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## **Population Genetic-Based Pharmacokinetic Modeling of Methadone and Relationship with the QTc Interval in Opioid Dependent Patients**

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**Short tile: Methadone Population Pharmacokinetics, pharmacodynamics and pharmacogenetics**

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## **Abstract**

**Background and objectives.** Methadone is a  $\mu$ -opioid agonist widly used for pain treatment and for detoxification or maintenance treatment in opioid addiction. It has been shown to exhibit large pharmacokinetic variability and concentration-QTc relationships. In this study we investigated the relative influence of genetic polymorphism and of other variables on the dose-concentration-QTc relationship.

**Patients and methods.** A population model for methadone enantiomers in 251 opioid dependant patients was developed using non-linear mixed effect modeling (NONMEM®). Various models were tested to characterize the pharmacokinetics of (*R)-* and (*S)-*methadone and the pharmacokinetic-pharmacodynamic relationship, while including demographics, physiological conditions, comedications and genetic variants as covariates. Model-based simulations were performed to assess the relative increase in QTc with dose upon stratification based on genetic polymorphism.

**Results.** A two-compartment model with first-order absorption and lag time provided the best model fit for (*R)-* and (*S)-*methadone pharmacokinetics. (*S*)-methadone clearance was influenced by CYP2B6 activity, *ABCB1 3435C>T* and α-1 acid glycoprotein level while that of (*R*)-methadone by CYP2B6 activity, *POR\*28* and *CYP3A4\*22*. A linear model described the methadone concentration-QTc relationship, with a mean QTc increase of 9.9ms and 19.2ms per 1000ng/ml of (*R*)- and (*S*)-methadone, respectively. Simulations with different methadone doses up to 240mg/day showed that <1% of patients would present QTc above 470ms, but might reach 6-10% in patients with a genetic status associated with a decreased methadone elimination at doses exceeding 240 mg/day.

**Conclusion.** Risk factor assessment, electrocardiogram monitoring, and therapeutic drug monitoring are beneficial to optimize treatment in methadone patients, especially for those who have low levels despite high methadone doses or who are at risk of overdosing.

## **Key points**

- This study show that methadone enantionmers' concentration profiles are very variable and affect the QTc interval, which partially dependent on the patient's genetic status.
- QTc intervals predicted in this study according to patients' genetic factors confirm the need for electrocardiogram monitoring and arrhythmia risk factor assessment to improve methadone safety.
- Plasma methadone concentrations measurements by therapeutic drug monitoring may be beneficial to guide practitioners' dosing decisions, especially for those patients who have low levels despite high methadone doses or who are at risk of overdosing

## **Introduction**

Methadone is a  $\mu$ -opioid agonist used for more than 30 years for pain treatment, and for detoxification or maintenance treatment in opioid addiction. The World Health Organization has introduced this drug in the list of essential medicines in 2005 [1]. They are however numerous case reports, retrospective analyses and observational studies describing QT prolongation and torsade de pointes (TdP) in patients under methadone treatment, especially in those receiving high to very high doses of methadone [2].

Methadone is mainly administered as a chiral mixture of  $(R, S)$ -methadone. However the  $\mu$ opioid receptor activation is mostly due to *(R)-*methadone [3], while *(S)-*methadone is 3.5 times more potent in blocking the cardiac hERG channel, the latter being therefore at higher risk for prolonging the QT interval [4, 5]. The higher potential of the *(S)*-enantiomer to block the hERG channel was confirmed in opioid dependant patients in maintenance treatment in whom replacement of *(R,S)*-methadone by *(R)*-methadone led to a significant decrease of  $QT_c$  values[6]. However, as  $(R)$ -methadone is currently available in only a few countries, the prescription of *(R,S)*-methadone should in no way be limited when clinically indicated and well monitored.

The variability in methadone concentrations and effect relationship is very large. Pharmacokinetic variability has been attributed to cytochrome P450 (CYP) isoenzymes, mainly CYP3A4 and CYP2B6, and to P-glycoprotein (P-gp encoded by the ATP-binding cassette sub-family B member 1 (*ABCB1*) gene), the activities of which are genetically and environmentally determined [7]. In addition, stereoselective CYP2B6-mediated metabolism of (*S*)-methadone, as evidenced by previous in vitro/in vivo data [8-11], induces higher plasma concentrations of (*S*)- than (*R*)-methadone in CYP2B6 slow metabolizers [12, 13]. The *CYP2B6\*6/\*6* genotype represents about 6% of Caucasians and African-Americans, who could thus be at higher risk of developing cardiotoxicity. Cytochrome P450 reductase (POR) plays a major role in drug metabolism as all microsomal CYP receive electrons from nicotinamide adenine dinucleotidephosphate (NADPH) through POR [14]. A large number of *POR* SNPs have now been described, which might influence CYP activities and thus drug metabolism [14]. Although stereoselective pharmacokinetics of methadone, genetic influences on *(R)*- and *(S)*- methadone concentration and concentration-effect relationships have been already explored [15-17], the relative influence of genetic polymorphism and of other variables on the dose-concentration-QTc relationship remains to be investigated.

The objectives of the study were to characterize the population pharmacokinetics of (*R)-* and (*S*)-methadone, to identify genetic and non-genetic sources of variability and to relate methadone concentrations to QTc interval in a cohort of opioid dependant patients in methadone maintenance treatment. The model served to simulate (*R*)- and (*S*)-methadone concentration-QTc interval at various dosage regimen of methadone according to the genetic status in order to quantify the expected increase of QTc in the different groups.

