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Alexandre R.R. Pery, Céline Brochot, Florence Anna Zeman, Enrico Mombelli, Sophie Desmots, et al.. Prediction of dose-hepatotoxic response in humans based on toxicokinetic/toxicodynamic modeling with or without in vivo data: A case study with acetaminophen. Toxicology Letters, 2013, 220 (1), pp.26-34. 10.1016/j.toxlet.2013.03.032. ineris-00961804

# HAL Id: ineris-00961804 https://ineris.hal.science/ineris-00961804v1

Submitted on 20 Mar 2014  $\,$ 

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# Prediction of dose - hepatotoxic response in humans based on toxicokinetic/toxicodynamic modeling with or without *in vivo* data: A case study with acetaminophen

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#### Abstract

In the present legislations, the use of methods alternative to animal testing is explicitly encouraged, to use animal testing only 'as a last resort' or to ban it. The use of alternative methods to replace kinetics or repeated dose in vivo tests is a challenging issue. We propose here a strategy based on in vitro tests and QSAR (Quantitative Structure Activity Relationship) models to calibrate a dose-response model predicting hepatotoxicity. The dose response consists in calibrating and coupling a PBPK (Physiologically-based pharmacokinetic) model with a toxicodynamic model for cell viability. We applied our strategy to acetaminophen and compared three different ways to calibrate the PBPK model: only with *in vitro* and *in silico* methods, using rat data or using all available data including data on humans. Some estimates of kinetic parameters differed substantially among the three calibration processes, but, at the end, the three models were quite comparable in terms of liver toxicity predictions and close to the usual range of human overdose. For the model based on alternative methods, the good adequation with the two other models resulted from an overestimated renal elimination rate which compensated for the underestimation of the metabolism rate. Our study points out that toxicokinetics/toxicodynamics approaches, based on alternative methods and modelling only, can predict in vivo liver toxicity with accuracy comparable to *in vivo* based methods.

Key-words: PBPK, model calibration, liver toxicity, acetaminophen, vitro-vivo extrapolation.

#### 1. Introduction

The promotion of alternative approaches to replace, reduce or refine animal use is present in all relevant EU legislations. For chemicals in general, the REACH legislation requires industry to evaluate the toxicity of new and existing chemicals, even those that are in use but have never been subject to regulatory testing, which translates into many thousands of chemicals to be tested. To fulfil this objective, the legislation explicitly encourages the use of methods alternative to animal testing, which would only be used 'as a last resort'. As far as cosmetics are concerned, the 7th Amendment to the Cosmetic Directive (76/768/EEC) was adopted in 2003. According to this directive, animal testing in the EU for cosmetic products had to stop immediately and a complete ban of animal testing for ingredients was due to enter into force by 11 March 2009. The deadline for most complex endpoints such as repeated dose toxicity, reproductive toxicity and toxicokinetics was set for the 11th of March 2013 but the directive can also accommodate an extension if alternative and validated methods are not available within this time framework. In parallel to the set up of a new legislation, considerable efforts, in particular from EU, were made to develop suitable and appropriate alternative methods. For instance, between 2003 and 2010, European Commission funded research programmes related to such development through FP6 and FP7 programmes for around 150 million euros (Adler et al., 2011).

Most of the toxicological information for a chemical obtained through *in vitro* testing provides information on the dose response relationship at target cell or, more rarely, at target organ level. Future risk assessment is expected to focus on avoiding significant perturbations in toxicity pathways through *in vitro* assays on human cells or cell lines (Krewski *et al.*, 2010). To integrate the *in vitro* results into quantitative *in vivo* risk assessment, it is thus necessary to relate the toxicokinetics (TK) of the chemical in the body and the toxicodynamics at each target level (Andersen and Krewski, 2010 ; Adler *et al.*, 2011 ; Louisse *et al.*, 2012 ; Yoon *et al.*, 2012). This can be achieved through Physiologically Based Toxicokinetics or Pharmacokinetics models - PBTK or PBPK- (Clewell *et al.*, 2008). A PBTK model consists of a series of mathematical equations which, based on the specific physiology of an organism and on the physicochemical properties of a substance, are able to describe the absorption, distribution, metabolism and elimination (ADME) of the compound within this organism. The solution of these equations provides the time-course of the parent

compound and its metabolites in the organs and allows for a sound mechanistic description of the kinetic processes including accumulation in tissues.

There are only a few examples for which PBPK models were used to extrapolate in vitro response to in vivo hazard assessment. Rotroff et al. (2010) combined a simple PBPK model with in vitro bioactivity data to rank chemicals according to actual human oral exposure and oral exposure leading to significant activity. As for tentative to go a step further in the prediction, Péry et al. (2011) showed the possibility to relate in vitro and in vivo gene responses in macrophages following exposure to benzo(a)pyrene through PBPK modeling. Punt et al. (2011) proposed a few examples where PBPK models have been used to extrapolate in vitro toxicity results to the in vivo situation. They show that predictions of in vivo effects on the basis of integrated in vitro and PBPK modeling approaches are generally within one order of magnitude of the observed in vivo data. Among the examples, Gubbels van-Hal et al. (2005) attempted to predict acute toxicity and repeated dose toxicity based on PBPK models and cytotoxic data. In general, the predictions over-estimated the toxicity, which could be both due to overestimation of the effects in the in vitro systems and uncertainty on the toxicokinetics parameters. There are thus improvements to be made both in the experimental field and in the accurate calibration of toxicokinetics models. Punt et al. (2011) asked for more examples that provide proof of principle of deriving in vivo doseresponse curves based on *in vitro* assays and PBPK modeling techniques. Yoon et al. (2012) reviewed different quantitative in vitro to in vivo extrapolations (QIVIVE). They identified key elements that have to be predicted for a successful extrapolation: (i) intestinal absorption and pre-hepatic clearance, (ii) hepatic and extra-hepatic metabolic clearance, (iii) renal clearance, (iv) volume of distribution (for acute in vivo exposures). They also indicated that only rare examples of QIVIVE do not rely, at least partly, on in vivo data.

