

1 Development of a human physiologically based pharmacokinetic
2 (PBPK) model for phthalate (DEHP) and its metabolites: a bottom up
3 modeling approach
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40 **Abstract:**

41 DEHP exposure to human comes from different sources such as food, diet, cosmetics,
42 toys, medical products, and food wraps. Recently DEHP was categorized under non-
43 persistent endocrine disruptor compounds (EDCs) by the world health organization
44 (WHO). There is enough evidence from the rat experimental studies that phthalate
45 causes hepatic, developmental and reproductive toxicity. In human, DEHP rapidly
46 metabolizes into a toxic metabolite MEHP. This MEHP further metabolizes into the
47 different chemical forms of 5OH-MEHP, 5oxo-MEHP, 5cx-MEPP and phthalic acid. A
48 simple pharmacokinetics model has been developed for the DEHP with limited number
49 of metabolites. A chemical like DEHP that extensively undergoes metabolism
50 producing many harmful metabolites urges to develop a detail metabolic kinetics. A
51 physiological based pharmacokinetics (PBPK) model of DEHP that considers all the
52 major metabolites in human has not been developed yet. The objective of this study is to
53 develop a detail human PBPK model for the DEHP and its major metabolites by a
54 bottom-up modelling approach integrating in vitro metabolic data. This approach uses
55 an in-vitro to in-vivo extrapolation (IVIVE) method and Quantitative structure activity
56 relationship (QSAR) for the parameterization of the model. Monte Carlo simulations
57 were performed to estimate the impact of parametric uncertainty onto model
58 predictions. First the model was calibrated using control human kinetic study that
59 represents the time course of the DEHP metabolites in blood and urine. Then, the model
60 was evaluated against the published independent data of different dosing scenarios. The
61 results of model predictions for the DEHP metabolites in blood and urine were well
62 within the range of experimentally observed data and it also captured the trend of time
63 course profile similarly to the observed data, showing model good predictability. The
64 current developed PBPK model can be used for the prediction of the time course of
65 chemical concentrations not only in the blood and urine but also in the other
66 compartment even for different exposure scenarios. Moreover, this model can also be
67 used to explore different biomonitoring studies for human health risk assessment and
68 might be useful for integrative toxicological study in improving exposure-target tissue
69 dose–response relationship.

70 **Keywords:** DEHP; MEHP; Pharmacokinetics; PBPK; Human health Risk assessment;
71 IVIVE; Endocrine disruptors; human biomonitoring

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75 **1. Introduction**

76 Phthalates are ubiquitous environmental contaminants made up of dialkyl esters or alkyl
77 and aryl esters of ortho-phthalic acid (1,2-dicarboxylic acid). Among Phthalates Di-2-
78 ethylhexyl phthalate (DEHP) is the most important because of its large and widespread
79 uses in industries as a plasticizer. It is found in food, cosmetics, toys, medical products
80 and food packaging, mostly used as a plasticizer. The total dietary intake (TDI) of
81 50µg/kg BW/day limit has been set by the EFSA and the European chemical agency
82 (ECHA) to assess the risk related to DEHP exposure (EFSA, 2015; ECHA, 2010).
83 Recently reported studies on the total dietary intake mean value of DEHP in different

84 cohort studies for several countries estimated in the range of 0.42 to 11.67 µg/kg
85 bw/day, which is far below the threshold set by the EFSA and the ECHA (Fromme et
86 al., 2007; Dickson-Spillmann et al., 2009; Sioen et al., 2012; Heinemeyer et al., 2013
87 ;Martine et al., 2013 ; Martínez et al., 2017).

88 DEHP has a short half-life and it does not accumulate inside the body (Krotz et al.,
89 2012). DEHP completely metabolizes into a toxic metabolite mono-(2-ethylhexyl)
90 phthalate (MEHP). MEHP further metabolize into different chemical forms like 5-
91 hydroxy MEHP, 2-ethyl-5-carboxypentyl phthalate (5-Cx MEPP) and phthalic acid. 5-
92 oxo MEHP is another metabolite result of the 5-OH MEHP metabolism. Temporal
93 variability in phthalates exposure from the different sources and their ability to generate
94 several forms of metabolites can lead to a stable microenvironment exposure of
95 phthalates to internal organs. This could lead to a pseudo-steady state concentration
96 over a long period of exposure (Meeker et al., 2009).

97 Currently, DEHP is of concern on its categorization as a non-persistent endocrine
98 disruptor by the World Health Organization (WHO, 2010). Cobellis, (2003) in his
99 epidemiological study, linked to the exposure of DEHP and the prevalence of
100 endometriosis in women. Other studies have also shown that environment relevant dose
101 of phthalates alters estrous cycle, impaired oocyte maturation, decrease ovulation (Anas
102 et al., 2003; Krisher, 2013; Hannon et al., 2014). DEHP and its toxic metabolite MEHP
103 mainly alter the estrogen productions and its activity in granulosa cell, required for the
104 development and secretion of the follicles, which might lead to infertility due to hypo-
105 estrogenic, polycystic ovary and anovulatory cycles (Davis et al. 1994; Lovekamp-
106 Swan & Davis 2003). Several hypotheses on phthalates effect on male reproductive
107 toxicities were proposed based on animal studies, for more detail please refer to given
108 references (Richburg et al., 1999; Koji et al., 2001; Sharma et al., 2017a). Increased
109 DEHP urinary levels are associated with significant declines in the plasma testosterone
110 concentrations were reported in several cohort studies (Duty et al., 2005; Pan et al.,
111 2006).

112 To better estimate the physiological concentration of DEHP metabolites in the target
113 tissues such as gonads, it is necessary to understand its pharmacokinetics and the factors
114 controlling its distribution and metabolism within the quantitative framework of a
115 physiologically based pharmacokinetic model. Reliable Physiologically based
116 Pharmacokinetic (PBPK) model will be useful for the establishment of proper dosing
117 metrics for the target tissues (Fabrega et al., 2014), and its applicability to setup the
118 exposure-dose-response relationship for the systems toxicology model(Sharma et al.,
119 2017b, 2018). Since 1974, several pharmacokinetic analyses on the DEHP and its
120 metabolites have been conducted both in-vitro and in-vivo (animal and humans)
121 (Daniel and Bratt, 1974; Peck and Albro, 1982; Albro, 1986; Ito et al., 2005; Wittassek
122 and Angerer, 2008; Choi et al., 2013). Several pharmacokinetic (PK) models have been
123 developed accounting its major metabolites using simple compartmental approach
124 (Koch et al., 2003, 2004, 2005, 2006; Lorber et al., 2010). Koch et al., (2003, 2004,
125 2005) experimentally investigated several secondary metabolites concentration of
126 DEHP both in the blood and urine describing their time course kinetics. A PK model
127 developed by Lorber et al., (2010) has predicted the DEHP metabolites concentration
128 both in the blood and urine which involves empirical fitting of the two key parameter,
129 one is fraction of chemicals available to undergo metabolism, and, other is rate of
130 dissipation of metabolites, against the observed blood and urine concentration data.
131 However, It lacks the mechanistic metabolic kinetics (Michaelis-Menten reaction),

132 considered the most important biotransformation process. Keys et al., (1999) and Cahill
133 et al., (2003) developed a PBPK model of DEHP in both the rats and human, however,
134 these models have not included all the metabolites and their kinetics, which might be
135 due to insufficient data on the DEHP metabolic kinetics at that time. Recently, Choi et
136 al., (2012) reported the *in vitro* metabolic kinetics information on DEHP and its
137 metabolites both in the rat and human using hepatic cell line. To best of our knowledge,
138 there is no published detailed target tissue dosimetry model (PBPK), which becomes
139 essential for the chemical like DEHP that produces many metabolites (Daniel and Bratt,
140 1974; Ghosh et al., 2010). The purpose of this study is to develop a detailed PBPK
141 model for DEHP and its major metabolites for the adult human and its evaluation
142 against the experimental data. A bottom-up modeling approach was used for the
143 development of the model. It involves the integration of *in vitro* metabolic and *in silico*
144 data that uses IVIVE (in-vitro in-vivo extrapolation) and QSAR (Quantitative structure
145 activity relationship) tools. These tools have led to possibly build a PBPK model with
146 minimal or no animal experiments, supporting the 3Rs strategies of minimizing animal
147 use. An IVIVE tool has successfully been used in connection with a PBPK to derived
148 in-vivo kinetics from *in vitro* studies using biologically appropriate scaling (Yoon et al.,
149 2014; Martin et al., 2015). This work is part of two major EU projects, HEALS and
150 EuroMix, where different aspects of in silico models and its applications in human
151 biomonitoring are investigated (Martínez et al., 2017, 2018).

