# ARTICLE OPEN

Check for updates

# Psychotropic-induced weight gain and telomere length: results from a one-year longitudinal study and a large populationbased cohort

Marianna Piras  $1^{[M]}$ , Jue Lin<sup>2</sup>, Marie Catherine Sadler  $1^{3,4,5}$ , Setareh Ranjbar  $1^{6}$ , Claire Grosu<sup>1</sup>, Nermine Laaboub<sup>1</sup>, Martin Preisig  $1^{6}$ , Franziska Gamma<sup>7</sup>, Kerstin Jessica Plessen<sup>8</sup>, Armin von Gunten  $1^{9}$ , Philippe Conus<sup>10</sup>, Zoltan Kutalik  $1^{3,4,5}$  and Chin B. Eap  $1^{1,1,12,13}$ 

© The Author(s) 2024

Weight-inducing psychotropic treatments are risk factors for age-related diseases such as cardiovascular disorders, which are associated with both inflammation and telomere length shortening. With a longitudinal design, the present study evaluates telomere length trajectories after 1 year of weight-inducing psychotropic medication, accounting for weight changes and the inflammatory biomarker high-sensitivity C-Reactive Protein (CRP). Among 200 patients, an overall median telomere shortening of -41.2 bp was observed (p = 0.014), which is comparable with the general population's yearly telomere attrition. Linear regression showed on average -93.1 and -58.9 bp of further telomere shortening per five units of BMI for BMI values < or  $\geq 30 \text{ kg/m}^2$ , respectively (p = 0.003 and p = 0.009, respectively). Importantly, the overall telomere shortening was predicted to be increased four-fold among patients with low baseline weight (i.e., 50 kg) and with clinically relevant weight gain ( $\geq 7\%$ ) after 1 year of treatment (interaction term between relevant weight gain and baseline weight: +6.3 bp, p = 0.016). Patients with relevant weight gain showed greater CRP levels (+49%; p = 0.016), and a telomere shortening of -36.2 bp (p = 0.010) was estimated whenever CRP level doubled. Mendelian randomization using UKBiobank data showed a causal effect of BMI on telomere shortening, notably stronger among patients receiving weight-inducing psychotropic treatments (n = 9798) than among psychiatric patients without such drugs (n = 16228) and non-psychiatric controls (n = 252932) (beta: -0.37, -0.12, -0.06, respectively; p = 0.004, p < 0.001, p < 0.001, respectively). Ultimately, telomere trajectories were associated with 1 year weight gain and increases in CRP levels, with telomere shortening strongly enhanced by BMI increments among patients receiving weight-inducing psychotropic treatments.

Translational Psychiatry (2024)14:471; https://doi.org/10.1038/s41398-024-03177-3

# INTRODUCTION

Telomeres are the protein-DNA chromosome extremities that prevent chromosomic fusion and genome instability [1]. Cellular replications and/or biological environments such as inflammation and oxidation have been associated with telomere shortening, which decreases cellular lifespan, eventually leading to apoptosis or senescence [2]. Although telomere shortening is reversible due to the activity of the ribonucleoprotein enzyme telomerase [1], leukocyte telomere length shortening is nowadays one hallmark of aging due to its association with several age-related diseases as type 2 diabetes, dementia and cardiovascular diseases [3].

Telomere length has also been associated with psychiatric illnesses, a meta-analysis reporting shorter telomere length for

psychotic, bipolar, depression, anxiety and post-traumatic stress disorders versus the general population [4]. The psychiatric population also shows > 10 years of shorter life expectancy versus the non-psychiatric population, mainly because of the development of cardiometabolic diseases such as obesity, dyslipidemia, type 2 diabetes and hypertension (i.e., several age-related diseases, as previously mentioned), which are due to several risk factors, such as unhealthy lifestyle and genetic predisposition [5–7]. Psychotropic drugs, such as antipsychotics, mood stabilizers and antidepressants are also risk factors for developing such somatic diseases, with weight gain being one of the most common adverse effects that can lead to an increase of up to +12% in baseline weight within

Received: 31 May 2023 Revised: 31 October 2024 Accepted: 4 November 2024 Published online: 15 November 2024

<sup>&</sup>lt;sup>1</sup>Unit of Pharmacogenetics and Clinical Psychopharmacology, Centre for Psychiatric Neuroscience, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Prilly, Switzerland. <sup>2</sup>Department of Biochemistry and Biophysics, University of California, San Francisco, CA, USA. <sup>3</sup>University Center for Primary Care and Public Health, University of Lausanne, Lausanne, Switzerland. <sup>6</sup>Psychiatric Epidemiology and Psychopathology Research Center, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Switzerland. <sup>6</sup>Psychiatric Epidemiology and Psychopathology Research Center, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Prilly, Switzerland. <sup>7</sup>Les Toises Psychiatry and Psychotherapy Center, Lausanne, Switzerland. <sup>8</sup>Service of Child and Adolescent Psychiatry, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Lausanne, Prilly, Switzerland. <sup>10</sup>Service of General Psychiatry, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Lausanne, Prilly, Switzerland. <sup>10</sup>Service of General Psychiatry, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Lausanne, Prilly, Switzerland. <sup>10</sup>Service of General Psychiatry, Department of Psychiatry, Lausanne University Hospital, University of Lausanne, Lausanne, Prilly, Switzerland. <sup>11</sup>School of Pharmaceutical Sciences, University of Geneva, University of Lausanne, Geneva, Switzerland. <sup>12</sup>Center for Research and Innovation in Clinical Pharmaceutical Sciences, University of Lausanne, Lausanne, Switzerland. <sup>13</sup>Institute of Pharmaceutical Sciences of Western Switzerland, University of Geneva, University of Lausanne, Lausanne, Switzerland. <sup>13</sup>Institute of Pharmaceutical Sciences of Western Switzerland, University of Lausanne, Lausanne, Lausanne, Lausanne, Switzerland. <sup>14</sup>Iniversity of Lausanne, Lausanne, Switzerland. <sup>15</sup>Iniversity of Lausanne, Lausanne, Lausanne, Switzerland. <sup>14</sup>Iniversity of Lausanne, Lausanne, Switzerl

6–12 months of treatment [8]. Telomere trajectories after the onset of weight-inducing psychotropic drugs are unclear. In a cross-sectional study of 256 bipolar patients and 139 controls, lithium-treated patients showed longer telomere length compared with controls, and telomere length was positively correlated with treatment duration [9]. On the other hand, another cross-sectional study including 170 patients with schizophrenia and 126 controls reported significant telomere shortening among patients receiving the atypical antipsychotic olanzapine [10].

High levels of inflammatory biomarkers such as C-reactive protein (CRP, i.e., levels >3 mg/l) have also been associated with both old age and psychiatric diseases, with evidence reporting elevated CRP (>3 mg/l) among more than one third of 950 psychiatric patients [11], and elevated CRP among nonpsychiatric patients with cardiovascular diseases, metabolic syndrome and obesity [12-14]. Regarding the association between psychotropic drugs and CRP, a subclinical increase of 600% in CRP levels was reported after 8 weeks of clozapine treatment among eight patients with schizophrenia [15], and both interleukin-1Ra and CRP levels were associated with obesity in a cross-sectional study including 190 clozapinetreated patients [16]. Of note, CRP levels were previously positively associated also with psychiatric symptoms severity [17–19], the effect size of this association being attenuated when considering environmental factors such as smoking, medication use (i.e., both psychotropic and non-psychotropic) and metabolic parameters such as body mass index (BMI) [20]. Concerning the relationship between metabolic parameters, CRP and telomere length, studies including non-psychiatric individuals suggest that CRP levels partially mediate an inverse BMI-telomere length correlation [21, 22].

