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1 Aggregating exposures & cumulating risk for Semivolatile Organic

2 Compounds: A review

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13 ABSTRACT

Increasingly, health risk assessment is addressing multiple pathway exposures to multiple 14 contaminants. We reviewed aggregated exposure and cumulative risk approaches for 15 contemporary and ubiquitous semivolatile organic compounds (SVOC). We identified 22 16 studies aggregating exposure pathways, and 31 cumulating risk. Exposure aggregation is 17 based on the addition of pathway-specific doses, using kinetic modeling where it exists, and 18 classic external dose equations otherwise. In most cases, exposure is dominated by a single 19 route or source of exposure - mainly the oral pathway - via dietary or non-dietary exposure. 20 Preferential routes and sources of exposure are influenced by SVOC physical-chemical 21 22 properties such as vapor pressure. The cumulative risk approach for contaminants is based on 23 dose addition. Simple sum of hazard quotient (Hazard Index: HI) is the most commonly used cumulative risk assessment approach, while Relative Potency Factor (RPF) appeared to the 24 25 best suited – although this calls for a level of toxicological information that limits the number of compounds that can be studied simultaneously. Where both were performed, moving from 26 HI to more refined approach produced similar results. In conclusion, both approaches -27 exposure aggregation and cumulative risk - rely on simple assumptions. Nevertheless, they 28 allow uncertainty to be reduced, in comparison with source-by-source or chemical-by-29 30 chemical approaches.

31 KEY WORDS

Mixture; contaminants; environmental exposure; health; exposure pathway; cumulative risk
assessment; chemical.

35 INTRODUCTION

People are continuously and increasingly exposed to a multitude of organic chemicals 36 (NHANES 2015) from various sources (e.g. food, dust, cosmetics and personal care products 37 (C&PCPs), textiles and materials) and media (e.g. air, water and soil), and by different routes 38 of exposure such as inhalation, ingestion or dermal contact. Organic chemicals include a high 39 number of compounds having various physical-chemical properties, and can be classified as 40 volatile, semivolatile or non-volatile compounds. Semivolatile organic compounds (SVOCs) 41 are defined as having a boiling point temperature of between 240 -and 400 °C (NF ISO 42 16000-6, 2006). This group includes a high number of organic molecules from different 43 44 chemical families (e.g. phthalates, bisphenols, polycyclic aromatic hydrocarbons (PAHs), 45 organophosphorus (OPs), organochlorines (OCs), synthetic musks, polychlorinated biphenyls (PCBs), polybromodiphenylethers (PBDEs)). The scientific community's growing interest in 46 studying exposure to SVOCs is motivated by a rise in their use in consumer products as well 47 as by improved analytical techniques that have shown their ubiquity, for example, in 48 dwellings (Rudel et al. 2003; Weschler and Nazaroff 2008). Moreover most are reprotoxic 49 (Peretz et al. 2014; Kay et al. 2014), neurotoxic (Muñoz-Quezada et al. 2013; Costa et al. 50 2014), or carcinogenic compounds (Armstrong et al. 2004; IARC 2015a, 2015b), and have 51 been found in human biological fluids (blood and urine). 52

When evaluating the impact of SVOC exposure on human health, exposures may be assessed using either external or internal doses. External dose is estimated from contamination data and human parameters such as body weight, inhalation and dust ingestion rate... Using a pharmacokinetic model or absorption factors, it can be converted to internal dose. Internal dose is preferentially assessed by biomonitoring. Biomonitoring data directly reflect internal aggregate exposures and could, with back calculation using pharmacokinetics models, inform as to the external dose attributable to each exposure pathway. However, using biomonitoring

data does not inform on the source of exposure that is so useful for prevention strategies. 60 61 Once exposure is assessed, the risk may be assessed by comparing exposures to a toxicological reference value. This value may be expressed as an external dose for a unique 62 route of exposure, i.e. a reference dose or acceptable daily intake for ingestion (or a reference 63 concentration for inhalation). They are usually estimated from an indicator of the dose-64 response relationship in laboratory mammals to which uncertainty factors are applied to take 65 into account inter/intra-species differences (Dybing et al. 2002). For some chemicals, internal 66 reference dose are proposed such as biomonitoring equivalent which are estimates of the 67 concentration of the substance (or a metabolite) in blood or urine that is consistent with the 68 69 reference dose (Hays and Aylward 2009).

70 In the case of indoor SVOCs, exposure occurs via different sources and media and concerns many compounds simultaneously. Multiple exposure to mixtures is now widely recognized 71 and addressed, notably by international and national institutions in charge of risk assessment. 72 73 In the WHO/IPCS Framework for Risk Assessment of Combined Exposures to Multiple Chemicals, aggregate exposure is defined as exposure to the same substance from multiple 74 sources, via multiple pathways, and routes (Meek et al. 2011). Cumulative risk assessment 75 linked to co-exposure to different substances is also recommended when feasible (Meek et al. 76 2011). 77

The objective of this study is to review the methods employed in the literature regarding (1)
exposure aggregation to an SVOC excluding biomonitoring and (2) cumulative risk
assessment for a mixture of SVOCs.