152 This article describes a physiologically based pharmacokinetic (PBPK) model
153 predicting the time variant concentrations of DEHP metabolites such as MEHP 5-OH
154 MEHP, 5-cx MEPP, and 5-oxo MEHP in plasma upon oral dosing of DEHP. The model
155 was used to simulate the cumulative amount of the DEHP metabolites in urine. The *in*
156 *vitro* human gut and hepatocyte DEHP metabolic kinetics data were scaled and
157 integrated into the model (Choi et al., 2013). The human experimental observed DEHP
158 metabolites concentration data both in the plasma and urine are used to calibrate the
159 PBPK model. The further model evaluation was done against the independent data on
160 DEHP kinetics for different dosing scenarios (Anderson et al., 2011). Prior mean
161 parameter values were obtained from the published literature or derived from the in-
162 vitro and in-silico experiments, whilst accounting for uncertainties in the range of ± 1 to
163 ± 1.5 standard deviation. After sensitivity analysis the most uncertain parameter yet
164 influential parameters were distributed statistically for Monte Carlo simulations.

165

166 **2. Models and Methods**

167 **2.1. Overview of the modeling approach**

168 The model was coded as a set of ordinary differential equations, written in the GNU
169 MCSim modeling language and solved by numerical integration using the R “deSolve”
170 package (Bois and Maszle 1997). Model parameters value was derived from *in vitro* and
171 *in-vivo* experiments reported in the literature or using the in-silico approach. Sensitivity
172 analysis of model was done using the mean value of the parameters. After sensitivity
173 analysis the most uncertain yet influential parameters were distributed statistically for
174 Monte Carlo simulations to estimate the impact on model predictions of uncertainty in
175 all of the selected parameters (Bois et al., 2010; Fàbrega et al., 2016). Model equations
176 are provided in Annex-B.

177 The exchange of the chemicals between blood and tissue in each organ is described by
178 flow limited processes i.e. we implement a perfusion rate-limited PBPK model (not

179 permeability limited). The model comprises several compartments i.e. gut, liver, blood,
180 fat, gonad and a compartment representing rest of the body (Fig.1). The gonad
181 compartment was included in the model for its later use in DEHP reproductive toxicity
182 assessment. The only metabolite MEHP was distributed to the given compartments,
183 while other metabolites were confined to the blood compartment presuming their
184 volume of distribution is equivalent to the plasma volume. All physiological parameters
185 such as blood flows and tissue volumes used in the model were obtained from the
186 published literatures (Davies and Morris, 1993; Brown et al., 1997; ICRP, 2002) and are
187 provided in Table A.1 of Annex. The partition coefficients and fractional unbound were
188 obtained from the in-silico approach or literature are provided in Table 1. The
189 calibration of the model was carried out against the human pharmacokinetic
190 experimental data on both the plasma and the urine level of DEHP metabolites reported
191 in Koch et al., (2004, 2005). This involves the plasma concentration data during the first
192 8 hours and the cumulative amount of metabolites in urine over 44 hours following an
193 oral dosing of 48.5mg. Further evaluation of the developed PBPK model was done
194 against the other independent pharmacokinetics study done by Anderson et al., (2011)
195 for two different dosing scenarios. In this study, all major metabolites are considered
196 namely; MEHP, 5-OH MEHP, 5-CX MEPP, 5-Oxo MEHP and phthalic acid. All the
197 metabolic parameters were derived from *in vitro* cell line study are provided in Table 1.

198 **2.2. Pharmacokinetics of DEHP and its Metabolite**

199 The rate of metabolite formation is assumed to be equal to the rate of parent compound
200 metabolism. DEHP metabolic pathway is provided in Fig.2. DEHP metabolizes to
201 MEHP, which metabolizes into different chemical forms i.e. 5-OH MEHP, 5cx-MEPP,
202 and 2cx-MEPP. Among them, 5-OH MEHP further metabolizes into 5-Oxo MEHP. All
203 the metabolites excrete via urine. Absorption of DEHP from the gut to the liver was
204 described by partition coefficient. Both DEHP and MEHP distributed to compartments
205 such as liver, fat, plasma and gonads. However, due to insufficient data on the partition
206 coefficients for other metabolites except MEHP, their distribution confined to the
207 plasma compartment. Thus the volume of distribution of metabolites other than MEHP
208 has set equal to the plasma volume.

209 **Absorption**

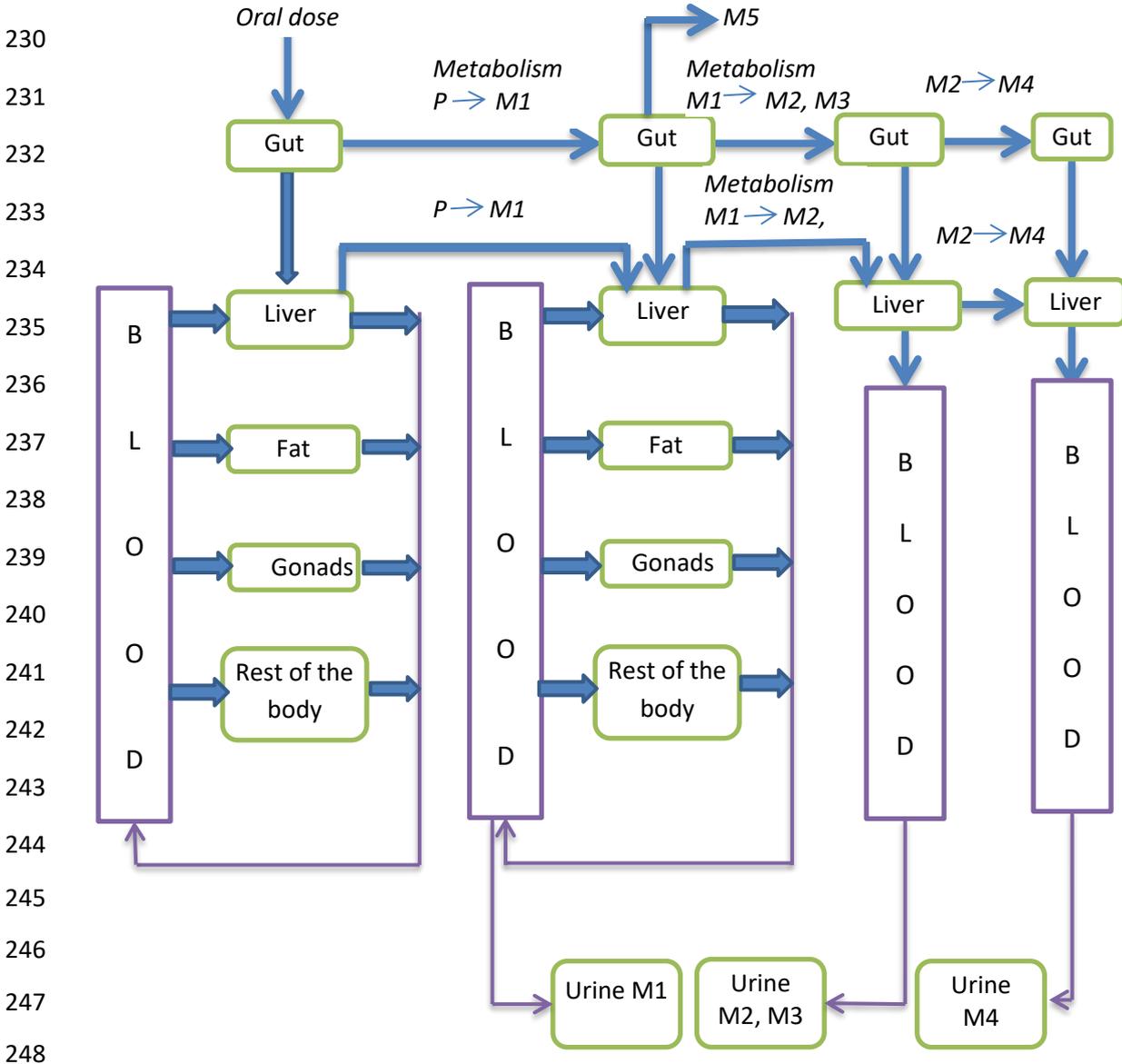
210 Koch et al., (2005) in his study reported that DEHP is completely absorbed from the gut
211 and rapidly metabolized into the MEHP in the liver. The distribution of DEHP from the
212 gut to the plasma is described by its partition coefficient between them. The partition
213 coefficient (gut: plasma) was estimated using QSAR approach of Poulin and Krishnan
214 tissue composition method (Poulin and Krishnan, 1996, 1995; Poulin and Theil, 2000).
215 The MEHP uptake from the gut the liver was described by the first order rate constant
216 (Adachi et al., 2015).