## **Materials and methods**

#### **Study population**

Plasma *(R)-* and *(S)-*methadone levels, measured by liquid chromatography coupled with mass spectroscopy [18], and QTc measurements were obtained from 244 opioid-dependent patients in 5 methadone-dispensing centers in Geneva, Lausanne, Bern, and Montreux, Switzerland [7]. Steady-state concentration samples with matched QTc interval determinations (Fridericia-corrected) were collected around peak (4h) and/or trough (24h) drug levels. In addition, seven opioid-dependent patients taking part in an interaction study [19] provided 11 *(R)*- and *(S)*-methadone concentrations per patient, measured by liquid chromatography coupled with ultraviolet detection [20] , collected between 0.5 and 23 h post dose under steady-state conditions. Mean (± SD) methadone dose was 123 (± 75) mg (range 3-400 mg) and was given once or twice daily. The ethics committees of the corresponding centers approved the project and all participants gave written informed consent for genetic testing.

## **Analytical method**

## **Genotyping**

Genomic DNA was extracted from EDTA blood samples with the FlexiGene DNA Kit (Qiagen, Hombrechtikon, Switzerland). All the SNPs, with the exception of *CYP2D6\*5*, *CYP2D6\*xN* and *CYP3A4\*22*, were detected by real-time polymerase chain reaction (PCR) with the use of 5'-nuclease allelic discrimination assays (ABI PRISM 7000 Sequence Detection System, Applied Biosystems, Rotkreuz, Switzerland) with primers and probes obtained from Applied Biosystems. The tested genetic polymorphisms are listed in **Table 2**  and were analyzed as previously described except for *CYP3A4\*22* [7, 21-23]. *CYP3A4\*22* was genotyped with a custom Illumina iSelect genotyping array on an iScan equipped platform (Illumina, San Diego, California). Quality control was assessed by the call rate (>96%), GC score (>0.15) and matched gender. Genetic data was called by using GenomeStudio software (version 2011.1, Illumina, San Diego, California).

## **Model-based pharmacokinetic modeling**

The model building process consisted of: (i) a population pharmacokinetic model for *(R)-* and *(S)-*methadone using rich sampling data; (ii) an extension to the whole dataset while taking into account potential influencing variables; (iii) a simultaneous pharmacokineticpharmacodynamic (PK-PD) analysis for the concentration-QTc interval relationship evaluation.

## **Structural models**

A stepwise procedure was used to find the models that fitted methadone data at best. The final pharmacokinetic model was a two-compartment model with first-order absorption and lag time for both drugs. The estimated parameters are clearance (CL), volume of distribution of the central compartment (Vc), volume of distribution of the peripheral compartment (Vp), intercompartmental clearance (Q), absorption rate constant (ka) and lag-time (Tlag). Since

methadone was only administered orally, CL, Vc, Vp and Q represent apparent values. Methadone was given as a racemic mixture composed of 50:50 of both enantiomers, and methadone dose was reduced by half by fixing the relative bioavailability to 0.5 for the separate analysis of each moiety. Exponential errors following a lognormal distribution with mean zero and variance  $\omega^2$  were assumed for the description of the interindividual variability. A proportional error model was used to model the residual variability with mean zero and variance  $\Sigma^2$ . Methadone elimination half-lives (t½ $\alpha$  and t½ $\lambda$ ), volume of distribution at steadystate (Vd<sub>ss</sub>) and mean absorption time (MAT=  $1/ka + lag-time$ ) were derived using classical equations.

## **Covariate models**

The available covariates were demographics (sex, body weight, race), physiopathological (α1-glycoprotein, albumin), environmental (smoking, co-medications) (**Table 1**) and tested genetic polymorphisms (**Table 2**). The potential influence of available covariates were explored graphically and then tested for significance into the model. The typical value of a parameter was modeled to depend on a covariate (continuous variables centered on the mean; categorical covariates being coded as indicator variables 0 or 1), testing linear and non-linear relationships, as appropriate. Comedications were classified into inducers or inhibitors of CYP3A4 and CYP2B6 and inhibitors of CYP2D6 [24-27] (Table 1). Comedications potentially affecting the QT intervals were categorized as drugs with a known, possible or conditional risk of torsade de pointes according to CredibleMeds.org [28] and patients were grouped according to their highest risk comedication. Genetic variants were classified into 3 groups: reference allele (Ref), heterozygote (Het) loss/decrease/gain of function (LOF/DOF/GOF) and homozygote (Hom) LOF/DOF/GOF variants. LOF and DOF alleles will be defined as DOF thereafter. An activity score for *CYP2B6* was derived to test for the effect of a combination of *CYP2B6\*6, \*5* and \**11* alleles. In this model, a score of 2 was attributed to fully functional alleles *CYP2B6\*1/1, \*5/\*5, \*1/\*4, \*1/\*5, \*4/\*5,* a score of 1 to *CYP2B6\*1/\*11, \*1/\*6, \*4/\*6, \*5/\*6* and a score of 0 to *CYP2B6\*6/\*6* and *\*6/\*11*. The relationship between methadone CL and the number of functional alleles was first tested using a rich model (eq.1) and competing models that accounted for gene effect as a function of the number of functional alleles using linear (eq.2), power (eq.3) and square root (eq.4) relationships with either additive or proportional (not shown) effect, as follows:

