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# The role of intermediate factors and biological mechanisms in life-course socioeconomic differences in cardiometabolic disorders

#### Petrovic Dusan

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# Faculté de biologie et de médecine

#### UNISANTÉ

Institut Universitaire de Médecine Sociale et Préventive Département d'Épidémiologie et Systèmes de Santé

## The role of intermediate factors and biological mechanisms in life-course socioeconomic differences in cardiometabolic disorders

#### Thèse de doctorat ès sciences de la vie (PhD)

présentée à la Faculté de biologie et de médecine de l'Université de Lausanne par

#### **Dusan PETROVIC**

Biologiste diplômé de l'Université de Lausanne

#### Jury

Prof. Lazare Benaroyo, Président Prof. Murielle Bochud, Directrice de thèse Dre Silvia Stringhini, Co-directrice de thèse Prof. Brigitte Santos-Eggimann, Experte Prof. Antoine Flahault, Expert

Lausanne, 2019



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pour le Doyen de la Faculté de biologie et de médecine

Prof. Lazare Benarov

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## List of publications

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#### **Summary**

Individuals experiencing adverse socioeconomic circumstances across the life-course are disproportionately affected by cardiometabolic diseases (CMD) in high income countries. While these inequalities have resulted from the epidemiological transition whereby the "diseases of affluence" have become the "diseases of the poor", the exact mechanisms underlying the lifecourse socioeconomic gradient in cardiometabolic disorders are only partially understood. The purpose of this thesis was to investigate the contribution of intermediate factors and the role of biological processes to the association between life-course socioeconomic position (SEP) and cardiometabolic disorders. In the first part of this thesis, we performed a systematic review of the literature examining the contribution of health behaviors to socioeconomic differences in cardiometabolic disorders and all-cause mortality. We found that the role of health behaviors varied according to social, economic, regional, and cultural factors. We identified three explanatory mechanisms for the contribution of health behaviors: the differential social patterning of health behaviors, physiological factors, and methodological characteristics of included studies. In the second part of this thesis, we investigated the contribution of sleep duration as an additional, unexplored intermediate factors of the life-course socioeconomic gradient in cardiovascular disorders. We observed a strong association between low socioeconomic position and abnormal sleeping duration patterns, but also a strong association between poor sleep and an increased cardiovascular risk. Moreover, we found that sleep duration meaningfully contributed to the life-course socioeconomic differences in cardiovascular disorders, explaining up to 13% of this gradient. Finally, we examined the associations between nine indicators of life-course SEP and DNA methylation of 451'000 epigenome-wide CpG markers. We identified 161 CpGs related to three SEP indicators in adulthood, and found that the identified CpGs were involved in inflammatory, immune, and cancer-related processes. In summary, the findings presented in this thesis contribute to a more complete understanding of the mechanisms underlying the life-course socioeconomic differences in cardiometabolic disorders; however, further research is needed to identify all potential intermediate mechanisms, and to characterize their overall role in shaping the socioeconomic gradient in health-related outcomes.

#### Résumé

Dans les pays riches, les individus éprouvant des circonstances socioéconomiques défavorables au cours de leurs vies sont affectés de façon disproportionnée par des troubles cardiométaboliques. Alors que ces inégalités ont résulté de la transition épidémiologique où les « maladies de l'opulence » sont devenues les « maladies du pauvre », les mécanismes sousjacents au gradient socioéconomique dans les troubles cardiométaboliques sont peu connus. L'objectif de cette thèse était d'investiguer la contribution des facteurs intermédiaires et le rôle des processus biologiques dans l'association entre la position socioéconomique (PSE) à travers le parcours de vie et les troubles cardiométaboliques. Dans la première partie de cette thèse, nous avons réalisé une revue systématique de littérature examinant la contribution des comportements de santé aux différences socioéconomiques dans les troubles cardiométaboliques et la mortalité. Nous avons trouvé que la contribution des comportements de santé variait suivant des facteurs sociaux, économiques, régionaux et culturels. Nous avons identifié trois mécanismes explicatifs quant à cette contribution hétérogène des comportements de santé : la distribution sociale différentielle des comportements de santé, les facteurs physiologiques et les aspects méthodologiques des articles inclus. Dans la deuxième partie de cette thèse, nous avons exploré la contribution de la durée du sommeil en tant que facteur intermédiaire de l'association entre la PSE à travers le parcours de vie et les troubles cardiovasculaires. Nous avons observé une forte association entre une PSE basse et une durée du sommeil anormale, mais aussi une forte association entre un sommeil perturbé et un risque cardiovasculaire plus élevé. Par ailleurs, nous avons trouvé que la durée du sommeil contribuait de façon significative à l'association entre la PSE à travers le parcours de vie et les troubles cardiovasculaires, expliquant jusqu'à 13% de cette relation. Finalement, nous avons examiné l'association entre neuf indicateurs de la PSE à travers le parcours de vie et la methylation de 451'000 marqueurs CpG à travers l'épigénome. Nous avons identifié 161 CpGs associés avec la PSE dans la vie adulte, et avons trouvé que ces CpGs étaient impliqués dans des processus liés à l'inflammation, au système immunitaire, et au cancer. En résumé, les résultats obtenus dans cette thèse contribuent à une compréhension plus complète des mécanismes sous-jacents aux différences socioéconomiques dans les troubles cardiométaboliques ; cependant, des investigations supplémentaires sont nécessaires afin d'identifier tous les mécanismes intermédiaires et de caractériser leur contribution globale au gradient socioéconomique dans la santé.

#### List of abbreviations

BAC Baccalauréat – High school diploma (France)

BMI Body mass index

CI Confidence interval

CHD Coronary heart disease

CMD Cardiometabolic disorder

CpG Cytosine-Guanine dinucleotide

CVD Cardiovascular disease

DNA Deoxyribonucleic acid

MTE Marginal total effect

NDE Natural direct effect

NIE Natural indirect effect

OR Odds ratio

PM Proportion mediated

SD Standard deviation

SEP Socioeconomic position

UK United Kingdom

### Introduction

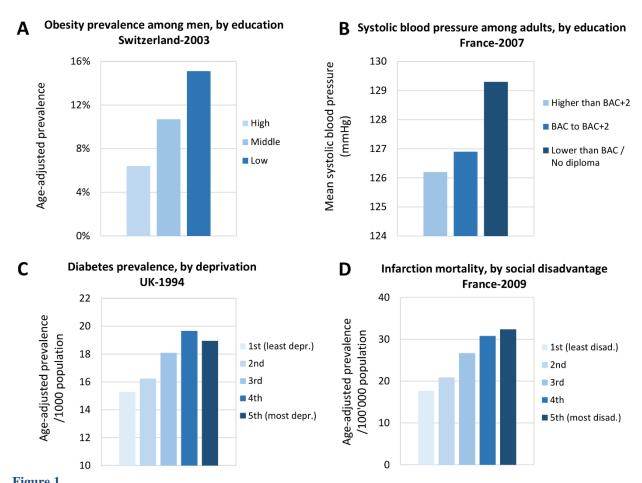
#### The socioeconomic gradient in cardiometabolic disorders

The existence of a socioeconomic gradient in health has been consistently observed and extensively documented in epidemiological research, whereby individuals with a lower socioeconomic position (SEP), usually measured by occupation, education, or income, experience poorer health and greater mortality than more advantaged individuals [1-3]. While health inequalities have existed ever since the beginning of human societies, the stepwise gradient between socioeconomic circumstances and health started to become evident during the nineteenth century, and was generally attributed to poverty, hazardous jobs, undernutrition, and poor hygiene [1, 4-6].

Throughout the twentieth century, major medical achievements and important progresses in the living and working standards have led to a substantial decline in overall mortality and an increase in life-expectancy in Western countries [7]. While the burden of infectious diseases has been reduced dramatically, the impact of lifestyle-related chronic conditions, such as cardiovascular diseases, metabolic disorders, respiratory illnesses, or cancer, has been steadily increasing since the 1950's [8, 9]. In particular, cardiometabolic disorders (CMD) including obesity, hypertension, hypercholesterolemia, diabetes, and cardiovascular diseases, nowadays constitute the leading cause of death in high income countries and have become an important burden in a large number of low and middle income countries [9-15]. Initially known as the "diseases of affluence", cardiometabolic disorders and their related risk factors were originally more prevalent in the higher socioeconomic groups, whereby conditions such as obesity, and associated behaviors such as smoking, and high-fat, energy-dense diets were reserved to socioeconomically privileged individuals, and perceived as status symbols [16]. However, following major social, economic,

and cultural changes that occurred in the West during the post-war period, cardiometabolic disorders and their related risk factors gradually shifted from the higher towards the lower socioeconomic groups as part of the epidemiological transition, eventually becoming the "diseases of the poor" [8, 16]. The processes underlying this transition included major economic development, which saw products such as tobacco, red meat, animal fats, and highly processed foods become widely available to the overall population [16, 17]. Furthermore, social phenomena also marked this shift, whereby lower socioeconomic groups progressively adopted "innovative", unhealthy behaviors (i.e. smoking) which were originally reserved to the better-off, whereas the upper classes have been better able to adapt their behaviors as the health effects of smoking, poor diet, and physical inactivity became apparent [16-19].

**Figure 1** illustrates the graded relation between education and obesity (A), education and mean systolic blood pressure (B), deprivation and diabetes (C), and social disadvantage and infarction mortality (D), in Switzerland, France, and the United Kingdom between 1994 and 2009.



BAC, *Baccalauréat* – High school diploma; BAC+2, two years of additional superior education after *Baccalauréat*A. Age-adjusted obesity prevalence among men in Switzerland in 2008, by highest attained education. Adapted from [20].

- B. Mean systolic blood pressure among adults in France in 2007, by highest attained education. Adapted from [21]. C. Age-adjusted prevalence of diabetes among UK men in 1994, by quintiles of deprivation (1<sup>st</sup> least deprived, 5<sup>th</sup> most deprived). Adapted from [22].
- D. Age-adjusted prevalence of infarction mortality, by municipality social disadvantage (1<sup>st</sup> least disadvantaged, 5<sup>th</sup> most disadvantaged). Adapted from [23].

#### The life-course perspective on cardiometabolic disorders

An important contribution to the understanding of the development of cardiometabolic disorders came with the "developmental origins of adult disease" hypothesis and the life-course approach in epidemiology, which postulate that environmental, biological, and social exposures across different life periods (gestation, childhood, adolescence, adulthood), alter one's physiology and influence later disease risk [24, 25]. Initially developed following observations that a low birthweight is related to a higher cardiovascular risk in later life, research in life-course epidemiology has shown that early exposures such as fetal undernutrition, maternal obesity, or adverse childhood experiences (i.e. adversity, abuse, parental separation), negatively affect cardiometabolic disease risk in adulthood [24, 26-30]. From the social epidemiology point of view, the importance of the life-course approach came with the research examining the role of early-life socioeconomic factors in later disease occurrence, whereby adverse socioeconomic circumstances in earlier life periods were found to influence the development of obesity, hypercholesterolemia, hypertension, and coronary heart disease in adulthood [31, 32].

The life-course approach combines multiple conceptual models along with the use of longitudinal data, whereby environmental, biological, and socioeconomic factors interact throughout life to influence later health and disease risk. As a result, three main non-mutually exclusive causal models for the life-course perspective in the development of cardiometabolic disorders have been elaborated; the critical period model, the accumulation model, and the pathway model [33, 34]. First, the critical period model implies that there are specific time windows throughout life when the body is particularly sensitive to external exposures (i.e. *in utero* development, the first year of life, adolescence, etc.), which would then result in either protective or adverse effects on future

health. In the context of socioeconomic differences in cardiometabolic disorders, an impaired fetal growth resulting from maternal socioeconomic adversity and malnutrition was found to result in an increased risk of obesity and coronary heart disease in later life [28, 31]. Second, the accumulation model is based on the principle that events characterizing different life periods have an additive effect, whereby adverse exposures, such as successive periods of socioeconomic adversity, accumulate across the life-course and affect later cardiometabolic disease risk in a dose-response manner. Third, the chains of risk, or the pathway model, implies that earlier exposures do not necessarily have physiological effects, but that they may determine later exposures and adverse circumstances, which in turn directly affect health. From the social epidemiology perspective, this may be related to the fact that certain socioeconomic factors in early life do not have direct consequences on cardiometabolic outcomes, but may shape subsequent socioeconomic circumstances which in turn determine later cardiometabolic disorders [33]. While, these causal models may present important conceptual differences, former investigations have shown that they actually all contribute to the life-course socioeconomic differences in cardiometabolic disorders, and should be considered as complementary in shaping this gradient [35].

## The role of intermediate mechanisms in the life-course socioeconomic gradient in cardiometabolic disorders

Along with the life-course perspective, previous research has also led to the development of a conceptual framework incorporating intermediate factors ("middle layer"), and subsequent biological processes ("inner layer") to the causal pathway between life-course socioeconomic circumstances and the occurrence of cardiometabolic disorders (**Figure 2**) [10, 36, 37]. Intermediate factors including patterns of unhealthy behaviors, chronic toxic environmental exposures, psychosocial stressors, and limited access or use of health care, are generally considered as mediators of the socioeconomic gradient in cardiometabolic disorders, as they are globally determined by socioeconomic factors, but are also known to affect subsequent physiological processes leading to a higher cardiometabolic disease risk [36, 38].

Health behaviors including tobacco use, physical activity, dietary patterns, and alcohol intake have been the object of particular attention in epidemiological research [38-40]. Previous studies conducted in Western countries have shown that smoking, sedentary behavior, and inadequate diet, have been steadily increasing in the lower socioeconomic groups since the 1950's, eventually resulting in a much higher prevalence of these unhealthy behaviors among the less well-off [16]. Furthermore, the adverse effects of these unhealthy behaviors on cardiometabolic outcomes have been extensively demonstrated in former clinical and epidemiological investigations, with smoking being a major risk factor for coronary heart disease, and high-fat, energy-dense diets and physical inactivity leading to diabetes, obesity, hypertension, and cardiovascular events [34, 36, 39-41]. As a result, it has been suggested that health behaviors are important intermediate factors of the socioeconomic gradient in cardiometabolic disorders;

however, their overall contribution to this gradient was found to vary substantially across previous studies [38]. Psychosocial factors are also considered as important mediators of the socioeconomic gradient in health, whereby poor material, financial, or social circumstances lead to higher levels of stress, more negative life events, fewer psychosocial resources, allowing to deal with daily hassles [17]. Subsequently, long-term chronic stress and the perception of various threats and burdens across the life-course permanently affect multiple mental, behavioral, and physiological processes, eventually leading to higher rates of depression, diabetes, obesity, and cardiovascular diseases [17, 36, 42, 43]. Environmental exposures constitute another important group of mediators, whose contribution to the socioeconomic gradient in health was already proposed during the nineteenth century, when the adverse living, working and sanitary conditions were seen as the main reason for this gradient [36, 44]. The environmental exposure hypothesis implies that socioeconomically disadvantaged individuals are not only more exposed to environmental hazards such as toxins, pollutants, and noise, but also to deprived neighborhoods and communities characterized by poor housing, insecurity, and insufficient access to healthy food and green spaces, which adversely affect cardiometabolic and other health-related outcomes [36, 45]. Furthermore, it has also been suggested that access and use of health care services could be another mediator of the socioeconomic gradient in cardiometabolic disorders and other health outcomes, particularly in countries that do not provide universal health care coverage, or that lack the resources to maintain effective public health care services [3, 34, 46, 47]. Finally, the contribution of other unknown mediators to the life-course socioeconomic gradient in cardiometabolic disorders cannot be discarded. In particular, recent investigations have suggested that sleep-related patterns, including sleep duration, sleep quality, and sleep apnea, may mediate the socioeconomic gradient in cardiometabolic disorders, as sleep was found to be determined by

socioeconomic factors, but also to affect multiple physiological processes, including glucose intolerance, hypertension, and the occurrence of cardiovascular events [48-51].

The role of biological pathways in the life-course socioeconomic gradient in cardiometabolic disorders

Along with the role of intermediate factors, former research has investigated series of biological mechanisms through which adverse socioeconomic circumstances and their associated risk factors potentially "get under the skin" and affect later cardiometabolic disease risk [36].

Among the most cited underlying biological pathways is the Hypothalamus-Pituitary-Adrenal axis (HPA), which controls the long-term stress response by regulating the release of corticosteroid hormones. Former investigations have suggested that in situations of chronic stress or prolonged adversity, the HPA axis is no longer properly regulated, eventually resulting in the release of excessive amounts of corticosteroids, which in turn affect multiple biological processes [34]. While mineralocorticoids such as aldosterone cause an increase of blood pressure and may result in hypertension, glucocorticoids such as cortisol promote glucose and fatty acid release, insulin resistance, protein degradation, and immunosuppression, altogether favoring obesity, diabetes, hypercholesterolemia, and cardiovascular events [36, 52]. The alterations of neurological structures constitute another potential biological pathway of the "social embedding" [36]. Former research has shown that the experience of adverse life events and poor socioeconomic circumstances may affect the adequate functioning of brain structures such as the amygdala or locus coeruleus, which in turn exacerbate the perception of threats, negative emotions, and feelings of powerlessness, eventually resulting in depression, cardiovascular diseases, and other disorders, in part via unhealthy behaviors (e.g. difficulty to control appetite

and make healthy dietary choices) [17, 36, 43, 53]. Moreover, disrupted inflammatory patterns have also been proposed as biological pathways underlying socioeconomic differences in health, whereby social adversity and unhealthy behaviors lead to elevated levels of pro-inflammatory markers such as C-reactive protein (CRP), cytokines, fibrinogen, or white blood cell infiltration, which have been related to autoimmune diseases, diabetes, and atherosclerosis [54-57]. In addition to the role of distinct or separate biological pathways, epidemiological studies have been increasingly using the concept of allostatic load (AL) since the 1990's, which is an indicator of generalized physiological dysregulation resulting from chronic psychosocial or physical challenges, and which incorporates markers from multiple biological systems and processes (cardiovascular, metabolic, HPA, dyslipidemic, inflammatory, oxidative stress) [58-60]. While allostatic load was found to be driven by poor socioeconomic circumstances and to influence later cardiometabolic disease risk, one of the major strength of this composite indicator is that it offers a global perspective of multiple, subclinical alterations caused by adversity, unhealthy behaviors, and chronic stress [61, 62]. Finally, evidence has been accumulating for the role of epigenetic modifications as an additional mechanism of social embedding [63, 64]. Former research has suggested that adverse environmental or psychosocial stimuli may lead to differential DNA methylation, whereby methyl groups are added to Cytosine nucleotides within specific DNA sequences [52]. Whilst DNA methylation does not change the DNA sequence, this process may lead to a differential expression of genes controlling key biological pathways, such as inflammation and the regulation of the HPA axis, eventually affecting cardiometabolic disease risk [63].

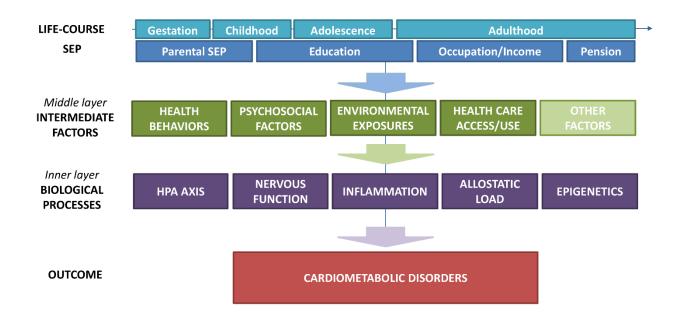


Figure 2
HPA, Hypothalamus-Pituitary-Adrenal axis; SEP, Socioeconomic position
Conceptual framework representing the association between life-course SEP and health-related outcomes, along with intermediate mechanisms: middle layer intermediate risk factors and inner layer biological pathways. Adapted from [11, 36, 65].

#### Thesis objectives

Despite the development of an extended conceptual framework encompassing multiple mechanisms underlying the life-course socioeconomic gradient in cardiometabolic disorders, the exact role of these intermediate factors and biological processes have often been unclear in previous epidemiological studies. In particular, evidence is lacking regarding the mechanisms driving the differential contribution of health behaviors; the potential contribution of additional, unknown intermediate factors; and a thorough characterization of underexplored biological processes involved in the "embedding" of the social environment.

Thus, the main objectives of this thesis were:

- 1. To systematically review existing evidence on the contribution of health behaviors to the socioeconomic gradient in cardiometabolic disorders and all-cause mortality.
- 2. To assess the role of underexplored mechanisms, such as sleep behaviors, in shaping lifecourse socioeconomic differences in cardiovascular outcomes.
- 3. To investigate inner layer biological pathways linking life-course socioeconomic circumstances and cardiometabolic disorders.

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Chapter 1 The contribution of health behaviors to socioeconomic inequalities in health: A systematic review

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#### Review Article

#### The contribution of health behaviors to socioeconomic inequalities in health: A systematic review



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#### ABSTRACT

Unhealthy behaviors and their social patterning have been frequently proposed as factors mediating socioeconomic differences in health. However, a clear quantification of the contribution of health behaviors to the socioeconomic gradient in health is lacking. This study systematically reviews the role of health behaviors in explaining socioeconomic inequalities in health.

Published studies were identified by a systematic review of PubMed, Embase and Web-of-Science. Four health behaviors were considered: smoking, alcohol consumption, physical activity and diet. We restricted health outcomes to cardiometabolic disorders and mortality. To allow comparison between studies, the contribution of health behaviors, or the part of the socioeconomic gradient in health that is explained by health behaviors, was recalculated in all studies according to the absolute scale difference method.

We identified 114 articles on socioeconomic position, health behaviors and cardiometabolic disorders or mortality from electronic databases and articles reference lists. Lower socioeconomic position was associated with an increased risk of all-cause mortality and cardiometabolic disorders, this gradient was explained by health behaviors to varying degrees (minimum contribution -43%; maximum contribution 261%).

Health behaviors explained a larger proportion of the SEP-health gradient in studies conducted in North America and Northern Europe, in studies examining all-cause mortality and cardiovascular disease, among men, in younger individuals, and in longitudinal studies, when compared to other settings. Of the four behaviors examined, smoking contributed the most to social inequalities in health, with a median contribution of 19%.

Health behaviors contribute to the socioeconomic gradient in cardiometabolic disease and mortality, but this contribution varies according to population and study characteristics. Nevertheless, our results should encourage the implementation of interventions targeting health behaviors, as they may reduce socioeconomic inequalities in health and increase population health.

#### 1. Introduction

The existence of a stepwise association between socioeconomic position (SEP) and health related outcomes (Antonovsky, 1967; Krieger et al., 1997; Miranda et al., 2008; Bartley, 2004), also referred as the socioeconomic gradient in health, constitutes one of the most consistent findings of epidemiologic research. Individuals with a lower socioeconomic position, as measured by occupational position, educational attainment, income, or composite indexes, are more likely to die earlier and have a higher incidence of cardiovascular events, diabetes, obesity, and other diseases than their more advantaged counterparts (Bartley,

2004; Adler et al., 1993). As eliminating socioeconomic disadvantage from society is difficult, quantifying modifiable intermediate factors and targeting them could have important public health benefits. Epidemiologic research has long investigated potential mediating factors of the association between socioeconomic position and health outcomes, with health behaviors, environmental exposures or psychosocial factors having been identified as major mechanisms in the link between low SEP and increased disease risk (Supplementary Fig. 1) (Matthews et al., 2010; Stringhini et al., 2011a; Stringhini et al., 2012a; Robertson et al., 2015a; Næss et al., 2007; van Oort et al., 2005).

Health behaviors such as smoking, alcohol consumption, diet and

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physical activity (PA) are major risk or protective factors for chronic diseases (Who and Consultation, 2003; Centers for Disease C, Prevention, 2008; Klatsky et al., 1992) and are also strongly socially patterned, with detrimental behaviors being more prevalent in lower SEP groups when compared to higher SEP groups (Nocon et al., 2007; Macintyre, 2000; Wardle and Steptoe, 2003). Yet, despite extensive investigations, a clear understanding of the role of health behaviors in social inequalities in health is still lacking, a major challenge being that their estimated contribution to the socioeconomic gradient in health varies greatly across studies, ranging from 12% to 72% (van Oort et al., 2005; Stringhini et al., 2011b; Laaksonen et al., 2008; Lantz et al., 1998; Schrijvers et al., 1999; Skalická et al., 2009; Stringhini et al., 2010).

The reasons for the differential contribution of health behaviors to social inequalities in health are numerous and include cultural differences between countries (Stringhini et al., 2011b), demographic characteristics of the participants included in the studies (Tseng and Lin, 2008), between-studies differences in the SEP measures, health behaviors and health outcomes examined, and methodological differences in the calculation of the contribution of health behaviors (Stringhini et al., 2010; Bartley, 2016). Another potential explanation may be related to the stage of the epidemiologic transition, which designates the changes in the prevalence of diseases, disease risk factors, and the changes in the adherence to health behaviors over time and in different sociodemographic contexts (Mackenbach et al., 1997). However, there is currently no attempt in the literature to synthesize the wealth of research on this topic and provide a more comprehensive assessment of health behaviors as mechanisms underlying the association between SEP and health. However, this is a crucial step for identifying targets for policies aimed at reducing socioeconomic differences in health as well as improving health at the population level.

In this study, we conducted a systematic review and synthesis of the literature on the contribution of smoking, alcohol intake, physical activity and dietary patterns to socioeconomic inequalities in all-cause mortality and risk of cardiometabolic disorders, two health outcomes showing a particularly consistent socioeconomic gradient across studies (Avendano et al., 2006a; Suadicani et al., 2001; Stringhini et al., 2013a; Mackenbach et al., 2008). The overarching purpose of this review was to examine all previously published studies investigating the contribution of health behaviors to socioeconomic inequalities in health, and to provide a complete and comprehensive analysis regarding the sources of heterogeneity of this contribution, with a particular focus on methodological, sociodemographic and cultural factors.

#### 2. Methods

#### 2.1. Search strategy and inclusion criteria

In this systematic review, we aimed to retrieve and analyze all articles that examined the contribution of health behaviors to the socioeconomic gradient in all-cause mortality and cardiometabolic disorders. We used four main groups of search terms: terms related to SEP, terms related to health behaviors, terms related to health outcomes, and terms related to "contribution", "role", or "mediation" (Supplementary Material - search strategy). Article search was performed from August 2015 to December 2016 by searching PubMed, Embase and Web-of-Science electronic databases following the PRISMA-Equity guidelines (Welch et al., 2012). No publication date restrictions were imposed. Articles in English and French were considered. Two reviewers (DP, CdM) independently examined the titles and abstracts of the papers identified in the databases search, removed papers that did not meet the inclusion criteria and selected eligible papers for full-text review. The reference lists of reviewed papers were also searched for additional articles of interest that were not identified by the electronic search.

In this review, we included four health behaviors that had been previously strongly related to SEP, but also to all-cause mortality and cardiometabolic disorders: smoking, alcohol consumption, physical activity, and dietary patterns (Who and Consultation, 2003; Centers for Disease C, Prevention, 2008; Klatsky et al., 1992; Jarvis and Wardle, 2005; Stringhini et al., 2013b; Trichopoulou and Lagiou, 1997; Mäki et al., 2014; Paffenbarger Jr et al., 1986). We also considered papers that performed analyses adjusted for multiple health behaviors simultaneously (i.e. smoking and alcohol). We searched for papers that reported SEP as measured by education, occupation, income, wealth, area-based indicators, childhood SEP indicators, partner's SEP as well as composite SEP scores (i.e. education and occupation). We included both cross-sectional and longitudinal observational studies investigating the contribution of the four health behaviors to socioeconomic inequalities in all-cause mortality and cardiometabolic outcomes (defined as cardiovascular disease, hypertension, coronary heart disease, stroke, diabetes, impaired glucose tolerance, metabolic syndrome, allostatic load, obesity). Despite the fact that some studies used BMI as a proxy for diet or a risk factor for other diseases, in the present review we considered it as a health outcome.

The main inclusion criterion in selected articles was the presence of a quantification of the contribution of health behaviors to the SEP gradient in health, or the possibility to estimate this from the data according to the difference method, which compares the coefficients from the SEP-health association model that is unadjusted for health behaviors, with the coefficients from a model additionally adjusted for health behaviors (Stringhini et al., 2010). Experimental studies (i.e. health education programs, randomized control trials), articles published in non-peer-reviewed journals, non-original research papers (i.e. reviews, commentaries), duplicate publications and articles limited to an abstract (i.e. congress proceedings) were excluded. After removing non-eligible papers, CdM and DP examined the papers to be included in the systematic review. For the title and abstract screening process, the level of agreement between the two reviewers was > 90%, while for full-text screening, the level of agreement between the two reviewers was > 95%. Whenever a conflict was encountered, the two reviewers discussed the article in question to decide whether to include it or not.

#### 2.2. Data extraction

For each study, the following data were extracted: title, last name of first author, study region or country, cohort name, study period, study design, sample size, characteristics of participants, SEP indicator(s) (exposure), health outcome(s) (outcome) and health behavior(s) (mediating factor) along with their measurement methods (i.e. self-administered questionnaires, medical records, death registries), and two regression coefficients for SEP ( $\beta$ , hazard ratio (HR), odds ratio (OR), risk ratio (RR)) with 95% confidence intervals (CI); the first coefficient from the unadjusted regression model: SEP  $\rightarrow$  health outcome (Model 1), and the second coefficient from the regression model additionally adjusted for health behavior(s) or mediator(s): SEP  $\rightarrow$  health behavior(s)  $\rightarrow$  health outcome (Model 2).

While the majority of the included papers did not provide any direct assessment of the contribution of health behaviors to socioeconomic differences in all-cause mortality and risk of cardiometabolic disorders, in 31 studies this contribution was calculated according to the absolute (n = 13) (Stringhini et al., 2011a; Stringhini et al., 2010; Suadicani et al., 2001; Stamler et al., 2003; László et al., 2008; Marmot et al., 2008; Kavanagh et al., 2010; Hagger-Johnson et al., 2012; Stringhini et al., 2012b; Woodside et al., 2012; Giesinger et al., 2013; Stringhini et al., 2014; Stringhini et al., 2016) or relative scale difference methods (n = 18) (van Oort et al., 2005; Laaksonen et al., 2008; Schrijvers et al., 1999; Skalická et al., 2009; Lynch et al., 1996; Van Lenthe et al., 2002; Agardh et al., 2004; Strand and Tverdal, 2004; van Oort et al., 2004; Khang and Kim, 2005; Silva et al., 2008; Singh-Manoux et al., 2008; Khang et al., 2009; Beauchamp et al., 2010; Chapman et al., 2010; Nandi et al., 2014; Bihan et al., 2016; Bonaccio et al., 2016) which compare the beta coefficient for SEP from the unadjusted regression

model (Model 1) with the beta coefficient from the regression model additionally adjusted for health behaviors (Model 2). Nine studies provided a quantification of the contribution of health behaviors by using alternative methods, namely path analysis model (Chaix et al., 2010; Robertson et al., 2015b), likelihood-ratio test statistic (Floud et al., 2016), Sobel's mediation test (Seligman et al., 2012; Ni et al., 2013; Zhu et al., 2015) and the mediation method based on direct and indirect effects (Nordahl et al., 2014a; Nordahl et al., 2014b; Houle et al., 2016).

Out of the 114 papers included in this review, 111 papers provided the estimators for the unadjusted and the health behavior adjusted models allowing the implementation of the difference method, while three studies assessed the contribution of health behaviors with an alternative method, and did not provide adequate information regarding the unadjusted and the adjusted models (Supplementary Fig. 2) (Houle et al., 2016; Jeffery et al., 1991; Schulz et al., 2008). Despite limitations of the difference method for assessing the contribution of mediating factors in an association, including unmeasured confounding variables and interactions (VanderWeele, 2013) as well as the possibility of yielding counter-intuitive negative contributions by health behaviors, this is to date the only statistical procedure that allows computing contribution of mediators based on statistical coefficients (B, OR, HR or RR) without individual-level data. Consequently, to allow comparison between studies, we recalculated the contribution of health behaviors with the absolute scale difference method for 111 out of 114 studies:

 $\begin{aligned} & \text{Contribution of health behaviors (\%)=} \\ & 100 \times (\beta_{Model~1} - \beta_{Model~2:Model~1 + health~behavior(s)}) / \beta_{Model~1} \end{aligned}$ 

where  $\beta = \beta$  regression coefficient or log (HR, OR, RR) of the least advantaged SEP group for studies that used highest SEP group as a reference (n = 105). For studies that used the lowest SEP group as a reference, β coefficients from the highest SEP group were used for computing the contribution of health behaviors (László et al., 2008; Bonaccio et al., 2016; Egeland et al., 2002; Osler et al., 2003; Silventoinen et al., 2005; Gorman and Sivaganesan, 2007; Prescott et al., 2007; Fu et al., 2011; Bradley Deere and Seth, 2016). To illustrate the computation of the contribution of health behaviors, we can consider an example taken from a study by Stringhini et al. (Table 4 -Whitehall II data) (Stringhini et al., 2011a). The HR coefficient from the unadjusted model for the association between occupation and all-cause mortality is: 1.62 95%CI[1.28-2.05]. In the model additionally adjusted for smoking, the HR for the association between occupational position and all-cause mortality is 1.39 95%CI[1.09-1.75]. The contribution of smoking to the association between occupational position and all-cause mortality, is then calculated as:

 $100 \times (\log(1.62) - \log(1.39)) / \log(1.62) = 32\%$ 

This percentage means that smoking contributes to approximately one third of the association between occupational position and all-cause mortality.

To analyze whether the contribution of health behaviors to the so-cioeconomic gradient differed by study settings, the contribution estimates computed for each article were grouped according to three main SEP indicators; namely education and occupation, which are the two most commonly used indicators, thought to capture multiple dimensions of SEP, and "Other SEP indicators" which included the remaining SEP markers (Stringhini et al., 2010; Galobardes et al., 2006). The contribution figures were further aggregated according to health outcome, sex, geographic location, age group of study participants, type of study (longitudinal vs. cross-sectional) and assessment methods of health behaviors (questionnaire vs. objective assessment methods). For each group of studies that presented the same SEP indicator and aggregating factor, a median, minimum and maximum contribution were computed.

2.3. Mediators, confounders, and moderators/modifiers of the SEP-health association

In addition to mediating factors, the studies included in this review also reported specific sets of confounding and/or modifying factors that may affect the SEP-health association. In order to avoid confusion between the terms mediator, confounders and modifier, we provide the following explanations regarding their respective effects. Health behaviors are usually considered as mediating factors of the SEP-health association as they are strongly socially patterned and are simultaneously major risk or protective factors for health-related outcomes (Stringhini et al., 2010; Stringhini et al., 2013b; Kuh et al., 2003). Consequently, they contribute to this association by being located on the assumed causal pathway between SEP (exposure) and health (outcome) (Kuh et al., 2003). In contrast to mediators, factors such as age, sex, or ethnicity are usually considered as confounders, as they influence the SEPhealth association but are not located on the causal pathway. Confounders are generally conceptualized as pre-existing or tangential to the exposure and often distort the effect of exposure on the outcome (Kuh et al., 2003; VanderWeele and Shpitser, 2013). Finally, there may also be risk or protective factors referred to as moderators or modifiers, which modify the association between the exposure and the outcome, when the effect of the exposure differs across levels of the moderator/ modifier (Kuh et al., 2014; Sharma et al., 1981).

### 3. Results

Our search strategy identified 855 potentially relevant articles, of which 740 were found in three electronic databases and 115 were retrieved from reference lists. The article selection process and flow-chart are presented in Supplementary Fig. 2. A total of 537 articles were rejected based on Title/Abstract screening. These studies were mostly health intervention programs, randomized controlled trials or other experimental studies, did not assess the association between SEP and a health outcome, did not include one of the health outcomes of interest or performed reversed analyses (health outcome as predictor of SEP). A total of 318 articles were selected for full text reading, of which 204 were excluded, the main reason for exclusion being that they did not provide an estimate of the contribution of health behaviors separate from major confounders such as sex, age and/or pre-existing diseases. Other articles excluded based on full text reading were either narrative reviews or commentaries and not original articles, or used SEP as an adjustment factor only. The selection process eventually yielded 114 articles that were included in the systematic review.

### 3.1. General characteristics

General characteristics of the papers included in this systematic review are summarized in Table 1. The included studies (39 cross-sectional; 75 longitudinal) took place between 1948 and 2016, and were mainly conducted in high-income countries (United States (n = 27), United Kingdom (n = 23) and other countries from the Organization for Economic Co-operation and Development (n = 57) (Bank W, 2016)). Four studies took place in low or middle income countries, namely Kenya, Seychelles and China, and three were international consortia. In 113 articles, analyses were carried out in adults, of which 13 also included adolescents. One article reported analyses performed in individuals aged 8-19 (Schreier and Chen, 2010). In 27 articles, analyses were stratified by sex while ten studies included men only and ten women only. To assess the association between SEP and health outcomes, most studies relied on logistic or Cox proportional hazards regression models, whereas others used linear or non-linear (Poisson) regression models.

| Ceneral characteristics of the studies included in the systematic review. | ne studies included | in the systematic review. | Ctude/ookout nomo  | Tomo of ottoder                 | Account         | Numbon         | CTD indicator(a)                    | Outcomo(e)           | Liferente                           |
|---|---------------------|---------------------------|--|---------------------------------|-----------------|----------------|-------------------------------------|----------------------|-------------------------------------|
| orac)   | Country             | nomed bearing             | Study/contact name   | type of study                   | baseline        | included       | SET IIIIII (SECONDO)                | Outcome(s)           | behavior(s)                         |
| Notkola et al. (1985)<br>Jacobsen and Thelle (1988)                       | Finland<br>Norway   | 1959–1974<br>1980         | East-West study<br>The Tromso Heart Study                              | Longitudinal<br>Cross-sectional | 40-60+<br>25-55 | 1711<br>11,562 | Childhood SES (OA)<br>Education (Q) | CVD (OA)<br>CVD (OA) | Smoking (Q) Alcohol, smoking        |
| Jeffery et al. (1991)   | ns                  | < 1991                    | Healthy Worker Project   | Cross-sectional                 | 38.7 (mean      | 4647           | SES score (Q)                       | Obesity (OA)         | PA, diet (Q)<br>Smoking, PA, diet   |
| Stamler et al. (1992)   | International       | 1982–1985                 | Intersalt Study  | Cross-sectional                 | age)<br>20–59   | 8477           | Education (Q)                       | CVD (OA)             | Alcohol, smoking,                   |
| Helmert and Shea (1994)   | Germany             | 1984–1991                 | German Cardiovascular Prevention                                       | Cross-sectional                 | 25–69           | 44,363         | SES score (Q)                       | Diabetes, CVD        | Smoking (Q)                         |
| Gliksman et al. (1995)  | ns                  | 1976–1990                 | Nurses' Health Study Cohort  | Longitudinal                    | 30-55           | 117,006        | Childhood SES (Q)                   | CVD (OA)             | Alcohol, PA, diet                   |
| Pekkanen et al. (1995)  | Finland             | 1972–1987                 | North Karelia Project  | Longitudinal                    | 25-59           | 18,661         | Occupation (Q)                      | ACM, CVD (OA)        | Smoking (Q)                         |
| Brancati et al. (1996)  | ns                  | 1972–1974                 | Three Area Stroke Study  | Cross-sectional                 | 35-54           | 1393           | SES score (Q)                       | Diabetes (OA)        | Smoking (Q)                         |
| Lynch et al. (1996)   | Finland             | 1984–1993                 | Kuopio Ischemic Heart Disease Risk<br>Factor Study                     | Longitudinal                    | 42-90           | 7087           | Income (Q)                          | ACM, CVD (OA)        | Alcohol, smoking,<br>PA (Q)         |
| Suadicani et al. (1997)   | Denmark             | 1985–1991                 | Copenhagen Male Study  | Longitudinal                    | 53-75           | 2974           | Occupation (Q)                      | CVD (Q + OA)         | Alcohol, PA, diet                   |
| Wannamethee and Shaper  | UK                  | 1983–1995                 | British Regional Heart Study   | Longitudinal                    | 40-59           | 7262           | Occupation (RGC)                    | ACM, CVD (OA)        | Smoking (Q)                         |
| Chandola (1998)   | UK                  | 1984–1995                 | The Health Lifestyles Survey   | Longitudinal                    | >18             | 9003           | Occupation (Q)                      | CVD (OA)             | Alcohol, smoking,                   |
| Lantz et al. (1998)   | ns                  | 1986–1994                 | Americans' Changing Live's Survey                                      | Longitudinal                    | ≥25             | 3617           | Education, income (Q)               | ACM (OA)             | Alcohol, smoking,                   |
| Schrijvers et al. (1999)  | Netherlands         | 1991–1996                 | Longitudinal Study on<br>Socioeconomic Health Differences              | Longitudinal                    | 15–74           | 15,451         | Education (Q)                       | ACM (OA)             | PA (Q) Alcohol, smoking, DA (Q)     |
| Hart et al. (2000)  | UK                  | 1972–1976                 | Renfrew/Praisley General   | Longitudinal                    | 45-64           | 14,947         | Occupation, wealth (RGC)            | CVD (OA)             | Smoking (Q)                         |
| Kilander et al. (2001)<br>Suadicani et al. (2001)                         | Sweden<br>Denmark   | 1970–1995<br>1971–1993    | Popuanon Study<br>Uppsala Male Health Survey<br>Copenhagen Male Study  | Longitudinal<br>Longitudinal    | 50<br>40–59     | 2301<br>5028   | Education (Q)<br>SES score (Q)      | CVD (OA)<br>CVD (OA) | Smoking (Q)<br>Alcohol, smoking,    |
| Egeland et al. (2002)   | Norway              | 1977–1992                 | Second Cardiovascular Disease and                                      | Longitudinal                    | 35-52           | 20,038         | Education, Partner's SES (Q)        | CVD (OA)             | PA (Q)<br>Smoking (Q)               |
| Van Lenthe et al. (2002)  | Netherlands         | 1991–1996                 | KISK FACTOR SCREENING SURVEY<br>Globe Study                            | Longitudinal                    | 15–74           | 9872           | Education (Q)                       | CVD (OA)             | Alcohol, smoking,                   |
| Aslanyan et al. (2003)  | UK                  | 1991–1998                 | Stroke Patients admitted to the<br>Western Infirmary Acute Stroke Unit | Cross-sectional                 | ≥18             | 2026           | Area SES (OA)                       | CVD (OA)             | PA (Q)<br>Smoking (Q)               |
| Osler et al. (2003)   | Denmark             | 1980–1997                 | in Glasgow<br>Copenhagen City Heart Study                              | Longitudinal                    | ≥20             | 21,721         | Income, area SES (OA)               | CVD (OA)             | Alcohol, smoking,                   |
| Stamler et al. (2003)<br>Woodward et al. (2003)                           | US<br>UK            | 1992<br>1984–1993         | Intermap Study<br>Scottish Heart Health Study                          | Cross-sectional<br>Longitudinal | 40–59<br>40–59  | 2195<br>11,629 | Education (Q)<br>Wealth (Q)         | CVD (OA)<br>CVD (OA) | Alcohol, diet (Q) Alcohol, smoking, |
| Agardh et al. (2004)  | Sweden              | 1992–1998                 | Stockholm Diabetes Prevention  | Cross-sectional                 | 35–56           | 7949           | Occupation (Q)                      | Diabetes (OA)        | PA (Q + OA)<br>Smoking, PA (Q)      |
| Lawlor et al. (2004)  | UK                  | 1999–2001                 | Program British Women's Heart and Health Stridy                        | Cross-sectional                 | 62-09           | 3444           | Childhood SES (RGC)                 | CVD (OA)             | Smoking, PA (Q)                     |
| Strand and Tverdal (2004)   | Norway              | 1974–2000                 | Cardiovascular Disease Study in<br>Finnmark, Sogn og Fjordan,          | Longitudinal                    | 35-74           | 44,144         | Education (Q)                       | CVD (OA)             | Smoking, PA (Q)                     |
| van Oort et al. (2004)  | Netherlands         | 1991–1998                 | Globe Study  | Longitudinal                    | 15-74           | 16,980         | Education (Q)                       | ACM (OA)             | Alcohol, smoking,                   |
| Blakely and Wilson (2005)   | New Zealand         | 1981–1984 1996–1999       | New Zealand Census Mortality<br>Study                                  | Longitudinal                    | 45–74           | 1,175,000      | Education (Q)                       | ACM, CVD (OA)        | Smoking (Q)                         |
|   |                     |                           |  |                                 |                 |                |                                     | (conti               | (continued on next page)            |