In this paper, we propose a modeling framework to predict *in vivo* liver toxicity. The proposed framework is composed by a dynamic model to analyse *in vitro* concentration-liver cell viability data throughout time, and by a PBPK model to relate dose of exposure and concentration in the liver. As case study, this modeling framework was applied to humans exposed to acetaminophen, which is a pharmaceutical known for its hepatotoxicity (Jaeschke *et al.*, 2011). The human PBPK model was calibrated in three different ways: i. with *in vitro* and *in silico* methods only, ii. by extrapolating to humans a PBPK model calibrated for rats, as usually performed in human toxicokinetics assessment based on animal testing, iii. or by using all relevant available data, including actual human data to compare the quality of the kinetics and effects predictions based either on animal or non-animal testing.

#### 2. Materials and methods

#### 2.1. Toxicokinetic data in rats for acetaminophen

Male Sprague-Dawley rats were purchased from Elevage Janvier Laboratory (Le Genet Saint Isle, France). They were maintained under standardized conditions (relative humidity 55±15%, 12-h day night cycle, room temperature 22±2°C). There were five different groups of 16 rats, with different times of exposure per group. For each group, 14 rats were orally exposed to a single dose of acetaminophen in an aqueous suspension containing methycellulose (0,5% w/v) and Tween 80 (0,1% w/v). We selected the dose of 600 mg/kg which is likely to induce liver damages in some Sprague-Dawley rats after the ingestion of one dose (Clayton et al., 2006). The remaining 2 control rats received vehicle only. The volume of administration was 10 ml/kg for each animal. Individual blood sample were collected from the retro-orbital sinus under slight isoflurane anaesthesia at 30, 60, 120, 180 and 240 min, then collected into plastic tubes containing lithium heparin as an anticoagulant and immediately centrifuged (17000 g at 4°C during 10 minutes to extract plasma). The urine was collected during the 24h post-exposure. Individual post-dose urine samples were collected from each rat into vessels which contained 0,5 ml of a 100 mg/ml solution of sodium azide in distilled water as an antibacterial preservative and were kept frozen at -80°C. The experimental protocol has been approved by the local ethical committee for animal research.

Acetaminophen (APAP) metabolism mainly occurs through sulfation and glucuronidation. A small fraction of the drug undergoes oxidative metabolism via cytochrome P450 and is excreted as acetaminophen mercapturate and acetaminophen cysteine. In rats, at a dose of 320 mg/kg, one half is excreted as acetaminophen glucuronide (one half in the bile, one half in urine) and one third is excreted in urine as acetaminophen sulfate (Watari *et al.*, 1983). For the dose of concern in our experimental study (600 mg/kg), Hjelle and Klaasen (1984) showed that biliary excretion of APAP and its metabolites reached 49% (between 20.2 and 29.3% after 4 hours), most of the compounds in the bile being glucuronide conjugate. Consequently, most of the analytical measurements in our experimental study focused on acetaminophen, acetaminophen glucuronide and acetaminophen sulfate. They were measured in blood and urine by PHATOPHY (Marcy-L'étoile, France) through LC/MS-MS method. In

addition, acetaminophen mercapturate was measured in urine by the same company with the same analytical method to improve the accuracy of the estimation of the parameters.

## 2.2. PBPK modelling of acetaminophen kinetics in rats

The formation of acetaminophen sulfate in rats is limited by the availability of inorganic sulfate, with a rate of steady-state acetaminophen sulfate formation around 33  $\mu$ mol/kg/hour (Galinsky and Levy, 1981), which, in our study, corresponds to 10  $\mu$ mol per hour. For moderate doses of APAP, sulfation capacity rapidly decreases to 20-30% of normal level (Kim *et al.*, 1992; Liu and Klaassen, 1996). Kim *et al.* (2009) also showed that 18h after a pretreatment with a dose of APAP of 500 mg/kg, rats still had a deeply depleted capacity of sulfation. In contrast, there is no saturation of the cumulative excretion of the glucuronide conjugate from 37.5 to 600 mg/kg (Hjelle and Klaasen, 1984). We thus did not account for saturation of glucuronidation but accounted for saturation of sulfation, by introducing both a maximum velocity per  $\mu$ mol of available sulfate and the total quantity of available sulfates.

The rat PBPK model describes the kinetics of acetaminophen, and also of its main metabolites to compare its prediction with data available in the literature. The parameters are listed in Table 1 and a schematic representation available in Figure 1. The equations are the following:

The quantity of APAP ( $Q_{APAPgut}$ ) in the intestinal tract is described as follows:

$$\frac{dQ_{APAP_{gut}}}{dt} = Frac_{ing} * Q_{admin} - k_{gut} * Q_{APAP_{gut}}$$
(1)

where  $Q_{admin}$  corresponds to total quantity of ingested APAP during the first minute (in µmol), and set to zero afterwards. *Frac*<sub>ing</sub> correspond to the fraction of acetaminophen that can enter the liver and  $k_{gut}$  to the oral absorption rate (min<sup>-1</sup>).

In general, kinetics in organ *i* is described by the equation:

$$\frac{dC_i}{dt}V_i = F_i \left(C_b - \frac{C_i}{PC_i}\right) (2)$$

with, in the organ *i*, *Ci* the concentration (of APAP, sulfate APAP or APAP glucuronide) (in  $\mu$ mol/L) and *PC<sub>i</sub>* the partition coefficient (of APAP, sulfate APAP or APAP glucuronide), *V<sub>i</sub>* 

the volume (in L), Fi the blood flow (in L/min/kg), and  $C_b$  the concentration in blood (in  $\mu$ mol/L). The equations are more complex for liver:

$$\frac{dQ_{APAP_{liv}}}{dt} = F_l \left( C_{APAP_{blood}} - \frac{Q_{APAP_{liv}}}{PC_l * V_l} \right) + k_{gut} * Q_{APAP_{gut}} - \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmG + fupAPAP * Q_{APAP_{liv}})} - \frac{(QS - QSULF) * vmaxS * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmS + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - \frac{(QS - QSULF) * vmaxS * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l}}{(3)}$$

with  $Q_{APAPliv}$  the total quantity of APAP in the liver,  $C_{APAPblood}$  the concentration of APAP in blood, *QSULF* the total quantity of sulfate APAP that has been produced (in µmol), *QS* the maximum value for this quantity (in µmol), and *fup* the fraction not bound to proteins. No resynthesis term was needed because the time-frame in the animal is short.

