Pharmacokinetic Modeling of Warfarin II – Model-based Analysis of Warfarin Metabolites following Warfarin Administered either Alone or Together with Fluconazole or Rifampin

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Abbreviations:

CYP: cytochrome P450

DDI: drug-drug interaction

TMDD: target mediated drug disposition

PK: pharmacokinetic

PD: pharmacodynamic

CL: clearance

CL_f: formation clearance

CL_R: renal clearance

IRB: institutional review board

EBE: empirical bayes estimate

OFV: objective function value

IIV: inter-individual variability

LD: linkage disequilibrium

RUV: residual unexplained variability

V_d: volume of distribution

EM: expectation-maximization

BQL: below the quantification limit

IMP: importance sampling

RSE: relative standard error

SIR: sampling importance resampling

VPC: visual predictive check

CI: confidence interval

LLOQ: lower limit of quantification

Abstract

The objective of this study is to conduct a population pharmacokinetic (PK) model-based analysis on 10 warfarin metabolites (4'-, 6-, 7-, 8- and 10-hydroxylated (OH)-S- and Rwarfarin), when warfarin is administered alone or together with either fluconazole or rifampin. One or two compartment PK models expanded from target mediated drug disposition (TMDD) models developed previously for warfarin enantiomers were able to sufficiently characterize the PK profiles of 10 warfarin metabolites in plasma and urine under different conditions. Modelbased analysis shows CYP2C9 mediated metabolic elimination pathways are more inhibitable by fluconazole (% formation CL (CL_f) of 6- and 7-OH-S-warfarin decrease: 73.2% and 74.8%) but less inducible by rifampin (% CL_f of 6- and 7-OH-S-warfarin increase: 85% and 75%), compared with non-CYP2C9 mediated elimination pathways (% CL_f of 10-OH-S-warfarin and CL_R of S-warfarin decrease in the presence of fluconazole: 65.0% and 15.3%; % CL_f of 4'- 8and 10-OH-S-warfarin increase in the presence of rifampin: 260%, 127% and 355%), which potentially explains the CYP2C9 genotype-dependent DDIs exhibited by S-warfarin, when warfarin is administrated together with fluconazole or rifampin. Additionally, for subjects with CYP2C9 *2 and *3 variants, a model-based analysis of warfarin metabolite profiles in subjects with various CYP2C9 genotypes demonstrates CYP2C9 mediated elimination is less important and non-CYP2C9 mediated elimination is more important, compared with subjects without these variants. To our knowledge, this is so far one of the most comprehensive population-based PK analyses of warfarin metabolites in subjects with various CYP2C9 genotypes under different comedications.

Significance Statement

The present study conducted population model-based analyses of 10 warfarin metabolites after racemic warfarin is administered either alone or together with metabolic inhibitors or inducers. The differential inhibition and induction of various elimination pathways of warfarin potentially explains the *CYP2C9* genotype-dependent drug-drug interactions of S-warfarin. The analysis also facilitates a deeper understanding of warfarin disposition.

Introduction

Since being introduced into clinical practice in the 1950s, warfarin continues to be one of the most commonly prescribed anticoagulant drugs in the world nowadays (Shapiro, 1953; Asiimwe et al., 2021). Although highly effective in treating diseases such as atrial fibrillation and venous thromboembolism, the narrow therapeutic index, high inter-individual variability, and potentially life-threatening and dose-limiting toxicities, such as intracranial hemorrhage, compromise the clinical use of warfarin (Smith et al., 1990; Takahashi and Echizen, 2001; Hart et al., 2007; Ansell et al., 2008).

Following the oral administration of warfarin enantiomers, both R- and S-warfarin are absorbed rapidly and eliminated primarily through cytochrome P450 (CYP) mediated hepatic metabolism, to form multiple monohydroxylated metabolites (Kaminsky and Zhang, 1997; Ufer, 2005). Swarfarin, the pharmacologically more active enantiomer of warfarin, is primarily (>80%) metabolized by CYP2C9 to form either 7- or 6-hydroxy (OH)-S-warfarin, although 4'-, 8- and 10-OH-S-warfarin can also be formed via catalysis by other CYPs such as CYP2C19 and CYP3A4 (Rettie et al., 1992; Ufer, 2005; Pouncey et al., 2018). R-warfarin, in contrast, is metabolized by multiple CYP enzymes, such as CYP1A2, CYP2C19 and CYP3A4, to form 4'-, 6-, 7-, 8- and 10-OH-R-warfarin (Zhang et al., 1995; Wienkers et al., 1996; Ufer, 2005; Rettie and Tai, 2006; Pouncey et al., 2018). Following the formation of monohydroxylated metabolites, several warfarin metabolites, such as 4'-, 6-, 7- and 8-hydroxy S- or R-warfarin, can undergo either urinary excretion or further metabolism, such as glucuronidation, although the relative importance in vivo of these conjugation pathways is unclear to date (Jansing et al., 1992; Takahashi et al., 1997; Ufer, 2005; Zielinska et al., 2008; Miller et al., 2009; Jones et al., 2010b; Pugh et al., 2014). Diastereomeric warfarin alcohols, were also identified in human urine, the formation of which is CYP-independent (Lewis and Trager, 1970; Moreland and Hewick, 1975; Hermans and Thijssen, 1989; Ufer, 2005).