217 **Distribution**

218 Both the DEHP and the MEHP distribution to the several compartments was done
219 using their partition coefficients estimated by in-silico or derived from the published
220 literature and are provided in Table 2. DEHP partition coefficients were estimated using
221 the QSAR approach based on tissue composition method (Poulin and Krishnan, 1996,
222 1995; Poulin and Theil, 2000). A log ko/w of 7.6 was used to estimate the tissue:
223 plasma partition coefficients. MEHP partition coefficient values measured
224 experimentally via vial –equilibration method by Keys et al., (2000) was used for tissue

225 distribution. Other metabolites distributions restricted to the blood compartment only,
 226 assuming their volume of distribution equivalent to the plasma volume. The metabolites
 227 formed in the liver transfer to the blood using first order uptake rate constants and these
 228 parameters were calibrated against the Koch et al., (2005) experimental data.

229



249 **Fig. 1.** The figure represents a PBPK model for the DEHP and its metabolites. It includes mainly
 250 five compartments and clearance of chemical depends on both metabolism (mainly five metabolites)
 251 and urinary elimination. Following oral administration of DEHP(P), it readily metabolizes into
 252 MEHP (M1) and MEHP further metabolizes into 5-OH MEHP (M2), 5-cx MEPP (M3) and
 253 phthalic acid (M5). 5-OH MEHP (M2) is further metabolizing into 5-oxo MEHP (M4), for detail
 254 metabolic scheme refers to Fig. 2. The DEHP and MEHP are distributed to the given
 255 compartments. However other metabolites produced in guts and liver are transferred to blood
 256 compartments assuming their distribution in a single compartment. The metabolite phthalic acid
 257 (M5) was not utilized in this model for its further distribution to blood or its elimination (except for
 258 MEHP clearance, metabolic conversion to M5), as no data are available to calibrate its
 259 concentration in urine or blood.

260

261 Elimination

262 Elimination of DEHP and its metabolites in urine was assumed to be directly
263 proportional to its rate of clearance from the plasma. The model presumed that DEHP
264 clearance solely depends on its metabolism into MEHP (Koch et al., 2004, 2005, 2006;
265 Lorber et al., 2010).

266 The excretion rates for the MEHP and other metabolites were described by first order
267 rate equation. These excretion rates were obtained by using the relationship of
268 elimination rate constant and chemical's plasma half-life i.e. ratio of $\ln 2$ (0.693)/ $t_{1/2}$
269 (half-life). The mean half-lives for MEHP, 5-OH MEHP and 5-CX MEPP and 5-oxo
270 MEHP was estimated by Lorber et al., (2010) was used for the model parameterization.
271 . These parameters values were used for the model simulation and calibration against
272 the reported time course concentration of chemicals in the plasma and cumulative
273 excretion profile in the urine reported (Koch et al., 2005). The elimination rate constant
274 for MEHP was measured using half-life reported by Mittermeier et al., (2016).

275 2.3. *In vitro* intestinal and Hepatocyte metabolic studies

276 Metabolism of the DEHP both in the liver and gut to MEHP, 5-OH MEHP, 5oxo-
277 MEHP, 5cx MEPP and phthalic acid was described by the Michaelis-Menten equation
278 provided in Eq. (2). This equation includes two important parameters namely V_{max}
279 (maximum velocity of metabolic reaction) and K_m (affinity i.e. concentration at which
280 reactions occurs at half maximal rate). The *in vitro* intestinal and hepatic metabolic rates
281 for several DEHP metabolites were reported in Choi et al., (2012) where author has
282 described mainly five metabolites (MEHP, 5-OH MEHP, 5oxo-MEHP, 5cx MEPP and
283 phthalic acid) kinetic both in the microsomal and cytosol fraction of the intestine and
284 the liver. High intrinsic clearance rate i.e. ratio between V_{max} and K_m for the
285 metabolic conversion of DEHP to MEHP in the cytosolic fraction of intestine and liver
286 was observed (Choi et al., 2012). However, intrinsic clearance for other metabolites in
287 cytosolic fraction was reported to be insignificant. The in-vitro in-vivo extrapolation
288 (IVIVE) method, which involves scaling of *in vitro* V_{max} value to *in vivo* utilizes
289 physiological specific parameters such as tissue specific microsomal protein content or
290 cytosol protein, specific tissue volume and, body weight (Yoon et al., 2014) was used to
291 derive the metabolic parameters. The Eq. (1) describes the scaling approach which is
292 used to derive the V_{max} value as an input for the PBPK model. The Michaelis constant
293 i.e. K_m for the five metabolites in gut and liver were set equal to the reported in-vitro
294 cell line study provided in Table 1. The reported V_{max} in-vitro values, maximum rate of
295 reaction, were scaled to the whole body PBPK using Eq. (1). The reported quantity of
296 MSP in the liver (Godin et al., 2006), and the gut is 52.5 mg/g liver and 20.6 mg/g
297 intestine respectively (Godin et al., 2006; Cubitt et al., 2011). Mean value of 80.7 mg
298 and 18 mg of cytosolic protein per gram of the liver and the gut respectively are used
299 for the IVIVE approach (Gibbs et al., 1998). In-vivo scaled V_{max} values for each
300 metabolite are provided in Table 2. The schema of metabolism is provided in Fig. 2.

$$301 \quad V_{max}(\text{intestine/liver}) = (V_{max_{\text{invitro intestine/liver}}} * MPPGG/MPPGL/CytosolPGL/CytosolPGL * \\ 302 \quad V_{\text{gut}}/V_{\text{liver}})/BW^{.75} \quad \text{Eq. (1)}$$

303 Where,

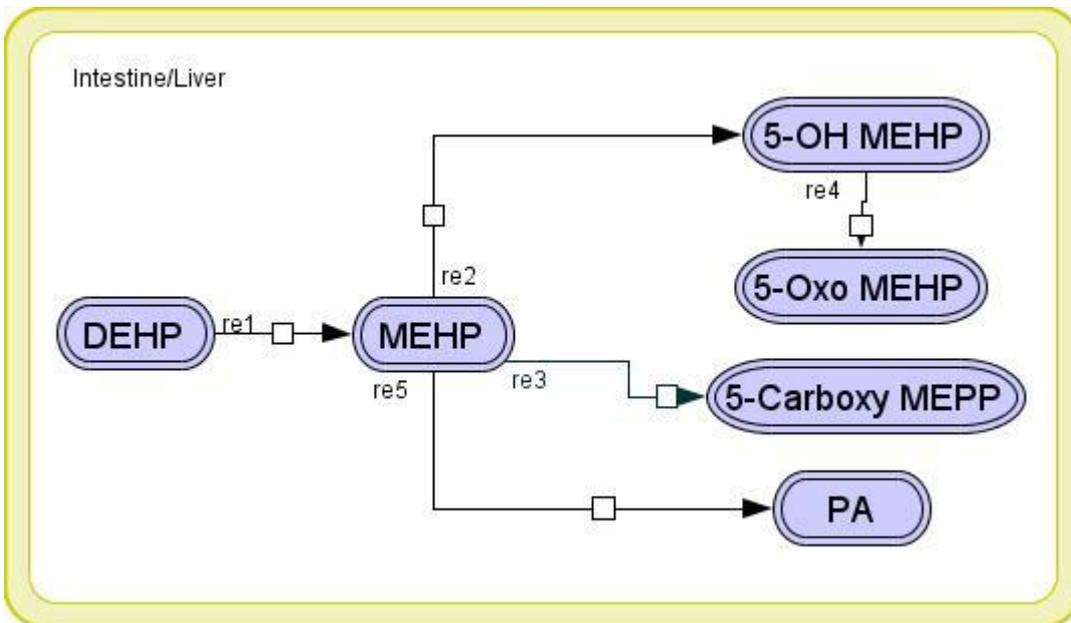
304 V_{max} is the maximum rate reactions value in the unit of $\mu\text{g/hr/kgBW}^{.75}$; MPPGG is the
305 microsomal protein per gram of gut; MPPGL is the microsomal protein per gram of

