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Comparative Analysis of Rapid Equilibrium Dialysis (RED) and Solid Phase Micro-Extraction (SPME) Methods for In Vitro-In Vivo Extrapolation of Environmental Chemicals

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Abstract

In vitro to in vivo extrapolation (IVIVE) is a critical component of the efforts to prioritize and assess environmental chemicals using high-throughput *in vitro* assays. The plasma unbound fraction (Fub) is a key toxicokinetic parameter in IVIVE, and is usually measured via the Rapid Equilibrium Dialysis (RED) assay widely used for pharmaceuticals. However, pharmaceuticals have a narrower range of physicochemical properties than environmental chemicals. Motivated by the observation that high LogK_{OW} compounds appeared to have disproportionately low Fub measurements using RED, we added a protein-free control in order to verify equilibration to 100% unbound in the absence of proteins. We found that many high LogK_{OW} non-pharmaceuticals fail to equilibrate in RED in protein-free controls, and thus had apparent values of Fub = 0 in plasma. In these cases, Solid Phase Microextraction (SPME) as an alternative method provided an accurate, though more time-consuming, alternative to accurately determine Fub. We propose an updated IVIVE workflow that adds a protein-free control to the RED protocol, with the use of alternative approaches, such as SPME, in cases where compounds fail to adequately equilibrate. These refinements will provide additional confidence in the use of IVIVE as part of high-throughput screening programs of chemicals.

Keywords

In vitro-in vivo extrapolation; high-throughput screening; protein binding; environmental chemicals; toxicokinetics

Introduction

The National Academies' seminal report *Toxicity Testing in the 21st Century: A Vision and Strategy* (National Research Council, 2007), ushered in a new era *in vitro*-based toxicology

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aimed at prioritizing and assessing the tens of thousands of chemicals in commerce. The report envisioned that pharmacokinetic modeling would be needed to relate effective concentrations *in vitro* and environmental exposure levels, generally referred to know as “*in vitro-in vivo* extrapolation,” or IVIVE (Yoon et al., 2012). Indeed, IVIVE is now recognized as essential to enabling prioritization and decision-making based on *in vitro* testing of chemicals (Bell et al., 2018; Wetmore, 2015).

The need to conduct IVIVE on a large scale across many chemicals has in turn led to the development of “high throughput toxicokinetic” (HTTK) models that only require a small number of experimental measurements in order to parameterize (Pearce et al., 2017; Wambaugh et al., 2015). By far the most widely used HTTK-based approach to IVIVE utilizes a simple steady state model that relies on two measurements that can be done *in vitro*: hepatic clearance and plasma protein binding (Rotroff et al., 2010; Wetmore et al., 2012). Specifically, for a given oral dose, the steady state plasma concentration (C_{SS}) in this case is given by

$$C_{SS} = \frac{\text{dose}}{(\text{GFR} \times F_{ub}) + \left(\frac{(Q_1 \times F_{ub} \times Cl_{int})}{(Q_1 \times F_{ub} \times Cl_{int})} \right)} \quad (1)$$

Because linear kinetics is assumed, the dose is usually set to a unit value of 1 mg/kg-day. F_{ub} equals the unbound fraction of parent chemical, measured through *in vitro* plasma protein binding. Cl_{int} equals intrinsic hepatic clearance, measured through *in vitro* hepatic clearance and scaled up to human physiological values. GFR is glomerular filtration rate and Q_1 is liver blood flow, set at human physiological values. The calculation of C_{SS} then assumes that elimination is solely due to hepatic metabolism and renal filtration, with only the unbound chemical fraction available for metabolism and elimination. The standard approach is then to measure Cl_{int} using cryopreserved hepatocytes, and to measure F_{ub} using Rapid Equilibrium Dialysis (RED) (Rotroff et al., 2010; Wetmore et al., 2012). This approach has been used for over 400 chemicals that had been tested in the U.S. EPA ToxCast screening battery (Wetmore, 2015). An “Oral Equivalent Dose” (OED) is determined by applying reverse dosimetry to determined exposure levels needed to reach steady state blood concentrations equal to the effective *in vitro* concentrations (e.g., AC_{50}):

$$\text{Oral equivalent dose(mg/kg/day)} = \text{ToxCast } AC_{50} \text{ or LEC}(\mu\text{M}) \times \frac{1 \text{ mg/kg/day}}{C_{ss}(\mu\text{M})} \quad (2)$$

Overall, these assumptions are thought to be conservative in the sense of not underestimating the dose at which bioactivity would be observed.

Much of the emphasis on improving the accuracy of IVIVE has focused on the prediction of metabolic clearance (Bell et al., 2018). However, in many cases, protein binding may have equal or greater impact on overall kinetics. Because of the success and broad applicability of RED method for predicting freely available concentrations of pharmaceuticals (Bohnert and

Gan, 2013), use of RED to determine F_{ub} has become part of the standard protocol for IVIVE analyses (Wetmore, 2015). However, due to the Lipinski “rule of 5” (Lipinski et al., 2001), pharmaceutical compounds commonly have a much narrower range of chemical properties as compared to the broader universe of chemicals in commerce.