Numerous previous studies suggested that *CYP2C9* contributes significantly to the high interindividual variability (IIV) in S-warfarin exposure, complicating warfarin dosing (Rettie et al., 1994; Takahashi and Echizen, 2001; Hamberg et al., 2007; Flora et al., 2017; Xue et al., 2017). For enzymes encoded by the *CYP2C9* gene with *2 (430C>T) and *3 (1075A>C) variants, *in*

vitro studies suggest the intrinsic clearance (CL) of CYP2C9 mediated S-warfarin 7-hydroxylation is approximately 5.5-fold and 27-fold lower, respectively, compared with enzyme encoded by wild type CYP2C9 gene (Rettie et al., 1994; Haining et al., 1996; Steward et al., 1997; Rettie et al., 1999; Ufer, 2005). A population pharmacokinetic (PK) analysis demonstrated that subjects homozygous with respect to CYP2C9 *2 or *3 exhibit a 72% and 85% reduction in S-warfarin CL, respectively, compared with subjects homozygous for CYP2C9 *1/*1 (Hamberg et al., 2007). Additionally, a previous study showed that the CYP2C9 *1B haplotype (characterized by -3089G_A and -2663delTG) is in linkage disequilibrium (LD) with CYP2C19 *2, which can impact the auto-induction of phenytoin (Chaudhry et al., 2010). The presence of CYP2C9 *1B haplotype is also associated with the lower maintenance doses of phenytoin in epileptic patients but not associated with warfarin maintenance doses in a Chinese patient population (Chaudhry et al., 2010). However, whether these genetic variants are associated with the PK of warfarin metabolites is largely unclear.

Despite many studies being conducted with warfarin, a comprehensive model-based analysis of the metabolic profiles of the warfarin enantiomers and their metabolites, following the administration of either warfarin alone or together with a CYP inhibitor or inducer, utilizing a population PK modeling approach is still lacking. The study presented here is the second manuscript of a two-part companion series describing warfarin kinetics. In the first analysis, we found that CYP2C9 genotypes are associated with the magnitude of S-warfarin CL changes when warfarin is co-administrated with CYP inhibitors or CYP inducers, so called CYP2C9 genotypedependent drug-drug interactions (DDIs) (Cheng et al., concurrently published). However, the mechanism behind it is poorly understood. Taking advantage of the plasma and urine PK profiles collected for 10 warfarin metabolites (4'-, 6-, 7-, 8-, 10-OH-S- and R-warfarin), the goal of the herein presented work is to conduct a model-based analysis to provide more mechanistic insights behind the CYP2C9 genotype-dependent DDIs exhibited by S-warfarin shown in our companion analysis (Cheng et al., concurrently published). Interestingly, several unexpected findings were obtained in the current analysis of metabolite PK, such as the effect of CYP2C9 *1B on the magnitude of formation CL (CL_f) changes of several metabolites following the administration of warfarin together with rifampin.

Methods

Data

Data used for developing the warfarin metabolite models were collected from an open-label, multi-phase and cross-over clinical pharmacogenetic study approved by the University of Minnesota's Institutional Review Board (IRB). Details about the study population and study design are provided in the first manuscript of our companion manuscripts (Cheng et al., concurrently published). Briefly, 29 healthy subjects with *CYP2C9* *1/*1 (n=8), *CYP2C9* *1/B/*1B (n=5), *CYP2C9* *1/*3 (n=9), *CYP2C9* *2/*3 (n=3) and *CYP2C9* *3/*3 (n=4) were enrolled in the study with written informed consent.

Each subject underwent three treatment periods. For the first period, each subject was treated with a single 10 mg oral dose of warfarin followed by an 11-15 day sampling phase and a 7-day washout phase before entering the second period. For the second period, subjects were randomized and administered either 400 mg fluconazole or 300 mg rifampin orally once daily for 7 consecutive days to allow the concentration of fluconazole or rifampin to reach steady state. Afterwards, a single 10 mg oral dose of warfarin was administered for each subject followed by an 11-15 day sampling phase and a 7-day washout phase. Fluconazole or rifampin was continuously administered on a daily basis during the sampling phase. The design of the third period was the same as the second period with subjects crossing over to the alternative interacting drug.

Blood samples were taken at 2 hours (hr), 6 hr, 24 hr, 2 days (d), 3 d, 4 d, 5 d, 6 d, 7 d, 9 d and 11 d after the dose of warfarin for each subject. For subjects with *CYP2C9 *1/*3*, an additional blood sample was taken at 13 d and for subjects with *CYP2C9 *2/*3* and *3/*3 genotypes, two more blood samples were taken at 13 d and 15 d since these subjects were assumed to exhibit a longer warfarin elimination half-life. Urine samples were collected at 24 hr intervals for each subject at 1 d, 4 d, 7 d and 10 d. Concentrations of 4'-, 6-, 7-, 8-, 10-OH-S and R-warfarin in both plasma and urine were analyzed by LC/MS with the methods described in the previous studies (Miller et al., 2009; Flora et al., 2017). The lower limit of quantifications (LLOQs) for 4'-, 6-, 7-, 8-, 10-OH-warfarin metabolites were 0.75, 0.4, 0.67, 0.5 and 0.75 ng/mL, respectively (Flora et al., 2017).

PK Model Development

The PK models for S- and R-warfarin metabolites were built subsequently on the basis of the PK models developed for S- and R-warfarin parent compounds (Cheng et al., concurrently published). After the development of the S- and R-warfarin models with *CYP2C9* genotype and drug interaction covariate effects, the Empirical Bayes Estimates (EBE) of individual PK parameters were exported to the S- and R-warfarin metabolite data sets respectively to derive the metabolite PK profiles. The molecular weight difference between parent compounds (308 Da) and metabolites (324 Da) were adjusted during the model fitting process. The covariate effects of *CYP2C9* genotypes and co-treatments were parameterized using the equations (1-2) as shown below.

$$TVP = TVP_{ref} \times P_Geno\ i\ (1)$$

 $TVP = TVP_{ref} \times P_TRT\ (2)$

(*TVP*: typical values of parameters; TVP_{ref} : typical values of parameters in reference groups; $P_Geno\ i$: CYP2C9 genotype effect on parameters (i = 1, 2, 3, 4, 5 represent CYP2C9 *I/*I. *IB/*IB, *I/*3, *2/*3, *3/*3 respectively); P_TRT : co-treatment effect on parameters (TRT: Flu: fluconazole, Rif: rifampin))

If an association between CYP2C9 genotypes and P_TRT is identified by visual inspection, CYP2C9 genotype effects were added on P_TRT as a covariate using the equation (3) as shown below.

$$P_TRT = P_TRT_Geno i (3)$$

($P_TRT_Geno\ i$: co-treatment effect on parameters for subjects with genotype i (i = 1, 2, 3, 4, 5 represent CYP2C9*1/*1.*1B/*1B, *1/*3, *2/*3, *3/*3 respectively))

A covariate introducing a 3.84 decrease in objective function values (OFVs) with one degree of freedom at an α level of 0.05 is considered to be statistically significant.