81 METHODS

The search covered the period from 1985 until 2016. Publications were selected in line with 82 the following criteria: addressing SVOC human exposure, aggregating at least two routes of 83 exposure for one SVOC or assessing cumulative risk to at least two SVOCs. Because they do 84 not provide methods for the aggregation of several routes of exposure; publications that 85 considered exposures to an SVOC from different sources (e.g. foodstuff) but via a single 86 exposure route (e.g. ingestion) were discarded, even though aggregation was the mentioned 87 Of KnowledgeTM 88 terminology. Using the Web website (Thomson Reuters. www.webofknowledge.com), publications were selected primarily by searching in the field 89 "topic" (title, abstract and key words): ((exposure AND (assessment OR evaluation) AND 90 91 (cumulat* OR aggregat*) AND (chemicals OR products OR substances OR compounds OR pollutants) AND health) OR (PBPK AND (SVOC OR pesticide OR phthalate OR flame 92 retardant OR plasticizer OR PCB OR musk OR PAH OR organochlor* OR organophosph* 93 94 OR pyrethroid) NOT (rat* OR mice OR mouse OR bear). Secondly, selected publications were screened on the basis of the subject-title match. Thirdly, those publications remaining 95 were subjected to an exhaustive abstract reading in order to remove those which did not 96 address the research subject and to separate publications performing exposure aggregation 97 from those dealing with cumulative risk assessment (CRA). Publications identified in the 98 reference list of others were added. Since the objective was to review methods, publications' 99 results are presented only where they allow the comparison of different methods. 100

101 Regarding publications that aggregated exposure, the following items were retrieved: 102 references, chemical class, exposure characteristics (source, media, and route of exposure), 103 exposure modeling (type of approach: deterministic or probabilistic, type of aggregated dose, 104 and the doses aggregation level: external or internal), and whether comparison with 105 biomonitoring data was made. Regarding publications that cumulated risks, the following items were retrieved: references, number of chemical cumulated, SVOC selection criteria
(related to occurrence and toxicity), CRA characteristics (grouping by chemical class or not,
the dose calculation basis, and the method employed), and toxicity indicators characteristics
(type, source, point of departure, and type of toxicological endpoint).

110 **RESULTS AND DISCUSSION**

This search identified 22 publications that carried out an exposure aggregation from at least
two routes of exposure to an SVOC and 31 publications that carried out a CRA to at least two
SVOCs.

114 1. Aggregate exposure assessment

115 Table 1: Publications performing exposure aggregation on semivolatile organic compounds.

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[Table 1]

Twenty-two publications carrying out SVOC exposure aggregation were identified, and these are presented in Table 1. This may seem few, given the high number of compounds concerned, yet assessments are often focused on exposure to a compound from various sources but via a single exposure route. The oldest dates back to 1998 and from 2010 to 2016, one to five publications per year were retrieved from the literature.

Seven publications aggregated exposure to OPs, six to phthalates, four to pyrethroids, three to 122 PAHs, three to PBDEs, three to phenols, two to PCBs, two to parabens, one to musks, one to 123 OCs, one to polychlorinated naphthalenes (PCNs), one to perfluoroalkyl acids (PFAAs) and 124 one to replacement flame retardants (RFRs). Residential exposure was studied most (18 125 126 publications), addressing exposure to air (n=16), dust (n=13), surfaces (n=7), soil (n=6) and 127 dental sealing (n=1). Fourteen of the publications addressed dietary exposure: all were interested in solid food exposure, four took drinking water into account and three were also 128 interested in breast milk exposure. Three publications addressed occupational source with 129 130 exposures to air (n=2) or to air and soil (n=1). Two publications addressed exposure to C&PCPs. 131

Human exposure to these various sources and media could occur via three pathways: 132 133 inhalation, ingestion or dermal contact. Of the 22 publications selected, a majority (n=14) aggregated exposure by three pathways, whereas the rest did so by two pathways. As an 134 135 example, Gosens et al. (2014) aggregated exposure to four parabens contained in C&PCPs by dermal and ingestion pathways. The reason put forward for not studying exposure by 136 inhalation was that none of the investigated C&PCPs applied by spray contained parabens. 137 Another reason for not studying a route of exposure is negligible absorption, in comparison 138 with the other pathway. For instance, Wilson et al. (2003) assessed the aggregated exposure 139 by ingestion and inhalation of 37 SVOCs present in several media (indoor and outdoor air, 140 141 indoor dust, soil and food) rather than by dermal absorption because this was considered negligible in comparison. Because of recent advances in dermal exposure importance 142 (Weschler and Nazaroff 2012) and modeling (Gong et al. 2014; Shi and Zhao 2014; Morrison 143 144 et al. 2016), this pathway is expected to be more systematically considered in the future. Indeed human experiments with exposure to phthalates have proven this pathway to be 145 146 significant for some SVOCs (Weschler et al. 2015).

Aggregation of exposure was always conducted by estimating exposure for each route 147 individually, then summing them. These exposures were often assessed by employing classic 148 149 external dose equations (e.g. U.S. EPA, 1992) combining human parameters (such as weight, body surface area, inhalation rate, amount of ingested dust and frequency of use) with media 150 or product contamination (e.g. SVOC concentration in the media or product). Thirteen 151 152 publications have used this method. An alternative could be the employment of pharmacokinetic (PK) and/or pharmacodynamics (PD) models to aggregate exposure to 153 154 individual SVOCs by several routes, and provide an absorbed dose. The physiologicallybased pharmacokinetic model (PBPK), describes the physiological, biochemical, and 155 physical-chemical processes governing the absorption, distribution, metabolism, and excretion 156

of a xenobiotic in the body. It consists of a series of compartments receiving the xenobiotic 157 158 via systemic circulation. These models could also incorporate a pharmacodynamic dimension (PBPK/PD) relating to processes leading to a critical health outcome (e.g. acetylcholinesterase 159 160 inhibition). PK and PD models require the same parameters as for external dose equations, with the addition of physiological, physiochemical (e.g. partition coefficient) and biochemical 161 (e.g. metabolic rate constant) parameters. Eight publications have used PK models: four used 162 a PBPK model, two a one-compartment PK model and one a PBPK/PD model. The four 163 PBPK models were developed for three different chemical families (PAHs, pyrethroids and 164 OPs), the two one-compartment PK models for PBDE compounds and for PAH compounds, 165 166 whereas the PBPK/PD model was only developed for OP compounds - chlorpyrifos, to be precise. When PK and/or PD models were available these appeared to be the preferred method 167 for assessment of overall exposure to an SVOC. However, because these are available only 168 169 for certain specific SVOCs, and because their construction entails high consumption of both data and resources, they are not systematically used. In order to estimate and aggregate 170 171 exposures to an SVOC, some publications have also used specific exposure models, which 172 include PK modeling components, such as the Stochastic Human Exposure and Dose Simulation model for multimedia (SHEDS-Multimedia) which was developed by the U.S. 173 EPA's Office of Research and Development to simulate aggregate exposure via dietary and 174 residential routes (inhalation and dermal contact) to a variety of environmental chemicals 175 such as pesticides, metals and persistent organic pollutants (https://www.epa.gov/chemical-176 research/stochastic-human-exposure-and-dose-simulation-sheds-estimate-human-exposure). 177 Three publications used SHEDS-Multimedia to assess exposure to pyrethroid and OP 178