For instance, one of Lipinski rules is that the octanol-water partition coefficient (LogK_{ow}) be no greater than five, while a large number of industrial chemicals have values greater than five (e.g., many polychlorinated biphenyl (PCB) and polycyclic aromatic hydrocarbon (PAH) compounds). High LogK_{ow} is also associated with non-specific binding to polymer-based plates used in *in vitro* experiments (Auner et al., 2019), raising the question as to whether apparently high values of binding derived from RED assays may be confounded by non-specific binding. For instance, a substantial fraction of chemical compounds tested using RED have been reported to have very small (<5%) or negligible values for F_{ub} (Wetmore, 2015), in which case a nominal value of $F_{ub} = 5\%$ has been assigned for the purposes of IVIVE. However, these data (Figure 1A) show that there appears to be strong correlation between higher LogK_{ow} and smaller values of the F_{ub} . Among the 51 chemicals with $\text{LogK}_{ow} \leq 5$, only three had measured $F_{ub} > 5\%$. Additionally, among the 97 chemicals with non-detectable F_{ub} , only 9 had a $\text{LogK}_{ow} < 3$ (Figure 1B). This correlation raises the concern that some of the small reported values for F_{ub} may be due to limitations in the domain of applicability of RED assay, and not reflect the true degree of plasma protein binding. For instance, the reported F_{ub} based on RED for the pesticide permethrin was 0% (Wetmore et al., 2012), while a radiolabel-based study reported much higher values of $F_{ub} = 11\%$ -80% (Sethi et al., 2014). Therefore, there is a critical need to routinely verify whether and when RED may be giving spurious results, as well as to testing alternative methods for measuring plasma protein binding in such cases.

To address this need, we first selected a subset of chemicals previously tested with RED assay that had a range of values for LogK_{ow} . We then augmented the standard RED protocol to include an additional protein-free control, so as to verify equilibration reflecting $F_{ub}=100\%$ in the absence of protein binding. Finally, we used Solid Phase Microextraction (SPME) as an alternative method for determining F_{ub} . We found that it is not uncommon for nonpharmaceuticals that RED fails to equilibrate in the absence of proteins, leading to an apparent value of $F_{ub} = 0$, and thus suggesting that F_{ub} in plasma determined by RED assay may not be accurate. Additionally, we found that in these cases, SPME provides an accurate, though more time-consuming, alternative to determining F_{ub} .

Materials and Methods

Chemicals

Phosphate buffer saline (PBS), LC-MS grade acetonitrile, dimethyl sulfoxide (DMSO), LC/MS grade water with 0.1% formic acid, and LC-MS grade methanol were purchased from Fisher Scientific (Waltham, MA). Pharmaceuticals: propranolol, sotalol, and isoproterenol were purchased from Molecular Devices (Sunnyvale, CA). Cisapride monohydrate was purchased from Sigma-Aldrich (St. Louis, MO). These pharmaceuticals were selected because their toxicokinetics has been extensively studied and they cover a range of plasma protein binding values as well as octanol/water partition coefficient's

(logK_{ow}). Environmental chemicals: carbaryl, pirimicarb, permethrin, acenaphthene, benzo(k)fluoranthene, chrysene, dibenz(a,h)anthracene, and phenanthrene were purchased from Sigma-Aldrich. Prometon was purchased from Accustandard (New Haven, CT). Acenaphthene, carbaryl, permethrin, pirimicarb, and prometon have been evaluated with the RED device in other studies and were selected to assess reproducibility of the RED assay data (Wetmore et al., 2012). Remaining chemicals were selected to evaluate logK_{ow} effects within the RED assay. In total, all selected chemicals cover a broad spectrum of logK_{ow} values, ranging from 0.1 (isoproterenol) to 6.75 (dibenz(a,h)anthracene) (Table 1). All chemicals and reagents were stored according to manufacturer's guidelines. Pharmaceuticals and environmental chemicals were purchased in neat form and diluted in 100% DMSO to working stock concentration of 2 mM and stored at < -70°C until use.