The schematic PK model structures for each warfarin metabolite are shown in Figure 1. For 4'-, 8- and 10-OH-S-warfarin, a one-compartment PK model with a urine compartment connected with the S-warfarin PK model with covariates was able to adequately describe the PK profiles for each metabolite in both plasma and urine under different conditions. For 6-, 7-OH-S-warfarin

and all the R-warfarin related metabolites, a two-compartment PK model with a urine compartment connected with either S- or R-warfarin PK model with covariates was able to adequately describe each metabolite's PK profiles in both plasma and urine under different conditions.

Without studies conducted with each metabolite administrated by itself and prior knowledge about the fraction of parent compound converted to each metabolite (f_m), the volume of distribution (V_d) of each metabolite is theoretically not identifiable using only the metabolite plasma PK profiles following the administration of parent compound (Cosson et al., 2007). However, this can potentially be overcome if the plasma and urine PK profiles of each metabolite are fitted simultaneously assuming the metabolite produced is 100% excreted through urine. The model fitting for each warfarin metabolite performed in this study were based on this assumption with plasma and urine measurements fitted simultaneously. Although this assumption allows the V_d of each metabolite model to become estimable, this may lead to underestimation of metabolite V_d, especially for metabolites that undergo extensive phase II metabolism such as glucuronidation or sulphation. The underestimation of V_d can further lead to underestimation of CL_f of each metabolite. Indeed, several warfarin metabolites such as 4'-, 6-, 7- and 8-OH warfarin have been shown to undergo various extents of glucuronidation and the overall percentages of warfarin metabolites that undergo glucuronidation varies from 14% to 59% between patients as shown by previous studies (Zielinska et al., 2008; Jones et al., 2010b). Thus, the V_d and CL_f estimated in this study should be interpreted as the minimum possible values for each metabolite.

The baseline plasma concentrations for the warfarin only treatment period were assumed to be zero for all the metabolites during the entire modeling process. The baseline plasma concentrations in the second and third treatment periods were assumed to be non-zero for 4'-, 6-, 7-, 8-OH-S- and 7-, 10-OH-R-warfarin and parameters for baseline concentrations in the central and peripheral compartments were included for estimations. Additionally, the baseline plasma concentrations in the second and third treatment periods were assumed to be zero for 10-OH-S- and 4'-, 6-, 8-OH-R-warfarin since the baseline concentration parameters in the second and third treatment periods cannot be estimated with adequate precision for these metabolites.

IIV terms were parameterized by assuming a log-normal distribution. For each undesired IIV, a fixed 0.3% inter-individual variability was assumed to facilitate the optimization efficiency of the expectation-maximization (EM) based method (Chigutsa et al., 2017). Proportional error models were used for modeling residual unexplained variabilities (RUVs). All IIVs were assumed to be independent of each other, thus no off-diagonal matrix elements were estimated. Because of the existence of many plasma concentrations below the lower limit of quantification (LLOQ), the M3 method (Ahn et al., 2008; Bergstrand and Karlsson, 2009) proposed by Stuart Beal was used to account for the missing concentrations in the plasma PK profiles of each metabolite. NONMEM code for 7-OH-S-warfarin has been provided as an example in supplementary material (code for 7-OH-S-warfarin plasma).

Model Evaluations

The evaluations of model fitting were performed by visual prediction check (VPC) stratified by model covariates, such as *CYP2C9* genotypes and co-medications, with 200 simulations. Because of the existence of plasma concentrations below LLOQ, a two panel VPC procedure was followed to evaluate model fitting in plasma for each metabolite (Bergstrand and Karlsson, 2009). The precision of the parameter estimations was evaluated with the relative standard error (RSE) generated with the covariance steps and 95% confidence intervals (CIs) constructed following the sampling importance resampling (SIR) procedure (Dosne et al., 2016).

Model-based Analysis

Percentage changes in CL_f of each metabolite and percentage changes in renal CL (CL_R) of each parent compound following the administration of fluconazole or rifampin were calculated with model parameters estimated by each metabolite model or parent compound model (Cheng et al., concurrently published) with equation (4) as shown below.

% changes in
$$CL_f$$
 (or CL_R) = $\left| CL_f TRT (or CL_R TRT) - 100\% \right|$ (4)

($|CL_f_TRT$ (or CL_R_TRT)-100% | represent the absolute difference between co-treatment effects on CL_f of each metabolite (or CL_R of each parent compound) and 100% (TRT: Flu: fluconazole, Rif: rifampin))

The 95% CIs were constructed with RSE estimated from the covariance steps by assuming a symmetrical normal distribution.

For model-based analysis of warfarin and its metabolites, S- and R-warfarin CL, CL_R and the covariate effects on them were extracted from our companion study (Cheng et al., concurrently published). The S- and R-warfarin CL, CL_R and CL_f for each warfarin metabolite in subjects with various *CYP2C9* genotypes under different co-treatments were first calculated with the corresponding covariates. The percentages of CL_f of each metabolite or CL_R of each parent compound with respect to S- or R-warfarin CL, in subjects with various *CYP2C9* genotypes under different co-treatments, were then calculated using the equation (5) as shown below.

$$\%CL_f (or \%CL_R) = \frac{CL_f (or CL_R)}{CL} (5)$$

Data Analysis

Model fittings were implemented with the Importance Sampling algorithm (IMP) with interaction using "AUTO=1" option and mu-reference within NONMEM 7.4 (ICON Development Solutions, Ellicott City, Maryland) (Bauer, 2015). Perl-speaks-NONMEM (PsN 4.9.0, Uppsala, Sweden) within Pirana interface (Keizer et al., 2011) was utilized to facilitate the implementation of VPC and SIR. R 3.6.3 (The R Foundation for Statistical Computing) and RStudio 1.1.453 (RStudio, Inc., Boston, Massachusetts) were utilized for data pre- and post-processing and data visualization.