For APAP glucuronide, we have, accounting for biliary excretion:

$$\frac{d Q_{GLU_{liv}}}{dt} = F_l \left( C_{GLU_{blood}} - \frac{Q_{GLU_{liv}}}{PC_l * V_l} \right) + \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmG + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - k_{GLU_{bil}} * fupGLU * \frac{Q_{GLU_{liv}}}{PC_l * V_l}}{(4)}$$

with  $Q_{GLUliv}$  the total quantity of APAP glucuronide in the liver and  $C_{GLUblood}$  the concentration of APAP glucuronide in blood.

For sulfate APAP, we have:

$$\frac{dQ_{SULF_{liv}}}{dt} = F_l \left( C_{SULF_{blood}} - \frac{Q_{SULF_{liv}}}{PC_l * V_l} \right) + \frac{(QS - QSULF) * vmaxS * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmS + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})}$$
(5)

with  $Q_{SULFliv}$  the total quantity of sulfate APAP in the liver and  $C_{SULFblood}$  the concentration of APAP sulfate in blood.

Urinary excretion is assumed to occur from blood with a rate proportional to the concentration in the blood:

$$\frac{dQ_{APAP_{elim_{kid}}}}{dt} = k_{APAP_{kid}} * fupAPAP * C_{APAP_{blood}}$$
(6)

As we only disposed of data on mercapturate in the urine, not in blood, we used an equation that related directly the quantity of mercapturate eliminated in the urine and the concentration of APAP in blood:

$$\frac{dQ_{MER_{elim_{kid}}}}{dt} = k_{MER_{kid}} * fupAPAP * C_{APAP_{blood}}$$
(7)

Some of the parameters of the PBPK model were fixed (see Table 1). For all rats, body weights (*BW*, in kg) and urinary volume for 24 hours (*Vu*, in mL) were measured. Partitions coefficients were calculated using the algorithm by Rodgers and Rowland (2006) with Simcyp simulation software version 11.1 (Simcyp Limited, Sheffield, UK). Blood to plasma ratio equals to 1 (Naritomi *et al.*, 2003) and protein binding values for APAP in serum is known (Bailey and Briggs, 2004). The fraction of ingested APAP entering the liver was fixed at 0.9. It corresponds to the common total amount of excreted APAP and metabolites in rat after oral absorption (Brown et al., 1979). For metabolism, *Km* values (in  $\mu$ M) for glucuronide and sulfate formations were taken from experiments with male Wistar rats by Watari et al. (1983).

All the other parameters (rate of stomach absorption, maximum velocities for metabolism, and urinary excretion rates) were estimated based on our rat *in vivo* data (blood and urine measurements). This estimation was performed through the maximum likelihood method. The measurement errors were assumed to be independent and log-normally distributed, with a geometric mean equal to the PBPK model predictions and a geometric standard deviation (GSD) of 1.1 (approximately 10% error). Data likelihoods were therefore given by:

$$\log(Y) \sim N(\log(F(X,\theta)), \sigma_c)$$
(8)

where the function  $F(X,\theta)$  corresponds to a PBPK model with input X and parameters  $\theta$ , and  $\sigma_c$  is equal to 1.1. Parameters estimation and building of confidence intervals were performed using the MCSim software (Bois and Maszle, 1997).

#### 2.3. Human PBPK modeling and calibration

In the human model, we focused on the kinetics of acetaminophen. The equations were the same as for rats, except for liver, with no sulfate formation limitation expected for humans, thus no resynthesis term introduced:

$$\frac{dQ_{APAP_{liv}}}{dt} = F_l \left( C_{APAP_{blood}} - \frac{Q_{APAP_{liv}}}{PC_l * V_l} \right) + k_{gut} * Q_{APAP_{gut}} - \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmG + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmS + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - \frac{VmaxG * fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})}{Q_l * V_l * (KmS + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - \frac{Q_{APAP_{liv}}}{Q_{APAP_{liv}}} - \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmS + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{Q_{APAP_{liv}}} - \frac{VmaxG * fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l}} - \frac{VmaxG * fupAPAP * Q_{APAP_{liv}}}{PC_l * V_l * (KmG + fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l})} - \frac{VmaxG * fupAPAP * \frac{Q_{APAP_{liv}}}{PC_l * V_l}} -$$

We used three ways to calibrate the human PBPK model.