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| Study  | Country  | Survey period                  | Study/cohort name  | Type of study                                   | Age at<br>baseline      | Number<br>included     | SEP indicator(s)                              | Outcome(s)                            | Lifestyle<br>behavior(s)                              |
|--|--|--------------------------------|--|---|-------------------------|------------------------|---|---------------------------------------|---|
| Khang and Kim (2005)   | South Korea                                    | 1998                           | KNHANES Study  | Cross-sectional                                 | >30                     | 5437                   | Income (Q)                                    | ACM (OA)                              | Alcohol, smoking,                                     |
| Maty et al. (2005)   | ns   | 1965–1999                      | Alameda County Study   | Longitudinal                                    | 17-94                   | 6147                   | Education, occupation,                        | Diabetes (Q)                          | Alcohol, smoking,                                     |
| Power et al. (2005)  | UK   | 1958–1991                      | British Birth Cohort   | Longitudinal                                    | 14-49                   | 11,855                 | Partner's SES, childhood SES                  | ACM (OA)                              | Smoking (Q)   |
| Silventoinen et al. (2005)   | Finland  | 1992–2001                      |  | Longitudinal                                    | 25-64                   | 1909                   | Education (Q)                                 | CVD, MS (OA)                          | Alcohol, smoking,                                     |
| van Oort et al. (2005)   | Netherlands                                    | 1991–1998                      | Globe Study  | Longitudinal                                    | 15-74                   | 3979                   | Education (Q)                                 | ACM (OA)                              | PA, diet (Q) Alcohol, smoking,                        |
| Avendano et al. (2006b)  | ns   | 1982–1994                      | Epese Study  | Longitudinal                                    | 65-74                   | 2812                   | Education, income (Q)                         | CVD (Q + OA)                          | Alcohol, smoking,                                     |
| Kittleson et al. (2006)  | US doctors (all age                            | 1948–1988                      | Johns Hopkins Precursors Study   | Longitudinal                                    | 26-70                   | 1131                   | Childhood SES (Q)                             | CVD (OA)                              | PA (Ų)<br>Smoking, PA (Ų)                             |
| Kittleson et al. (2006)<br>Rathmann et al. (2006)<br>Yan et al. (2006) | groups)<br>US (< 50 y of age)<br>Germany<br>US | 1948–1988<br>1999<br>1985–2001 | Johns Hopkins Precursors Study<br>KORA survey 2000<br>Coronary Artery Risk Development | Longitudinal<br>Cross-sectional<br>Longitudinal | 26–50<br>55–74<br>18–30 | < 1131<br>1476<br>2913 | Childhood SES (Q) SES score (Q) Education (Q) | CVD (OA)<br>Diabetes (OA)<br>CVD (OA) | Smoking, PA (Q)<br>Smoking, PA (Q)<br>Smoking, PA (Q) |
| Agardh et al. (2007)   | Sweden   | 1992–1998                      | in Young Adults study<br>Stockholm Diabetes Prevention                                 | Cross-sectional                                 | 35-56                   | 7949                   | Education, occupation,                        | Diabetes (OA)                         | Smoking, PA (Q)                                       |
| Feinglass et al. (2007)  | ns   | 1992–2002                      | Program<br>Health and Retirement Study   | Longitudinal                                    | 51–61                   | 9759                   | childhood SES (Q) Education, income, wealth   | ACM (OA)                              | Smoking, PA (Q)                                       |
| Gorman and Sivaganesan   | Sn   | 2001                           | National Health Interview Survey   | Cross-sectional                                 | ≥25                     | 29,767                 | (Q)<br>Education, wealth (Q)                  | CVD (Q)                               | Alcohol, smoking,                                     |
| (2007)<br>Kivimäki et al. (2007)                                       | Finland  | 2000-2002                      | The Finnish Public Sector Study  | Cross-sectional                                 | 17-65                   | 48,592                 | Income (OA)                                   | CVD (Q)                               | Alcohol, smoking,                                     |
| Kuper et al. (2007)  | Sweden   | 1991–2002                      | Women's Lifestyle and Health   | Longitudinal                                    | 30-50                   | 47,942                 | Education (Q)                                 | CVD (OA)                              | Alcohol, smoking,                                     |
| Loucks et al. (2007)   | ns   | 1988–1994                      | Conort study<br>NHANES III   | Cross-sectional                                 | ≥25                     | 11,107                 | Education, wealth (Q)                         | MS (OA)                               | Alcohol, smoking,                                     |
| Prescott et al. (2007)   | Denmark  | 1976–2003                      | Copenhagen Swiss National Science  | Cross-sectional                                 | >20                     | 6909                   | Education (Q)                                 | MS (OA)                               | Alcohol, smoking,                                     |
| Ito S et al., 2008 (Ito et al.,  | Japan  | 1990–2003                      | Japan Public Health Center-based   | Longitudinal                                    | 40-59                   | 39,228                 | Education (Q)                                 | ACM, CVD (OA)                         | Alcohol, smoking,                                     |
| Laaksonen et al. (2008)  | Finland  | 1979–2001                      | Frospective Study<br>Finnish Health Behaviors Survey<br>and Finnish National Causes of | Longitudinal                                    | 25-64                   | 000'09                 | Education (Q)                                 | ACM, CVD (OA)                         | PA, diet (Q) Alcohol, smoking, PA, diet (Q)           |
| László et al. (2008)   | Sweden   | 1996–2000                      | Death Register   | Longitudinal                                    | < 75                    | 188                    | Income (Q)                                    | CVD (OA)                              | Alcohol, smoking                                      |
| Marmot et al. (2008)   | UK   | 1985–2004                      | Whitehall II   | Longitudinal                                    | 35-55                   | 5312                   | Occupation (Q)                                | CVD (OA)                              | Alcohol, smoking,                                     |
| Maty et al. (2008)   | sn   | 1965–1999                      | Alameda County Study   | Longitudinal                                    | 17-94                   | 5913                   | Education, occupation,                        | Diabetes (Q)                          | Alcohol, smoking,                                     |
| McFadden et al. (2008)   | UK   | 1993–2006                      | EPIC-Norfolk Cohort  | Longitudinal                                    | 39–79                   | 22,486                 | Occupation (RGC)                              | ACM, CVD (OA)                         | Smoking (Q)   |
| Panagiotakos et al. (2008)<br>Ramsay et al. (2008)                     | Greece<br>UK                                   | 2001–2005<br>1978–2000         | Attica Study<br>British Regional Heart Study   | Longitudinal<br>Cross-sectional                 | ≥18<br>60-79            | 3042<br>2968           | Education (Q) Occupation, childhood SES       | CVD (OA)<br>MS (OA)                   | Alcohol, smoking,                                     |
| Schulz et al. (2008)   | ns   | 2002                           | Healthy Environments Partnership   | Cross-sectional                                 | ≥25                     | 616                    | (RGC)<br>Education, income (Q)                | Obesity (OA)                          | PA (Q)<br>Alcohol, PA (Q)                             |
| Silva et al. (2008)  | Netherlands                                    | 2002–2006                      | Generation R Study   | Cross-sectional                                 | 30-35                   | 8226                   | Education (Q)                                 | CVD (OA)                              | Alcohol, smoking                                      |
| Singh-Manoux et al. (2008)<br>Khang et al. (2009)                      | UK<br>South Korea                              | 1985–2004<br>1998–2001         | Whitehall II<br>Korea National Health and Nutrition<br>Examination Survey (KNHANES)    | Longitudinal<br>Longitudinal                    | 35–55 ≥ 30              | 5363<br>8366           | Occupation (OA)<br>Education, occupation (Q)  | CVD (OA) ACM (OA)                     | Smoking (Q) Alcohol, smoking, PA (Q)                  |
|  |  |                                |  |   |                         |                        |   | (20)                                  | nueu on next page)                                    |

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| Study  | Country          | Survey period          | Study/cohort name  | Type of study                      | Age at<br>baseline | Number<br>included | SEP indicator(s)  | Outcome(s)                | Lifestyle<br>behavior(s)                                |
|--|------------------|------------------------|--|------------------------------------|--------------------|--------------------|---|---------------------------|---|
| McFadden et al. (2009)                               | UK               | 1993–1997              | Norfolk Cohort   | Longitudinal                       | 39–79              | 22,488             | Occupation (RGC)  | CVD (OA)                  | Alcohol, smoking,                                       |
| Münster et al. (2009)                                | Germany          | 2006–2007              | German National Telephone Health                           | Cross-sectional                    | ≥40                | 9267               | Wealth (Q)  | Obesity (Q)               | Smoking (Q)   |
| Rosengren et al. (2009)                              | International    | 1999–2003              | Interheart study   | Longitudinal                       | ≥18                | 27,098             | Education, occupation, income wealth (O)                          | CVD (OA)                  | Alcohol, smoking,                                       |
| Rostad et al. (2009)<br>Skalická et al. (2009)       | Norway<br>Norway | 1995–2007<br>1995–1997 | The HUNT Study<br>Hunt Study                               | Longitudinal<br>Longitudinal       | ≥70<br>24-80       | 5607<br>36,525     | Education (Q) Education, income (OA)                              | ACM, CVD (OA)<br>ACM (OA) | Smoking, PA (Q) Alcohol, smoking,                       |
| Beauchamp et al. (2010)                              | Australia        | 1991–1994              | Melbourne Collaborative Cohort                             | Longitudinal                       | 40-69              | 38,355             | Education (Q)   | CVD (OA)                  | PA (Q) Alcohol, smoking,                                |
| Chaix et al. (2010)                                  | France           | 2007-2008              | Study  | Cross-sectional                    | 30-79              | 5941               | Education, area SES (OA)  | CVD (OA)                  | PA, diet (Q) Alcohol, smoking                           |
| Chapman et al. (2010)                                | ns               | 1995–2005              | Midlife Development in the United                          | Longitudinal                       | 25–74              | 2998               | SES score (Q)   | ACM (OA)                  | (Q) Alcohol, smoking,                                   |
| Kavanagh et al. (2010)                               | Australia        | 1999–2000              | States Study<br>AusDiab Study                              | Cross-sectional                    | 25-64              | 9988               | Education, income (Q)   | Diabetes, CVD             | Alcohol, smoking,                                       |
| Krishnan et al. (2010)                               | sn               | 1995–2007              | Black Women's Health Study                                 | Longitudinal                       | 30-69              | 46,382             | Education, income, area SES                                       | (OA)<br>Diabetes (OA)     | PA, diet (Q)<br>Alcohol, smoking,                       |
| Lantz et al. (2010)                                  | ns               | 1986–2005              | Americans' Changing Live's Survey                          | Longitudinal                       | ≥25                | 3617               | (OA)<br>Education, income (Q)                                     | ACM (OA)                  | PA (Q) Alcohol, smoking,                                |
| Manuck et al. (2010)<br>Maty et al. (2010)           | US<br>US White   | 2001–2005<br>1965–1995 | Adult Health and Behavior Registry<br>Alameda County Study | Cross-sectional<br>Longitudinal    | 30–54<br>20–94     | 981                | SES score (Q) Education, occupation,                              | MS (OA)<br>Diabetes (Q)   | Smoking, PA (Q)<br>Alcohol, smoking,                    |
| Maty et al. (2010)                                   | US Black         | 1965–1995              | Alameda County Study                                       | Longitudinal                       | 20-94              | 4774               | income, childhood SES (Q)<br>Education, occupation,               | Diabetes (Q)              | PA (Q)<br>Alcohol, smoking,                             |
| Schreier and Chen (2010)<br>Steptoe et al. (2010)    | Canada<br>UK     | 2008<br>2006–2008      | Whitehall II Study   | Cross-sectional<br>Cross-sectional | 8–19<br>53–76      | 88<br>528          | income, childhood SES (Q)<br>Childhood SES (Q)<br>Occupation (OA) | CVD (OA)<br>CVD (OA)      | PA (Q)<br>Smoking, PA (Q)<br>Alcohol, smoking,          |
| Stringhini et al. (2010)                             | UK               | 1985–2009              | Whitehall II Study   | Longitudinal                       | 35–55              | 10,308             | Occupation (OA)   | ACM, CVD (OA)             | Alcohol, smoking,                                       |
| Williams et al. (2010)<br>Brummett B.H. et al., 2011 | Australia<br>US  | 1999–2005<br>1995–2008 | AusDiab Study<br>National Longitudinal Study of            | Longitudinal<br>Longitudinal       | ≥25<br>28–30       | 4405<br>14,299     | Education (Q) Education, income,                                  | Diabetes (OA)<br>CVD (OA) | PA, diet (Q) Smoking, PA (Q) Alcohol, smoking,          |
| (Brummett et al., 2011)<br>Demakakos et al. (2012)   | UK               | 1998-2003              | Adolescent Health<br>ELSA                                  | Longitudinal                       | >50                | 7432               | childhood SES (Q) Education, occupation,                          | Diabetes (OA)             | PA (Q) Alcohol, smoking,                                |
| Dinca-Panaitescu et al.                              | Canada           | 2005                   | Canadian Community Health Survey                           | Cross-sectional                    | ≥12                | 98,298             | SES (Q) Education, income (Q)                                     | Diabetes (Q)              | PA (Q)  |
| (2011)<br>Franks et al. (2011)                       | Sn               | 1987–1997              | Atherosclerosis Risk in Communities                        | Longitudinal                       | 45-64              | 15,495             | SES score (Q)   | CVD (OA)                  | Smoking (Q)   |
| Fu et al. (2011)                                     | China            | 2006–2007              | Study<br>Rural Deqing Cohort Study                         | Cross-sectional                    | 18–64              | 2898               | Education, occupation,  | Diabetes (OA)             | Alcohol, smoking,                                       |
| Gustafsson et al. (2011)                             | Sweden           | 1983-2008              | Northern Swedish Cohort                                    | Longitudinal                       | 16                 | 832                | SES score (Q)   | MS (OA)                   | Alcohol, smoking,                                       |
| Niedhammer et al. (2011)                             | France           | 1996–2008              | Lorhandicap Study  | Longitudinal                       | ≥15                | 4118               | Occupation (Q)  | ACM (OA)                  | Alcohol, smoking  |
| Silhol et al. (2011)                                 | France           | 1990-2000              | Gazel Cohort   | Longitudinal                       | 35-55              | 19,808             | Education, occupation,  | CVD (OA)                  | Smoking, diet (Q)                                       |
| Stringhini et al. (2011a)                            | UK-Whitehall     | 1985–2005              | Whitehall II Study   | Longitudinal                       | 35-55              | 9771               | Education, occupation, income (OA)                                | ACM (OA)                  | Alcohol, smoking,                                       |
| Stringhini et al. (2011a)                            | France-Gazel     | 1985–2005              | Gazel Cohort   | Longitudinal                       | 35–50              | 17,760             | Education, occupation, income (OA)                                | ACM (OA)                  | Alcohol, smoking, PA, diet (Q) (continued on next page) |
|  |                  |                        |  |                                    |                    |                    |   |                           |   |

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| Study  | Country            | Survey period             | Study/cohort name   | Type of study                | Age at<br>baseline | Number<br>included | SEP indicator(s)  | Outcome(s)                | Lifestyle<br>behavior(s)              |
|--|--------------------|---------------------------|---|------------------------------|--------------------|--------------------|---|---------------------------|---------------------------------------|
| Dinca-Panaitescu et al.                          | Canada             | 1994–2007                 | Canada's National Population  | Longitudinal                 | >12                | 17,276             | Income (Q)  | Diabetes (Q)              | PA (Q)                                |
| (2012)<br>Hagger-Johnson et al.<br>(2012)        | UK                 | 1984–2009                 | nedili Survey   | Longitudinal                 | 35-75              | 5450               | SES score (RGC)   | ACM (OA)                  | Alcohol, smoking,                     |
| Ploubidis et al. (2013)                          | Kenya - urban      | 2007–2008                 | Nakuru Population-Based Survey                                      | Cross-sectional              | ≥50                | 4314               | Education, wealth (Q)   | Diabetes, CVD             | Alcohol, smoking                      |
| Ploubidis et al. (2013)                          | Kenya - rural      | 2007–2008                 | Nakuru Population-Based Survey                                      | Cross-sectional              | ≥50                | 4314               | Education, wealth (Q)   | Diabetes, CVD             | Alcohol, smoking                      |
| Seligman et al. (2012)                           | population         | 2008–2009                 | Immigration, Culture and  | Cross-sectional              | ≥18                | 711                | Wealth (OA)   | Diabetes (OA)             | (Q)<br>Diet (Q)                       |
| Stringhini et al. (2012a)                        | UK                 | 1991–2009                 | Whitehall II  | Longitudinal                 | 35-55              | 7237               | Occupation (OA)   | Diabetes (OA)             | Alcohol, smoking,                     |
| Tanaka et al. (2012)                             | UK                 | 2004–2008                 | English Longitudinal Study of<br>Ageing                             | Longitudinal                 | >50                | 9432               | Income, wealth (Q)  | Diabetes,<br>obesity      | FA, ulet (Q) Alcohol, smoking, PA (Q) |
| Williams et al. (2012)                           | Australia          | 1999–2004                 | AusDiab Study   | Longitudinal                 | ≥25                | 4572               | Area SES (OA)   | (Q + OA)<br>Diabetes (OA) | Alcohol, smoking,                     |
| Woodside et al. (2012)                           | France and UK      | 1991–2004                 | Prime Study   | Longitudinal                 | 50-59              | 10,600             | Education, wealth (Q)   | ACM, CVD (OA)             | PA, diet (Q)<br>Alcohol, PA, diet     |
| Ni et al. (2013)                                 | Taiwan             | 2002                      | Taiwanese Survey on Prevalence of Hypertension, Hyperglycemia and   | Cross-sectional              | 18–94              | 6188               | SES score (Q)   | MS (OA)                   | (Q) (Q)                               |
| Shamshirgaran et al. (2013)                      | Australia          | 2006–2009                 | Hyperiipidemia<br>45 and Up Study                                   | Cross-sectional              | ≥45                | 266,848            | Education, income, wealth   | Diabetes (Q)              | Smoking, PA (Q)                       |
| Dinwiddie et al. (2014)                          | US - foreign born  | 2001–2008                 | National Health and Nutrition                                       | Cross-sectional              | >20                | 6032               | (Q)<br>Education (Q)  | Diabetes, CVD,            | Alcohol, smoking,                     |
| Dinwiddie et al. (2014)                          | US - US born US    | 2001–2008                 | National Health and Nutrition                                       | Cross-sectional              | ≥20                | 6032               | Education (Q)   | Diabetes, CVD,            | Alcohol, smoking,                     |
| Giesinger et al. (2013)                          | UK                 | 1971–2002                 | 1946 Birth Cohort   | Longitudinal                 | 26                 | 2132               | Childhood SES (RGC)   | ACM (OA)                  | Smoking (Q)                           |
| Hwang and Shon (2014)                            | South Korea        | 2010–2012                 | Korea National Health and Nutrition<br>Examination Survey (KNHANES) | Cross-sectional              | 30-65+             | 14,330             | Education, income, wealth (Q)                                       | Diabetes<br>(Q + OA)      | Alcohol, smoking,<br>PA (Q)           |
| Lear et al. (2014)                               | International      | 2002–2009                 | Prospective Urban Rural<br>Epidemiology Study                       | Cross-sectional              | 35–70              | 139,000            | Wealth (Q)  | Diabetes,<br>obesity      | PA (Q)                                |
| Lipowicz et al. (2014)                           | Poland             | 1983–1993                 | Lower Silesian Centre for Preventive                                | Cross-sectional              | 25-60              | 3887               | Education (Q)   | (Q + OA)<br>MS (OA)       | Alcohol, smoking,                     |
| Nandi et al. (2014)                              | ns                 | 1992; 1998–2008           | Health and Retirement Study   | Longitudinal                 | 57–67              | 8037               | Education, occupation, income, wealth, SES score, childhood SES (O) | ACM (OA)                  | Alcohol, smoking,<br>PA (Q)           |
| Nordahl et al. (2014a)<br>Nordahl et al. (2014b) | Denmark<br>Denmark | 1981–2009<br>Differs-2009 | Social Inequality in Cancer Cohort                                  | Longitudinal<br>Longitudinal | ≥18<br>30-70       | 69,513<br>76,294   | Education (Q) Education (Q)   | CVD (OA)<br>ACM, CVD (OA) | Smoking, PA (Q)<br>Smoking (Q)        |
| Stringhini et al. (2014)                         | Seychelles         | 1989–1994–2004-           | Study<br>Seychelles Study   | Longitudinal                 | 25-64              | 3246               | Occupation (Q)  | ACM (OA)                  | Alcohol, smoking                      |
| Tamayo et al. (2014)                             | Germany            | (2012)<br>2006–2008       | Heinz Nixdorf Recall Study  | Cross-sectional              | 67.2 ± 7.3         | 662                | Education, income, wealth   | Diabetes (Q)              | (Q) Alcohol, smoking,                 |
| Dupre et al. (2015)                              | US elderly (low    | 2006–2008                 | Health and Retirement Study   | Longitudinal                 | 65-75              | 3312               | Education (Q)   | ACM (OA)                  | Alcohol, smoking,                     |
| Dupre et al. (2015)                              | US elderly (high   | 2006–2008                 | Health and Retirement Study   | Longitudinal                 | 65-75              | 3312               | Education (Q)   | ACM (OA)                  | Alcohol, smoking,                     |
| Panagiotakos et al. (2015)                       | Greece             | 2001-2002                 | Attica Study  | Longitudinal                 | 18-89              | 2020               | Education (Q)   | CVD (OA)                  | Alcohol, smoking,                     |
| Robertson et al. (2015b)                         | UK                 | 1987–2008                 | West of Scotland Twenty-07 Study                                    | Longitudinal                 | 35                 | 1444               | Occupation (RGC)  | MS (OA)                   | Alcohol, smoking, PA, diet (Q)        |
|  |                    |                           |   |                              |                    |                    |   | moo)                      | nuea on next page)                    |

(Q) smoking, Alcohol, smoking, Smoking, PA, diet smoking smoking Alcohol, smoking Lifestyle behavior(s) Smoking (Q) 9 PA, diet ( Alcohol, s PA (Q) Diet (Q) PA (Q) Alcohol, s Alcohol, PA (Q) Diabetes (OA) Diabetes (OA) Diabetes (OA) Diabetes (OA) Outcome(s) ACM (OA) ACM (OA) CVD (OA) CVD (OA) MS (OA) MS (OA) Education, wealth, SES score, (Q) Education, childhood SES (Q) Education, childhood SES Education, childhood SES childhood SES (Q) Education, area SES (Q) Occupation, income (Q) SES childhood SES (Q) indicator(s) Education, area Occupation (Q) SES score (Q) (6 + 0A)SEP 9 1,202,983 16,247 3114 9338 6823 826 Age at baseline 42-52 42-52 35-76 30-59 > 50 Cross-sectional Type of study Cross-sectional Cross-sectional Cross-sectional Longitudinal Longitudinal Longitudinal Longitudinal Longitudinal Longitudinal Study of Women's Health Across the Study of Women's Health Across the Danish Work Environment Cohort Million Women Study Jackson Heart Study AusDiab Cohort Study/cohort MOLI-SANI Study ELSA period 1999-2012 2005-2010 1996-2013 1996-2013 2004-2013 2000-2008 1996-2011 1995-2005 Survey 2016 2013 Australia Country taly ŻΚ ΩS ns ns ĽΚ 2016 Bradley Deere and Seth Stringhini et al. (2016) Poulsen and Andersen, Bonaccio et al. (2016) Montez et al. (2016) Montez et al. (2016) Bihan et al. (2016) Floud et al. (2016) Houle et al. (2016) Zhu et al. (2015)

Fable 1 (continued)

methods (FFQ); OA: Objective assessment (death registries, medical records, accelerometer for measure of PA: Physical activity. coronary heart disease), MS: Metabolic syndrome (including allostatic load), prevalence, stroke, Self-administered questionnaire, Qa: Questionnaire adjusted according to validated ACM: All-cause mortality, CVD: Cardiovascular disease (including mortality, incidence, morbidity, physical activity,...), RGC: Registrar's general classification based on occupation ö Assessment methods:

### 3.2. SEP indicators

In two thirds of the included studies (n = 72), only one SEP indicator was used, while 42 studies used more than one indicator. 89 articles used self-administered questionnaires to measure SEP, while 25 relied on more objective methods including work registries or adjusted questionnaires according to validated methods (i.e. Registrar general's classification based on occupation (Hagger-Johnson et al., 2012; Giesinger et al., 2013; McFadden et al., 2008)). The main SEP indicator was participant's education (n = 63), followed by income (n = 31) and occupation (n = 30). Alternative indicators were also used, such as wealth or poverty levels (n = 18), partner's education or occupation (n = 2), area based indicators (n = 8) as well as composite SEP scores (n = 14) which were computed based on several SEP indicators (i.e. education and occupation). Other studies assessed childhood SEP inchildhood

### 3.3. Health outcomes

The majority of studies included only one health outcome (n = 96), 17 studies examined two health outcomes and, one study assessed three outcomes. Generally, health outcomes were assessed through objective measures including death registries or medical records (n = 98). Most studies assessed cardiovascular diseases such as stroke, coronary heart disease or hypertension (n = 57) and all-cause mortality (n = 31). A total of 29 studies assessed diabetes or impaired glucose tolerance, whereas obesity was used as an outcome in 6 studies, and composite health outcomes such as metabolic syndrome and allostatic load were assessed in 10 studies.

### 3.4. Health behaviors

Generally, included studies assessed the contribution of several health behaviors (n = 96), whose information was almost exclusively collected through self-administered questionnaire (n = 113), except for one study that also assessed smoking according to cotinine levels in blood (Woodward et al., 2003). Smoking was the most common behavior assessed (n = 103), followed by physical activity (n = 83), alcohol consumption (n = 73) and dietary patterns (n = 31).

Table 2 shows the median contribution of multiple health behaviors to socioeconomic differences in all-cause mortality and cardiometabolic disorders, stratified by the type of SEP indicator, health outcomes, sex, study region, age groups, type of study and assessment method of health behaviors. Health behaviors generally contributed similarly to the SEP gradient in the health outcomes examined; the median contributions being between 20% and 26% for all-cause mortality, between 16% and 33% for cardiovascular disorders, and between 17% and 29% for metabolic disorders.

However, a generally higher contribution of health behaviors was observed in studies that used occupational position instead of other SEP indicators. Health behaviors generally contributed to a greater extent to the associations between SEP and health outcomes in Northern Europe, with **median contributions** varying between 29% and 36%, followed by the remaining regions (other OECD countries and other low and middle-income countries) (16% to 25%), North America (12% to 25%) and Central/Southern Europe with median contributions ranging between 10% to 18% (one outlier study with 64% contribution (Chaix et al., 2010)). Finally, median contributions tended to be higher in longitudinal studies (23% to 31%) when compared to cross-sectional studies (12% to 21%).

Table 3 presents the median contribution of smoking (Panel A) and alcohol consumption (Panel B) to socioeconomic differences in all-cause mortality and cardiometabolic disorders. The median contribution of smoking to the socioeconomic gradient was the highest for all-cause mortality (19% to 32%), followed by metabolic disorders (14% to

22%) and cardiovascular disease (15% to 17%). However, the median contribution varied according to SEP indicator, and was generally higher for occupation. Smoking contributed to the socioeconomic gradient slightly more in men (12% to 22%) than in women (6% to 19%), and more in Northern Europe (17% to 19%) and North America (2% to 35%), than in Central/Southern Europe (4%) or other regions (11% to 15%). The median contribution of smoking was also higher in studies with greater proportion of younger individuals, as well as in longitudinal studies than in cross-sectional ones. Alcohol's median contribution (Panel B) was higher for cardiovascular disorders (6% to 64%) than for all-cause mortality (-2% to 17%) or metabolic disorders (2%). While no particular difference was observed between men and women, the median contribution of alcohol tended to be higher and broader in North America (2% to 139%) than in other regions.

The contributions of physical activity (Panel A) and dietary patterns (Panel B) to socioeconomic differences in health are shown in Table 4. The median contribution of PA to the SEP-health gradient was higher for all-cause mortality (12% to 20%) and cardiovascular disorders (4% to 19%) than for metabolic disorders (6% to 9%), but varied in men and women according to the SEP indicator. Similarly to smoking and alcohol, the contribution of PA was higher for studies conducted in Northern Europe (6% to 13%) and North America (-2% to 26%) than in Central/Southern Europe (8%). Dietary patterns contributed more to the SEP gradient in all-cause mortality (17% to 21%) and cardiovascular disorders (7% to 24%) than in metabolic disorders (10% to 11%). Furthermore, the median contribution was higher in men (36%) than in women (11%). The contribution of dietary patterns was generally higher in Northern Europe (13% to 26%) and North America (11% to 29%) and for middle-aged individuals (13% to 27%) than for other regions or age groups.

#### 4. Discussion

In this study, we reviewed the evidence on the contribution of smoking, alcohol consumption, physical activity and dietary patterns on social inequalities in all-cause mortality and cardiometabolic disorders. We confirmed the existence of a strong association between SEP and health outcomes, and showed that health behaviors contribute to the SEP gradient in health to varying degrees. In general, the contribution of health behaviors to socioeconomic differences in health was higher in studies conducted in North America and Northern Europe than in Central/Southern Europe, in men than in women, in younger and middle-aged individuals than in older individuals, for smoking when compared to other health behaviors, for all-cause mortality and cardiovascular disease than for metabolic disorders and in longitudinal studies compared to cross-sectional studies. Furthermore, we also observed that the contribution tended to be higher for the socioeconomic gradient in health when occupational position was used as the indicator of socioeconomic position. These findings are of particular interest when considering implementation of prevention policies, as future measures and interventions aiming to reduce the socioeconomic gradient in health could focus on health behaviors with the highest impact in given geographic and sociodemographic contexts (Mackenbach et al., 2008).

Health behaviors are plausible mediators of social inequalities in health as they are strongly socially patterned and simultaneously related to health outcomes (Who and Consultation, 2003; Centers for Disease C, Prevention, 2008; Macintyre, 2000; Doll and Hill, 1950). Previous research has shown that socially disadvantaged individuals tend to adhere more to health detrimental behaviors either due to material and financial constraints, perception of fewer benefits of health behaviors for longevity, a lack of knowledge of their detrimental effect, difficulties to take up health promoting messages as well as more pessimistic attitudes about life (Wardle and Steptoe, 2003; Stringhini et al., 2011b; Pampel et al., 2010). Previous studies have also shown that low SEP individuals lack the resources to buy adequate food or

sports equipment (Laaksonen et al., 2003), or have no access to sports facilities, as safe areas or adequate transport may not be always available (Macintyre, 2000; Chinn et al., 1999). Furthermore, deprived neighborhoods frequently offer little opportunity for a healthy life (Walker et al., 2010). These areas are often characterized by an absence of supermarkets offering a variety of affordable and healthy foods but on the other hand are full of small convenience stores which sell highlyadvertised tobacco, alcohol, processed foods (i.e. snacks, sodas) and no or few fruits and vegetables (Walker et al., 2010). An additional aspect concerns the motivations, beliefs and attitudes that socially disadvantaged individuals have towards health behaviors. For example, it has been shown that less advantaged SEP individuals tend to be less conscious about healthy behaviors, have stronger beliefs in the influence of chance over health and were generally more pessimistic or fatalistic about their life expectancy, altogether acting as an additional barrier to a healthy lifestyle (Wardle and Steptoe, 2003).

### 4.1. Social patterning of health behaviors

Our review confirms that health behaviors contribute to the socioeconomic gradient in health, yet the extent of this contribution varied greatly across included articles, the main reason being the differential social patterning of health behaviors, which designates an unequal distribution of health behaviors across socioeconomic groups in given socio-demographic, regional and cultural contexts (Stringhini et al., 2011b). The differential social patterning of health behaviors according to age, gender and region may be explained by the epidemiologic transition from the "diseases of affluence" towards the "diseases of the poor". According to this model, coronary heart disease and related health behaviors such as smoking and an energy-dense diet were originally more prevalent in the higher socioeconomic groups, but their burden started to gradually shift to the lower SEP groups along with the progression of the epidemiologic transition (Marmot et al., 1978; Wilkinson, 1994). The epidemiologic transition progressed at a different pace in different geographical regions and for men and women, due to economic, social or cultural factors (Omran, 2005). In the same way, it is hypothesized that the socioeconomic gradient in chronic diseases and related health behaviors also reversed (from higher prevalence in the higher SEP groups to higher prevalence in the lower) at different times in different countries and for men than for women (Stringhini et al., 2011b). We have tested this hypothesis by stratifying the articles by periods during which the studies were conducted, and observed that the overall contribution of smoking to the socioeconomic gradient in health has increased over time (results available from the authors). These results are in line with the smoking epidemic model, which shows that smoking prevalence rates differ by gender and SEP in different stages of the epidemic (Lopez et al., 1994). These differences are likely due to socio-cultural factors such as the level of gender equality in the country, as smoking could be/has been perceived as a symbol of emancipation by women, especially in the higher socioeconomic groups at the early stages of the epidemics (Hitchman and Fong, 2011; Huisman et al., 2005). As regions such as Southern Europe are at later stages of the smoking epidemics, smoking may still be more common in women with higher education, likely due to the delayed acquisition of full social and political rights (Hitchman and Fong, 2011; Huisman et al., 2005; Curtin et al., 1997; Thun et al., 2012). The succession of different stages of the smoking epidemic may also explain the differences in the patterning of health behaviors according to age groups, as we observed higher contributions of smoking to the socioeconomic gradient in health in younger and middle-aged individuals compared to older individuals. A possible explanation may be that the behavioral characteristics of a given stage of the smoking epidemic have been imprinted within individuals during specific periods, resulting in a different social patterning of health behaviors across generations (Stringhini et al., 2011a; Lopez et al., 1994; Raho et al., 2015). Hence, in older generations smoking patterns may be the ones observed

Table 2

Median, minimum and maximum contribution of multiple health behaviors for associations between SEP and health outcomes. Contributions are displayed according to education, occupation, other SEP indicators (predictors - columns), and according to six major groups of study settings.

|  | Education  | Occupation                | Other SEP indicators     |
|--|--|---------------------------|--------------------------|
| <sup>a</sup> Outcome                               |  |                           |                          |
| All-cause mortality                                | 24% <sup>b</sup> (-16%;43%) <sup>c</sup> ; n = 11 <sup>d</sup> | 26% (0%;75%); n = 10      | 20% (-3%;55%); n = 12    |
| Cardiovascular disorders                           | 18% (-59%;56%); n = 21   | 26% (-7%;73%); n = 11     | 30% (-16%;69%); n = 15   |
| Metabolic disorders                                | 15% (-43%;67%); n = 24   | 29% (-6%;68%); n = 7      | 19% ( – 11%;61%); n = 23 |
| <sup>a</sup> Sex                                   |  |                           |                          |
| Men  | 9% (-12%;61%); n = 13  | 43% (30%;69%); n = 7      | 26% (-3%;69%); n = 9     |
| Women  | 18% (-43%;64%); n = 18   | 30% (9%;53%); n = 5       | 27% (-6%;68%); n = 14    |
| <sup>a</sup> Region                                |  |                           |                          |
| Central/Southern Europe                            | 18% (-12%;42%); n = 4  | 10% (0%;19%); n = 2       | 64% (64%;64%); n = 1     |
| Northern Europe                                    | 24% (-12%;93%); n = 23   | 36% (-7%;75%); n = 21     | 29% (-6%;69%); n = 24    |
| North America                                      | 14% (-59%;64%); n = 24   |                           | 14% (-16%;60%); n = 15   |
| Other  | 26% (11%;47%); n = 12  | 22% (-6%;73%); n = 5      | 16% (-11%;47%); n = 10   |
| <sup>a</sup> Age-range                             |  |                           |                          |
| Young (≤35 years)                                  | 32% (32%;32%); n = 1   | 24% (24%;24%); n = 1      | 35% (23%;47%); n = 2     |
| Middle-aged (30-65 years)                          | 25% (-16%;50%); n = 20   | 36% (9%;75%); n = 18      | 32% (4%;69%); n = 10     |
| Old (≥65 years)                                    | 27% (11%;67%); n = 5   | 36% (-7%;69%); n = 3      | 36% (13%;61%); n = 9     |
| All age groups                                     | 15% (-43%;64%); n = 28   | 25% ( $-6\%$ ;73%); n = 6 | 16% (-16%;64%); n = 29   |
| <sup>a</sup> Type of study                         |  |                           |                          |
| Cross-sectional                                    | 11% (-59%;64%); n = 26   | 17% (-7%;53%); n = 4      | 14% (-16%;64%); n = 19   |
| Longitudinal                                       | 23% (-16%;67%); n = 30   | 31% (0%;75%); n = 24      | 27% (-6%;69%); n = 31    |
| <sup>a</sup> Assessment method of health behaviors |  |                           |                          |
| Questionnaire<br>Objective assessment              | 18% (-43%;67%); n = 54   | 27% (-7%;75%); n = 28     | 21% (-16%;64%); n = 48   |

<sup>&</sup>lt;sup>a</sup> Study settings according to which the contribution of health behaviors was computed.

during the earlier stages of the smoking epidemic, with a relatively high prevalence of smoking and a weak socioeconomic gradient, while younger generations may be characterized by a smaller smoking prevalence and a strong social patterning of smoking (Lopez et al., 1994; Raho et al., 2015). Alternatively, age related differences in the contribution of health behaviors may also be explained by a decrease in these inequalities with ageing, as older people are more likely to have stopped smoking or decreased alcohol intake (Stringhini et al., 2012c; House et al., 1990). Nevertheless, as a consequence of the ongoing globalization process, the socioeconomic gradient in health behaviors is likely to become increasingly homogenous and omnipresent on a worldwide scale in the next years or decades. Even though we found a stronger contribution of health behaviors to social inequalities in health in Northern Europe or North America compared to other countries, increasing social differences in health behaviors are being reported in a growing number of regions, including emerging economies, as low SEP individuals are being increasingly exposed to unhealthy behaviors, including sedentary behavior and the adherence to the so-called "neoliberal diet", characterized by cheap, highly-processed and energy dense food (Schrecker, 2016; Otero et al., 2015; Prentice, 2006).

In addition to the epidemiologic transition hypothesis, the differential social patterning of health behaviors may also be related to cultural aspects and norms (Thun et al., 2012). Previous studies have suggested that the observed SEP-health behavior gradient in Northern countries may result from the expression of social distinction, while in Southern European regions, dietary patterns, alcohol intake or smoking still tend to be related to cultural norms rather than SEP (Bartley, 2004; Stringhini et al., 2011b). Moreover, in countries such as Italy, Spain or Greece, dietary patterns characterized by a high consumption of fruits, vegetables, olive oil and moderate wine intake were very common in every socioeconomic group as a result of the overall availability of these products (Bartley, 2004). Additional cultural aspects that could explain the differential social patterning of health behaviors by gender may be

related to the perception of body size, standards of beauty or signs of dominance and rank (Prentice, 2006; McLaren, 2007). Previous studies have found that in low and middle income countries, men with high SEP tend to be frequently obese and adhere to health behaviors that would reflect their affluent position and lifestyle, including smoking, an energy-dense diet and sedentary behavior resulting from the use of motorized transport or leisure activities such as television watching. Alternatively, women with high SEP would tend to adopt Western standards of beauty or attractiveness, centered towards thinness and thus pay attention to their lifestyle (Stringhini et al., 2013b; Prentice, 2006; McLaren, 2007).

The stronger contribution of smoking when compared to the contribution of other health behaviors is also related to the degree of social patterning of health behaviors (Jarvis and Wardle, 2005; Lopez et al., 1994). Smoking may be so prevalent among disadvantaged SEP groups as it may help managing stress, regulating mood and dealing with every day hassles occurring as a consequence of poverty and other adverse social circumstances (Graham, 1987). Moreover, while smoking may have become stigmatized in socially advantaged individuals, in lower SEP groups smoking generally remains more tolerated (Jarvis and Wardle, 2005). Smoking uptake occurs earlier in poor children whose parents, family and peers usually smoke or may consider smoking as being the norm or socially acceptable (Jarvis and Wardle, 2005; Stuber et al., 2008).

We have also observed that the contribution of health behaviors tended to be higher when occupation was used as an exposure when compared to education and the other SEP indicators. This may be related to the fact that occupation is strongly associated to work-related stress, job strain and feelings of control (Galobardes et al., 2006; Andresen and Bouldin, 2010). Former studies have shown that these job-related psychosocial factors, particularly stress, may lead to an increased adherence to high-rewarding unhealthy behaviors, such as smoking, alcohol drinking, overeating, or drug use, which eventually

b Median contribution.

<sup>&</sup>lt;sup>c</sup> Minimum and maximum computed contributions for each association. Contribution percentages for each association were computed according to the absolute scale difference method (Stringhini et al., 2010).

d Number of found associations (one study may contain several associations).

Table 3

Median, minimum and maximum contribution of smoking (Panel A) and alcohol (Panel B) for associations between SEP and health outcomes. Contributions are displayed according to education, occupation, other SEP indicators (predictors - columns), and according to six major groups of study settings.

| A. Contribution by smoking                | Education                  | Occupation                              | Other SEP indicators     |
|---|----------------------------|---|--------------------------|
| <sup>a</sup> Outcome                      |                            |   |                          |
| All-cause mortality                       | 19% b (10%;24%) c; n = 7 d | 19% (-5%;32%); n = 9                    | 32% (13%;50%); n = 2     |
| Cardiovascular disorders                  | 17% (-15%;48%); n = 17     | 15% (-13%;36%); n = 7                   | 14% (-11%;136%); n = 14  |
| Metabolic disorders                       | 14% (14%;14%); n = 1       | 22% (5%;35%); n = 4                     | 15% (10%;24%); $n = 3$   |
| <sup>a</sup> Sex                          |                            |   |                          |
| Men                                       | 22% (7%;48%); n = 9        | 23% (14%;36%); n = 8                    | 12% (-11%;27%); n = 5    |
| Women                                     | 14% (-15%;23%); n = 12     | 6% (-13%;35%); n = 4                    | 19% (4%;31%); n = 5      |
| *Region                                   |                            |   |                          |
| Central/Southern Europe                   |                            | 4% (4%;4%); n = 1                       |                          |
| Northern Europe                           | 19% ( -15%;48%); n = 19    | 19% (-13%;36%); n = 17                  | 17% (-11%;50%); n = 14   |
| North America                             | 2% (2%;2%); n = 1          |   | 35% (7%;136%); n = 4     |
| Other                                     | 15% (10%;20%); n = 5       | 11% (6%;16%); n = 2                     |                          |
| <sup>a</sup> Age-range                    |                            |   |                          |
| Young (≤35 years)                         | -7% (-15%;2%); n = 2       | 33% (33%;33%); n = 1                    | 93% (50%;136%); n = 2    |
| Middle-aged (30–65 years)                 | 20% (4%;27%); n = 11       | 18% (-13%;36%); n = 17                  | 18% (11%;31%); n = 6     |
| Old (≥65 years)                           |                            |   | 13% (13%;13%); n = 1     |
| All age groups                            | 15% (4%;48%); n = 12       | 11% (6%;16%); n = 2                     | 9% (-11%;24%); n = 8     |
| Type of study                             |                            |   |                          |
| Cross-sectional                           | 0% (-15%;14%); n = 3       | 25% (14%;35%); n = 2                    | 7% (-11%;24%); n = 6     |
| Longitudinal                              | 19% (4%;48%); n = 22       | 17% (-13%;36%); n = 18                  | 21% (11%;136%); n = 11   |
| <sup>a</sup> Assessment method of smoking |                            |   |                          |
| Questionnaire                             | 17% ( -15%;48%); n = 25    | 18% (-13%;36%); n = 20                  | 18% (-11%;136%); n = 17  |
| Objective assessment                      |                            |   | 29% (27%;31%); n = 2     |
| B. Contribution by alcohol                | Education                  | Occupation                              | Other SEP indicators     |
| Outcome                                   |                            |   |                          |
| All-cause mortality                       | -2% (-11%;10%); n = 3      | 12% (7%;13%); n = 4                     | 17% (17%;17%); n = 1     |
| Cardiovascular disorders                  | 6% (-2%;21%); n = 8        | 10% (3%;18%); n = 2                     | 56% (-2%;261%); n = 6    |
| Metabolic disorders                       | 070 (-270,2170), n = 0     | 2% (2%;2%); n = 2                       | 3070 (-270,20170), H = 0 |
| Sex                                       |                            |   |                          |
| Men                                       | -4% (-6%; -2%); n = 2      |   | 21% (-2%;43%); n = 2     |
| Women                                     | 5% (-11%;21%); n = 5       |   | 11% (6%;24%); n = 3      |
| Region                                    |                            |   |                          |
| Central/Southern Europe                   |                            | 7% (7%;7%); n = 1                       |                          |
| Northern Europe                           | 5% (-11%;21%); n = 9       | 9% (2%;18%); n = 5                      | 15% (-2%;43%); n = 4     |
| North America                             | 2% (2%;2%); n = 1          | , | 139% (17%;261%); n = 2   |
| Other                                     | 5% (5%;5%); n = 1          | 7% (3%;12%); n = 2                      |                          |
| Age-range                                 |                            |   |                          |
| Young (≤35 years)                         | 3% (3%;3%); n = 1          | 2% (2%;2%); n = 1                       | 261% (261%;261%); n = 1  |
| Middle-aged (30-65 years)                 | 0% (-11%;21%); n = 6       | 10% (2%;18%); n = 7                     | 16% (-2%;43%); n = 3     |
| Old (≥65 years)                           |                            | * * *                                   | 17% (17%;17%); n = 1     |
| All age groups                            | 12% (5%;19%); n = 4        |   | 18% (11%;24%); n = 2     |
| Type of study                             |                            |   |                          |
| Cross-sectional                           | 3% (2%;3%); n = 2          |   |                          |
| Longitudinal                              | 6% (-11%;21%); n = 9       | 9% (2%;18%); n = 8                      | 50% (-2%;261%); n = 7    |
| Assessment method of alcohol              |                            |   |                          |
|   |                            |   |                          |
| Questionnaire                             | 4% (-11%;21%); n = 11      | 9% (2%;18%); n = 8                      | 71% (11%;261%); n = 5    |

 $<sup>^{\</sup>rm a}\,$  Study settings according to which the contribution of smoking/alcohol was computed.

lead to adverse health outcomes (Wardle and Steptoe, 2003; Wilkinson and Marmot, 2003).

### 4.2. Physiological aspects

The contribution of health behaviors to the socioeconomic gradient in health also varied depending on the health outcome. This may be related to the fact that some physiological systems are more affected by certain types of behaviors than others. For example, smoking would have greater consequences on occurrence of respiratory diseases, malignancies and atherosclerosis than on obesity, which tends to be more related to dietary patterns and physical activity (Shamshirgaran et al., 2013; Dinwiddie et al., 2014). Furthermore, the contribution of genetic factors varies from one health outcome to another, thus moderating or interfering with the impact of health behaviors (Pilia et al., 2006; Elbein et al., 1999; Mayer et al., 2007; Maskarinec and Noh, 2004).

b Median contribution.

<sup>&</sup>lt;sup>c</sup> Minimum and maximum computed contributions for each association. Contribution percentages for each association were computed according to the absolute scale difference method (Stringhini et al., 2010).

<sup>&</sup>lt;sup>d</sup> Number of found associations (one study may contain several associations).

Table 4

Median, minimum and maximum contribution of physical activity (Panel A) and dietary patterns (Panel B) for associations between SEP and health outcomes.

Contributions are displayed according to education, occupation, other SEP indicators (predictors - columns), and according to six major groups of study settings.

| A. Contribution by physical activity               | Education   | Occupation           | Other SEP indicators  |
|--|---|----------------------|-----------------------|
| <sup>a</sup> Outcome                               |   |                      |                       |
| All-cause mortality                                | 12% <sup>b</sup> (8%;17%) <sup>c</sup> ; n = 3 <sup>d</sup> | 20% (8%;21%); n = 3  | 17% (17%;17%); n = 1  |
| Cardiovascular disorders                           | 4% (-5%;13%); n = 12  | 12% (12%;12%); n = 1 | 8% (-33%;34%); n = 5  |
| Metabolic disorders                                | 9% (9%;9%); n = 1   | 6% (4%;10%); n = 4   |                       |
| <sup>a</sup> Sex                                   |   |                      |                       |
| Men  | 4% (0%;13%); n = 4  | 10% (10%;10%); n = 1 | 15% (3%;27%); n = 2   |
| Women  | 6% (0%;11%); n = 7  | 4% (4%;4%); n = 1    | 9% (9%;9%); n = 1     |
| *Region  |   |                      |                       |
| Central/Southern Europe                            |   | 8% (8%;8%); n = 1    |                       |
| Northern Europe                                    | 6% (0%;17%); n = 13   | 11% (4%;21%); n = 7  | 13% (3%;27%); n = 3   |
| North America                                      | -2% (-5%;1%); n = 2   |                      | 6% (-33%;34%); n = 3  |
| Other  | 9% (9%;9%); n = 1   |                      |                       |
| <sup>a</sup> Age-range                             |   |                      |                       |
| Young (≤35 years)                                  | 1% (1%;1%); n = 1   | 4% (4%;4%); n = 1    | 34% (34%;34%); n = 1  |
| Middle-aged (30–65 years)                          | 7% (-5%;13%); n = 7   | 13% (4%;21%); n = 7  | 15% (3%;27%); n = 2   |
| Old (≥65 years)                                    |   |                      | 17% (17%;17%); n = 1  |
| All age groups                                     | 5% (0%;17%); n = 8  |                      | -12% (-33%;9%); n = 2 |
| Type of study                                      |   |                      |                       |
| Cross-sectional                                    | 2% (-5%; 9%); n = 3   | 7% (4%;10%); n = 2   |                       |
| Longitudinal                                       | 6% (0%;17%); n = 13   | 14% (4%;21%); n = 6  | 18% (3%;34%); n = 5   |
| <sup>a</sup> Assessment method of health behaviors |   |                      |                       |
| Questionnaire                                      | 6% (-5%;17%); n = 16  | 12% (4%;21%); n = 8  | 18% (3%;34%); n = 5   |
| Objective assessment                               |   |                      |                       |

### B. Contribution by diet

|   | Education  | Occupation                                     | Other SEP indicators     |
|---|--|--|--------------------------|
| Outcome   | 21% <sup>a</sup> (17%;25%) <sup>b</sup> ; n = 2 <sup>c</sup> | 170/ (40/-040/) 0                              |                          |
| All-cause mortality<br>Cardiovascular disorders | 21% (17%;25%); n = 2<br>24% (2%;50%); n = 5                  | 17% (4%;24%); n = 3<br>7% (7%;7%); n = 1       |                          |
| Metabolic disorders                             | 24% (2%,50%), II = 5   | 7% (7%, 7%),  if  = 1<br>10% (8%; 11%);  n = 2 | 11% (11%:11%); n = 1     |
|   |  | 1070 (070,1170), 11 = 2                        | 1170 (1170,1170), 11 = 1 |
| Sex   |  |  |                          |
| Men   | 36% (25%;50%); n = 3   |  |                          |
| Women   | 11% (6%;17%); n = 2  |  |                          |
| Region  |  |  |                          |
| Central/Southern Europe                         |  | 4% (4%;4%); n = 1                              |                          |
| Northern Europe                                 | 26% (6%;50%); n = 5  | 13% (7%;24%); n = 5                            |                          |
| North America                                   | 29% (29%;29%); n = 1   |  | 11% (11%;11%); n = 1     |
| Other   | 2% (2%;2%); n = 1  |  |                          |
| Age-range                                       |  |  |                          |
| Young (≤35 years)                               |  | 11% (11%;11%); n = 1                           |                          |
| Middle-aged (30-65 years)                       | 27% (6%;50%); n = 6  | 13% (4%;24%); n = 5                            |                          |
| Old (≥65 years)                                 |  |  |                          |
| All age groups                                  | 2% (2%;2%); n = 1  |  | 11% (11%;11%); n = 1     |
| Type of study                                   |  |  |                          |
| Cross-sectional                                 | 29% (29%;29%); n = 1   |  | 11% (11%;11%); n = 1     |
| Longitudinal                                    | 22% (2%;50%); n = 6  | 13% (4%;24%); n = 6                            | 1170 (1170,1170), 11 = 1 |
| _   | 2270 (270,0070); 11 = 0                                      | 1070 (470,2470); 11 = 0                        |                          |
| Assessment method of diet                       |  |  |                          |
| Questionnaire                                   | 23% (2%;50%); n = 7  | 13% (4%;24%); n = 6                            | 11% (11%;11%); n = 1     |
| Objective assessment                            |  |  |                          |

<sup>&</sup>lt;sup>a</sup> Study settings according to which the contribution of physical activity/diet was computed.