$$
CL = CL_0 \cdot (1 + \theta_1 I_1) \cdot (1 + \theta_2 I_2) \tag{1}
$$

$$
CL = CL_0 + \theta_1 \cdot n \tag{2}
$$

$$
CL = CL_0 + \theta_1^{n}
$$
 (3)

$$
CL = CL_0 + \theta_1 \sqrt{n} \tag{4}
$$

where  $n = 1$ , 2 represents the functional score and  $\theta_1$  the average contribution per active allele above the clearance level of Hom DOF individuals (CL*0*). The joint influence of functional alleles on methadone CL was first tested using pair-wise conjunction of *CYP2B6* with the other *CYP* alleles, to finally build up the model including all influent genetic variants. The impact of functional alleles on methadone CL was further explored using the dominant (Hom/Het DOF vs. Ref alleles) and recessive (Hom DOF vs. Het DOF/Ref alleles) models.

The investigation of the joint influence of *CYP2B6* and *ABCB1 3435C>T* alleles is shown as an example. The richest model was:

$$
CL = CL_0 + \theta_{01}I_{01} + \theta_{02}I_{02} + \theta_{10}I_{10} + \theta_{11}I_{11} + \theta_{12}I_{12} + \theta_{20}I_{20} + \theta_{21}I_{21} + \theta_{22}I_{22}
$$
(5)

where here CL<sub>0</sub> is CL in individuals Hom DOF for both genes and  $I_{ii}$  is an indicator variable that takes the value of 1 if the individual carries the *CYP2B6* i<sup>th</sup> genotype and the *ABCB1* 3435C>T j<sup>th</sup> genotype and is "0" otherwise, and each  $\theta_{ij}$  estimate the absolute change in CL among the different genotypic groups. The following competing models were evaluated:

$$
CL = CL_0 + \theta_1 \cdot \sqrt{p} + (\theta_2 I_1 + \theta_3 I_2)
$$
\n<sup>(6)</sup>

$$
CL = CL_0 + \theta_1 \cdot \sqrt{p} + (\theta_2 \cdot n) \tag{7}
$$

$$
CL = CL_0 + \theta_1 \cdot \sqrt{p} + \theta_2 \cdot \sqrt{q} \tag{8}
$$

where *p* indicates the functional score for *CYP2B6* and *q* the score for *ABCB1 3435C>T*. In eq.6, the contribution of *ABCB1 3435C>T*  $(\theta_2, \theta_3)$  is investigated using all genetic groups on *CYP2B6* polymorphism and in reduced models and testing linear (eq.7) and square root functions (eq.8) for both genes.

## **Concentration-QTc modeling**

The relationship between methadone concentrations and the Fridericia heart-rate corrected  $QT<sub>c</sub>$  [29] interval were explored using linear and log-linear models of the general form:

$$
QTc_{ij} = Intercept_i + Slope_i \cdot Conc_{ij} + \varepsilon_{ij}
$$
\n(9)

where Slope<sub>i</sub> and Intercept<sub>i</sub> are the slope and the intercept for the i<sup>th</sup> individual and QTc<sub>ii</sub> and is the Fridericia's corrected QT interval and Conc<sub>ii</sub> methadone concentration for the i<sup>th</sup> individual and the j<sup>th</sup> time point. The residual variability,  $\varepsilon_{ij}$ , was included assuming an additive error with mean zero and variance  $\Sigma^2$  and an interindividual variability on the slope and intercept was tested assuming a normal distribution with mean zero and variance  $\omega^2$ . Available potentially influencing factors on the QTc interval were sex, potassium and calcium levels, comedications affecting the QTc interval and were included in the model using linear functions.

#### **Parameter Estimation and Selection**

NONMEM® [30](version 7.2, NM-TRAN, version II) was used with the FOCE INTERACTION method to fit the data. The minimum objective function value (ΔOF) provided by NONMEM<sup>®</sup>, (-2 log likelihood, approximate  $\chi^2$  distribution) was used to discriminate between hierarchical models using the log likelihood test. A model was considered superior to another nested model when the OFV value was reduced by at least 3.84 points (p< 0.05). Covariate analysis comprised forward selection of influential factors followed by backward deletion and were

retained in the final model at the statistical level of p < 0.01. The most appropriate model for the concentration-QTc relationship was selected based on Akaike information criteria and the log likelihood test for the influence of covariates. Model assessment was based on diagnostic plots along with the measure of the standard errors, the correlation matrix of parameter estimates, the size of residual errors and eta-shrinkage.

## **Model validation**

The stability and the performance of the final population pharmacokinetic model were validated by the bootstrap method using 2000 bootstrap resampling with replacement (Perlspeaks-NONMEM version 3.2.4 (http://psn.sourceforge.net/)). The median and the 95% confidence interval of each parameter obtained with the bootstrapped data were compared to the parameters of original dataset. In addition, simulations were performed in 1000 to predict the 2.5<sup>th</sup>, 50<sup>th</sup> and 97.5<sup>th</sup> percentiles of the concentrations and QTc intervals and compared with observed data. The figures were generated using GraphPad Prism (Version 4.00 for Windows, GraphPad Software, San Diego California USA, (www.graphpad.com).