Results

Data

The number of plasma concentrations and urine samples included for developing each metabolite PK model are shown in Table S1. The plasma measurements are categorized into baseline concentrations, non-baseline concentrations above the LLOQ and non-baseline concentrations below LLOQ.

Parameters representing baseline plasma concentrations in the second and third treatment periods were initially included for 10-OH-S- and 4'-, 6-, 10-OH-R-warfarin, but relatively imprecise estimations (large RSE) were observed. Thus, for these compounds, no parameters related to baseline plasma concentrations were included and baseline plasma concentrations were assumed to be zero in all treatment periods. Additionally, poor fitting of the 10-OH-S-warfarin plasma PK profiles in three subjects was observed with all the structure models tested that resulted in an excessive influence on the overall model fitting and parameter estimations. Thus, the 10-OH-S-warfarin PK profiles for these three subjects were subsequently excluded during model fitting.

The plasma and urine PK profiles used for developing each metabolite model are shown in Figures 2 and 3, respectively. In general, plasma concentrations were readily detectable and substantial for most of the warfarin metabolites except for 4'-, 8-OH-S- and 7-OH-R-warfarin. The large number of plasma concentrations below the LLOQ indicate an extremely low plasma exposure of these metabolites (Table S1). In contrast, 4'-, 8-OH-S- and 7-OH-R-warfarin were readily detected in urine, suggesting that they are rapidly eliminated following their enzymatic generation. Additionally, despite substantial concentrations of 10-OH-S- and 10-OH-R-warfarin in plasma, these metabolites were only sparsely detected in urine.

Model parameters

The parameter estimations for 4'-, 6-, 7-, 8-, 10-OH-S- and R-warfarin are shown in Table S2-S11, respectively. Model parameters were estimated with reasonable precision as indicated by the RSE estimated from the covariance steps and 95% CIs generated following the SIR procedure. The inhibitory and inducing effects of fluconazole and rifampin, respectively, on the CL_f of the warfarin metabolites was variable and metabolite dependent. As would be expected,

the CYP2C9 genotype impacted the CL_f of 6- and 7-OH-S-warfarin, but, surprisingly, also 8-OH-S-warfarin.

For metabolites with sparse plasma PK profiles, such as 4'-OH-S-, 7-OH-R-, 8-OH-S-warfarin, large RUV estimations (128%, 2640% and 352%, respectively) for the plasma PK profile fits were observed (Table S2, S7 and S8). In addition, for these metabolites, several excessively large IIV estimations for CL and V_C were also noted. It is suspected that the existence of the substantial number of plasma concentrations below the LLOQ contributed to the excessive amount of uncertainty (either IIV or RUV) estimated.

Model Evaluations

Again, the model parameters were estimated with reasonable precision based on the RSEs generated with the covariance steps and the 95% CIs calculated with SIR overall (Table S2-S11). The visual prediction checks (VPCs), which are stratified by *CYP2C9* genotypes and comedications, suggested the developed models can predict the PK observations in both plasma and urine for each metabolite reasonably well (Figure S1-S10, A and C). Importantly, the observed fractions of concentrations below quantification limits (BQL) in plasma PK profiles align well with the model predicted fractions of concentrations BQL (Figure S1-S10, B), which indicate the appropriate use of the M3 method.

Model-based Analysis

The estimated inhibitory effect of fluconazole and inducing effect of rifampin on the CL_f of each metabolite or on the CL_R of each parent compound are presented in Figure 4. Following the administration of fluconazole, the CL_f of each metabolite and the CL_R of each parent enantiomer decrease. Notably, the decrease in CL_R is much less compared with the decrease in CL_f of each metabolite, following the administration of fluconazole. In contrast, following the administration of rifampin, the CL_f of each metabolite and the CL_R of each parent compound increase, with a much lesser increase in CL_R compared with the increase in CL_f of each metabolite. Interestingly, our model identified that subjects with the CYP2C9*IB/*IB genotype exhibit a greater induction of CL_f (higher CL_f Rif) for 10-OH-S- and 10-OH-R-warfarin but a lesser effect on CL_f

(lower CL_f_Rif) for 8-OH-R-warfarin following the administration of rifampin (Figure 4, B and D).

7- and 6-OH-S-warfarin are the most abundant metabolites of S-warfarin, the formation of which is mediated by CYP2C9 (Table 1). Following the administration of fluconazole, the percentage decrease in CL_f of 7- and 6-OH-S-warfarin was similar to the decrease in CL_f of 4'- and 8-OH-S-warfarin (Figure 4A). However, fluconazole had a lesser impact on 10-OH-S-warfarin CL_f and a minimal impact on S-warfarin CL_R (Figure 4A). Rifampin administration, however, increased the CL_f of 7- and 6-OH-S-warfarin to a lesser extent than any of the other S-warfarin metabolites (Figure 4B).