306 liver; CytosolPPG is the cytosolic protein per gram of gut; CytosolPGL is the cytosolic
 307 protein per gram of liver
 308 Vgut and Vliver is the volume of gut and liver respectively
 309

310
$$\frac{dA_{\text{mets}}}{dt} = \frac{V_{\text{max}} \cdot C_t \cdot f_u}{k_m + C_t \cdot f_u} \quad \text{Eq. (2)}$$

311 Where,
 312 C_t is the corresponding concentration in tissue and f_u is the fraction unbound constant.
 313 V_{max} ($\mu\text{g/hr/whole body weight}$) is the maximum rate for the corresponding reactions;
 314 K_m is the affinity constant concentration at which half of the V_{max} occurs.
 315 $\frac{dA_{\text{mets}}}{dt}$ is the rate of production of metabolites
 316

317 **Metabolism pathway**



318
 319 **Fig. 2. Represent the schematic metabolic pathway of DEHP in the human gut and liver. The**
 320 **productions of metabolites follow same structure in PBPK and were described using Michaelis**
 321 **Menten equation. The corresponding re1, re2, re3, re4, and re5 represent the Michaelis-Menten**
 322 **metabolic reaction used in the model represented in the Eq. (2).**

323 **2.4. In vivo Human Pharmacokinetics study**

324 In-vivo pharmacokinetics of DEHP and its metabolites are well characterized in several
 325 studies (Koch et al., 2006, 2005, 2004; Anderson et al., 2011; Lorber et al., 2010). Koch
 326 et al., (2004, 2005) studies involved the self dosing of 48.5 mg of D4-DEHP by
 327 volunteer (n = 1) . The volunteer aged 61, 175 cm tall and weighing 75 kg. Plasma
 328 concentrations for MEHP, 5-OH MEHP, 5-oxo MEHP and 5-Cx MEPP were measured
 329 at 2,4, 6 and 8.3 hours upon DEHP self dosing. In the same study, urine samples were
 330 collected until 44hr and the cumulative amount of DEHP metabolites were reported.
 331 This study was accounted for the model calibration. Koch et al., (2005) monitored two
 332 metabolites namely 5-cx MEPP and 2cx MMHP in both plasma and urine. Koch et al.,
 333 (2005) found 5-OH MEHP and 5-cx MEPP as major metabolites in the urine and

334 observed no dose dependency related to the amount of metabolites. The 5-cx MEPP
335 metabolite was not included in the current model since there is no data on its metabolic
336 kinetics (rate of production).

337 Anderson et al., (2011) analyzed DEHP pharmacokinetics in urine. For this analysis,
338 two scenarios were considered: one at the high dose of 2.8 mg D4-DEHP and second at
339 a low dose of 0.31mg D4-DEHP. This pharmacokinetics study included 20 volunteers
340 (10 males and 10 females) of following characteristics aged greater than 18 years, BMI
341 between 19 and 32kg/m² and body weight greater than 60 kg. The cumulative amount of
342 DEHP metabolites concentration in urine was reported as a percentage of mole dosing.
343 The cumulative DEHP metabolites urine data were used for evaluation of the developed
344 model keeping all the model's parameters same except subject body characteristics such
345 as BW and BMI.

346 2.5. Sensitivity analysis

347 A Local sensitivity analysis was carried out for the PBPK model. The R package FME
348 was used, which measures the alteration in model output for the variable of interest by
349 changing each parameter by 1 percentage up and down whilst keeping other ones
350 constant. Detailed information about the functions of FME can be found in Soetaert and
351 Petzoldt, (2010).

$$352 \quad S_{i,j} = \frac{\partial y_j}{\partial p_i} * \frac{V_{p_i}}{V_{y_j}}$$

353 Where,

354 $S_{i,j}$ is the sensitivity of parameter i for model variable j and is normalized and
355 dimensionless. y_j is a model output variable (DEHP Metabolites time-plasma
356 concentration profile), p_i is parameters involved in PBPK model, V_{p_i} is the scaling of
357 parameters p_i and V_{y_j} is the scaling of variable y_j .

358 These sensitivity functions collapsed into a summary of sensitivity values and it
359 includes L1 norm, L2 norm, Mean, Min and Max. The magnitude of the time-averaged
360 sensitivity values was used to rank the parameters.

$$361 \quad \text{Where } L1 = \sum \frac{|S_{ij}|}{n} \quad \text{and} \quad L2 = \sqrt{\sum \frac{(S_{ij}^2)}{n}}$$

362 2.6. Parameter and its distribution

363 Human physiological data, *in vitro* data and QSAR estimates, were used for the
364 parameterization of the model. Only Pharmacokinetic specific parameters such as
365 partition coefficients, metabolisms and elimination rate constant are selected for
366 uncertainty analysis. Prior mean parameter values were obtained from in-silico, in-vitro
367 and in-vivo experiments reported in the literature. The model parameters value is
368 provided in Table 1. The model parameters are distributed log normally in the range of
369 ± 1 to ± 1.5 standard deviations accounting uncertainty on model predictions. Monte
370 Carlo simulations were performed to estimate the uncertainty proceeded by sampling
371 one random value (out of its assigned distribution) for each selected parameter. The
372 model was then run and its outputs (predictions) recorded. Those two steps were

373 iterated 20000 times, and the collected output values formed a random sample, for with
 374 we computed the mean, the SD, and any percentile of interest.

375

Table 1. DEHP parameter values and statistical distributions

Parameters	Symbols	Units	Values or distributions	References
Molecular weight (DEHP)	<i>MW</i>	g/mole	391	-
Molecular weight (D4-MEHP)	<i>MW</i>	g/mole	281	Anderson et al., (2011)
Molecular weight (MEHP-OH)	<i>MW</i>	g/mole	297	Anderson et al., (2011)
Molecular weight (D4-5-oxo MEHP)	<i>MW</i>	g/mole	295	Anderson et al., (2011)
Molecular weight (D4-5-cx MEPP)	<i>MW</i>	g/mole	311	Anderson et al., (2011)
Octanol:water partition coefficient	<i>LogKo:w</i>	-	7.60 ^a	-
Partition coefficients				
Gut/Plasma	<i>k_gut_plasma</i>		<i>LN</i> (12.86, 1.1) _b	-
Liver /Plasma	<i>k_liver_plasma</i>	-	<i>LN</i> (10.16, 1.1) _b	-
Gonads/Plasma	<i>k_gonads_plasma</i>	-	<i>LN</i> (6.5, 1.1) ^b	-
Fat/Plasma	<i>k_fat_plasma</i>	-	<i>LN</i> (188, 1.1) ^b	-
Rest of the body/Plasma	<i>k_restbody_plasma</i>	-	<i>LN</i> (6.24, 1.1) _{b*}	-
Liver/ Plasma	<i>k_liver_plasmaM1</i>	-	<i>LN</i> (1.7, 1.1)	(Keys et al., 2000)
Gonads/Plasma	<i>k_gonads_plasmaM1</i>	-	<i>LN</i> (0.6, 1.1)	(Keys et al., 2000)
Fat/Plasma	<i>k_fat_plasmaM1</i>	-	<i>LN</i> (0.12, 1.1)	(Keys et al., 2000)
Rest of the body/Plasma	<i>k_restbody_plasmaM1</i>	-	<i>LN</i> (0.38, 1.1)	Set to slow perfused organ (muscle) (Keys et al., 1999)