The first one consisted in considering only data from methods alternative to animal testing (in vitro and in silico methods). We used two tools, ACD/Labs PhysChem Suite version 12.00 for the calculation of the octanol-water partition coefficient and pKa, and ACD/Labs ADME Suite version 5.0 for the calculation of human intestinal absorption and fraction unbound. Then, the algorithm by Rodgers and Rowland (2006) to deduce the partition coefficients. ACD/Labs PhysChem Suite estimates the octanol-water partition coefficient (logP) by a structure fragment approach; it splits the structure into fragments and searches for identical fragments in the internal databases, which contains well-characterized increments for over 500 different functional groups, together with well-characterized increments for different types of carbons that are not involved in any functional group as well as well-characterized increments for over 2,000 different types of pair-wise group interactions through aliphatic, aromatic and vinylic systems. It includes two different predictive algorithms - ACD/LogP Classic and ACD/LogP GALAS. Each prediction is provided with its reliability evaluation by the means of 95% confidence intervals (ACD/LogP Classic), or Reliability Index (ACD/LogP GALAS). From the two reliable predictions of acetaminophen LogP (ACD/LogP Classic = 0.34; ACD/LogP GALAS = 0.54), a consensus LogP value was derived equal to 0.44. ACD/Labs PhysChem Suite was used to estimate acetaminophen pKa; it estimates accurate acid-base ionization constants (pKa values) at 25°C and zero ionic strength in aqueous solutions for almost any organic or inorganic structure. The accuracy of the calculations is typically better than  $\pm 0.2$  pKa units except for highly complex structures or poorly characterized substituents, where the accuracy is usually within ±0.5 pKa units. The acetaminophen dissociation constants (Ka) for the strongest acid and base ionization centers were calculated equal to 9.9 (±0.1) and 1.7 ((±0.5), respectively. The Blood Brain Barrier Penetration ACD/ADME Suite module was used to calculate the unbound fraction in plasma. The BBB module provides reliable and easily interpreted predictions of passive BBB permeation rate (expressed as LogPS constants); it calculates steady-state distribution ratio between brain tissue and plasma (LogBB) and unbound (i.e., pharmacologically active) fraction of drug in plasma and in brain tissue. The calculated unbound fraction of acetaminophen in plasma tissue was equal to 0.88.

ACD/ADME Suite was employed for the calculation of human intestinal absorption and fraction unbound. For human intestinal absorption it predicts the effect of a compound's physicochemical properties (logKow, pKa(acid), pKa(base)) on the upper limit of its intestinal passive absorption via both transcellular and paracellular routes, its human jejunum permeability and its absorption rate. The model was built based on approximately 600 data points of human *in vivo* intestinal absorption. The acetaminophen calculated upper limit of intestinal passive absorption via transcellular and paracellular routes resulted equal to 99% and 1%, respectively; the human jejunum permeability and absorption rate resulted equal to 4.68 × 10<sup>-4</sup> cm/s and 0.032 min<sup>-1</sup>. The estimation of human oral bioavailability was obtained using the physiological-based pharmacokinetic model described and applied to acetaminophen by Paixão *et al.* (2012), based on *in vitro* and QSAR data. The fraction entering liver would be 1 for 1g and 0.99 for 10g. In our simulation, we kept a value of 1 for all doses.

For metabolism, *Km* and *Vmax* values for glucuronide and sulfate formations were taken from experiments with cryopreserved human hepatocytes by Riches *et al.* (2009). As their values were expressed per number of cells, we used the conversion factor proposed by Barter *et al.* (2007) to have data expressed per g of liver. Excretion rate was estimated as in Rotroff *et al.* (2010). The rate of renal excretion was estimated by multiplying the predicted percentage of unbound acetaminophen in plasma by the normal adult human glomerular filtration rate (111 ml/min).

The second way to calibrate the human PBPK model consisted in extrapolating from rat to human. We kept the same blood to plasma ratio, partition coefficients between blood and tissues and protein binding values that were determined for rats. The fraction of ingested APAP entering the liver was also adopted from experiments on rats and fixed at 0.9. Urinary excretion rate of acetaminophen was estimated based on the estimate for rats through biometric scaling (ratio of the glomerular filteration rates of the two species (Lin, 1995)). Metabolism parameters were scaled as in Haddad *et al.* (1998), i.e. same *Km* value and *Vmax* scaled by  $BW^{0.74}$ .

The third calibration was performed by fitting available human data. Critchley *et al.* (2005) measured human plasma and urine concentrations of acetaminophen and its conjugates after oral administration of 20 mg/kg. After 24 hours the authors found in the urine 59.9% glucuronide, 27.7% sulfate, 4.7% acetaminophen and 7.7% of other metabolites. Prior to

adjustment, we converted these data into urine concentration and considered that all the ingested acetaminophen was in urine either as parent compound or metabolites. Critchley *et al.* (2005) also found respective plasmatic area under the curve (*AUC*) after 24hours of 83  $\mu$ g/mL/h with maximal plasmatic concentration (*Cmax*) between 14.4 and 22.9  $\mu$ g/mL. Model adjustment was achieved by estimating the fraction of APAP entering liver, absorption rate and maximal velocities that would maximize the likelihood of these data (plasma *AUC* and *Cmax* and concentration of acetaminophen and metabolites in urine).

#### 2.4. *Calibration of the* in vitro *dose response for HepaRG cells*

We used data on effects of acetaminophen on HepaRG cells which were available at the Joint Research Center (JRC), Ispra Italy. HepaRG cells have been shown to be a useful model to study mechanisms of acetaminophen hepatotoxicity in humans (McGill et al., 2011). The cell exposure procedure was already described in Mennecozzi et al. (2012). Briefly, a vial of cryo preserved Human Cell Line HepaRG was obtained from INSERM's laboratory U522 and a cell culture bank had been established in house at JRC. HepaRG cells were seeded at a density of  $2.6 \times 10^4$  cells/cm<sup>2</sup> in the growth medium composed of Williams E medium supplemented with 10% FCS, 100 units/mL penicillin, 100 µg/mL streptomycin, 5 µg/mL insulin, 2 mM glutamine and  $5 \times 10^{-5}$  M hydrocortisone hemisuccinate, and then further culturing for 2 more weeks with the same medium supplemented with 2% DMSO in 75 cm<sup>2</sup> culture flask. The medium was renewed every 2 to 3 days. After differentiation, HepaRG cells were detached by gentle trypsinization, then seeded at a density of  $4-5 \times 10^4$ /well in 96 well microtiter plates (BD Biosciences) to allow the selection of hepatocyte-like populations. This procedure resulted in a higher percentage of hepatic-like cells versus biliary like epithelial cells of the HepaRG cell culture. The cells were used for testing within one week after plate seeding (Rodrigues et al., 2012). 32 exposure concentrations from  $3.5 \times 10^{-8}$  to 0.01 M were tested, with one value measured per concentration. Viability was assessed after 72 h of exposure through a high-content analysis approach (HCA) using Cellomics ArrayScan vTi. A 10x objective was used to collect 10 image fields per well for two fluorescence channels with the XF93 filter set. Cell count analysis was performed using the Target Activation Bioapplication v.4 from Cellomics Scan Software (Mennecozzi et al., 2012).