Although the association between telomere length or inflammation and psychiatric disorders has been established, the relationship between telomere length, inflammation, psychotropic treatment and/or the induced weight gain that might occur remains unclear. An ex-vivo study including peripheral blood mononuclear cells of six healthy individuals showed that the antipsychotics aripiprazole and haloperidol could increase telomere length by 23% and 20%, respectively, after the induction of acute oxidative stress injury [23]. Along with the latter result, the antipsychotic-induced blockage of dopamine (D<sub>2</sub>) and serotonin (5-HT<sub>2A</sub>) receptors has been suggested to increase the expression of telomerase catalytic unit, resulting in telomere lengthening [24]. Conversely, a cross-sectional study reported higher CRP levels among 41 patients with schizophrenia taking psychotropic treatments versus controls, and an inverse association between CRP and telomere length, which was independent of metabolic parameters such as BMI [25].

Given the conflicting results concerning psychotropic drugs and their metabolic and/or inflammatory consequences regarding telomere length, longitudinal studies evaluating the association of both inflammation and psychotropic-induced metabolic adverse effects on telomere trajectories are needed, as well as studies inferring causality of such associations. For this reason, this study aims to elucidate whether telomere length changes after 1 year of weight-inducing psychotropic medication in a cohort of psychiatric patients in Switzerland. Of note, due to the multiple factors influencing telomere length, an aging-related telomere shortening should be expected, as well as telomere changes due to weight gain/loss, and to senolytic [26] or telomerase-enhancing treatments (e.g., antipsychotic drugs as previously suggested). Thus, if a change in telomere length is found, we aim to investigate in which direction the latter change goes (i.e., lengthening or shortening); whether the telomere change is associated with metabolic features (e.g., BMI) and inflammation; whether we could validate our results in a large population-based cohort (UKBiobank).

#### Study design

From the PsyMetab cohort ongoing since 2007 at the Department of Psychiatry of Lausanne University Hospital in collaboration with a private mental health care center (Les Toises; Lausanne), 200 patients starting a psychotropic treatment and with at least two available blood samples and weight measures were selected for the telomere analysis. With the approval of the Ethics Committee of the Canton of Vaud and upon signature indicating informed consent, PsyMetab collects clinical data (e.g., weight) and blood samples as described elsewhere [27]. Informed consent was obtained for all participants included in the present study. Blood samples analyzed in the present study were collected at the beginning of the treatment (T0) and after 1 year (T12). To evaluate telomere trajectories within 1 year, additional blood samples collected at one and 3 months were analyzed for 38 and 47 patients, respectively. The included psychotropic treatments could have a high (i.e., clozapine, olanzapine and valproate), medium (i.e., lithium, mirtazapine, quetiapine, and risperidone) or low risk (i.e., amisulpride and aripiprazole) of inducing weight gain [28]. High sensitivity CRP levels (Cobas integra 400 plus Roche®, Roche Diagnostic, Rotkreuz, Switzerland) were also available for 162 patients at T12.

#### **Telomere analysis**

Telomere length was examined by quantitative polymerase chain reaction (qPCR) and telomere-to-single-copy-gene (T/S) ratios were obtained (See Supplementary Appendix). Although these qPCR results were not directly compared with another telomere length method, we used a conversion formula generated in the same lab using the same assay format to roughly estimate telomere length in base pairs (bp, i.e., base pairs = 3274 + 2413. (T/S)) [29]. Briefly, this conversion formula derived from side-by-side comparison of telomere restriction fragment (TRF) analysis and qPCR using a series of genomic DNA samples from the human fibroblast primary cell line IMR90 at different population doublings, as well as with the telomerase protein subunit gene (hTERT) transfected into a lentiviral construct [29].

#### Statistical analysis

Telomere lengths at T0 and T12 were compared with one another using two-sided Wilcoxon matched-pairs signed-rank test. T0- or T12-length associations with other continuous and binary variables were tested using Pearson correlation and the two-sided unpaired Wilcoxon rank-sum test, respectively. Linear regression on telomere bp difference at T12 (i.e., T12 telomere length—T0 length) and logistic regression on important telomere shortening (i.e., percentile of bp difference from 25% to the minimum value) or lengthening (i.e., percentile from 75% up to the maximum value) at T12 were applied. Both regressions were adjusted for age, sex, smoking status (i.e., smokers and ex-smokers versus non-smokers), antidepressant co-medication, also including metabolic variables such as clinically relevant weight gain (CRWG, i.e.,  $\geq$ 7% from baseline), baseline weight or 1 year BMI. Since we found a non-linear relationship between BMI and telomere differences, the piecewise function was applied to BMI with a knot at 30 kg/m<sup>2</sup> to analyze telomere length trajectories for obese versus nonobese subjects. Since inflammation could mediate the association between BMI and telomere length [21], additional models including CRP were performed to ascertain whether metabolic effects persist after accounting for inflammation. Moreover, since the different diagnoses did not influence our outcomes nor our results in linear and logistic regression (data not shown), this covariate was not included in the models. For further details on statistical analysis see Supplementary Appendix. R environment for statistical computing version 4.0.2 and Stata 17.0 (StataCorp; College Station, Texas) were used for the analysis, and p-values  $\leq 0.05$  were considered statistically significant.

## Validation in UKBiobank

In order to validate the explored associations and to infer causality through a Mendelian randomization (MR) analysis, a psychiatric cohort was defined using a cross-sectional approach in the UKBiobank (UKBB), a large population-based British cohort previously described elsewhere [30]. Briefly, the UKBB (2006-2010) includes clinical and genetic data of >500,000 British citizens aged between 40 and 69, including blood biomarkers and demographic indicators. Among this cohort, participants were selected according to quality measures, ethnicity, and relatedness, and they were classified as cases or psychiatric controls, according to the prescription of at least one high or low metabolic-risk medication, respectively (see Supplementary Table 1 for medication lists). Additionally, a control group within the general population was defined including participants not taking any of the medications listed in Supplementary Table 1, and not taking weight-inducing medications according to the SIDER database [31]. Associations and interactions were evaluated for BMI, educational attainment (i.e., a proxy for socio-economic status), CRP and telomere length phenotypes, considering every pairwise group combination (i.e., cases vs psychiatric controls, cases vs population-based controls, and psychiatric vs population-based controls), and the effect of BMI, educational attainment and CRP on telomere length was assessed using MR analysis in each group (See Supplementary Appendix and Supplementary Table 2 for demographics of the three groups).

# RESULTS

#### Univariate analysis

An overall telomere shortening of 41.2 bp (p = 0.014) was found among the 200 patients (Table 1). A significant telomere length shortening was indicated for patients experiencing CRWG (p = 0.040), taking medium- or low-risk drugs (p = 0.023, p = 0.029, respectively), and for patients with CRP levels > 3 mg/l at T12 (p = 0.006).