Uptake rate of 5-OHMEHP to blood	K_{tM2}	1/h	$LN (.07, 1.5)$	Optimized against data of Koch et al., (2003, 2005)
Uptake rate of 5-oxo MEHP to the blood	K_{tM4}	1/h	$LN (0.08, 1.5)$	Optimized against data Koch et al., (2003, 2005)
<i>Absorption and elimination parameters</i>				
Unbound fraction in plasma for MEHP	fup	-	0.007	(Adachi et al., 2015)
Oral absorption rate	kgut	1/h	$LN (7, 1.5)$	(Adachi et al., 2015)
Elimination rate constant (M1)	kurineM1	1/h	$LN (0.35, 1.1)^c$	Calculated
Elimination rate constant (M2)	kurineM2	1/h	$LN (0.69, 1.1)^c$	Calculated
Elimination rate constant (M3)	kurineM3	1/h	$LN (0.69, 1.1)^c$	Calculated
Elimination rate constant (M4)	kurineM4	1/h	$LN (3.47, 1.1)^c$	Calculated
<i>Metabolic parameters for DEHP and its metabolites in the gut</i>				
DEHP to MEHP in intestinal MSP maximum reaction value	vmaxgutM1	$\mu\text{g}/\text{min}/\text{mg}$ MSP	$LN (0.11, 1.1)^d$	(Choi et al., 2013)
Conc. at half maximum value	kgutM1	$\mu\text{g}/\text{L}$	6956	(Choi et al., 2013)
DEHP to MEHP in gut cytosol maximum reaction value	vmaxgutM1_cyt_invitro	$\mu\text{g}/\text{min}/\text{mg}$ cytosol	$LN (0.312, 1.1)^d$	(Choi et al., 2013)
Conc. at half maximum value	kgut_cytM1	$\mu\text{g}/\text{L}$	7038	(Choi et al., 2013)
MEHP to 5-OH MEHP maximum reaction value	vmaxgutM2_invitro	$\mu\text{g}/\text{min}/\text{mg}$ MSP	$LN (0.0012, 1.1)^d$	(Choi et al., 2013)
Conc. at half maximum value	kgutM2	$\mu\text{g}/\text{L}$	22508	(Choi et al., 2013)
MEHP to 5-carboxy MEPP maximum reaction value	vmaxgutM3_invitro	$\mu\text{g}/\text{min}/\text{mg}$ MSP	0	(Choi et al., 2013)

Conc. at half maximum value	kmgutM3	µg/L	0	(Choi et al., 2013)
MEHP-OH to 5-oxo MEHP maximum reaction value	vmaxgutM4_invitro	µg/min/mg MSP	LN (0.0012, 1.5) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmgutM4	µg/L	219076	(Choi et al., 2013)
MEHP to phthalic acid maximum reaction value	vmaxgutM5_invitro	µg/min/mg MSP	LN (0.285, 1.1) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmgutM5	µg/L	187652	(Choi et al., 2013)
<i>Metabolic parameters for DEHP and its metabolites in the liver</i>				
DEHP to MEHP in liver MSP maximum reaction value	vmaxlivM1	µg/min/mg MSP	LN (0.112, 1.1) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmlivM1	µg/L	11847.3	(Choi et al., 2013)
DEHP to MEHP in liver cytosol maximum reaction value	vmaxlivM1cyt_invitro	µg/min/mg cytosol	LN (0.036, 1.1) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmliv_cytM1	µg/L	2228.7	(Choi et al., 2013)
MEHP to 5-OH MEHP maximum reaction value	vmaxlivM2_invitro	µg/min/mg MSP	LN (0.172, 1.1) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmlivM2	µg/L	7980.4	(Choi et al., 2013)
MEHP to 5-carboxy MEPP maximum reaction value	vmaxlivM3_invitro	µg/min/mg MSP	LN (0.0023, 1.5) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmlivM3	µg/L	1124	(Choi et al., 2013)
MEHP-OH to 5-oxo MEHP maximum reaction value	vmaxlivM4_invitro	µg/min/mg MSP	LN (0.003, 1.1) ^d	(Choi et al., 2013)
Conc. at half maximum value	kmlivM4	µg/L	23,117.7	(Choi et al., 2013)
MEHP to phthalic acid maximum reaction value	vmaxlivM5_invitro	µg/min/mg MSP	LN (0.088, 1.1) ^d	(Choi et al., 2013)

Conc. at half maximum value	kmlivM5	µg/L	141315	(Choi et al., 2013)
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376 a = value taken from PubChem
377 b = partition coefficient calculated based on tissue composition method using (Poulin and Krishnan, 1996, 1995;
378 Poulin and Theil, 2000)
379 c = value is first estimated applying following relationship i.e. elimination rate constant = $0.693/t_{1/2}$
380 d = parameters value needs to scale to whole body weight prior to use in model
381

382 3. Results and Discussions

383 In this study, parameters such as partition coefficient, biochemical (metabolism),
384 absorption, elimination as an input and target variables such as DEHP metabolites
385 concentration as a model output, were considered to conduct sensitivity analysis and
386 uncertainty analysis. The bottom up approach was used for the development of the
387 PBPK model and all parameters were derived from in-silico (QSAR), *in vitro*
388 (metabolism) and published literature. The results are described and discussed in the
389 following subsection

390 3.1. Sensitivity analysis results

391 The local sensitivity analysis was carried out for all the kinetic parameters that were
392 used in the development of PBPK model. The human physiological parameters were
393 not included for the Monte Carlo and the sensitivity analysis assuming their inherent
394 variability. The sensitivity coefficient of parameters were estimated using R FME
395 package (Soetaert and Petzoldt, 2010) (described in section 2.5) that uses the initial
396 parameter value with allowable relative change in parameters one by one. The results
397 are provided in Table 2. It includes L1 and L2 norm, mean, minimum, maximum, and
398 ranking. The table summarizes the statistics of the normalized and dimensionless
399 parameter sensitivity results. The parameters were ranked based on L1 value and a
400 parameter with higher value signifies their higher sensitiveness towards the model
401 output. The biochemical parameters such Vmax and Km value have very close
402 sensitivity coefficient. The mean sensitivity coefficient of Vmax shows its negative
403 effect and the Km has positive effect on the model output. , Hence in uncertainty
404 analysis, only Vmax has subjected to statistical distribution not Km as sensitivity results
405 shows that they are highly correlated with each other. The VmaxliverM2 (metabolism
406 of MEHP to MEHP-OH) is the most sensitive parameter (Rank 1) following partition
407 coefficient of liver:plasma (Rank 3). The partition coefficient for the rest of the body
408 and the metabolism of DEHP in the cytosol fraction of both gut and liver are under the
409 rank of 10, considering relatively more sensitive than other parameters. The plots for
410 sensitive analysis output i.e. mean sensitivity coefficient are provided in Fig. A.1
411 (Annex-A). The summary statistics tables of parameters' sensitivities for the output of
412 DEHP metabolites concentration in plasma is provided in Table. A.9- A.12 (Annex-A).

Parameters	L1	L2	Mean	Min	Max	Rank
vmaxliverM2	0.61	0.01	-0.45	-3.40	1.00	1
kmliverM2	0.60	0.01	0.44	-1.00	3.39	2