compounds. Another specific model is the Probabilistic Aggregate Consumer Exposure
Model (PACEM), first used by Gosens et al. (2014) to facilitate aggregate exposure
assessment of parabens compounds present in C&PCPs. However, though these are more

adaptable to various SVOCs than are PK and/or PD models, they could be limited by the use
of predefined scenarios (e.g. residential pesticide use scenarios using SHEDS-Multimedia,
such as indoor flying insect killer, pet treatment, vegetable patch, etc.) or data (e.g. Dutch
C&PCPs use data for PACEM). Compared to classical external dose modeling, most of the
time achieved with a deterministic approach, these models use distributions for the human
parameters inputs and contamination data in order to allow a probabilistic approach.

Exposure assessment to a contaminant could be expressed as an external or internal dose, the 188 latter reflecting contaminant uptake after crossing absorption barriers. Only Wilson et al. 189 (2003) and Roosens et al. (2010) expressed results as external doses for each route of 190 191 exposure. Fifteen other publications estimated internal doses for each route of exposure, and 192 five estimated internal dose only for the dermal pathway. Of these, nine publications used a PK approach to convert external exposure into organ, tissue or fluid concentrations. Eleven 193 other publications converted external exposure into internal exposure by applying absorption 194 factors retrieved from the literature or considered a default value of 100%. For the dermal 195 pathway the authors used dermal absorption fraction (Shurdut et al. 1998; Duggan et al. 2003; 196 Linares et al. 2010; Gosens et al. 2014) or a transdermal permeability coefficient (Beko et al. 197 2013). Transdermal permeability coefficients are more precise, because they take into account 198 199 partition through the different layers of the skin to the dermal capillaries, and these were 200 recently available in the literature for several SVOCs (Weschler and Nazaroff 2012). This explains why their use has increased since 2013 (in comparison with 1998) for dermal 201 202 absorption factors. Internal dose appears as the logical metric when considering aggregation of exposure. The most sophisticated approach is PBPK modeling, followed by PK modeling, 203 204 use of absorption factor, or default 100% absorption. Using external doses (most often observed for inhalation and ingestion) actually consists in considering that there is no 205

206 differential absorption between exposure routes. This should at least deserve an uncertainty207 analysis with reported values for bioavailability.

208 Both external and internal exposure assessments require input parameters (such as human parameters, media or product contamination data and specific parameters of SVOCs). With 209 regard to these parameters, single values could be used to conduct a deterministic approach. A 210 conservative choice of parameters is considered as a lower tier approach by several authors 211 (Delmaar and van Engelen 2006; Sarigiannis et al. 2013), and was indeed employed in ten 212 publications. A higher tier approach could be conducted by probabilistic analyses with Monte 213 Carlo simulation by introducing distributions rather than single values, and this was employed 214 215 by twelve authors. Both approaches were used and compared by Gosens et al. (2014) to 216 estimate aggregate exposure, by ingestion and dermal contact, to four parabens. Although exposure assessment results were comparable in both approaches, internal exposures 217 estimated by the higher tier approach were always below those estimated by the lower tier 218 approach for each paraben. This result confirmed that a deterministic approach gave a good 219 conservative starting point for exposure assessment but that a probabilistic approach gave a 220 221 more realistic and more informative exposure assessment where enough data were available (by, for example, allowing estimation of the proportion of population above the reference 222 223 dose, and enabling sensitivity analysis).

224 Most of the studies (n=16) aggregated exposures for an average individual using 225 representative data from a population, e.g. a specific age group. Six studies aggregated 226 exposures for specific individuals with their own data.

227 Most studies (n=16) compared their estimations of aggregate exposure to human 228 biomonitoring data (e.g. NHANES), and eleven of these found consistent results. A reason for

the discrepancies could be for instance the non-inclusion of a major pathway, such as diet forphthalates (Beko et al. 2013).

It is noteworthy that the authors discussed the contribution made to exposure by each 231 pathway, source or media. The major route of exposure depends on: the studied compounds; 232 the conditions of exposure to these compounds (e.g. residential or occupational), the routes of 233 exposure assessed, and whether the population of interest included children more susceptible 234 to dust ingestion (Beamer et al. 2012; Wason et al. 2012; Gaspar et al. 2014; Mitro et al. 235 2016). Some authors investigated influent parameters such as SVOC physical-chemical 236 parameters with molecular weight (Beko et al. 2013), and vapor pressure (Wilson et al. 2003), 237 238 which are related to their partitioning among various media (e.g. indoor air, dust), leading to a 239 preferential route of exposure. As an example, Beko et al. (2013) found the dermal pathway to be the major route of exposure for two phthalates (DnBP and DiBP). Xue et al. (2014) studied 240 exposure to seven pyrethroids when using, or not using, pesticide at home. These authors 241 found ingestion to be the major route of exposure in both cases, with dietary exposure being 242 the most contributive for the population not using pesticides, and non-dietary exposure for the 243 population that does use them. Zartarian et al. (2012) found the same results regarding 244 children's aggregate (dietary and non-dietary) residential exposure to permethrin. The 245 246 circumstance of exposure also has an influence. For example Wei et al. (2013) studied global exposure to a pyrethroid during and after aircraft disinfection treatments, finding inhalation to 247 be the major route of exposure during the pre-flight spray, and dermal pathway to be the 248 249 major route of exposure for the residual treatment scenario. The dominant pathway may change depending on exposure level. For example Trudel et al. (2011) found ingestion of food 250 to be the dominant pathway for several PBDEs up to about the 60th quantile of the total dose, 251 while oral and dermal uptake of dust dominated above the 60th quantile, because of a larger 252 variability of concentration and dust ingestion rate. Because few studies (n=6) addressed 253