The metabolic profiles for S-warfarin (the percentages of CL_f of each metabolite or CL_R of each parent compound with respect to S-warfarin CL), in subjects with various *CYP2C9* genotypes under different co-treatments, are shown in Figure 5. For subjects with the *CYP2C9* *2 and *3 variants, the proportion of *CYP2C9* mediated S-warfarin CL occurring through the formation of 6- and 7-OH-S-warfarin decreases, but the proportion of non-*CYP2C9* mediated warfarin clearance increases. Interestingly, the CL_R of S-warfarin contributes more towards S-warfarin CL in subjects possessing the *CYP2C9* *2 and *3 variants compared with wild-type subjects (*CYP2C9* *1/*1), regardless of co-medications administered. Despite prior suggestions that the CL_R of S-warfarin is generally inconsequential (Ufer, 2005), our results suggest for subjects with the *CYP2C9* *2/*3 and *3/*3 variants, the CL_R of S-warfarin can constitute up to 5.1% and 6.6% of overall S-warfarin CL respectively, when warfarin is administered alone. Furthermore, the CL_R of S-warfarin can constitute up to 10.8% and 10.7% of overall S-warfarin CL, when warfarin is administered together with fluconazole.

The percentages of CL_f for each metabolite or CL_R for each parent enantiomer with respect to R-warfarin CL, in subjects with various *CYP2C9* genotypes under different co-treatments, are shown in Figure 6. Unlike S-warfarin, no obvious *CYP2C9* genotype-dependency is detected in the R-warfarin metabolic profiles. Following the administration of fluconazole, CL_R contributes more and CL_f through R-warfarin metabolites contributes less towards overall CL of R-warfarin. Following the co-administration of rifampin, CL_R of R-warfarin contribute less towards overall CL. Interestingly, the formation of 4'-,8-, 10-OH-R-warfarin play a more prominent role in R-

warfarin elimination following the co-administration of rifampin compared to the administration of warfarin alone. In contrast, the formation of the 6- and 7-OH-R-warfarin metabolites appears to play a lesser role in R-warfarin elimination, following co-administration of rifampin.

Discussion

In this study, we developed PK models for 10 warfarin metabolites on the basis of the S-and R-warfarin PK models built in our companion study (Cheng et al., concurrently published). Our models were able to characterize the plasma and urine PK profiles of 10 warfarin metabolites reasonably well, with reasonable parameter estimation precisions. Importantly, the developed warfarin metabolite models can provide more mechanistic insights about warfarin dispositions, following warfarin administered either alone or together with fluconazole or rifampin.

Many previous studies show 7- and 6-OH-S warfarin are the major metabolites for S-warfarin, the formation of which are mediated by CYP2C9 (Rettie et al., 1992; Kaminsky and Zhang, 1997; Ufer, 2005). As expected, our model-based analysis confirmed previous findings by showing 7and 6-OH-S-warfarin are the most predominant metabolites for S-warfarin, the CL_f of which is impacted by CYP2C9 (Figure 5). Interestingly, our model detects a CYP2C9 genotype-dependent elimination clearance (CL_e) for 10-OH-S-warfarin. Subjects with more defective CYP2C9 exhibit a higher CL_e for 10-OH-S-warfarin. This potentially suggests further CYP-dependent metabolism or conjugation, such as glucuronidation, may be involved in the elimination of 10-OH-S-warfarin. Indeed, the involvement of subsequent metabolism steps may also explain the relatively low urine level of 10-OH-S-warfarin (Figure 3I). Interestingly, a previous study also suggests the exposure level of 10-OH-S-warfarin is related to CYP2C9 genotypes (Pouncey et al., 2018). However, this study concluded that subjects who are CYP2C9 extensive metabolizers may exhibit a lower concentration of 10-OH-S-warfarin, which is paradoxical with our analysis. Given that many studies show the formation of 10-OH-S-warfarin is mediated by CYP3A4 (Kaminsky and Zhang, 1997; Ngui et al., 2001; Pouncey et al., 2018), the impact of CYP2C9 on the elimination rather than the formation of 10-OH-S-warfarin demonstrated by our analysis provides additional insight about its disposition that warrants further investigation. The formation of 10-OH-R-warfarin is mediated by CYP3A4 as well (Ufer, 2005; Pouncey et al., 2018). The plasma concentration of 10-OH-R-warfarin appears to be the highest among the Rwarfarin metabolites (Figure 2), but its PK have heretofore not been extensively assessed. Here, our model identified a relatively low CL_f and V_d for 10-OH-R-warfarin (Table S11). The noncompartmental analysis reported in our previous study demonstrated that 10-OH-R-warfarin also has an uncommonly long terminal half-life (>100 hours) and exhibited elimination rate-limited

kinetics (Flora et al., 2017). In addition, the urinary excretion of 10-OH-R-warfarin appears to be very limited (Figure 3J). The mechanism behind the unusual PK behavior of 10-OH-R warfarin is unknown. However, as indicated in our previous study, we suspect that 10-OH-R-warfarin may undergo enterohepatic recirculation, fecal elimination and sequential metabolism to another metabolite (Flora et al., 2017). Interestingly, a previous study has reported 10-OH-metabolites of warfarin can potently inhibit the S-warfarin CYP2C9 metabolic clearance in a competitive manner (Jones et al., 2010a). Thus, more studies focused on the disposition of 10-OH-warfarin may be valuable for better understanding of the interplay between warfarin metabolites and the disposition of S-warfarin, the pharmacologically more active component in warfarin.