k_liver_plasma	0.57	0.01	-0.57	-2.08	0.00	3
vmaxliverM4	0.43	0.01	-0.36	-3.63	0.99	4
kmliverM4	0.38	0.01	0.32	-0.99	3.39	5
k_restbody_plasma	0.32	0.01	0.27	-0.92	3.85	6
vmaxgut_cytM1	0.30	0.00	-0.29	-8.86	0.54	7
k_liver_plasmaM1	0.29	0.00	-0.14	-1.00	0.40	8
vmaxliver_cytM1	0.21	0.00	-0.21	-3.09	0.12	9
kmliver_cytM1	0.20	0.00	0.20	-0.12	3.04	10
vmaxliverM3	0.19	0.00	0.08	-0.32	1.00	11
kmliverM3	0.18	0.00	-0.07	-1.00	0.32	12
kurineM3	0.17	0.00	-0.15	-2.79	1.00	13
ktM2	0.17	0.00	0.05	-0.67	1.00	14
ktM4	0.15	0.00	0.15	0.00	1.00	15
kmgut_cytM1	0.15	0.00	0.15	-0.30	6.45	16
kurineM2	0.15	0.00	-0.13	-2.20	1.00	17
kurineM1	0.13	0.00	-0.03	-0.47	1.00	18
vmaxgutM1	0.12	0.00	-0.12	-3.57	0.22	19
kurineM4	0.10	0.00	-0.09	-1.13	0.98	20
k_restbody_plasmaM1	0.09	0.00	-0.08	-0.71	0.20	21
vmaxliverM1	0.08	0.00	-0.08	-1.18	0.05	22
kmliverM1	0.08	0.00	0.08	-0.05	1.17	23
kmgutM1	0.06	0.00	0.06	-0.12	2.59	24
k_gut_plasma	0.05	0.00	0.05	0.00	0.37	25
k_gonads_plasma	0.04	0.00	0.04	-0.04	1.59	26
vmaxgutM2	0.03	0.00	0.03	-0.05	1.00	27
kmgutM2	0.03	0.00	-0.03	-1.00	0.00	28
vplasmad	0.03	0.00	-0.03	-1.00	0.00	29
kmliverM5	0.02	0.00	0.02	-0.06	0.10	30
vmaxliverM5	0.02	0.00	-0.02	-0.10	0.03	31
k_fat_plasmaM1	0.02	0.00	0.00	-0.10	0.74	32
k_fat_plasma	0.01	0.00	-0.01	-0.23	0.08	33
k_gonads_plasmaM1	0.01	0.00	0.01	-0.02	0.66	34
vmaxgutM5	0.00	0.00	0.00	-0.03	0.03	35
kmgutM5	0.00	0.00	0.00	-0.01	0.03	36
vmaxgutM4	0.00	0.00	0.00	0.00	0.01	37
kmgutM4	0.00	0.00	0.00	-0.01	0.00	38

413 Table 2: Sensitivity results for both the rat and human PBPK model. It includes L1 and
414 L2 norm, mean, minimum, maximum, and ranking. Ranking of parameter sensitivity
415 coefficient was done based on L1 norm.

416 3.2. PBPK model calibration results and its evaluation with independent data

417 The time course of DEHP metabolites concentration in plasma and cumulative amount
418 in urine were predicted at median, 2.5 and 97.5 percentiles and 20 random predictions.
419 PBPK model has accounted the parameter statistical distribution followed by sampling

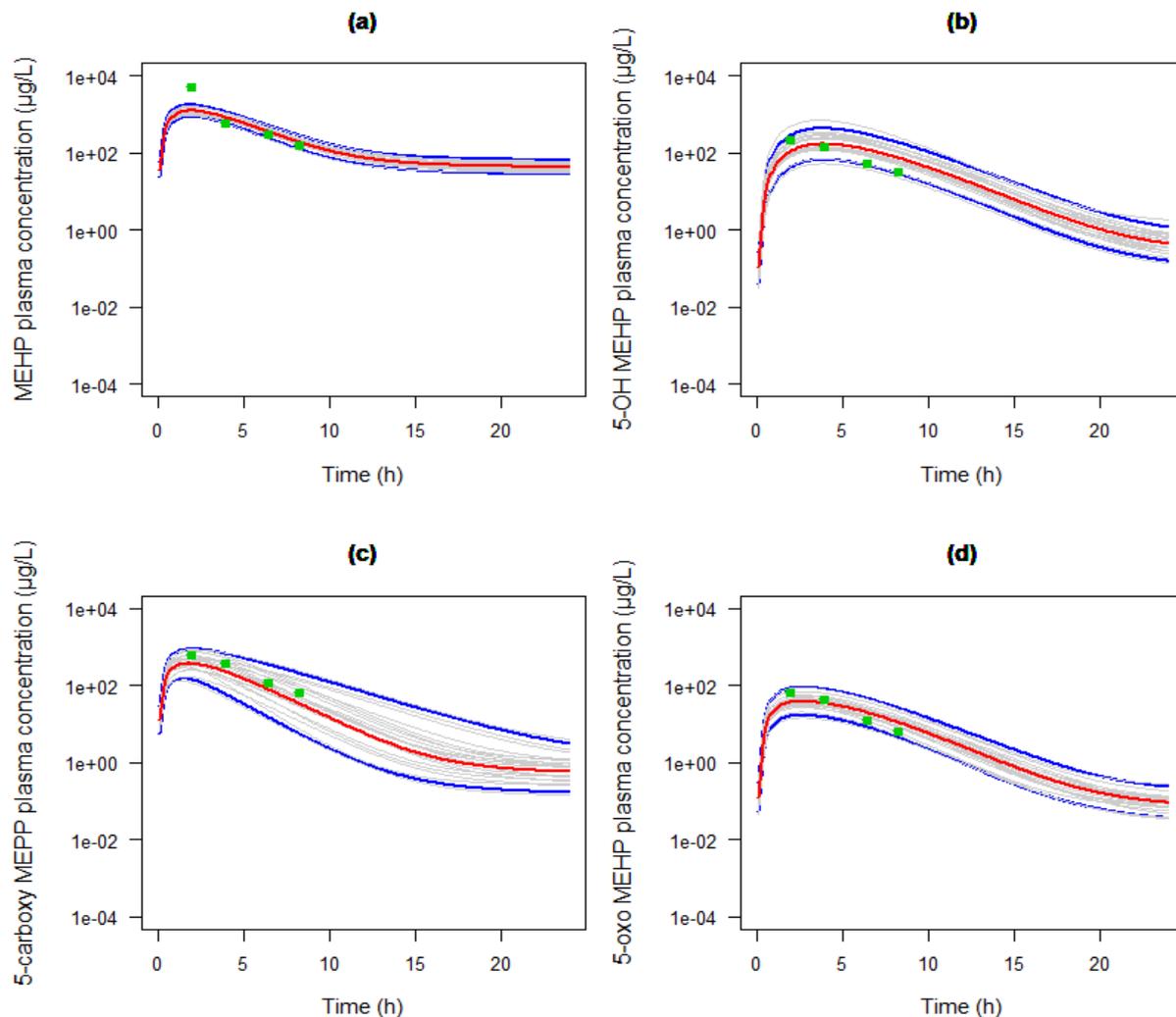
420 one random value (out of its assigned distribution) and performing Monte Carlo
421 simulation reflecting uncertainty in the model. The model does not include any
422 variability factor related to physiological parameters. For the metabolic uncertainties
423 only Vmax values were statistically distributed but not Km considering that they are
424 highly correlated with each others. Single oral dose of 48.5mg DEHP as an input and the
425 observed concentration of metabolites both in the blood and urine as an output were
426 used to calibrate the model. Most of the parameters were derived via either from in-
427 silico (estimation of the partition coefficient) (Poulin and Krishnan, 1996, 1995; Poulin
428 and Theil, 2000) or from *in vitro* such as, partition coefficient determined (Keys et al.,
429 2000) and *in vitro* metabolic data (human hepatocyte and intestinal cell line) (Choi et
430 al., 2013). The parameters such as elimination rate constants for the metabolites are
431 derived using mathematical relationship described in models and methods section. The
432 absorption rates of metabolites (mass transfer) from the gut to the liver were set as one
433 (complete mass transfer) except MEHP whose absorption rate constant was derived
434 from the literature (Adachi et al., 2015). . The mass transfer rate of metabolites from the
435 liver to the blood was calibrated against the observed data (Koch et al., 2005). The
436 model was developed using the parameters derived from in-silico, *in vitro* data, and
437 previously published literature, and certain default parameter values, which needed to be
438 calibrated. Instead of optimizing all the parameters very specifically to get a point to
439 point prediction against the observed data rather we statistically distributed all the
440 parameters in a range of $1-1.5 \pm SD$ (standard deviation) providing range of predictions.
441 Then the model was verified against the blood and urine metabolites concentration data
442 reported by Koch et al., (2005), so that observed data for all metabolites fall within the
443 range (2.5^{th} - 97.5^{th}) of model predictions. The predictions of the DEHP metabolites
444 concentration in blood and urine included their metabolic kinetics both in the gut and
445 the liver described by Michaelis Menten equation. And the parameters such as Vmax
446 and Km were estimated *in vitro* by Choi et al., (2013) were scaled to the whole body
447 (based on organ weight) and integrated into the model.