## **Simulations**

Simulations for *(R)- and (S)-*methadone plasma and QT interval were performed in 1000 individuals for doses ranging from 80 mg to 280 mg once daily at steady-state. The volume of distribution of (*S)*-methadone was fixed for a typical patient with a median AAG level of 0.97 g/L. A "lowest" CL and "best" CL value were calculated for *(R)*- and *(S)*-methadone stratified according to the genetic status. Average QT interval predictions with the 95% prediction intervals (PI<sub>95%</sub>) for each dosage regimen were retrieved. In addition, the percentage of patients with absolute QT above the thresholds of >450 ms and > 470 ms associated with an increased risk of cardiotoxicity was derived.

**Prediction of** *(R,S)-***methadone plasma concentration threshold for QTc prolongation risk** 

Receiver operating characteristic (ROC) analyses and graph were performed using GraphPad Prism (Version 6.05 for Windows, GraphPad Software, San Diego California USA, www.graphpad.com) to predict a threshold of *(R,S)-*methadone plasma concentration for increased risk of QTc above 450 ms.

## **Results**

A total of 504 *(R)-* and *(S)-*methadone plasma concentrations and 317 QTc intervals were used for the analysis. A summary of the population characteristics and of the tested genetic polymorphisms are presented in **Tables 1 and 2**.

#### **Population Pharmacokinetic Analysis**

**Structural model for** *(R)-* **and** *(S)-***methadone.** Analyses from 7 individuals with rich sampling showed that a two-compartment model with first order absorption fitted the data better than a one-compartment model for both enantionmers (∆OF>-23;p<0.001); the addition of a lag time significantly improved the fit for both compounds (∆OF>-34;p<0.001). In addition to CL, assignment of an interindividual variability on Ka improved the fit for (*R)-* (∆OF=- 43;p<0.001) and *(S)-*methadone (∆OF=-37;p<0.001), as well as on Q for the latter (∆OF=-7;p<0.01). This model adequately fitted (*R)-* and *(S)-*methadone concentrations of the whole population. The lack of drug level measurements during the absorption phase prevented from a precise estimation of Ka; this parameter and the lag time were thus fixed to the estimates from the rich data analysis. Addition of an interindividual variability on Vc and Q (∆OF>-34;p<0.001) improved the description of both enantiomers' data, with a correlation between CL and Vc (ΔOF>-12;p<0.01). Allowing Ka and the peripheral volume of distribution (Vp) to vary did not improve the model fit (∆OF>-1.2).

**Covariate modeling on** *(S)-***methadone**. Among the non-genetic covariates, only α-1 acid glycoprotein (AAG) concentrations influenced Vc (∆OF=-12.8;p<0.001), indicating a 25% increase in volume upon AAG doubling.

Univariate analyses testing the influence of genetic polymorphisms revealed that *CYP2B6\*6* had a marked impact on (*S*)-methadone elimination (∆OF=-14.0,p<0.001), with an estimated CL of 10.6 l/h, 9 l/h and 6.6 l/h in Ref, Het decrease of function allele (DOF) and Hom DOF patients, respectively. A trend for an influence of the *CYP2B6 rs2279344* polymorphism was found (∆OF=-3.8,p=0.051), suggesting a 14% decrease in *(S)-*methadone CL in Hom DOF carriers compared to the other groups. *CYP2B6\*11* (∆OF=-2.4;p=0.12), and *CYP2B6*\**5* (∆OF=-0.7;p=0.4) did not show any influence. The use of an activity score combining *CYP2B6\*6, \*5 and \*11* improved the fit (∆OF=-20.4;p<0.001), providing very close estimates of CL to the model including *CYP2B6\*6* solely, and was retained for further analyses. The relationship between CL and the number of *CYP2B6* functional alleles could adequately be described by a square root model (eq.4). This model estimated a CL of 6.2 l/h in Hom DOF patients that increased by 3.1 ∙ √݊ (n=number of functional allele). Polymorphism in *POR\*28* showed a significant influence on CL (∆OF=-4.1;p<0.05); a 20% increase in *(S)-*methadone CL in Hom gain of function allele (GOF) (*POR\*28 TT*) compared to Ref and Het GOF patients was observed. *CYP3A4\*22* Het DOF was associated with a non-significant 15% decrease in *(S)*-methadone CL (∆OF=-3,p=0.08). Variations in the *ABCB1 3435C>T* (∆OF=- 5.9;p<0.05), *2677G>T/A* (∆OF=-7;p<0.01), *61A>G* (∆OF=-4.5;p<0.05) and *1199G>A* (∆OF=- 9.2;p<0.01) significantly affected *(S)-*methadone CL. Patients carrying two variant alleles of these polymorphisms had a 15 to 30% higher methadone elimination compared to Het DOF and Ref patients. *CYP3A5\*3* did not show any influence on *(S)*-methadone CL (∆OF=- 2.4;p=0.12). No other genetic polymorphism showed any influence.