## 4.3. Methodological aspects

Methodological aspects can also explain heterogeneity across studies. Health behaviors may explain a larger proportion of the SEP-health gradient when their assessment is repeated and thus more accurate over time, as in longitudinal studies (Stringhini et al., 2010). The contribution of health behaviors may also vary depending on the specific confounders or modifying factors that are controlled for in the

various studies (Stringhini et al., 2011b).

Finally, we have seen that health behaviors contribute to varying degrees to SEP differences in health, the main reason being the differential social patterning of health behaviors which is due to cultural, political or demographic factors. However, it is important to note that health behaviors do not entirely explain the socioeconomic gradient in health. Other mediators including psychosocial factors, working conditions, environmental exposures as well as access to healthcare likely

b Median contribution.

<sup>&</sup>lt;sup>c</sup> Minimum and maximum computed contributions for each association. Contribution percentages for each association were computed according to the absolute scale difference method ().

<sup>&</sup>lt;sup>d</sup> Number of found associations (one study may contain several associations).

constitute additional mechanisms through which SEP affects health, and the study of their contribution, along with health behaviors, may help understand the SEP gradient globally.

### 4.4. Strengths and limitations

To our knowledge, this is the first study to have systematically reviewed the evidence on the contribution of health behaviors to socioeconomic inequalities in health. Our study has limitations to acknowledge. All the studies included in this review assume a causal association between socioeconomic factors and health. Although the majority of studies were longitudinal studies conducted on healthy individuals where the exposure preceded the outcome, reverse causation cannot be completely ruled out, especially for cross-sectional studies which are less well suited for determining causal associations (Wilkinson and Marmot, 2003; Hellgren and Sverke, 2003; Zapf et al., 1996). While the causal association from health towards SEP was generally found to be negligible when compared to the causal association going from SEP towards health (Wilkinson and Marmot, 2003; Blane et al., 1993; Marmot, 2015), some former studies have reported that children showing evidence of illness were more likely to be downwardly mobile in the socioeconomic structure in later life (Wilkinson and Marmot, 2003; Wadsworth, 1986; Power et al., 1990). Another limitation is the frequent uneven distribution of studies across categories of different aggregating factors (study region, age-range, type of study, assessment method of health behaviors), which challenges interpretation and identification of factors that affect the contribution of health behaviors. Further, differences in the set of confounders included in the analysis across studies may represent an additional source of heterogeneity. Another limitation of this work concerns the use of the absolute difference method to compute the contribution of health behaviors, as this method does not take into account all the possible confounding and interactions between the exposure, the mediators and the outcomes, and is therefore subject to bias (VanderWeele, 2016). Only nine papers used alternative mediation methods, of which two applied the counterfactual mediation methods based on direct and indirect effects (Nordahl et al., 2014a; Nordahl et al., 2014b), which restrict bias by including all possible confounding between the exposure, the mediators and the outcome. Moreover, an additional limitation may be related to the fact that some of the included studies used BMI as a risk factor or a proxy for diet, while other studies used it as an outcome. This differential use of BMI may further challenge the interpretation of the contribution of health behaviors, as BMI was not used consistently across the included studies. Furthermore, differences in sociodemographic aspects, study-periods, and assessment methods of SEP indicators, health behaviors, and health outcomes, greatly challenge between-study comparisons of the contribution of health behaviors to the SEP gradient in health, and preclude conducting formal meta-analyses and assessing associated parameters (i.e. publication bias, quality score). Consequently, this heterogeneity may hinder an adequate interpretation of the contribution of health behaviors and prevent drawing right conclusions (Higgins and Thompson, 2002; Higgins et al., 2003). The use of objective and validated measurement and classification methods such as the European socio-economic classification scheme (ESEC) for classifying socioeconomic position, accelerometer or cotinine levels for assessing health behaviors, and clinical parameters and medical records for determining health outcomes, should be preferred over less valid and inaccurate methods (i.e. self-report), in order to limit bias and further improve the quality of studies (Bartley, 2004; Benowitz, 1996; Petrovic et al., 2016; Prince et al., 2008; Rose and Harrison, 2007). However, we did not assess additional aspects related to study quality in this systematic review, such as comprehensive reporting of results, or the validity and reliability of questionnaire, which may potentially represent a limitation in terms of study comparison. Additionally, longitudinal designs should be preferred over the cross-sectional ones, as they allow to determine causality and mediation, and account for the fact that the assessment of health outcomes, the adherence to health behaviors, and the socio-economic position evolve over the life-course and follow secular trends, as suggested by the epidemiologic transition and the smoking epidemic model (Stringhini et al., 2010; Galobardes et al., 2006; Lopez et al., 1994; Forouhi et al., 2006; Association AD, 2014; Messerli et al., 2007). Finally, another potential issue may be related to the contribution of multiple health behaviors when compared to the contribution of individual health behaviors, as we cannot exclude potential non-additive effects (i.e. interaction between health behaviors) in models adjusting for multiple health behaviors, which may affect or bias the extent of the contribution of health behaviors.

#### 5. Conclusion

This is the first study to provide a complete and comprehensive synthesis on the factors influencing the contribution of health behaviors to the socioeconomic gradient in health. We observed that health behaviors overall contribute to the association between SEP and health outcomes, but that this contribution varies substantially according to geographic location, sex, age, health outcomes and methodological differences between included studies, the main reason for this heterogeneity being the differential socioeconomic patterning of health behaviors in given regional and demographic contexts. While our results provide a global understanding of the role of health behaviors to the socioeconomic gradient in health, they also encourage implementation of policies aimed at reducing socioeconomic inequalities in health, for example addressing the unequal distribution of unhealthy behaviors.

An overall challenge regarding the socioeconomic gradient in health would be to identify all the mediators involved in this association, such as psychosocial factors, material conditions, environmental exposures or work conditions in order to provide a global and complete understanding of mechanisms underlying socioeconomic inequalities in health. Finally, an experimental approach and monitoring regarding the effectiveness of these policies should also be considered to ensure that socioeconomic inequalities are indeed reduced.

### Compliance with ethical standards

For this type of study ethics approval is not required.

## Conflicts of interest

None.

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### Appendix A. Supplementary data

Supplementary data to this article can be found online at https:// doi.org/10.1016/j.ypmed.2018.05.003.

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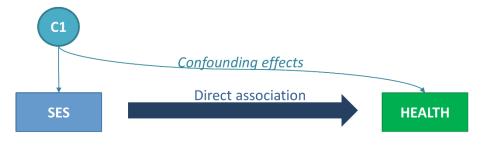
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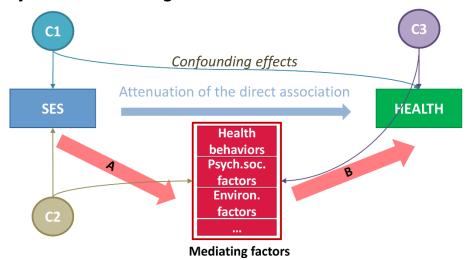
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# **Supplementary material**

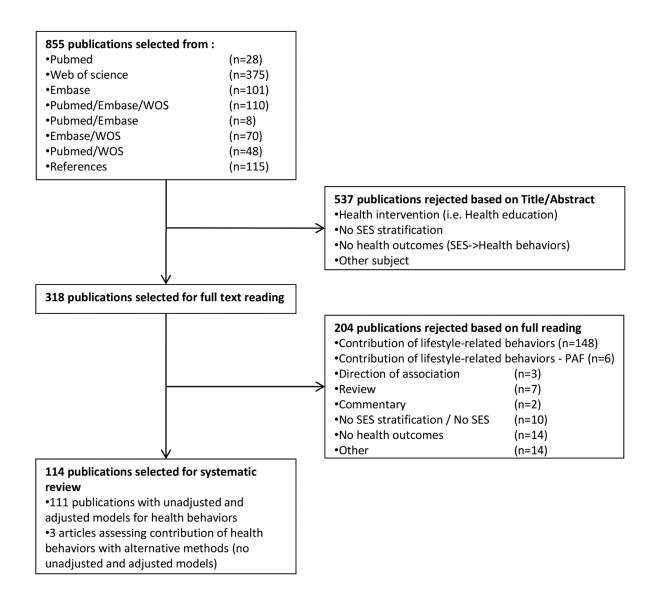
# A. Unadjusted model



# B. Model adjusted for mediating factors



**Supplementary Figure 1:** Conceptual framework representing the association between SEP, mediating factors, health outcomes and confounders (C1-3: i.e. sex, age, pre-existent diseases, genetic predisposition,...). In panel A, the crude or unadjusted model is represented with the direct association leading from SEP to health. In panel B, the model comprises mediating factors, which are thought to be located on the causal pathway between SEP and health. According to this framework, mediating factors are socially patterned (arrow A) and are at the same time associated with health (arrow B). This figure was realized with MO Power Point.



**Supplementary Figure 2:** Flow chart representing the selection of studies to be included in the systematic review. 740 were identified in Pubmed, Web of Science and Embase electronic databases and 115 studies were retrieved from reference lists. 537 studies were rejected based on Title/Abstract reading. 318 studies were selected for full text reading, of which 204 were rejected, yielding 114 studies to be included in the systematic review. Out of the 114 included publications in the systematic review, 111 publications included the SEP-health model unadjusted for health behaviors, and a model additionally adjusted for health behaviors, while three publications did not include these two models and assessed the contribution of health behaviors according to alternative methods. This figure was realized with MO Power Point.

# **Supplementary Table 1:** Computed contribution by health behaviors for the association between SEP and health outcomes.

| -                          |               | Stratification of |                      |  |
|----------------------------|---------------|-------------------|----------------------|--|
| Study                      | Country       | analyses          | Regression parameter | Attenuation by health behaviors  |
| Notkola et al., 1985[1]    | Finland       |                   | Relative risk        | Childhood SEP-CVD - Unadjusted $\beta = 1.63$ (smoking: 14%)   |
|                            |               |                   |                      | M: Education-CVD - Unadjusted $\beta$ = 132.1 (full: 0%) W: Education-CVD - Unadjusted $\beta$ =   |
| Jacobsen et al., 1988[2]   | Norway        | Stratified by sex | Mean difference      | 124.6 (full: 0%)   |
| Jeffery et al., 1991[3]    | US            | Stratified by sex | Other                |  |
|                            |               |                   |                      | M: Education-CVD - Unadjusted $\beta$ = -1.30 (full: 47%) W: Education-CVD - Unadjusted $\beta$ = -  |
| Stamler R. et al., 1992[4] | International | Stratified by sex | Beta coefficient     | 4.47 (full: 35%)   |
|                            |               |                   |                      | M: SEP score-Diabetes - Unadjusted $\beta$ = 1.69 (smoking: 10%) SEP score-CVD - Unadjusted $\beta$  |
|                            |               | a 12 11           |                      | = 1.88 (smoking: -11%) W: SEP score-Diabetes - Unadjusted $\beta$ = 2.82 (smoking: 24%) SEP  |
| Helmert et al., 1994[5]    | Germany       | Stratified by sex | Odds ratio           | score-CVD - Unadjusted $\beta$ = 2.86 (smoking: 4%)  |
| Gliksman M.D. et al.,      | 110           | ***               | 5.1.4                |  |
| 1995[6]                    | US            | Women only        | Relative risk        | M O  |
|                            |               |                   |                      | M: Occupation-ACM - Unadjusted $\beta = 1.86$ (smoking: 24%; full: 38%) Occupation-CVD -   |
| D-1-1                      | Finland       | C44:6: - 4 1      | Hazard ratio         | Unadjusted $\beta = 1.54$ (smoking: 36%; full: 54%) W: Occupation-ACM - Unadjusted $\beta = 1.49$ (smoking: -5%; full: 17%) Occupation-CVD - Unadjusted $\beta = 1.74$ (smoking: -13%; full: 9%) |
| Pekkanen et al., 1995[7]   | US            | Stratified by sex | Odds ratio           | (Smoking: -5%; Iuii: 17%) Occupation-CVD - Unadjusted $\beta = 1.74$ (Smoking: -15%; Iuii: 9%) SEP score-Diabetes - Unadjusted $\beta = 4.09$ (full: 11%)  |
| Brancati et al., 1996[8]   | US            |                   | Odds ratio           | M: Income-ACM - Unadjusted $\beta = 3.14$ (full: 24%) Income-CVD - Unadjusted $\beta = 2.66$ (full:  |
| Lynch et al., 1996[9]      | Finland       | Men only          | Relative risk        | 38%) Income-CHD - Unadjusted $\beta = 3.14$ (full: 21%)  |
| Suadicani et al., 1997[10] | Denmark       | Men only          | Relative risk        | M: Occupation-CVD - Unadjusted $\beta = 4.34$ (full: 2170)   |
| Wannamethee SG et al.,     | Delillark     | Wich only         | Relative 115K        | M: Occupation-CVD - Onadjusted $\beta = 1.44$ (tuli. 0970)<br>M: Occupation-ACM - Unadjusted $\beta = 1.80$ (smoking: 31%; full: 43%) Occupation-CVD -   |
| 1997[11]                   | UK            | Men only          | Relative risk        | Unadjusted $\beta = 1.80$ (smoking: 31%; full: 43%)  |
| Chandola et al., 1998[12]  | UK            | Stratified by sex | Odds ratio           | Onadjastea p 1.00 (Shioking, 5170, tani. 1570)   |
| Lantz et al., 1998[13]     | US            | Stratified by Sen | Hazard ratio         | Income-ACM - Unadjusted $\beta = 3.22$ (full: 13%)   |
| Schrijvers et al.,         |               |                   |                      |  |
| 1999[14]                   | Netherlands   |                   | Relative risk        |  |
| . ,                        |               |                   |                      | M: Wealth-CVD - Unadjusted $\beta = 2.29$ (smoking: 11%) W: Wealth-CVD - Unadjusted $\beta =$  |
| Hart C.L. et al., 2000[15] | UK            | Stratified by sex | Hazard ratio         | 2.27 (smoking: 15%)  |
| Kilander L et al.,         |               | ·                 |                      |  |
| 2001[16]                   | Sweden        | Men only          | Relative risk        | M: Education-CVD - Unadjusted $\beta = 1.67$ (smoking: 25%; diet: 34%)   |
| Suadicani P. et al.,       |               |                   |                      |  |
| 2001[17]                   | Denmark       | Men only          | Risk ratio           | M: SEP score-CHD - Unadjusted $\beta = 1.59$ (smoking: 13%; alcohol: 43%; PA: 27%)   |
| Egeland GM et al.,         |               |                   |                      |  |
| 2002[18]                   | Norway        | Men only          | Risk ratio           |  |
| Van Lenthe et al.,         |               |                   |                      |  |
| 2002[19]                   | Netherlands   |                   | Hazard ratio         | Education-CHD - Unadjusted $\beta = 1.85$ (smoking: 22%; alcohol: 19%; PA: 8%)   |
| Aslanyan et al., 2003[20]  | UK            |                   | Hazard ratio         | Area-CVD - Unadjusted $\beta = 1.06$ (smoking: 0%)   |
|                            | _             |                   |                      | M: Income-CVD - Unadjusted $\beta$ = 1.74 (full: 7%) W: Income-CVD - Unadjusted $\beta$ = 2.01   |
| Osler et al., 2003[21]     | Denmark       | Stratified by sex | Hazard ratio         | (full: -6%)  |
| Stamler et al., 2003[22]   | US            |                   | Beta coefficient     | Education-CVD - Unadjusted $\beta$ = -0.264 (alcohol: 2%; PA: -5%; diet: 29%)  |

| 49 (cmolana, 27%, alaahal, 20%, DA, 20%, full, 60%) W/.   |
|---|
| 48 (smoking: 27%; alcohol: -2%; PA: 3%; full: 69%) W:   |
| smoking: 31%; alcohol: 6%; full: 68%)   |
| d β = 2.90 (smoking: 14%; PA: 10%; full: 30%) W:  |
| = 2.70 (smoking: 35%; PA: 4%; full: 53%)  |
| ed $\beta = 1.35$ (full: 26%)   |
| = 1.33 (smoking: 48%; PA: 0%) W: Education-CVD -  |
| PA: 2%)   |
| 66 (smoking: 10%; alcohol: 10%; PA: 17%)  |
| = 1.31 (smoking: 17%) Education-CVD - Unadjusted $\beta$ =  |
| ACM - Unadjusted $\beta = 1.42$ (smoking: 10%) Education-   |
| (: 10%)   |
| (full: 13%)   |
| (1811. 1370)  |
| = 1.51 (full: 15%)  |
| $\beta = 1.75$ (full: 35%) Occupation-CVD - Unadjusted $\beta =$  |
| Jnadjusted β = 2.74 (full: 32%) Childhood SEP-ACM   |
| dhood SEP-CVD (Unadjusted $\beta = 1.37$ (full 19%)   |
| = 1.47 (full 18%)   |
| 0.39 (full: 10%) W: Education-MS - Unadjusted $\beta = 0.40$  |
|   |
| 57 (full: 17%)  |
|   |
|   |
|   |
|   |
|   |
|   |
| = 2.40 (smoking: 7%; PA: -33%)  |
| $\beta$ = 1.40 (full: 13%) W: SEP score-Diabetes -  |
| 14 (6 11 220/)  |
| 14 (full: 32%)  |
| sted $\beta$ = 2.50 (smoking: 14%; PA: 9%)<br>79 (full: -16%) Income-ACM - Unadjusted $\beta$ = 1.40 (full: |
| /9 (1uii: -10%) income-ACM - Onadjusted p = 1.40 (1uii:   |
| 3 (full: 56%)   |
| .24 (full: 22%) W: Income-CVD - Unadjusted $\beta = 2.12$   |
| 21 (Idii. 2270) W. Income CVD Chacijastea p 2.12  |
| = 2.10 (smoking: 21%; alcohol: 21%; PA: 7%)   |
| 1.33 (full: 16%) W: Education-MS - Unadjusted $\beta = 2.25$  |
| ( )   |
| (full: 8%)  |
| 31 (full: 26%) Education-CVD - Unadjusted $\beta = 1.53$  |
| •   |
| = F6 = A; ( = 3 Jid = 1). 5   |

|  |                      |                   |                                | M: Education-ACM - Unadjusted β = 1.64 (smoking: 24%; alcohol: -6%; PA: 11%; diet: 25%;  |
|--|----------------------|-------------------|--------------------------------|--|
|  |                      |                   |                                | full: 39%) Education-CVD - Unadjusted $\beta = 1.04$ (smoking: 24%; alcohol: -0%; PA: 11%; diet: 25%; full: 39%) Education-CVD - Unadjusted $\beta = 1.46$ (smoking: 27%; alcohol: -2%; PA: 13%; |
|  |                      |                   |                                | diet: 50%; full: 50%) W: Education-ACM - Unadjusted $\beta = 1.32$ (smoking: 20%; alcohol: -   |
| Laaksonen et al.,                                  |                      |                   |                                | 11%; PA: 8%; diet: 17%; full: 34%) Education-CVD - Unadjusted $\beta$ = 2.16 (smoking: 4%;   |
| 2008[46]   | Finland              | Stratified by sex | Hazard ratio                   | alcohol: -2%; PA: 5%; diet: 6%; full: 17%)   |
| Laszlo et al., 2008[47]                            | Sweden               | Women only        | Hazard ratio                   | Income-CVD – Unadjusted $\beta = 0.39$ (smoking: 13%; alcohol: 24%)  |
| Marmot et al., 2008[48]                            | UK                   | Men only          | Hazard ratio                   | M: Occupation-CVD - Unadjusted $\beta = 2.17$ (smoking: 19%; full: 30%)  |
| Maty S.C. et al., 2008                             |                      |                   |                                |  |
| [49]   | US                   |                   | Hazard ratio                   | Childhood SEP-Diabetes - Unadjusted $\beta = 1.60$ (full: 0%)  |
| McFadden et al.,                                   |                      |                   |                                | M: Occupation-ACM - Unadjusted $\beta$ = 2.21 (smoking: 16%) W: Occupation-ACM -   |
| 2008[50]   | UK                   | Stratified by sex | Relative risk                  | Unadjusted $\beta = 1.64$ (smoking: 6%)  |
| Panagiotakos et al.,                               |                      |                   |                                |  |
| 2008[51]   | Greece               |                   | Hazard ratio                   |  |
| Ramsay S.E. et al., 2008                           | 1117                 | 3.6               | 0.11                           |  |
| [52]   | UK                   | Men only          | Odds ratio                     |  |
| Schulz A.J. et al.,<br>2008[53]                    | US                   |                   | Beta coefficient               |  |
| Silva et al., 2008[54]                             | Netherlands          | Women only        | Odds ratio                     | W: Education-CVD - Unadjusted $\beta = 5.12$ (smoking: -15%; alcohol: 3%)  |
| Singh-Manoux et al.,                               | remenanus            | women omy         | Odds ratio                     | w. Education-C v D - Onadjusted $\beta = 3.12$ (smoking13%, alcohol. 3%)   |
| 2008[55]   | UK                   | Men only          | Relative risk                  | M: Occupation-CVD - Unadjusted $\beta = 1.66$ (smoking: 15%)   |
| Khang/Selmer et al.,                               | OK                   | wien omy          | Relative lisk                  | Education-ACM - Unadjusted $\beta = 2.83$ (full: 11%) Occupation-ACM - Unadjusted $\beta = 1.92$   |
| 2009[56]   | South Korea          |                   | Relative risk                  | (full: 12%)  |
| McFadden et al.,                                   | 50 <b>u</b> m 11010u |                   | Trouble of Tibil               | (14111 12/0)   |
| 2009[57]   | UK                   |                   | Hazard ratio                   | Occupation-Stroke - Unadjusted $\beta = 2.62$ (full: 3%)   |
| Münster E et al.,                                  |                      |                   |                                |  |
| 2009[58]   | Germany              |                   | Odds ratio                     | Wealth-Obesity - Unadjusted $\beta = 2.91$ (smoking: 12%)  |
|  |                      |                   |                                | Education-CVD - Unadjusted $\beta = 1.56$ (full: 39%) Occupation-CVD - Unadjusted $\beta = 1.33$   |
| Rosengren et al.,                                  |                      |                   |                                | (full: 73%) Income-CVD - Unadjusted $\beta$ = 1.28 (full: 47%) Wealth-CVD (Unadjusted $\beta$ = 0.79   |
| 2009[59]   | International        |                   | Odds ratio                     | (full: 87%)  |
|  |                      |                   |                                | W: Education-ACM - Unadjusted $\beta$ = 1.21 (full: 18%) Education-CVD - Unadjusted $\beta$ = 1.21   |
| Rostad et al., 2009[60]                            | Norway               | Women only        | Hazard ratio                   | (full: 13%)  |
|  |                      |                   |                                | Education-ACM - Unadjusted $\beta$ = 1.67 (full: 32%) Income-ACM - Unadjusted $\beta$ = 2.03 (full:  |
| Skalicka et al., 2009[61]                          | Norway               |                   | Hazard ratio                   | 14%)   |
| Beauchamp et al.,                                  | 4 . 1*               |                   | TT 1 2                         | Education-CVD - Unadjusted $\beta$ = 1.66 (smoking: 20%; alcohol: 5%; PA: 9%; diet: 2%; full:  |
| 2010[62]   | Australia            |                   | Hazard ratio                   | 32%)   |
| Chair at al. 2010[62]                              | F                    |                   | D-4 £5: -: 4                   | Education-CVD - Unadjusted $\beta$ = 3.96 (full: 30%) Area-CVD - Unadjusted $\beta$ = 2.39 (full:  |
| Chaix et al., 2010[63]<br>Chapman et al., 2010[64] | France<br>US         |                   | Beta coefficient<br>Odds ratio | 64%) SEP score-ACM - Unadjusted $\beta = 1.34$ (full: 55%)   |
| Kavanagh et al., 2010[64]                          | US                   |                   | Odds ratio                     | M: Education-Diabetes - Unadjusted $\beta = 0.41$ (full: 12%) W: Education-CVD - Unadjusted $\beta$  |
| 2010[65]   | Australia            | Stratified by sex | Beta coefficient               | = 4.47 (full: 26%) Income-Obesity - Unadjusted $\beta$ = 3.09 (full: 36%)  |
| Krishnan S. et al.,                                | Australia            | Stratified by sex | Beta coefficient               | W: Education-Diabetes - Unadjusted $\beta = 1.28$ (full: 26%) Income-Diabetes - Unadjusted $\beta =$   |
| 2010[66]   | US                   | Women only        | Risk ratio                     | 1.57 (full: 60%) Area-Diabetes - Unadjusted $\beta = 1.65$ (full: 54%)   |
| 2010[00]   | 55                   | omen omj          | THISK THEFO                    | Education-ACM - Unadjusted $\beta$ = 1.40 (full: 43%) Income-ACM - Unadjusted $\beta$ = 2.12 (full:  |
| Lantz et al., 2010[67]                             | US                   |                   | Hazard ratio                   | 25%)   |
|  |                      |                   |                                | 52   |

| M 1 CD + 1                 |            |                   |                     | GED. GVD II 1' + 10 0.7(/C.11.140/).GED. OI '- II 1' + 10 0.74  |
|----------------------------|------------|-------------------|---------------------|---|
| Manuck S.B. et al.,        | TIC        |                   | 011 6               | SEP score-CVD - Unadjusted $\beta = 0.76$ (full: 14%) SEP score-Obesity - Unadjusted $\beta = 0.74$   |
| 2010[68]                   | US         |                   | Odds ratio          | (full: 4%)  |
| 34 1 2010[60]              | 110 3311 1 |                   | TT 1 2              | Education-Diabetes - Unadjusted $\beta$ = 1.60 (full: 0%) Childhood SEP-Diabetes - Unadjusted $\beta$ |
| Maty et al., 2010[69]      | US White   |                   | Hazard ratio        | = 1.60 (full: 0%)   |
| Maty et al., 2010[69]      | US Black   |                   | Hazard ratio        | Education-Diabetes - Unadjusted $\beta = 0.50$ (full: 0%)   |
| Schreier et al., 2010[70]  | Canada     |                   | Beta coefficient    | Education-CVD - Unadjusted $\beta$ = -0.434 (smoking: 2%; PA: 1%)                                     |
| Steptoe A. et al.,         |            |                   | 3.5                 | 0 1 0777 77 11 10 0004 (011 774)  |
| 2010[71]                   | UK         |                   | Mean difference     | Occupation-CVD - Unadjusted $\beta = 0.824$ (full: -7%)   |
|                            |            |                   |                     | Occupation-ACM - Unadjusted $\beta = 1.60$ (smoking: 31%; alcohol: 12%; PA: 21%; diet: 17%;           |
| Stringhini et al.,         |            |                   |                     | full: 72%) Occupation-CVD - Unadjusted $\beta$ = 3.05 (smoking: 12%; alcohol: 18%; PA: 12%;           |
| 2010[72]                   | UK         |                   | Hazard ratio        | diet: 7%; full: 45%)  |
| Williams et al., 2010[73]  | Australia  |                   | Odds ratio          | Education-Diabetes - Unadjusted $\beta = 2.10$ (full: 21%)  |
| Brummett B.H. et al.,      |            |                   | Unstandardized path |   |
| 2011[74]                   | US         |                   | weights             | Income-CVD - Unadjusted $\beta$ = -0.590 (smoking: 136%; alcohol: 261%; PA: 34%)                      |
|                            |            |                   |                     | Education-Diabetes - Unadjusted $\beta$ = 2.09 (full: 26%) Occupation-Diabetes - Unadjusted $\beta$ = |
| Demakakos et al.,          |            |                   |                     | 1.48 (full: 47%) Income-Diabetes - Unadjusted $\beta$ = 1.63 (full: 40%) Wealth-Diabetes              |
| 2011[75]                   | UK         |                   | Hazard ratio        | (Unadjusted $\beta$ = 2.65 (full: 22%; Childhood SEP – Diabetes Unadjusted $\beta$ = 2.05 (full 20%)  |
|                            |            |                   |                     | M: Education-Diabetes - Unadjusted $\beta$ = 1.19 (full: 61%) Income-Diabetes - Unadjusted $\beta$ =  |
|                            |            |                   |                     | 1.90 (full: -3%) W: Education-Diabetes - Unadjusted $\beta$ = 1.24 (full: 64%) Income-Diabetes -      |
| Dinca et al., 2011[76]     | Canada     | Stratified by sex | Odds ratio          | Unadjusted $\beta = 3.24$ (full: 14%)   |
| Franks et al., 2011[77]    | US         |                   | Hazard ratio        | SEP score-CHD - Unadjusted $\beta = 1.79$ (smoking: 21%)  |
| Fu C et al., 2011[78]      | China      |                   | Odds ratio          |   |
| Gustafsson et al.,         |            |                   |                     | M: SEP score-MS - Unadjusted $\beta$ = 1.79 (full: 47%) W: SEP score-MS - Unadjusted $\beta$ = 2.05   |
| 2011[79]                   | Sweden     | Stratified by sex | Odds ratio          | (full: 23%)   |
| Niedhammer et al.,         |            |                   |                     |   |
| 2011[80]                   | France     |                   | Hazard ratio        | Occupation-ACM - Unadjusted $\beta = 1.88$ (full: 0%)   |
| Silhol et al., 2011[81]    | France     |                   | Hazard ratio        |   |
| Stringhini et al.,         | UK-        |                   |                     | Occupation-ACM - Unadjusted $\beta$ = 1.62 (smoking: 32%; alcohol: 13%; PA: 20%; diet: 24%;           |
| 2011[82]                   | Whitehall  |                   | Hazard ratio        | full: 75%)  |
| Stringhini et al.,         | France-    |                   |                     | Occupation-ACM - Unadjusted $\beta$ = 1.94 (smoking: 4%; alcohol: 7%; PA: 8%; diet: 4%; full:         |
| 2011[82]                   | Gazel      |                   | Hazard ratio        | 19%)  |
| Dinca et al., 2012[83]     | Canada     |                   | Hazard ratio        | Income-Diabetes - Unadjusted $\beta = 1.41$ (full: 11%)   |
| Hagger-Johnson et al.,     |            |                   |                     |   |
| 2012[84]                   | UK         |                   | Hazard ratio        |   |
|                            | Kenya -    |                   |                     |   |
|                            | urban      |                   |                     |   |
| Ploubidis et al., 2012[85] | population |                   | Beta coefficient    |   |
|                            | Kenya -    |                   |                     |   |
|                            | rural      |                   |                     |   |
| f et al., 2012[85]         | population |                   | Beta coefficient    |   |
| Seligman H.K. et al.,      | • •        |                   |                     |   |
| 2012[86]                   | US         |                   | Odds ratio          | Wealth-Diabetes - Unadjusted $\beta = 1.46$ (diet: 11%)   |
| Stringhini et al.,         |            |                   |                     | Occupation-Diabetes - Unadjusted $\beta = 1.86$ (smoking: 5%; alcohol: 2%; PA: 6%; diet: 8%;          |
| 2012[87]                   | UK         |                   | Hazard ratio        | full: 15%)  |
|                            |            |                   | 5                   | 54  |
|                            |            |                   | -                   |   |

| Tanaka et al., 2012[88]           | UK            | Stratified by sex | Odds ratio            | M: Wealth-Diabetes - Unadjusted $\beta$ = 1.93 (full: 32%) W: Wealth-Diabetes - Unadjusted $\beta$ = 3.15 (full: 36%) Wealth-Obesity - Unadjusted $\beta$ = 2.98 (full: 3%)      |
|-----------------------------------|---------------|-------------------|-----------------------|--|
| Williams E.D. et al.,<br>2012[89] | Australia     |                   | Odds ratio            | Area-Diabetes - Unadjusted $\beta = 1.53$ (full: 11%)  |
| Woodside et al.,                  | France and    |                   |                       |  |
| 2012[90]                          | UK            | a                 | Hazard ratio          | Education-ACM - Unadjusted $\beta = 0.85$ (full: 42%)  |
| Ni et al., 2013[91]               | Taiwan        | Stratified by sex | Odds ratio            | M: W: SEP score-MS - Unadjusted $\beta = 0.85$ (full: 7%)  |
| Shamshirgaran et al.,             | 4             |                   | 0.11                  | Education-Diabetes - Unadjusted $\beta = 1.71$ (full: 43%) Income-Diabetes - Unadjusted $\beta = 1.42$   |
| 2013[92]                          | Australia     |                   | Odds ratio            | (full: 12%)  |
|                                   | US -          |                   |                       | M: Education-Diabetes - Unadjusted $\beta$ = 1.22 (full: 0%) Education-CVD - Unadjusted $\beta$ =  |
| B: 111 . 1                        | Foreign       |                   |                       | 3.11 (full: -0%) Education-Obesity - Unadjusted $\beta$ = 1.22 (full: -20%) W: Education-Diabetes  |
| Dinwiddie et al.,                 | born US       | G                 | 0.11                  | - Unadjusted $\beta$ = 0.90 (full: -43%) Education-CVD - Unadjusted $\beta$ = 0.46 (full: 0%) Education-   |
| 2014[93]                          | Mexicans      | Stratified by sex | Odds ratio            | Obesity - Unadjusted $\beta = 1.21$ (full: -4%)  |
|                                   |               |                   |                       | M: Education-Diabetes - Unadjusted $\beta = 1.13$ (full: 0%) Education-CVD - Unadjusted $\beta = 0.02$ (6.1%, 2004) Fig. 1.1.  |
| <b>5</b>                          | US - US       |                   |                       | 2.63 (full: -0%) Education-Obesity - Unadjusted $\beta = 1.12$ (full: -31%) W: Education-Diabetes  |
| Dinwiddie et al.,                 | born US       | G                 | 0.11                  | - Unadjusted $\beta = 0.32$ (full: 3%) Education-CVD - Unadjusted $\beta = 0.46$ (full: -3%) Education-  |
| 2014[93]                          | Mexicans      | Stratified by sex | Odds ratio            | Obesity - Unadjusted $\beta = 1.04$ (full: -24%)   |
| Giesinger et al., 2014[94]        | UK            |                   | Hazard ratio          | Childhood SEP-ACM - Unadjusted $\beta = 1.97$ (smoking: 50%)   |
| H I -4 -1 2014[05]                | C 41- 1/      |                   | 044                   | Education-Diabetes - Unadjusted $\beta = 1.74$ (full: 11%) Income-Diabetes - Unadjusted $\beta = 1.37$   |
| Hwang J et al., 2014[95]          | South Korea   |                   | Odds ratio            | (full: 5%)   |
| I C A -+ -1 2014[06]              | I             |                   | 044                   | Wealth-Diabetes - Unadjusted $\beta = 1.38$ (full: 19%) Wealth-Obesity - Unadjusted $\beta = 1.43$   |
| Lear S.A. et al., 2014[96]        | International | M1                | Odds ratio            | (full: 8%)   |
| Lipowicz et al., 2014[97]         | Poland        | Men only          | Odds ratio            | M: Education-MS - Unadjusted $\beta = 1.30$ (full: -12%) W:  |
| Nandi et al., 2014[98]            | US            |                   | Risk ratio            | SEP score-ACM - Unadjusted $\beta$ = 2.84 (smoking: 13%; alcohol: 17%; PA: 17%; full: 41%) M: Education-CVD - Unadjusted $\beta$ = 1.55 (smoking: 7%; PA: 1%) W: Education-CVD - |
| Nordahl et al., 2014[99]          | Denmark       | Stratified by sex | Hazard ratio          | Unadjusted $\beta = 1.65$ (smoking: 4%; PA: 0%)  |
|                                   |               |                   | Rate difference in    | M: Education-ACM - Unadjusted $\beta$ = 1277 (smoking: 22%) Education-CVD - Unadjusted $\beta$ =   |
| Nordahl et al., 2014              |               |                   | additional death per  | 464 (smoking: 17%) W: Education-ACM - Unadjusted $\beta$ = 746 (smoking: 23%) Education-   |
| [100]                             | Denmark       | Stratified by sex | 100'000 Person-Years  | CVD - Unadjusted $\beta = 200$ (smoking: 15%)  |
| Stringhini et al.,                |               |                   |                       | Occupation-ACM - Unadjusted $\beta$ = 1.80 (smoking: 16%; alcohol: 12%; full: 23%)   |
| 2014[101]                         | Seychelles    |                   | Hazard ratio          | Occupation-CVD - Unadjusted $\beta$ = 1.95 (smoking: 6%; alcohol: 3%; full: 10%)   |
| Tamayo T. et al.,                 |               |                   |                       |  |
| 2014[102]                         | Germany       |                   | Rate/prevalence ratio |  |
| D                                 | US elderly    |                   | **                    |  |
| Dupre et al., 2015[103]           | (low Hba1c)   |                   | Hazard ratio          |  |
|                                   | US elderly    |                   |                       |  |
|                                   | (high         |                   |                       | T1 - 1 - 1 07 6 77 - 11 - 10 - 1 (0 /0 11 110)   |
| Dupre et al., 2015[103]           | Hba1c)        |                   | Hazard ratio          | Education-ACM - Unadjusted $\beta = 1.62$ (full: 11%)  |
| Panagiotakos et al.,              | G.            |                   | B 1                   | THE COURS IN 15 of 10 of 20 (C.11 120)   |
| 2015[104]                         | Greece        |                   | Relative risk         | Education-CVD - Unadjusted $\beta = 1.52$ (full: 13%)  |
| Robertson et al.,                 | 1117          |                   | D                     | Occupation-MS - Unadjusted $\beta$ = -0.450 (smoking: 33%; alcohol: 2%; PA: 4%; diet: 11%;   |
| 2015[105]                         | UK            |                   | Beta coefficient      | full: 24%)   |
| 71                                | China         |                   | 011                   | Occupation-Diabetes - Unadjusted $\beta = 9.04$ (full: -6%) Income-Diabetes - Unadjusted $\beta = 2.89$  |
| Zhu et al., 2015 [106]            | China         |                   | Odds ratio            | (full: -11%)   |
|                                   |               |                   | 5                     | 65   |

| Bihan et al., 2016 [107]   | Australia |            | Hazard ratio  | Area-ACM - Unadjusted $\beta = 1.27$ (full: -3%)   |
|----------------------------|-----------|------------|---------------|--|
| Bonaccio et al., 2016      |           |            |               |  |
| [108]                      | Italy     |            | Hazard ratio  |  |
|                            |           |            |               | Education-CVD - Unadjusted $\beta = 0.67$ (full:-59%); Income-CVD Unadjusted $\beta = 0.54$ (full: -   |
| Deere et al., 2016 [109]   | US        |            | Odds ratio    | 16%)   |
|                            |           |            |               | W: Education-CVD - Unadjusted $\beta$ = 2.46 (smoking: 15%; alcohol: 13%; PA: 11%; full: 40%)          |
| Floud et al., 2016 [110]   | UK        | Women only | Relative risk | Area-CVD - Unadjusted $\beta$ = 1.96 (smoking: 21%; alcohol: 11%; PA: 9%; full: 45%)                   |
| Houle et al., 2016 [111]   | Canada    |            | Other         | Total effect of education: -0.35**; Direct effect: -0.29*; Indirect effect (smoking): -0.05            |
| Montez et al., 2016 [112]  | US        | Women only | Hazard ratio  | W: Education-MS - Unadjusted $\beta = 1.51$ (full: 7%)   |
| Montez et al., 2016 [112]  | US        | Women only | Odds ratio    | W: Education-MS - Unadjusted $\beta = 1.72$ (full: 30%)  |
| Poulsen et al., 2016 [113] | Denmark   | •          | Risk ratio    | Occupation-Diabetes - Unadjusted $\beta = 1.64$ (full: 68%)  |
|                            |           |            |               | Education-Diabetes - Unadjusted $\beta = 1.53$ (full: 67%) Wealth-Diabetes - Unadjusted $\beta = 1.76$ |
| Stringhini et al., 2016    |           |            |               | (full: 61%) SEP score-ACM - Unadjusted $\beta = 2.10$ (full: 45%) Childhood SEP-Diabetes               |
| [114]                      | UK        |            | Hazard ratio  | (Unadjusted $\beta = 1.55$ (full: 45%)   |

ACM: All-cause mortality, CVD: Cardiovascular disease (including mortality, incidence, morbidity, prevalence, stroke, coronary heart disease), MS: Metabolic syndrome (including allostatic load), PA: Physical activity, M: Men, W: Women, Full: Adjustment was performed for all previously mentioned health behaviors (Table 1) or additional covariables added simultaneously to the adjusted model (2) (BMI, hypertension,...)

 $\beta 1: \beta$  coefficient for SEP  $\rightarrow$  Health outcomes unadjusted for health behaviors Contribution percentages were computed according to the absolute scale difference method [72]

**Supplementary Table 2:** Contribution of health behaviors according to the assessment method of SEP indicators (Questionnaire vs. Objective assessment)

| Health behavior           | SEP assessment method | SEP indicator  |                     |                       |  |
|---------------------------|-----------------------|--|---------------------|-----------------------|--|
|                           |                       | Education  | Occupation          | Other SEP indicators  |  |
| Multiple health behaviors | Questionnaire         | 16% <sup>a</sup> (-59%;67%) <sup>b</sup> ; n=53 <sup>c</sup> | 36% (-6%;73%); n=16 | 24% (-16%;69%); n=38  |  |
| _                         | Objective assessment  | 29% (26%;32%); n=3   | 35% (-7%;75%); n=12 | 22% (-6%;64%); n=12   |  |
| Smoking                   | Questionnaire         | 17% (-15%;48%); n=25   | 15% (-13%;36%); n=9 | 16% (-11%;136%); n=14 |  |
|                           | Objective assessment  |  | 22% (4%;33%); n=11  | 18% (0%;50%); n=5     |  |
| Alcohol                   | Questionnaire         | 4% (-11%;21%); n=11  | 7% (3%;12%); n=2    | 50% (-2%;261%); n=7   |  |
|                           | Objective assessment  |  | 10% (2%;18%); n=6   |                       |  |
| Physical activity         | Questionnaire         | 6% (-5%;17%); n=16   | 7% (4%;10%); n=2    | 10% (-33%;34%); n=6   |  |
|                           | Objective assessment  |  | 14% (4%;21%); n=6   |                       |  |
| Diet                      | Questionnaire         | 23% (2%;50%); n=7  |                     |                       |  |
|                           | Objective assessment  |  | 13% (4%;24%); n=6   | 11% (11%;11%); n=1    |  |

<sup>&</sup>lt;sup>a</sup>: Median contribution

**Supplementary Table 3:** Median, minimum and maximum contribution of health behaviors according to the assessment method of health outcomes (Questionnaire vs. Objective assessment)

|                           | Health outcome assessment |  |                          |                       |  |  |
|---------------------------|---------------------------|--|--------------------------|-----------------------|--|--|
| Health behavior           | method                    | Health outcome   |                          |                       |  |  |
|                           |                           | All-cause mortality  | Cardiovascular disorders | Metabolic disorders   |  |  |
| Multiple health behaviors | Questionnaire             | 16% <sup>a</sup> (-59%;67%) <sup>b</sup> ; n=53 <sup>c</sup> | 36% (-6%;73%); n=16      | 24% (-16%;69%); n=38  |  |  |
| _                         | Objective assessment      | 29% (26%;32%); n=3   | 35% (-7%;75%); n=12      | 22% (-6%;64%); n=12   |  |  |
| Smoking                   | Questionnaire             | 17% (-15%;48%); n=25   | 15% (-13%;36%); n=9      | 16% (-11%;136%); n=14 |  |  |
| _                         | Objective assessment      |  | 22% (4%;33%); n=11       | 18% (0%;50%); n=5     |  |  |
| Alcohol                   | Questionnaire             | 4% (-11%;21%); n=11  | 7% (3%;12%); n=2         | 50% (-2%;261%); n=7   |  |  |
|                           | Objective assessment      |  | 10% (2%;18%); n=6        |                       |  |  |
| Physical activity         | Questionnaire             | 6% (-5%;17%); n=16   | 7% (4%;10%); n=2         | 10% (-33%;34%); n=6   |  |  |
| •                         | Objective assessment      |  | 14% (4%;21%); n=6        |                       |  |  |
| Diet                      | Questionnaire             | 23% (2%;50%); n=7  |                          |                       |  |  |
|                           | Objective assessment      |  | 13% (4%;24%); n=6        | 11% (11%;11%); n=1    |  |  |

<sup>&</sup>lt;sup>a</sup>: Median contribution

b: Minimum and maximum contributions for each association. Contribution percentages for each association were computed according to the absolute scale difference method [72]

c: Number of found associations (one study may contain several associations)

b: Minimum and maximum contributions for each association. Contribution percentages for each association were computed according to the absolute scale difference method [72]

c: Number of found associations (one study may contain several associations)

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("cardiovascular disease"[Title/Abstract] OR diabetes[Title/Abstract] OR cardiometabolic [Title/Abstract] OR stroke [Title/Abstract] OR "blood sugar"[Title/Abstract] OR "heart disease"[Title/Abstract] OR coronary[Title/Abstract] OR "metabolic syndrome"[Title/Abstract] OR "myocardial infarction"[Title/Abstract] OR "infarction"[Title/Abstract] OR "blood pressure"[Title/Abstract] OR "hypertension"[Title/Abstract] OR "cardiovascular"[Title/Abstract] OR "all-cause mortality"[Title/Abstract] OR "all cause mortality"[Title/Abstract])

AND ("socioeconomic status" [Title] OR income [Title] OR education [Title] OR occupation [Title] OR "occupational position" [Title] OR "socioeconomic position" [Title] OR "occupational inequalities" [Title] OR "social disparities" [Title] OR "social inequalities" [Title] OR "health inequalities" [Title])

AND (contribut\* OR mediat\* OR attenuat\* OR explain\* OR explanation OR reduc\* OR role)

AND ("lifestyle behaviors" [Title/Abstract] OR smoking [Title/Abstract] OR alcohol [Title/Abstract] OR drinking [Title/Abstract] OR "lifestyle behaviours" [Title/Abstract] OR "lifestyle factors" [Title/Abstract] OR lifestyle [Title/Abstract] OR "health behaviours" [Title/Abstract])

NOT ("cochrane review" [Title] OR "systematic review" [Title] OR "meta analysis" [Title])

NOT (cancer [Title] OR depression [Title] OR respiratory [Title] OR "health education" [Title/Abstract] OR COPD [Title] OR pulmonary [Title] OR CRP [Title] OR "health intervention" [Title/Abstract] OR "education program" [Title/Abstract] OR "lifestyle intervention" [Title] OR "patient education" [Title/Abstract] OR dementia [Title] OR neurolog\* [Title])

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AND ('socioeconomic status':ti OR income:ti OR education:ti OR occupation:ti OR 'occupational position':ti OR 'socioeconomic position':ti OR 'occupational inequalities':ti OR 'social disparities':ti OR 'health inequalities':ti)

AND (contribut\* OR mediat\* OR attenuat\* OR explain\* OR explanation OR reduc\* OR role)

AND ('lifestyle behaviors':ab,ti OR smoking:ab,ti OR alcohol:ab,ti OR drinking:ab,ti OR diet:ab,ti OR 'lifestyle behaviours':ab,ti OR 'lifestyle factors':ab,ti OR lifestyle:ab,ti OR 'health behaviours':ab,ti)

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AND [humans]/lim

AND [abstracts]/lim

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**AND** ('lifestyle behaviors' OR smoking OR alcohol OR drinking OR diet OR 'lifestyle behaviours' OR 'lifestyle factors' OR lifestyle OR 'health behaviours')

**AND** (contribut\* OR mediat\* OR attenuat\* OR explain\* OR explanation OR reduc\* OR role)

## **UNDER TITLE: AND**

('cardiovascular disease' OR diabetes OR cardiometabolic OR stroke OR 'blood sugar' OR 'heart disease' OR coronary OR 'metabolic syndrome' OR 'myocardial infarction' OR 'infarction' OR 'blood pressure' OR 'hypertension' OR cardiovascular OR 'all-cause mortality' OR 'all cause mortality')

('socioeconomic status' OR income OR education OR occupation OR 'occupational position' OR 'socioeconomic position' OR 'occupational inequalities' OR 'social disparities' OR 'social inequalities' OR 'health inequalities')

# UNDER TITLE: NOT

(cancer OR depression OR respiratory OR 'health education' OR COPD OR pulmonary OR CRP OR 'health intervention' OR 'education program' OR 'lifestyle intervention' OR 'patient education' OR dementia OR neurolog\* OR 'cochrane review' OR 'systematic review' OR 'meta analysis' OR 'lifestyle education') Other filters [Left menu, click Refine]: English/French; Articles

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Chapter 2 The contribution of sleep to social inequalities in cardiovascular disorders: a multi-cohort study

# The contribution of sleep to social inequalities in cardiovascular disorders: a multicohort study

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# **Abstract**

## Aims

Sleep disturbances exhibit a strong social patterning, and inadequate sleep has been associated with adverse health outcomes, including cardiovascular disorders (CVD). However, the contribution of sleep to socioeconomic inequalities in CVD is unclear. This study pools data from eight European cohorts to investigate the role of sleep duration in the association between life-course socioeconomic position (SEP) and CVD.