Rapid Equilibrium Dialysis (RED) Assay

Plasma protein binding was evaluated for each chemical utilizing the rapid equilibrium dialysis (RED) method as described in other publications (Figure 2A) (Rotroff et al., 2010; Wetmore et al., 2012), but modified to incorporate no protein equilibrium controls (Figure 2B). Human plasma was recovered from whole blood donations using anti-coagulant (K₂EDTA) and pooled from healthy donors at a U.S. Food and Drug Administration-licensed donor center (HMPLEDTA2; Bioreclamation, Westbury, NY). All donors tested negative for HIV V2 AB and HCV AB and non-reactive for HBSAG, HIV-1 RNA, HCV RNA, HBV DNA and STS. Prior to analysis, human plasma, stored at < -70°C, was thawed to room temperature and centrifuged at 2000×g for 10 minutes to remove particulates (Waters et al., 2008; Wetmore et al., 2012). The assay was conducted using RED inserts (catalog no. 90006, Pierce Biotechnology, Rockford, IL) according to manufacturer's instructions, with protocol modification to incorporate protein free equilibrium controls. The RED membrane 8K MWCO was used in all experiments. The only deviation from previously published protocols was addition of equilibrium controls comprising of PBS buffer in both sample and buffer chambers, which are designed to verify that chemicals frilly equilibrated within the device in the absence of proteins (Figure 2B).

DMSO-dissolved chemical stock solutions were diluted 200-fold in human plasma to test concentration of 10 μM. This concentration was used by previous investigators for generating data for IVIVE (Rotroff et al., 2010; Wetmore et al., 2012), and corresponds to a typical *in vitro* test concentration. Preliminary experiments with the three drugs conducted at both 1 and 10 μM gave similar results, so subsequent experiments were only conducted at 10 μM. Moreover, because the aim of IVIVE to estimate oral equivalent doses from *in vitro* assay results, which are then compared to human exposure levels for the purposes of prioritization, it is only necessary to measure F_{ub} in the range of nominal test concentrations. Specifically, if the margin of exposure is large, then a smaller F_{ub} at lower environmental concentrations (where there is less saturation of binding sites) would only make the margin of exposure larger. On the other hand, if the margin of exposure is small, then the test concentrations are already in the range of human exposures.

Final DMSO concentration in each assay was 0.5% (v/v). Sealing tape was placed on each RED device and it was incubated at 37°C for 4 hours at 100 oscillations per minute on an

orbital rocker (Waters et al., 2008; Wetmore et al., 2012). Upon completion of incubation, 50 μL aliquots were removed from each chamber and matrix matched with equal volumes of plasma, or buffer. Samples were diluted with 300 μL 100% acetonitrile and frozen at -80°C until analysis (Waters et al., 2008; Wetmore et al., 2012). Aliquots of spiked human plasma, and PBS working stock solutions were removed to measure percent recovery. These percent recovery samples followed the same matrix match and acetonitrile dilution pattern. All RED assays were completed in triplicate.

The percentage of a chemical that remains unbound was calculated by measuring the concentration within both chambers, sample and buffer. The concentration in the buffer chamber was then divided by the concentration detected in the sample chamber and multiplied by 100. Experiments were performed in triplicate and percent unbound values were averaged to determine the final unbound value. No testing concentrations were below the analytical detection limits.

Solid Phase Micro-Extraction (SPME) Assay

SPME techniques present a possible alternative to accurately measure protein binding for chemicals not suitable for the RED assay. The SPME device consists of small rods covered in a material that absorbs a fraction of the chemical in equilibrium with the sample's unbound concentration. This technique has been utilized in a variety of applications such as ecological contamination monitoring, *in vitro* protein binding modeling, and analysis of a variety of chemicals (Blaauboer, 2010; Musteata et al., 2006; Peltenburg et al., 2015).

Protein binding analysis followed previously described methods (Musteata et al., 2006; Peltenburg et al., 2015) with some modifications at room temperature (Figure 2C). C_{18} SPME fibers were preconditioned in methanol/Milli-Q water solution (50:50). Samples were placed into 2 ml amber glass vials containing 200 μL glass inserts. Total sample volume was 100 μL and analyses were performed in triplicate. Prior to SPME fiber extraction, samples were allowed to equilibrate on an orbital shaker (500 rpm) for 1hr. After equilibration, SPME fibers were inserted through the vial cap septa and placed in the incubator on an orbital shaker (500 rpm) for 3 hrs. After that, SPME fibers were removed, rinsed briefly with Milli-Q water and placed in 100 μL of 100% acetonitrile. Fibers were placed on an orbital shaker (500 rpm) and desorbed for 30 min. Standard solutions were prepared in PBS, following the same dilution patterns and fiber extraction, desorption procedures as previously mentioned. SPME protein binding controls (propranolol, acenaphthene, and permethrin) were tested at 10 μM concentrations in pooled human plasma, prepared in the same manner as in the RED assay. These control chemicals were incorporated in order to validate the SPME method's ability to produce accurate and precise protein binding data.