Among patients with telomere data for the four time-points, no telomere length difference was found between each time-point (Supplementary Table 3). Of note, baseline telomere length was correlated with 1 year length (r = 0.85, p < 0.001), and both lengths were correlated with age (r = -0.52, p < 0.001 for both). Telomere lengths at T0 and at T12 were not different among men and women (p = 0.83 and  $p \approx 1$ , respectively), did not correlate with BMI (r = -0.035 and r = -0.064, p = 0.63 and p = 0.38, respectively), and were not different among obese versus nonobese patients at T12 (p = 0.64 and p = 0.24, respectively). Additionally, at T12, a significant increment (1.16 versus 2.03 mg/l, p = 0.021) and no difference (1.26 versus 1.41 mg/l, p = 0.67) in CRP levels were found for patients with and without CRWG, respectively. Additional information on clinical data (intake of antihypertensive, antidiabetic and lipid-lowering drugs, and median fasting lipids and glucose levels at T0 and T12) can be found in Supplementary Table 4.

#### Multiple regression analysis

Multiple regression analysis showed a non-linear relationship between telomere bp difference and 1 year BMI (Fig. 1). Thus, a piecewise knot at 30 kg/m<sup>2</sup> was applied to 1 year BMI covariate in a linear model (Table 2, Model-1A), showing an estimated telomere attrition per five units of BMI of -93.1 bp for BMI < 30 kg/m<sup>2</sup> (p = 0.003), and an estimated telomere attrition of -58.9 bp for BMI  $\ge 30$  kg/m<sup>2</sup> (p = 0.009). Similarly, when including CRWG and baseline weight in a linear model (Table 2, Model-2A), the effect of CRWG on telomere bp difference ( $\beta$ -estimate: -490.0 bp, p = 0.010), changed in function of baseline weight (interaction effect: +6.3 bp, p = 0.016, Fig. 2), suggesting that a higher baseline weight would reduce telomere shortening linked to CRWG. For example, -175 and -112 bp (i.e., four-fold and 2.5-fold the overall median shortening of 41.2 bp, respectively) were predicted for 50 kg and 60 kg patients with CRWG, respectively, according to Model-2A (i.e., -490 + (6.3\*50)and -490 + (6.3\*60), respectively). A non-significant three-way interaction between baseline weight, CRWG and age was also found (data not shown), excluding a moderating effect of age on the association between baseline weight-CRWG interaction and telomere bp difference.

When including both BMI and CRP values in the linear model (Table 2, Model-1B), a telomere attrition was estimated only for BMI < 30 kg/m<sup>2</sup> (-83.4 bp per five BMI units, p = 0.018). Accordingly, similar results were found when including CRWG, baseline weight and CRP in a linear model (Table 2, Model-2B), with CRWG effect ( $\beta$ -estimate: -557.4, p = 0.013) changing in function of baseline weight (interaction effect: 7.8; p = 0.013). Additionally, an

attrition of -38.0 (p = 0.008) and -36.2 bp (p = 0.010) were estimated for each CRP duplication according to Model-1B and -2B in Table 2, respectively. Similar results were found when considering only CRP levels < 10 mg/l (Supplementary Fig. 1), and when applying robust linear models to down-weight three outlying observations (Supplementary Table 5). Interestingly, the linear model with logarithm-CRP as the outcome (data not shown) showed increased CRP levels (+ 49%) among patients with CRWG versus those with non-CRWG ( $\beta$ -estimate: 0.40, p = 0.016).

No further associations with telomere bp difference were found for age, sex, and smoking status in these linear models, nor with a Swiss-based socioeconomic score in an additional model (p = 0.16). On the other hand, a mean of -114.2 bp was estimated for patients taking versus not taking antidepressant co-medications according to Model-2A (p = 0.007).

In logistic models (Table 3), increases of one baseline weight standard deviation (i.e., 17 kg) were associated with 3.27 and 5.40 odds of important telomere lengthening among CRWG patients when including or not including CRP in the model, respectively (p = 0.004 and p = 0.001, respectively). Moreover, when including the Swiss-based socioeconomic score, each unit increment (range: 10 – 85) decreased the odds of important telomere shortening by 4% (p = 0.013, Supplementary Table 6).

Since receptor  $D_2$  and 5-HT<sub>2A</sub> blockage have been suggested to increase telomerase activity [24], a sensitivity analysis adjusting for drugs blocking both receptors (i.e., aripiprazole, clozapine, quetiapine, risperidone and olanzapine) or only the  $D_2$  receptor (amisulpride) versus other drugs without such blockade (lithium, mirtazapine or valproate) was performed, and no association with telomere bp difference was found (data not shown). Moreover, similar results as reported in Tables 2 and 3 were found in a sensitivity analysis (data not shown) including baseline telomere length as a covariate, and excluding the 14 samples with DNA quantity and quality below our criteria (see Supplementary Appendix—Methods).

#### Validation UKBB

When replicating these results using UKBB data, a significant association with telomere length was found for BMI, CRP and educational attainment when considering the three group combinations (Supplementary Table 7). Moreover, MR analysis revealed a causative effect of BMI on telomere length for cases, psychiatric and population-based controls (i.e., 9798, 16228 and 252932 included individuals, respectively), this effect being notably stronger among psychiatric cases (beta -0.37 versus -0.12 and -0.06, respectively, see Table 4). Furthermore, a significant difference of these effects was found when metaanalyzing the two differences (-0.37 versus -0.12 and -0.12 vs -0.06) while accounting for the covariance between these estimates (p = 0.011). Conversely, a causative effect of CRP was found only in the non-psychiatric cohort (beta -0.04). To investigate whether CRP mediates the effect of BMI on telomere length, multivariable MR was also performed, reporting no statistical evidence of such a mechanism (beta of the indirect effect of BMI on telomere length via CRP levels: 0.005, p = 0.75).

### DISCUSSION

To our knowledge, the present longitudinal study is the first examining the associations of one-year telomere trajectories with both inflammation and psychotropic-induced weight gain, indicating a median overall telomere shortening of 41.2 bp among 200 psychiatric patients, which is in line with a systematic review reporting 32 to 45 bp attrition per year in the general population [32]. However, stronger telomere attrition was predicted among patients with low baseline weight and one-year CRWG.

Significant telomere attrition was found for patients taking lowand medium-metabolic-risk drugs, but, surprisingly, not for 
 Table 1.
 Clinical characteristics and one-year telomere differences.