Stepwise inclusion of the significant genetic variants in the multivariate analyses identified *CYP2B6* activity score and *ABCB1 3435C>T* polymorphism as significant covariates on CL. Both allele influences were best captured using a square root model for *CYP2B6* functional alleles with an additional influence of *ABCB1 3435C>T* for Hom DOF carriers of this gene (eq. 6). No statistical difference in CL between *ABCB1 3435C>T* Het DOF and Hom DOF stratified for *CYP2B6* was observed, and both linear (eq. 7) and square root models (eq.8) described the data as well (∆OF< -0.7)*.* All other significant allelic variants were correlated to both genes and did not remain statistically significant. The influence of AAG levels on Vc was retained in the final model. This final model explained 4%, 16% and 7% of the interindividual variability on CL, Vc and Q, respectively.

**Covariate modeling on** *(R)-***methadone.** No non-genetic factors showed any influence on *(R)-*methadone disposition. Inclusion of *CYP2B6\*6* (∆OF=-7.0;p<0.01) and *CYP2B6* activity score (ΔOF=-7.5;p<0.01) improved the description of *(R)*-methadone elimination. These models estimated a CL of 10.4 l/h, 9.5 l/h and 8.0 l/h in Ref, Het DOF and Hom DOF patients, respectively. The use of a square root model according to the number of functional alleles fitted the data as well as the rich model, with a CL of 7.9 l/h in Hom DOF that increased by 1.7  $\sqrt{n}$ . A significant influence of the *CYP2B6 rs8192719* polymorphism was found (∆OF=-7.9; p<0.01), but not of the *CYP2B6 rs2279344* (∆OF=-3.5;p=0.061). Variations in the *POR\*28* (∆OF=-7.1;p<0.01) and *CYP3A4\*22* (∆OF=-5.0;p<0.05) influenced the model fit, revealing an increase in CL by 14% in Het or Hom GOF carriers of *POR\*28* and a decrease of 22% in Het DOF *CYP3A4\*22* compared to the Ref groups. *CYP3A5\*3* did not show any influence on *(R)*-methadone CL (∆OF=0). No other genetic polymorphism showed any influence.

The *CYP2B6* activity score, *POR\*28* and *CYP3A4\*22* remained statistically significant in the multivariate analysis. *CYP2B6 rs8192719* was not retained due to a strong linkage with *CYP2B6*\**6.* The joint effect of the three alleles was best fitted using an additive model (eq. 6), with no further improvement while using competing models (eq. 7 or eq. 8). This final model explained 5%, 6% and 16% of the interindividual variability on CL, Vc and Q, respectively.

## **Methadone concentration-QTc interval Analysis**

The concentration-QT<sub>c</sub> interval relationship was fitted using a linear model, with no difference observed using a log-linear model (∆OF<-1.83). The assignment of an interindividual variability on the intercept parameter improved significantly the fit (∆OF=-62 for *(R)-* and ∆OF=-64 for *(S)-*Methadone;p<0.001), but no variability on the slope parameter was found (∆OF=0). A slightly non-significant higher intercept QTc level of about 3 ms was observed in women compared to men and no difference in slope was observed (∆OF>-2). Neither potassium, nor calcium levels significantly influenced the concentration-QTc relationship (∆OF>-1.3), nor did comedications at risk of QTc prolongation. The final population parameters are presented in **Table 3**. Goodness-of-fit plots are presented in **Supplementary Figure 1**.

#### **Model Validation**

The median parameter estimates obtained with bootstrap with the 95% confidence interval (CI) are presented in **Table 3**. The parameter estimates of the final population pharmacokinetic model lied within the 95% CI of the bootstrap results suggesting that the model was acceptable. The visual predictive check of the observed methadone concentrations versus time and the concentration-QTc plots is shown in **Figure 1**.

#### **Simulations**

Simulations of (*R*)- and (*S*)-methadone concentrations for 80 mg to 320 mg once daily assuming a "best" and "lowest" elimination of each enantiomer according to influencing genetic effects are shown in **Figure 2**. The probability of the  $QT_C$  value being above the 450 ms threshold is increased by 1.5 to 2 times depending on the genotypic status. Less than 4% of patients would present QTc above 450 ms at the dose levels below or equal to 160 mg daily, but this number might increase up to 10% for patients at doses exceeding 240 mg/day with a genetic status associated with a decreased methadone elimination, particularly observed for *(S)-*methadone. Less than 1% of patients would present QTc values above 470 ms according to our model.

## **Prediction of** *(R,S)-***methadone plasma concentration threshold for QTc prolongation risk**

The ROC analysis indicates that a plasma concentration of *(R,S)*-methadone above 656 ng/ml is the best predictor for a QTc above 450 ms (**Supplementary Figure 2;**  sensitivity=79%; specificity=68%; ROC AUC=0.69  $\pm$  0.06; 95%CI=0.57-0.81, p=0.01).

## **Discussion**

We developed a population pharmacokinetic-pharmacodynamic model for methadone in a cohort of opioid patients, and could quantify the relative contribution of genetic and nongenetic factors affecting drug disposition, its consequences on the QTc interval and predict QTc increase according to dose and patients' genetic status.

Estimates of (*R*)- and (*S*)-methadone pharmacokinetic parameters are in good accordance with previous results [16, 17]. No demographic covariates showed any influence on these compounds' kinetics, except for an influence of AAG on the volume of distribution of (*S*) methadone. The lack of influence of protein binding on (*R*)-methadone could be related to a lower protein binding of this enantiomer [31]. As expected, a marked interindividual variability in methadone pharmacokinetics was observed, even more pronounced for (*S*)-methadone. This large variability is typical of drugs that are metabolized by polymorphic enzymes such as CYP3A4 and CYP2B6. Few strongly interacting co-medications were taken by patients, thus reducing the power to detect any influence of comedications. Since CYP2D6 seems only moderately involved in methadone metabolic pathway [7, 32] an influence of CYP2D6 inhibitors was not expected.