## **Methods and Results**

We used cross-sectional data from eight European cohorts, totaling 111,205 participants. Life-course SEP was assessed using father's and adult occupational position. Self-reported sleep duration was categorized into recommended (6h-8.5h/night), long (>8.5h/night), and short (<6h/night). We examined two cardiovascular outcomes: coronary heart disease (CHD) and stroke. Main analyses were conducted using pooled data and examined the association between life-course SEP and CVD, and the contribution of sleep duration to this gradient using counterfactual mediation. Low father's occupational position was associated with an increased risk of CHD (men: OR=1.19, 95% CI [1.04;1.37]; women: OR=1.25, 95% CI [1.02;1.54]), with marginal decrease of the gradient after accounting for adult occupational position (men: OR=1.17, 95% CI [1.02;1.35]; women: OR=1.22, 95% CI [0.99;1.52]), and no mediating effect by short sleep duration. Low adult occupational position was associated with an increased risk of CHD in both men and women (men: OR=1.48, 95% CI [1.14;1.92]; women: OR=1.53, 95% CI [1.04;2.21. Short sleep duration meaningfully contributed to the association between adult occupational position and CHD in men, with 13.4% mediation. Stroke did not exhibit a social patterning with any of the variables examined.

## Conclusion

This study suggests that inadequate sleep accounts to a meaningful proportion of the association between adult occupational position and coronary heart disease, at least in men. With sleep increasingly being considered an important cardiovascular risk factor in its own terms, our study additionally points to its potential role in social inequalities in cardiovascular disease.

# Translational perspective

This study, including data on 111,205 participants from eight cohorts in four European countries, suggests that inadequate sleep accounts for a meaningful proportion of the socioeconomic gradient in coronary heart disease, at least in men. With inadequate sleep increasingly being considered an important cardiovascular risk factor in its own terms, our study additionally points to its potential role in social inequalities in cardiovascular disease, and should encourage health professionals to consider these factors as major contributors to the pathophysiology of coronary heart disease.

## Introduction

Individuals experiencing adverse socioeconomic circumstances across the life-course are disproportionately affected by cardiovascular disorders (CVD), including coronary heart disease and stroke [1, 2]. Social differences in cardiovascular disorders are partly explained by behavioral or psychosocial factors [3, 4]. However, a significant part of the socioeconomic gradient in cardiovascular disease remains unexplained [4].

Among the factors that may potentially link social disadvantage to CVD is inadequate sleep. First, individuals who experienced social adversity across the life-course report sleep-related problems more frequently than those with more advantaged experiences [5-7]. In particular, people working in shifts, living in deprived neighborhoods, or who have experienced adversity in childhood show an increased prevalence of sleep-related disorders [6, 8-12]. Second, inadequate sleep has been associated with an increased risk of cardiovascular disease [13-15]. Chronic sleep deprivation disrupts the function of several physiological systems including the dysregulation of key endocrine and metabolic processes, which may lead to an aberrant activation of the autonomous nervous system, and the impairment of immunity and inflammatory processes, altogether leading to an increased cardiovascular risk [13, 16, 17]. Excessively long sleep has also been associated with adverse cardiovascular health outcomes, although reverse causation processes whereby individuals sleep longer cannot be excluded [18-21]. To date, however, no large population-based study has assessed the contribution of sleep to the social gradient in CVD [8, 22].

In this study, we examine the associations between indicators of socioeconomic position (SEP) across the life-course and cardiovascular disorders, namely coronary heart disease (CHD) and stroke, by using cross-sectional data from eight cohort studies from four European

countries. Further, we assess to what extent the associations between life-course SEP and CVD are explained by sleep duration by applying the counterfactual mediation model.

### **Methods**

# **Study population**

This study is part of the Lifepath project [23] and uses cross-sectional data from eight cohorts: the French Constances (study period 2012-2016; N=65,843), E3N (2005-2006; N=51,841) and GAZEL (2014; N=10,203), the English Whitehall II (1997-1998; N=6,359) and ELSA (2012; N=5,083), the Swiss COLAUS (2009-2011; N=4,147) and SKIPOGH (2013-2016; N=979) and the Portuguese EPIPORTO (2005-2009; N=2,410) [11, 24-30]. While five cohorts included adults from the general population, E3N, GAZEL and Whitehall II were occupational cohorts and included women working in the French national education sector, employees of the French national gas and electricity company and British civil servants, respectively. All participants underwent a clinical examination and filled a questionnaire collecting data on demographic characteristics, health, medication, education, work, lifestyle and sleep characteristics.

#### **Ethics statement**

Each study was approved by relevant local or national ethics committees and all procedures performed in these studies were in accordance with the 1964 Helsinki declaration and its later amendments or comparable ethical standards. All participants gave written informed consent. This study does not contain any studies with animals performed by any of the authors.

#### Measures

Life-course socioeconomic position

We used father's occupational position and last known adult occupational position as measures of SEP across the life-course. Father's occupational position is a common indicator of SEP in early life, whereas adult occupational position is the most used SEP indicator in adulthood [31]. Both variables capture multiple dimensions of SEP, including education, social prestige, wealth, and retirement benefits, and have been widely used in former studies exploring socioeconomic differences in health [32]. While father's occupational position was self-reported by study participants in all cohorts, adult occupational position was retrieved through work registries in GAZEL and Whitehall II studies, and self-reported in the six other cohorts (Supplementary Table 15). Both SEP indicators were coded according to the nine categories of the European Socio-economic Classification system (ESeC), which is a standard system for classifying professions in social epidemiology, and further grouped in three main categories: "High" (higher professionals/managers, lower professionals/managers, higher clerical), "Middle" (small employers and self-employed, farmers, lower supervisors and technicians) and "Low" (lower clerical, sales workers, skilled/unskilled workers) [33].

#### Cardiovascular disorders

Two cardiovascular disorders were considered as outcomes: coronary heart disease (CHD) and stroke. CHD was defined as reporting ischemic artery disease, angina pectoris, or myocardial infarction, whereas stroke was defined as reporting an ischemic or hemorrhagic stroke. The history of CVD events was based on self-report in GAZEL, ELSA, COLAUS, SKIPOGH and EPIPORTO studies, whereas an objective assessment of cardiovascular outcomes was available in Constances, E3N and Whitehall II cohorts, as these studies included thorough cardiological examinations at interview or had access to participant's medical records (Supplementary Table 15).

Sleep duration

Our study focused on sleep duration as this measure has previously been related to both SEP and CVD and was available in all eight cohorts [13, 34]. Sleep duration was self-reported in all eight cohorts as the average number of hours of sleep per night and subsequently categorized into recommended or normal sleep (6-8.5 h/night), short sleep (<6h/night) and long sleep (>8.5h/night). These thresholds were chosen from clinical practice which found that short sleep (<6h/night) was associated with an increased risk of CVD [14, 35], whereas long sleep (>8.5h/night) was related with preexistent conditions, such as depression [19, 36].

#### Other covariates

Potential confounders we considered included cohort, study period, health behaviors, and flexible working hours. Health behaviors were self-reported in all eight cohorts and included smoking, sedentary behavior and alcohol intake. Smoking status was categorized as current vs. former/never smoker, sedentary behavior was categorized as sedentary vs. non-sedentary based on the amount, frequency, and type of physical activity, whereas alcohol intake was categorized as hazardous intake (>3 daily alcohol units for men, >2 daily alcohol units for women) vs. non-hazardous intake. Flexible working hours were based on the ESeC classification of professions and were categorized as flexible (higher professionals and managers, lower professionals and managers; higher clerical, services and sales workers) and non-flexible (small employers and self-employed; farmers; lower supervisors; technicians; lower clerical, services and sales workers, skilled and unskilled workers).

## Statistical analyses

We tested the association between adult or father's occupational position (main exposure variables) and sleep duration (outcome), using a multinomial logistic regression model adjusted for age, cohort, study period, health behaviors, and flexible working hours. To

account for the effect of adult occupational position in analyses using father's occupational position as the main exposure, we implemented an additional model that was further adjusted for adult occupational position [37]. We used the same set of covariates for the logistic model assessing the association between sleep duration (exposure) and CVD (outcome). We tested the associations between SEP indicators and cardiovascular disorders and the mediating effect of each level of sleep duration by applying the counterfactual mediation method, using the same sets of covariates. The counterfactual mediation method is based on two regression models (Annex 1): a first model predicting the outcome (CHD, stroke) based on the main exposure variable (SEP), the mediator (sleep duration), an interaction term between the main exposure and the mediator, and confounders, and a second regression model predicting the mediator based on the main exposure and confounders. The regression coefficients from the two models are subsequently used to compute counterfactual mediation estimates (Figure 1), namely the natural direct effects (NDE(odds ratio): effect of exposure on the outcome via pathways that do not involve the mediator), natural indirect effects (NIE(odds ratio): effect of exposure on the outcome operating through the mediator), marginal total effects (MTE(odds ratio)=NIE+NDE, total effect of the exposure on the outcome), and the proportion of the association between the exposure and the outcome which is mediated by the mediator (Proportion mediated-PM) [38]. Confidence intervals for MTE, NDE, NIE and PM parameters were computed through bootstrap procedure (random sample with replacement -10,000 simulations). The main statistical analyses were conducted using Stata v.14 (Stata Corp, TX, USA). Statistical significances were set at p-value <0.05.

#### **Individual cohort associations**

To investigate for potential differences between individual cohorts, we repeated the associations between SEP and sleep duration, sleep duration and CVD, and the counterfactual

mediation models between SEP, sleep duration and CVD, cohort by cohort. We also performed a meta-analysis of the eight individual cohorts to examine which studies contributed the most to the pooled data associations, and to explore the inter-study heterogeneity by computing the I2 coefficient.

## Additional sensitivity analyses

Cox regression models for time-to-event event longitudinal analyses

To examine whether the cross-sectional approach could have biased the main findings, we also conducted a series of longitudinal analyses using Cox regression models for the associations between SEP at baseline and CVD occurrence, and between sleep duration at baseline and CVD occurrence, using time-to-event data from Whitehall II study through waves 1 to 8 (w1 1985-1988, w2 1989-1990, w3 1991-1993, w4 1995-1996, w5 1997-1999, w6 2001, w7 2003-2004, w8 2006)[27]. We included 6805 individuals with complete data at waves 1-8, and tested the proportional hazard assumptions for Cox regression models by using log-log plots (not violated).

Multiple imputation for missing data for health behaviors

To test for bias that would result from missing values, we imputed missing data for health behaviors (confounding factors) using chained equations based on SEP, cardiovascular disorders and major confounders (Stata procedure "mi") [39].

Confounding by sleep quality indicators and other cardiometabolic disorders

We further explored potential confounding effects by four binary sleep quality indicators, namely "Difficulty falling asleep", "Difficulty waking up in the morning", "Waking up during the night", and "Waking up too early", by including them as covariables in counterfactual

mediation analyses between SEP indicators, sleep duration, and CVD (Annex 1). We also explored the potential confounding/contribution to the main associations by further adjusting for two major cardiometabolic disorders, namely type 2 diabetes (T2D), and obesity (Annex 2).

Comparison of studies using objective assessment vs. self-reported data

To investigate whether the methodology of data acquisition could have affected our findings, we compared the gradients for the associations between SEP and sleep duration, sleep duration and CVD, and the mediation by sleep duration to the SEP gradient in CVD, between cohorts that either used an objective assessment of the data for the main endpoints (Constances, E3N, Whitehall II) cohorts that were based on self-report (GAZEL, ELSA, COLAUS, SKIPOGH, EPIPORTO).

Education as the main SEP indicator

In addition to father's and adult occupational position, we also used education as the main exposure variable, in order to examine the association between education and sleep duration, and to assess the contribution of sleep duration to the educational gradient in CVD.

Extreme sleep duration thresholds

Finally, we repeated the associations between SEP and sleep duration, sleep duration and CVD, and the contribution of sleep duration to the SEP gradient in CVD using extreme sleep duration thresholds, namely 0h-5h for short sleep duration, and >10h for long sleep duration.

## **Results**

From the initial 188,238 participants from the eight cohorts, 37,682 were excluded due to missing information on health behaviors, 3,691 for missing sleep duration, 17,328 for missing

adult occupational position, and 18,332 participants for missing father's occupational position, leaving a total of 111,205 participants to be included in the study. Excluded participants were more frequently women (73% vs. 67%) and had a lower adult occupational position than those included in the study (20% vs. 26% in the high occupation group).

### Sample characteristics

We report the characteristics of the study population in **Table 1**. In the majority of the cohorts, low and middle father's occupational positions were the most prevalent, whereas the distribution of adult occupational position varied among studies and countries, with high and middle adult SEP groups being generally more prevalent in English cohorts, and low and middle adult SEP groups being more common in Southern European cohorts. The prevalence of short sleep ranged between 3% and 14% (6% for pooled data) and was higher in ELSA (14%) and lower in E3N and EPIPORTO (3% and 5%, respectively), while the prevalence of long sleep ranged between 9% and 27%, and was lower in Whitehall II, SKIPOGH and COLAUS (2%-5%), and higher in EPIPORTO (27%). The distribution of detrimental health behaviors varied substantially across the cohorts, and prevalence estimates ranged between 7% and 26% for current smoking, between 8% and 42% for hazardous alcohol intake, and between 6% and 81% for sedentary behavior. The prevalence of CHD ranged between 1% and 13%, with highest prevalence estimates being observed in Whitehall II and ELSA (13%), while the prevalence of stroke ranged between 1% and 5%, with highest prevalence being in ELSA.

### Association between life-course SEP indicators and sleep duration

We show the association between life-course SEP indicators and sleep duration using pooled data in **Table 2**. We found a U-shaped association between father's occupational position and

sleep duration, with low SEP being more strongly associated with short sleep (A. Odds Ratio(OR)=1.18, 95% Confidence Interval(CI)[1.07;1.31], women: OR=1.31, 95% CI [1.20;1.44]), than long sleep (A. OR=1.01, 95% CI [0.92;1.11], women: OR=1.07, 95% CI [1.01;1.14]). The association between father's occupational position and sleep duration persisted after accounting for adult SEP. Larger effect size and stronger associations were observed for the association between adult occupational position and sleep duration, with stronger associations in men than in women. As for father's occupational position, however, we found stronger associations for short sleep (men: OR=2.22, 95% CI [1.85;2.66], women: OR=2.12, 95% CI [1.82;2.47]), than for long sleep (men: OR=1.88, 95% CI [1.59;2.23], women: OR=1.14, 95% CI [1.03;1.27]).

#### Association between sleep duration and cardiovascular disorders

The association between sleep duration and cardiovascular disorders is presented in **Table 3**. Short sleep was associated with an increased risk of CHD in both sexes (CHD-men: OR=1.65, 95% CI [1.41;1.92]; women: OR=1.59, 95% CI [1.28;1.97]), whereas it was associated with an increased risk of stroke in women but not in men (Stroke-men: OR=1.16, 95% CI [0.84;1.60]; women: OR=1.31, 95% CI [1.03;1.66]). We also observed a higher risk of stroke in participants with long sleep (men: OR=1.51, 95% CI [1.17;1.95]; women: OR=1.24, 95% CI [1.06;1.49]), while long sleep was also associated with an increased risk of CHD in women (OR=1.24, 95% CI [1.03;1.43]).

Association between life-course SEP indicators and CVD, and the contribution of sleep duration

In **Table 4**, we present the counterfactual mediation models for the associations between SEP indicators and cardiovascular disorders, mediated by short sleep duration. We observed an

inverse association between father's occupational position and CHD in both men and women (A. men: marginal total effect (MTE – OR scale)=1.19 95% CI [1.04;1.37], women: MTE (OR) = 1.25 95% CI [1.02;1.55]). Upon accounting for the effect of adult occupational position, the gradient between father's occupational position and CHD was marginally decreased (B. men: MTE (OR)=1.17 95% CI [1.02;1.35], women: MTE (OR) = 1.22 95% CI [0.99;1.51]). Sleep did not mediate the association between father's occupational position and stroke. We found a strong inverse association between adult occupational position and CHD risk in both sexes (C. men: MTE (OR)=1.45 95% CI [1.13;1.86], women: MTE (OR) = 1.52 95% CI [1.07;2.11]), with 13.4% mediation of this association by short sleep duration in men. We also evaluated the contribution of *long* sleep duration to the life-course socioeconomic gradient in cardiovascular disorders, but found no meaningful mediation (**Supplementary Table 1**).

#### **Individual cohort associations**

We further examined the associations between SEP and sleep duration, sleep duration and cardiovascular disorders, and the mediating effect of short sleep duration to the association between SEP and cardiovascular disorders on each cohort separately (Supplementary Tables 2-8). Overall, we found that low adult occupational position was associated with an increased risk of short and long sleep duration in the majority of cohorts (Constances, E3N, Whitehall II, ELSA, COLAUS, SKIPOGH, EPIPORTO), with generally stronger odds ratios for short sleep than long sleep, whereas there were fewer associations between father's occupational position and sleep duration, with stronger associations in the model unadjusted for adult occupational position. We also found associations between short sleep duration and an increased risk of CHD, with significant associations being observed in Constances, GAZEL, E3N and Whitehall II cohorts, whereas there were fewer associations between sleep duration

and stroke, in both unadjusted and adjusted models for adult occupational position. Furthermore, in most of the studies, results from mediation analyses were uninformative and yielded non-significant estimates for the mediation by short sleep duration due to low statistical power, the few exceptions being the inverse associations between father's occupational position and CHD in Constances and Whitehall II studies (Supplementary **Tables 6-7**), and a strong inverse association between adult occupational position and CHD in Whitehall II (Supplementary Table 8). Finally, we performed a meta-analysis using adult occupational position, sleep duration, and CHD, in order to examine which cohorts contributed the most to the pooled data associations (weights), and to examine the degree of heterogeneity across the cohorts (Supplementary Figure 1). We found a high inter-study heterogeneity for the SEP-sleep duration gradient, while there were more consistent gradients for the associations between sleep duration and CHD, the adult occupational gradient in CHD (MTE), and the mediating effect by sleep duration (NIE) across the cohorts. The observed heterogeneity for the SEP-sleep duration gradient may be explained by the different gradients found in GAZEL, SKIPOGH, and EPIPORTO studies when compared to the other cohorts. A possible explanation for these differences may be the lack of statistical power, as well as a weaker socioeconomic patterning of sleep duration in these studies.

### Additional sensitivity analyses

Cox regression models for time-to-event event longitudinal analyses

As there is currently no methodology allowing to apply counterfactual mediation modelling to time-to-event longitudinal analysis, main analyses presented in this study were performed cross-sectionally. To assess whether this may have biased our findings for the main associations examined, the one between adult SEP and CVD and the one between sleep duration and CVD, we repeated the analysis using a longitudinal design in a cohort where

repeated data was available (Whitehall II). Using time-to-event analyses fitted through Cox regression models, we observed that low occupational position and short sleep (baseline, wave 1) were systematically associated with a higher risk of CHD events through waves 1 to 8 when compared to higher adult occupational position, and normal or long sleep duration. There were no clear gradients in women and for stroke, likely due to lack of statistical power and insufficient number of events (Supplementary Tables 9-10; Supplementary Figures 2-3).

Multiple imputation for missing data for health behaviors

We performed further sensitivity analyses by imputing missing values for confounders using chained equations, and by investigating the potential confounding effects of four sleep quality indicators in the cohorts where this information was available. We observed that there were no important differences between the associations using the complete case data from those using imputed data (**Supplementary Tables 11-12, Tables 2-3**).

Confounding by sleep quality indicators

We also found that sleep quality indicators could act as potential confounders of the association between life-course SEP, sleep duration, and CVD, as they were simultaneously associated with sleep duration and CVD in the counterfactual models (**Supplementary Tables 13-14**).

Comparison of studies using objective assessment vs. self-reported data

We further investigated whether the fact that several data were self-reported could have biased our results by comparing the associations between SEP and sleep duration, sleep duration and CHD, the association between SEP and CHD (MTE), and the mediation of this association by sleep duration between cohorts that used objective assessment of CHD and

those with self-reported data (**Supplementary Tables 16-18**). Results from cohorts that used objectively assessed data provided systematically stronger gradients than cohorts that were based on self-report, including meaningful mediation by short sleep duration (11.1%). However, we cannot conclude that these differences are exclusively attributed to the assessment method of CHD, as there were major regional differences between the two groups of cohorts.

Education as the main SEP indicator

We also investigated to what extent education was associated with sleep duration, and whether the educational gradient in CVD outcomes was mediated by short sleep duration (**Supplementary Tables 19-20**). We observed that low education was associated with an increased risk of short sleep duration and a higher risk for CHD, and that this association was significantly mediated by short sleep duration (9.2%). These associations and mediation were systematically weaker than those involving adult occupational position, and somewhat higher compared to associations using father's occupational position as main exposure.

Confounding/contribution by cardiometabolic disorders

Moreover, we also performed a series of additional analyses where associations between adult occupational position, sleep duration, and CHD were further adjusted for type 2 diabetes and obesity (**Supplementary Tables 21-23**). We observed that the associations between adult SEP and short sleep, and between short sleep and CHD were attenuated upon adjustment for type 2 diabetes (T2D) and obesity, whereas the association between SEP and CHD and the contribution of short sleep duration to this association were no longer significant.

Extreme sleep duration thresholds

Finally, we also examined the associations between adult SEP, sleep duration, and CHD, using more extreme thresholds for sleep duration; 0h-5h for short sleep duration, and >10h for long sleep duration (**Supplementary Tables 24-26**). We generally found stronger gradients for the association between adult SEP and extreme sleep duration, and for extreme sleep duration and CHD, in particular for the 0h-5h sleep duration category. These findings indicate that extreme sleep patterns are more prevalent among socially disadvantaged individuals, and that they have stronger effects on cardiovascular outcomes. Furthermore, we also observed that there was a somewhat weaker mediation by extreme short sleep duration (0h-5h) when compared to the former threshold (0h-6h), which was due to a weaker indirect effect (NIE).

### **Discussion**

In this study, we found that both father's and adult occupational position were associated with abnormal sleep duration patterns, with stronger associations for adult than for early life SEP, and for short sleep than for long sleep. Furthermore, abnormal sleep duration was associated with an increased risk of cardiovascular disorders, with stronger associations for short sleep than for long sleep. Finally, we observed that there were inverse associations between both life-course SEP indicators and CHD, and that the association between adult occupational position and CHD was partly explained by short sleep duration, at least in men.

Our results on life-course socioeconomic gradient in short sleep duration tend to be in line with previous studies [6, 12, 34]. Former research has reported that adverse socioeconomic circumstances in childhood affect sleep health in adulthood through a latent effect, and that this association may be related to the fact that stressful childhood experiences lead to disrupted emotion regulation in adulthood, which in turn has a negative impact on adult sleep [12, 40]. The adult occupational gradient in sleep duration may be related to the fact that individuals with lower grade occupations often have to combine several jobs, work in shifts,

and live in noisy environments, thus experiencing greater levels of stress, altogether leading to sleep deprivation [5, 11, 22]. The stronger association between adult occupational position and short sleep duration when compared with father's occupational position and education may be related to the fact that adult occupational position directly acts on proximal exposures which affect sleep, such as poor housing, work stress, and recent psychosocial exposures, whereas father's occupational position and education likely act through more indirect effects that have occurred in early life [7, 40, 41]. Interestingly, we also observed that individuals with low father's and adult occupational position were more likely to have excessively long sleep duration, when compared to high SEP individuals. However, while short sleep duration is more probably the consequence of adverse socioeconomic circumstances, later leading to adverse health outcomes, long sleep duration more probably results from preexisting conditions, such as depression, that affect socially disadvantaged individuals more [18-21, 35].

Our study also confirms the relationship between short sleep duration and an increased risk of CHD and stroke [13]. Mechanistic studies suggest that chronic sleep deprivation may result in hypertension, elevated inflammation, and atherosclerosis through an aberrant activation of the sympathetic nervous system, as well as to an increased risk of type 2 diabetes (T2D) and obesity, altogether leading to cardiovascular events [13, 15, 42]. In a series of sensitivity analyses additionally adjusted for T2D and obesity, we observed that the association between adult SEP and CHD, and the contribution of sleep duration were no longer significant, which may be attributed to potential confounding or even mediation, whereby T2D and obesity could constitute an additional intermediate step between chronic sleep deprivation, and the eventual occurrence of CHD or stroke. The potential role of inappropriate nutrition as an

additional step in this chain of causation could not be investigated in our study and shall be the subject of additional research.

We also found that long sleep duration is associated with an increased CVD risk, but to a lesser extent than short sleep, which is line with previous studies reporting that an excessively long sleep duration is also associated with adverse health outcomes, including CVD [21]. Nevertheless, the underlying mechanisms linking sleep duration and CVD are not the same for short and long sleep duration, and long sleep duration is often mentioned as a consequence of preexisting illnesses rather than a cause [18-21]. While there is no clear evidence that sleeping more than eight hours per night could lead to adverse health outcomes in healthy individuals, former research has often reported that major depressive disorder is a strong predictor of excessive sleeping, suggesting that depression may confound the associations between long sleep and adverse health-related outcomes [18].

Our study found that there was an inverse association between adult occupational position and CHD in both men and women, which is in line with previous research [43]. We also observed that short sleep duration significantly contributed to the adult occupational gradient in CHD in men, but not in women. The absence of mediation by short sleep duration in women may be related to the fact that there was a weaker adult occupational gradient in short sleep duration in women than in men. Overall, these gender-related differences may be explained by additional sociodemographic and socioeconomic factors, such as the fact that low SEP women often have to combine the physical and psychosocial strain of manual, less paid jobs to that of numerous household responsibilities and stress, which eventually negatively affects their sleep and its health-restoring effects when compared to men <sup>11</sup>. Furthermore, we found an inverse association between father's occupational position and CHD, which was only marginally decreased upon accounting for adult occupational position. These findings indicate

that father's occupational position likely affects CHD through latent mechanisms, whereby adverse socioeconomic circumstances in early life have left permanent biological imprints that translate into higher CHD risk in later life [37, 44]. Finally, we also observed that there were no associations between both life-course SEP indicators and stroke, which may be related to a differential socioeconomic patterning, and different pathophysiology and risk factors for these two cardiovascular disorders [45, 46]. Another explanation may be related to a lack of statistical power, as the occurrence of stroke was much lower than the occurrence of CHD events throughout the included cohorts.

#### Strengths and limitations

Our study has several strengths. First, to our knowledge this is the first study to investigate the contribution of sleep duration to the association between life-course socioeconomic position and cardiovascular disorders. Second, we used data from eight cohorts conducted in four European countries, involving more than 111,000 participants. Our study also has some limitations to acknowledge. First, the demographic, epidemiological and methodological differences between the eight cohorts represent a vast challenge in terms of data harmonization, and may result in important heterogeneity, particularly concerning the occurrence and assessment of cardiovascular outcomes. While the difference in CHD prevalence between the Northern (Whitehall II, ELSA) and the Southern European cohorts (Constances, E3N, GAZEL, SKIPOGH, COLAUS) may be attributed to the well-established North-South gradient in CHD prevalence in Europe [47], potential bias resulting from a differential reporting of cardiovascular outcomes cannot be excluded. In particular, the absence of objectively assessed health-related outcomes and the lack of access to medical records may result in important self-report and recall biases, eventually yielding differential SEP-CVD and sleep duration-CVD gradients across included studies [48, 49]. These types of

systematic errors represent an important issue in epidemiological studies, especially given the fact that factors such as education and other SEP variables were found to influence recall bias in retrospective cohorts [48]. Furthermore, another limitation related to procurement methodology is the systematic difference observed between self-reported and objectively measured sleep duration, which could not be accounted for in the present analyses [50]. Additional issues may be related to the statistical methodology applied in this study. In particular, cross-sectional analyses do not allow determining the causal direction of associations, which can be a particular issue for analyses involving sleep disturbances and health-related outcomes, as the relation between these two factors is not exclusively unidirectional. However, we managed to address this issue by performing a series of longitudinal analyses in Whitehall II study. Furthermore, apart from the contribution of sleep duration, we must acknowledge the role of other potential confounders or mediators of the socioeconomic gradient in cardiovascular disorders, including hypertension, hyperlipidemia, life-related factors, working hours, psychosocial exposures, and environmental factors, whose contribution was not examined in this multi-cohort study. Finally, the lack of information on objectively measured sleep disorders (i.e. sleep-disordered breathing) as well as sleep quality indicators in the majority of cohorts may be another limiting factor in this study, as sleep apnea and sleep quality have been found to be associated with CVD risk as well as sleep duration, and could potentially confound the causal pathways involving SEP, sleep duration, and cardiovascular disorders [51-53].

#### Conclusion

In summary, this large pan-European analysis suggests that short sleep duration is a potential mechanism underlying the association between adult occupational position and CHD.

Additional longitudinal analyses shall be conducted to further investigate the causal

relationship between SEP, sleep duration and CVD. Finally, the role of other sleep features, in particular sleep quality, shall further be investigated as potential confounders of the associations between SEP, sleep duration, and CVD.

### **Author's contributions**

SS, DP, CC and MCH designed the study. JHR, MK-I, PVi, MK, MG, FR, AD'E, MB, PVo, HB, SF, MG, MZ, AS, CD, RH, and SS actively contributed to data acquisition and harmonization. DP, SN, SS, CC, MCH analyzed the data. DP, SS, CC, MCH, JHR, CDM, MK-I, PVi, MK, SN, MG, FR, AD'E, MB, PVo, HB, SF, MG, MZ, AS, CD, RH critically revised the manuscript.

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# Disclosure of potential conflicts of interest

The authors declare that they have no conflict of interest.

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**Table 1:** General characteristics of included participants by cohort

|  | Constances  | GAZEL       | E3N          | Whitehall II | ELSA       | COLAUS     | SKIPOGH      | EPIPORTO   | Pooled data  |
|--|-------------|-------------|--------------|--------------|------------|------------|--------------|------------|--------------|
|  | N=50,463    | N=8,760     | N=39,258     | N=4,356      | N=3,838    | N=2,228    | N=854        | N=1,448    | N=111,205    |
| % Women                                    | 26437 (52%) | 2059 (24%)  | 39258 (100%) | 1239 (28%)   | 2144 (56%) | 1149 (52%) | 432 (51%)    | 864 (60%)  | 73582 (66%)  |
| Age (mean±SD, y)                           | 48.4 (±13)  | 68.9 (±3.4) | 64 (±6.3)    | 55.7 (±6)    | 72 (±8.7)  | 53 (±8)    | 50.3 (±16.2) | 52 (±13.3) | 56.8 (±13.1) |
| Father's occupationnal position (N, %)     |             |             |              |              |            |            |              |            |              |
| High                                       | 10933 (22%) | 3251 (37%)  | 6303 (16%)   | 426 (10%)    | 396 (10%)  | 718 (32%)  | 215 (25%)    | 195 (13%)  | 22437 (20%)  |
| Middle                                     | 20504 (41%) | 1930 (22%)  | 16805 (43%)  | 1335 (31%)   | 1476 (38%) | 848 (38%)  | 406 (48%)    | 306 (21%)  | 43610 (39%)  |
| Low  | 19026 (38%) | 3579 (41%)  | 16150 (41%)  | 2595 (60%)   | 1966 (51%) | 662 (30%)  | 233 (27%)    | 947 (65%)  | 45158 (41%)  |
| Adult occupational position (N, %)         |             |             |              |              |            |            |              |            |              |
| High                                       | 17041 (34%) | 2527 (29%)  | 5041 (13%)   | 2412 (55%)   | 1118 (29%) | 352 (16%)  | 187 (22%)    | 310 (21%)  | 28988 (26%)  |
| Middle                                     | 16402 (33%) | 4649 (53%)  | 28411 (72%)  | 1350 (31%)   | 1679 (44%) | 818 (37%)  | 293 (34%)    | 313 (22%)  | 53915 (48%)  |
| Low  | 17020 (34%) | 1584 (18%)  | 5806 (15%)   | 594 (14%)    | 1041 (27%) | 1058 (47%) | 374 (44%)    | 825 (57%)  | 28302 (25%)  |
| Flexible working hours (N, %)              | 17041 (34%) | 2527 (29%)  | 5041 (13%)   | 3762 (86%)   | 1118 (29%) | 352 (16%)  | 185 (22%)    | 310 (21%)  | 30336 (27%)  |
| Sleep duration (mean±SD, h/n)              | 7.2 (±1.2)  | 7.3 (±1.1)  | 7.6 (±1.1)   | 6.7 (±1)     | 6.9 (±1.3) | 6.9 (±1)   | 6.9 (±1.1)   | 7.8 (±1.5) | 7.3 (±1.2)   |
| Sleep duration (N, %)                      |             |             |              |              |            |            |              |            |              |
| Normal sleep (6h-8.5h/n)                   | 40382 (80%) | 6676 (76%)  | 31532 (80%)  | 3960 (91%)   | 2962 (77%) | 1953 (88%) | 728 (85%)    | 996 (69%)  | 89189 (80%)  |
| Long sleep (>8.5h/n)                       | 5934 (12%)  | 1376 (16%)  | 6670 (17%)   | 66 (2%)      | 325 (8%)   | 80 (4%)    | 42 (5%)      | 385 (27%)  | 14878 (13%)  |
| Short sleep (<6h/n)                        | 4147 (8%)   | 708 (8%)    | 1056 (3%)    | 330 (8%)     | 551 (14%)  | 195 (9%)   | 84 (10%)     | 67 (5%)    | 7138 (6%)    |
| Health-related behaviors (N, %)            |             |             |              |              |            |            |              |            |              |
| Current smoking                            | 9696 (19%)  | 635 (7%)    | 2639 (7%)    | 452 (10%)    | 354 (9%)   | 496 (22%)  | 224 (26%)    | 327 (23%)  | 14823 (13%)  |
| Hazardous alcohol consumption <sup>a</sup> | 5847 (12%)  | 2468 (28%)  | 16601 (42%)  | 1731 (40%)   | 1057 (28%) | 401 (18%)  | 72 (8%)      | 475 (33%)  | 28652 (26%)  |
| Sedentary behavior                         | 11689 (23%) | 2884 (33%)  | 7874 (20%)   | 259 (6%)     | 1280 (33%) | 611 (27%)  | 337 (39%)    | 1169 (81%) | 26103 (23%)  |
| Diabetes (N, %)                            | 1683 (3%)   | 1155 (13%)  | ***          | 204 (5%)     | 303 (12%)  | 176 (8%)   | 46 (5%)      | 165 (11%)  | 3732 (5%)    |
| Obesity (N, %)                             | 5676 (11%)  | 1177 (14%)  | 2660 (7%)    | 596 (18%)    | 945 (29%)  | 297 (13%)  | 123 (14%)    | 312 (22%)  | 11786 (11%)  |
| Cardiovascular disorders                   |             |             |              |              |            |            |              |            |              |
| CHD (N, %)                                 | 660 (1%)    | 518 (6%)    | 460 (1%)     | 574 (13%)    | 445 (13%)  | 93 (4%)    | 21 (2%)      | 92 (6%)    | 2863 (3%)    |
| Stroke (N, %)                              | 400 (1%)    | 99 (1%)     | 878 (2%)     | 18 (0%)      | 190 (5%)   | 24 (1%)    | 10 (1%)      | 36 (2%)    | 1655 (2%)    |

CHD, coronary heart disease; h/n, hours per night

a Hazardous alcohol consumption was defined as having >3 alcoholic drinks per day for men and >2 alcoholic drinks per day in women, \*\*\* This outcome was not assessed in the E3N cohort

**Table 2:** Association between SEP indicators and sleep duration based on pooled cohort data

| Men   |                                       | OR (95 %CI)      | <i>P</i> -value | N     |
|---|---------------------------------------|------------------|-----------------|-------|
| A. Father's occupational position (unadj. adult occ.) | Short sleep (0h-6h)                   | 1.18 [1.07;1.31] | 0.002           | 37623 |
| (High: 7.15h; Mid: 7.13h; Low: 7.07h) d               | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|   | Long sleep (>8.5h)                    | 1.01 [0.92;1.11] | 0.805           |       |
| B. Father's occupational position (adj. adult occ.)   | Short sleep (0h-6h)                   | 1.12 [1.01;1.24] | 0.036           | 37623 |
| (High: 7.15h; Mid: 7.13h; Low: 7.07h) d               | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|   | Long sleep (>8.5h)                    | 0.97 [0.89;1.07] | 0.560           |       |
| C. Adult occupational position                        | Short sleep (0h-6h)                   | 2.22 [1.85;2.66] | < 0.001         | 37623 |
| (High: 7.11h; Mid: 7.12h; Low: 7.09h) d               | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|   | Long sleep (>8.5h)                    | 1.88 [1.59;2.23] | < 0.001         |       |
| Women   |                                       |                  |                 |       |
| A. Father's occupational position (unadj. adult occ.) | Short sleep (0h-6h)                   | 1.31 [1.20;1.44] | < 0.001         | 73582 |
| (High: 7.37h; Mid: 7.41h; Low: 7.37h) d               | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|   | Long sleep (>8.5h)                    | 1.07 [1.01;1.14] | 0.014           |       |
| B. Father's occupational position (adj. adult occ.)   | Short sleep (0h-6h)                   | 1.24 [1.13;1.36] | < 0.001         | 73582 |
| (High: 7.37h; Mid: 7.41h; Low: 7.37h) d               | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|   | Long sleep (>8.5h)                    | 1.07 [1.01;1.13] | 0.028           |       |
| C. Adult occupational position                        | Short sleep (0h-6h)                   | 2.12 [1.82;2.47] | < 0.001         | 73582 |
| (High: 7.33h; Mid: 7.46h; Low: 7.27h) d               | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|   | Long sleep (>8.5h)                    | 1.14 [1.03;1.27] | 0.014           |       |

A. Multinomial logistic regression for the association between father's occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ), adjusted for age, cohort, study period, flexible working hours and health behaviors

B. Multinomial logistic regression for the association between father's occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ), adjusted for age, adult occupational position, cohort, study period, flexible working hours and health behaviors

C. Multinomial logistic regression for the association between adult occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ), adjusted for age, cohort, study period, flexible working hours and health behaviors

<sup>&</sup>lt;sup>d</sup> Average sleep duration per SEP categories

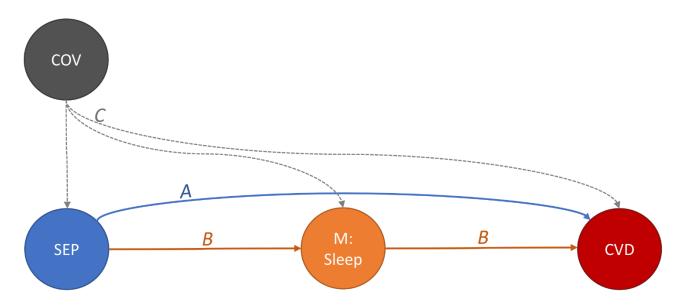
Table 3: Association between sleep duration and cardiovascular disorders based on pooled cohort data

|       |                              |        | OR (95% CI) a    | P-value | N     |
|-------|------------------------------|--------|------------------|---------|-------|
| Men   | Short sleep (0h-6h)          | CHD    | 1.65 [1.41;1.92] | < 0.001 | 36987 |
|       | Normal sleep (6h-8.5h) (ref. |        |                  |         |       |
|       | predictor)                   |        | 1.00             |         |       |
|       | Long sleep (>8.5h)           |        | 1.02 [0.87;1.19] | 0.825   |       |
|       | Short sleep (0h-6h)          | Stroke | 1.16 [0.84;1.60] | 0.381   | 36759 |
|       | Normal sleep (6h-8.5h) (ref. |        |                  |         |       |
|       | predictor)                   |        | 1.00             |         |       |
|       | Long sleep (>8.5h)           |        | 1.51 [1.17;1.95] | 0.001   |       |
| Women | Short sleep (0h-6h)          | CHD    | 1.59 [1.28;1.97] | < 0.001 | 72863 |
|       | Normal sleep (6h-8.5h) (ref. |        |                  |         |       |
|       | predictor)                   |        | 1.00             |         |       |
|       | Long sleep (>8.5h)           |        | 1.24 [1.03;1.49] | 0.024   |       |
|       | Short sleep (0h-6h)          | Stroke | 1.31 [1.03;1.66] | 0.028   | 72819 |
|       | Normal sleep (6h-8.5h) (ref. |        |                  |         |       |
|       | predictor)                   |        | 1.00             |         |       |
|       | Long sleep (>8.5h)           |        | 1.24 [1.06;1.43] | 0.005   |       |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

a Logistic regression for the association between three category sleep duration (categorical predictor-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ) and cardiovascular disorders (outcome), adjusted for age, cohort, study period, flexible working hours, and health behaviors

Figure 1: Directed acyclic graphs representing the counterfactual mediation model for the association between SEP indicators and cardiovascular outcomes, mediated by sleep duration



COV: Covariates (age, cohort, study period, health behaviors, flexible working hours); SEP: (Adult/Father's occupational position); M: mediator - sleep duration; CVD (cardiovascular disorders)

A: NDE, Natural direct effect: Effect of the predictor (SEP) on the main outcome (CVD), through pathways which do not involve the mediator (sleep duration) B: NIE: Natural indirect effect: Effect of the predictor (SEP) on the main outcome (CVD), through pathways which involve the mediator (sleep duration)

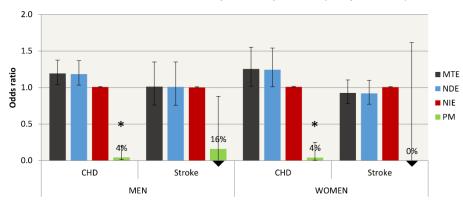
C: Confounding effects by covariates

MTE: Marginal total effect of the predictor (SEP) on the main outcome (CVD): NDE + NIE (not represented)

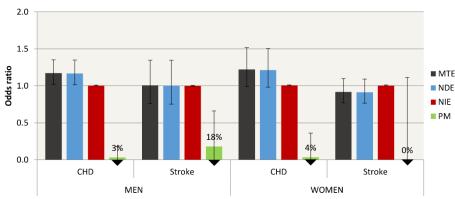
This figure was realized with MS Office-Excel.

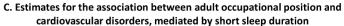
**Figure 2:** Counterfactual mediation estimates for the association between SEP indicators and cardiovascular disorders, mediated by short sleep duration (<6h/n), using pooled cohort data

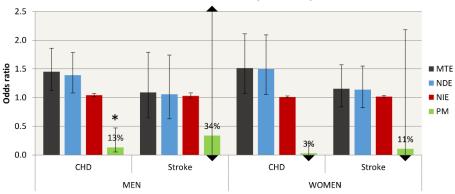
A. Estimates for the association between father's occupational position and cardiovascular disorders, mediated by short sleep duration (unadj. adult occ.)



B. Estimates for the association between father's occupational position and cardiovascular disorders, mediated by short sleep duration (adj. adult occ.)







CHD, coronary heart disease

A. Association between father's occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors B. Association between father's occupational position and CVD, adjusted for age, adult occupational position, cohort, study period, flexible working hours and health behaviors

C. Association between adult occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors **Sample size** (A, B, C): Men: N=36'987 CHD, N=36'759 stroke; Women: N=72'863 CHD, N=72'819 stroke

MTE: Marginal total effect (OR95% CI); NDE: Natural direct effect (OR 95% CI); NIE: Natural indirect effect (OR 95% CI); PM: Proportion of the association between occupational position and cardiovascular disorders which is mediated by short sleep duration (\*, significant mediation; Lower ▼ and upper ▲ arrow indicate that CIs extend beyond the limits of the graph)

This figure was realized with MSOffice-Excel.