	Total patients (N = 200	) <sup>a</sup>	
Age (years)	36 (26–49) <sup>b</sup>		
Baseline telomere length (bp)	6019.9 (5742.1–6400.5)	D,C	
One-year telomere length (bp)	6008.6 (5697.3–6382.7)	b,c	
Baseline weight (kg)	71 (61.5 – 81.5)		
Baseline BMI (kg/m²)	24 (21–29)		
Missing BMI	5 (2.5%)		
	N (%)	Т12–Т0 (bp)	p-value
Overall telomere shortening <sup>e</sup>	200 (100%)	-41.2 (-217.7 - +115.1)	0.014
Age categories			
≤25 years	47 (23.5%)	-68.7 (-258.1 - +110.7)	0.12
>25 and <65 years	137 (68.5%)	-37.2 (-212.1 - +126.1)	0.10
≥65 years	16 (8%)	-11.5 (-180.3 - +37.8)	0.30
Sex			
Men	113 (56.5%)	-74.3 (-233.8 - +133.7)	0.069
Women	87 (43.5%)	-15.4 (-200.8 - +95.3)	0.11
Ethnicity <sup>f</sup>			
Europeans	145 (72.5%)	-45 (-211.7 - +116.31)	0.038
Other	44 (22%)	-24.2 (-258.6 - +121.7)	0.28
Missing	11 (5.5%)	-50.7 (-177.1 - +48.7)	0.41
CRWG <sup>9</sup>			
Yes	89 (44.5%)	-61.4 (-191.4 - +95.3)	0.040
No	111 (55.5%)	-18.4 (-235.5 - +127.5)	0.13
Risk level of drugs <sup>h</sup>			
High	37 (18.5%)	+40.2 (-127.4 - +203.6)	0.35
Medium	116 (58.0%)	-53.2 (-233.8 - +113.0)	0.023
Low	47 (23.5%)	-71.6 (-235.9 - +56.1)	0.029
Diagnoses <sup>i</sup>			
Schizophrenia	86 (43%)	-64.9 (-235.5 - +110.7)	0.043
Bipolar disorder	38 (19%)	-30.3 (-205.0 - +161.6)	0.62
Depression	33 (16.5%)	-88.2 (-224.6 - +89.5)	0.16
Others	26 (13%)	+3.9 (-189.1 - +113.9)	0.63
Schizoaffective disorders	16 (8%)	+18.5 (-225.3 - +148.9)	0.94
Missing	1 (0.5%)		
Smoking <sup>j</sup>			
Smokers	111 (55.5%)	-45.2 (-200.8 - +99.9)	0.089
Ex-smokers	6 (3%)	+121.7 (22.1 - +212.0)	0.31
Non-smokers	83 (41.5%)	-61.8 (-249.6 - +112.0)	0.034
Previous psychotropic drug(s) <sup>k</sup>			
No	50 (25%)	-76.7 (-237.6 - +43.7)	0.035
Yes	150 (75%)	-18 (-211.7 - +126.1)	0.11
Antidepressant use <sup>l</sup>			
Yes	68 (34%)	-156.1 (-237.3 - +53.0)	<0.001
No	132 (66%)	-1.4 (-185.0 - +150.1)	0.65
CRP at T12	,		
High >3 mg/l	51 (25.5%)	-81.8 (-233.5 - +45.4)	0.006
$Low \leq 3 \text{ mg/l}$	111 (55.5%)	-17.6 (-200.8 - +180.5)	0.56
Missing	38 (19%)	-74.3 (-249.2 - +110.7)	0.17
Drug <sup>m</sup>			
Amisulpride	16 (8%)	-89.8 (-252.9 - +33.4)	0.044
Aripiprazole	31 (15.5%)	-45.2 (-235.9 - +95.3)	0.18

### Table 1. continued

	Total patients ( <i>N</i> = 200) <sup>a</sup>		
Lithium	23 (11.5%)	-91.4 (-224.6 - +99.0)	0.22
Mirtazapine	11 (5.5%)	-151.6 (-260.3 - +42.4)	0.46
Olanzapine	15 (7.5%)	-37.2 (-177.1 - +212.0)	0.85
Quetiapine	57 (28.5%)	-33.5 (-212.1 - +112.0)	0.080
Risperidone	25 (12.5%)	-7.7 (-249.6 - +133.7)	0.71
Valproate	9 (4.5%)	117.3 (22.1 – +270.7)	0.098

<sup>a</sup>Proportions (%) and medians (Q1 – Q3) are reported for categorical and continuous variables, respectively.

<sup>b</sup>Significant Pearson correlation between both telomere lengths (i.e., baseline and 1 year) and age (r = -0.52, p < 0.001 for both). Minimum age: 12; maximum age: 91.

 $c^{c}$ Significant Pearson correlation between baseline and 1 year telomere length (r = 0.85, p < 0.001). Median (Q1 – Q3) of T/S ratio at T0: 1.14 (1.02–1.30). Median (Q1 – Q3) of T/S ratio at T12: 1.13 (1.00–1.29).

<sup>d</sup>Wilcoxon matched-pairs signed-rank test comparison between telomere length at T0 and T12.

<sup>e</sup>Although the two median lengths were 6019.9 bp at T0 and 6008.6 bp at T12, and their difference is 11.3 bp (i.e., 6008.6–6019.9 = -11.3 bp), the median difference between T12 and T0 lengths is -41.2 bp, as it depends on how many bp were lost and gained per patient.

<sup>f</sup>Genetic ethnicities. Mixed ethnicity (n = 36) and African ethnicity (n = 8) were pooled together as "Other".

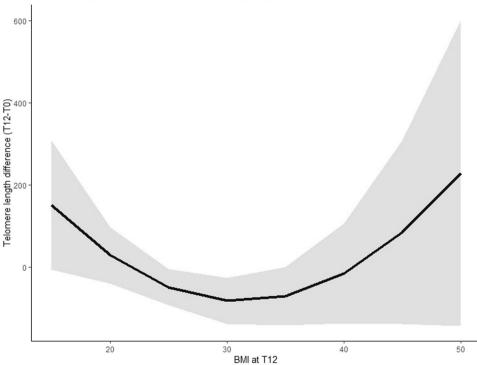
<sup>9</sup>Clinically relevant weight gain (i.e.,  $\geq$ 7% from baseline weight) at T12.

<sup>h</sup>High-risk drugs for inducing metabolic adverse effects: clozapine, olanzapine valproate; medium-risk drugs: lithium, mirtazapine, quetiapine, risperidone; lowrisk drugs: amisulpride, aripiprazole.

<sup>1</sup>International Classification of Diseases-10 classification: organic disorders, anxiety, personality disorder, intellectual disability, dementia, and substance use disorder were classified together as "other."

<sup>j</sup>Patients classified as smokers at T0 and as non-smokers at T12 were classified as ex-smokers. Whether non-smokers were tobacco-naïve was unknown. <sup>k</sup>Patients with or without records of previous psychotropic treatments with metabolic risk in our database (i.e., see list of psychotropic drugs reported in footnote<sup>b</sup>). Among patients with a previous psychotropic treatment, 33 had a previous low-risk drug, 87 a medium-risk and 30 a high-risk drug. <sup>l</sup>Antidepressant drugs among: agomelatine, buproprion, citalopram, duloxetine, escitalopram, fluoxetine, mianserine, moclobemide, paroxetine, sertraline, trazodone, venlafaxine.

<sup>m</sup>49 patients were prescribed with  $\geq 1$  additional psychotropic drug with metabolic risk at T12 (i.e., see list of psychotropic drugs reported in footnote<sup>h</sup>). bp base pairs, BMI body mass index, CRP C-reactive protein.