A genetic influence of *CYP2B6\*6* was observed on both enantiomers, with a more important effect on (*S*)-methadone. Its clearance is reduced by 37% in *CYP2B6* Hom DOF carriers, whereas (*R*)-methadone clearance is decreased by 21%. These data confirm the stereoselectivity of the CYP2B6 isoform for (*S*)-methadone, previously reported [8, 10-13, 17, 33]. The lack of influence of *CYP2B6\*11* could be explained by its low minor allele frequency (0.8%). *CYP2B6\*5* was also not found to influence methadone elimination in agreement with an *in vitro* moderately decreased activity [33], despite the recent finding of its overrepresentation in a group of patients with low methadone concentration (thus suggesting an increased CYP2B6 activity) [22]. We therefore defined the CYP2B6 activity score by combining *CYP2B6\*6*, *\*11 and \*5*, the major known DOF and loss of function (LOF) alleles of *CYP2B6* in Caucasians.

We report in the present study for the first time a decrease in methadone clearance in carriers of the *CYP3A4\*22* allele. This variant was previously shown to affect CYP3A4 mRNA expression and enzyme activity, the mutant carriers presenting approximately 2.5-fold lower CYP3A4 activity [34], which was verified by CYP3A-phenotyping probes midazolam and erythromycin [35]. In univariate models, the *CYP3A4\*22* allele significantly decreased *(R)*-methadone clearance (-23%) and non-significantly *(S)*-methadone clearance (-15%). This small difference is most likely due to the stronger influence of CYP2B6 on *(S)* methadone rather than a real stereoselectivity of CYP3A4. The lack of CYP3A4 stereoselective metabolism of methadone has been previously shown *in vivo* [7] and *in vitro* [8, 10, 11]. On the other hand, *CYP3A5\*3* did not seem to influence either *(S)*- or *(R)* methadone elimination, in accordance with *in vitro* [9] and *in vivo* results [7].

An increase in both enantiomers' elimination in *POR\*28* Het or Hom carriers was observed in univariate analyses. This is in accordance with the increased CYP3A activity observed by midazolam phenotyping in *POR\*28* Hom GOF carriers [21, 36]. Conflicting results were also found [37, 38], which might suggest substrate specific-effects of POR variants on CYP3A activities [14]. In multivariate analyses, the influence of the *POR\*28* polymorphism was only observed for *(R)-*methadone, possibly due to the more important contribution of CYP2B6 to *(S)-*methadone thus masking the POR influence.

Methadone is a substrate and inhibitor of the PgP coded by the *ABCB1* gene. We observed a small reduction in (*S*)-methadone clearance in carriers of one or two DOF alleles of the gene, whereas no effect was found for (*R*)-methadone. These results are in agreement with an *in vitro* experiment suggesting a weak stereoselectivity for the transport of the *(S)* enantiomer [39]. Moreover, a recent population pharmacokinetic study also found an association of *ABCB1 2677G>T/A* with a 20% reduction of the clearance of (*R*)- and (*S*) methadone, but did not observe any stereoselectivity [17].

The concentration-QTc relationship indicate that mean QTc is increased by 9.9 ms and 19.2 ms per 1'000 ng/ml of (*R*)- and (*S*)-methadone, respectively, in line with previously reported values of 17 ms for the racemate (CI<sub>90%</sub> 12-22) [15]. The magnitude of the effect is small and of modest clinical relevance at low methadone dosage. The range of QTc interval measured in our population was slightly higher than in the Framingham study [40] but did not include extreme QTc values, which might explain the modest concentration-effect relationship*.* Our results however suggest a more pronounced QTc increase with *(S)-*methadone, and confirm the more potent inhibition of the hERG channel by this enantiomer [4]. Considering that both enantiomers' concentrations can increase in patients with a genetic-related poor elimination profile and the confirmed link between exposure and the risk of QTc prolongation, the need for caution is reinforced, especially at higher methadone dosage. This need for caution has been confirmed by recent studies on drug-induced QTc prolongation. A large study on the prevalence of drug-induced long QT in adult psychiatric patients reported that prolonged QTc was significantly associated with methadone, which was the most frequent drug among patients with drug-induced long QT [41]. Furthermore, among the reported 12 cases of sudden death and/or torsade de pointes (TdP), seven patients had received methadone. In another study aimed to determine the associated factors for prolonged QTc and the development of TdP, methadone was by far the leading medication implicated in the development of TdP and an independent predictor in both univariate and multivariate analyses despite the fact that it was not the most common QT-prolonging medication in their population [42].

One limitation of our study is that the relationships between both enantiomers and QTc could only be described with a linear relationship. QTc measurements were performed at two times post-drug intake, which prevented from the possibility to characterize the full pharmacokinetic-pharmacodynamic relationship and the relative increase in QTc interval after dose administration. Sex, calcium and potassium levels did not influence QTc in this study, neither did co-adminstration of drugs at risk for QT prolongation. Potassium and calcium levels were in the normal range, which might have limited to detect any association. Only few drugs with known risk of torsade de pointes were prescribed in this population and the influence of these drugs is expected to be modest within the normal range of QTc interval. Other patient's risk factor, such as the use of illicit hERG blockers were not accounted for in our model, which is another study limitation.