Our model also discovered that subjects with the CYP2C9 *1B/*1B genotype exhibit a lower 8-OH-R-warfarin CL_f compared with subjects with other CYP2C9 genotypes. Interestingly, a strong linkage disequilibrium between CYP2C9*1B and CYP2C19 *2 was previously reported (Chaudhry et al., 2010). In addition, CYP2C19 *2 is known to be the most common mutation encoding a defective CYP2C19 protein (de Morais et al., 1994; Dehbozorgi et al., 2018). Since the formation of 8-OH-R-warfarin is mediated mainly by CYP2C19 (Pouncey et al., 2018), the higher probability of the existence of the CYP2C19 *2 genotype in subjects with the CYP2C9 *1B/*1B genotype may explain the lower 8-OH-R-warfarin CL_f in these subjects. Our companion study also suggests that the increase in S- and R-warfarin CL following the coadministration of rifampin is similar between subjects with the CYP2C9 *1/*1 and CYP2C9 *1B/*1B (Cheng et al., concurrently published). However, the current study demonstrates that subjects with the CYP2C9 *1B/*1B exhibit a more pronounced induction of the CL_f for CYP3A4-mediated 10-hydroxylation of both S- and R-warfarin (Figure 4, B and D, Table 1), but a less inducible CL_f for CYP2C19-mediated 8-hydroxylation of R-warfarin (Figure 4B, Table 1). Interestingly, Chaudhry et al. also demonstrated that subjects with the CYP2C9 *1B variant tend to exhibit a greater induction of CYP3A4 but a lesser induction of CYP2C19, although both associations were not statistically significant (Chaudhry et al., 2010). The mechanism for the altered inducibility of CYP3A4 and CYP2C19 is speculated to be attributable to binding element changes in transcription factors, such as Yin Yang 1 (YY1), introduced by CYP2C9 *1B (Chaudhry et al., 2010).

In our companion study, we successfully utilized a target mediated drug disposition (TMDD) model to characterize warfarin PK profiles in both plasma and urine, when warfarin is administered either alone or together with fluconazole or rifampin. Our model-based analysis suggested the changes in S-warfarin CL, following the administration of warfarin together with fluconazole or rifampin, follows a CYP2C9 genotype-dependent manner (Cheng et al., concurrently published). As such, the study presented herein provides more mechanistic insights behind the CYP2C9 genotype-dependent DDIs exhibited by S-warfarin. Specifically, following the administration of fluconazole, the inhibitory effects on the CL_f of CYP2C9 related metabolites, such as 7-and 6-OH-S-warfarin, are higher than some of the non-CYP2C9 related metabolites, such as 10-OH-S-warfarin, and are much higher than the CL_R for S-warfarin (Figure 4A). Since for subjects possessing the CYP2C9 *2 and *3 variants, CL_f of CYP2C9 related metabolites represents a smaller proportion of the overall S-warfarin CL, compared to CYP2C9 *1/*1 subjects (Figure 5), a higher inhibitability of CYP2C9-mediated CL_f compared with other elimination pathways makes the S-warfarin CL in subjects with CYP2C9 *2 and *3 variants less susceptible to fluconazole inhibition. In contrast, following the administration of rifampin, the inducing effects on CL_f for the CYP2C9 related metabolites are less than the non-CYP2C9 related metabolites (Figure 4B). Since for subjects with CYP2C9 *2 and *3 variants, CLf of non-CYP2C9 related metabolites represents a larger proportion of the overall S-warfarin CL compared to CYP2C9 *1/*1 subjects (Figure 5), the greater induction of non-CYP2C9 mediated CL makes subjects with the CYP2C9 *2 and *3 variants subject to higher CL changes following the co-administration of rifampin.

The present study confirmed some previous findings. For example, Heimark et al. found in the presence of rifampin co-treatment, the CL of warfarin enantiomers and the CL_f of 6-, 7- and 8-OH metabolites increase. Heimark et al. also found the percentages of R-warfarin dose excreted in the urine decrease as 6- and 7-OH metabolites, but increase as 4'- and 8-OH metabolites (Heimark et al., 1987). Additionally, following the co-administration of fluconazole, Douglas et al. found the CL of warfarin enantiomers and the CL_f of 6-, 7-, 8- and 10-OH metabolites decrease. Fluconazole inhibits the formation of 6-, 7- and 8-OH S-warfarin to a similar extent, by around 70% (Black et al., 1996). These findings are consistent with the analysis presented in this study (Figure 4 and Figure 6).

Limitations to our models are recognized. Firstly, for metabolites such as 4'-OH-S-, 7-OH-R- and 8-OH-S-warfarin, the model predicted plasma PK profiles included a high proportion of concentrations below 0 (Figure S1, S6 and S7, A). This occurred because the estimated RUVs for these metabolites are excessively large (>100%). In addition, several IIV terms in PK models were also uncommonly large (Table S2, S7 and S8). We suspect that a significant proportion of the concentrations below LLOQ for these metabolites (Table S1) leads to substantial inflation in the estimations of IIVs and RUVs. However, given the sufficient urine measurements collected, the model parameters were still estimated with reasonable precision (Table S2, S7 and S8). In the future, more advanced analytical techniques with higher sensitivity for detection of these metabolites will be needed to better characterize their plasma PK profiles. Additionally, some systemic bias in model predictions were noticed. For example, the developed model for 4'-OH-S-warfarin appears to under-predict the urinary PK profiles in subjects with *CYP2C9*1B/*1B* and inadequately characterize the urinary PK profiles in subjects with *CYP2C9*2/*3* when warfarin is administered together with fluconazole (Figure S1C).

Secondly, without the administration of each metabolite alone or any prior knowledge about the fraction of warfarin enantiomers metabolized to a particular metabolite, the V_d of each metabolite is theoretically not estimable based on metabolite plasma PK profiles alone when only the parent compound is administered (Cosson et al., 2007). A common approach to address this is to either fix the fraction of metabolism (f_m) based on literature (Vanobberghen et al., 2016; Mian et al., 2019) or to assume a metabolite V_d (for instance, equal to V_d of parent compound) (Patel et al., 2017). However, the V_d of each metabolite becomes identifiable if the metabolite plasma and urine PK profiles are fitted simultaneously, if all the metabolites generated are excreted in the urine and only renally eliminated. In fact, in vitro studies conducted by Zielinska et al. suggest that 4'-, 6-, 7- and 8-hydroxywarfarin can undergo glucuronidation mediated by multiple UDP-glucuronosyltransferases (UGTs), such as UGT1A1 and UGT1A10 (Zielinska et al., 2008). Human studies also suggest the overall percentages of glucuronidation of monohydroxylated warfarin metabolites can vary between 14-59% (Miller et al., 2009; Jones et al., 2010b). This in vitro and in vivo evidence of phase II metabolism suggests that the metabolite PK models presented may potentially underestimate the actual V_d and CL_f of each metabolite. Thus, the CL_f estimated in our study should be considered as the minimum possible CL_f for each metabolite. Nevertheless, despite the limitations discussed above, our collective

analyses presented in Figures 5 and 6 can still reasonably reflect the warfarin metabolic profiles in subject with various *CYP2C9* under different co-treatments.