448 Fig. 3 (a-d) represents the PBPK model predictions for plasma concentrations of four
449 DEHP metabolites. It can be observed that the model predictions agree quite closely to
450 the observed data. The cumulative excretion of DEHP metabolites is also adequately
451 predicted by the model represented in Fig. 4 (a-d) and Table 2. The recently reported *in*
452 *vitro* metabolism data shows that the production rate of MEHP from the DEHP is very
453 high (Choi et al., 2013). A similar trend of the kinetic profile was also reported by
454 Koch et al., (2005) where he observed very low or undetectable DEHP blood
455 concentration. Given the above facts, the clearance of DEHP is presumed to completely
456 depend on its metabolic conversion to MEHP. The Fig. 3 (a) shows that predicted Cmax
457 (highest chemical plasma concentration) of the MEHP is slightly lower than the
458 observed data even at 97.5 percentile simulation. However, the time course trend of
459 chemical concentrations in plasma is similar to the observed data points. In addition to
460 that, post Cmax, the predictability of the model are in close agreement with the
461 observed points. The clearance of MEHP from the body includes both its metabolism
462 and the urinary elimination.

463 Fig. 3 (b) represents the model predictions for MEHP-OH concentrations in blood at
464 2.5, 50 (median) and 97.5th percentiles including 20 random simulations, and the
465 observed data in green dots. The blood C_{max} value for 5-OH MEHP is lower than
466 MEHP and 5-Cx MEPP and more than its metabolite 5-oxo MEHP. The observed data
467 points at the terminal elimination are predicted at the lower boundary of the model,
468 where almost all chemicals are eliminated. All the observed blood data points are within
469 the range of the model prediction (2.5, 50 and 97.5th percentiles). The observed
470 production rate of 5-OH MEHP in gut and liver i.e. *in vitro* metabolism data (V_{max}) is
471 higher than the other metabolites (Choi et al., 2013). However, reported blood
472 concentration by Koch et al., (2005) is less than 5-Cx MEPP, another metabolite. The
473 reason for its lower blood plasma concentration is might be due to its higher volume of
474 distribution than the other metabolites, the similar observation was noted previously by
475 Lorber et al., (2010) during the calibration of the model. The other reasons might be its
476 higher clearance to the urine and its further metabolism to 5-oxo MEHP. The
477 production of 5-OH MEHP depends on the MEHP concentration in both the liver and
478 the gut, and then its distribution to the blood. The transfer of 5-OH MEHP from the
479 liver to blood was done using first order rate constant and is calibrated against the
480 observed data. 5-OH MEHP clearance was done based on both its metabolism to the 5-
481 oxo MEHP and the urinary elimination. The urinary elimination was described using
482 first order using first order rate constant.

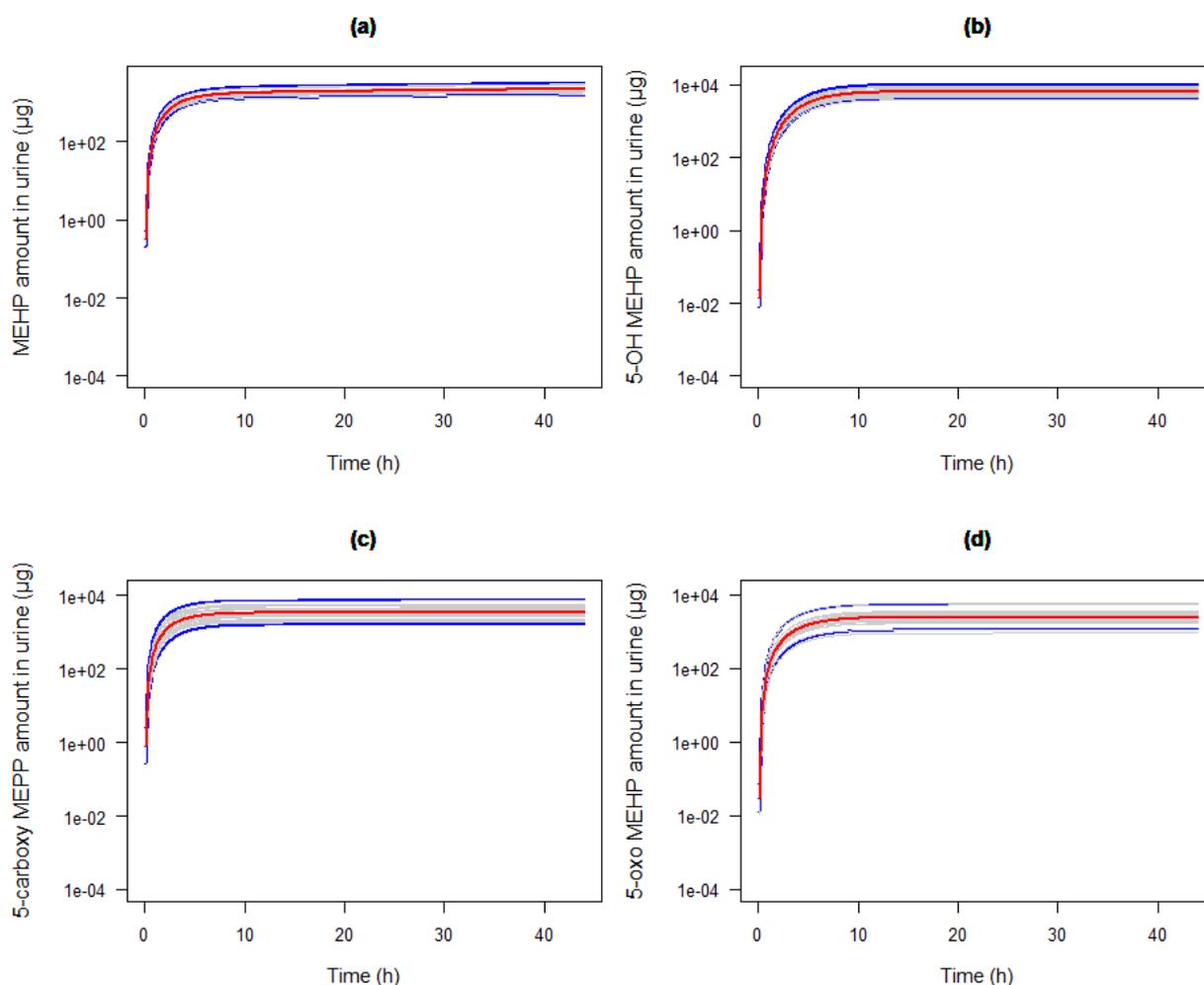
483 Similarly, PBPK model predictions for 5-cx MEPP plasma concentrations as shown in
484 Fig. 3 (c), which is the metabolite of MEHP, appears to be in close agreement with
485 observed data points. The volume of distribution (V_d) was confined to the plasma
486 compartment volume since the distribution of the compound is unknown. The
487 production of 5-cx MEPP metabolite from the MEHP in the gut was reported to be null
488 in the *in vitro* experiment (Choi et al., 2013). So, the concentration of 5-oxo MEPP only
489 depends on its production in the liver from the MEHP. Its clearance was described using
490 first order rate constant from the blood to urine.

491 The model predictions for 5-oxo MEHP plasma concentrations as shown in Fig. 3(d),
492 results from metabolism of 5-OH MEHP in both gut and liver, are in close agreements
493 with the observed concentrations. All the observed data points are in compliance with
494 the predicted range of percentile. Its production in gut and liver from the 5-OH MEHP
495 is described using Michaelis Menten reaction. Its volume of distribution is confined to a
496 single compartment of plasma volume. The urinary elimination was described using
497 first order elimination rate from the systemic circulation.