To analyze the effects data (cell population dynamics as a function of exposure concentration), we propose the following simple growth model:

 $\frac{dN}{dt} = -k * max(C - NEC, 0) * N \quad (10)$ 

with *N* the number of cells, *k* the killing rate, *C* the exposure concentration and *NEC* the No Effect Concentration, *i.e.* the concentration threshold that a cell can be exposed to without any decrease of cell viability. In the equation, *max* refers to maximum value between the two terms between brackets. In the control situation, *N* is constant as expected for HepaRG cell populations. The formalism used here is similar to the DEBtox approach used in ecotoxicology to analyze survival data (Kooijman and Bedaux, 1996), with the main difference that kinetics from the medium to the cell is neglected here. This is a pragmatic choice as we dispose only of the value after 72 h of exposure. As in DEBtox, the aim is to account for the time-dependence of effects, which is the only way to relate properly *in vitro* constant exposure concentration (*in vitro* cell density is not sufficient here to subtantially metabolize acetaminophen in a 72h period) and the time-varying liver concentration profiles from PBPK modelling. Parameter estimation was performed by minimizing the sum of the squared differences between the model predictions and the actual data.

## 2.5. TK/TD modeling

We coupled the PBPK models and the toxicodynamic model to calculate the expected dose response relating *in vivo* liver cell viability long after absorption of acetaminophen (10 days in our simulations) and the dose absorbed. To achieve this, Equation 10 was incorporated in the toxicokinetic model with liver blood acetaminophen concentration as input. We thus implicitly assumed that hepatotoxicity could be related both *in vitro* and *in vivo* to the acetaminophen concentration in the fluid in contact with the cells. As, in fact, acetaminophen hepatotoxicity is related to a minor metabolite undergoing oxidative metabolism via cytochrome P450 and produced directly and for a short time in the liver from acetaminophen (N-acetyl-p-benzoquinone imine, or NAPQI), this hypothesis seems reasonable. The three different calibrated human PBPK models were used.

## 3. Results

## 3.1. *PBPK modeling*

The fits of the rat PBTK model to our data are presented in Figure 2 for plasma. As for excretion, the model predicts that more than 96% of the initial amount of acetaminophen was eliminated after 24 h (10% not absorbed, 41% eliminated through the bile, 45% eliminated

through urine as sulfate conjugate (58%), glucuronide (24%), acetaminophen (9%) and other metabolites (9%)). Actual urine data showed a recovery of 45% in urine (sulfate conjugate (56%), glucuronide (26%), acetaminophen (12%) and other metabolites (6%)). Estimated parameters are given in Table 1.

The parameters' estimates for the three methods to calibrate the human PBPK are given in Table 2. The largest differences between estimates is related to maximum metabolism velocity with *in vitro* data largely underestimating *in vivo* data and for urinary excretion rate suggesting much lower renal filtration *in vivo* relative to acetaminophen than expected based on unbound acetaminophen in plasma. We obtained predictions of urine composition of 59% glucuronide, 27.5% sulfate, 4.5% acetaminophen and 9% other metabolites (measured percentages were 59.9% glucuronide, 27.7% sulfate, 4.7% acetaminophen and 7.7% of other metabolites). Plasma acetaminophen area under the concentration curve at 24 h was close to the measured value (80  $\mu$ g/mL/h versus between 83 and 87.6  $\mu$ g/mL/h). The *Cmax* was predicted at 18.2  $\mu$ g/mL (observed values between 14.4 and 22.9  $\mu$ g/mL), and the peak concentration occurs after 60 min, as it was observed.

#### 3.2. *Dose-response modeling*

Figure 3 shows the data and the model for HepaRG cells exposed to acetaminophen. We estimated a *NEC* of 0 M and a value of  $1.88 \text{ h}^{-1}$  for *k*. The estimated EC50 is 5.1 mM, within the range of variation of published LC50 values, from 0.21 to 28.2 mM for human hepatocytes (Fey and Wrzesinski, 2012).

Figure 4 presents the expected dose-response for the three different PBPK-TD models. Despite some high differences in some PBPK parameters values, the resulting dose response relationships do not differ substantially. The standard deviation for *in vitro* cell viability in control HepaRG responses was estimated at 4.9%. If we calculate which dose would lead to a significant difference (at the level 0.05) compared to control situation, we obtain respectively 820, 690 and 500 mg/kg for the human data-based, the rat data based and the alternative methods-based PBPK/TD models.

#### 4. Discussion

4.1. Relevance of our PBPK models relative to other kinetics studies for rats and humans

For rats, we estimated a maximum velocity for glucuronide formation of 5.3 µmol/min/kg. This is twice the value found by Watari et al. (1983) for lower exposure doses (2.76 µmol/min/kg). Maximum velocity for sulfate formation at the start of the experiment was estimated at 3.5 µmol/min/kg, which is lower but close to the value from Watari et al. (1983), 4.92 µmol/min/kg. The pool of activated sulfate was estimated at a mean value of 417 µmol. As hypothesized, the rate of formation of new activated sulfate (10 µmol per hour) is low compared to this pool, which explains the rapid saturation (half depletion time is estimated at 95 min). The renal clearance we found (0.00031 L/min) is similar to the one measured by Watari et al. (1983), around 0.00035 L/min. The quantity of biliary excretion throughout time ranges from 9 to 43% after 4 hours, and from 27 to 57% at 24 hours. These ranges are in accordance with data from the literature with rats exposed to 600 mg/kg APAP (Hjelle and Klaasen, 1984), corresponding to 20-30% at 4 hours and 50% at 24 hours. We also performed kinetic simulation with our model for a low dose of exposure (50 mg/kg) to assess its ability to predict kinetics for concentrations far below those used in our experiments. We predicted that 85-95% of urinary excreted compounds would be acetaminophen sulfate, 5-15% being acetaminophen glucuronide. Around 10% of acetaminophen would be excreted into the bile. This is coherent with data measured in urine and bile (Hjelle and Klaassen, 1984; Watari et al., 1983) showing from 5 to 20% of biliary excretion at low doses. Our rat PBPK model consequently appears to be relevant relative to the data on acetaminophen kinetics available in the literature.