Determination of unbound chemical concentrations using SPME followed procedures outlined elsewhere (Musteata et al., 2006). Briefly, the fiber constant (f_c), representing the partition coefficient between unbound chemical in solution and the amount of absorbed to the fiber, was determined by analyzing standard solutions of chemical in PBS.

$$f_c = \frac{C_{e,s}}{C_{0,s} - C_{e,s}} \quad (3)$$

Where $C_{0,s}$ is the initial concentration prior to fiber extraction and $C_{e,s}$ represents the concentration of the chemical extracted by the fiber. When SPME procedure was performed in a sample containing proteins and a chemical is extracted by the fiber (C_e), the unbound concentration (C_{free}) in the sample is determined using the following equation.

$$C_{free} = \frac{C_e}{f_c} \quad (4)$$

The final total concentration (C_t) of a chemical in the sample was determined using the following equation, where C_0 represents the initial chemical concentration prior to fiber extraction.

$$C_t = C_0 - C_e \quad (5)$$

Ultimately, the percentage unbound (% Unbound) was calculated from the total and free concentration of the chemical as displayed below.

$$\%Unbound = \left(1 - \frac{C_t - C_{free}}{C_t}\right) \times 100 \quad (6)$$

Analytical Chemistry

All analytical measurements were performed using Agilent (Santa Clara, CA) 6470 triple quadrupole mass spectrometer operating in positive ion mode with a Waters Acquity H class HPLC (Milford, MA). Chromatography separation was performed on a C_{18} column (Agilent Zorbex Eclipse Plus C_{18} 3.0×50mm, 1.8 micron) with a C_{18} guard column. Complete HPLC/MS and GC/MS conditions for all chemicals are listed in Supplemental Tables 1–2.

Analysis of pharmaceuticals: Aqueous mobile phase consisted of 0.1% formic acid and acetonitrile for organic mobile phase. Sample (10 μ L) injections were separated using the following a solvent gradient: (1) 2% organic for 1 min; (2) linear gradient ramp to 95% organic over 1.5min; (3) 95% organic maintained for 1.5 min; (4) linear gradient ramp to 2% organic over 0.2 min; (5) 2% organic condition held for 3.8 min until next injection. Total analysis time was 8 minutes at a flow rate of 400 μ L per minute.

Analysis of environmental chemicals: Chromatography conditions followed a previously described method with slight modification (Wetmore et al., 2012). Aqueous mobile phase consisted of 0.1 % formic acid and methanol for organic mobile phase. Sample

(5 μL) injections were separated using the following a solvent gradient: (1) 20% organic for 0.5 min; (2) linear gradient ramp to 100% organic over 4.5 min; (3) maintain 100% organic for 1 min; (4) linear gradient ramp to 20% organic over 0.5 min; and (5) maintain 20% organic for 2 min prior to the next injection. Total analysis time was 8.5 min per sample at a flow rate of 400 μL per minute. All samples (environmental chemicals, and pharmaceuticals) were introduced to the mass spectrometer in splitless mode with an AJS ESI ion source.

Results

Rapid Equilibrium Dialysis with Additional Controls

As shown in Table 1, a library of 13 chemicals, comprising of pharmaceuticals, pesticides, and industrial chemicals, with $\log K_{ow}$ values ranging from less than 1 to greater than 5 were selected to test the reproducibility and applicability of RED.

Evaluated pharmaceuticals (cisapride, propranolol, and isoproterenol) all had $\text{Log}K_{ow} < 5$, and the resulting F_{ub} measurements were consistent with drug label references or literature-based values (Figure 3A). Cisapride was the most highly bound and isoproterenol was mostly free. Additionally, all pharmaceutical successfully equilibrated within the RED device in PBS controls (Figure 3B), with protein-free free fractions of $>80\%$. We also measured mass balance for these compounds in both protein binding experiments and equilibrium controls, with recovery compared to stock solutions $>70\%$ for cisapride and isoproterenol, but only 43% for propranolol.

For pesticides, measured values for pirimicarb and permethrin were very similar to those previously reported using RED, whereas values for prometon and carbaryl were substantially different (Figure 3C). For instance, carbaryl yielded a lower value of 12% unbound, as compared to a reported value of 70% unbound (Wetmore et al., 2012), displaying a more highly bound characteristic similar to pirimicarb and other carbamate insecticides (Alden, 1991). The three pesticides with $\log K_{ow} < 3$ (prometon, carbaryl, and pirimicarb) all successfully equilibrated with PBS controls, with protein-free free fractions $>95\%$; however, permethrin was poorly equilibrated, with a protein-free free fraction of $<10\%$ (Figure 3D).

For the industrial chemicals other than naphthalene, $F_{ub} < 5\%$ was measured, consistent with previous reports (Figure 3E). For naphthalene, a value of $F_{ub} = 15\%$ was measured, whereas it was also previously reported to be $\sim 2\%$ (Wetmore et al., 2012) (Figure 3E). However, there is a clear trend of lower equilibration with higher $\log K_{ow}$, with the lowest $\log K_{ow}$ compound (naphthalene) completely equilibrated with a protein-free free fraction of 100%, and the compounds with $\log K_{ow} > 5$ completely unequilibrated (Figure 3F). Only biphenyl and naphthalene had equilibration of $>80\%$. All completely unequilibrated compounds have an “apparent” unbound fraction of 0%.