To our knowledge, our model-analysis of warfarin parent enantiomers and metabolites is the most comprehensive population PK analyses of warfarin disposition in subjects with different *CYP2C9* to date. This study involved the development of population PK models for 10 warfarin metabolites and conduct a model-based analysis of the warfarin metabolic profiles. The differential effects of fluconazole inhibition and rifampin induction on the CL_f of warfarin metabolites across *CYP2C9* genotypes largely explains the *CYP2C9* genotype-dependent effects on the warfarin enantiomers observed in our companion study (Cheng et al., concurrently published). In addition, the differential inhibitability and inducibility of several CYP enzymes elucidated by our study of warfarin metabolites is potentially useful in informing the predicted extent of DDIs of other drugs eliminated by similar metabolic pathways.

In conclusion, we developed population PK models for 10 warfarin metabolites and performed comprehensive model-based analysis. The model-based analysis provides mechanistic insights behind the *CYP2C9* genotype-dependent DDIs exhibited by S-warfarin, as suggested in our companion study. In addition, our analysis provides a better understanding of warfarin disposition for subjects with various *CYP2C9* genotypes following the administration of both inhibitor and inducer co-medications.

Author Contributions:

Participated in research design: Cheng, Flora, Rettie, Brundage, Tracy

Conducted experiments: Flora, Rettie, Tracy

Performed data analysis: Cheng, Brundage

Wrote or contributed to the writing of the manuscript: Cheng, Flora, Rettie, Brundage, Tracy

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Figure legends

- Figure 1. PK model structures for warfarin parent and metabolites. Dark-blue frames: S-warfarin parent compound and metabolites models; Dark-red frames: R-warfarin parent compound and metabolites models. *Notes: Periph: peripheral; Cent: central; R: receptors; DR: drug-receptor complexes. M-Cent: metabolite central compartment; M-periph: metabolite peripheral compartment; M-urine: metabolite urine compartment.*
- Figure 2. Plasma PK profiles for S-warfarin metabolites (left, 4'-(A), 6-(C), 7-(E), 8-(G) and 10-(I) OH-S-warfarin) and R-warfarin metabolites (right, 4'-(B), 6-(D), 7-(F), 8-(H) and 10-(J) OH-R-warfarin). Colors represent subjects' *CYP2C9* genotypes. Plots are on log scales.
- Figure 3. Urine PK profiles for S-warfarin metabolites (left, 4'-(A), 6-(C), 7-(E), 8-(G) and 10-(I) OH-S-warfarin) and R-warfarin metabolites (right, 4'-(B), 6-(D), 7-(F), 8-(H) and 10-(J) OH-R-warfarin). Colors represent subjects' *CYP2C9* genotypes. Plots are on log scales.
- Figure 4. Percentage changes in CL_f or CL_R of S-warfarin metabolites (A and B) and R-warfarin metabolites (C and D) following the administration of fluconazole (A and C) or rifampin (B and D). Colors represent the fluconazole and rifampin introduced inhibition and induction, respectively, as shown in the figure legend. Error bars represent 95% confidence intervals constructed with relative standard error (RSE) estimated from covariance steps assuming a symmetrical normal distribution.
- Figure 5. S-warfarin metabolic profiles in subjects with different *CYP2C9* genotypes following the administration of warfarin alone (A) and warfarin together with fluconazole (B) or rifampin (C). Color represents different elimination pathway as shown in the figure legend.
- Figure 6. R-warfarin metabolic profiles in subjects with different *CYP2C9* genotypes following the administration of warfarin alone (A) and warfarin together with fluconazole (B) or rifampin (C). Color represents different elimination pathway as shown in the figure legend.

Table 1. Summary of the major CYP enzymes involved in the formation of each metabolite.

S-warfarin metabolites	CYPs	R-warfarin metabolites	CYPs
4'-OH-S-warfarin	2C19, 3A4, 2C8	4'-OH-R-warfarin	2C19, 3A4, 2C8
6-OH-S-warfarin	2C9 (major), 2C19 (minor)	6-OH-R-warfarin	1A2 (major), 2C19 (minor)
7-OH-S-warfarin	2C9 (major), 2C19 (minor)	7-OH-R-warfarin	2C19, 1A2, 2C8
8-OH-S-warfarin	2C19	8-OH-R-warfarin	2C19 (major), 1A2 (minor)
10-OH-S-warfarin	3A4	10-OH-R-warfarin	3A4

Notes: the information of CYPs is based on reference (Ufer, 2005) and (Pouncey et al., 2018)