**Supplementary Table 1:** Counterfactual mediation estimates for the association between SEP indicators and cardiovascular disorders, mediated by long sleep duration (>8.5h/n), using pooled cohort data

|   |        | MTE-OR (95%CI)   | NDE-OR (95%CI)   | NIE-OR (95%CI)   | PM (95%CI)          | N     |
|---|--------|------------------|------------------|------------------|---------------------|-------|
| A. Father's occupational position (unadj. adult occ.) |        |                  |                  |                  |                     |       |
| Men   | CHD    | 1.18 [1.03;1.37] | 1.18 [1.03;1.37] | 1.00 [0.99;1.01] | 0.0 [-1.1;0.9]      | 36987 |
|   | Stroke | 1.01 [0.77;1.34] | 1.01 [0.77;1.33] | 1.00 [0.99;1.01] | 7.2 [-19.4;18.6]    | 36759 |
| Women   | CHD    | 1.15 [0.94;1.41] | 1.15 [0.94;1.41] | 1.00 [0.99;1.01] | 0.6 [-5.9;9.6]      | 72863 |
|   | Stroke | 0.92 [0.78;1.08] | 0.91 [0.78;1.07] | 1.00 [0.99;1.01] | -2.6 [-25.3;28.8]   | 72819 |
| B. Father's occupational position (adj. adult occ.)   |        |                  |                  |                  |                     |       |
| Men   | CHD    | 1.17 [1.01;1.35] | 1.17 [1.01;1.35] | 1.00 [0.99;1.01] | 0.1 [-1;1.7]        | 36987 |
|   | Stroke | 1.00 [0.76;1.32] | 1.00 [0.76;1.32] | 1.00 [0.99;1.01] | -153.1 [-21.6;19.7] | 36759 |
| Women   | CHD    | 1.12 [0.91;1.37] | 1.12 [0.91;1.37] | 1.00 [0.99;1.01] | 0.6 [-7;9.2]        | 72863 |
|   | Stroke | 0.91 [0.77;1.08] | 0.91 [0.77;1.08] | 1.00 [0.99;1.01] | -2.1 [-25.6;14.6]   | 72819 |
| C. Adult occupational position                        |        |                  |                  |                  |                     |       |
| Men   | CHD    | 1.38 [1.06;1.75] | 1.38 [1.07;1.76] | 1.00 [0.98;1.02] | -0.3 [-8.7;8.5]     | 36987 |
|   | Stroke | 1.04 [0.61;1.69] | 1.02 [0.60;1.65] | 1.03 [0.99;1.07] | 63.5 [-184.5;188.5] | 36759 |
| Women   | CHD    | 1.59 [1.14;2.22] | 1.59 [1.13;2.21] | 1.01 [0.98;1.01] | 1.4 [-0.3;5.8]      | 72863 |
|   | Stroke | 1.14 [0.83;1.53] | 1.13 [0.82;1.53] | 1.00 [0.99;1.01] | 3.3 [-30.4;30.1]    | 72819 |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

A. Association between father's occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors

B. Association between father's occupational position and CVD, adjusted for age, adult occupational position, cohort, study period, flexible working hours and health behaviors

C. Association between adult occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors

MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between occupational position and cardiovascular disorders which is mediated by long sleep duration (bold, significant associations/mediation)

**Supplementary Table 2:** Association between father's occupational position and sleep duration based on individual cohort data, unadjusted for adult occupational position

|              |       |                               | OR (95 %CI) a       | P-value | N     |
|--------------|-------|-------------------------------|---------------------|---------|-------|
| Constances   | Men   | Short sleep (0h-6h)           | 1.25 [1.09;1.43]    | 0.001   | 24026 |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.99 [0.88;1.12]    | 0.926   |       |
|              | Women | Short sleep (0h-6h)           | 1.38 [1.21;1.57]    | < 0.001 | 26437 |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.98 [0.89;1.08]    | 0.703   |       |
| GAZEL        | Men   | Short sleep (0h-6h)           | 1.05 [0.84;1.30]    | 0.683   | 6701  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1 [0.86;1.16]       | 0.974   |       |
|              | Women | Short sleep (0h-6h)           | 1.02 [0.74;1.41]    | 0.909   | 2059  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.17 [0.87;1.57]    | 0.296   |       |
| E3N          | Women | Short sleep (0h-6h)           | 1.22 [1.03;1.46]    | 0.024   | 39258 |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.10 [1.02;1.18]    | 0.014   |       |
| Whitehall II | Men   | Short sleep (0h-6h)           | 1.00 [0.65;1.53]    | 0.997   | 3117  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.66 [0.60;4.60]    | 0.333   |       |
|              | Women | Short sleep (0h-6h)           | 1.48 [0.80;2.75]    | 0.215   | 1239  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.51 [0.16;1.61]    | 0.252   |       |
| ELSA         | Men   | Short sleep (0h-6h)           | 1.16 [0.71;1.89]    | 0.543   | 1694  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.13 [0.65;1.96]    | 0.659   |       |
|              | Women | Short sleep (0h-6h)           | 0.91 [0.65;1.28]    | 0.599   | 2144  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.16 [0.73;1.84]    | 0.537   |       |
| COLAUS       | Men   | Short sleep (0h-6h)           | 1.21 [0.71;2.08]    | 0.486   | 1079  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.05 [0.36;3.10]    | 0.927   |       |
|              | Women | Short sleep (0h-6h)           | 1.59 [0.90;2.79]    | 0.108   | 1149  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.95 [0.46;1.95]    | 0.888   |       |
| SKIPOGH      | Men   | Short sleep (0h-6h)           | 1.09 [0.42;2.82]    | 0.862   | 422   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 4.4 [1.06;18.25]    | 0.041   |       |
|              | Women | Short sleep (0h-6h)           | 2.07 [0.85;5.02]    | 0.109   | 432   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.94 [0.28;3.19]    | 0.918   |       |
| EPIPORTO     | Men   | Short sleep (0h-6h)           | 2.21 [0.46;10.61]   | 0.320   | 584   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.77 [0.43;1.39]    | 0.390   |       |
|              | Women | Short sleep (0h-6h)           | 19.04 [2.83;128.12] | 0.002   | 864   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.82 [0.50;1.33]    | 0.418   |       |

a Multinomial logistic regression for the association between father's occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ), adjusted for age, cohort, study period, flexible working hours, and health behaviors

**Supplementary Table 3:** Association between father's occupational position and sleep duration based on individual cohort data, adjusted for adult occupational position

|              |       |                               | OR (95 %CI) a       | P-value | N     |
|--------------|-------|-------------------------------|---------------------|---------|-------|
| Constances   | Men   | Short sleep (0h-6h)           | 1.15 [1.01;1.32]    | 0.042   | 24026 |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.94 [0.84;1.06]    | 0.336   |       |
|              | Women | Short sleep (0h-6h)           | 1.26 [1.11;1.44]    | < 0.001 | 26437 |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.95 [0.86;1.06]    | 0.353   |       |
| GAZEL        | Men   | Short sleep (0h-6h)           | 1.05 [0.85;1.30]    | 0.640   | 6701  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.00 [0.86;1.16]    | 0.985   |       |
|              | Women | Short sleep (0h-6h)           | 1.01 [0.73;1.40]    | 0.949   | 2059  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.18 [0.88;1.58]    | 0.277   |       |
| E3N          | Women | Short sleep (0h-6h)           | 1.21 [1.02;1.45]    | 0.029   | 39258 |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.10 [1.02;1.19]    | 0.012   |       |
| Whitehall II | Men   | Short sleep (0h-6h)           | 0.94 [0.61;1.45]    | 0.771   | 3117  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.56 [0.56;4.36]    | 0.400   |       |
|              | Women | Short sleep (0h-6h)           | 1.36 [0.73;2.55]    | 0.334   | 1239  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.45 [0.14;1.43]    | 0.177   |       |
| ELSA         | Men   | Short sleep (0h-6h)           | 1.10 [0.67;1.80]    | 0.702   | 1694  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.04 [0.60;1.80]    | 0.899   |       |
|              | Women | Short sleep (0h-6h)           | 0.84 [0.59;1.18]    | 0.314   | 2144  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.13 [0.71;1.81]    | 0.598   |       |
| COLAUS       | Men   | Short sleep (0h-6h)           | 1.05 [0.60;1.85]    | 0.866   | 1079  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.01 [0.33;3.07]    | 0.989   |       |
|              | Women | Short sleep (0h-6h)           | 1.41 [0.79;2.50]    | 0.248   | 1149  |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 1.00 [0.49;2.07]    | 0.992   |       |
| SKIPOGH      | Men   | Short sleep (0h-6h)           | 1.06 [0.41;2.75]    | 0.906   | 422   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 4.37 [1.05;18.15]   | 0.042   |       |
|              | Women | Short sleep (0h-6h)           | 1.69 [0.68;4.19]    | 0.259   | 432   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.95 [0.28;3.28]    | 0.935   |       |
| EPIPORTO     | Men   | Short sleep (0h-6h)           | 2.38 [0.49;11.46]   | 0.280   | 584   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.69 [0.38;1.27]    | 0.234   |       |
|              | Women | Short sleep (0h-6h)           | 18.86 [2.79;127.28] | 0.003   | 864   |
|              |       | Normal sleep (6h-8.5h) (ref.) | 1.00                |         |       |
|              |       | Long sleep (>8.5h)            | 0.81 [0.50;1.32]    | 0.399   |       |

a Multinomial logistic regression for the association between father's occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ), adjusted for adult occupational position age, cohort, study period, flexible working hours, and health behaviors

# **Supplementary Table 4:** Association between adult occupational position and sleep duration based on individual cohort data

|                       |   |                               | OR (95 %CI) a                         | P-value | N     |
|-----------------------|---|-------------------------------|---------------------------------------|---------|-------|
| Constances            | Men                                     | Short sleep (0h-6h)           | 2.73 [2.17;3.43]                      | < 0.001 | 24026 |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 1.98 [1.60;2.44]                      | < 0.001 |       |
|                       | Women                                   | Short sleep (0h-6h)           | 2.39 [1.95;2.93]                      | < 0.001 | 26437 |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 1.31 [1.11;1.55]                      | 0.002   |       |
| GAZEL                 | Men                                     | Short sleep (0h-6h)           | 0.68 [0.40;1.17]                      | 0.163   | 6701  |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 1.06 [0.73;1.54]                      | 0.756   |       |
|                       | Women                                   | Short sleep (0h-6h)           | 1.26 [0.66;2.42]                      | 0.490   | 2059  |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 0.84 [0.46;1.54]                      | 0.567   |       |
| E3N                   | Women                                   | Short sleep (0h-6h)           | 1.39 [1.00;1.94]                      | 0.049   | 39258 |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 0.88 [0.75;1.03]                      | 0.100   |       |
| Whitehall II          | Men                                     | Short sleep (0h-6h)           | 2.58 [1.38;4.82]                      | 0.003   | 3117  |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 2.74 [0.73;10.27]                     | 0.135   |       |
|                       | Women                                   | Short sleep (0h-6h)           | 2.34 [0.80;6.82]                      | 0.119   | 1239  |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 4.04 [0.37;43.64]                     | 0.250   |       |
| ELSA                  | Men                                     | Short sleep (0h-6h)           | 1.95 [0.94;4.05]                      | 0.075   | 1694  |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 3.15 [1.29;7.71]                      | 0.012   |       |
|                       | Women                                   | Short sleep (0h-6h)           | 2.68 [1.58;4.54]                      | < 0.001 | 2144  |
|                       | ,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,, | Normal sleep (6h-8.5h) (ref.) | 1.00                                  |         |       |
|                       |   | Long sleep (>8.5h)            | 1.32 [0.66;2.66]                      | 0.429   |       |
| COLAUS                | Men                                     | Short sleep (0h-6h)           | 2.91 [1.19;7.11]                      | 0.019   | 1079  |
| COLITOS               | 1,1011                                  | Normal sleep (6h-8.5h) (ref.) | 1.00                                  | 0.01)   | 10.7  |
|                       |   | Long sleep (>8.5h)            | 1.37 [0.26;7.31]                      | 0.716   |       |
|                       | Women                                   | Short sleep (0h-6h)           | 4.55 [1.58;13.14]                     | 0.005   | 1149  |
|                       | Women                                   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  | 0.005   | 1117  |
|                       |   | Long sleep (>8.5h)            | 0.58 [0.18;1.85]                      | 0.354   |       |
| SKIPOGH               | Men                                     | Short sleep (0h-6h)           | 2.31 [0.42;12.65]                     | 0.335   | 422   |
|                       | Wich                                    | Normal sleep (6h-8.5h) (ref.) | 1.00                                  | 0.555   | .22   |
|                       |   | Long sleep (>8.5h)            | 1.38 [0.15;12.73]                     | 0.778   |       |
|                       | Women                                   | Short sleep (0h-6h)           | 11.42 [2.37;55.08]                    | 0.002   | 432   |
|                       | Wollien                                 | Normal sleep (6h-8.5h) (ref.) | 1.00                                  | 0.002   | 732   |
|                       |   | Long sleep (>8.5h)            | 0.88 [0.14;5.53]                      | 0.891   |       |
| EPIPORTO              | Men                                     | Short sleep (0h-6h)           | 0.70 [0.11;4.36]                      | 0.702   | 584   |
| EIHUKIU               | IVICII                                  | Normal sleep (6h-8.5h) (ref.) | 1.00                                  | 0.702   | 304   |
|                       |   | Long sleep (>8.5h)            |                                       | 0.046   |       |
|                       | Woman                                   | Short sleep (>8.5n)           | 2.59 [1.02;6.56]<br>1.71 [0.27;10.79] |         | 864   |
|                       | Women                                   | * '                           |                                       | 0.569   | 804   |
|                       |   | Normal sleep (6h-8.5h) (ref.) | 1.00                                  | 0.974   |       |
| D odds ratio: CL conf |   | Long sleep (>8.5h)            | 1.08 [0.43;2.68]                      | 0.874   |       |

a Multinomial logistic regression for the association between adult occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night), adjusted for age, cohort, study period, flexible working hours, and health behaviors

# **Supplementary Table 5:** Association between sleep duration and cardiovascular disorders based on individual cohort data

|              |   |         | Men               |           |       | Women                                |           |      |
|--------------|---|---------|-------------------|-----------|-------|--------------------------------------|-----------|------|
| Constances   |   |         | OR (95%CI) a      | P-value b | N     | OR (95%CI) a                         | P-value b | N    |
|              | Short sleep (0h-6h)                                 | CHD     | 1.53 [1.18;1.99]  | 0.001     | 23534 | 1.58 [0.88;2.83]                     | 0.124     | 2591 |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 0.90 [0.69;1.17]  | 0.433     |       | 1.15 [0.63;2.10]                     | 0.645     |      |
|              | Short sleep (0h-6h)                                 | Stroke  | 0.96 [0.59;1.57]  | 0.874     | 23522 | 1.51 [0.97;2.35]                     | 0.069     | 259  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 1.5 [1.06;2.13]   | 0.021     |       | 0.95 [0.59;1.53]                     | 0.843     |      |
| GAZEL        |   |         |                   |           |       |                                      |           |      |
|              | Short sleep (0h-6h)                                 | CHD     | 1.44 [1.06;1.96]  | 0.020     | 6701  | ***                                  | ***       | 205  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 1.05 [0.82;1.34]  | 0.715     |       | 1.37 [0.15;12.54]                    | 0.778     |      |
|              | Short sleep (0h-6h)                                 | Stroke  | 1.25 [0.60;2.64]  | 0.550     | 6515  | 1.04 [0.23;4.60]                     | 0.961     | 203  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 0.67 [0.33;1.35]  | 0.257     |       | 1.26 [0.36;4.41]                     | 0.716     |      |
| E3N          |   |         |                   |           |       |                                      |           |      |
|              | Short sleep (0h-6h)                                 | CHD     |                   |           |       | 1.69 [1.10;2.59]                     | 0.017     | 392  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         |                   |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         |                   |           |       | 1.3 [1.03;1.63]                      | 0.025     |      |
|              | Short sleep (0h-6h)                                 | Stroke  |                   |           |       | 1.46 [1.03;2.05]                     | 0.032     | 392  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         |                   |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         |                   |           |       | 1.31 [1.11;1.55]                     | 0.001     |      |
| Whitehall II | Long sleep (> 0.511)                                |         |                   |           |       | 1.51 [1.11,1.55]                     | 0.001     |      |
| vvincenan 11 | Short sleep (0h-6h)                                 | CHD     | 1.98 [1.37;2.85]  | < 0.001   | 3117  | 1.52 [0.95;2.43]                     | 0.082     | 123  |
|              | Normal sleep (6h-8.5h) (ref.)                       | CHD     | 1.00              | ₹0.001    | 3117  | 1.00                                 | 0.002     | 12,  |
|              | Long sleep (>8.5h)                                  |         | 0.44 [0.13;1.45]  | 0.177     |       | 0.88 [0.26;3.02]                     | 0.837     |      |
|              | Short sleep (0h-6h)                                 | Stroke  | 2.17 [0.47;10.09] | 0.322     | 3117  | 5.64 [0.30;104.89]                   | 0.246     | 123  |
|              | *   | SHOKE   | 1.00              | 0.322     | 3117  | 1.00                                 | 0.240     | 12.  |
|              | Normal sleep (6h-8.5h) (ref.)<br>Long sleep (>8.5h) |         | 3.91 [0.48;31.65] | 0.201     |       | ***                                  | ***       |      |
| ELSA         | Long sleep (>8.311)                                 |         | 3.91 [0.46,31.03] | 0.201     |       |                                      |           |      |
| ELSA         | Short sleep (0h-6h)                                 | CHD     | 1.84 [1.24;2.73]  | 0.003     | 1555  | 1.49 [1.03;2.15]                     | 0.035     | 195  |
|              | Normal sleep (6h-8.5h) (ref.)                       | CHD     | 1.00              | 0.003     | 1333  | 1.49 [1.03,2.13]                     | 0.033     | 17.  |
|              | -   |         |                   | 0.097     |       |                                      | 0.670     |      |
|              | Long sleep (>8.5h)                                  | Ctualra | 1.50 [0.94;2.39]  | 0.087     | 1524  | 0.89 [0.51;1.53]<br>0.74 [0.41;1.33] | 0.670     | 193  |
|              | Short sleep (0h-6h)                                 | Stroke  | 0.94 [0.47;1.91]  | 0.873     | 1324  |                                      | 0.517     | 193  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              | 0.004     |       | 1.00                                 | 0.214     |      |
| GOT 1770     | Long sleep (>8.5h)                                  |         | 2.41 [1.33;4.35]  | 0.004     |       | 0.67 [0.31;1.45]                     | 0.314     |      |
| COLAUS       | <b>21</b> (21 (21)                                  | - CITE  | 1.07.50.51.0.003  | 0.454     | 1071  | 0.54.50.45.2.407                     | 0.502     |      |
|              | Short sleep (0h-6h)                                 | CHD     | 1.35 [0.61;2.98]  | 0.461     | 1074  | 0.74 [0.17;3.19]                     | 0.683     | 114  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 0.95 [0.2;4.41]   | 0.948     |       | 0.99 [0.22;4.47]                     | 0.988     |      |
|              | Short sleep (0h-6h)                                 | Stroke  | 4.99 [1.16;21.43] | 0.031     | 1075  | 0.98 [0.12;7.81]                     | 0.987     | 114  |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 17.49             | 0.001     |       | 1.35 [0.17;11.01]                    | 0.777     |      |
| SKIPOGH      |   |         |                   |           |       |                                      |           |      |
|              | Short sleep (0h-6h)                                 | CHD     | 1.56 [0.3;8.24]   | 0.599     | 422   | 1.47 [0.15;14.46]                    | 0.743     | 43   |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 0.69 [0.07;6.49]  | 0.742     |       | ***                                  | ***       |      |
|              | Short sleep (0h-6h)                                 | Stroke  | 5.07 [0.87;29.69] | 0.072     | 422   | ***                                  | ***       | 43   |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 2.74 [0.25;30.61] | 0.412     |       | ***                                  | ***       |      |
| EPIPORTO     |   |         |                   |           |       |                                      |           |      |
| ·            | Short sleep (0h-6h)                                 | CHD     | 2.85 [0.86;9.44]  | 0.087     | 584   | 2.12 [0.65;6.89]                     | 0.210     | 86   |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |
|              | Long sleep (>8.5h)                                  |         | 1.07 [0.54;2.12]  | 0.840     |       | 1.55 [0.78;3.1]                      | 0.212     |      |
|              | Short sleep (0h-6h)                                 | Stroke  | ***               | ***       | 584   | 1.08 [0.13;8.75]                     | 0.944     | 86   |
|              | r ( /   |         |                   |           | -     | F                                    |           |      |
|              | Normal sleep (6h-8.5h) (ref.)                       |         | 1.00              |           |       | 1.00                                 |           |      |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

a Logistic regression for the association between three category sleep duration (categorical predictor-Short: <6h/night; Normal:  $\ge6h-8.5/night$ ; Long:  $\ge8.5h/night$ ) and CVD (outcome), adjusted for age, study period, flexible working hours, and health behaviors \*\*\* OR could not be compute due to lack of statistical power

**Supplementary Table 6:** Counterfactual mediation estimates for the association between father's occupational position and cardiovascular disorders, mediated by short sleep duration (<6h/n), using individual cohort data (unadjusted for adult occupational position)

|              |        | MTE-OR (95%CI)    | NDE-OR (95%CI)    | NIE-OR (95%CI)   | PM (95%CI)           | N     |
|--------------|--------|-------------------|-------------------|------------------|----------------------|-------|
| Constances   |        |                   |                   |                  |                      |       |
| Men          | CHD    | 1.33 [1.02;1.75]  | 1.32 [1.01;1.73]  | 1.01 [1;1.02]    | 2.6 [-1.5;16.1]      | 23534 |
|              | Stroke | 0.81 [0.53;1.2]   | 0.81 [0.53;1.2]   | 1 [0.99;1.01]    | 0.7 [-18.7;22.9]     | 23522 |
| Women        | CHD    | 0.73 [0.38;1.38]  | 0.71 [0.37;1.35]  | 1.02 [0.99;1.07] | -5.9 [-81.5;64.6]    | 25913 |
|              | Stroke | 1.12 [0.72;1.7]   | 1.1 [0.71;1.68]   | 1.01 [0.99;1.04] | 12.4 [-94;83.7]      | 25915 |
| GAZEL        |        |                   |                   |                  |                      |       |
| Men          | CHD    | 1.1 [0.89;1.39]   | 1.1 [0.89;1.39]   | 1 [0.99;1.01]    | 1.3 [-20.1;29.5]     | 6701  |
|              | Stroke | 1.41 [0.83;2.49]  | 1.4 [0.83;2.49]   | 1 [0.99;1.02]    | 0.7 [-11.7;17.4]     | 6515  |
| Women        | CHD    | ***               | ***               | ***              | ***                  | 2059  |
|              | Stroke | ***               | ***               | ***              | ***                  | 2030  |
| E3N          |        |                   |                   |                  |                      |       |
| Women        | CHD    | 1.11 [0.84;1.5]   | 1.11 [0.84;1.49]  | 1.00 [0.99;1.01] | 4 [-33.5;35.1]       | 39258 |
|              | Stroke | 0.86 [0.69;1.07]  | 0.85 [0.69;1.06]  | 1.00 [0.99;1.01] | -2.9 [-29;20.9]      | 39258 |
| Whitehall II |        |                   |                   |                  |                      |       |
| Men          | CHD    | 1.07 [0.76;1.5]   | 1.07 [0.76;1.49]  | 1 [0.97;1.02]    | -0.1 [-68.5;71.5]    | 3117  |
|              | Stroke | ***               | ***               | ***              | ***                  | 3117  |
| Women        | CHD    | 1.75 [1.06;3.06]  | 1.73 [1.04;3.02]  | 1.02 [0.99;1.06] | 3.6 [-4.8;25.7]      | 1239  |
|              | Stroke | ***               | ***               | ***              | ***                  | 1239  |
| ELSA         |        |                   |                   |                  |                      |       |
| Men          | CHD    | 1.48 [0.92;2.48]  | 1.47 [0.91;2.44]  | 1.01 [0.98;1.05] | 2.7 [-18.4;28.6]     | 1555  |
|              | Stroke | 1.04 [0.48;2.41]  | 1.04 [0.48;2.4]   | 1 [0.98;1.04]    | 2.7 [-38.8;33]       | 1524  |
| Women        | CHD    | 1.46 [0.88;2.43]  | 1.47 [0.9;2.44]   | 0.99 [0.96;1.02] | -1.6 [-30.3;22.1]    | 1956  |
|              | Stroke | 0.67 [0.35;1.3]   | 0.66 [0.35;1.29]  | 1 [0.98;1.04]    | -0.6 [-20.6;15.6]    | 1937  |
| COLAUS       |        |                   |                   |                  |                      |       |
| Men          | CHD    | 0.79 [0.4;1.56]   | 0.79 [0.39;1.56]  | 1 [0.97;1.06]    | -0.8 [-41.3;44.9]    | 1074  |
|              | Stroke | ***               | ***               | ***              | ***                  | 1075  |
| Women        | CHD    | 0.86 [0.3;2.54]   | 0.84 [0.29;2.46]  | 1.02 [0.97;1.19] | -12.8 [-90.9;95.9]   | 1145  |
|              | Stroke | 2.14 [0.51;10.49] | 2.17 [0.49;10.58] | 0.99 [0.96;1.06] | -2.8 [-16.4;14.9]    | 1146  |
| SKIPOGH      |        |                   |                   |                  |                      |       |
| Men          | CHD    | 1.7 [0.21;17.14]  | 1.67 [0.2;16.28]  | 1.02 [0.73;1.61] | 5.4 [-144.7;138.9]   | 422   |
|              | Stroke | 1.57 [0.17;23.91] | 1.57 [0.16;24.49] | 1 [0.78;1.18]    | 1.4 [-94.8;55.5]     | 422   |
| Women        | CHD    | ***               | ***               | ***              | ***                  | 432   |
|              | Stroke | ***               | ***               | ***              | ***                  | 432   |
| EPIPORTO     |        |                   |                   |                  |                      |       |
| Men          | CHD    | 0.94 [0;2.88]     | 0.9 [0;2.72]      | 1.05 [0.97;1.26] | -80.3 [-135.6;142.7] | 584   |
|              | Stroke | ***               | ***               | ***              | ***                  | 584   |
| Women        | CHD    | 5.98 [0.83;96.9]  | 5.5 [0.72;91.95]  | 1.09 [0.95;1.4]  | 9.7 [-22.9;70.2]     | 861   |
|              | Stroke | ***               | ***               | ***              | ***                  | 862   |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

Association between father's occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between occupational position and cardiovascular disorders which is mediated by short sleep duration (bold, significant associations/mediation)

\*\*\* OR could not be compute due to lack of statistical power

**Supplementary Table 7:** Counterfactual mediation estimates for the association between father's occupational position and cardiovascular disorders, mediated by short sleep duration (<6h/n), using individual cohort data (adjusted for adult occupational position)

|              |        | MTE-OR (95%CI)          | NDE-OR (95%CI)          | NIE-OR (95%CI)   | PM (95%CI)            | N     |
|--------------|--------|-------------------------|-------------------------|------------------|-----------------------|-------|
| Constances   |        |                         |                         |                  |                       |       |
| Men          | CHD    | 1.3 [1;1.71]            | 1.29 [0.99;1.7]         | 1.00 [0.99;1.01] | 1.7 [-1.6;13.8]       | 23534 |
|              | Stroke | 0.79 [0.52;1.17]        | 0.79 [0.52;1.18]        | 1 [0.99;1.01]    | 0.5 [-11.7;12.8]      | 23522 |
| Women        | CHD    | 0.72 [0.37;1.37]        | 0.7 [0.36;1.34]         | 1.02 [0.99;1.05] | -4 [-51.1;42.8]       | 25913 |
|              | Stroke | 1.12 [0.71;1.74]        | 1.11 [0.7;1.72]         | 1.01 [1;1.03]    | 9 [-59.7;89.1]        | 25915 |
| GAZEL        |        | 1.12 [0.71,1.71]        | 1.11 [0.7,1.72]         | 1.01 [1,1.05]    | 7 [ 37.11,07.11]      | 23713 |
| Men          | CHD    | 1.1 [0.89;1.38]         | 1.1 [0.89;1.38]         | 1 [0.99;1.01]    | 1.5 [-27.9;24.1]      | 6701  |
|              | Stroke | 1.41 [0.83;2.5]         | 1.41 [0.84;2.48]        | 1 [0.99;1.02]    | 0.7 [-10.8;18.7]      | 6515  |
| Women        | CHD    | ***                     | ***                     | ***              | ***                   | 2059  |
|              | Stroke | ***                     | ***                     | ***              | ***                   | 2030  |
| E3N          |        |                         |                         |                  |                       | 2030  |
| Women        | CHD    | 1.1 [0.83;1.47]         | 1.1 [0.83;1.47]         | 1.00 [0.99;1.01] | 4.3 [-32.6;49.9]      | 39258 |
|              | Stroke | 0.86 [0.69;1.06]        | 0.85 [0.69;1.06]        | 1.00 [0.99;1.01] | -2.7 [-27.7;20.2]     | 39258 |
| Whitehall II |        | 0.80 [0.02,1.00]        | 0.05 [0.05,1.00]        | 1.00 [0.55,1.01] | -2.7 [-27.7,20.2]     | 37236 |
| Men          | CHD    | 1.03 [0.73;1.44]        | 1.03 [0.73;1.45]        | 1 [0.97;1.02]    | -8.8 [-76.6;82.4]     | 3117  |
| 1,1011       | Stroke | ***                     | ***                     | ***              | ***                   | 3117  |
| Women        | CHD    | 1.73 [1.01;3.11]        | 1.71 [1.00;3.05]        | 1.01 [0.98;1.05] | 2.9 [-9;25.1]         | 1239  |
| Women        | Stroke | 1./5 [1.01;5.11]<br>*** | 1./1 [1.00;3.05]<br>*** | ***              | 2.9 [-9,23.1]<br>***  | 1239  |
| ELSA         | Биоке  |                         |                         |                  |                       | 1239  |
| Men          | CHD    | 1 40 [0 01:2 51]        | 1 49 [0 01.2 47]        | 1 01 [0 07:1 05] | 1 9 [ 21 7-20 0]      | 1555  |
| Wich         | Stroke | 1.49 [0.91;2.51]        | 1.48 [0.91;2.47]        | 1.01 [0.97;1.05] | 1.8 [-21.7;30.9]      | 1555  |
| Women        | CHD    | 1.09 [0.51;2.51]        | 1.09 [0.51;2.51]        | 1.00 [0.98;1.03] | 1.2 [-42.7;40.6]      | 1524  |
| Women        | Stroke | 1.4 [0.85;2.35]         | 1.41 [0.86;2.36]        | 0.99 [0.95;1.01] | -3.2 [-51.9;25]       | 1956  |
| COLATIC      | SHOKE  | 0.68 [0.35;1.36]        | 0.68 [0.35;1.34]        | 1.01 [0.98;1.05] | -1.2 [-25.5;24.2]     | 1937  |
| COLAUS       | CHD    |                         |                         |                  |                       |       |
| Men          | CHD    | 0.68 [0.32;1.4]         | 0.68 [0.31;1.4]         | 1 [0.96;1.04]    | -0.1 [-24.3;33.4]     | 1074  |
| ***          | Stroke | ***                     | ***                     | ***              | ***                   | 1075  |
| Women        | CHD    | 0.74 [0.25;2.36]        | 0.73 [0.24;2.33]        | 1.01 [0.97;1.15] | -3.8 [-71.5;52.2]     | 1145  |
|              | Stroke | 2 [0.35;11.48]          | 2.02 [0.35;11.55]       | 0.99 [0.96;1.04] | -2.3 [-12.2;11.2]     | 1146  |
| SKIPOGH      |        |                         |                         |                  |                       |       |
| Men          | CHD    | 1.57 [0.17;15.32]       | 1.54 [0.17;15.29]       | 1.02 [0.71;1.59] | 4.2 [-145.3;146.4]    | 422   |
|              | Stroke | 2 [0.14;58.23]          | 1.99 [0.13;58.23]       | 1 [0.73;1.19]    | 0.6 [-104.7;59.7]     | 422   |
| Women        | CHD    | ***                     | ***                     | ***              | ***                   | 432   |
|              | Stroke | ***                     | ***                     | ***              | ***                   | 432   |
| EPIPORTO     |        |                         |                         |                  |                       |       |
| Men          | CHD    | 0.97 [0;3.09]           | 0.92 [0;2.82]           | 1.05 [0.97;1.27] | -154.6 [-130.3;148.7] | 584   |
|              | Stroke | ***                     | ***                     | ***              | ***                   | 584   |
| Women        | CHD    | 6.07 [0.76;89.89]       | 5.58 [0.71;82.78]       | 1.09 [0.95;1.4]  | 9.5 [-31.3;65.7]      | 861   |
|              | Stroke | ***                     | ***                     | ***              | ***                   | 862   |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

Association between father's occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between occupational position and cardiovascular disorders which is mediated by short sleep duration (bold, significant associations/mediation)

**Supplementary Table 8:** Counterfactual mediation estimates for the association between adult occupational position and cardiovascular disorders, mediated by short sleep duration (<6h/n), using individual cohort data

|              |        | MTE-OR (95%CI)     | NDE-OR (95%CI)     | NIE-OR (95%CI)   | PM (95%CI)                 | N     |
|--------------|--------|--------------------|--------------------|------------------|----------------------------|-------|
| Constances   |        |                    |                    |                  |                            |       |
| Men          | CHD    | 1.49 [0.93;2.26]   | 1.43 [0.9;2.2]     | 1.04 [0.99;1.09] | 11.5 [-24.3;70.9]          | 23534 |
|              | Stroke | 1.46 [0.71;2.9]    | 1.47 [0.71;2.93]   | 0.99 [0.94;1.06] | -2.5 [-83.7;65.8]          | 23522 |
| Women        | CHD    | 1.11 [0.37;2.88]   | 1.07 [0.35;2.77]   | 1.03 [0.97;1.13] | 31.5 [-94.6;111.3]         | 25913 |
|              | Stroke | 1.08 [0.55;2.16]   | 1.05 [0.53;2.14]   | 1.03 [0.98;1.09] | 38.7 [-159.4;161.7]        | 25915 |
| GAZEL        |        |                    |                    |                  |                            |       |
| Men          | CHD    | 1.32 [0.75;2.17]   | 1.34 [0.76;2.22]   | 0.99 [0.94;1.01] | -5.8 [-70.6;44.9]          | 6701  |
|              | Stroke | 0.98 [0.16;3.2]    | 0.99 [0.17;3.4]    | 0.99 [0.87;1.04] | 47.3 [-58.4;44.5]          | 6515  |
| Women        | CHD    | ***                | ***                | ***              | ***                        | 2059  |
|              | Stroke | ***                | ***                | ***              | ***                        | 2030  |
| E3N          |        |                    |                    |                  |                            |       |
| Women        | CHD    | 1.58 [0.89;2.54]   | 1.57 [0.89;2.54]   | 1.01 [1;1.03]    | 1.5 [-6.7;16]              | 39258 |
|              | Stroke | 1.1 [0.71;1.62]    | 1.09 [0.71;1.61]   | 1 [1;1.02]       | 4.6 [-45.4;32.1]           | 39258 |
| Whitehall II |        | 1.1 [0.71,1.02]    | 1.05 [0.71,1.01]   | 1 [1,1.02]       | 1.0 [ 13.1,32.1]           | 3,230 |
| Men          | CHD    | 1.89 [1.18;3.22]   | 1.74 [1.09;2.82]   | 1.08 [0.99;1.34] | 16.4 [-2.2;53.1]           | 3117  |
|              | Stroke | ***                | ***                | ***              | ***                        | 3117  |
| Women        | CHD    | 1.33 [0.56;3.6]    | 1.31 [0.54;3.56]   | 1.01 [0.96;1.12] | 5.6 [-67.6;80.8]           | 1239  |
|              | Stroke | ***                | ***                | ***              | ***                        | 1239  |
| ELSA         |        |                    |                    |                  |                            | 123)  |
| Men          | CHD    | 0.91 [0.39;1.97]   | 0.82 [0.35;1.81]   | 1.1 [0.99;1.32]  | -90.1 [-332.6;328.9]       | 1555  |
|              | Stroke | 0.41 [0.09;1.33]   | 0.38 [0.08;1.23]   | 1.08 [0.95;1.39] | -5.1 [-83.9;51.1]          | 1524  |
| Women        | CHD    | 1.48 [0.72;3.02]   | 1.46 [0.71;2.95]   | 1.01 [0.93;1.13] | 4.1 [-77.7;82.5]           | 1956  |
|              | Stroke | 0.76 [0.24;2.05]   | 0.78 [0.25;2.11]   | 0.97 [0.88;1.11] | 10.5 [-108.9;158.3]        | 1937  |
| COLAUS       |        | 0.70 [0.24,2.03]   | 0.76 [0.25,2.11]   | 0.57 [0.00,1.11] | 10.5 [-100.5,150.5]        | 1/31  |
| Men          | CHD    | 2.16 [0.67;7.54]   | 2.11 [0.63;7.47]   | 1.02 [0.94;1.16] | 3.8 [-48.9;68.6]           | 1074  |
|              | Stroke | ***                | ***                | ***              | ***                        | 1074  |
| Women        | CHD    | 3.28 [0.57;40.26]  | 3.32 [0.54;39.44]  | 0.99 [0.93;1.16] | -1.7 [-26.8;41.5]          | 1145  |
| ,, 0111011   | Stroke | 1.5 [0.13;36.71]   | 1.49 [0.11;34.27]  | 1.01 [0.97;1.35] | 2.5 [-69.7;100]            | 1145  |
| SKIPOGH      | Suone  | 1.5 [0.15,50.71]   | 1.49 [0.11,34.27]  | 1.01 [0.97,1.33] | 2.3 [-09.7,100]            | 1140  |
| Men          | CHD    | 6.97 [0.17;12.4]   | 5.88 [0.14;7.9]    | 1.19 [0.8;3.18]  | 18.3 [-59.2;124]           | 422   |
| 1,1011       | Stroke |                    |                    |                  |                            |       |
| Women        | CHD    | 0.15 [0;467.87]    | 0.1 [0;107.38]     | 1.57 [0.67;7.25] | -6.6 [-193.8;198.3]<br>*** | 422   |
| Women        | Stroke | ***                | ***                | ***              | ***                        | 432   |
| EPIPORTO     | SHORE  | 10 14 15           | -0-4-4-            | -to also also    | en ekster                  | 432   |
| Men          | CHD    | 0.70 [0.14.4.02]   | 0.92 [0.14.4.45]   | 0.06 [0.50 1.24] | 140 - 202 0 214 21         | 504   |
| TATELL       | Stroke | 0.78 [0.14;4.03]   | 0.82 [0.14;4.45]   | 0.96 [0.59;1.24] | 14.8 [-203.9;214.3]        | 584   |
| Women        |        | 1.46 [0.05;208.59] | 1.46 [0.05;208.59] | 1 [1;1]          | 0 [0;0]                    | 584   |
| Women        | CHD    | 0.67 [0.03;22.89]  | 0.66 [0.03;20.95]  | 1.01 [0.91;1.3]  | -2.3 [-42.3;63.6]          | 861   |
|              | Stroke | ***                | ***                | ***              | ***                        | 862   |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

Association between adult occupational position and CVD, adjusted for age, cohort, study period, flexible working hours and health behaviors MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between occupational position and cardiovascular disorders which is mediated by short sleep duration

<sup>\*\*\*</sup> OR could not be compute due to lack of statistical power

# **Supplementary Table 9**: Longitudinal association between occupational position at baseline, and cardiovascular disease occurrence in the Whitehall II study through waves 1 to 8

|       | Outcome | <b>Incident number of events (w1-w8)</b> | HR (95%CI) a     | P-value |
|-------|---------|--|------------------|---------|
| Men   | CHD     | 1289                                     | 1.23 [1.03;1.46] | 0.017   |
|       | Stroke  | 139                                      | 2.33 [1.41;3.86] | 0.001   |
| Women | CHD     | 661                                      | 1.24 [0.97;1.60] | 0.090   |
|       | Stroke  | 71                                       | 1.36 [0.61;3.01] | 0.449   |

HR, Hazard ratio; CI, confidence interval; CHD, coronary heart disease; CVD, cardiovascular disorders

a Cox proportional hazard regression model for the association between three adult occupational position (predictor-Lowest vs. Highest) and CVD through waves 1 to 8, adjusted for age, and health behaviors

Supplementary Table 10: Longitudinal association between sleep duration at baseline, and cardiovascular disease occurrence in the Whitehall II study through waves 1 to 8

|       | Predictor                               | Outcome | Incident number of events (w1-w8) | HR (95%CI) <sup>a</sup> | P-value |
|-------|---|---------|-----------------------------------|-------------------------|---------|
| Men   | Short sleep (0h-6h)                     | CHD     | 1285                              | 1.49 [1.19;1.87]        | 0.001   |
|       | Normal sleep (6h-8.5h) (ref. predictor) |         |                                   | 1.00                    |         |
|       | Long sleep (>8.5h)                      |         |                                   | 1.25 [1.02;1.52]        | 0.048   |
|       | Short sleep (0h-6h)                     | Stroke  | 137                               | 1.37 [0.68;2.72]        | 0. 371  |
|       | Normal sleep (6h-8.5h) (ref. predictor) |         |                                   | 1.00                    |         |
|       | Long sleep (>8.5h)                      |         |                                   | 1.19 [0.47;10.24]       | 0.798   |
| Women | Short sleep (0h-6h)                     | CHD     | 659                               | 1.16 [0.87;1.53]        | 0.304   |
|       | Normal sleep (6h-8.5h) (ref. predictor) |         |                                   | 1.00                    |         |
|       | Long sleep (>8.5h)                      |         |                                   | 0.98 [0.59;1.69]        | 0.686   |
|       | Short sleep (0h-6h)                     | Stroke  | 71                                | 0.77 [0.30;2.07]        | 0.614   |
|       | Normal sleep (6h-8.5h) (ref. predictor) |         |                                   | 1.00                    |         |
|       | Long sleep (>8.5h)                      |         |                                   | ***                     | ***     |

HR, Hazard ratio; CI, confidence interval; CHD, coronary heart disease; CVD, cardiovascular disorders

a Cox regression model for the association between three cat. sleep duration (wave 1- categorical predictor-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ) and CVD through waves 1 to 8, adjusted for age, and health behaviors

\*\*\* Insufficient statistical power

# **Supplementary Table 11:** Association between SEP indicators and sleep duration based on pooled, imputed cohort data

| Men   |                                       | OR (95 %CI)      | <i>P</i> -value |
|---|---------------------------------------|------------------|-----------------|
| A. Father's occupational position (unadj. adult occ.) | Short sleep (0h-6h)                   | 1.17 [1.06;1.28] | 0.002           |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |
|   | Long sleep (>8.5h)                    | 1.02 [0.94;1.11] | 0.623           |
| B. Father's occupational position (adj. adult occ.)   | Short sleep (0h-6h)                   | 1.10 [0.99;1.21] | 0.057           |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |
|   | Long sleep (>8.5h)                    | 0.98 [0.90;1.06] | 0.553           |
| C. Adult occupational position                        | Short sleep (0h-6h)                   | 2.45 [2.10;2.86] | < 0.001         |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |
|   | Long sleep (>8.5h)                    | 2.11 [1.82;2.44] | < 0.001         |
| Women   |                                       |                  |                 |
| A. Father's occupational position (unadj. adult occ.) | Short sleep (0h-6h)                   | 1.34 [1.24;1.45] | < 0.001         |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |
|   | Long sleep (>8.5h)                    | 1.06 [1.01;1.12] | 0.018           |
| B. Father's occupational position (adj. adult occ.)   | Short sleep (0h-6h)                   | 1.26 [1.16;1.37] | < 0.001         |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |
|   | Long sleep (>8.5h)                    | 1.05 [1.00;1.11] | 0.050           |
| C. Adult occupational position                        | Short sleep (0h-6h)                   | 2.27 [2.00;2.57] | < 0.001         |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |
|   | Long sleep (>8.5h)                    | 1.24 [1.14;1.35] | < 0.001         |

OR, odds ratio; CI, confidence interval; occ., occupational position

A. Multinomial logistic regression for the association between father's occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal:  $\ge6h-8.5/night$ ; Long:  $\ge8.5h/night$ ), adjusted for age, cohort, study period, flexible working hours and health behaviors B. Multinomial logistic regression for the association between father's occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal:  $\ge6h-8.5/night$ ; Long:  $\ge8.5h/night$ ), adjusted for age, adult occupational position, cohort, study period, flexible working hours and health behaviors

C. Multinomial logistic regression for the association between adult occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal:  $\ge6h-8.5/night$ ; Long:  $\ge8.5h/night$ ), adjusted for age, cohort, study period, flexible working hours and health behaviors

**Supplementary Table 12:** Association between sleep duration and cardiovascular disorders based on pooled, imputed cohort data

|       |   |        | OR (95%CI) a     | P-value |
|-------|---|--------|------------------|---------|
| Men   | Short sleep (0h-6h)                     | CHD    | 1.60 [1.40;1.82] | < 0.001 |
|       | Normal sleep (6h-8.5h) (ref. predictor) |        | 1.00             |         |
|       | Long sleep (>8.5h)                      |        | 1.07 [0.93;1.22] | 0.357   |
|       | Short sleep (0h-6h)                     | Stroke | 1.22 [0.94;1.59] | 0.140   |
|       | Normal sleep (6h-8.5h) (ref. predictor) |        | 1.00             |         |
|       | Long sleep (>8.5h)                      |        | 1.34 [1.07;1.68] | 0.010   |
| Women | Short sleep (0h-6h)                     | CHD    | 1.53 [1.28;1.83] | < 0.001 |
|       | Normal sleep (6h-8.5h) (ref. predictor) |        | 1.00             |         |
|       | Long sleep (>8.5h)                      |        | 1.19 [1.02;1.39] | 0.026   |
|       | Short sleep (0h-6h)                     | Stroke | 1.43 [1.19;1.73] | < 0.001 |
|       | Normal sleep (6h-8.5h) (ref. predictor) |        | 1.00             |         |
|       | Long sleep (>8.5h)                      |        | 1.22 [1.08;1.38] | 0.002   |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

a Logistic regression for the association between three category sleep duration (categorical predictor-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ) and cardiovascular disorders (outcome), adjusted for age, cohort, study period, flexible working hours, and health behaviors

Supplementary Table 13: Counterfactual mediation estimates for the association between adult occupational position and CHD mediated by short sleep duration (<6h/n), non-adjusted (A) and adjusted (B) for four sleep-quality indicators (Constances and GAZEL pooled data)

| A. Unadjusted for sleep quality |                  |                  |                       |                   |       |
|---------------------------------|------------------|------------------|-----------------------|-------------------|-------|
| indicators                      | MTE-OR (95%CI)   | NDE-OR (95%CI)   | <b>NDE-OR (95%CI)</b> | PM (95%CI)        | N     |
| Men                             | 1.47 [1.05;2.07] | 1.43 [1.02;2]    | 1.03 [1;1.07]         | 9.5 [0.2;49]      | 30235 |
| Women                           | 0.92 [0.33;2.25] | 0.9 [0.31;2.18]  | 1.03 [0.97;1.11]      | -30.1 [-104.5;99] | 27972 |
| B. Adjusted for sleep quality   |                  |                  |                       |                   |       |
| indicators                      |                  |                  |                       |                   |       |
| Men                             | 1.36 [0.94;1.94] | 1.35 [0.93;1.94] | 1 [0.99;1.02]         | 1.8 [-10.3;23.1]  | 28358 |
| Women                           | 0.94 [0.3;2.54]  | 0.93 [0.3;2.53]  | 1 [0.98;1.05]         | -7.6 [-42.6;33.5] | 26185 |

A. Association between adult occupational position and CHD, adjusted for age, adult occupational position, cohort, study period, flexible working hours and health behaviors, unadjusted for sleep quality indicators

B. Association between adult occupational position and CHD, adjusted for age, cohort, study period, flexible working hours and health behaviors, additionally adjusted for four sleep quality indicators, namely "Difficulty falling asleep", "Difficulty waking up in the morning", "Waking up during the night", "Waking up too early" – sleep quality related beta coefficients (M1 and M2) are presented in Supplementary Table 5

MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association

between occupational position and cardiovascular disorders which is mediated by sleep duration (\* significant mediation)

**Supplementary Table 14:** Sleep quality beta coefficients for mediation models 1- $\theta$  and 2- $\beta$  (Annex 1), computed for the association between adult occupational position and CHD, mediated by sleep duration – (Constances and GAZEL pooled data)

| `  | 1                  |                      |                      |                   |
|--|--------------------|----------------------|----------------------|-------------------|
|  | Difficulty falling | Difficulty waking up | Waking up during the | Waking up too     |
|  | asleep             | in the morning       | night                | early             |
| <sup>a</sup> Men-M1: θ <sub>4</sub> <sup>c</sup> (95%CI)   | 0.33 [0.05;0.6]    | 0.01 [-0.31;0.29]    | 0.2 [0.04;0.36]      | 0.09 [-0.19;0.33] |
| <sup>b</sup> Men-M2: β <sub>4</sub> <sup>c</sup> (95%CI)   | 0.98 [0.83;1.12]   | 0.31 [0.15;0.46]     | 0.4 [0.27;0.51]      | 1.5 [1.38;1.63]   |
| <sup>a</sup> Women-M1: $\theta_4^c$ (95%CI)                | -0.24 [-1.16;0.48] | 0.44 [-0.32;1.14]    | 0.08 [-0.59;0.66]    | 0.42 [-0.43;1.18] |
| <sup>b</sup> Women-M2: β <sub>4</sub> <sup>c</sup> (95%CI) | 1.01 [0.88:1.14]   | 0.23 [0.1:0.36]      | 0.57 [0.44:0.69]     | 1.51 [1.38:1.63]  |