No volume shifts in liquid across the two sides of the membrane were observed. Additionally, for the three pharmaceuticals, 4 PAHs, and permethrin, similar results (not shown) were observed using the 12K MWCO membrane, extending the incubation time from 4 to 5 hr, or using deproteinated plasma instead of PBS for equilibrium controls. For

the larger pore size membrane, mass balance was also measured compared to stock solutions, with recoveries between 47% and 103%.

Solid Phase MicroExtraction

Because low logKow chemicals appeared to consistently equilibrate in the RED device under protein-free conditions, only the subset of chemicals with logKow >3 were tested using SPME. Only for propranolol has Fub been previously measured using SPME, and our results for this compound are consistent with the reported value (Figure 4). For compounds with logKow >3.5, SPME results for Fub were consistently higher than those from RED (Figure 4). In particular, all of the compounds with “apparent” unbound fraction of 0% via RED had measurable values for Fub based on SPME. For instance, for permethrin, SPME yielded Fub of near to 70%, while the RED device resulted in a value <1%. Additionally, the SPME value was within the range of 11%-80% reported by (Sethi et al., 2014), who used ¹⁴C- labeled permethrin analyzed through a 3-phase organic solvent extraction procedure to isolate bound and unbound concentrations.

Conclusions

High-throughput *in vitro* assays offer the promise of more humane, human-relevant, and efficient testing of chemical toxicity as compared to animal bioassays. However, in this new paradigm, the challenge of extrapolating from experimental animals to humans is replaced by an equally daunting challenge of extrapolating from *in vitro* bioactivity to *in vivo* toxicity. A critical component to addressing this challenge is IVIVE, which combines *in vitro* and *in silico* approaches to convert *in vitro* concentrations to equivalent *in vivo* exposure levels. IVIVE requires determination of a chemical’s unbound fraction, as this parameter plays a significant role in assessing its distribution throughout the body, and is also important for determination of its rate of elimination via metabolism and excretion. This parameter is also used widely to estimate bioavailability and safe dosing levels (Bohnert and Gan, 2013). In the pharmaceutical industry, equilibrium dialysis is recognized as the standard, validated approach to determining free fraction of a drug in plasma. The incorporation of RED into pharmaceutical evaluation dramatically reduced time, labor, and data uncertainty common with other equilibrium dialysis methods (Waters et al., 2008). Thus, RED assay was adapted to screen hundreds of environmental chemicals with a hope to provide data necessary for informing *in vitro* to *in vivo* extrapolation (IVIVE) of the dose in chemical risk assessments (Wetmore, 2015).

However, because the range of chemical properties is much wider among environmental chemicals than it is among pharmaceuticals, it is necessary to better understand the domain of applicability of RED so as to ensure accurate prediction of chemical toxicokinetics. This study confirms that chemical water solubility represents a critical factor in determining suitability of the RED approach toward accurate protein binding evaluation. The implementation of protein-free controls through the evaluation of environmental chemicals spanning a range of water solubility revealed that hydrophobic chemicals with larger values of logKow > 5 failed to equilibrate fully within the device, thus yielding inaccurate data. Moreover, the trend towards poor equilibration appears to be apparent at even lower values

of logK_{ow} of 3 or 4. Interestingly, the degree of equilibration does not seem to be influenced by mass balance recovery, as both equilibrating pharmaceuticals and non-equilibrating high logK_{ow} chemicals had similar ranges of recovery. Thus, significant non-specific binding or loss does not appear to be the reason for the lack of equilibrium, suggesting that the RED membrane is for some reason ill-suited for high logK_{ow} compounds. However, we could not definitively determine whether that attachment to the membrane was the specific cause of these problems.

Whatever their source(s), the resultant inaccuracies can result in erroneous IVIVE and pharmacokinetic modeling by altering derived OEDs. The IVIVE models used to extrapolate from *in vitro* concentration to *in vivo* dose (Bell et al., 2018; Wambaugh et al., 2015; Wetmore, 2015), take a health-protective approach by matching *in vitro* active concentrations to C_{ss} based on total blood concentration, as opposed to free concentration. As a result, increasing the unbound chemical concentration contributes to a greater metabolic clearance, constituting to a higher OED, so the challenges with using data from RED assay as identified in this study may result in “conservative” estimates that tend to overestimate risks.