global exposure to SVOCs via ingestion, inhalation and dermal contact to at least food, air, dust or soil and objects (such as toys, clothing or indoor surfaces), it is difficult to determine a general dominant pathway trend in global exposure assessment to SVOC. However, as observed by Wilson et al. (2003), on the basis of 54 SVOCs, ingestion was found to be the main route of exposure for the less volatile compounds, whereas inhalation was the most significant for the more volatile compounds.

To summarize, choice of method depends strongly on research objectives. A PK and/or PD model seemed preferential when assessing total exposure to an SVOC. However, because they are available only for certain SVOCs, and because their construction involves high data and resource consumption, a lower tier approach - such as employing external dose equation appeared to be more adequate (at least as a first step) and provided consistent estimations. Inclusion of an uncertainty analysis in exposure assessment appears essential in this situation.

Lastly, even where exposure to an SVOC is governed by a major route, aggregating exposure provides useful information regarding exposure characteristics such as influent media, or variation between compounds of the same chemical family.. Aggregation of all routes of exposure to an SVOC appears essential, especially when performing a risk assessment in a second step.

271 2. Cumulative Risk Assessment

Table 2: Publications performing Cumulative Risk Assessment on semivolatile organiccompounds.

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[Table 2]

Thirty-one publications conducting SVOC CRA were identified for inclusion in this review, and these are presented in Table 2. The oldest dates back to 2003, and since 2009, from one to seven publications per year were retrieved from the literature.

278 For each study, SVOCs were included in a CRA on the basis of their occurrence and/or a similar pattern of toxicity. Firstly, regarding occurrence, dietary contamination was the most 279 used criterion (n=16), followed by the occurrence of SVOC metabolites in humans (n=8). In 280 addition, two studies chose on the basis of their presence in industrial emissions, three on their 281 presence in the residential environment, one on their presence in drinking water, one on their 282 presence in the water, sediment and biota of a specific river and lastly, four studies provided 283 284 no explanation regarding occurrence for the selection of compounds. Secondly, regarding 285 toxicity patterns for compound selection, having an anti-androgenic mechanism of action 286 (n=11), or inhibiting the acetylcholinesterase (AChE) mechanism (n=11) were the most studied effects. In addition, sodium channel modulators, toxic effects on the nervous system, 287 toxic effects on the liver, the reduction of hepatic retinoid, and respiratory irritation were also 288 studied. Finally, five publications based their compound selection on multiple toxic effects. 289 Chemical classes investigated were: carbamates (CBs), OPs, OCs, PAHs, parabens, PBDEs, 290 PCBs, phenols, phthalates, polyfluoroalkylated substances (PFASs) and pyrethroids. In fact, 291 292 12 publications studied OP compounds, 11 phthalate compounds, 7 carbamate compounds and 6 pyrethroid compounds. The scientific community's growing interest in OPs and 293 phthalates is driven by suspicion of toxic health effects, such as the anti-androgenic effects of 294 295 some phthalates on the male reproductive system (Joensen et al. 2012), or the neurotoxic effects of some OPs (Mileson et al. 1998), their ubiquitous occurrence in various media (Rudel 296 et al. 2003; Blanchard et al. 2014), and the acknowledged presence of these compounds and 297 298 their metabolites in human biological fluids (NHANES 2015), as well as - specifically for OPs - the availability of relative potency factors (RPF) published by governmental agencies 299

300 (U.S. EPA 2006). Finally the review reveals that a majority of the publications (n=26)
301 performed CRA for SVOCs coming from the same chemical class and only five encompassed
302 compounds from different families.

A CRA can be performed using several methods that have been developed and used for 303 decades now, notably for regulatory purposes on polluted sites (U.S. EPA 1989). Most of 304 these are based on the following additivity assumptions, notably with the "Incremental 305 Lifetime Cancer Risk", a sum of cancer risks commonly used in regulatory risk assessment. 306 "Dose additivity" assumes that each compound of a mixture is supposed to contribute to the 307 overall observed effect in proportion to its concentration (dose), with the assumption that 308 309 "toxicants in a mixture act upon similar biological systems and contribute to a common 310 response in proportion to their respective potencies" (Calabrese 1990). On the other hand, "response additivity" assumes that each compound of a mixture is supposed to contribute to 311 312 the overall observed effect in proportion to its effect (response), with the assumption that "toxicants in a mixture act upon dissimilar biological systems and act independently" 313 (Calabrese 1990). This notion does not take into account the possibility of such toxicological 314 interaction as antagonism or potentiation and could lead to biased estimation of the risk. For 315 example, Boon et al. (2008) have highlighted an overestimation when conducting a CRA to 316 317 OPs and carbamates exposures. Even though these are known for their common AChE inhibiting activity, their specific mechanisms of action are different - indeed AChE receptor 318 binding is mostly irreversible regarding OPs whereas it is reversible regarding carbamates. 319 320 However, toxicological interaction (i.e. antagonism or potentiation) is mostly based on the saturation phenomena of metabolic systems, which can be considered as never being achieved 321 regarding low, even sometimes very low (e.g. up to ng/m³ in indoor air regarding several 322 SVOCs) (Blanchard et al. 2014) compound concentrations in the exposure media (ATSDR 323 2004). Nevertheless, an empirical analysis of low-dose synergy, by Boobis et al. (2011) 324

revealed results of low magnitude (1.5 to 3.5). Furthermore, the principal purpose of risk assessments is to help regulatory or policy-making organizations make decisions and to develop operative strategies regarding the control of human exposure to environmental, residential and occupational pollutants, leading to consideration of the additivity assumptions as operational.