Figure 1

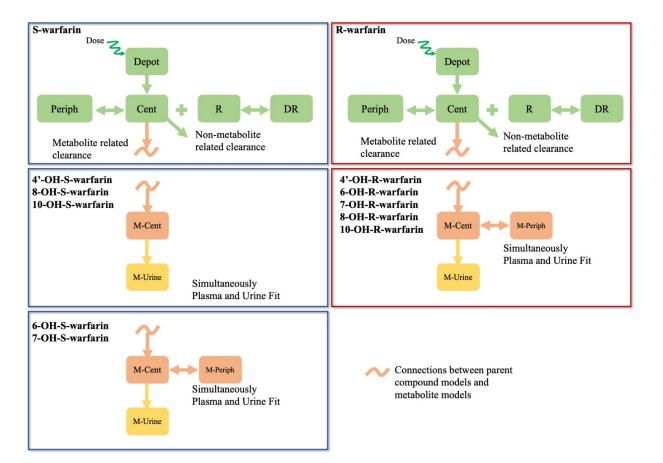


Figure 2

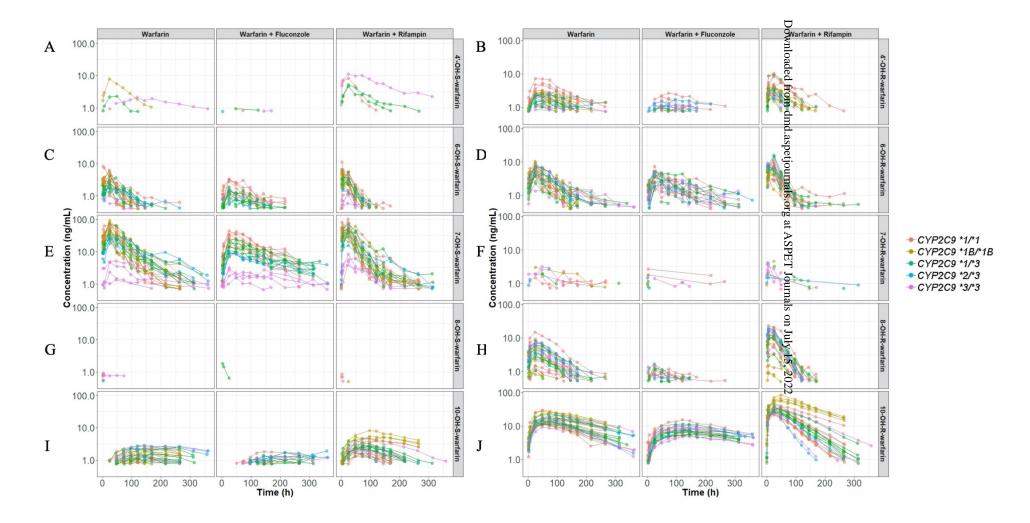


Figure 3

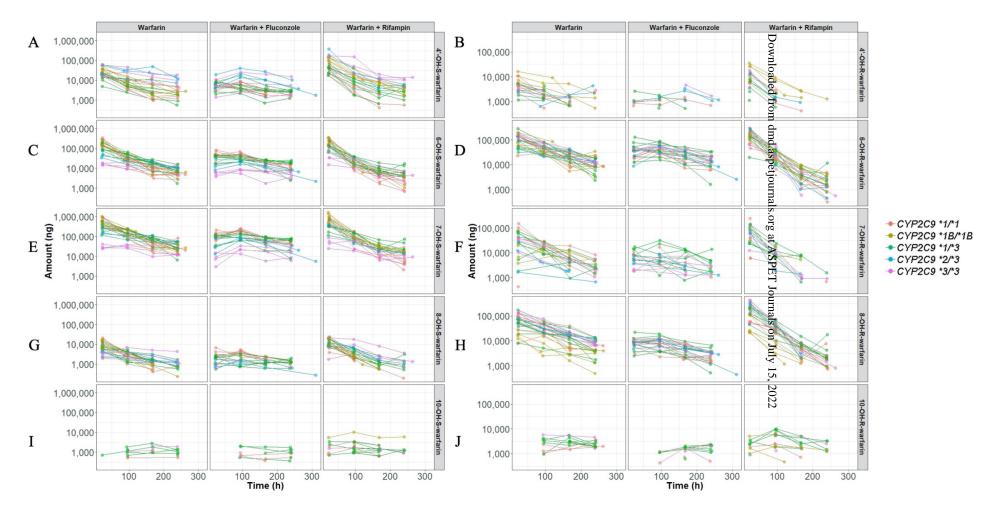


Figure 4

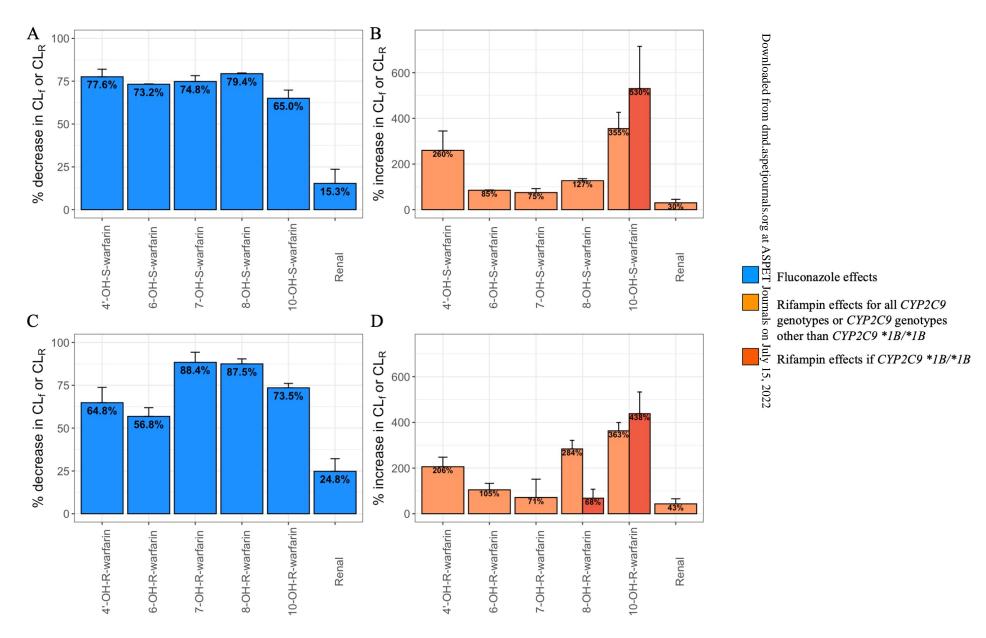


Figure 5



Figure 6