For humans, Rawlins *et al.* (1977) measured the time-course of plasma concentration for 6 volunteers after oral administration of 500, 1000 and 2000 mg acetaminophen and Schwarz *et al.* (2002) followed plasma concentration after oral ingestion of 1000 mg acetaminophen by 40 patients. They both showed an early peak in plasma concentration (in the first hour) and the half-lives were between 2.3 and 2.8 hours for the Rawlins study and above 3 hours in the Schwarz study. In our human PBPK model, calibrated on human data, we have both the early peak and a half life just below 3 hours at the doses these authors tested. The ratio between glucuronidation and sulfation at therapeutic dose (1-1.5 mg) is estimated by the model at 2, which is realistic (Bales *et al.*, 1984; Esteban *et al.*, 1996). Thus, the PBPK model based on human data appears to be relevant for the purpose of our study.

#### 4.2. *Comparison between the three calibrations of PBPK models*

The estimated parameters in Table 2 depending on the calibration method mainly differ relative to metabolism estimate. Clearly, rats and humans show qualitative and quantitative differences relative to metabolism. Mice may be a more relevant model than rats to understand the mechanisms of acetaminophen overdosing in humans (Jaeschke et al., 2011). As we found here for humans, in mice, sulfation is reduced compared to what takes place in rats and there is no sulfate depletion when toxicity occurs (Liu and Klaasen, 1996). In vitro value largely underestimated the maximum velocity, by a factor of 7 for sulfation, and of 20 for glucuronidation. This discrepancy is not surprising since the estimation of hepatic clearance with in vitro system is known to vary (Chaturvedi et al., 2001). Nevertheless, this difference is abnormally high. In the paper by Sohlenius-Sternbeck et al. (2012), an in vitro raw intrinsic clearance of 1.3  $\mu$ L/min/10<sup>6</sup> cells was found with cryopreserved human hepatocytes, with a predicted in vivo clearance of 9.5 mL/min/kg, close to the actual in vivo value (4 mL/min/kg). In our model, we used values in Riches et al. (2009), because we looked for data on sulfation and glucuronidation separately. It seems however that these values, which corresponds to 0.19  $\mu$ L/min/10<sup>6</sup> cells, largely underestimates the *in vivo* metabolism rate.

Excretion is overestimated through alternative methods (based on filtration rate and unbound fraction in blood). The difference may be due to acute renal toxicity, which is characterized by cellular injury primarily confined to the proximal tubule and significant reductions in glomerular filtration rate (Blantz, 1996).

As for the other parameters, QSAR predictions performed well. The estimated absorption rate was closer to the *in vivo* human estimate than the one based on the extrapolation from rats. The estimated fraction unbound to protein (*fup*) and *Kow*, that have been used for calculating partition coefficients were relevant enough to obtain similar partition coefficients between all methods. Note also that the *fup* was estimated for plasma at 0.88, in the range of *in vitro* measures of acetaminophen unbound fraction in blood from 0.68 to 0.95 (Summerfield *et al.*, 2006; Edginton *et al.*, 2006; Sohlenius-Sternbeck *et al.*, 2012).

#### 4.3. *Relevance of the TK/TD coupling*

*In vivo* cell viability is not an immediate endpoint to predict hepatotoxicity or hepatic failure. We just pointed out that a significant difference with control cell viability would be expected for an absorbed dose between 500 and 820 mg/kg, depending on the model selected. These estimates are close to the usual range of human overdose, between 150 and 500 mg/kg

(Jaeschke et al., 2011). It is important to realize that, in this paper, effects are deduced from concentration at organ level in a dynamic way (a differential equation) accounting explicitly for the time-dependence of the occurrence of adverse effects. Usually, in TK/TD approaches, in vivo and in vitro effects are related through the area under the curve (AUC) of the parent or metabolite concentration or their maximum concentration. Using a mechanistic and dynamic model to relate cell exposure concentration and cell death may provide more biological relevance. In particular, the extrapolation between different exposure durations or from one dose to repeated doses becomes straightforward. Moreover, a process of cell regeneration could easily been incorporated. It is also clear that the more data we would have for different exposure durations, the more robust the dynamic model would be. Here, data on cell viability after 24 and 48 h of exposure would have permitted to introduce additional parameters, accounting for instance for acetaminophen kinetics in the cells, which would have improved the relevance and the potential for extrapolation of the model. A substantial improvement may also come from a better characterization, in vitro and in vivo of the toxic metabolic pathway. The production of NAPQI is a function of both the intrinsic clearance for several CYP isozymes as well as competitive phase II metabolism. At the moment, the PBPK/PD approach we used ignores the impact of potential differences in CYP activities between the HepaRG cells and in vivo.

The dose-response curves obtained with the different calibrations of the human PBPK models did not differ substantially. The *in vitro* underestimation of the metabolism rate was partly compensated by the overestimation of the renal excretion. We performed additional simulations setting the renal excretion value in the PBPK model calibrated based on *in vitro* and *in silico* data to the same value as the two other calibrated models. In this case, for a given cell viability, the corresponding dose would have been divided by a factor of 3. For instance, in this case, the dose at which significant effects on *in vivo* cell viability would be expected was estimated at 155 mg/kg in this case.