330 Several CRA methods exist and the most commonly used in the literature are, from the lowest to the highest tier, the Hazard Index (HI) method, the Point of Departure Index (PODI) and 331 the RPF approaches, described extensively elsewhere (U.S. EPA 2000; Sarigiannis and 332 Hansen 2012; Fournier et al. 2014a). Briefly, the HI method is based on the sum of hazard 333 334 quotients (HQ) for substances affecting the same target organ or system. For each substance 335 involved, the HQ is calculated by dividing exposure by reference dose (i.e. the level at which no adverse effects are expected in humans) (U.S. EPA 2000). This method was used in 20 336 publications. Although it provides a transparent and comprehensive result (HI<1 indicates that 337 there is little likelihood that an adverse effect might be observed from chronic exposure) this 338 method is also a lower tier approach, because the reference doses are not necessarily 339 constructed with regard to the same target organ, and can sometimes be imprecise with regard 340 to the compounds' mechanism of action. However, it does allow the study of compounds 341 342 from different chemical classes, but affecting the same target organ or system. Four publications are concerned in this review; all the others studied compounds from a single 343 class (n=16). In order to quantify interaction effects in a mixture, Ragas et al. (2011) followed 344 345 the interaction-based HI approach developed by the U.S. EPA (2000). This method assumes that interactions among compounds in a complex mixture are dependent on those of all 346 possible binary combinations of the individual mixture components. The HI is multiplied by a 347 weight factor reflecting the significance of these interactions. The authors observed 348 interaction effects in two groups (with, for instance, four and two pesticides respectively) and 349

found that the interaction-based HI was always higher than the conventional one. However, because of weak scientific evidence regarding the calculation procedure, and a weak empirical basis regarding parameter values, the authors have warned that these interaction-based HIs should be used with caution (Ragas et al. 2011).

The PODI approach differs from the HI in that the sum of exposures to each compound is expressed as a fraction of its respective and comparable point of departure (POD) for effects of toxicological relevance (for example, a benchmark dose) rather than a fraction of the reference dose – inducing less uncertainty. The reciprocal of the PODI is the combined margin of exposure (MOE) based on the sum of individual MOEs. For each compound involved, the MOE is calculated by dividing its POD to human exposure (EFSA 2008). Three of the publications used a combined MOE approach.

The RPF approach assumes similarity of mechanisms of action between individual 361 compounds and uses toxicity data for an index compound to normalize the potencies of each 362 other compound in a mixture. Usually the potencies are POD derived from dose-response 363 364 curves. The combined toxicity of the mixture corresponds to the sum of the potency normalized doses to yield total equivalent exposure, expressed as index compound 365 equivalents, which is then compared to the reference dose of the index compound (EFSA 366 2008). This method was used in 13 publications. Seven publications studied compounds from 367 the same chemical class - mostly OPs (n=4) - whereas the others studied compounds from 368 369 different classes (n=6). Four of them applied a RPF approach class by class, whereas Caldas et al. (2006) and Blaznik et al. (2015) performed a RPF approach to OP and CB compounds 370 having the same mechanism of action. 371

372 Several publications compared CRA methods. Three publications used both a RPF and a373 combined MOE approach. One of these is interested in cumulating risks linked to exposure to

five PCBs, and although the authors found similar results with respect to estimates of median 374 375 MOE values, they pointed out that the advantage of the RPF approach is that it is more easily implemented in practice, and accounts quantitatively for both variability and the various 376 377 uncertainties involved (Kalantari et al. 2013). Furthermore, RPF data published by the U.S. EPA are available for the OPs (U.S. EPA 2006), CBs (U.S. EPA 2007), and pyrethroids (U.S. 378 EPA 2011). Benson et al. (2009) and Beamer et al. (2012) found similar results when using 379 both a RPF and an HI approach. Beamer et al. (2012) did not assess the potential added value 380 of a RPF approach to an HI approach, yet Benson et al. (2009) suggested using the less 381 complex HI approach for future CRA to simultaneous phthalates. 382

383 The reference doses employed by the authors could differ for a single SVOC according to: the toxicological endpoint studied and the type of POD chosen (no observed adverse effect level 384 (NOAEL), lowest observed adverse effect level (LOAEL) or Benchmark Dose (BMD)); the 385 value of the uncertainty factor applied, and the date of construction, depending on the 386 organization producing these values (e.g. acceptable/tolerable daily intakes (A/TDI) from 387 EFSA or WHO, and reference doses (RfD) from U.S. EPA). Dewalque at al. (2014) and Gao 388 et al. (2016) both calculated HI to several phthalates using two different reference values, (1) 389 TDI from EFSA based on effects on reproduction and development and (2) reference dose 390 from Kortenkamp and Faust (2010) based on anti-androgenic effects. Each author found 391 392 different results, attesting to the fact that cumulative assessment is dependent on the reference value taken into account. 393

Dose calculation for exposure estimation was based on contamination data alone in 21 publications and on both contamination and biomonitoring data in 9. Only Beko et al. (2013) estimated daily intakes from both media phthalates compound contaminations (with the exception of foodstuffs) and urinary concentrations of their metabolites before conducting a 398 CRA using an HI approach. The authors found an HI from urinary concentrations to be twice399 as high as from media contaminations.

400 Following a tiered approach when conducting a CRA is now recognized by institutions such as the EFSA's Scientific Panel on Plant Protection products and their Residues (PPR) which 401 402 recommends the use of tiered approaches when assessing risks of chronic exposure to pesticide residues (EFSA 2008). Several authors of this review have confirmed the pertinence 403 404 of this recommendation for conducting a CRA on SVOC exposure. A lower tier method (such as the HI approach) could be used as a first step, with recourse to a higher tier method (such 405 as the RPF approach) being justified where the outcome suggests further refinement is called 406 407 for.