<sup>&</sup>lt;sup>a</sup> M1. Logistic regression model for the association between SEP (main predictor) and CVD (binary outcome) (coefficient  $\theta_1^{\text{sep}}$ ), including sleep duration ( $\theta_2^{\text{m}}$ -effect of sleep duration on CVD), an interaction term between SEP and sleep duration ( $\theta_3^{\text{sep}*m}$ ), and major confounders ( $\theta_4^{\text{c}}$ - age, cohort, study period, health behaviors, and flexible working hours)

<sup>&</sup>lt;sup>b</sup> M2. Multinomial regression model for the association between SEP (main predictor) and sleep duration (categorical outcome) ( $\beta_1^{\text{sep}}$ ), including the effect of major confounders ( $\beta_4^{\text{c}}$ - age, cohort, study period, health behaviors, and flexible working hours) (**bold**, significant associations/mediation)

## Supplementary Table 15: Summary of data acquisition methods across individual cohorts

|                          | Constances | GAZEL | E3N             | Whitehall II | ELSA | COLAUS | SKIPOGH | EPIPORTO |
|--------------------------|------------|-------|-----------------|--------------|------|--------|---------|----------|
| Father's occ.            | SR         | SR    | SR              | SR           | SR   | SR     | SR      | SR       |
| Adult occ.               | SR         | OA-WR | SR              | OA-WR        | SR   | SR     | SR      | SR       |
| Sleep                    | SR         | SR    | SR              | SR           | SR   | SR     | SR      | SR       |
| CVD (history & baseline) | OAa        | SR    | OA <sup>b</sup> | OAc          | SR   | SR     | SR      | SR       |
| Health behaviors         | SR         | SR    | SR              | SR           | SR   | SR     | SR      | SR       |

Occ., Occupational position; SR, Self-report; OA, Objective assessment; WR, Work registry; Health behaviors (smoking, alcohol intake, and sedentary behavior)

<sup>a</sup> Health-questionnaire filled in with a physician and by using participant's personal medical record at interview

<sup>b</sup> Complementary information related to medical history provided by participants' GP

<sup>c</sup> Thorough medical examination at interview and access to personal medical records

**Supplementary Table 16:** Association between adult occupational position and sleep duration among cohorts that included objectively assessed CHD events (A), and self-reported data (B)

| Men – Adult occupational position (predictor)   | Outcome                               | OR (95 %CI) d    | <i>P</i> -value <sup>d</sup> | N     |
|---|---------------------------------------|------------------|------------------------------|-------|
| A. Objective assessment (CHD)                   | Short sleep (0h-6h)                   | 2.72 [2.19;3.37] | < 0.001                      | 27143 |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                              |       |
|   | Long sleep (>8.5h)                    | 1.99 [1.62;2.45] | < 0.001                      |       |
| B. Self-reported data                           | Short sleep (0h-6h)                   | 1.25 [0.88;1.79] | 0.218                        | 10480 |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                              |       |
|   | Long sleep (>8.5h)                    | 1.49 [1.10;2.02] | 0.011                        |       |
| Women - Adult occupational position (predictor) |                                       |                  |                              |       |
| A. Objective assessment (CHD)                   | Short sleep (0h-6h)                   | 2.08 [1.76;2.46] | < 0.001                      | 66934 |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                              |       |
|   | Long sleep (>8.5h)                    | 1.13 [1.01;1.26] | 0.030                        |       |
| B. Self-reported data                           | Short sleep (0h-6h)                   | 2.38 [1.67;3.37] | < 0.001                      | 6648  |
|   | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                              |       |
|   | Long sleep (>8.5h)                    | 1.05 [0.73;1.52] | 0.790                        |       |

OR, odds ratio; CI, confidence interval

A. Constances, Whitehall II, and E3N (women) data

B. GAZEL, ELSA, COLAUS, SKIPOGH, and EPIPORTO

d Multinomial logistic regression for the association between adult occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night), adjusted for age, cohort, study period, flexible working hours and health behaviors

**Supplementary Table 17:** Association between sleep duration and CHD among cohorts that included objectively assessed CHD events (A), and self-reported data (B)

|   |         | Men              |           |       | Women            |         |       |
|---|---------|------------------|-----------|-------|------------------|---------|-------|
| A. Objective assessment (CHD)                   | Outcome | OR (95%CI) d     | P-value d | N     | OR (95%CI) a     | P-value | N     |
| Short sleep (0h-6h)                             | CHD     | 1.67 [1.35;2.07] | < 0.001   | 26651 | 1.64 [1.24;2.17] | < 0.001 | 66410 |
| Normal sleep (6h-8.5h) (ref. <b>predictor</b> ) |         | 1.00             |           |       | 1.00             |         |       |
| Long sleep (>8.5h)                              |         | 0.89 [0.69;1.15] | 0.365     |       | 1.27 [1.03;1.57] | 0.026   |       |
| B. Self-reported data                           |         |                  |           |       |                  |         |       |
| Short sleep (0h-6h)                             | CHD     | 1.61 [1.29;2.02] | < 0.001   | 10336 | 1.47 [1.05;2.06] | 0.023   | 6453  |
| Normal sleep (6h-8.5h) (ref. <b>predictor</b> ) |         | 1.00             |           |       | 1.00             |         |       |
| Long sleep (>8.5h)                              |         | 1.12 [0.91;1.37] | 0.276     |       | 1.16 [0.79;1.71] | 0.438   |       |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

A. Constances, Whitehall II, and E3N (women) data

B. GAZEL, ELSA, COLAUS, SKIPOGH, and EPIPORTO

d Logistic regression for the association between three cat. sleep duration (categorical predictor-Short: <6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night) and CHD (outcome), adjusted for age, cohort, study period, flexible working hours and health behaviors

**Supplementary Table 18:** Counterfactual mediation estimates for the association between adult occupational position and CHD, mediated by short sleep duration among cohorts that included objectively assessed CHD events (A), and self-reported data (B)

| Men - Adult SEP, short sleep, CHD                         | MTE-OR (95%CI)   | NDE-OR (95%CI)   | NIE-OR (95%CI)   | PM (95%CI)       | N     |
|---|------------------|------------------|------------------|------------------|-------|
| A. Objective assessment (CHD)                             | 1.60 [1.14;2.24] | 1.53 [1.09;2.15] | 1.04 [1.01;1.1]  | 11.1 [1.3;37]    | 26651 |
| D. Colf. was auto d. doto                                 | 1 22 [0 90.1 02] | 1 2 [0 97.1 01]  | 1 01 [0 00.1 05] | 6 [ 21 2.56 9]   | 10226 |
| B. Self-reported data Women - Adult SEP, short sleep, CHD | 1.32 [0.89;1.93] | 1.3 [0.87;1.91]  | 1.01 [0.99;1.05] | 6 [-31.3;56.8]   | 10336 |
| A. Objective assessment (CHD)                             | 1.44 [0.94;2.14] | 1.42 [0.93;2.11] | 1.01 [0.99;1.04] | 4.4 [-19.5;33.2] | 66410 |
| A. Objective assessment (CHD)                             | 1.44 [0.94,2.14] | 1.42 [0.55,2.11] | 1.01 [0.55,1.04] | 4.4 [-17.3,33.2] | 00410 |
| B. Self-reported data                                     | 1.49 [0.77;2.76] | 1.48 [0.77;2.74] | 1.01 [0.97;1.06] | 2.1 [-37.8;46.8] | 6453  |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

A. Constances, Whitehall II, and E3N (women) data

B. GAZEL, ELSA, COLAUS, SKIPOGH, and EPIPORTO

MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between occupational position and CHD which is mediated by short sleep duration

Supplementary Table 19: Association between education and sleep duration based on pooled cohort data

| Men                             |                                       | OR (95 %CI) a    | <i>P</i> -value | N     |
|---------------------------------|---------------------------------------|------------------|-----------------|-------|
| Education (High, Middle, Low) b | Short sleep (0h-6h)                   | 1.86 [1.46;2.36] | < 0.001         | 20154 |
|                                 | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|                                 | Long sleep (>8.5h)                    | 1.48 [1.17;1.87] | < 0.001         |       |
| Women                           |                                       |                  |                 |       |
| Education (High, Middle, Low) b | Short sleep (0h-6h)                   | 1.94 [1.54;2.43] | < 0.001         | 39218 |
|                                 | Normal sleep (6h-8.5h) (ref. outcome) | 1.00             |                 |       |
|                                 | Long sleep (>8.5h)                    | 1.5 [1.22;1.83]  | < 0.001         |       |

OR, odds ratio; CI, confidence interval

<sup>&</sup>lt;sup>a</sup> Multinomial logistic regression for the association between education (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short:

<sup>&</sup>lt;6h/night; Normal: ≥6h-8.5/night; Long: ≥8.5h/night ), adjusted for age, cohort, study period, flexible working hours and health behaviors

b Highest level of attained education was self-reported by study participants across cohorts according to 7-9 categories and further harmonized into three levels : High (Tertiary education - University), Middle (Higher secondary school), Low (Primary or lower secondary school)

**Supplementary Table 20:** Counterfactual mediation estimates for the association between education and CVD outcomes, mediated by short sleep duration, using pooled data

| Education (High, Middle, Low) <sup>a</sup> | Outcome | MTE-OR (95%CI)   | <b>NDE-OR (95%CI)</b> | <b>NIE-OR (95%CI)</b> | PM (95%CI)        | $\mathbf{N}$ |
|--|---------|------------------|-----------------------|-----------------------|-------------------|--------------|
| Men  | CHD     | 1.40 [1.21;1.65] | 1.37 [1.18;1.60]      | 1.03 [1.01;1.05]      | 9.2 [4.1;18.0]    | 36802        |
|  | Stroke  | 1.37 [1.00;1.87] | 1.36 [0.99;1.85]      | 1.01 [0.99;1.04]      | 3.5 [-9.8;28.8]   | 36575        |
| Women                                      | CHD     | 1.55 [1.22;2.00] | 1.53 [1.20;1.97]      | 1.01 [1.00;1.03]      | 3.8 [-0.6;11.4]   | 71206        |
|  | Stroke  | 1.05 [0.84;1.33] | 1.05 [0.84;1.32]      | 1.00 [0.99;1.02]      | 5.5 [-105.3;95.2] | 71161        |

OR, odds ratio; CI, confidence interval; CVD, cardiovascular disorders; CHD, coronary heart disease

MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between education and cardiovascular disorders which is mediated by short sleep duration

<sup>&</sup>lt;sup>a</sup> Highest level of attained education was self-reported by study participants across cohorts according to 7-9 categories and further harmonized into three levels: High (Tertiary education - University), Middle (Higher secondary school), Low (Primary or lower secondary school)

Supplementary Table 21: Association between adult occupational position and sleep duration based on pooled

cohort data (model further adjusted for type 2 diabetes and obesity)

| Men – Adult occupational position (predictor)   | OR (95 %CI) a    | <i>P-</i> value <sup>a</sup> | N     |
|---|------------------|------------------------------|-------|
| Short sleep (0h-6h)                             | 2.15 [1.78;2.59] | < 0.001                      | 35485 |
| Normal sleep (6h-8.5h) (ref. outcome)           | 1.00             |                              |       |
| Long sleep (>8.5h)                              | 1.85 [1.55;2.2]  | < 0.001                      |       |
| Women – Adult occupational position (predictor) |                  |                              |       |
| Short sleep (0h-6h)                             | 2.37 [1.97;2.84] | < 0.001                      | 32515 |
| Normal sleep (6h-8.5h) (ref. <b>outcome</b> )   | 1.00             |                              |       |
| Long sleep (>8.5h)                              | 1.28 [1.1;1.49]  | 0.002                        |       |

OR, odds ratio; CI, confidence interval

a Multinomial logistic regression for the association between adult occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <6h/night; Normal: ≥6h-8.5h/night; Long: ≥8.5h/night), adjusted for age, cohort, study period, flexible working hours, health behaviors, type 2 diabetes, and

**Supplementary Table 22:** Association between sleep duration and cardiovascular disorders based on pooled cohort data (model further adjusted for type 2 diabetes and obesity)

|       |   | Outcome | OR (95%CI) a     | P-value <sup>a</sup> | N     |
|-------|---|---------|------------------|----------------------|-------|
| Men   | Short sleep (0h-6h)                             | CHD     | 1.55 [1.32;1.83] | < 0.001              | 34974 |
|       | Normal sleep (6h-8.5h) (ref. <b>predictor</b> ) |         | 1.00             |                      |       |
|       | Long sleep (>8.5h)                              |         | 0.99 [0.84;1.16] | 0.870                |       |
| Women | Short sleep (0h-6h)                             | CHD     | 1.4 [1.04;1.89]  | 0.029                | 31951 |
|       | Normal sleep (6h-8.5h) (ref. <b>predictor</b> ) |         | 1.00             |                      |       |
|       | Long sleep (>8.5h)                              |         | 1.2 [0.85;1.69]  | 0.305                |       |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

a Logistic regression for the association between three cat. sleep duration (categorical predictor-Short: <6h/night; Normal: ≥6h-8.5h/night; Long: ≥8.5h/night ) and CVD (outcome), adjusted for age, cohort, study period, flexible working hours, health behaviors, type 2 diabetes, and obesity

**Supplementary Table 23:** Counterfactual mediation estimates for the association between adult occupational position and CHD, mediated by short sleep duration, using pooled data (model further adjusted for type 2 diabetes and obesity)

| Adult occupational position (predictor) – CHD (outcome) | MTE-OR (95%CI)   | NDE-OR (95%CI)  | NIE-OR (95%CI)   | PM (95%CI)          | N     |
|---|------------------|-----------------|------------------|---------------------|-------|
| Men   | 1.22 [0.93;1.58] | 1.18 [0.9;1.53] | 1.03 [1.01;1.06] | 17.9 [-110.5;153.4] | 34974 |
| Women   | 1.17 [0.68;1.99] | 1.17 [0.68;2]   | 1 [0.97;1.04]    | 1.00 [-64.4;53.7]   | 31951 |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

MTE: Marginal total effect (OR 95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between adult occupational position and cardiovascular disorders which is mediated by short sleep duration. Model adjusted for age, cohort, study period, flexible working hours, health behaviors, type 2 diabetes, and obesity

**Supplementary Table 24:** Association between adult occupational position and modified sleep duration (extreme thresholds) based on pooled cohort data

| Men – Adult occupational position (predictor) | OR (95 %CI) <sup>a</sup> | P-value <sup>a</sup> | N     |
|---|--------------------------|----------------------|-------|
| Short sleep (0h-5h)                           | 4.09 [2.95;5.66] <0.001  |                      | 37623 |
| Normal sleep (5h-10h) (ref. outcome)          | 1.00                     |                      |       |
| Long sleep (>10h)                             | 2.45 [1.8;3.33]          | < 0.001              |       |
| Women   |                          |                      |       |
| Short sleep (0h-5h)                           | 3.35 [2.46;4.55]         | < 0.001              | 73582 |
| Normal sleep (5h-10h) (ref. outcome)          | 1.00                     |                      |       |
| Long sleep (>10h)                             | 1.52 [1.26;1.83]         | < 0.001              |       |

OR, odds ratio; CI, confidence interval

a Multinomial logistic regression for the association between adult occupational position (predictor-Lowest vs. Highest) and three category sleep duration (outcome-Short: <5h/night; Normal: ≥5h-10/night; Long: ≥10h/night), adjusted for age, cohort, study period, flexible working hours and health behaviors

# **Supplementary Table 25:** Association between modified sleep duration (extreme thresholds) based on pooled cohort

|       |  | Outcome | OR (95%CI) a     | P-value <sup>a</sup> | N     |
|-------|--|---------|------------------|----------------------|-------|
| Men   | Short sleep (0h-5h)                            | CHD     | 1.96 [1.55;2.48] | < 0.001              | 36987 |
|       | Normal sleep (5h-10h) (ref. <b>predictor</b> ) |         | 1.00             |                      |       |
|       | Long sleep (>10h)                              |         | 1.07 [0.79;1.44] | 0.675                |       |
| Women | Short sleep (0h-5h)                            | CHD     | 1.91 [1.41;2.61] | < 0.001              | 72863 |
|       | Normal sleep (5h-10h) (ref. <b>predictor</b> ) |         | 1.00             |                      |       |
|       | Long sleep (>10h)                              |         | 1.34 [1.00;1.8]  | 0.053                |       |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

a Logistic regression for the association between three cat. sleep duration (categorical predictor-Short: <5h/night; Normal:  $\ge 5h-10h/night$ ; Long:  $\ge 10h/night$ ) and CVD (outcome), adjusted for age, cohort, study period, flexible working hours and health behaviors

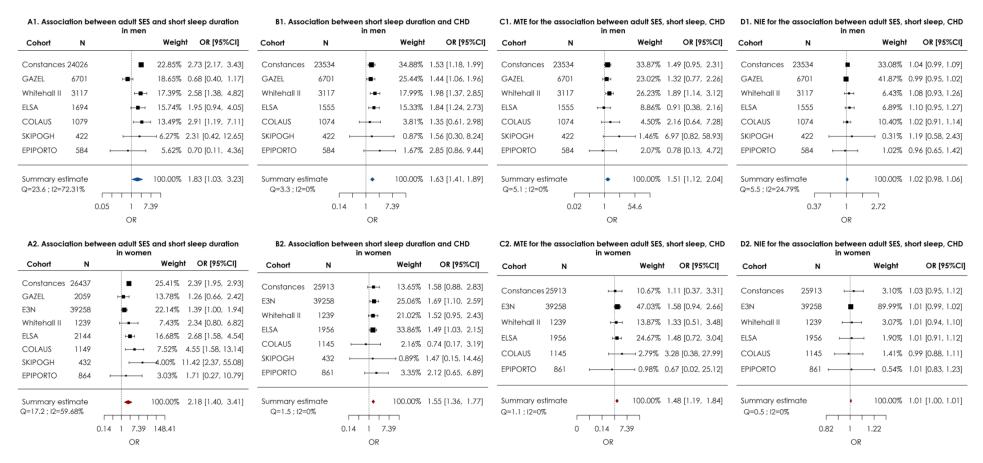
**Supplementary Table 26:** Counterfactual mediation estimates for the association between adult occupational position and cardiovascular disorders, mediated by short sleep duration (<5h/n), and long sleep duration (>10h/n), using pooled cohort data

| Mediator: Short sleep (0h-5h) | MTE-OR (95%CI)   | NDE-OR (95%CI)   | NIE-OR (95%CI)   | PM (95%CI)     | N     |
|-------------------------------|------------------|------------------|------------------|----------------|-------|
| Men                           | 1.42 [1.10;1.81] | 1.39 [1.08;1.78] | 1.02 [1.00;1.04] | 6.5 [0.8;23.7] | 36987 |
| Women                         | 1.54 [1.09;2.12] | 1.54 [1.09;2.11] | 1.00 [0.99;1.01] | 0.9 [-0.5;5.1] | 72863 |
| Mediator: Long sleep (>10h)   |                  |                  |                  |                |       |
| Men                           | 1.40 [1.09;1.78] | 1.40 [1.08;1.78] | 1.00 [0.99;1.02] | 0.7 [-3.4;8.0] | 36987 |
| Women                         | 1.57 [1.12;2.17] | 1.56 [1.11;2.15] | 1.01 [0.99;1.02] | 1.7 [-0.7;7.6] | 72863 |

OR, odds ratio; CI, confidence interval; CHD, coronary heart disease

MTE: Marginal total effect (OR95%CI); NDE: Natural direct effect (OR 95%CI); NIE: Natural indirect effect (OR 95%CI); PM: Proportion of the association between occupational position and cardiovascular disorders which is mediated by sleep duration

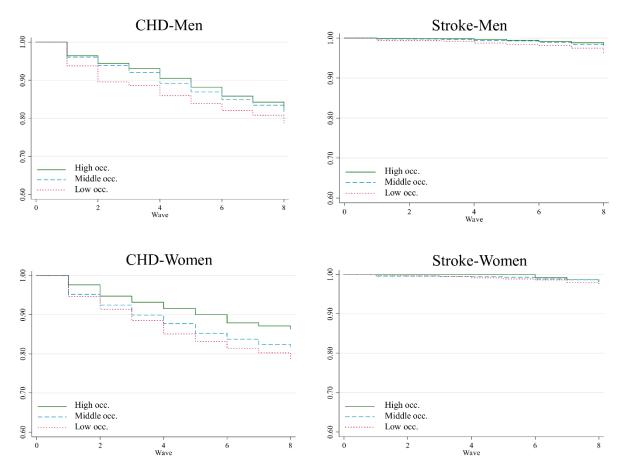
**Supplementary Figure 1:** Random effect meta-analyses for associations between adult occupational position and sleep-duration (A), sleep duration and CHD, and MTE and NIE (mediation proxy) parameters for the associations between adult occupational position, short sleep duration, and CHD (C, D).



Cochran's Q statistic for estimating heterogeneity, 12, heterogeneity index (%) based on Cochran's Q; MTE, Marginal total effect - proxy for the total effect of adult SEP on CHD; NIE, Natural indirect effect - proxy for the mediating effect of short sleep duration to the association between adult SEP, short sleep duration, and CHD

**Supplementary Figure 2:** Survival curves for the longitudinal association between adult occupational position at baseline (wave 1), and cardiovascular disease occurrence in the Whitehall II study through waves 1 to 8

# Kaplan Meier estimates Adult occupational position and CVD outcomes

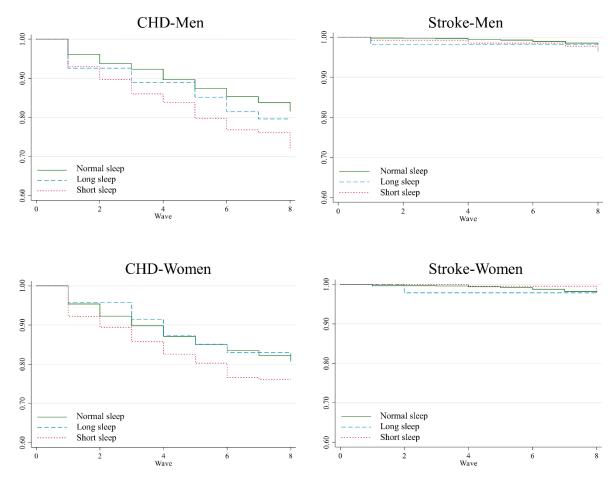


CHD, coronary heart disease; occ., adult occupational position

a Cox proportional hazard regression model for the association between three adult occupational position (predictor-Lowest vs. Highest) and CVD through waves 1 to 8, adjusted for age, and health behaviors

**Supplementary Figure 3:** Survival curves for the longitudinal association between sleep duration at baseline (wave 1), and cardiovascular disease occurrence in the Whitehall II study through waves 1 to 8

# Kaplan Meier estimates Sleep duration and CVD outcomes



CHD, coronary heart disease

a Cox regression model for the association between three cat. sleep duration (wave 1- categorical predictor-Short: <6h/night; Normal:  $\ge6h-8.5/night$ ; Long:  $\ge8.5h/night$ ) and CVD through waves 1 to 8, adjusted for age, and health behaviors

**Annex 1:** Formulas for the mediation models (M1, M2) and the calculation of Natural Direct Effect (NDE), Natural Indirect Effect (NIE), Marginal Total Effect (MTE), Proportion Mediated (PM)

M1: CVD (main outcome) = 
$$\theta_1^{sep} + \theta_2^m + \theta_3^{sep*m} + \theta_4^{cov}$$

M2: Sleep duration (mediator) =  $\beta_1^{sep} + \beta_4^{cov}$ 

$$NDE = \frac{\exp(\theta_1^{sep} * a) * (1 + (\exp(\theta_2^m + \theta_3^{ses*m} * a^* + \beta_0 + \beta_4^{cov} * c)))}{\exp(\theta_1^{sep} * a^*) * (1 + (\exp(\theta_2^m + \theta_3^{ses*m} * a^* + \beta_0 + \beta_4^{cov} * c)))}$$

$$NIE = \frac{(1 + \exp(\beta_0 + \beta_1^{sep} * a^* + \beta_4^{cov} * c)) * (1 + \exp(\theta_2^m + \theta_3^{ses*m} * a + \beta_0 + \beta_1 * a + \beta_4^{cov} * c))}{(1 + \exp(\beta_0 + \beta_1^{sep} * a + \beta_4^{cov} * c)) * (1 + \exp(\theta_2^m + \theta_3^{ses*m} * a + \beta_0 + \beta_1 * a^* + \beta_4^{cov} * c))}$$

$$MTE = \exp(\log(NDE) + \log(NIE))$$

$$PM = (NDE * (NIE - 1))/(NDE * NIE - 1)$$

COV, Covariables (age, cohort, study period, health behaviors, flexible working hours; SEP: (Adult/Father's occupational position); M: mediator – sleep duration, SEP\*M: Interaction term SEP \* Mediator (Sleep duration); CVD, cardiovascular disorders;

NDE, Natural Direct Effect; NIE, Natural Indirect Effect; MTE, Marginal Total Effect, PM, Proportion Mediated

M1. Logistic regression model for the association between SEP (main predictor) and CVD (binary outcome) (coefficient  $\theta_1^{\text{sep}}$ ), including sleep duration ( $\theta_2^{\text{m}}$ -effect of sleep duration on CVD), an interaction term between SEP and sleep duration ( $\theta_3^{\text{sep}^{\text{fm}}}$ ), and major confounders ( $\theta_4^{\text{c}}$ - age, cohort, study period, health behaviors, and flexible working hours)

M2. Multinomial regression model for the association between SEP (main predictor) and sleep duration (categorical outcome) ( $\beta_1^{\text{sep}}$ )

# **Annex 2:** Assessment of sedentary behavior, type 2 diabetes, and obesity **Physical activity and sedentary behavior**

Sedentary behavior was based on self-reported physical activity where participants reported the time they spent participating in a physical activity in and out of work (EPIPORTO), by rating their level of physical activity on a scale (SKIPOGH), by indicating the frequency of physical activity (SKIPOGH, CONSTANCES, GAZEL, E3N), or by using detailed questionnaires inquiring about the time, the frequency, the amount, and the type of physical activity (Whitehall II, COLAUS). These indicators were subsequently harmonized into a dichotomous "sedentary behavior" variable.

#### Type 2 diabetes and obesity

Type 2 diabetes status was available in seven cohorts (Constances, GAZEL, Whitehall II, SKIPOGH, ELSA, COLAUS, EPIPORTO), and defined based on self-report, a previous diagnosis of this disease by a physician, use of anti-diabetic medication, or having fasting blood glucose  $\geq$  7mmol/L or glycated hemoglobin (Hba1c)  $\geq$  6.5% at clinical visit. Obesity status was available in all eight cohorts, and was defined as having a body mass index (BMI)  $\geq$  30kg/m<sup>2</sup> at clinical visit, by dividing objectively measured weight (kilograms) by squared height (meters)

Chapter 3 Exploring the relation between life-course socioeconomic position and genome-wide CpG DNA methylation markers in a Swiss-population based study

# Exploring the relation between life-course socioeconomic position and genome-wide CpG DNA methylation markers in a Swiss-population based study

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#### **Abstract**

#### **Background**

Previous investigations have reported that adverse socioeconomic circumstances across the life-course lead to the alteration of major biological processes, eventually resulting in a higher disease risk and premature death. In particular, a low life-course socioeconomic position (SEP) has been associated with a modified epigenetic signature of loci involved in inflammation, the physiological response to stress, and other regulatory processes.

#### Methods

In this study, we investigated the association between nine indicators of SEP across the life-course and the differential methylation of 451'000 genome-wide CpG markers, using data from 690 adults included in a Swiss population-based study. We further examined the interrelations between the SEP-related CpGs, and the biological pathways in which the identified markers are involved.

#### **Results**

Three SEP indicators in adulthood were associated the differential methylation of 161 genome-wide CpG markers, whereby 156 CpGs were less methylated in people with low versus high SEP. Among the identified CpGs, a substantial proportion of markers were no longer associated with SEP upon accounting for health behaviors and cardiometabolic disorders. In addition, the identified CpGs were found to be involved in immune, inflammatory, and cancer-related processes.

#### **Conclusion**

Our results support the hypothesis that adverse socioeconomic circumstances may lead to the dysregulation of inflammatory processes, eventually resulting in the occurrence of serious chronic conditions such as atherosclerosis, diabetes, or cancer.

## Introduction

Adverse socioeconomic conditions account for the most important determinants of ill health and premature mortality, however, the mechanisms underlying these associations are not fully understood [1-3]. To explain this relation, recent epidemiological research has been increasingly investigating the biological processes through which the social environment "gets embedded" under the skin, eventually altering the body's physiological functions and leading to disease [2]. Among the suggested biological pathways of the social embedding is the dysregulation of the Hypothalamus-Pituitary-Adrenal axis, aberrant inflammation, altered neural function and structure, and high allostatic load [2]. Moreover, the underlying molecular mechanism of modified epigenetic signature has been the object of particular attention in recent years [2, 4-7].

A modified epigenetic signature results from DNA methylation, whereby methyl groups are added to cytosines of CpG dinucleotides throughout the genome, eventually affecting gene expression [8, 9]. DNA methylation occurs as a natural regulatory process, but may also result from multiple environmental exposures, including cigarette smoking, physical exercise, environmental toxins, dietary exposures, as well as adversity and psychosocial factors [6, 10-13]. In the context of social epidemiology, former studies have suggested that chronic stress, inadequate nutrition, pollution, and other exposures resulting from poor socioeconomic circumstances across the life-course may alter the DNA methylation of selected loci involved in the regulation of many genes, including those regulating inflammation and other major processes, eventually leading to various conditions such as diabetes, atherosclerosis, or cancer [5, 6, 12, 14-16].

Despite these findings, a global understanding of socially driven DNA methylation changes and the subsequent occurrence of diseases is lacking. One of the main limitations of previous research is the focus on targeted approaches by examining epigenetic modifications occurring

in candidate genes, or in gene promoters, which restricts the relation between socioeconomic circumstances and DNA methylation to specific processes (i.e. inflammation, glucocorticoid signaling) and may introduce some bias [6]. Moreover, results from previous research have often been inconsistent in terms of socioeconomically induced DNA methylation changes, with some studies reporting increased methylation (hypermethylation), whereas others found decreased methylation of candidate genes or regions (hypomethylation) [5, 6, 17].

In this study, we investigate the association between socioeconomic position (SEP) throughout the life-course and 451'000 DNA methylation CpG markers across the human genome. We subsequently examine the biological processes in which SEP-related CpGs are involved, and to what extent they correlate with one another.

#### **Methods**

## Study population

We used data from the SKIPOGH study, a Swiss multicenter population-based study investigating genetic and environmental determinants of health-related outcomes in the Swiss population. Study participants were recruited in the city of Lausanne and the cantons of Geneva and Bern between 2009 and 2013 as previously described [4, 18]. Inclusion criteria were: (1) written informed consent; (2) 18 years of age; (3) Caucasian origin; (5) at least one first-degree family members willing to participate to the study. Women who reported being pregnant were excluded from the study. All included participants attended a morning medical visit after an overnight fast, provided a blood sample, completed a self-administered questionnaire inquiring about life and medical history, and were asked to collect urine over 24 hours. All participants signed a written informed consent.

## Life-course socioeconomic position

We examined nine different SEP indicators across the life-course in relation to genome-wide CpG methylation. Father's occupational position, material and financial conditions during infancy, and father and mother's education were used as early-life SEP indicators. SEP indicators in adulthood included participant's education, last known occupational position, monthly household income, and an indicator of financial difficulties inquiring whether the participant would face difficulties paying food, rent, charges, insurance or loans throughout the month. SEP indicators were divided into three categories: high (most favorable – reference group), middle, and low (least favorable) as described in Annex I. Socioeconomic trajectories from childhood to adulthood were generated using father's occupational position and participant's last known occupational position. Five trajectories were possible: stable high (highest-most favorable), upward, stable middle, downward, and stable low trajectory (lowest-least favorable) (Annex I).

## CpG DNA methylation measurement and data pre-processing

Genome-wide DNA methylation from peripheral blood mononuclear cells (PBMC) was measured in 256 SKIPOGH participants using the Infinium Human Methylation450 BeadChip microarray of Illumina (HM450), measuring the methylation status of 451'522 CpG sites. For a different set of 451 SKIPOGH participants, genome-wide DNA methylation was measured using the Infinium MethylationEPIC v1.0 microarray (EPIC), assessing the methylation status of 898'918 CpG sites. For both HM450 and EPIC chips, missing values for CpG methylation data were imputed according to the nearest neighbor averaging procedure, followed by a logit transformation of the data [19]. The imputed and transformed CpG methylation data were subsequently denoised for five random effect categorical variables:

Illumina array, array position, plate level, participant's recruitment center, and participant's family index, whereby the residuals of the random effect variables were directly added to the transformed CpG methylation data, enabling the implementation of fixed-effect regression models. Of the 451'000 CpGs present in both chips, data transformation could not be achieved for 29'943 markers due to extensive missing values, yielding 421'057 CpGs in 707 participants available for analyses.

#### **Covariates**

The main covariates included in the present analyses were sex (dichotomous), age at blood sampling (continuous), seasonality of blood sampling (categorical), PBMC composition corrected according to Houseman procedure (continuous: CD8T, CD4T, NK, B-cells, Monocytes, Granulocytes), and chip type (categorical, random effect variable: HM450, EPIC) [20]. Additional covariates included self-reported health behaviors, namely smoking status, sedentary behavior, and hazardous alcohol drinking, along with self-reported or diagnosed cardiometabolic disorders, namely obesity, hypertension, diabetes, and history of coronary heart disease (CHD) as described in Annex II.

## Statistical analyses

#### Univariate linear regression

We applied fixed-effect univariate linear regression models for the associations between life-course SEP indicators and differential methylation of genome-wide CpG markers [21]. We used categorized life-course SEP indicators as the main exposure variables (continuous – Lowest versus Highest), and imputed, logit-transformed, and denoised CpG methylation markers as the response variables, adjusting for main covariates (M1: age, sex, seasonality,

PBMC composition, chip type). We further implemented three additional regression models between life-course SEP and CpGs identified in the first model, additionally adjusting for health behaviors (M2), cardiometabolic disorders (M3), and health behaviors *and* cardiometabolic disorders (M4).

#### Gene ontology enrichment

To examine the biological pathways in which the SEP-related CpGs are involved, we applied the CpG-based gene ontology enrichment approach using the "missMethyl" tool [22]. "missMethyl" uses the "Gene Ontology" (GO) collection which identifies fundamental biological pathways (BP-Biological Process, MF-Molecular Function, CC-Cellular Component), and the "Kyoto Encyclopedia of Genes and Genomes" (KEGG) collection which highlights health outcomes and diseases related to a given set of CpGs [22]. We also used the "PANTHER" gene ontology platform which uses gene names (intragenic CpGs only) to provide potential biological processes and pathways [23].

#### **Network analyses**

To investigate for potential inter-correlations between CpGs related to life-course SEP indicators, we implemented a network analysis by applying neighborhood selection and partial correlation methods [24]. We identified the number of clusters (groups of inter-correlated CpGs within the network) by using the Integrated Completed Likelihood criterion (ICL), whereby the number of clusters (Q) is determined by the maximum ICL value [24].

All statistical analyses performed in this study were carried out using the R statistical software and relevant CRAN and Bioconductor packages (R Foundation for Statistical Computing, Vienna, Austria). Statistical significances were set at p<0.05, and according to Bonferroni

(N=421'057 CpGs) and Benjamini-Hochberg (BH, p<0.05 - N=421'057 CpGs) thresholds when accounting for multiple testing.

#### **Results**

From the initial 707 SKIPOGH participants, we excluded 17 individuals because of missing data for one or more covariates (sex, age, seasonality, PBMC composition, health behaviors, and cardiometabolic disorders). Compared with the included participants, those excluded were more frequently men (76% vs. 47%, p=0.03).

We summarize the main characteristics of the sample stratified by sex in **Table 1**. We observed that men had a higher count of CD8T cells (p<0.001), whereas women had higher NK (p<0.013) and Monocyte counts (p<0.001). More men than women had a high occupational position (30% vs. 13%, p<0.001), a high household income (42% vs. 34%, p=0.051) and experienced more favorable occupational trajectories across the life-course (stable high: 11% vs. 7%, p=0.005). Furthermore, a greater proportion of men were current smokers, had a hazardous alcohol consumption, a higher BMI, and were more affected by hypertension and diabetes when compared to women.

In **Figures 1** and **2**, we show the mean methylation difference (β) and P-value distribution for linear regressions between life-course SEP and CpG markers, adjusting for the main covariates (Manhattan plots – Supplementary Figures 1-2). While early-life SEP indicators were not associated with any of the CpGs (**Figure 1**), household income in adulthood, financial difficulties in adulthood, and occupational trajectories across the life-course were associated with two, 153, and six CpGs, respectively (**Figure 2** - BH significance threshold;

**Table 2-M1**). The two CpGs related to the lowest (least favorable) versus the highest (most favorable) household income were the intragenic ZNF385D-cg17024919 (β=-0.55, p=1.20E-07), and the intergenic cg21900073 (β=-0.55, p=1.75E-07), whereas the top three CpGs related to the least favorable versus the most favorable level of financial difficulties included the intragenic KIAA0319L-cg24940583 (β=-0.47, p=9.78E-09), TRIO-cg21618273 (β=-0.24, p=1.14E-07), KY-cg14313576 (β=-0.27, p=1.22E-07). The top three CpGs associated with the lowest versus the highest occupational trajectories were the intragenic BBS9-cg13362105 (β=-0.61, p=5.52E-08), DSC3-cg11722699 (β=0.43, p=1.34E-07), and KCNQ1-cg14089425 (β=-0.45, p=3.74E-07). Of the 161 SEP-related CpGs, 41 CpGs were intergenic, while 120 CpGs were located within known genes, including 80 CpGs located in the gene body, 24 CpGs in the gene promoter, and 16 CpGs in other intragenic regions. Furthermore, we observed that 156 CpGs were hypomethylated (β<0), whereas five CpGs were hypermethylated (β>0), namely ZBTB16-cg10827488, ARL11-cg01425731, KLKB1-cg05740254, C8orf84-cg17173767, and DSC3-cg11722699.

In Table 2 M2-M4, we show the regression estimates for the associations between SEP indicators and the 161 CpG markers, further adjusting for health behaviors (M2), cardiometabolic disorders (M3), and health behaviors *and* cardiometabolic disorders (M4). The eight CpGs initially associated with household income and occupational trajectories (M1: ZNF385D-cg17024919, cg21900073, BBS9-cg13362105, DSC3-cg11722699, KCNQ1-cg14089425, BTBD11-cg27431274, PIRT-cg06881239, cg06803821) remained significantly and consistently associated with these indicators across the three additionally adjusted regression models (M2-M4). Of the 153 CpGs initially associated with financial difficulties (M1), 90 markers were no longer associated with this indicator upon adjusting for health behaviors (M2), 109 CpGs upon adjusting for cardiometabolic disorders (M3), and 128 CpGs

were no longer related to financial difficulties upon accounting for health behaviors *and* cardiometabolic disorders (M4).

In **Table 3**, we present the top 30 GO and KEGG biological pathways identified according to the 161 SEP-related CpGs (Table 2). The GO algorithm identified 326 significant pathways and structures involved in various processes, most of which were related to cell signaling and communication (ankyrin binding, plasma membrane, signal transduction, receptor clustering, ion channel binding), as well as metabolic and physiological processes (cardiac cell polarization and potential, muscle contraction, blood metabolism). Alternatively, the KEGG algorithm identified seven significant pathways, out of which five were related to immune and oncogenic processes (pathways in cancer, primary immunodeficiency, choline metabolism in cancer, intestinal immune network for IgA production, Rap1 signaling pathway), involving intragenic CpGs located within the immune-related CCR3, ITGAL, CCL22, PRKCB, TNFRSF13B, RUNX3, SIT1, KALRN, TIGIT, NOTCH4, TSPAN4, RPL23A, and TRIO genes, and intragenic CpGs within the cancer-related ALK, EPHB2, NOTCH4, PRKCB, FGF1, ADSSL1, miR-134, RBP1, RPL23A, GLI2, and TP53I11 genes (Table 2) [22, 23].

In **Figure 3**, we show a network of SEP-related CpG markers. Of the 161 CpGs initially identified in the linear regression model (Table 2-M1), 91 CpGs were related to at least one other CpG and used to build the network. Using the ICL criterion (Supplementary Figure 3), we identified two CpG clusters; the first cluster including 62 CpGs (red), out of which 60 CpGs were associated with financial difficulties, whereas the two other CpGs were related to household income and occupational trajectories, respectively; and the second cluster including 29 CpGs (yellow) associated with financial difficulties. While the first cluster presented a

more diffuse structure with the intergenic cg27109056 and the intragenic RBP1-cg16171849 as the most central CpGs, the second cluster was much more compact and displayed stronger inter-correlations (Supplementary Figure 4), with C22orf39-cg06501716, RPL23A-cg15036326, PRKCB-cg09327847, and miR134-cg10734581 as the most central CpGs.

# Sensitivity analyses

Using Fisher's exact tests for count data, we further explored whether there were associations between the identified network clusters, CpG methylation status (hyper/hypomethylation), CpG location (detailed intragenic position; intragenic/intergenic), and SEP indicators (financial difficulties, household income, occupational trajectories), but found no meaningful relations between these factors (Supplementary Tables 1-9).

#### **Discussion**

In this Swiss population-based study, we found that financial difficulties in adulthood, low household income, and adverse socioeconomic trajectories across the life-course are associated with the differential methylation of a large number of genome-wide CpG markers, with 97% of the identified CpGs being hypomethylated. Furthermore, we observed that after adjusting for health behaviors and cardiometabolic disorders, a substantial number of CpGs were no longer associated with SEP indicators, suggesting that these CpG markers may potentially mediate the effect of SEP on these cardiometabolic conditions. Finally, we found that the identified CpGs were strongly related to cell signaling, immune, and cancer-related processes, and tended to cluster into two main groups.

While we failed to retrieve any of the SEP-related CpGs identified in former studies, we found common biological processes and pathways between our study and previous investigations [5, 6, 25, 26]. Among the significantly associated intragenic CpGs, there were multiple genes involved in inflammatory and immune processes, including CCR3, ITGAL, CCL22, PRKCB, TNFRSF13B, RUNX3, SIT1, KALRN, TIGIT, NOTCH4, TSPAN4, RPL23A, and TRIO genes, which is consistent with previous research reporting a strong association between life-course SEP or dominance rank, and a differential methylation of CpGs located within pro-inflammatory genes [5, 6, 23, 26]. From the pathophysiological perspective, our results tend to be in line with former findings, as adverse socioeconomic circumstances have been strongly associated with aberrant inflammation, eventually leading to the occurrence of chronic diseases such as atherosclerosis, diabetes, and cancer [7, 27-29]. We also identified several intragenic CpGs located within cancer-related genes, including the two highly interconnected RBP1-cg1617849 (network-cluster 1) and RPL23A-cg15036326 (network-cluster 2), which is consistent with previous research suggesting that adverse socioeconomic circumstances may lead to a higher cancer risk, with DNA methylation as a potential underlying mechanism for this association [14, 30-34]. Furthermore, we observed that the great majority of the SEP-related CpG markers were hypomethylated, which is consistent with most previous research reporting overall hypomethylation in response to adverse socioeconomic circumstances [5, 6, 32, 35]. We also observed that upon accounting for health behaviors and/or cardiometabolic disorders, a substantial number of CpGs were no longer associated with SEP indicators, which is explained by variations in health behaviors and cardiometabolic disorders, and may suggest a potential mediating effect between SEP, health behaviors, DNA methylation, and cardiometabolic disorders [36]. In particular, we found that smoking, obesity, CHD, and diabetes were significantly associated with 29 of the 128 "dropped" CpG markers in the fully adjusted model (results available on request).

Finally, unlike previous research reporting an association between early-life socioeconomic circumstances and a differential CpG methylation in multiple gene promoters, we did not observe any associations involving SEP in childhood [17]. These results may be attributed to a lack of statistical power, or to a retrospective self-reporting of childhood SEP in our study [37], whereas former research reporting a significant relation between early-life socioeconomic circumstances and differential CpG methylation was conducted in a birth cohort with a more extensive measurement of SEP across different life periods [17].

# Strengths and limitations

Our study has several strengths, the first being the untargeted approach using 451'000 CpG markers across the entire human genome. Second, we investigated the role of nine different SEP indicators in childhood and adulthood, which allowed us to explore SEP-driven methylation changes across different life phases.

Our study also has some limitations to acknowledge. First, the relatively small sample size may lead to a limited statistical power, which restricts the ability to detect small effect-size associations. Second, unlike specific exposures producing strong and consistent DNA methylation changes in most populations (i.e. cigarette smoking), we found generally weak associations, with only three CpGs being associated with SEP indicators at Bonferroni threshold. Third, except for the CpG located within the ZNF385 gene (DNA binding) whose expression was modified as a result of SEP [25], we failed to retrieve any of the previously SEP-related methylation or transcription markers. Fourth, the relation between SEP-related CpG markers and gene expression shall also be investigated in order to determine how the differential methylation of CpGs affects the actual phenotype, eventually translating into a higher disease risk. This "multi-omics" approach, combining epigenomics and transcriptomics will thoroughly explore the correlations between the SEP-related CpGs, transcriptome-wide

RNAs, as well as blood inflammation markers (C-reactive protein, cytokines), and will be the object of our next research. Moreover, we must interpret the suggested relation between CpG methylation and inflammatory and oncogenic pathways cautiously, as it is impossible to determine which process occurred in the first place due to the overall cross-sectional nature of the present study. Finally, the use of peripheral blood mononuclear cells for assessing DNA methylation represents an additional issue due to heterogeneity in leukocyte composition, individual and population-based differences, and an important cell-turnover, which may eventually confound DNA methylation assessment [38]. However, we applied the Houseman procedure to account for these factors [20].

#### Conclusion

In summary, our findings suggest that adverse socioeconomic circumstances lead to a differential methylation of inflammation and cancer-related CpG markers in the human epigenome. However, the relation between socioeconomic factors and identified CpGs shall also be investigated in other populations to provide additional validity to our findings. Furthermore, future investigations shall explore the actual relation between identified CpG markers and inflammation and cancer-related outcomes. Finally, a longitudinal approach shall also be implemented in order to disentangle the causal pathway involving adverse socioeconomic circumstances, DNA methylation, inflammation, and disease occurrence.