Quadratic model - with 95% Confidence Interval

Fig. 1 Non-linear relationship between telomere base-pair differences (T12-T0) and 1-year BMI. Linear model adjusted for age, sex, smoking status, antidepressant co-medication, BMI and BMI square. BMI  $\beta$ -estimate: -55.3, p = 0.026 and BMI/2  $\beta$ -estimate: 0.89, p = 0.037.

patients taking high-risk drugs. This result may be due to chance, given the low sample size, or to the potential properties of decelerating cellular aging of both mood stabilizers (i.e., valproate) and clozapine, as mentioned in previous cross-sectional studies

[33, 34]. However, unlike two previous cross-sectional studies reporting a positive correlation between telomere length and lithium treatment duration [9], and significant telomere shortening among olanzapine-treated patients versus controls [10], in

	Tolomoro hac	Telomere base pair differences (T12-T0) <sup>a</sup>					
	reionere bas	e pair unterences (11	2-10)				
	Α			В			
	Model1 <sup>d</sup>						
Predictors	Estimates	CI	р	Estimates	CI	р	
BMI/5 if BMI < 30 $(kg/m^2)^b$	-93.1	-155.231.0	0.003	-83.4	-152.214.5	0.018	
BMI/5 if BMI $\ge$ 30 (kg/m <sup>2</sup> )	-58.9	-102.815.0	0.009	-47.0	-97.2 - 3.1	0.066	
CRP (2 log) <sup>c</sup>				-38.0	-66.19.9	0.008	
Ν	195			159			
	Model2 <sup>f</sup>						
CRWG [Yes] <sup>e</sup>	-490.0	-863.0117.1	0.010	-557.4	-996.0118.7	0.013	
Baseline weight (kg)	-3.2	-5.90.5	0.022	-2.1	-5.1 - 0.8	0.15	
Baseline weight (kg) * CRWG [Yes]	6.3	1.2 – 11.5	0.016	7.8	1.7 – 13.9	0.013	
CRP (2 log) <sup>c</sup>				-36.2	-63.78.7	0.010	
Ν	200			162			

<sup>a</sup>Models below the A column do not include CRP as co-variate and vice-versa. Models were also adjusted for age, sex, smoking status (i.e., smokers and exsmokers versus non-smokers) and antidepressant co-medication.

<sup>b</sup>BMI is expressed as five BMI units. At T12, 45 patients had a BMI  $\ge$  30 kg/m<sup>2</sup>.

<sup>c</sup>CRP values are expressed as base-two logarithm values.

<sup>d</sup> For BMI <30 kg/m<sup>2</sup>, each increase of five BMI units (e.g., from 20 to 25 or from 22 to 27 kg/m<sup>2</sup>) would lead to -93.1 (Model1-A) or -83.4 base pairs (Model1-B) on average. For BMI  $\ge$  30 kg/m<sup>2</sup>, each increase of five BMI units (e.g., from 30 to 35 or from 33 to 38 kg/m<sup>2</sup>) would lead to -58.9 base pairs according to Model1-A. According to Model1-B, each time CRP levels doubled, a loss of -38.0 base pair was predicted.

<sup>e</sup>Clinically relevant weight gain (i.e., ≥7% from baseline weight).

<sup>f</sup>Patients reaching CRWG at T12 showed a mean of -490.0 or -557.4 base pairs less than patients not reaching this threshold according to Model2-A and Model2-B, respectively. According to Model2-A, for each additional kg of baseline weight among patients not reaching CRWG, -3.2 base pairs were predicted, whereas for patients reaching CRWG, +3.2 base pairs were predicted for each additional baseline kg (i.e., -3.2 + 6.3). Thus, the telomere base pair difference for two fictive patients with CRWG of 50 and 80 kg would be -167.4 and 66.6 base pairs, respectively [i.e., -557.4 + (7.8\*50) and -557.4 + (7.8\*80), respectively], according to Model2-B.

BMI body mass index, CI 95% confidence interval, CRP C-reactive protein, N number of included patients, p p-value.

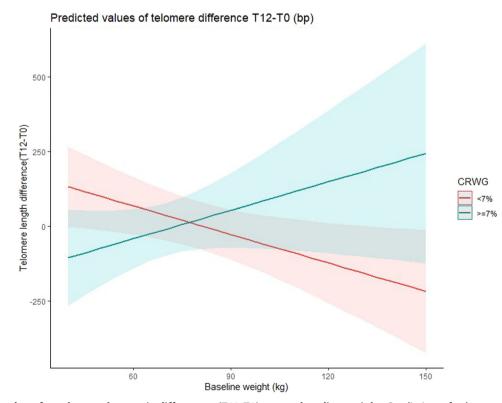


Fig. 2 Predicted values for telomere base-pair differences (T12-T0) versus baseline weight. Prediction of telomere base-pair difference versus baseline weight for patients experiencing clinically relevant weight gain (CRWG, i.e.,  $\geq$ 7%) or not (i.e., <7%) with 95% confidence interval according to Model-2A, Table 2.

lable 3. Logistic regression for important telomere lengthening or shortening.	engthenin	g or shortening	÷									
	Important	ant telomere lengthening <sup>a</sup>	engthening	e			Impor	Important telomere shortening <sup>b</sup>	hortening	<u>م</u>		
	A <sup>c</sup>			ğ			υ			٥		
Predictors	OR	כו	р	OR	כו	р	OR	CI	р	OR	כו	d
CRWG [Yes]	0.95	0.48 - 1.87	0.89	1.51	0.69 - 3.36	0.31	0.56	0.26 – 1.17	0.13	0.47	0.18 – 1.12	0.10
Baseline weight (standard deviation)	0.65	0.40 - 1.01	0.068	0.61	0.34 - 1.03	0.085	1.09	0.73 - 1.61	0.68	0.89	0.56 – 1.38	0.62
Baseline weight (standard deviation) * CRWG [Yes]	3.27	1.48 – 7.64	0.004	5.40	2.02 - 16.57	0.001	0.57	0.23 – 1.31	0.20	0.66	0.21 - 1.82	0.44
CRP (2 log) <sup>d</sup>				0.84	0.64 - 1.08	0.19				1.28	1.00-1.64	0.052
Z	200			162			200			162		
<sup>a</sup> Important telomere lengthening included values for telomere base pair differences from 75th percentile up to the maximum value (i.e., from +115.1 to +1220.2 base pairs). Models below the A column do not include CRP as co-variate and vice-versa.	mere base	pair differences	from 75th p	ercentile u	up to the maximun	n value (i.e.,	from +11	5.1 to +1220.2 bē	ase pairs).	Models be	low the A colum	n do not
<sup>b</sup> Important telomere shortening included values for telomere base pair differences from 25th percentile to the minimum value (i.e., from -217.7 to -1212.4 base pairs). Models below the C column do not	mere base	pair differences	from 25th p	oercentile	to the minimum v	/alue (i.e., fr	om –217.	7 to1212.4 bas	e pairs). N	Aodels belo	ow the C colum	n do not
<sup>ab</sup> Models were also adjusted for age, sex, smoking status (i.e., smokers and ex-smokers versus non-smokers) and antidepressant co-medication. Continuous variables (i.e., age and baseline weight) were scaled	: (i.e., smok	ers and ex-smok	ers versus no	on-smokei	s) and antidepres	sant co-meo	lication. C	ontinuous variabl	les (i.e., ag	e and base	eline weight) wei	e scaled

According to Model-A and -B, the increment of one standard deviation of baseline weight among patients with CRWG is associated with 3.27 and 5.40 odds of experiencing important telomere lengthening.