A recent comparison of IVIVE methods with *in vivo* toxicokinetic data in the rat confirms that IVIVE predictions using these methods tend to be “conservative” in the sense that they overestimate the steady state C_{ss} (Wambaugh et al., 2018), although only 3 of the 45 compounds investigated had logK_{ow} > 5. In addition, Casey et al. (2018) recently suggested improvements to IVIVE by incorporating F_{ub} into the calculation of the estimated dose by matching *in vitro* active concentrations to C_{ss} based free concentration:

$$C_{SS} = \frac{F_{ub} \times \text{dose}}{(GFR \times F_{ub}) + \left(\frac{(Q_1 \times F_{ub} \times Cl_{int})}{(Q_1 + F_{ub} \times Cl_{int})} \right)} \quad (7)$$

This equation is the same as equation (1) but multiplied by F_{ub}. In this case, underestimating F_{ub} can result in an underestimate of the C_{ss}, leading to equivalent *in vivo* doses that may not be adequately protective. Thus, accurate estimation of F_{ub} remains a critical concern for implementing IVIVE in high throughput screening and prioritization of chemicals.

SPME is a widely available technique for chromatographic-spectrometric analysis that relies on solvent-free sample preparation whereby the analytes are extracted from a gaseous or liquid sample by absorption in, or adsorption on, a fiber that is coated with various polymers and placed inside an injection needle or inside a capillary (Pragst, 2007). SPME is applied in the analysis of various biological fluids and specimens in both clinical and forensic toxicology. In addition, SPME is used as sampling tool for freely dissolved concentrations, including for pharmaceuticals, especially for highly protein-bound compounds (Peltenburg et al., 2015). The SPME technique implemented in this study demonstrates its suitability as an alternative method to RED assays to evaluate *in vitro* protein binding of more hydrophobic environmental chemicals. Because of the low concentration levels of chemicals in plasma, microextraction sample preparation methods also allow for less consumption of

solvent, reagents, and packing materials, and small sample volumes can be used (Moein et al., 2014). Moreover, SPME has additional advantages, such as increasing detection signal during chemical analysis by reducing instrumental noise commonly attributed to matrix effects (Maciel et al., 2019).

Overall, our results suggest that IVIVE approaches that rely on RED for estimating the extent of protein binding may be inaccurate for more hydrophobic compounds. Fortunately, the accuracy of RED for any given compound can be verified through use of a protein-free control, which measure how well the compound equilibrates within the RED device in the absence of proteins. Thus, we propose an updated IVIVE workflow that adds a protein-free control to the RED protocol. Then, in cases where compounds fail to adequately equilibrate, alternative approaches to measuring protein binding, such as SPME, would be used. Additional optimization of alternative methods would be beneficial in order to better define a comprehensive workflow for protein binding measurements for using in IVIVE. Furthermore, additional studies comparing IVIVE predictions with *in vivo* methods to measure free and bound chemicals in plasma would be useful for validation, particularly for high logK_{OW} compounds for which there is greater uncertainty in the measurement of F_{ub}. These refinements will provide additional confidence in the use of IVIVE as part of high-throughput screening programs of chemicals, further advancing the National Academies' (2007) vision for *Toxicity Testing in the 21st Century*.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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HIGHLIGHTS

- Fraction unbound (Fub) is a key parameter for in vitro-in vivo extrapolation
- Rapid equilibrium dialysis (RED) may lead to incorrect Fub for lipophilic compounds
- Checking equilibration of protein-free controls can verify the validity of RED
- Solid phase microextraction is a recommended alternative for measuring Fub