The application of uncertainty factors is well established in toxicological risk assessment worldwide. The key issue for decision making is to assess the confidence one can have in a toxicological data or predictions. This is even more crucial when trying to predict effects *in vivo* based on the integration of many components either from experimental or computational sources. A PBPK/TD model calibrated only based on alternative methods may not have the same relevance as an *in vivo* test, but the derivation of a confidence interval, even large, may be enough to assess protectively the safety of a compound. In the cosmetics industry, with the ban of animal testing, this would, at least, permit to market the ingredients with low expected

concern based on rational risk estimation including a full characterisation of the inherent uncertainty. With PBPK/TD models, uncertainty should be assessed at all steps of integration and with all the sources. For instance, in the present study, quantifying the expected degree of difference between the metabolism rate estimated *in vitro* and the actual human one would have been of great interest. This process would be similar to the validation of Integrated Testing Strategies (ITS), in which the predictive capacity of the whole strategy may largely depend on the predictive capacity of each building block (De Wever *et al.*, 2012). At the moment, only one *in vitro* toxicokinetic method is accepted at the OECD level (OECD guideline 428 for *in vitro* dermal absorption). It has been suggested that methods to assess *in vitro* protein binding, *in vitro* metabolism and clearance, and *in vitro* oral absorption should undergo reliability assessment with a small sample of compounds with properties relevant for cosmetics (Adler *et al.*, 2011). Similarly, the same reliability assessment should also be applied to computational methods, such as the algorithms that predict partition coefficients (e.g. tissue:blood partitioning) in order to check their pertinence for the chemicals space covered by cosmetic ingredients.

#### Acknowledgments

The research leading to the results presented here has received funding from the European Community's Seventh Framework Program (FP7/2007-2013) and from Cosmetics Europe through the COSMOS project under grant agreement n° 266835. The experimental rat data have been obtained in the project ACTIVISME funded by the French ministry of ecology. The authors are very grateful to Alicia Paini who helped in the finalization of the work, so as to two anonymous reviewers who greatly helped to improve the readability of the manuscript.

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## Table 1

Parameters of the rat PBPK model. Values are either from the literature or estimated based on

the data we generated

C			
Body weight (kg)	BW		measured
Urinary volume (mL)	Vu		measured
Scaled volume of liver	scVl	0.037	Haddad et al., 1998
Scaled volume of adipose tissues	scVf	0.07	Haddad et al., 1998
Scaled volume of well perfused tissues	scVwp	0.11	Haddad et al., 1998
Scaled volume of poorly perfused tissues	scVpp	0.723	Haddad et al., 1998
Scaled volume of blood	scVbl	0.06	Haddad et al., 1998
Cardiac output (L/min/kg)	Fcard	0.296	Davies and Morries, 1993
Scaled liver blood flow	scFl	0.25	Haddad et al., 1998
Scaled adipose tissues blood flow	scFf	0.07	Haddad et al., 1998
Scaled well perfused blood flow	scFwp	0.54	Haddad et al., 1998
Scaled poorly perfused blood flow	scFpp	0.14	Haddad et al., 1998
Fraction of APAP entering liver	Fracing	0.9	Brown et al., 1979
Absorption rate from gut to stomach (min <sup>-1</sup> )	k <sub>gut</sub>	0.0116	estimated
Liver to blood APAP partition coefficient	$PC_l$	0.774	Rodgers and Rowland, 2006
Well perfused tissues to blood APAP partition	$PC_{wp}$	0.774	Rodgers and Rowland, 2006
coefficient	·· F		C ·
Poorly perfused tissues to blood APAP partition	$PC_{pp}$	0.66	Rodgers and Rowland, 2006
coefficient	ĨĨ		
Adipose tissues to blood APAP partition coefficient	$PC_f$	0.25	Rodgers and Rowland, 2006
Protein binding for APAP in liver	fupAPAP	0.75	Ishii et al., 2002
Protein binding for sulfate APAP	fupSULF	0.38	Ishii et al., 2002
Protein binding for APAPglucuronide	fupGLU	1.01	Ishii et al., 2002
Michaelis constant for APAP glucuronide formation	KmG	915	Watari et al., 1983
(μΜ)			
Michaelis constant for sulfate APAP formation (µM)	KmS	109	Watari et al., 1983
Maximum velocity for APAP glucuronide formation	VmaxG	5.3	estimated
(µmol/min)			
Maximum velocity for sulfate APAP formation per	vmaxS	0.00854	estimated
μmol sulfate (μmol/min/μmol)			
Total quantity of available sulfate (µmol)	QS	417	estimated
APAP urinary excretion rate (L/min)	$\tilde{k}_{APAPkid}$	0.00031	estimated
APAP glucuronide urinary excretion rate (L/min)	k <sub>GLUkid</sub>	0.0031	estimated
Sulfate APAP urinary excretion rate (L/min)	k <sub>SULFkid</sub>	0.024	estimated
Mercapturate urinary excretion rate (L/min)	k <sub>MERkid</sub>	0.00028	estimated
APAP glucuronide biliary excretion rate (L/min)	k <sub>GLUbil</sub>	0.0095	estimated
<b>`</b> `	22000		

## Table 2

Parameters of the human PBPK model, depending on the method we used to calibrate it (only alternative methods, extrapolation from the rat model, use of human data leading to re-

estimation).