ZRVG Clinically relevant weight gain, CI 95% confidence interval, CRP C-reactive protein, N number of included patients, OR odds ratio, p p-value.

<sup>1</sup>CRP values are expressed as base-two logarithm values.

espectively

according to the variable mean and standard deviation.

the present study no significant telomere changes were found for patients taking these two drugs. This discrepancy is possibly explained by the different study designs, with the present longitudinal study standing in contrast with a cross-sectional design comparing two different cohorts at one time-point, or by the different sample sizes (e.g., 256 bipolar patients included in the previously mentioned study [9] versus 23 patients taking lithium in the present study).

BMI was associated with telomere shortening, with BMI increases up to 30 kg/m<sup>2</sup> resulting in greater telomere attrition than increases from 30 kg/m<sup>2</sup>, suggesting that increasing BMI up to becoming obese has a stronger impact on telomere attrition than increasing BMI once this threshold is reached. This result is in contrast with a previous one-year longitudinal study reporting greater telomere attrition with increased baseline obesity, possibly explained by the inclusion of non-psychiatric women experiencing chronic obesity [35]. Moreover, an approximately four-fold predicted increase in overall telomere attrition was found among patients with low baseline weight (e.g., 50 kg) and one-year CRWG, which is in agreement with a previous cross-sectional analysis reporting an inverse association between telomere length and selfreported weight gain in the general population [36]. Conversely, higher baseline weights were associated with less telomere shortening (e.g., 2.5-fold the overall shortening for 60 kg patients versus four-fold for 50 kg patients) or even telomere lengthening (+ 77 bp for 90 kg patients) among CRWG patients, with a large confidence interval predicted for the latter case. Altogether, both CRWG and BMI results suggest that gaining weight or becoming obese with weight-inducing psychotropic treatments could induce dysregulation of inflammatory biomarkers [37], which could upregulate telomere shortening. On the other hand, when already obese, telomere shortening would not be further upregulated, given the chronic inflammation state. Thus, telomere lengthening could be explained by secondary biological/pharmacological mechanisms prevailing once a chronic inflammation state is reached (e.g., psychotropic drugs' telomerase-induction properties). Of note, this result could also be explained by other uncontrolled factors, such as changes in dietary intake and physical activity experienced by overweight and obese patients. Hence, the mechanisms linking psychotropic-induced weight gain, BMI, telomere length and inflammation cannot be reflected by examining these variables alone, as other secondary factors may be involved.

Patients with CRWG had a significant increase in CRP levels, on average +49% greater than among patients with non-CRWG, suggesting that metabolic changes rather than the psychotropic treatment itself could increase inflammatory biomarkers. This agrees with a previous cross-sectional study including clozapine-treated patients showing that BMI is associated with elevated CRP levels [16]. However, these results might also be explained by other uncontrolled factors, as CRP is also associated with several environmental (e.g., poverty [38]) and medical factors (e.g., psychiatric symptoms severity [17-19]). In the present study, CRP increases were also associated with telomere attrition, which agrees with a previous cross-sectional study reporting an inverse correlation between CRP values and telomere length among patients treated with psychotropic drugs [25]. Furthermore, when adjusting our linear model for CRP values (i.e., Table 2. Model 1-B), a significant effect on telomere attrition was observed only for  $BMI < 30 \text{ kg/m}^2$ . This could be explained by a smaller sample size (i.e., 159/195 patients with CRP values), and/or by chronic inflammation associated with obesity, which could mediate the association between obesity status and telomere shortening as suggested in a previous cross-sectional study including 5451 non-psychiatric adults [21]. Altogether, the present results indicate that both weight gain and CRP increases are associated with telomere shortening on average, and that inflammation increases are found among patients with relevant weight gain after one year of psychotropic treatment.

Table 4. Mendelian randomization results using UKBiobank data.

Beta <sup>a</sup>	SE	P-value	N SNPs	Q stat <sup>b</sup>	Q <i>p</i> -value <sup>b</sup>	Exposure	Outcome	Group <sup>c,d</sup>
-0.37	0.13	0.00417352	613	532.87	0.990563143	BMI	Telomere	Cases
-0.12	0.03	5.07E-06	633	613.19	0.696970429	BMI	Telomere	Psychiatric controls
-0.06	0.01	1.11E-08	633	1522.60	3.01E-75	BMI	Telomere	Population-based controls
0.00	0.12	0.984541935	448	364.12	0.99836974	CRP	Telomere	Cases
-0.04	0.02	0.070093414	462	543.72	0.00468493	CRP	Telomere	Psychiatric controls
-0.04	0.01	6.71E-06	464	1158.18	2.92E-61	CRP	Telomere	Population-based controls
2.35	1.75	0.17872795	43	45.37	0.33340906	EA	Telomere	Cases
0.02	0.11	0.865740958	45	57.06	0.0895339	EA	Telomere	Psychiatric controls
0.08	0.05	0.132819814	45	215.56	1.82E-24	EA	Telomere	Population-based controls

<sup>a</sup>Mendelian randomization beta coefficient.

<sup>b</sup>Heterogeneity Q-statistic and its *p*-value.

<sup>c</sup>9798, 16228 and 252932 individuals were included in cases, psychiatric controls and population-based controls.

<sup>d</sup>A sensitivity analysis excluding individuals receiving psychotropic drugs known to decrease weight in some cases (see Supplementary Table 1) was performed, and similar results were found (data not shown).

SE Standard Error, N number, Q Q-statistic, BMI body mass index, CRP C-Reactive Protein, EA Educational attainment.

Antidepressant co-medication was associated with greater telomere attrition. This result is in contrast with a previous 24 week longitudinal study reporting telomere lengthening after antidepressant treatment onset, with the small number (n = 12) of depressed patients and the included antidepressant treatments (i.e., selective serotonin reuptake inhibitors only [39] versus diverse antidepressant medications in the present study) possibly explaining the difference. Moreover, inter-individual one-unit increases in socioeconomic status were associated with decreased odds of important telomere shortening. This finding supports previous studies indicating that telomere shortening is a multifactorial biological process, which is influenced by many environmental factors [32]. Of note, the socioeconomic status examined in the present study includes income, education, occupation, and housing conditions.

MR analysis on telomere shortening in the UKBB psychiatric cohort showed a causal effect only for BMI. Indeed, MR results indicated that BMI increases strongly enhance telomere attrition when weight-inducing psychotropic drugs are prescribed, regardless of the CRP level. However, a causal effect of inflammation on telomere shortening cannot be excluded. Indeed, MR indicated that CRP levels enhance telomere attrition among non-psychiatric controls, suggesting that other unaccounted variables among the psychiatric population may have prevented the detection of this causal relationship. Moreover, several other inflammatory biomarkers (e.g., cytokines) were not considered. In addition, in UKBB, given the cross-sectional design, CRP levels were possibly measured after different treatment durations among individuals who experienced variable weight changes, whereas in our longitudinal PsyMetab study, we considered weight gain and inflammation at one year, both variables being associated one with the other. Therefore, considering inflammation cross-sectionally and independently of metabolic changes might have contributed to a non-significant effect of CRP on telomere attrition in psychiatric subjects.