408 CONCLUSIONS AND PERSPECTIVES

Aggregate exposures and cumulative risks need to be taken into consideration in addressing 409 total SVOC exposure and the overall risk they pose. In particular, the dermal pathway has 410 411 proven to be significant in the recent years. This literature review has revealed that relatively simple approaches based on the sum of exposures, doses or effects can be useful, at least in a 412 first tier. However, these first-tier approaches carry their own uncertainties and should be 413 accompanied by an uncertainty analysis of simplifying assumptions. It is however important 414 to keep in mind that not choosing to aggregate exposures or cumulate risks creates more 415 uncertainty because of the implicit assumption of independence of exposures and effects. 416

This review has highlighted that, because they consider differential absorption rates related to the different routes of exposure, as well as metabolism phenomena, pharmacokinetic models are useful tools for aggregating exposure. Because these are currently available only for certain SVOCs, there is a need for development of generic models for those SVOCs sharing common toxicological effects (e.g. a PBPK model for reprotoxic SVOC). They could also be used for reverse dosimetry using biomonitoring data.

When assessing cumulative risks to several compounds (e.g. in order to build a RPF), a 423 compromise needs to be reached between the exhaustiveness of the compounds list and the 424 required precision of the toxicity estimates for each substance involved in the mixture. A great 425 progress towards putting cumulative risk assessment into practice would be to generate 426 comparable toxicity data in order to build RPF. This may be achieved, for instance, with the 427 428 use of standardized high-throughput assays as developed last years by the US EPA (Kavlock 429 et al. 2012), associated with the development of omics strategies (i.e. proteomics or transcriptomics). Recent works in these topics are very promising (Hannas et al. 2011; 430

431 Thomas et al. 2011, 2012; Van Ravenzwaay et al. 2014; Chauhan et al. 2016; Labib et al.
432 2016).

Both PBPK building and toxicity testing is time and resources consuming and a proposal would be to focus efforts on ubiquitous compounds sharing, or suspected to share, the same mechanism of action. A next step would be to identify compounds the populations are frequently exposed to, and then define corresponding cumulative assessment groups, such it has already be done for certain environments (Fournier et al. 2014b), or regulatory processes (Boobis et al. 2008).

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Table 1. Publications	including exposure	aggregation on	semivolatile o	roanic compounds
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	Chamberlala	Ex	Exposure	e modeling	Aggregation			Comparison		
References (year of publication)	(nb. of publications)	Source	Media	Route	Source-to- external dose	External-to- internal dose	Approach	Type of aggregated dose	Aggregation level	with biomonitoring data
Ginsberg and Foos (2016)	Phthalates (1)	Dietary Residential	Food Breast milk Drinking water Indoor air Indoor dust Indoor objects Clothing	Dermal Ingestion Inhalation	External dose equation	Absorption factors	Deterministic	Internal	Average individual	Yes
Mitro et al. (2016)	Musks (1) Parabens (3) PFAAs (11) Phenols (7) Phthalates (8) RFRs (15)	Residential	Indoor air Indoor dust	Dermal Ingestion Inhalation	External dose equation	Dermal absorption factors	Deterministic	External (ingestion, inhalation) Internal (dermal)	Average individual	No
Gosens et al. (2014)	Parabens (4)	Personal care products	Personal care products	Dermal Ingestion	External dose equation and PACEM	Absorption factors	Deterministic Probabilistic	Internal	Individual	No
Gaspar et al. (2014)	Phthalates (2)	Residential	Indoor air Indoor dust	Dermal Ingestion Inhalation	External dose equation	Dermal absorption factors	Probabilistic	Internal	Average individual	No
Poet et al. (2014)	OPs (1)	Residential	Indoor air Indoor surface (carpet treated)	Dermal Inhalation	PBPK/PD model		Deterministic	Internal	Individual	Yes
Ortiz et al. (2014)	PAHs (1)	Occupational	Indoor air	Dermal Inhalation	PBPK n simple one-co mo	nodel and ompartment PK odel	Deterministic	Internal	Individual	Yes
Xue et al. (2014)	Pyrethroids (7)	Dietary Residential	Food Indoor air	Dermal Ingestion Inhalation	SHEDS- Multimedia	PK model	Probabilistic	Internal	Average individual	Yes
Beko et al. (2013)	Phthalates (5)	Residential	Gas phase Particle phase Indoor dust	Dermal Ingestion Inhalation	External dose equation	Dermal absorption factor	Probabilistic	External (ingestion, inhalation) Internal (dermal)	Average individual	Yes
Wei et al. (2013)	Pyrethroids (1)	Occupational (aircraft disinfection)	Indoor air	Dermal Ingestion Inhalation	PBPK	model	Probabilistic	Internal	Average individual	Yes
Wason et al. (2013)	Pyrethroids (3) OPs (2)	Residential	Indoor dust Indoor surfaces Soil	Dermal Ingestion	SHI Multi	EDS- imedia	Probabilistic	Internal	Average individual	No