Body weight (kg)	BW	73	Fixed
Urinary volume (mL)	Vu	1500	Fixed
Scaled volume of liver	scVl	0.025	Mielke and Gundert-Remy, 2009
Scaled volume of adipose tissues	scVf	0.25	Mielke and Gundert-Remy, 2009
Scaled volume of well perfused tissues	scVwp	0.08	Mielke and Gundert-Remy, 2009
Scaled volume of poorly perfused	scVpp	0.06	Mielke and Gundert-Remy, 2009
Cardiac output (L/min/kg)	Fcard	0.089	Mielke and Gundert-Remy, 2009
Scaled liver blood flow	scFl	0.255	Mielke and Gundert-Remy, 2009
Scaled adipose tissues blood flow	scFf	0.05	Mielke and Gundert-Remy, 2009
Scaled poorly perfused blood flow	scFpp	0.22	Mielke and Gundert-Remy, 2009
Fraction of APAP entering liver	Frac <sub>ing</sub>	1	Paixão et al. (2012)
C	8	0.9	Same value as for rats
		0.95	Re-estimated for humans.
Absorption rate from gut to stomach (min <sup>-1</sup> )	<i>k<sub>gut</sub></i>	0.032	QSAR estimate
	8	0.0116	Same value as for rats
		0.025	Re-estimated for humans
Liver to blood APAP partition coefficient	$PC_l$	0.79	QSAR estimate
		0.77	Same value as for rats
Well perfused tissues to blood APAP partition	$PC_{wp}$	0.79	QSAR estimate
coefficient	Ĩ	0.77	Same value as for rats
Poorly perfused tissues to blood APAP partition	$PC_{pp}$	0.68	QSAR estimate
coefficient	ĨĨ	0.66	Same value as for rats
Adipose tissues to blood APAP partition coefficient	$PC_f$	0.28	QSAR estimate
	5	0.25	Same value as for rats
Protein binding for APAP in liver	fupAPAP	0.88	QSAR estimate
		0.75	Same value as for rats
Michaelis constant for APAP glucuronide formation	KmG	6000	Riches et al., 2009
(μΜ)		915	Same value as for rats
Michaelis constant for sulfate APAP formation (µM)	KmS	300	Riches et al., 2009
		109	Same value as for rats
Maximum velocity for APAP glucuronide formation	VmaxG	36	Riches et al., 2009; Barter et al.,
(µmol/min/kg liver)			2007
		106	Extrapolated from rats
		720	Re-estimated for humans
Maximum velocity for sulfate APAP formation	VmaxS	2.9	Riches et al., 2009 ; Barter et al.,
(µmol/min/kg liver)			2007
		72	Extrapolated from rats
		20	Re-estimated for humans
APAP urinary excretion rate (L/min)	<i>k<sub>APAPkid</sub></i>	0.098	Calculated
		0.016	Scaled from rat model
Mercapturate urinary excretion rate (L/min)	<i>k<sub>MERkid</sub></i>	0	Default value
		0.015	Scaled from rat model

## **Figure legends**

**Fig. 1.** Schematic presentation of the PBTK model used to describe the kinetics of acetaminophen and its metabolites.

**Fig. 2.** Kinetics of acetaminophen and its two main metabolites (glucuronide and sulfate) in rat plasma (the data points are the measured values and the line represents the prediction for an individual with a median weight and urinary volume).

**Fig. 3.** HepaRG cell viability as a function of acetaminophen exposure concentration. Points represent the actual data and the line represents the regression of the data with our model.

**Fig. 4.** Predicted *in vivo* cell viability as a function of dose for the three different PBPK-TD models (plain lines: PBPK models calibrated on human data; dotted lines: PBPK model extrapolated from rats; dashed lines: PBPK models calibrated on *in vitro* and QSAR data only).

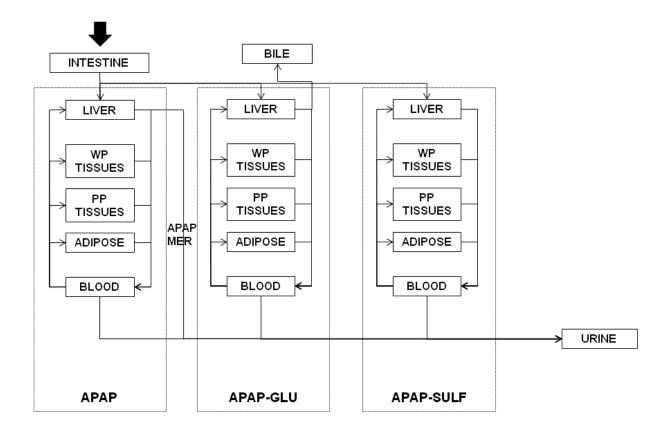
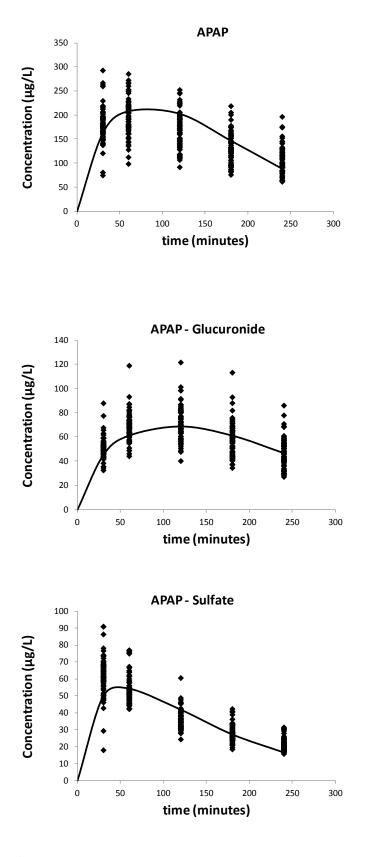


Fig. 1.





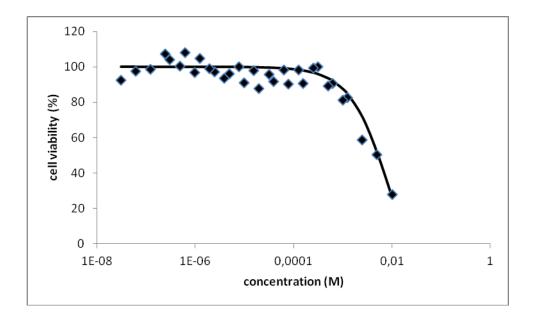


Fig. 3.