 Table 1: General characteristics of included participants by sex

|   | Men (N=329)               | Women (N=361)           | P-value a,b |
|---|---------------------------|-------------------------|-------------|
| Age (μ±SD, y)                               | 52.4 (±15.8)              | 52.5 (±15.3)            | 0.948       |
| Recruitement center (random effect variable |                           |                         |             |
| Lausanne                                    | 137 (42%)                 | 167 (46%)               | 0.474       |
| Geneva                                      | 142 (43%)                 | 144 (40%)               |             |
| Bern  | 50 (15%)                  | 50 (14%)                |             |
| Seasonality of recruitement                 |                           |                         |             |
| Spring                                      | 104 (32%)                 | 107 (30%)               | 0.89        |
| Summer                                      | 70 (22%)                  | 75 (21%)                |             |
| Fall  | 74 (23%)                  | 84 (24%)                |             |
| Winter                                      | 74 (23%)                  | 84 (24%)                |             |
| PBMC composition                            |                           |                         |             |
| CD8T (µ±SD)                                 | $4.6e-02 (\pm 4.1e-02)$   | $6.5e-02 (\pm 4.2e-02)$ | < 0.001     |
| CD4T (µ±SD)                                 | $1.8e-01 \ (\pm 5.9e-02)$ | 1.8e-01 (±6.7e-02)      | 0.411       |
| NK (µ±SD)                                   | $6.1e-02 (\pm 3.7e-02)$   | 5.4e-02 (±3.7e-02)      | 0.013       |
| Bcells (µ±SD)                               | $4.3e-02 (\pm 3.0e-02)$   | $4.2e-02 (\pm 4.4e-02)$ | 0.361       |
| Monocytes (µ±SD)                            | $8.2e-02 (\pm 2.4e-02)$   | $7.3e-02 (\pm 2.5e-02)$ | < 0.001     |
| Granulocyte (μ±SD)                          | $6.0e-01 (\pm 9.8e-02)$   | $5.9e-01 (\pm 1.0e-01)$ | 0.298       |
| Illumina chip                               |                           |                         |             |
| HM450                                       | 107 (33%)                 | 129 (36%)               | 0.551       |
| EPIC  | 215 (67%)                 | 227 (64%)               |             |
| Early-life SEP                              |                           |                         |             |
| Father's occupational position              |                           |                         |             |
| High  | 75 (23%)                  | 90 (25%)                | 0.801       |
| Middle                                      | 127 (40%)                 | 132 (37%)               |             |
| Low   | 119 (37%)                 | 131 (37%)               |             |
| Infancy conditions                          |                           |                         |             |
| High  | 94 (29%)                  | 88 (25%)                | 0.413       |
| Middle                                      | 164 (51%)                 | 198 (56%)               |             |
| Low   | 64 (20%)                  | 70 (20%)                |             |
| Father's education                          |                           |                         |             |
| High  | 80 (25%)                  | 92 (26%)                | 0.907       |
| Middle                                      | 130 (41%)                 | 136 (39%)               |             |
| Low   | 110 (34%)                 | 123 (35%)               |             |
| Mother's education                          |                           |                         |             |
| High  | 41 (13%)                  | 46 (13%)                | 0.862       |
| Middle                                      | 111 (35%)                 | 128 (37%)               |             |
| Low   | 166 (52%)                 | 175 (50%)               |             |
| Adult SEP                                   |                           |                         |             |
| Participant's education                     |                           |                         |             |
| High  | 132 (41%)                 | 134 (38%)               | 0.121       |
| Middle                                      | 146 (45%)                 | 150 (42%)               |             |
| Low   | 44 (14%)                  | 72 (20%)                |             |
| Occupational position                       | 00.455                    | 10 (10)                 |             |
| High  | 93 (30%)                  | 42 (13%)                | < 0.001     |
| Middle                                      | 73 (24%)                  | 137 (42%)               |             |
| Low   | 143 (46%)                 | 145 (45%)               |             |
| Household income                            | 110 (40%)                 | 104 (242)               | 0.051       |
| High  | 119 (42%)                 | 104 (34%)               | 0.051       |
| Middle                                      | 121 (43%)                 | 132 (43%)               |             |
| Low   | 43 (15%)                  | 69 (23%)                |             |
| Financial difficulties 1 °                  | 010 (572)                 | 225 (652)               | 2.24        |
| No difficulties                             | 213 (67%)                 | 235 (67%)               | 0.91        |
| Average difficulties                        | 69 (22%)                  | 77 (22%)                |             |
| Important difficulties                      | 38 (12%)                  | 38 (11%)                |             |
| Life-course occupational trajectories       | 22 (110/)                 | 22 (70)                 | 0.005       |
| Stable high                                 | 33 (11%)                  | 22 (7%)                 | 0.005       |
| Upward                                      | 88 (29%)                  | 63 (20%)                |             |
| Stable mid.                                 | 31 (10%)                  | 55 (17%)                |             |
| Downward                                    | 93 (30%)                  | 111 (35%)               |             |
| Stable low                                  | 63 (20%)                  | 70 (22%)                |             |
| Health behaviors                            | 0.4.45                    |                         |             |
| Current smoking (N,%)                       | 96 (30%)                  | 74 (21%)                | 0.014       |
| Hazardous alcohol intake (N,%) <sup>e</sup> | 36 (11%)                  | 0 (0%)                  | < 0.001     |

| Sedentary behavior (N,%) | 130 (40%)   | 145 (41%)   | 1       |
|--------------------------|-------------|-------------|---------|
| CMD                      |             |             |         |
| BMI (µ±SD,kg/m2)         | 26.6 (±4.1) | 24.8 (±4.8) | < 0.001 |
| Obesity (N,%)            | 54 (17%)    | 48 (13%)    | 0.208   |
| Hypertension (N,%)       | 108 (34%)   | 77 (22%)    | < 0.001 |
| Diabetes (N,%)           | 25 (8%)     | 13 (4%)     | 0.023   |
| CHD (N,%)                | 10 (3%)     | 5 (1%)      | 0.095   |

CHD (N,%)

CHD (N,%)

CHD, coronary heart disease; PBMS, peripheral blood mononuclear cell; SEP, socioeconomic position

Data are mean ± SD for continuous variables and n (%) for categorical variables

The Mann-Whitney U-test was performed between men and women for continuous variables.

The χ2 contingency test was performed between men and women for categorical variables

The definition of health behaviors and cardiometabolic disorders is given in Annex II

**Table 2:** Summary of CpG markers (N=161) significantly associated with life-course SEP variables at Benjamini-Hochberg (BH) significance threshold in the model adjusted for main covariates (M1), and the models additionally adjusted for health behaviors and/or cardiometabolic disorders (M2-M4)

|            |                        | M1 <sup>a</sup> |      |          | M2:M  | 1 + HB | b         | M3:M1 | + CMD | e         | M4:M1 + HB + CMD d |      |                      |           |            |            |
|------------|------------------------|-----------------|------|----------|-------|--------|-----------|-------|-------|-----------|--------------------|------|----------------------|-----------|------------|------------|
| CpG        | SEP                    | Beta            | SE   | P-value  | Beta  | SE     | P-value e | Beta  | SE    | P-value e | Beta               | SE   | P-value <sup>e</sup> | Gene      | Location f | Chromosome |
| cg17024919 | Household income       | -0.55           | 0.10 | 1.20E-07 | -0.50 | 0.10   | 1.26E-06  | -0.54 | 0.10  | 1.78E-07  | -0.50              | 0.10 | 1.78E-06             | ZNF385D   | Body       | chr3       |
| cg21900073 | Household income       | -0.41           | 0.08 | 1.75E-07 | -0.41 | 0.08   | 2.47E-07  | -0.39 | 0.08  | 4.27E-07  | -0.39              | 0.08 | 6.31E-07             |           | Intergenic | chr4       |
| cg24940583 | Financial difficulties | -0.47           | 0.08 | 9.78E-09 | -0.46 | 0.08   | 3.53E-08  | -0.49 | 0.08  | 6.61E-09  | -0.47              | 0.08 | 3.27E-08             | KIAA0319L | 5'UTR      | chr1       |
| cg21618273 | Financial difficulties | -0.24           | 0.05 | 1.14E-07 | -0.24 | 0.05   | 3.21E-07  | -0.25 | 0.05  | 1.03E-07  | -0.24              | 0.05 | 3.11E-07             | TRIO      | Body       | chr5       |
| cg14313576 | Financial difficulties | -0.27           | 0.05 | 1.22E-07 | -0.27 | 0.05   | 2.40E-07  | -0.27 | 0.05  | 3.40E-07  | -0.26              | 0.05 | 7.02E-07             | KY        | Body       | chr3       |
| cg20171011 | Financial difficulties | -0.36           | 0.07 | 1.72E-07 | -0.35 | 0.07   | 4.13E-07  | -0.36 | 0.07  | 2.23E-07  | -0.35              | 0.07 | 5.81E-07             | TSPAN4    | Body       | chr11      |
| cg10576132 | Financial difficulties | -0.29           | 0.06 | 3.28E-07 | -0.28 | 0.06   | 1.20E-06  | -0.28 | 0.06  | 1.17E-06  | -0.27              | 0.06 | 3.70E-06             | TXNDC3    | Body       | chr7       |
| cg05946118 | Financial difficulties | -0.28           | 0.05 | 3.47E-07 | -0.28 | 0.05   | 4.62E-07  | -0.28 | 0.05  | 3.44E-07  | -0.28              | 0.06 | 5.25E-07             |           | Intergenic | chr16      |
| cg13361798 | Financial difficulties | -0.54           | 0.11 | 4.76E-07 | -0.56 | 0.11   | 2.29E-07  | -0.52 | 0.11  | 1.19E-06  | -0.54              | 0.11 | 6.16E-07             |           | Intergenic | chr22      |
| cg07565228 | Financial difficulties | -0.39           | 0.08 | 5.58E-07 | -0.40 | 0.08   | 5.65E-07  | -0.39 | 0.08  | 8.31E-07  | -0.39              | 0.08 | 1.04E-06             | LDHD      | Body       | chr16      |
| cg17007693 | Financial difficulties | -0.31           | 0.06 | 7.94E-07 | -0.29 | 0.06   | 3.94E-06  | -0.30 | 0.06  | 2.10E-06  | -0.28              | 0.06 | 1.09E-05             |           | Intergenic | chr18      |
| cg14531564 | Financial difficulties | -0.33           | 0.07 | 9.14E-07 | -0.31 | 0.07   | 2.80E-06  | -0.32 | 0.07  | 1.92E-06  | -0.30              | 0.07 | 7.18E-06             | SDF4      | Body       | chr1       |
| cg11195733 | Financial difficulties | -0.44           | 0.09 | 1.14E-06 | -0.49 | 0.09   | 1.15E-07  | -0.46 | 0.09  | 6.42E-07  | -0.51              | 0.09 | 5.26E-08             | TECPR2    | Body       | chr14      |
| cg05259836 | Financial difficulties | -0.46           | 0.09 | 1.15E-06 | -0.46 | 0.09   | 1.40E-06  | -0.45 | 0.09  | 2.37E-06  | -0.45              | 0.10 | 2.95E-06             |           | Intergenic | chr6       |
| cg09251508 | Financial difficulties | -0.35           | 0.07 | 1.18E-06 | -0.35 | 0.07   | 1.27E-06  | -0.32 | 0.07  | 8.55E-06  | -0.32              | 0.07 | 8.54E-06             |           | Intergenic | chr3       |
| cg11875995 | Financial difficulties | -0.37           | 0.08 | 1.59E-06 | -0.37 | 0.08   | 2.61E-06  | -0.37 | 0.08  | 2.37E-06  | -0.37              | 0.08 | 4.73E-06             |           | Intergenic | chr8       |
| cg25430442 | Financial difficulties | -0.45           | 0.09 | 1.65E-06 | -0.47 | 0.09   | 4.87E-07  | -0.43 | 0.09  | 5.97E-06  | -0.45              | 0.09 | 2.08E-06             |           | Intergenic | chr2       |
| cg27054610 | Financial difficulties | -0.39           | 0.08 | 1.66E-06 | -0.38 | 0.08   | 3.23E-06  | -0.39 | 0.08  | 1.49E-06  | -0.38              | 0.08 | 3.23E-06             | NOTCH4    | Body       | chr6       |
| cg05398769 | Financial difficulties | -0.43           | 0.09 | 1.67E-06 | -0.43 | 0.09   | 2.75E-06  | -0.42 | 0.09  | 4.14E-06  | -0.41              | 0.09 | 7.96E-06             | CASZ1     | 5'UTR      | chr1       |
| cg10827488 | Financial difficulties | 0.25            | 0.05 | 1.68E-06 | 0.24  | 0.05   | 7.53E-06  | 0.25  | 0.05  | 3.18E-06  | 0.23               | 0.05 | 1.49E-05             | ZBTB16    | Body       | chr11      |
| cg24069724 | Financial difficulties | -0.47           | 0.10 | 1.77E-06 | -0.50 | 0.10   | 4.29E-07  | -0.50 | 0.10  | 6.95E-07  | -0.53              | 0.10 | 1.98E-07             | GLI2      | Body       | chr2       |
| cg19654061 | Financial difficulties | -0.48           | 0.10 | 1.79E-06 | -0.46 | 0.10   | 4.65E-06  | -0.46 | 0.10  | 5.96E-06  | -0.44              | 0.10 | 1.78E-05             | ALPP      | 1stExon    | chr2       |
| cg22012299 | Financial difficulties | -0.34           | 0.07 | 1.97E-06 | -0.33 | 0.07   | 2.81E-06  | -0.32 | 0.07  | 1.02E-05  | -0.31              | 0.07 | 1.70E-05             | ITGBL1    | Body       | chr13      |
| cg10588834 | Financial difficulties | -0.44           | 0.09 | 1.98E-06 | -0.44 | 0.09   | 2.01E-06  | -0.45 | 0.09  | 1.86E-06  | -0.45              | 0.09 | 2.27E-06             | AUTS2     | Body       | chr7       |
| cg01425731 | Financial difficulties | 0.34            | 0.07 | 2.01E-06 | 0.31  | 0.07   | 1.75E-05  | 0.34  | 0.07  | 3.00E-06  | 0.31               | 0.07 | 2.41E-05             | ARL11     | 5'UTR      | chr13      |
| cg26148774 | Financial difficulties | -0.33           | 0.07 | 2.22E-06 | -0.32 | 0.07   | 4.30E-06  | -0.35 | 0.07  | 8.31E-07  | -0.34              | 0.07 | 1.90E-06             | OR10P1    | TSS1500    | chr12      |
| cg05229416 | Financial difficulties | -0.30           | 0.06 | 2.53E-06 | -0.29 | 0.06   | 6.14E-06  | -0.29 | 0.06  | 8.38E-06  | -0.28              | 0.07 | 2.06E-05             | EPHB2     | Body       | chr1       |
| cg06332621 | Financial difficulties | -0.26           | 0.05 | 2.73E-06 | -0.25 | 0.05   | 3.88E-06  | -0.26 | 0.05  | 2.68E-06  | -0.26              | 0.06 | 4.12E-06             | RBM47     | TSS1500    | chr4       |
| cg20948431 | Financial difficulties | -0.33           | 0.07 | 2.74E-06 | -0.30 | 0.07   | 1.53E-05  | -0.34 | 0.07  | 1.22E-06  | -0.32              | 0.07 | 7.05E-06             | C4orf10   | Body       | chr4       |
| cg01527394 | Financial difficulties | -0.47           | 0.10 | 2.79E-06 | -0.47 | 0.10   | 3.23E-06  | -0.46 | 0.10  | 6.98E-06  | -0.46              | 0.10 | 8.39E-06             | TBC1D22A  | Body       | chr22      |
| cg18796704 | Financial difficulties | -0.49           | 0.10 | 2.80E-06 | -0.52 | 0.10   | 1.03E-06  | -0.45 | 0.10  | 2.27E-05  | -0.47              | 0.11 | 1.02E-05             | ENPP1     | 3'UTR      | chr6       |
| cg00052588 | Financial difficulties | -0.44           | 0.09 | 3.06E-06 | -0.43 | 0.09   | 4.95E-06  | -0.44 | 0.09  | 3.39E-06  | -0.43              | 0.09 | 5.68E-06             |           | Intergenic | chr16      |
| cg26197254 | Financial difficulties | -0.23           | 0.05 | 3.12E-06 | -0.22 | 0.05   | 6.92E-06  | -0.21 | 0.05  | 1.68E-05  | -0.21              | 0.05 | 4.50E-05             | FLJ37543  | Body       | chr5       |
| υ          | Financial difficulties | -0.33           | 0.07 | 3.15E-06 | -0.33 | 0.07   | 5.06E-06  | -0.31 | 0.07  | 1.67E-05  | -0.30              | 0.07 | 3.10E-05             |           | Intergenic | chr5       |
| cg24180759 | Financial difficulties | -0.23           | 0.05 | 3.18E-06 | -0.23 | 0.05   | 5.11E-06  | -0.22 | 0.05  | 7.59E-06  | -0.22              | 0.05 | 1.18E-05             | ODZ2      | Body       | chr5       |
| cg07617814 | Financial difficulties | -0.29           | 0.06 | 3.21E-06 | -0.28 | 0.06   | 6.19E-06  | -0.27 | 0.06  | 1.50E-05  | -0.26              | 0.06 | 3.25E-05             | ZNF217    | 1stExon    | chr20      |
| cg17034360 | Financial difficulties | -0.50           | 0.11 | 3.21E-06 | -0.48 | 0.11   | 6.30E-06  | -0.50 | 0.11  | 3.90E-06  | -0.48              | 0.11 | 1.03E-05             | GPR177    | Body       | chr1       |
| cg03377767 | Financial difficulties | -0.25           | 0.05 | 3.26E-06 | -0.24 | 0.05   | 1.13E-05  | -0.25 | 0.05  | 3.75E-06  | -0.24              | 0.06 | 1.26E-05             | MSGN1     | TSS1500    | chr2       |
| cg20488756 | Financial difficulties | -0.49           | 0.10 | 3.29E-06 | -0.48 | 0.11   | 6.68E-06  | -0.51 | 0.11  | 2.07E-06  | -0.50              | 0.11 | 4.24E-06             | TRIM15    | 1stExon    | chr6       |
| cg19043851 | Financial difficulties | -0.36           | 0.08 | 3.44E-06 | -0.37 | 0.08   | 3.07E-06  | -0.35 | 0.08  | 1.03E-05  | -0.36              | 0.08 | 7.66E-06             |           | Intergenic | chr10      |

| cg21733502               | Financial difficulties                         | -0.47          | 0.10 | 3.44E-06             | -0.47          | 0.10 | 4.95E-06             | -0.44          | 0.10 | 1.80E-05                    | -0.44          | 0.10 | 2.64E-05             | ZSCAN5B           | Body            | chr19 |
|--------------------------|--|----------------|------|----------------------|----------------|------|----------------------|----------------|------|-----------------------------|----------------|------|----------------------|-------------------|-----------------|-------|
| cg00293599               | Financial difficulties                         | -0.43          | 0.09 | 3.52E-06             | -0.45          | 0.09 | 1.51E-06             | -0.46          | 0.09 | 1.48E-06                    | -0.48          | 0.09 | 5.66E-07             | SPDEF             | 3'UTR           | chr6  |
| cg16431352               | Financial difficulties                         | -0.29          | 0.06 | 3.75E-06             | -0.28          | 0.06 | 8.76E-06             | -0.27          | 0.06 | 2.00E-05                    | -0.26          | 0.06 | 5.28E-05             |                   | Intergenic      | chr2  |
| cg08816023               | Financial difficulties                         | -0.34          | 0.07 | 3.84E-06             | -0.34          | 0.07 | 5.45E-06             | -0.32          | 0.07 | 2.07E-05                    | -0.32          | 0.08 | 2.97E-05             | FGF1              | 5'UTR           | chr5  |
| cg15805567               | Financial difficulties                         | -0.28          | 0.06 | 3.90E-06             | -0.28          | 0.06 | 3.04E-06             | -0.27          | 0.06 | 9.88E-06                    | -0.27          | 0.06 | 8.25E-06             | ARHGAP22          | Body            | chr10 |
| cg26405835               | Financial difficulties                         | -0.50          | 0.11 | 3.94E-06             | -0.51          | 0.11 | 3.18E-06             | -0.53          | 0.11 | 1.46E-06                    | -0.54          | 0.11 | 1.01E-06             | NCRNA00160        | TSS1500         | chr21 |
| cg12252328               | Financial difficulties                         | -0.42          | 0.09 | 4.00E-06             | -0.41          | 0.09 | 7.68E-06             | -0.41          | 0.09 | 9.24E-06                    | -0.40          | 0.09 | 1.98E-05             | ALK               | Body            | chr2  |
| cg04716530               | Financial difficulties                         | -0.23          | 0.05 | 4.06E-06             | -0.21          | 0.05 | 5.10E-05             | -0.22          | 0.05 | 1.19E-05                    | -0.19          | 0.05 | 1.61E-04             | ITGAL             | Body            | chr16 |
| cg00045118               | Financial difficulties                         | -0.27          | 0.06 | 4.15E-06             | -0.27          | 0.06 | 8.87E-06             | -0.26          | 0.06 | 1.37E-05                    | -0.25          | 0.06 | 3.18E-05             | RUNX1T1           | Body            | chr8  |
| cg14883070               | Financial difficulties                         | -0.46          | 0.10 | 4.16E-06             | -0.50          | 0.10 | 8.78E-07             | -0.46          | 0.10 | 6.65E-06                    | -0.49          | 0.10 | 2.00E-06             | SPIRE1            | 5'UTR           | chr18 |
| cg19928195               | Financial difficulties                         | -0.26          | 0.06 | 4.25E-06             | -0.27          | 0.06 | 4.51E-06             | -0.24          | 0.06 | 3.37E-05                    | -0.24          | 0.06 | 3.67E-05             | KALRN             | TSS1500         | chr3  |
| cg02854972               | Financial difficulties                         | -0.26          | 0.06 | 4.35E-06             | -0.26          | 0.06 | 6.74E-06             | -0.25          | 0.06 | 1.62E-05                    | -0.24          | 0.06 | 2.54E-05             |                   | Intergenic      | chr4  |
| cg06519434               | Financial difficulties                         | -0.23          | 0.05 | 4.47E-06             | -0.23          | 0.05 | 9.91E-06             | -0.23          | 0.05 | 1.10E-05                    | -0.22          | 0.05 | 2.78E-05             | SCN5A             | Body            | chr3  |
| cg10734581               | Financial difficulties                         | -0.24          | 0.05 | 4.49E-06             | -0.25          | 0.05 | 3.87E-06             | -0.23          | 0.05 | 1.62E-05                    | -0.24          | 0.05 | 1.53E-05             | MIR134            | TSS1500         | chr14 |
| cg27488095               | Financial difficulties                         | -0.29          | 0.06 | 4.95E-06             | -0.28          | 0.06 | 1.17E-05             | -0.29          | 0.06 | 4.31E-06                    | -0.28          | 0.06 | 1.12E-05             | TM4SF5            | 1stExon         | chr17 |
| cg08745960               | Financial difficulties                         | -0.45          | 0.10 | 5.04E-06             | -0.48          | 0.10 | 1.32E-06             | -0.44          | 0.10 | 1.10E-05                    | -0.47          | 0.10 | 2.76E-06             |                   | Intergenic      | chr22 |
| cg00442174               | Financial difficulties                         | -0.49          | 0.11 | 5.15E-06             | -0.47          | 0.11 | 1.50E-05             | -0.49          | 0.11 | 9.68E-06                    | -0.46          | 0.11 | 2.86E-05             | PIGL              | Body            | chr17 |
| cg01940273               | Financial difficulties                         | -0.47          | 0.10 | 5.36E-06             | -0.27          | 0.09 | 3.13E-03             | -0.46          | 0.10 | 8.21E-06                    | -0.25          | 0.09 | 5.92E-03             |                   | Intergenic      | chr2  |
| cg22526555               | Financial difficulties                         | -0.40          | 0.09 | 5.49E-06             | -0.40          | 0.09 | 6.26E-06             | -0.42          | 0.09 | 1.95E-06                    | -0.43          | 0.09 | 2.20E-06             | DSCR10            | Body            | chr21 |
| cg09364677               | Financial difficulties                         | -0.49          | 0.11 | 5.49E-06             | -0.49          | 0.11 | 7.50E-06             | -0.52          | 0.11 | 2.07E-06                    | -0.52          | 0.11 | 3.10E-06             |                   | Intergenic      | chr16 |
| cg09091373               | Financial difficulties                         | -0.47          | 0.10 | 5.65E-06             | -0.47          | 0.10 | 7.31E-06             | -0.47          | 0.10 | 4.85E-06                    | -0.47          | 0.10 | 6.35E-06             | TP53I11           | Body            | chr11 |
| cg10221172               | Financial difficulties                         | -0.31          | 0.07 | 5.89E-06             | -0.31          | 0.07 | 3.91E-06             | -0.27          | 0.07 | 6.73E-05                    | -0.28          | 0.07 | 4.58E-05             | SASH1             | Body            | chr6  |
| cg15518883               | Financial difficulties                         | -0.15          | 0.03 | 5.96E-06             | -0.15          | 0.03 | 2.79E-06             | -0.15          | 0.03 | 3.85E-06                    | -0.16          | 0.03 | 1.61E-06             | SIT1              | Body            | chr9  |
| C                        | Financial difficulties                         | -0.32          | 0.07 | 5.97E-06             | -0.29          | 0.07 | 3.59E-05             | -0.32          | 0.07 | 8.31E-06                    | -0.29          | 0.07 | 5.09E-05             | PIGT              | Body            | chr20 |
| cg13820281               | Financial difficulties                         | -0.38          | 0.08 | 6.07E-06             | -0.39          | 0.08 | 4.23E-06             | -0.37          | 0.09 | 1.49E-05                    | -0.38          | 0.09 | 1.36E-05             |                   | Intergenic      | chr9  |
| U                        | Financial difficulties                         | -0.28          | 0.06 | 6.12E-06             | -0.28          | 0.06 | 9.70E-06             | -0.27          | 0.06 | 1.90E-05                    | -0.27          | 0.06 | 2.68E-05             | P4HA2             | Body            | chr5  |
| cg11904429               | Financial difficulties                         | -0.26          | 0.06 | 6.17E-06             | -0.26          | 0.06 | 6.59E-06             | -0.26          | 0.06 | 9.59E-06                    | -0.26          | 0.06 | 9.40E-06             | CD70              | TSS1500         | chr19 |
| cg16519923               | Financial difficulties                         | -0.22          | 0.05 | 6.49E-06             | -0.19          | 0.05 | 8.99E-05             | -0.21          | 0.05 | 3.50E-05                    | -0.18          | 0.05 | 4.70E-04             | ITGAL             | Body            | chr16 |
| cg08536617               | Financial difficulties                         | -0.29          | 0.06 | 6.55E-06             | -0.27          | 0.06 | 2.17E-05             | -0.27          | 0.06 | 2.02E-05                    | -0.26          | 0.06 | 6.69E-05             | 11 0.12           | Intergenic      | chr10 |
| cg26034811               | Financial difficulties                         | -0.29          | 0.06 | 6.72E-06             | -0.28          | 0.06 | 1.65E-05             | -0.28          | 0.06 | 1.18E-05                    | -0.27          | 0.06 | 3.22E-05             | ADSSL1            | Body            | chr14 |
| 2                        | Financial difficulties                         | -0.31          | 0.07 | 6.83E-06             | -0.29          | 0.07 | 2.32E-05             | -0.30          | 0.07 | 1.94E-05                    | -0.28          | 0.07 | 7.07E-05             | SNORD18A          | TSS200          | chr15 |
| cg07568203               | Financial difficulties                         | -0.36          | 0.08 | 7.09E-06             | -0.35          | 0.08 | 1.48E-05             | -0.33          | 0.08 | 3.08E-05                    | -0.33          | 0.08 | 6.18E-05             | OR51B5            | TSS1500         | chr11 |
| υ                        | Financial difficulties                         | -0.45          | 0.10 | 7.23E-06             | -0.40          | 0.10 | 5.99E-05             | -0.43          | 0.10 | 2.29E-05                    | -0.38          | 0.10 | 2.10E-04             | GCET2             | TSS1500         | chr3  |
| C                        | Financial difficulties                         | -0.41          | 0.09 | 7.53E-06             | -0.43          | 0.09 | 2.57E-06             | -0.42          | 0.09 | 5.78E-06                    | -0.44          | 0.09 | 2.23E-06             | SLC16A3           | Body            | chr17 |
| cg18461347               | Financial difficulties                         | -0.28          | 0.06 | 7.57E-06             | -0.28          | 0.06 | 9.30E-06             | -0.26          | 0.06 | 5.20E-05                    | -0.26          | 0.06 | 5.98E-05             | MAGI2             | Body            | chr7  |
| υ                        | Financial difficulties                         | -0.30          | 0.07 | 7.58E-06             | -0.31          | 0.07 | 8.25E-06             | -0.28          | 0.07 | 5.41E-05                    | -0.27          | 0.07 | 7.53E-05             | KLF15             | 5'UTR           | chr3  |
| υ                        | Financial difficulties                         | -0.23          | 0.05 | 7.65E-06             | -0.20          | 0.05 | 8.48E-05             | -0.22          | 0.05 | 2.78E-05                    | -0.19          | 0.05 | 3.19E-04             | ITGAL             | Body            | chr16 |
| cg05740254               | Financial difficulties                         | 0.48           | 0.03 | 7.88E-06             | 0.44           | 0.03 | 3.39E-05             | 0.49           | 0.03 | 4.63E-05                    | 0.46           | 0.03 | 2.19E-04<br>2.19E-05 | KLKB1             | TSS200          | chr4  |
| cg26869501               | Financial difficulties                         | -0.33          | 0.11 | 7.93E-06             | -0.31          | 0.11 | 1.90E-05             | -0.32          | 0.11 | 1.43E-05                    | -0.31          | 0.11 | 4.25E-05             | TMPO              | Body            | chr12 |
| cg22374742               | Financial difficulties                         | -0.33          | 0.07 | 8.09E-06             | -0.31          | 0.07 | 1.69E-05             | -0.32          | 0.07 | 1.43E-05<br>1.20E-05        | -0.27          | 0.07 | 2.38E-05             | UXS1              | Body            | chr2  |
| cg02762561               | Financial difficulties                         | -0.28          | 0.00 | 8.23E-06             | -0.27          | 0.00 | 2.49E-05             | -0.28          | 0.00 | 2.78E-05                    | -0.27          | 0.00 | 7.81E-06             | PAXIP1            | Body            | chr7  |
| υ                        | Financial difficulties                         | -0.41          | 0.09 | 8.25E-06<br>8.35E-06 | -0.44          | 0.09 |                      | -0.39          | 0.09 | 6.39E-05                    | -0.42<br>-0.18 | 0.09 | 1.01E-03             |                   | ьоду<br>5'UTR   | chr14 |
| cg01731783<br>cg09246203 | Financial difficulties  Financial difficulties | -0.24          | 0.03 | 8.40E-06             | -0.21          | 0.03 | 1.33E-04<br>4.24E-05 | -0.22<br>-0.36 | 0.05 | 6.39E-05<br><b>5.41E-06</b> | -0.18<br>-0.33 | 0.03 | 2.91E-05             | C14orf43<br>TIGIT |                 | chr3  |
| C                        |  |                |      |                      |                |      |                      |                |      |                             |                |      |                      |                   | Body<br>TSS1500 |       |
| cg01693305               | Financial difficulties                         | -0.31<br>-0.24 | 0.07 | 8.66E-06             | -0.30<br>-0.24 | 0.07 | 2.38E-05             | -0.29          | 0.07 | 4.00E-05                    | -0.28          | 0.07 | 9.64E-05             | CAPZB             | TSS1500         | chr1  |
| cg16086570               | Financial difficulties                         |                |      | 8.83E-06             |                |      | 1.19E-05             | -0.23          | 0.05 | 3.75E-05                    | -0.22          | 0.05 | 5.02E-05             |                   | Intergenic      | chr5  |
| cg21283739               | Financial difficulties                         | -0.41          | 0.09 | 8.96E-06             | -0.44          | 0.09 | 1.52E-06             | -0.40          | 0.09 | 1.38E-05                    | -0.44          | 0.09 | 2.42E-06             |                   | Intergenic      | chr17 |

| cg16455376 | Financial difficulties | -0.28 | 0.06 | 8.97E-06 | -0.27 | 0.06 | 1.79E-05 | -0.29 | 0.06 | 8.50E-06 | -0.28 | 0.06 | 1.47E-05 |           | Intergenic | chr16 |
|------------|------------------------|-------|------|----------|-------|------|----------|-------|------|----------|-------|------|----------|-----------|------------|-------|
| cg09875213 | Financial difficulties | -0.22 | 0.05 | 9.13E-06 | -0.22 | 0.05 | 2.18E-05 | -0.22 | 0.05 | 1.40E-05 | -0.22 | 0.05 | 3.39E-05 | TIFAB     | 5'UTR      | chr5  |
| cg12621745 | Financial difficulties | -0.33 | 0.07 | 9.22E-06 | -0.31 | 0.08 | 4.96E-05 | -0.34 | 0.08 | 9.28E-06 | -0.31 | 0.08 | 5.71E-05 | PLEC1     | Body       | chr8  |
| cg17174275 | Financial difficulties | -0.32 | 0.07 | 9.32E-06 | -0.29 | 0.07 | 6.53E-05 | -0.31 | 0.07 | 1.65E-05 | -0.28 | 0.07 | 1.04E-04 | ATP10A    | TSS1500    | chr15 |
| cg24315209 | Financial difficulties | -0.23 | 0.05 | 9.36E-06 | -0.23 | 0.05 | 1.53E-05 | -0.22 | 0.05 | 2.27E-05 | -0.22 | 0.05 | 3.57E-05 | CDK18     | Body       | chr1  |
| cg01502320 | Financial difficulties | -0.24 | 0.05 | 9.38E-06 | -0.24 | 0.05 | 7.18E-06 | -0.23 | 0.05 | 2.41E-05 | -0.23 | 0.05 | 1.85E-05 | TNFRSF13B | TSS200     | chr17 |
| cg21949830 | Financial difficulties | -0.34 | 0.08 | 9.50E-06 | -0.31 | 0.08 | 5.79E-05 | -0.36 | 0.08 | 3.65E-06 | -0.33 | 0.08 | 2.51E-05 | SLC43A2   | Body       | chr17 |
| cg13466546 | Financial difficulties | -0.36 | 0.08 | 9.62E-06 | -0.36 | 0.08 | 1.03E-05 | -0.32 | 0.08 | 7.78E-05 | -0.32 | 0.08 | 1.01E-04 | TBC1D16   | Body       | chr17 |
| cg20747462 | Financial difficulties | -0.38 | 0.09 | 9.67E-06 | -0.37 | 0.09 | 2.13E-05 | -0.42 | 0.09 | 1.52E-06 | -0.41 | 0.09 | 3.79E-06 | RAMP3     | Body       | chr7  |
| cg20402658 | Financial difficulties | -0.45 | 0.10 | 9.75E-06 | -0.48 | 0.10 | 2.17E-06 | -0.43 | 0.10 | 2.31E-05 | -0.47 | 0.10 | 5.69E-06 | NCALD     | Body       | chr8  |
| cg23719877 | Financial difficulties | -0.32 | 0.07 | 9.82E-06 | -0.32 | 0.07 | 1.55E-05 | -0.30 | 0.07 | 4.51E-05 | -0.30 | 0.07 | 7.39E-05 | FLNC      | Body       | chr7  |
| cg15036326 | Financial difficulties | -0.24 | 0.05 | 9.96E-06 | -0.22 | 0.05 | 4.21E-05 | -0.22 | 0.05 | 3.99E-05 | -0.21 | 0.05 | 1.64E-04 | RPL23A    | Body       | chr17 |
| cg14211837 | Financial difficulties | -0.29 | 0.07 | 1.01E-05 | -0.29 | 0.07 | 2.27E-05 | -0.28 | 0.07 | 2.94E-05 | -0.28 | 0.07 | 5.93E-05 |           | Intergenic | chr18 |
| cg22573118 | Financial difficulties | -0.38 | 0.09 | 1.02E-05 | -0.37 | 0.09 | 1.82E-05 | -0.39 | 0.09 | 8.12E-06 | -0.38 | 0.09 | 1.74E-05 | CCR3      | TSS1500    | chr3  |
| cg11345703 | Financial difficulties | -0.40 | 0.09 | 1.03E-05 | -0.40 | 0.09 | 1.43E-05 | -0.38 | 0.09 | 1.53E-05 | -0.38 | 0.09 | 2.47E-05 | SYT7      | Body       | chr11 |
| cg22478317 | Financial difficulties | -0.23 | 0.05 | 1.03E-05 | -0.21 | 0.05 | 6.49E-05 | -0.22 | 0.05 | 1.76E-05 | -0.20 | 0.05 | 1.13E-04 |           | Intergenic | chr2  |
| cg11952604 | Financial difficulties | -0.48 | 0.11 | 1.06E-05 | -0.46 | 0.11 | 2.92E-05 | -0.48 | 0.11 | 1.19E-05 | -0.45 | 0.11 | 4.04E-05 | ANP32A    | TSS200     | chr15 |
| cg03797139 | Financial difficulties | -0.42 | 0.09 | 1.08E-05 | -0.40 | 0.09 | 2.83E-05 | -0.40 | 0.09 | 2.44E-05 | -0.39 | 0.10 | 6.45E-05 | HECA      | Body       | chr6  |
| cg03724006 | Financial difficulties | -0.48 | 0.11 | 1.09E-05 | -0.50 | 0.11 | 6.86E-06 | -0.48 | 0.11 | 1.44E-05 | -0.50 | 0.11 | 9.76E-06 |           | Intergenic | chr11 |
| cg14166701 | Financial difficulties | -0.46 | 0.10 | 1.09E-05 | -0.44 | 0.11 | 3.90E-05 | -0.49 | 0.11 | 5.49E-06 | -0.45 | 0.11 | 2.91E-05 | ASPG      | Body       | chr14 |
| cg27627493 | Financial difficulties | -0.25 | 0.06 | 1.10E-05 | -0.26 | 0.06 | 3.46E-06 | -0.25 | 0.06 | 1.70E-05 | -0.26 | 0.06 | 5.02E-06 |           | Intergenic | chr15 |
| cg09920804 | Financial difficulties | -0.23 | 0.05 | 1.10E-05 | -0.21 | 0.05 | 6.19E-05 | -0.23 | 0.05 | 1.85E-05 | -0.21 | 0.05 | 9.99E-05 | PLAT      | 5'UTR      | chr8  |
| cg01158415 | Financial difficulties | -0.46 | 0.10 | 1.13E-05 | -0.47 | 0.11 | 9.77E-06 | -0.44 | 0.11 | 4.09E-05 | -0.44 | 0.11 | 4.88E-05 |           | Intergenic | chr2  |
| cg11786338 | Financial difficulties | -0.22 | 0.05 | 1.13E-05 | -0.21 | 0.05 | 4.41E-05 | -0.22 | 0.05 | 2.78E-05 | -0.20 | 0.05 | 1.07E-04 | SEC11C    | Body       | chr18 |
| cg24630195 | Financial difficulties | -0.43 | 0.10 | 1.13E-05 | -0.45 | 0.10 | 5.84E-06 | -0.42 | 0.10 | 1.91E-05 | -0.44 | 0.10 | 1.03E-05 | IRX2      | Body       | chr5  |
| cg14906909 | Financial difficulties | -0.40 | 0.09 | 1.17E-05 | -0.40 | 0.09 | 1.47E-05 | -0.35 | 0.09 | 1.38E-04 | -0.35 | 0.09 | 1.57E-04 | ACSS3     | Body       | chr12 |
| cg16171849 | Financial difficulties | -0.34 | 0.08 | 1.18E-05 | -0.35 | 0.08 | 1.07E-05 | -0.34 | 0.08 | 2.05E-05 | -0.34 | 0.08 | 1.89E-05 | RBP1      | Body       | chr3  |
| cg09327847 | Financial difficulties | -0.23 | 0.05 | 1.18E-05 | -0.22 | 0.05 | 3.79E-05 | -0.23 | 0.05 | 1.82E-05 | -0.22 | 0.05 | 6.07E-05 | PRKCB     | Body       | chr16 |
| cg05700681 | Financial difficulties | -0.31 | 0.07 | 1.22E-05 | -0.30 | 0.07 | 3.58E-05 | -0.31 | 0.07 | 1.37E-05 | -0.30 | 0.07 | 4.11E-05 | CCL22     | 1stExon    | chr16 |
| cg15247069 | Financial difficulties | -0.46 | 0.11 | 1.24E-05 | -0.47 | 0.11 | 1.30E-05 | -0.45 | 0.11 | 2.38E-05 | -0.46 | 0.11 | 2.34E-05 | ICOS      | Body       | chr2  |
| cg02387843 | Financial difficulties | -0.28 | 0.06 | 1.25E-05 | -0.27 | 0.06 | 4.13E-05 | -0.27 | 0.06 | 4.09E-05 | -0.25 | 0.07 | 1.43E-04 | SLC2A9    | Body       | chr4  |
| cg19367172 | Financial difficulties | -0.41 | 0.09 | 1.25E-05 | -0.41 | 0.09 | 9.83E-06 | -0.39 | 0.09 | 3.60E-05 | -0.40 | 0.09 | 2.60E-05 | ST8SIA5   | Body       | chr18 |
| cg05380127 | Financial difficulties | -0.38 | 0.09 | 1.27E-05 | -0.41 | 0.09 | 3.34E-06 | -0.36 | 0.09 | 3.89E-05 | -0.39 | 0.09 | 1.00E-05 | NOTCH4    | Body       | chr6  |
| cg11391828 | Financial difficulties | -0.31 | 0.07 | 1.28E-05 | -0.32 | 0.07 | 1.01E-05 | -0.30 | 0.07 | 4.35E-05 | -0.31 | 0.07 | 3.05E-05 | KCNE4     | TSS1500    | chr2  |
| cg19403178 | Financial difficulties | -0.44 | 0.10 | 1.33E-05 | -0.45 | 0.10 | 1.01E-05 | -0.45 | 0.10 | 1.21E-05 | -0.46 | 0.10 | 9.34E-06 |           | Intergenic | chr1  |
| cg21146652 | Financial difficulties | -0.37 | 0.08 | 1.33E-05 | -0.36 | 0.08 | 2.29E-05 | -0.34 | 0.08 | 6.20E-05 | -0.34 | 0.09 | 9.46E-05 | DGKI      | 3'UTR      | chr7  |
| cg16642360 | Financial difficulties | -0.40 | 0.09 | 1.34E-05 | -0.39 | 0.09 | 2.04E-05 | -0.41 | 0.09 | 1.20E-05 | -0.40 | 0.09 | 2.37E-05 | NOTCH4    | Body       | chr6  |
| cg06501716 | Financial difficulties | -0.21 | 0.05 | 1.34E-05 | -0.19 | 0.05 | 8.51E-05 | -0.20 | 0.05 | 5.69E-05 | -0.18 | 0.05 | 3.75E-04 | C22orf39  | TSS1500    | chr22 |
| cg18490350 | Financial difficulties | -0.44 | 0.10 | 1.34E-05 | -0.43 | 0.10 | 2.21E-05 | -0.42 | 0.10 | 3.72E-05 | -0.41 | 0.10 | 5.89E-05 |           | Intergenic | chr7  |
| cg26950756 | Financial difficulties | -0.33 | 0.08 | 1.35E-05 | -0.32 | 0.08 | 2.65E-05 | -0.30 | 0.08 | 9.95E-05 | -0.29 | 0.08 | 1.89E-04 |           | Intergenic | chr15 |
| cg07217653 | Financial difficulties | -0.23 | 0.05 | 1.38E-05 | -0.23 | 0.05 | 2.71E-05 | -0.24 | 0.05 | 1.30E-05 | -0.23 | 0.05 | 2.72E-05 | LRRK1     | Body       | chr15 |
| cg27109056 | Financial difficulties | -0.26 | 0.06 | 1.43E-05 | -0.26 | 0.06 | 1.54E-05 | -0.24 | 0.06 | 8.60E-05 | -0.24 | 0.06 | 1.13E-04 |           | Intergenic | chr18 |
| cg14971567 | Financial difficulties | -0.47 | 0.11 | 1.44E-05 | -0.46 | 0.11 | 3.14E-05 | -0.49 | 0.11 | 8.23E-06 | -0.48 | 0.11 | 1.74E-05 |           | Intergenic | chr2  |
| cg15498134 | Financial difficulties | -0.26 | 0.06 | 1.45E-05 | -0.24 | 0.06 | 8.21E-05 | -0.26 | 0.06 | 2.66E-05 | -0.23 | 0.06 | 1.67E-04 | RUNX3     | Body       | chr1  |
| cg26963277 | Financial difficulties | -0.42 | 0.10 | 1.47E-05 | -0.32 | 0.09 | 6.54E-04 | -0.43 | 0.10 | 9.47E-06 | -0.33 | 0.09 | 5.00E-04 | KCNQ1OT1  | TSS1500    | chr11 |
| cg08142848 | Financial difficulties | -0.37 | 0.09 | 1.48E-05 | -0.35 | 0.09 | 4.25E-05 | -0.36 | 0.09 | 3.90E-05 | -0.34 | 0.09 | 1.10E-04 | ST3GAL3   | TSS1500    | chr1  |
| _          |                        |       |      |          |       |      |          |       |      |          |       |      |          |           |            |       |

| cg14343017 | Financial difficulties    | -0.32 | 0.07 | 1.48E-05 | -0.30 | 0.07 | 5.69E-05 | -0.35 | 0.07 | 2.88E-06 | -0.33 | 0.07 | 1.17E-05 |         | Intergenic | chr7  |
|------------|---------------------------|-------|------|----------|-------|------|----------|-------|------|----------|-------|------|----------|---------|------------|-------|
| cg10745498 | Financial difficulties    | -0.32 | 0.07 | 1.50E-05 | -0.32 | 0.07 | 1.89E-05 | -0.32 | 0.07 | 1.30E-05 | -0.32 | 0.07 | 1.53E-05 | SNX8    | Body       | chr7  |
| cg00779056 | Financial difficulties    | -0.41 | 0.09 | 1.50E-05 | -0.39 | 0.09 | 3.74E-05 | -0.42 | 0.09 | 1.14E-05 | -0.40 | 0.10 | 3.20E-05 |         | Intergenic | chr16 |
| cg00467296 | Financial difficulties    | -0.30 | 0.07 | 1.51E-05 | -0.29 | 0.07 | 2.22E-05 | -0.27 | 0.07 | 7.59E-05 | -0.27 | 0.07 | 1.34E-04 | OR51A7  | 1stExon    | chr11 |
| cg14731400 | Financial difficulties    | -0.27 | 0.06 | 1.52E-05 | -0.26 | 0.06 | 3.29E-05 | -0.27 | 0.06 | 2.18E-05 | -0.26 | 0.06 | 5.45E-05 |         | Intergenic | chr2  |
| cg24323726 | Financial difficulties    | -0.18 | 0.04 | 1.53E-05 | -0.17 | 0.04 | 6.47E-05 | -0.18 | 0.04 | 1.90E-05 | -0.16 | 0.04 | 8.99E-05 | ZBED2   | TSS200     | chr3  |
| cg26687619 | Financial difficulties    | -0.48 | 0.11 | 1.55E-05 | -0.47 | 0.11 | 2.84E-05 | -0.49 | 0.11 | 9.91E-06 | -0.48 | 0.11 | 1.88E-05 |         | Intergenic | chr8  |
| cg23230362 | Financial difficulties    | -0.40 | 0.09 | 1.56E-05 | -0.40 | 0.09 | 1.67E-05 | -0.39 | 0.09 | 3.18E-05 | -0.39 | 0.09 | 3.22E-05 | PDZD3   | 3'UTR      | chr11 |
| cg06485892 | Financial difficulties    | -0.30 | 0.07 | 1.60E-05 | -0.30 | 0.07 | 2.14E-05 | -0.29 | 0.07 | 4.47E-05 | -0.28 | 0.07 | 6.78E-05 | KHDC1L  | 3'UTR      | chr6  |
| cg03899643 | Financial difficulties    | -0.22 | 0.05 | 1.60E-05 | -0.21 | 0.05 | 4.62E-05 | -0.21 | 0.05 | 3.32E-05 | -0.20 | 0.05 | 1.03E-04 |         | Intergenic | chr1  |
| cg10537176 | Financial difficulties    | -0.30 | 0.07 | 1.60E-05 | -0.29 | 0.07 | 2.84E-05 | -0.26 | 0.07 | 1.77E-04 | -0.25 | 0.07 | 3.71E-04 | GPR39   | Body       | chr2  |
| cg08548559 | Financial difficulties    | -0.41 | 0.09 | 1.62E-05 | -0.36 | 0.09 | 1.36E-04 | -0.37 | 0.09 | 1.00E-04 | -0.32 | 0.09 | 7.29E-04 | PIK3IP1 | Body       | chr22 |
| cg15489422 | Financial difficulties    | -0.47 | 0.11 | 1.65E-05 | -0.46 | 0.11 | 3.41E-05 | -0.49 | 0.11 | 1.17E-05 | -0.48 | 0.11 | 2.57E-05 | TMCC1   | 5'UTR      | chr3  |
| cg08720250 | Financial difficulties    | -0.27 | 0.06 | 1.66E-05 | -0.26 | 0.06 | 2.99E-05 | -0.25 | 0.06 | 7.86E-05 | -0.24 | 0.06 | 1.48E-04 |         | Intergenic | chr12 |
| cg02433979 | Financial difficulties    | -0.30 | 0.07 | 1.67E-05 | -0.29 | 0.07 | 2.90E-05 | -0.29 | 0.07 | 2.66E-05 | -0.28 | 0.07 | 5.90E-05 |         | Intergenic | chr7  |
| cg04875821 | Financial difficulties    | -0.31 | 0.07 | 1.70E-05 | -0.30 | 0.07 | 3.59E-05 | -0.32 | 0.07 | 1.15E-05 | -0.31 | 0.07 | 2.31E-05 |         | Intergenic | chr15 |
| cg17173767 | Financial difficulties    | 0.37  | 0.08 | 1.76E-05 | 0.37  | 0.09 | 1.71E-05 | 0.35  | 0.09 | 5.96E-05 | 0.35  | 0.09 | 4.52E-05 | C8orf84 | 1stExon    | chr8  |
| cg00811166 | Financial difficulties    | -0.47 | 0.11 | 1.76E-05 | -0.47 | 0.11 | 2.21E-05 | -0.50 | 0.11 | 7.09E-06 | -0.50 | 0.11 | 9.86E-06 | TERT    | Body       | chr5  |
| cg09589308 | Financial difficulties    | -0.31 | 0.07 | 1.76E-05 | -0.30 | 0.07 | 3.58E-05 | -0.27 | 0.07 | 1.63E-04 | -0.26 | 0.07 | 3.14E-04 | KCNH8   | Body       | chr3  |
| cg16640008 | Financial difficulties    | -0.30 | 0.07 | 1.77E-05 | -0.28 | 0.07 | 7.11E-05 | -0.31 | 0.07 | 1.52E-05 | -0.29 | 0.07 | 6.85E-05 |         | Intergenic | chr6  |
| cg25930161 | Financial difficulties    | -0.39 | 0.09 | 1.77E-05 | -0.38 | 0.09 | 2.95E-05 | -0.40 | 0.09 | 1.50E-05 | -0.38 | 0.09 | 3.16E-05 | ADAMTS2 | Body       | chr5  |
| cg04688596 | Financial difficulties    | -0.32 | 0.07 | 1.80E-05 | -0.32 | 0.07 | 1.46E-05 | -0.32 | 0.07 | 1.90E-05 | -0.32 | 0.07 | 1.88E-05 | FBN3    | Body       | chr19 |
| cg02674639 | Financial difficulties    | -0.26 | 0.06 | 1.81E-05 | -0.25 | 0.06 | 4.15E-05 | -0.24 | 0.06 | 9.62E-05 | -0.23 | 0.06 | 2.08E-04 | WASF3   | 5'UTR      | chr13 |
| cg13362105 | Occupational trajectories | -0.61 | 0.11 | 5.52E-08 | -0.61 | 0.11 | 8.61E-08 | -0.62 | 0.11 | 4.66E-08 | -0.61 | 0.11 | 6.56E-08 | BBS9    | TSS200     | chr7  |
| cg11722699 | Occupational trajectories | 0.43  | 0.08 | 1.34E-07 | 0.41  | 0.08 | 3.47E-07 | 0.43  | 0.08 | 1.16E-07 | 0.42  | 0.08 | 3.08E-07 | DSC3    | TSS200     | chr18 |
| cg14089425 | Occupational trajectories | -0.45 | 0.09 | 3.74E-07 | -0.46 | 0.09 | 3.37E-07 | -0.46 | 0.09 | 2.96E-07 | -0.46 | 0.09 | 2.53E-07 | KCNQ1   | Body       | chr11 |
| cg27431274 | Occupational trajectories | -0.43 | 0.09 | 4.84E-07 | -0.42 | 0.09 | 8.76E-07 | -0.43 | 0.08 | 4.25E-07 | -0.42 | 0.08 | 8.09E-07 | BTBD11  | Body       | chr12 |
| cg06881239 | Occupational trajectories | -0.42 | 0.08 | 5.50E-07 | -0.42 | 0.08 | 6.62E-07 | -0.41 | 0.08 | 6.71E-07 | -0.41 | 0.08 | 8.00E-07 | PIRT    | TSS200     | chr17 |
| cg06803821 | Occupational trajectories | -0.57 | 0.11 | 6.68E-07 | -0.58 | 0.11 | 6.61E-07 | -0.57 | 0.11 | 9.09E-07 | -0.57 | 0.11 | 9.51E-07 |         | Intergenic | chr16 |