Beamer et al. (2012)	OPs (2)	Dietary Residential	Food Indoor air Indoor dust Indoor surfaces and toy	Dermal Ingestion Inhalation	PBPK model	Probabilistic	Internal	Individual	Yes
Zartarian et al. (2012)	Pyrethroids (1)	Dietary Residential	Food Indoor air	Dermal Ingestion Inhalation	SHEDS- Multimedia PK model	Probabilistic	Internal	Average individual	Yes
Trudel et al. (2011)	PBDEs (8)	Dietary Residential	Food Indoor air Indoor dust Indoor surfaces Soil	Dermal Ingestion Inhalation	External dose Absorption equation factors	Probabilistic	Internal	Average individual	Yes
Roosens et al. (2010)	PBDEs (6)	Dietary Residential	Food Breast milk Indoor air Indoor dust Soil	Ingestion Inhalation	External dose No equation	Probabilistic	External	Average individual	No
Von Goetz et al. (2010)	Phenols (1)	Dietary Residential	Food Breast milk Indoor air Indoor dust Dental sealings	Ingestion Inhalation	External dose Absorption equation factors	Deterministic	Internal	Average individual	Yes
Linares et al. (2010)	PAHs (16) PCBs (7) PCNs (5)	Dietary Occupational (petrochemistry)	Food Drinking water Air Soil	Dermal Ingestion Inhalation	External dose equation Dermal absorption factor	Probabilistic	External (ingestion, inhalation) Internal (dermal)	Average individual	No
Lu et al. (2010)	OPs (1)	Dietary Residential	Food Drinking water Indoor air Indoor dust Toy surfaces Soil	Ingestion Inhalation	PBPK model	Deterministic	Internal	Individual	Yes
Lorber (2007)	PBDEs (9)	Dietary Residential	Food Indoor air Indoor dust Soil	Dermal Ingestion Inhalation	Simple one-compartment PK model	Deterministic	Internal	Average individual	Yes
Wormuth et al. (2006)	Phthalates (8)	Dietary Residential Personal care products	Food Indoor air Outdoor air Indoor dust Clothing Personal care products	Dermal Ingestion Inhalation	External dose Absorption equation factors	Deterministic	Internal	Average individual	Yes
Duggan et al. (2003)	OPs (31)	Dietary Residential	Food Drinking water Non-dietary	Dermal Ingestion Inhalation	External dose equation Dermal absorption factor	Deterministic	External (ingestion, inhalation) Internal (dermal)	Average individual	Yes
Wilson et al. (2003)	OCs (9)	Dietary	Food	Ingestion	External dose No	Deterministic	External	Individual	Yes

	OPs (2)	Residential	Indoor air	Inhalation	equation					
	PAHs (20)		Outdoor air							
	PCBs (18)		Indoor dust							
	Phenols (3)		Soil							
	Phthalates (2)									
Shurdut et al. (1998)	OPs (1)	Dietary Residential	Food Indoor air Indoor surfaces	Dermal Ingestion Inhalation	External dose equation	Dermal absorption factor	Probabilistic	External (ingestion, inhalation) Internal (dermal)	Average individual	Yes

OCs = Organochlorines; OPs = Organophosphorus; PACEM = Probabilistic aggregate consumer exposure model; PAHs = Polycyclic aromatic hydrocarbons; PBDEs = Polybrominated diphenyl ethers; PCBs = Polychlorinated biphenyls; PCNs = Polychlorinated naphthalenes; PFAAs = Perfluoroalkyl acids; RFRs = Replacement flame retardants; SHEDS-multimedia = Stochastic human exposure and dose simulation model for multimedia.

References (year	Number of chemicals	ber of SVOCs selection criteria			CRA		Toxicity indicators			
$ \begin{array}{ c c c c c c c c c c c c c c c c c c c$	Type of toxicological endpoint	POD								
Li et al. (2016)	Pyrethroids (7)	Dietary contamination	AChE inhibitors	Yes	Contamination data	HI	ADI RfD	na	na	na
Lozowicka et al. (2016)	CBs (1) OPs (3) Pyrethroids (3)	Dietary contamination	AChE inhibitors Sodium channel modulators	Yes	Contamination data	HI	ADI	EFSA	na	na
Quijano et al. (2016)	CBs (7) OPs (12) Pyrethroids (7)	Dietary contamination	AChE inhibitors	Yes	Contamination data	RPF	RPF ADI	U.S. EPA	AChE activity	NOAEL BMD
Zentai et al. (2016)	OPs (24)	Dietary contamination	AChE inhibitors	Yes	Contamination data	RPF	RPF RfD	Boon et al. (2008) Caldas et al. (2006) JMPR	AChE activity	NOAEL BMD ₁₀
		Urinary	Multiple		Biomonitoring		TDI	EFSA	Effects on reproduction and development	NOAEL
Gao et al. (2016)	Phthalates (3)	measurement	Anti-androgenic	Yes	data	HI	RfD	Kortenkamp and Faust (2010)	Anti-Androgenic	LOAEL BMD
Ogbeide et al. (2016)	OCs (13)	Water, sediment and biota contamination	-	Yes	Contamination data	HI	RfD	U.S. EPA	na	na
Jensen et al. (2015)	Different classes of pesticides (20)	Dietary contamination	Multiple	No	Contamination data	HI	ADI	EC EFSA JMPR	na	na
Blaznik et al. (2015)	CBs (4) OPs (10)	Dietary contamination	AChE inhibitors	No	Contamination data	RPF	RPF RfD	Boon et al. (2008) European commission	AChE activity	NOAEL LOAEL BMD ₁₀
Kranich et al.				V	Biomonitoring		TDI	EFSA	Effects on reproduction and development	NOAEL
(2014)	Phthalates (5)	-	Anti-androgenic	Yes	data	HI	RfD	Kortenkamp and Faust (2010)	Anti-Androgenic	BMD
Peluso et al. (2014)	OCs (9)	Water contamination	Multiple	Yes	Contamination data	HI	RfD	U.S. EPA IRIS	na	na
		Residential (consumer use)			Contamination		RPF			
Xue et al. (2014)	Pyrethroids (7)	roids (7) (consumer use) Urinary measurement	-	Yes	data	RPF	RfD	– U.S. EPA	na	na
Chang et al. (2014)	Phthalates (7)	-	Anti-androgenic	Yes	Contamination	HI	TDI	EFSA WHO	Hepatotoxicity	na
ũ v v			Ũ		data		RfD	U.S. EPA	Anti-Androgenic	