Interestingly, a recent study investigated the consequences of having longer and shorter telomere length versus the general population's mean length, suggesting that 40 years-old individuals with shorter telomere length of 1 standard deviation had 2.5 years of lower life expectancy versus individuals with longer telomere length of 1 standard deviation [40]. Thus, among psychiatric patients taking weight-inducing psychotropic drugs, important BMI increases might lead to a further lowering in life expectancy than among psychiatric patients with weight-neutral treatments or among the general population.

Several limitations of the present study must be mentioned. Many environmental factors previously associated with telomere length (e.g., perceived stress levels, paternal age, marital status, etc.) or with both telomere length and weight gain separately (e.g., physical activity, alcohol consumption, diet, etc.) could not be controlled for [32], and only the inflammatory biomarker CRP was available to investigate the association between inflammation and telomere trajectories. Adherence to treatment could not be ascertained, and no data was available on the duration of psychiatric illness at baseline, nor on psychiatric symptoms severity at the time of sample collection. Moreover, although our results showed that the potential telomerase-enhancing property of antipsychotics was not associated with our outcome. the prescription of other telomerase-enhancing or senolytic drugs could not be controlled for. The effect of each psychotropic drug alone on telomere trajectories, as well as the speed of telomere changes over one year considering samples collected at one and 3 months of treatment could also not be ascertained using a multivariate analysis given the limited sample size. Moreover, given the reduced sample size in the UKBB with available longitudinal data, only a cross-sectional approach could be used to validate our associations. On the other hand, our longitudinal study, taking each patient as his/her own control, could investigate the association of psychotropic drugs, induced weight gain and inflammation with telomere dynamics, considering weight change over time and CRP levels. Finally, the UKBB statistical power allowed validation of the associations and demonstrated a causal effect of BMI on telomere shortening, which was stronger among patients receiving weight-inducing psychotropic treatments. Further longitudinal studies should evaluate the long-term metabolic impact of early weight gain on telomere length to better understand the associations between psychotropic-induced weight gain and telomere biology.

#### CONCLUSION

To our knowledge, this is the first study showing that one-year weight gain and increases in CRP levels are associated with telomere shortening, and that BMI increments strongly enhance telomere attrition among patients receiving weight-inducing psychotropic treatments.

#### REFERENCES

1. Blackburn EH. Telomeres and telomerase: their mechanisms of action and the effects of altering their functions. FEBS Lett. 2005;579:859–62.

- Zhang J, Rane G, Dai X, Shanmugam MK, Arfuso F, Samy RP, et al. Ageing and the telomere connection: an intimate relationship with inflammation. Ageing Res Rev. 2016;25:55–69.
- Gavia-García G, Rosado-Pérez J, Arista-Ugalde TL, Aguiñiga-Sánchez I, Santiago-Osorio E, Mendoza-Núñez VM. Telomere length and oxidative stress and its relation with metabolic syndrome components in the aging. Biology. 2021;10:253.
- Darrow SM, Verhoeven JE, Révész D, Lindqvist D, Penninx BW, Delucchi KL, et al. The association between psychiatric disorders and telomere length: a metaanalysis involving 14,827 persons. Psychosom Med. 2016;78:776–87.
- Laursen TM, Munk-Olsen T, Vestergaard M. Life expectancy and cardiovascular mortality in persons with schizophrenia. Curr Opin psychiatry. 2012;25:83–8.
- Walker ER, McGee RE, Druss BG. Mortality in mental disorders and global disease burden implications: a systematic review and meta-analysis. JAMA psychiatry. 2015;72:334–41.
- Lawrence D, Hancock KJ, Kisely S. The gap in life expectancy from preventable physical illness in psychiatric patients in Western Australia: retrospective analysis of population based registers. BMJ Br Med J. 2013;346;f2539.
- Foley DL, Morley KI. Systematic review of early cardiometabolic outcomes of the first treated episode of psychosis. Arch Gen psychiatry. 2011;68:609–16.
- Martinsson L, Wei Y, Xu D, Melas PA, Mathe AA, Schalling M, et al. Long-term lithium treatment in bipolar disorder is associated with longer leukocyte telomeres. Transl Psychiatry. 2013;3:e261.
- Monroy-Jaramillo N, Rodriguez-Agudelo Y, Avina-Cervantes LC, Roberts DL, Velligan DI, Walss-Bass C. Leukocyte telomere length in Hispanic schizophrenia patients under treatment with olanzapine. J Psychiatr Res. 2017;90:26–30.
- Wysokiński A, Margulska A, Strzelecki D, Kłoszewska I. Levels of C-reactive protein (CRP) in patients with schizophrenia, unipolar depression and bipolar disorder. Nord J Psychiatry. 2015;69:346–53.
- Malik S, Wong ND, Franklin S, Pio J, Fairchild C, Chen R. Cardiovascular disease in U.S. patients with metabolic syndrome, diabetes, and elevated C-reactive protein. Diab Care. 2005;28:690–3.
- Ishikawa S, Kayaba K, Gotoh T, Nakamura Y, Kajii E. Metabolic syndrome and C-reactive protein in the general population: JMS Cohort Study. Circ J. 2007;71:26–31.
- Ndumele CE, Nasir K, Conceiçao RD, Carvalho JA, Blumenthal RS, Santos RD. Hepatic steatosis, obesity, and the metabolic syndrome are independently and additively associated with increased systemic inflammation. Arterioscler Thromb Vasc Biol. 2011;31:1927–32.
- Löffler S, Löffler-Ensgraber M, Fehsel K, Klimke A. Clozapine therapy raises serum concentrations of high sensitive C-reactive protein in schizophrenic patients. Int Clin Psychopharmacol. 2010;25:101–6.
- Klemettilä JP, Kampman O, Seppälä N, Viikki M, Hämäläinen M, Moilanen E, et al. Cytokine and adipokine alterations in patients with schizophrenia treated with clozapine. Psychiatry Res. 2014;218:277–83.
- Dickerson F, Stallings C, Origoni A, Boronow J, Yolken R. C-reactive protein is associated with the severity of cognitive impairment but not of psychiatric symptoms in individuals with schizophrenia. Schizophr Res. 2007;93:261–5.
- Michopoulos V, Rothbaum AO, Jovanovic T, Almli LM, Bradley B, Rothbaum BO, et al. Association of CRP genetic variation and CRP level with elevated PTSD symptoms and physiological responses in a civilian population with high levels of trauma. Am J psychiatry. 2015;172:353–62.
- 19. Howren MB, Lamkin DM, Suls J. Associations of depression with C-reactive protein, IL-1, and IL-6: a meta-analysis. Psychosom Med. 2009;71:171–86.
- Figueroa-Hall LK, Xu B, Kuplicki R, Ford BN, Burrows K, Teague TK, et al. Psychiatric symptoms are not associated with circulating CRP concentrations after controlling for medical, social, and demographic factors. Transl Psychiatry. 2022;12:279.
- Gao X, Li S, Dong S, Li J, Yan Y, Zhang T, et al. Association between body weight and telomere length is predominantly mediated through C-reactive protein. J Clin Endocrinol Metab. 2021;106:e4634–e40.
- Rode L, Nordestgaard BG, Weischer M, Bojesen SE. Increased body mass index, elevated C-reactive protein, and short telomere length. J Clin Endocrinol Metab. 2014;99:E1671–5.
- Polho GB, Cardillo GM, Kerr DS, Chile T, Gattaz WF, Forlenza OV, et al. Antipsychotics preserve telomere length in peripheral blood mononuclear cells after acute oxidative stress injury. Neural Regen Res. 2022;17:1156–60.
- Polho GB, De-Paula VJ, Cardillo G, dos Santos B, Kerr DS. Leukocyte telomere length in patients with schizophrenia: a meta-analysis. Schizophr Res. 2015;165:195–200.
- Squassina A, Manchia M, Pisanu C, Ardau R, Arzedi C, Bocchetta A, et al. Telomere attrition and inflammatory load in severe psychiatric disorders and in response to psychotropic medications. Neuropsychopharmacol Off Publ Am Coll Neuropsychopharmacol. 2020;45:2229–38.
- Kirkland JL, Tchkonia T. Senolytic drugs: from discovery to translation. J Intern Med. 2020;288:518–36.