As previously reported [15], a simulation approach allowed to describe the concentration- QT interval relationship, while integrating for the first time genetic influence on methadone elimination. Patients carrying mutation of the *CYP2B6\*6* are at risk of exhibiting high methadone concentrations, in particular *(S)-*methadone, and QTc prolongation above the 450 ms threshold. This risk is even more pronounced in case of additional variation such as *CYP3A4\*22* and *ABCB1 3435C>T* affecting *(R)-* and *(S)-*methadone elimination, respectively. Variation in the *POR\*28* would only partly compensate for a CYP2B6 associated reduced *(R)-*methadone elimination.

The ROC analysis predicted a threshold of 656 ng/ml *(R,S)*-methadone plasma concentration for QTc prolongation above 450 ms. This value should be considered cautiously as only 14 values of QTc (among 317) were above 450 ms but is close to the clinically determined threshold of 800 ng/ml previously proposed [31].

Despite an important influence of CYP2B6 polymorphisms and other genes, the major part of methadone pharmacokinetic variability remains unexplained. The very large variability in plasma methadone concentrations renders the dose-concentration relationship difficult to predict. Plasma methadone concentrations measurements by therapeutic drug monitoring may be beneficial to guide practitioners' dosing decisions, especially for those patients who have low levels despite high methadone doses or who are at risk of overdosing (i.e poor metabolizer status, high methadone dose or suspicion of a drug-drug interaction). As previously reported, trough plasma concentrations of 250 ng/ml for *(R)*-methadone or 400ng/ml for *(R,S)*-methadone might be used as target values in cases of nonresponse [31]. Due to the widely unexplained pharmacokinetic variability and the fact that pharmacodynamic pathway–related genes in the heart and other factors such as electrolyte disturbances may also be important, our data confirm the need for electrocardiogram monitoring and arrhythmia risk factor assessment as determined in clinical practice for patients receiving doses above 100 or 120 mg/day [43, 44] or for unusual situation with trough *(R,S)*-methadone plasma concentrations above 660-800 ng/ml [31].

#### **Compliance with ethical standards**

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**Conflict of interest :** CBE has received research support from Takeda and from the Roche Organ Transplantation Research Foundation in the past 3 years. He has received honoraria for conferences or teaching CME courses from, Astra Zeneca, Janssen-Cilag, Lundbeck, Merck Sharp & Dohme, Mepha, Otsuka, Sandoz, Servier, and Vifor-Pharma in the past 3 years.

CC, SC, MG declare that they have no conflict of interest that might be relevant to the contents of this manuscript."

## **Legend to figures**

**Figure 1 :** (*R*)- and (*S*)-methadone plasma concentration-time profile (stratified for a 100 mgdaily steady-state dose)(upper panels); QTc vs. time (middel panel) and observed concentration vs. QTc (lower panels), with population prediction (solid line) and 95% prediction interval (dashed lines).

**Figure 2 :** Model-based predicted percentage of patients with QT<sub>C</sub> value above the threshold value of 450 ms (solid lines) and 470 ms (dashed lines) for different methadone daily doses and stratified according to the genetic effect for **(A)** (*R*)-methadone and **(B)** (*S*)-methadone. Black symbols: « best » *(R)-* or *(S)-*methadone clearance and white symbols: «lowest» *(R)*  or *(S)-*methadone clearance based on the final model estimates. For (*S*)-methadone, the "lowest" CL value is a *CYP2B6* activity score of 0 (decrease of function allele; DOF) and *ABCB1 3435 CC or CT* (CL= 6.14 L/h) and the « best » CL value is a *CYP2B6* activity score of 2 (reference allele; Ref) and *ABCB1 3435 TT* (CL=11.65 L/h). For (*R*)-Methadone, the "lowest" CL is a *CYP2B6* activity score of 0 (DOF), *POR\*28* (homozygote gain of function allele; GOF) and *CYP3A4\*22* heterozygote DOF (CL=7.53 L/h) and the "best" CL is a *CYP2B6* activity score of 2 (Ref), *POR\*28* Ref and *CYP3A4\*22* Ref (CL=10.97 L/h).

**Supplementary Figure 1**: Goodness-of-fit plots for **A :** (*R*)-methadone and **B :** (*S*) methadone population and individual pharmacokinetic and QTc predictions vs observations and conditional weighted residuals (CWRES) vs. time after last dose.

**Supplementary Figure 2** : Receiver Operating Characteristic (ROC) curve indicating the best *(R,S)*-methadone plasma concentration threshold to predict a QTc prolongation above 450 ms. \**(R,S)*-methadone plasma concentration value; sensitivity and specificity enclosed in parentheses.

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**Table 1:** Demographic characteristics of the study population.





Abbreviations : AST, aspartate aminotransferase ; ALT, alanine amino transferase ; **-**GT, gamma glutamyl transferase ; CYP, cytochrome P450.