Table 2: Publications performing cumulative risk assessment (CRA) on semivolatile organic compounds

Dewalque et al.	Phthalates (4)	Urinary	Anti-androgenic	Yes	Biomonitoring data	ш	TDI	EFSA	Effects on reproduction and development	NOAEL
(2014)	Fillialates (4)	measurement	Anti-androgenic	Tes	data	п	RfD	Kortenkamp and Faust (2010)	Anti-Androgenic	BMD
Christensen et al.	Phthalates (5)	Dietary contamination	Anti-androgenic	Ves	Biomonitoring	ні	TDI	EFSA	Effects on reproduction and development	NOAEL
(2014)	T minutes (5)	Urinary measurement	Tinti unurogenie	105	data		RfD	Denmark EPA	Anti-Androgenic	LOAEL
Jordim et al. (2014)	OPs (7)	Dietary	Multiple	Vac	Contamination	DDE	RPF	Caldas et al. (2006) U.S. EPA	A ChE activity	NOAEL
Jardini et al. (2014)	Pyrethroids (4)	contamination	Wuttiple	165	data	KI I'	RfD	JMPR U.S. EPA	Achie activity	BMD
Leeman et al.	CBs (7)	Dietary	AChE inhibitors	X	Contamination	DDE	RPF	Calculated		
(2013)	Phthalates (6)	contamination	Ache inhibitors Anti-androgenic	res	data	KPF	ADIRf D	EU Pesticide Database	na	na
Borg et al. (2013)	PFASs (17)	Dietary contamination Urinary measurement	Multiple	Yes	Biomonitoring data	HI	RfD	Calculated	Hepatotoxicity Reproductive toxicity	NOAEL LOAEL BMD
Beko et al. (2013)	Phthalates (3)	Residential (dust contamination) Urinary measurement	Anti-androgenic	Yes	Biomonitoring data Contamination data	HI	TDI	EFSA	Effects on reproduction and development	NOAEL LOAEL
Kalantari et al.	PCBs (5)	Dietary	Reduction of	Yes	Contamination	RPF Combine	RPF	Kalantari et al. (2012)	Hepatic retinoids	na
(2013)	1003(3)	contamination	hepatic retinoid	103	data	d MOE	RfD	Calculated	Body/liver weights	BMD ₀₅
Beamer et al. (2012)	OPs (2)	Dietary contamination Residential (media contamination)	AChE inhibitors	Yes	Contamination data	RPF HI	RPF RfD	U.S. EPA	ChE inhibition (plasma, RBC) ChE inhibition (brain)	BMD ₁₀ NOAEL
Søeborg et al.	Dhthalatas (4)	Urinary	Anti androgania	Vac	Biomonitoring	ш	TDI	EFSA	Effects on reproduction and development	NOAEL
(2012)	Thinalates (4)	measurement	Anti-androgenie	103	data	111	RfD	Kortenkamp and Faust (2010)	Anti-Androgenic	LOAEL
Ragas et al. (2011)	CBs (1) Neonicotinoids (1) OCs (1) OPs (2) Pyrethroids (1)	Dietary contamination	Nervous system Liver	Yes	Contamination data	HI	ADI	EC WHO	na	na
Koch et al. (2011)	Phthalates (3)	Urinary measurement	Anti-androgenic	Yes	Biomonitoring data	HI	TDI	EFSA	Effects on reproduction and development	NOAEL LOAEL
Kortenkamp and Faust (2010)	OCs (1) OPs (1) Parabens (2) Phenols (1)	-	Anti-androgenic	No	Contamination data	НІ	RfD	Calculated	Anti-androgenic	NOAEL LOAEL BMDL

	Phthalates (5) PBDEs (1) Other classes of pesticides (4)						ADI	EFSA		
Linares et al. (2010)	PAHs (3)	Chemical and petrochemical industries emissions	-	Yes	Contamination data	HI	RfD	U.S. EPA	na	na
Bosgra et al. (2009)	OPs (31)	Dietary contamination	AChE inhibitors	Yes	Contamination data	RPF Combine d MOE	RPF	Calculated	AChE activity	BMD ₂₀
Benson (2009)	Phthalates (5)	-	Anti-androgenic	Yes	Biomonitoring data	RPF HI	RfD	Calculated	Anti-Androgenic	NOAEL LOAEL BMDL
	OPs (26)	Dietary			Contamination		RPF Calculated	NOAEL		
Boon et al. (2008)	CBs (8)	contamination	AChE inhibitors	Yes	data	RPF	RfD	JMPR	AChE activity	BMD ₁₀
Durmusoglu et al. (2007)	Phenols (1) PAHs (4)	Tire industries emissions	Respiratory irritation	No	Contamination data	HI	RfD	U.S. EPA	Not specific	na
	OPs (22)	Dietary			Contamination		RPF	Calculated		NOAEL
Caldas et al. (2006)	CBs (3)	contamination	AChE inhibitors	No	data	RPF	RfD	JMPR	AChE activity	BMD ₁₀
Castorina et al. (2003)	OPs (11)	OPs commonly applied that metabolize dialkyl compounds	AChE inhibitors	Yes	Biomonitoring data	RPF Combine d MOE	RPF	Calculated	AChE activity	BMD ₁₀

AChE = acetylcholinesterase; ADI = Acceptable daily intake; CBs = Carbamates; DNEL = Derived no effect level; EC = European Commission; HI = Hazard index; HQ = Hazard quotient; JMPR = Joint FAO/WHO Meeting on Pesticide Residues; MOE = margin of exposure; na = not available; OCs = Organochlorines; OPs = Organophosphorus; PAHs = Polycyclic aromatic hydrocarbons; PCBs = Polychlorinated biphenyls; PFAs = Perfluoroalkoxy alkanes; POD = Point of departure; POPs = Persistent organic pollutants; RBC = Red blood cell; RfD = Reference dose.