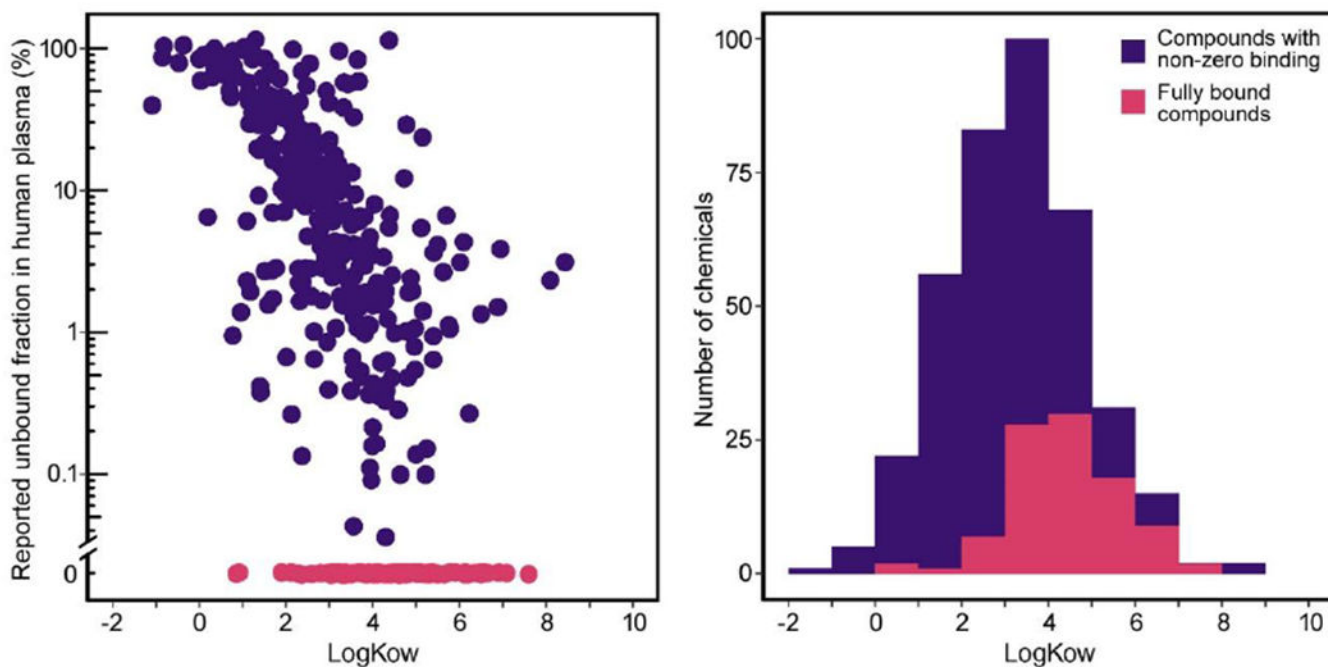


Figure 1. Relationship between logKow and unbound fraction in RED by Wetmore et al. (Wetmore, 2015; Wetmore et al., 2012). having non-zero unbound fractions in purple and those with zero human plasma measured using **A.** Scatter-plot with chemicals unbound fractions in magenta and shown along the lower x-axis. **B.** Histogram distribution of logKow values from panel A overall (purple), and for the subset with zero measured unbound fractions shown in magenta.