- Vandenberghe F, Gholam-Rezaee M, Saigi-Morgui N, Delacrétaz A, Choong E, Solida-Tozzi A, et al. Importance of early weight changes to predict long-term weight gain during psychotropic drug treatment. J Clin Psychiatry. 2015;76:e1417–23.
- Pillinger T, McCutcheon RA, Vano L, Mizuno Y, Arumuham A, Hindley G, et al. Comparative effects of 18 antipsychotics on metabolic function in patients with schizophrenia, predictors of metabolic dysregulation, and association with psychopathology: a systematic review and network meta-analysis. Lancet Psychiatry. 2019;7:64–77.
- Farzaneh-Far R, Lin J, Epel E, Lapham K, Blackburn E, Whooley MA. Telomere length trajectory and its determinants in persons with coronary artery disease: longitudinal findings from the heart and soul study. PLoS ONE. 2010;5:e8612.
- Bycroft C, Freeman C, Petkova D, Band G, Elliott LT, Sharp K, et al. The UK Biobank resource with deep phenotyping and genomic data. Nature. 2018;562:203–9.
- 31. Kuhn M, Letunic I, Jensen LJ, Bork P. The SIDER database of drugs and side effects. Nucleic Acids Res. 2016;44:D1075–9.
- Müezzinler A, Zaineddin AK, Brenner H. A systematic review of leukocyte telomere length and age in adults. Ageing Res Rev. 2013;12:509–19.
- Higgins-Chen AT, Boks MP, Vinkers CH, Kahn RS, Levine ME. Schizophrenia and Epigenetic aging biomarkers: increased mortality, reduced cancer risk, and unique clozapine effects. Biol psychiatry. 2020;88:224–35.
- Okazaki S, Numata S, Otsuka I, Horai T, Kinoshita M, Sora I, et al. Decelerated epigenetic aging associated with mood stabilizers in the blood of patients with bipolar disorder. Transl Psychiatry. 2020;10:129.
- Wojcicki JM, Elwan D, Lin J, Blackburn E, Epel E. Chronic obesity and incident hypertension in latina women are associated with accelerated telomere length loss over a 1 year period. Metab Syndr Relat Disord. 2018;16:262–6.
- Müezzinler A, Mons U, Dieffenbach AK, Butterbach K, Saum KU, Schick M, et al. Body mass index and leukocyte telomere length dynamics among older adults: results from the ESTHER cohort. Exp Gerontol. 2016;74:1–8.
- Fonseka TM, Müller DJ, Kennedy SH. Inflammatory cytokines and antipsychoticinduced weight gain: review and clinical implications. Mol Neuropsychiatry. 2016;2:1–14.
- Nazmi A, Victora CG. Socioeconomic and racial/ethnic differentials of C-reactive protein levels: a systematic review of population-based studies. BMC Public Health. 2007;7:212.
- da Silva RS, de Moraes LS, da Rocha CAM, Ferreira-Fernandes H, Yoshioka FKN, Rey JA, et al. Telomere length and telomerase activity of leukocytes as biomarkers of selective serotonin reuptake inhibitor responses in patients with major depressive disorder. Psychiatr Genet. 2022;32:34–6.
- Codd V, Wang Q, Allara E, Musicha C, Kaptoge S, Stoma S, et al. Polygenic basis and biomedical consequences of telomere length variation. Nat Genet. 2021;53:1425–33.

#### ACKNOWLEDGEMENTS

This study was supported by the Swiss National Research Foundation. The authors thank A.C. Aubert, M. Brocard and S. Jaquet for C-Reactive Protein and DNA extraction analysis (Lausanne University Hospital, Lausanne, Switzerland) and L. Maw for editorial assistance. None have conflicts of interest to declare. The authors thank the nursing and medical staff involved in the data collection. Part of the results of the present manuscript was presented at the WorldCongress of Societies of Biological Psychiatry (2024, June 5–8, Istanbul, Turkey).

#### DATA SHARING STATEMENT

Data from PsyMetab cannot be publicly deposited due to participantconfidentiality purposes. Data from PsyMetab can be accessed after formal application and ethicalreview by the Ethics Committee of the Canton of Vaud. For further details: http://www.chuv.ch/cnp-psymetab.

#### AUTHOR CONTRIBUTIONS

CBE had full access to the data in the study and takes responsibility for its integrity and accuracy. Study concept and design was provided by CBE. Acquisition of data was provided by MP, NL, CG and by MPr, FG, KJP, AvG, PC, and by JL. MP, SR, MCS and ZK provided statistical analyses and interpretation. Drafting of the manuscript was provided by MP. Each author provided critical revision of the manuscript. CBE, PC and KJP obtained funding for the study. FG, AvG, PC, and CBE provided administrative, technical, or material support.

#### FUNDING

Swiss National Science Foundation (CE and PC: 320030-120686, 324730- 144064, and 320030-173211; CBE, PC and KJP: 320030-200602; ZK: 310030-189147).

#### **COMPETING INTERESTS**

CBE received honoraria for conferences from Forum pour la formation médicale, Janssen-Cilag, Lundbeck, Otsuka, Sandoz, Servier, Sunovion, Sysmex Suisse AG, Takeda, Vifor-Pharma, andZeller in the past 3 years. The authors declare no competing interests.

#### **ETHICS**

This study was carried out in accordance with the Declaration of Helsinki. The study protocol was approved by the Ethics Committee of Vaud (CER-VD).

#### **ADDITIONAL INFORMATION**

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41398-024-03177-3.

**Correspondence** and requests for materials should be addressed to Marianna Piras or Chin B. Eap.

Reprints and permission information is available at http://www.nature.com/ reprints

**Publisher's note** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

**Open Access** This article is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 International License, which permits any non-commercial use, sharing, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if you modified the licensed material. You do not have permission under this licence to share adapted material derived from this article or parts of it. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http:// creativecommons.org/licenses/by-nc-nd/4.0/.

© The Author(s) 2024