#### **Comedications affecting the PK** [26-27]

CYP3A4 strong inhibitor: nefadozone (n=1)

CYP3A4 weak inhibitors : efavirenz (n=2), fluoxetine (n=10), fluvoxamine (n=3), quetiapine (n=8), valproate (n=6), desogestrel and/or ethinylestradiol (n=2)

CYP3A4 and CYP2B6 strong inducers : carbamazepine (n=1), efavirenz (n=2), St John's wort (n=1)

CYP3A4 weak inducers : topiramate (n=10)

CYP2B6 weak inhibitors : efavirenz (n=2)

CYP2D6 strong inhibitors : bupropion (n=1), fluoxetine (n=10), paroxetine (n=10), levomepromazine  $(n=5)$ , metoclopramide  $(n=2)$ , thioridazine  $(n=4)$ 

CYP2D6 weak inhibitors : citalopram (n=9), escitalopram (n=12), fluvoxamine (n=3), haloperidol (n=1), hydroxyzine (n=1), nefadozone (n=1), quetiapine (n=8), risperidone (n=5), sertraline (n=4), venlafaxine  $(n=5)$ 

#### **Comdedications affecting the QT** [28]

Known risk: haloperidol (n=1), astemizole (n=1), thioridazine (n=4), citalopram (n=13)

Possible risk: venlafaxine (n=5), olanzapine (n=15), mirtazapine (n=32), tizanidine (n=1), quetiapine (n=8), risperidone (n=4), aripiprazole (n=1), trimipramine (n=1).

Conditional risk: paroxetine (n=10), chloral hydrate (n=10), fluoxetine (n=7), hydroxyzine (n=1), loperamide  $(n=1)$ , pantoprazole  $(n=2)$ , sertraline  $(n=4)$ , amisulpride  $(n=3)$ , doxepine  $(n=1)$ .

**Table 2 :** Summary of the tested genetic polymorphisms in the study population (decrease or loss of function (LOF/DOF) and gain of function (GOF).



Abbreviations. LOF: loss of function; DOF: diminished function; GOF: gain of function; Ref: Reference, Het: heterozygote, Hom: homozygote.<br># Combination of *CYP2B6\*6, \*5* and *\*11* alleles: a score of 2 (Ref) was attributed to fully functional alleles

(*CYP2B6 \*1/\*1, \*1/\*4, \*1/\*5, \*4/\*5, \*5/\*5),* a score of 1 (Het LOF/DOF**)** to *CYP2B6 \*1/\*11, \*1/\*6, \*4/\*6,* 

*\*5/\*6* and a score of 0 (Hom LOF/DOF) to *CYP2B6 \*6/\*6* and *\*6/\*11*. § Ref genotype corresponds to *CYP3A5 \*1/\*1*, Het LOF to *CYP3A5 \*1/\*3* and Hom LOF to *CYP3A5 \*3/\*3.*  ° Effect might be substrate-dependant.

**Table 3:** Final population pharmacokinetic and pharmacodynamics parameters for *(R)-* and *(S)-*methadone with the parameters obtained from the 2000 bootstrapped samples.





Final model for (*R*)-methadone:  $TVCL = CL + \theta_{CLCYP2B6} \cdot \sqrt{n} \quad + \theta_{CLPOR*28\,TT/CT} \quad + \theta_{CLCYP3A4*22\,CT} \quad ;$ and for (*S*)-methadone  $TVCL = CL + \theta_{CLCYP2B6} \cdot \sqrt{n} \ +theta_{CL\ ABCB1\ 3435\ CC/CT}$ 

Abbreviations: TV, typical population value; CL, clairance; Q intercompartmental CL;  $V_c$  and Vp, volume of distribution of the central et peripheral compartment, respectively; ka, absorption rate constant; Tlag, lag time in drug absorption;  $\theta_{\text{AAG}}$  relative contribution of  $\alpha$  acid-glycoprotein (AAG) on the volume of distribution;  $\theta_{CLCYP2B6}$  relative contribution of cytochrome 2B6 coded as an activity score (see text) on CL;  $\theta_{CL POR28 TTCT}$  relative contribution of cytochrome *POR\*28* heterozygotes and homozygotes on CL; θ<sub>CL ABCB1</sub> 3435 CC/CT, relative contribution of *ABCB1* 3435 C>T heterozygotes and homozygotes on CL; θ<sub>CL CYP3A4\*22 CT;</sub> relative contribution of *CYP3A4\*22* heterozygotes on CL.

<sup>a</sup> Relative standard error of estimates (RSE), calculated as SE/estimate.

**b** Coefficient of variation, calculated as  $\sqrt{e^{(\omega^2)-1}}$ .

<sup>c</sup> Relative standard error of the estimates, calculated as SE/RSE with SE=  $(SE^{(\omega^2)}/2\sqrt{\omega})$ .

<sup>d</sup> Coefficient of variation, calculated as  $\sqrt{e^{(\sigma^2)-1}}$ .

#### *Clinical Pharmacokinetics*

## **Population Genetic-Based Pharmacokinetic Modeling of Methadone and Relationship with the QTc Interval in Opioid Dependent Patients**

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## A. (*R*)-methadone



B. (*S*)-methadone



## *Clinical Pharmacokinetics* **Population Genetic‐Based Pharmacokinetic Modeling of Methadone and Relationship with the QTc Interval in Opioid Dependent Patients** Chantal Csajka<sup>1,2</sup>, Séverine Crettol<sup>3</sup>, Monia Guidi<sup>1,2</sup>, Chin B Eap<sup>3,1</sup>

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