498 Fig. 3. PBPK model predictions of DEHP metabolites plasma concentration following 48.5 mg oral
 499 dose in human. Red lines: median predictions; blue lines: 2.5 and 97.5 percentiles; gray lines: 20
 500 random simulations. (a) Represents MEHP plasma concentration. (b) Represents 5-hydroxy MEHP
 501 plasma concentration. (c) Represents 5-carboxy MEPP plasma concentration. (d) Represents 5-oxo
 502 MEHP plasma concentration. The green dots indicate the observed concentrations reported in
 503 (Lorber et al., 2010). Dose unit is converted to microgram prior to use as an input for the model.
 504

505 The four metabolites' blood concentrations are not only in close agreement with
506 observed data points but also captured the time course profile. The Fig. 4 (a-d),
507 presented PBPK prediction of the cumulative amount (μg) urinary excretion of
508 four metabolites for 44hr at median, 2.5 and 97.5 percentiles and for 20 random
509 simulations. The simulated urinary amount of DEHP metabolites (cumulative
510 amount) are also in compliance with the experimentally observed cumulative
511 amount (Koch et al., 2005), results are provided in Table 2. It also summarizes the
512 predicted vs observed metabolites elimination as a percent of applied dose in mole
513 for three dosing scenarios based on Koch et al., (2005) study. The observed
514 metabolites as a percentage of mole doses are within the range of predictions of
515 the model not only for high dose (use for calibration) but also for other two
516 independent dosing scenarios such as medium (2.15 mg) and low dose (0.35 mg).



517 **Fig. 4. PBPK model predictions of DEHP metabolites amount in urine following 48.5 mg oral**
518 **dose. Red lines: median predictions; blue lines: 2.5 and 97.5 percentiles; gray lines: 20**
519 **random simulations. (a) Represents MEHP cumulative amount (μg) in urine. (b) Represents**
520 **5-hydroxy MEHP cumulative amount (μg) in urine. (c) Represents 5-carboxy MEPP**
521 **cumulative amount (μg) in urine. (d) Represents 5-oxo MEHP cumulative amount (μg) in**
522 **urine. Dose unit is converted to microgram prior to use as an input for the PBPK model.**

523

Table 3. Observed and PBPK predicted amount of DEHP (μg) metabolites in urine

The cumulative amount of Metabolites (μg) of the D4-DEHP in urine						
Study involved	Dose	MEHP	5OH-MEHP	5cx-MEPP	5oxo-MEHP	Total dose in μg or percent
Koch et al., (2005) ^a	48,500 μg	2500	9000	7500	5000	23500 μg
Present study 2.5 th -97.5 th (median)	48,500 μg	1548.2-3122.7 (2230.5)	3988.6- 10148 (6511)	1585.4- 7086 (3397)	1087- 5497 (2432)	8209.2-25853.7 (14570.5) μg
Metabolites of the D4-DEHP Dose as a percent of applied dose (mol)						
Koch et al., (2005)	48,500 μg	7.3	24.1	20.7	14.6	66.7 %
Present study 2.5 th -97.5 th (median)	48,500 μg	4.4-8.9 (6.4)	10.8-27.5 (17.6)	4.1-18.3 (8.8)	3.0-15.0 (6.6)	22.3-69.7 (39.44) %
Koch et al., (2005)	2,150 μg	4.3	22.7	19.4	13.0	59.4 %
Present study 2.5 th -97.5 th (median)	2,150 μg	4.3-8.7 (6.2)	8.9-23.3 (14.6)	4.3-19.0 (9.2)	3.02-15.3 (6.7)	20.52-66.3 (36.7) %
Koch et al., (2005)	350 μg	6.2	23.1	15.5	17.3	62.1 %
Present study 2.5 th -97.5 th (median)	350 μg	4.3-8.7 (6.2)	8.8-23.2 (14.5)	4.3-19.0 (9.2)	3.1-15.3 (6.8)	20.5-66.2 (36.7) %

524 **a = values are extracted from the graph presented in manuscript by Koch et al., (2005)**

525 **Dose unit is converted to microgram prior to use as an input for the PBPK model.**

526

527 Given that the model predictions fit the DEHP metabolites namely MEHP and other
528 metabolites 5-OH MEHP, 5-cx MEPP and 5-oxo MEHP concentration in the blood and
529 urine upon 48.5 mg of a single oral dose of DEHP. The structure of the model and the
530 model parameters remained unchanged from their calibrated values, and the predicted
531 percentage mole elimination data for four metabolites in urine were compared with the
532 data reported in Anderson et al., (2011) for the evaluation of model credibility. The
533 study included 20 subjects, 10 male, and 10 female, and their overall mean body weight
534 was 74.8 kg. The only additional change in the model is subject body weight. The
535 present model does not include gender variability among 20 subjects, and the mean
536 body weight was taken as an input for model simulation, as current model only
537 accounted for the parametric uncertainty, not the variability. Two dosing scenarios
538 namely high dose; a single oral dose of 2.8 mg DEHP and low dose; a single oral dose
539 of 0.31 mg was used for the model simulations. The subject characteristic and dosing
540 for respective studies are provided in Table A. (1-3). The predicted urinary data were
541 converted into moles based on their molecular weight in order to standardize the
542 exposure unit data. Then the relation; ((predicted amounts of metabolites in urine
543 (moles)/amounts dose (moles)) *100), is used to calculate the percentage molar
544 eliminations on moles basis (Anderson et al., 2011; Koch et al., 2005). The detailed
545 summarized tables are provided in Table A.5 to A.7. The PBPK predicted a range of
546 metabolites elimination as a percentage of doses in mole reflecting the uncertainty in the

547 model. The model output was compared with the observed experimental data. Table 3
 548 summarizes the predicted vs observed percentage amount elimination of metabolites.
 549 The experimentally observed cumulative amount of all metabolites is well within the
 550 range of PBPK simulation.

Table 4. Fraction excretion value (mole percentage) for observed and PBPK predicted of DEHP metabolites

Study involved	Dose	Metabolites of the D4-DEHP Dose (% mol elimination)				Total molar elimination (%)
		MEHP	5OH-MEHP	5cx-MEPP	5oxo-MEHP	
Anderson et al., (2011)	310µg	6.94	16.33	15.90	12.53	51.70
Present study 2.5 th -97.5 th (median)	310µg	4.3-8.7 (6.3)	8.8-22.9 (14.6)	4.3-18.5 (9.2)	3.0-15.2 (6.8)	20.4 -65.2 (36.9)
Anderson et al., (2011)	2800µg	5.67	14.86	11.97	10.00	42.51
Present study 2.5 th -97.5 th (median)	2800µg	4.4-8.7 (6.3)	9.0-23.2 (14.8)	4.3-18.9 (9.2)	3.0-15.3 (6.8)	20.7-66.1 (37.1)

551

552 4. Conclusions and Future work

553 The results showed that the current developed model can able to predict the plasma and
 554 the cumulative urine concentration of the DEHP metabolites for the different exposure
 555 scenario. The current model included four metabolites and the generation of metabolites
 556 are mechanistically described using integrated physiological parameters and Michaelis-
 557 Menten (M-M) parameters such as Vmax and Km derived from a human
 558 hepatic/intestine cell line. The sensitive analysis was done for all the parameters and the
 559 metabolic parameters found to be more sensitive than the other parameters. Monte Carlo
 560 simulation was used accounting probabilistic information about pharmacokinetics
 561 parameters that estimated DEHP metabolites concentration in both the plasma and the
 562 urine at three percentile considering the uncertainty into the model. Some of the major
 563 strength of current predictive model over previously developed models for DEHP are:
 564 1) it's a detail PBPK model that integrates the *in vitro* metabolism data with the
 565 application of IVIVE to predict metabolites concentrations, instead of calibrating or
 566 empirically fitting over observed data, 2) production of metabolites is described using
 567 saturation kinetics (M-M equations) retaining its biological plausibility, 3) model can be
 568 individualized (personalized) for different populations by understanding the
 569 physiological variability, 4) it can be used to predict the target tissue internal
 570 concentrations for further toxicodynamics study and human health risk assessments.
 571 The current developed model did not account for the 2-cx MEPP metabolite due to lack
 572 of *in vitro* metabolic data, considered to be another important metabolite for the
 573 biomonitoring study. The current PBPK model can be further extended for 2-cx MEPP,
 574 once the metabolic data are available. Detailed rat's pharmacokinetic studies that
 575 include all metabolites could be very useful for further understanding metabolites tissue

576 distribution. The current developed model can be applied in the biomonitoring and
577 exposome studies for the human health risk assessment (Martínez et al., 2017, 2018).
578 The developed model can be further extended for the development of an integrated
579 PBPK/PD systems toxicology model (integrative systems toxicology) to establish the
580 exposure-internal dose- response relationship (Sharma et al., 2017b).

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