SEP, Indicator of socioeconomic position; CMD: cardiometabolic disorders (obesity, diabetes, hypertension, coronary heart disease); HB, health behaviors (smoking, sedentary behavior, hazardous alcohol intake)

<sup>&</sup>lt;sup>a</sup> Linear regression models for the association between life-course SEP indicators (predictor, lowest versus highest) and methylation of CpG markers (outcome), adjusted for sex, age, seasonality of blood collection, PBMC composition, and chip (BH significance threshold)

<sup>&</sup>lt;sup>b</sup> Linear regression models for the association between life-course SEP indicators (predictor, lowest versus highest) and methylation of CpG markers (outcome), additionally adjusted for health behaviors Statistical significance was set according to Benjamini-Hochberg threshold

<sup>&</sup>lt;sup>c</sup> Linear regression models for the association between life-course SEP indicators (predictor, lowest versus highest) and methylation of CpG markers (outcome), additionally adjusted for cardiometabolic disorders Statistical significance was set according to Benjamini-Hochberg threshold

<sup>&</sup>lt;sup>d</sup> Linear regression models for the association between life-course SEP indicators (predictor, lowest versus highest) and methylation of CpG markers (outcome), additionally adjusted for health behaviors and cardiometabolic disorders Statistical significance was set according to Benjamini-Hochberg threshold

e P-values displayed in bold indicate a significant association (Benjamini-Hochberg) in the model additionally adjusted for health behaviors and/or cardiometabolic disorders

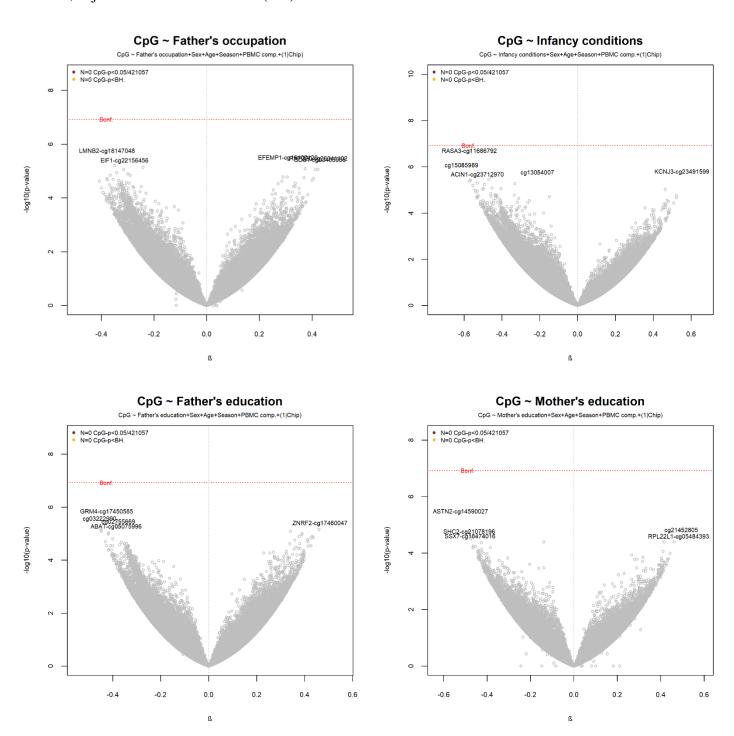
<sup>&</sup>lt;sup>f</sup> Intragenic regions: UTR, Untranslated region (intron); TSS200, Distance (i.e. 200 bp) to Transcription Start Site (promoter); Body, Gene body (exon). Intergenic regions: CpG is not located within a known gene

Table 3: Top 30 Gene ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) pathways identified based on CpG markers associated with life-course SEP indicators (N=161, Table 1)

| GO         | Ontology | GO pathway                                       | GO P-value | KEGG     | KEGG pathway  | KEGG P-Value |
|------------|----------|--|------------|----------|---|--------------|
| GO:0046959 | BP       | habituation                                      | < 0.001    | hsa00563 | Glycosylphosphatidylinositol (GPI)-anchor biosynthesis        | 0.010        |
| GO:0030506 | MF       | ankyrin binding                                  | < 0.001    | hsa05200 | Pathways in cancer  | 0.017        |
|            |          | regulation of atrial cardiac muscle cell         |            |          | ·   |              |
| GO:0060372 | BP       | membrane repolarization                          | < 0.001    | hsa05340 | Primary immunodeficiency                                      | 0.022        |
|            |          | positive regulation of intracellular signal      |            |          |   |              |
| GO:1902533 | BP       | transduction                                     | < 0.001    | hsa05231 | Choline metabolism in cancer                                  | 0.023        |
| GO:0016192 | BP       | vesicle-mediated transport                       | < 0.001    | hsa04672 | Intestinal immune network for IgA production                  | 0.037        |
| GO:0005886 | CC       | plasma membrane                                  | < 0.001    | hsa04015 | Rap1 signaling pathway  | 0.041        |
| GO:0005887 | CC       | integral component of plasma membrane            | 0.001      | hsa00740 | Riboflavin metabolism   | 0.048        |
| GO:0016528 | CC       | sarcoplasm                                       | 0.001      | hsa04514 | Cell adhesion molecules (CAMs)                                | 0.061        |
| GO:0086014 | BP       | atrial cardiac muscle cell action potential      | 0.001      | hsa05221 | Acute myeloid leukemia  | 0.062        |
| GO:0031639 | BP       | plasminogen activation                           | 0.002      | hsa05223 | Non-small cell lung cancer                                    | 0.062        |
| GO:0045766 | BP       | positive regulation of angiogenesis              | 0.002      | hsa04971 | Gastric acid secretion  | 0.078        |
|            |          | membrane repolarization during ventricular       |            |          |   |              |
| GO:0098915 | BP       | cardiac muscle cell action potential             | 0.002      | hsa00533 | Glycosaminoglycan biosynthesis - keratan sulfate              | 0.083        |
| GO:0003779 | MF       | actin binding                                    | 0.003      | hsa04610 | Complement and coagulation cascades                           | 0.085        |
| GO:0045599 | BP       | negative regulation of fat cell differentiation  | 0.004      | hsa00604 | Glycosphingolipid biosynthesis - ganglio series               | 0.088        |
| GO:0030247 | MF       | polysaccharide binding                           | 0.004      | hsa00730 | Thiamine metabolism   | 0.094        |
|            |          | positive regulation of histone H3-K4             |            |          |   |              |
| GO:0051571 | BP       | methylation                                      | 0.004      | hsa05202 | Transcriptional misregulation in cancer                       | 0.107        |
| GO:0086005 | BP       | ventricular cardiac muscle cell action potential | 0.004      | hsa04060 | Cytokine-cytokine receptor interaction                        | 0.108        |
| GO:0030902 | BP       | hindbrain development                            | 0.004      | hsa00770 | Pantothenate and CoA biosynthesis                             | 0.111        |
| GO:0042730 | BP       | fibrinolysis                                     | 0.005      | hsa04062 | Chemokine signaling pathway                                   | 0.111        |
| GO:0043034 | CC       | costamere  | 0.005      | hsa04666 | Fc gamma R-mediated phagocytosis                              | 0.112        |
| GO:0043113 | BP       | receptor clustering                              | 0.005      | hsa04070 | Phosphatidylinositol signaling system                         | 0.124        |
| GO:0097503 | BP       | sialylation                                      | 0.005      | hsa04061 | Viral protein interaction with cytokine and cytokine receptor | 0.126        |
| GO:0044325 | MF       | ion channel binding                              | 0.006      | hsa00514 | Other types of O-glycan biosynthesis                          | 0.127        |
|            |          | N-acetylglucosaminylphosphatidylinositol         |            |          |   |              |
| GO:0000225 | MF       | deacetylase activity                             | 0.006      | hsa04972 | Pancreatic secretion  | 0.13         |
|            |          | positive regulation of histone H3-K36            |            |          |   |              |
| GO:0000416 | BP       | methylation                                      | 0.006      | hsa00515 | Mannose type O-glycan biosynthesis                            | 0.132        |
| GO:0002517 | BP       | T cell tolerance induction                       | 0.006      | hsa03060 | Protein export  | 0.132        |
|            |          | N-acetyllactosaminide alpha-2,3-                 |            |          |   |              |
| GO:0008118 | MF       | sialyltransferase activity                       | 0.006      | hsa00790 | Folate biosynthesis   | 0.148        |
| GO:0019778 | MF       | Atg12 activating enzyme activity                 | 0.006      | hsa04670 | Leukocyte transendothelial migration                          | 0.151        |
| GO:0021508 | BP       | floor plate formation                            | 0.006      | hsa04725 | Cholinergic synapse   | 0.151        |
| GO:0022616 | BP       | DNA strand elongation                            | 0.006      | hsa00601 | Glycosphingolipid biosynthesis - lacto and neolacto series    | 0.154        |

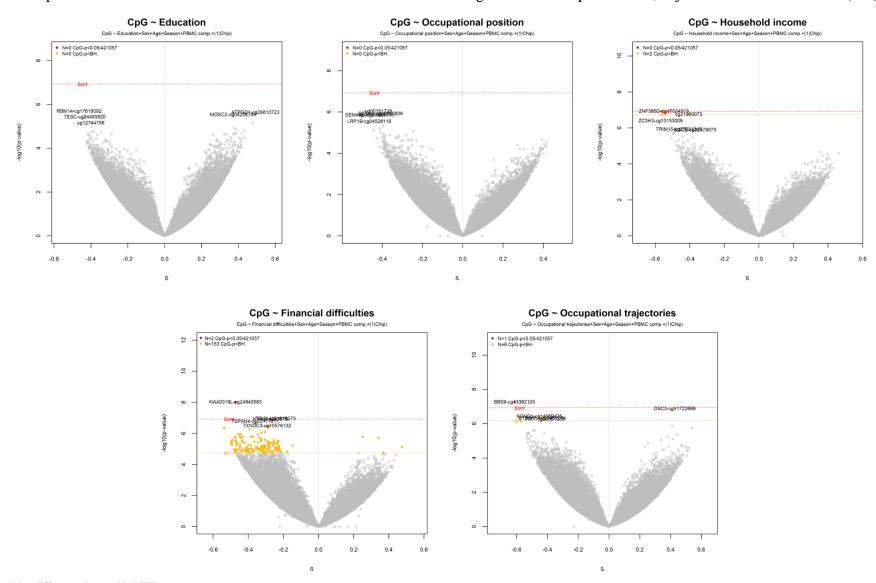
BP, Biological process; CC, Cellular component; MF, Molecular Function <sup>a</sup> Significance threshold was set at P-value <0.05

**Figure 1:** Funnel plots for the associations between early-life SEP indicators and genome-wide CpG markers, adjusted for main covariates (M1)



Beta, mean methylation difference (low vs. high SEP)
Linear regression model for the association between early-life SEP indicators (predictor, lowest versus highest) and methylation of CpG markers (outcome), adjusted for sex, age, seasonality of blood collection, PBMC composition, and chip (random effect variable)

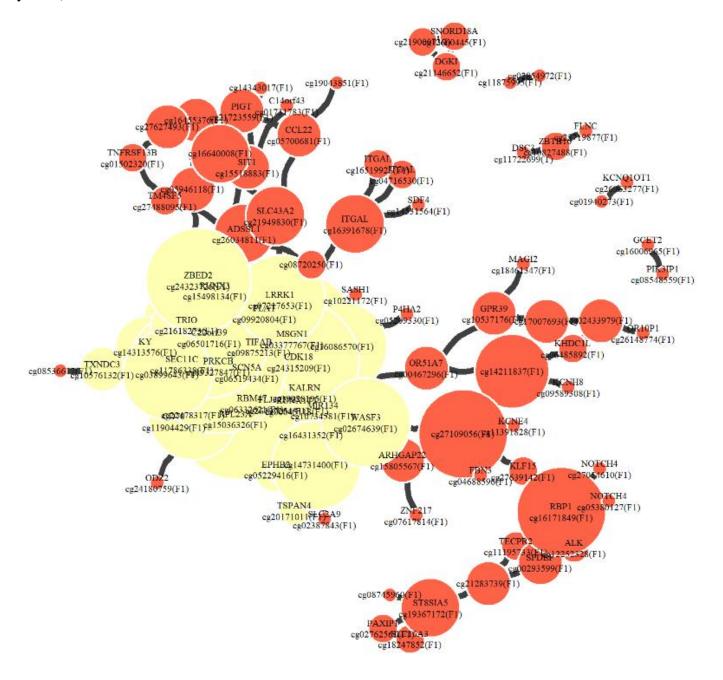
Figure 2: Funnel plots for the associations between SEP indicators in adulthood and genome-wide CpG markers, adjusted for main covariates (M1)



Beta, mean methylation difference (low vs. high SEP)

Linear regression model for the association between SEP indicators in adulthood (predictor, lowest versus highest) and methylation of CpG markers (outcome), adjusted for sex, age, seasonality of blood collection, PBMC composition, and chip (random effect variable)

**Figure 3:** Network of interrelated CpG markers associated with at least one indicator of SEP, and related to at least one other CpG, displayed according to clusters (Cluster 1: N=62 CpGs – red; Cluster 2: N=29 – yellow).



(FO); father's occupation; (IC), infancy conditions; (FE), father's education; (ME), mother's education; (E), participant's education, (O), occupational position in adulthood; (I), Household income; (F1), Financial difficulties; (T), Occupational trajectories

CpGs were identified from linear regression models for the association between SEP indicators (predictor, lowest versus highest) and methylation of CpG markers (outcome), adjusted for sex, age, seasonality of blood collection, PBMC composition, chip (random effect variable)

Of the 161 significantly associated CpGs (Table 1), only CpGs that were associated with at least one other CpG (N=91) were included in the network. Each circle represents a CpG, whereby the size of the circle is related to the centrality of the CpG; the bigger the circle, the more relations to other CpGs there are.

**Supplementary Table 1:** Fisher's exact test for the association between CpG methylation status and SEP indicators

|                  | Financial difficulties | Household income | Occupational trajectories |
|------------------|------------------------|------------------|---------------------------|
| Hypermethylation | 4                      | 0                | 1                         |
| Hypomethylation  | 149                    | 2                | 5                         |

Fisher's test p=0.2275

**Supplementary Table 2:** Fisher's exact test for the association between CpG methylation status and CpG location (detailed)

| _                | 1stExon | 3'UTR | 5'UTR | Body | Intergenic | TSS |
|------------------|---------|-------|-------|------|------------|-----|
| Hypermethylation | 1       | 0     | 1     | 1    | 0          | 2   |
| Hypomethylation  | 6       | 5     | 10    | 72   | 41         | 22  |

Fisher's test p=0.063

**Supplementary Table 3:** Fisher's exact test for the association between CpG methylation status and CpG location (grouped)

|                  | Intergenic | Intragenic |
|------------------|------------|------------|
| Hypermethylation | 0          | 5          |
| Hypomethylation  | 41         | 115        |

Fisher's test p=0.330

**Supplementary Table 4:** Fisher's exact test for the association between SEP indicators CpG location (detailed)

|                           | 1stExon | 3'UTR | 5'UTR | Body | Intergenic | TSS |
|---------------------------|---------|-------|-------|------|------------|-----|
| Financial difficulties    | 7       | 5     | 11    | 70   | 39         | 21  |
| Household income          | 0       | 0     | 0     | 1    | 1          | 0   |
| Occupational trajectories | 0       | 0     | 0     | 2    | 1          | 3   |

Fisher's test p=0.6641

**Supplementary Table 5:** Fisher's exact test for the association between SEP indicators CpG location (grouped)

|                           | Intergenic | Intragenic |
|---------------------------|------------|------------|
| Financial difficulties    | 39         | 114        |
| Household income          | 1          | 1          |
| Occupational trajectories | 1          | 5          |

Fisher's test p=0.634

**Supplementary Table 6:** Fisher's exact test for the association between network-identified clusters and CpG methylation status

|           | Hypermethylation | Hypomethylation |
|-----------|------------------|-----------------|
| Cluster 1 | 2                | 60              |
| Cluster 2 | 0                | 29              |

Fisher's test p=1

**Supplementary Table 7:** Fisher's exact test for the association between network-identified clusters and SEP indicators

|           | Financial difficulties | Household income | Occupational trajectories |
|-----------|------------------------|------------------|---------------------------|
| Cluster 1 | 60                     | 1                | 1                         |
| Cluster 2 | 29                     | 0                | 0                         |

Fisher's test p=0.1

**Supplementary Table 8:** Fisher's exact test for the association between network-identified clusters and CpG location (detailed)

| - <b>F</b> | 1stExon | 3'UTR | 5'UTR | Body | Intergenic | TSS |
|------------|---------|-------|-------|------|------------|-----|
| Cluster 1  | 4       | 3     | 2     | 28   | 18         | 7   |
| Cluster 2  | 0       | 0     | 3     | 14   | 5          | 7   |

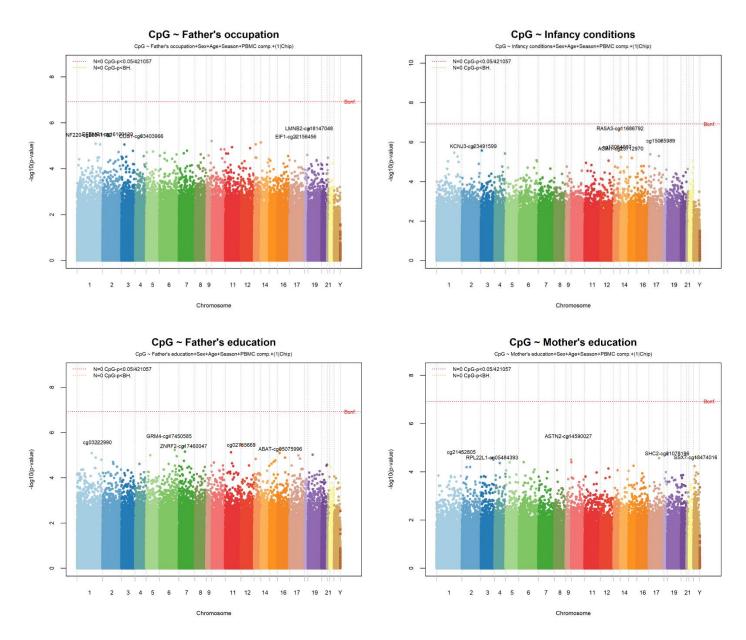
Fisher's test p=0.159

**Supplementary Table 9:**  $\chi^2$  test for the association between network-identified clusters and CpG location (grouped)

|           | Intragenic | Intergenic |
|-----------|------------|------------|
| Cluster 1 | 44         | 18         |
| Cluster 2 | 24         | 5          |

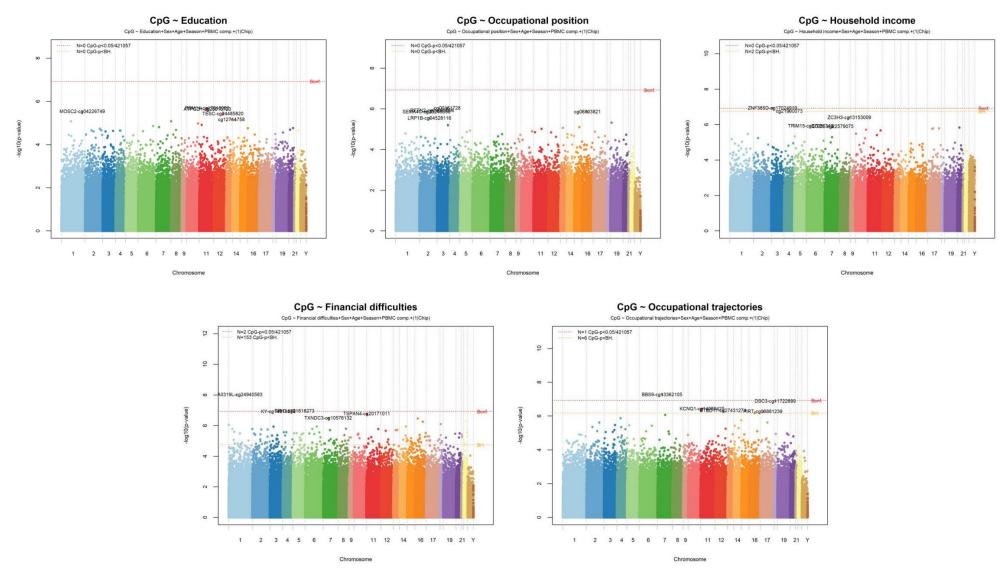
Fisher's test p=0.303

**Supplementary Figure 1:** Manhattan plots for the associations between early-life SEP indicators and genome-wide CpG markers, adjusted for main covariates (M1)



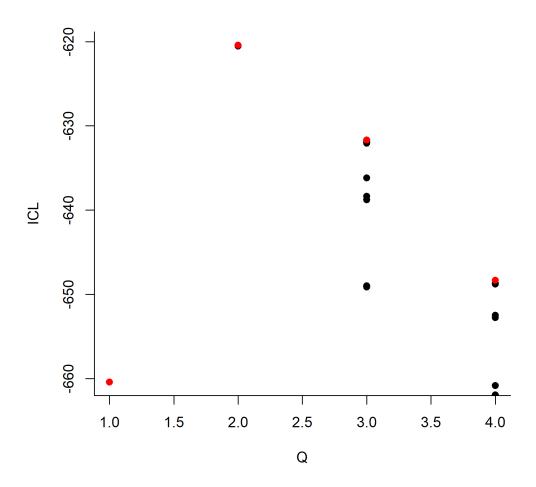
Linear regression model for the association between SEP indicators in early-life (predictor, lowest versus highest) and methylation of CpG markers (outcome), adjusted for sex, age, seasonality of blood collection, PBMC composition, and chip (random effect variable)

**Supplementary Figure 2:** Manhattan plots for the associations between SEP indicators in adulthood and genome-wide CpG markers, adjusted for main covariates (M1)



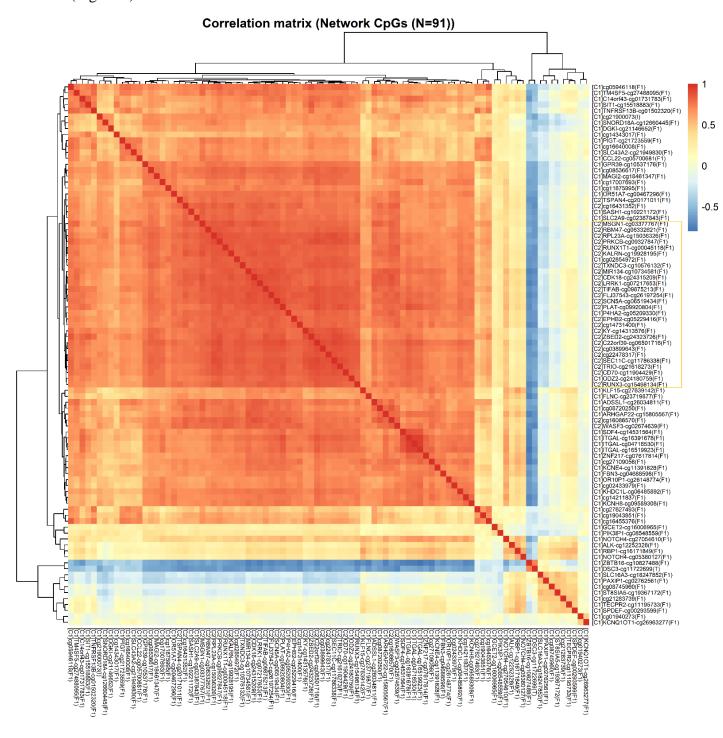
Linear regression model for the association between SEP indicators in adulthood (predictor, lowest versus highest) and methylation of CpG markers, adjusted for sex, age, seasonality of blood collection, PBMC composition, and chip (random effect variable)

**Supplementary Figure 3**: ICL criterion plot for the determination of the number of clusters (Q) based on SEP-related CpG markers (Table 2). The optimal number of clusters Q is determined by the maximum ICL value (Q=2)



ICL, Integrated Completed Likelihood Optimal number of clusters Q is determined by the maximum ICL value

# **Supplementary Figure 4:** Correlation heatmap of 91SEP-related CpGs included in the partial correlation network (Figure 3)



 $[C1], Cluster\ 1; [C2], Cluster\ 2\ (legend-yellow\ square)$ 

(FO); father's occupation; (IC), infancy conditions; (FE), father's education; (ME), mother's education; (E), participant's education, (O), occupational position in adulthood; (I), Household income; (F1), Financial difficulties; (T), Occupational trajectories

Of the 161 SEP-related CpGs (Table 1), only CpGs that were associated with at least one other CpGs (N=91) were included in the network and the correlation heatmap.

#### Annex I: Reporting and grouping life-course SEP indicators

# **Early-life SEP indicators (self-reported)**

There were 10 suggested categories for father's occupational position that were subsequently grouped into three categories: "High" (superior manager, liberal professions, CEO-director, professor), "Middle" (qualified non-manual worker, middle-level executive, self-employed worker (craftsman/trade)), "Low" (unqualified manual worker, qualified manual worker, farmer, unqualified non-manual worker). Mother and father's education were available in 10 suggested categories that were classified into three groups: "High" (university education superior education (+3 years after high school − "maturité")), "Middle" (high school − "maturité", education preparing for a profession: apprenticeship − "CFC"), "Low" (mandatory education, trade school diploma). Material and financial condition in infancy inquired about whether participants had or benefited from the following items/activities during their childhood: car, TV, a domestic worker, dishwasher, telephone, enough heat at home, participating to a social or cultural association, leaving home during annual vacation, home ownership. Owing ≥7 items was classified as "High", 4-6 items was classified as "Middle", and ≤3 items was classified as "Low" infancy conditions.

#### **SEP** indicators in adulthood and trajectories (self-reported)

Own last known occupational position was self-reported and further classified into three categories: "High" (managers: liberal professions, directors and professors), "Middle" (lower level executives: teachers, qualified technicians, and nurses), "Low" (low qualified non-manuals and manuals: sales-assistants, clerks and manual workers). Own education was defined in the same way as father's and mother's education. Financial difficulties inquired whether the participant would face difficulties paying food, rent, charges, insurance, loans throughout the month, and was classified as following: "No difficulties" ("This has never happened"), "Average difficulties" ("Not currently, but this has happened in the past), "Important difficulties" ("This has happened in the recent past"). Occupational trajectories across the life-course were classified as following: "Stable high" (high father's occupation and high own occupation), "Upward" (low father's occupation and middle/high own occupation, or middle father's occupation and high own occupation), "Stable middle" (middle father's occupation, or middle father's occupation and low own occupation), "Stable low" (low father's occupation and low own occupation).

**Annex II:** Reporting and grouping health behaviors and history of cardiometabolic disorders

### **Health behaviors (self-reported)**

Smoking status was categorized as current and non-current smokers, the latter category including former smokers. Alcohol intake was measured using questions on the number of alcoholic drinks usually consumed within a week and categorized as hazardous drinking (>3 daily alcoholic drinks for men; >2 daily alcoholic drinks for women) versus non-hazardous drinking. Physical activity was reported on a scale from 1 to 10, 1 corresponding to a complete sedentary lifestyle and 10 corresponding to manual work combined with sports practice. Based on this scale, three categories were subsequently defined: "Low" (1–4), "Middle" (5), and "High" (6–10).

#### Cardiometabolic disorders

Obesity status was defined as having a BMI≥30 kg/m² at clinical visit. Hypertension was based on self-reported hypertension, self-reported use of anti-hypertensive drugs, or having a systolic blood pressure ≥140mmHg *and* a diastolic blood pressure ≥90mmHg at clinical visit. Diabetes was based on self-reported diabetes, self-reported use of anti-diabetic drugs, having a blood sugar ≥7mmol/L at clinical visit, or having a glycated hemoglobin ≥6.5% (fasting conditions). Coronary heart disease was based on self-reporting a history of myocardial infarction, angina, or ischemic artery disease.

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# **General discussion**

#### **Summary of main results**

The main objective of this thesis was to investigate the role of multiple intermediate factors and biological processes underlying the life-course socioeconomic gradient in cardiometabolic disorders (CMD). In the first study, we systematically examined all previous research assessing the role of health behaviors to socioeconomic differences in cardiometabolic disorders and all-cause mortality, and found that this contribution varied according to social, economic, and cultural factors. Then, we explored the role of sleep duration as another mechanism underlying the life-course socioeconomic gradient in cardiovascular outcomes using multi-cohort data on 111'205 individuals, and found that excessively short sleep meaningfully contributed to this relationship. Finally, we examined the relationship between life-course socioeconomic position (SEP) and DNA methylation as an underexplored molecular mechanisms through which the social environment "gets embedded" under the skin, and found that adverse socioeconomic conditions in adulthood lead to a differential methylation of markers involved in immune, inflammatory, and cancer-related processes.

#### **Comparison to the literature**

In chapter 1, we performed a systematic review of the literature investigating the contribution of health behaviors to socioeconomic differences in all-cause mortality and cardiometabolic disorders. The purpose of this research was to provide a comprehensive synthesis on the role of health behaviors and to identify the factors determining the differential contribution of health behaviors in given contexts [1]. Overall, we observed a strong socioeconomic gradient in health outcomes across the included articles, whereby adverse socioeconomic circumstances were consistently associated with an increased risk of cardiometabolic disorders and all-cause mortality. Furthermore, we found that the contribution of health

behaviors to this association varied according to geographic regions, demographic characteristics of included participants, the type of health behaviors and outcomes, and study characteristics. We identified three major explanations for the differential contribution of health behaviors. First, the differential social patterning of health behaviors accounts for the most important determinants of the heterogeneous contribution of health behaviors, and is strongly related to the epidemiologic transition of cardiometabolic disorders and associated risk factors, shifting from the higher towards the lower socioeconomic groups [2, 3]. According to this model, this transition has started at different periods and has progressed at a different pace across geographic regions and for men and women, eventually yielding different socioeconomic gradients in health behaviors and cardiometabolic diseases [1-4]. Second, we found that *physiological factors* may also determine the differential contribution of health behaviors, whereby certain behaviors explain a greater proportion of the socioeconomic gradient as they are causally more related to a given health outcome (i.e. smoking and cardiovascular diseases, dietary patterns and obesity) [5, 6]. Third, the methodological characteristics of included studies can also explain the heterogeneous contribution of health behaviors across included articles, whereby a repeated assessment of health behaviors was generally found to explain a greater proportion of the socioeconomic gradient in cardiometabolic disorders, as in longitudinal studies [7]. In summary, this study systematically examined all previous research addressing the role of health behaviors to the socioeconomic differences in cardiometabolic disorders and all-cause mortality, and provided a comprehensive synthesis on the factors and mechanisms influencing the contribution of health behaviors to this gradient.

In chapter 2, we investigated the role of sleep duration in the association between life-course socioeconomic position and cardiovascular outcomes, using data from eight European

cohorts. The objective of this study was to assess the contribution of sleep duration as an additional intermediate factor to the life-course socioeconomic gradient, as poor sleep was found to be driven by adverse socioeconomic circumstances, but also to be strongly associated with cardiometabolic disorders [8-10]. In line with previous research, we found a strong life-course socioeconomic gradient in coronary heart disease (CHD), whereby adverse socioeconomic circumstances in early-life and in adulthood were associated with an increased cardiovascular risk [1]. We also observed a meaningful association between low socioeconomic position across the life-course and abnormal sleeping patterns. These results are explained by the socioeconomic patterning of sleep duration, and are consistent with previous research showing that disadvantaged individuals experience greater sleep problems due to adverse early-life experiences, shift work, financial and material difficulties, and chronic stress [8, 9, 11]. Furthermore, we found an association between abnormal sleeping patterns and an increased risk of coronary heart disease and stroke, with short sleep being a stronger risk factor for coronary heart disease than excessively long sleep. This relation has been systematically reported by previous experimental and clinical studies, whereby sleep deprivation was found to disrupt key physiological processes often resulting in a higher cardiovascular risk, whereas long sleep was generally found to occur as a consequence of preexisting disorders [10, 12]. Finally, we found that short sleep duration significantly contributed to the associations between life-course socioeconomic position and coronary heart disease, explaining up to 13% of the gradient. In summary, this study showed a meaningful contribution of sleep to the life-course socioeconomic gradient in cardiovascular disorders, further contributing to the understanding of intermediate mechanisms underlying the socioeconomic gradient in cardiometabolic disorders.

In chapter 3, we explored the relation between life-course SEP and the differential methylation of genome-wide CpG markers. The purpose of this study was to explore the effect of adverse socioeconomic circumstances on subclinical, "inner layer" biological processes (Figure 2 – Introduction), and to investigate how these modifications potentially translate into a higher disease risk. We found that low SEP in adulthood was associated with a decreased methylation (hypomethylation) of a large number of genome-wide CpGs (N=161), in line with previous research [13, 14]. Socioeconomic factors in early life were conversely not associated with the differential methylation of CpG markers. These results may be related to a smaller effect size between early-life SEP and DNA methylation in adulthood, due to a biased, retrospective self-reporting of childhood SEP [13, 15]. Furthermore, we found that a substantial proportion of the association between socioeconomic position and CpG methylation was explained by variations in health behaviors and/or cardiometabolic disorders, with only 33 out of 161 CpGs (20%) being related to SEP independently from health behaviors and cardiometabolic disorders. Furthermore, we found that the identified CpGs were involved in immune and inflammation-related processes, which is consistent with former findings, as adverse socioeconomic circumstances have been previously related to immune-related CpG markers and aberrant inflammation, eventually leading to the occurrence of serious chronic illnesses such as diabetes, heart disease, and cancer [16-19]. In summary, this study showed that adverse socioeconomic circumstances are strongly related to a modified epigenetic signature of markers involved in immune and inflammatory pathways; however, further investigations are required to determine the exact physiological effects of these alterations.

#### Strengths and limitations

The studies presented in this thesis have several strengths. Overall, the systematic review, the multi-cohort counterfactual mediation analysis, and the epigenome-wide analysis applied innovative methodological approaches to examine central yet poorly described mechanisms underlying the socioeconomic gradient in cardiometabolic disorders. First, in the systematic review, we examined all previously published articles and synthesized their findings according to specifically defined procedures, which allowed us to identify major mechanisms driving the differential contribution of health behaviors [20, 21]. Second, we used a very large multi-cohort sample to assess the contribution of sleep as an additional, unexplored mechanism underlying the life-course socioeconomic gradient in cardiovascular disorders. The large sample size of this study ensured adequate statistical power to detect small samplesize associations, and to account for the effect of many potential confounders. Third, the multi-cohort study used a relatively novel statistical procedure, the counterfactual mediation method, which provides a less biased assessment of the contribution of a given mediator [22]. Fourth, we applied a life-course approach in this thesis, which allowed us to account for the effect of socioeconomic circumstances across different life phases on intermediate mechanisms and health-related outcomes in later life [23]. Finally, the major strength of the DNA methylation analysis was the genome-wide approach, which examined life-course SEPinduced differential methylation across the *entire* genome (hence using an exploratory hypothesis-generating approach), potentially unraveling unknown biological processes of the social embedding.

However, these studies also have important limitations to acknowledge. First, the articles included in the systematic review displayed important differences in terms of sociodemographic characteristics of study participants, study periods, potential confounders,

and the assessment methods of SEP, health behaviors, and health-related outcomes, which considerably limited between-study comparisons and precluded the statistical integration of results through a meta-analysis [24, 25]. An additional limitation related to the systematic review is the use of the difference method to estimate the contribution of health behaviors across included articles, as this approach does not account for all the possible confounding and interactions between the exposure, the mediators, and the outcomes, eventually yielding biased mediation estimates [22].

Another major limitation is related to the overall cross-sectional nature of the studies presented in chapters 2 and 3, which prevents establishing a cause-to-effect relationship and allows for the possibility of reverse causality. In particular, former research has reported that the relation between sleep duration and cardiovascular disorders was not exclusively unidirectional, whereby pre-existing health problems may also lead to sleep disturbances in some contexts [12]. Nevertheless, we managed to address this issue by using indicators of SEP in early-life, and by performing a longitudinal analysis in the Whitehall II study, showing temporal cause-to-effect relationships between low SEP and short sleep duration, between low SEP and a higher incidence of coronary heart disease, and between short sleep duration and an increased CHD risk. Moreover, while we identified a large number of SEP-related CpG markers involved in inflammatory pathways in chapter 3, we could not determine whether these CpGs lead to abnormal inflammation, or if they occurred as a consequence of pre-existing inflammatory processes [26].

The use of self-reported data in chapters 2 and 3 represents another important limitation in this thesis. In the multi-cohort analysis examining the contribution of sleep duration, the majority of cohorts used self-reported data on SEP in adulthood and cardiovascular disorders, whereas the remaining factors (early-life SEP, sleep duration, confounding factors) were

exclusively self-reported by study participants. Such an extensive use of self-reported data may represent an important issue in terms of recall bias and other types of systematic errors, yielding distorted associations between SEP, sleep duration and cardiovascular disorders [27, 28]. Moreover, we also observed that none of the SEP indicators in childhood were associated with a differential methylation of CpG markers, which may be related to a biased recall of socioeconomic circumstances in early life, as suggested by former research [15].

Finally, the small sample size used in the epigenome-wide analysis represents a further limitation, as it restricts the ability to detect small effect-size associations occurring between self-reported SEP and differential CpG methylation [26].

## **Conclusion and future perspectives**

The studies included in this thesis have provided comprehensive answers and a novel insight on the role of intermediate mechanisms and biological processes underlying the life-course socioeconomic gradient in cardiometabolic disorders. However, this thesis has also yielded several important questions.

First, even though the *individual* role of intermediate mechanisms such as health behaviors, psychosocial stressors, sleep, and other factors, has been examined, evidence is lacking for the *overall* contribution of these factors to the life-course socioeconomic gradient in cardiometabolic disorders. One of the main reasons for this gap is the lack of understanding of the causal relations and interactions existing between these intermediate factors, which need to be specifically defined and accounted for in statistical models assessing the contribution of multiple mediators [29]. Moreover, a global understanding of the socioeconomic differences in cardiometabolic disorders also calls for a more systematic use of the life-course approach, whereby the role of socioeconomic circumstances across

different life phases shall be examined in the light of the causal models defined by life-course epidemiology (accumulation, critical periods, and chains of risk models) [23]. Nevertheless, conducting research combining the life-course approach along with the contribution of multiple mediators represents a major challenge in practice, as the statistical and causal inference tools allowing these analyses generally require strong assumptions, and have not been fully developed to this date [29, 30].

Furthermore, while we found that most of the SEP-related CpG markers are located within genes involved in inflammation, the exact exposures driving differential DNA methylation, and the physiological consequences of these alterations are unknown [26]. Former investigations conducted in animal models have suggested that an inferior rank in the social hierarchy affects the methylation and the expression of stress-related and pro-inflammatory genes, which in turn "prepare" the body to threat and potential injuries, but have detrimental effects on cardiovascular outcomes on the long term [31-33]. However, it remains to be determined to what extent such biological processes operate in response to adverse socioeconomic circumstances in humans, what are the exact exposures (i.e. psychosocial factors, environmental exposures) and the physiological mechanisms driving the differential DNA methylation, and how these alterations eventually translate into a higher cardiometabolic disease risk in later life. Related to the above, future epidemiologic research shall also aim for a more integrative approach of the SEP-related biological pathways (i.e. amygdala activity, HPA-axis, DNA methylation, inflammation), examining the mutual interactions between these processes, and their global role in the occurrence of cardiometabolic disorders [34].

#### Implications for public health

In addition to a more comprehensive understanding of the mechanisms underlying the socioeconomic gradient in cardiometabolic disorders, our findings may also have important implications for public health policies aimed at reducing these inequalities.

The results obtained in our systematic review showed a major contribution of health behaviors in shaping the relation between socioeconomic factors and cardiometabolic disorders. Throughout the second half of the twentieth century, the prevalence of cardiometabolic disorders and unhealthy behaviors (i.e. smoking, physical inactivity, consumption of highly-processed foods) has been steadily decreasing in the higher socioeconomic groups, while simultaneously increasing in more disadvantaged people in high-income countries [4, 35, 36]. As addressed in the introduction, this transition resulted from major economic development occurring in the post-war Western societies, whereby products such as tobacco, sugar, or processed foods became widely available, but also due to social phenomena, including a better response to public health messages by the higher socioeconomic groups [4, 37, 38]. Additionally, other factors further contributed to a greater prevalence of unhealthy behaviors in the lower socioeconomic groups, such as deprived neighborhoods offering few or no opportunities for a healthy lifestyle [35, 39]. Overall, these observations suggest that smoking, inadequate diet, physical inactivity, or other unhealthy "behaviors" are widely driven by the circumstances in which people are born, grow, live, and die, rather than entirely resulting from personal choices [35, 37]. In order to reduce the burden of cardiometabolic disorders, structural rather than agentic public health policies targeting unhealthy behaviors shall be implemented [37]. Indeed, former research has shown that agentic interventions encouraging individuals to adopt a healthier life-style were generally more efficient in the higher socioeconomic groups, due to greater resources,

knowledge or discernment capacity, eventually leading to an even higher socioeconomic gradient in cardiometabolic disorders [37, 40, 41]. On the other hand, structural policies such as raising tobacco prices, smoking bans in public spaces, trans-fat bans, and taxation of soft drinks, were generally found to benefit *all* socioeconomic groups, and particularly the more disadvantaged ones, further reducing health inequalities [41-44].

In addition to health behaviors, this thesis has pointed out towards the role of sleep as another important intermediate factor of the socioeconomic gradient in cardiometabolic disorders. Sleep is an essential recovery and restauration process, and sleep deprivation and other sleep-related problems have been related to major cardiometabolic disorders [10]. As part of the economic, social, and cultural changes that took place in the West during the twentieth century, the average sleep duration has been steadily decreasing, with socioeconomically disadvantaged individuals being particularly affected [9, 45, 46]. Consequently, to further reduce the burden and the socioeconomic differences in cardiometabolic disorders, structural policies shall aim at addressing socially patterned sleep disturbing factors, such as shift work, nighttime noise, or light pollution, which were previously associated with adverse cardiometabolic outcomes [45-50].

Furthermore, in the last part of this thesis, we observed that poor socioeconomic circumstances in adulthood were associated with a differential methylation of inflammation-related CpG markers. While aberrant inflammation was previously related to an increased cardiometabolic risk, further investigations are needed to identify and address the socially patterned exposures (i.e. psychosocial stressors, environmental factors) driving the differential methylation of the SEP-related markers.

Finally, the most important aspect in reducing the socioeconomic gradient in cardiometabolic disorders shall consist in eliminating the socioeconomic disadvantage itself. Even if the role

of most intermediate mechanism is eventually characterized, the fundamental causes of socioeconomic inequalities in health-related outcomes would still need to be fully understood and addressed directly [35, 51]. Former research in public health has thus shown that policies aimed at improving different aspects of the SEP, such as conditional cash transfers, the introduction of a universal basic income, or the promotion of social mobility through education, lead to an overall improvement of health [35, 37, 52-55]. Nevertheless, while eliminating socioeconomic inequalities would require extensive social, economic, and political effort at every level of society, a further characterization of the underlying mechanisms of the socioeconomic gradient in health-related outcomes remains absolutely essential for implementing effective, evidence-based public health policies addressing health inequalities.

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