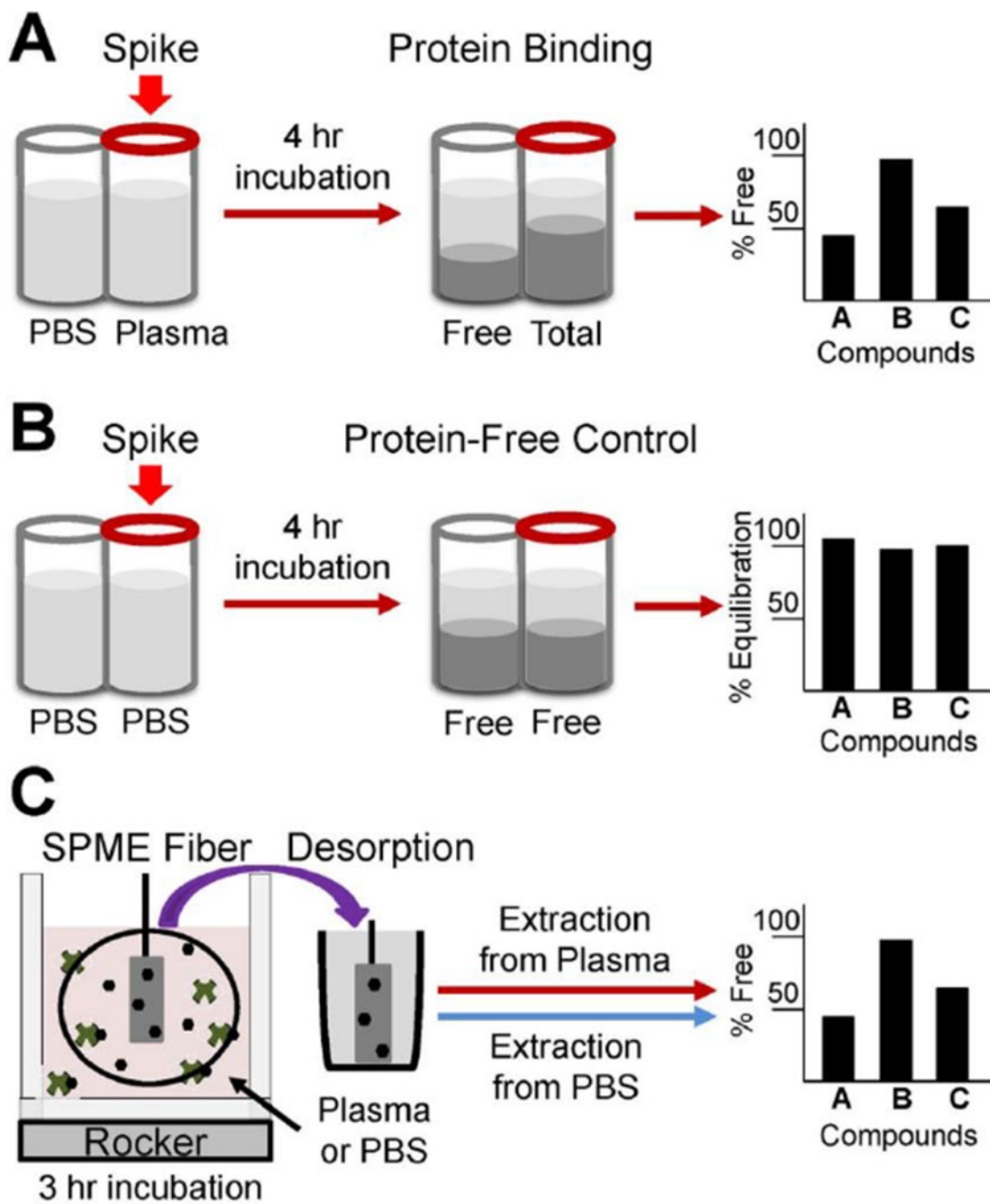
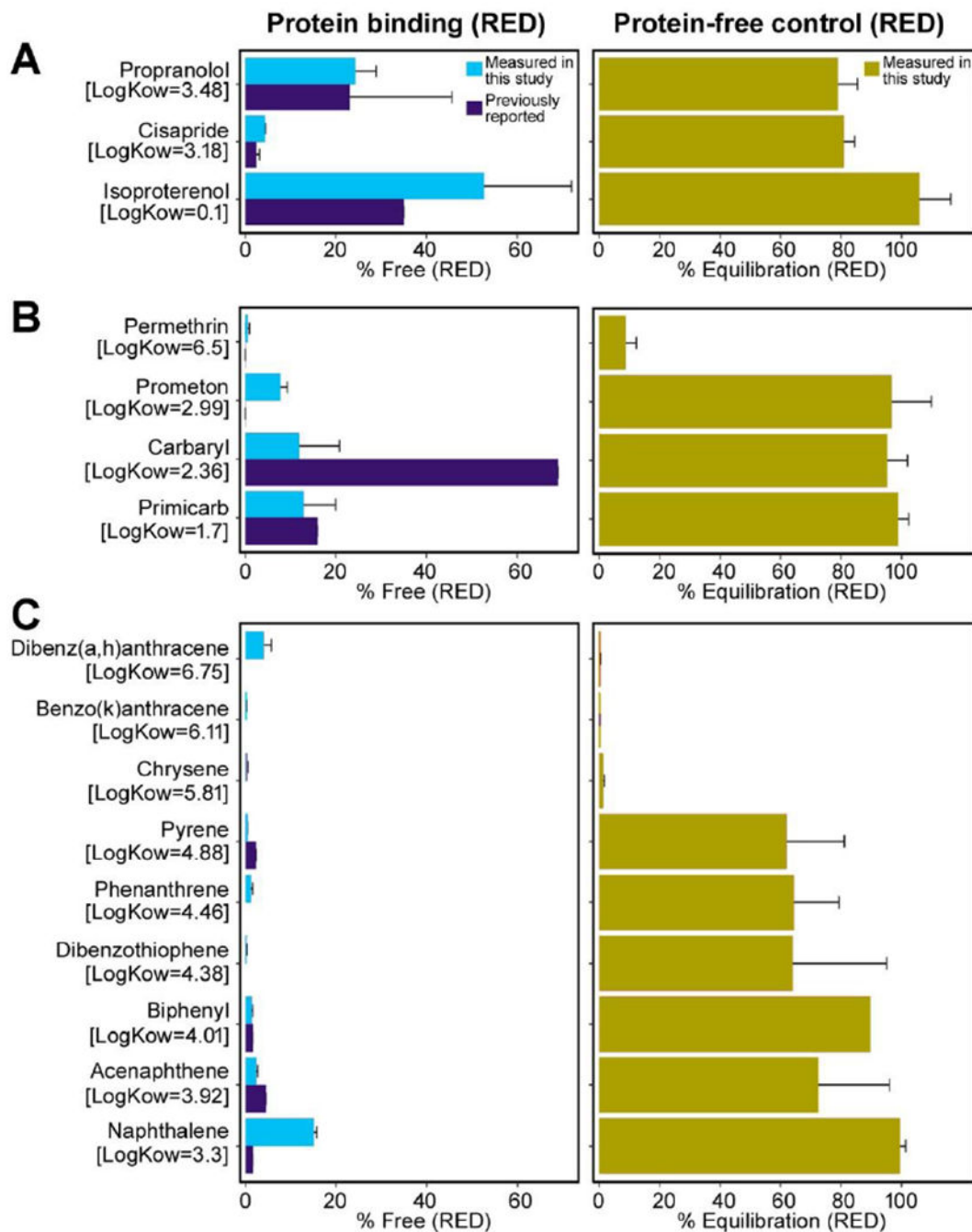


Figure 2. Overview of experimental design.

(A) Rapid Equilibrium Dialysis (RED) assay following manufacturer protocol to measure percent unbound in plasma; (B) additional protein-free control for RED assay to measure percent equilibration in absence of proteins; (C) alternative method to measure percent unbound in plasma using Solid Phase Micro-Extraction (SPME), adapted from (Musteata et al., 2006).



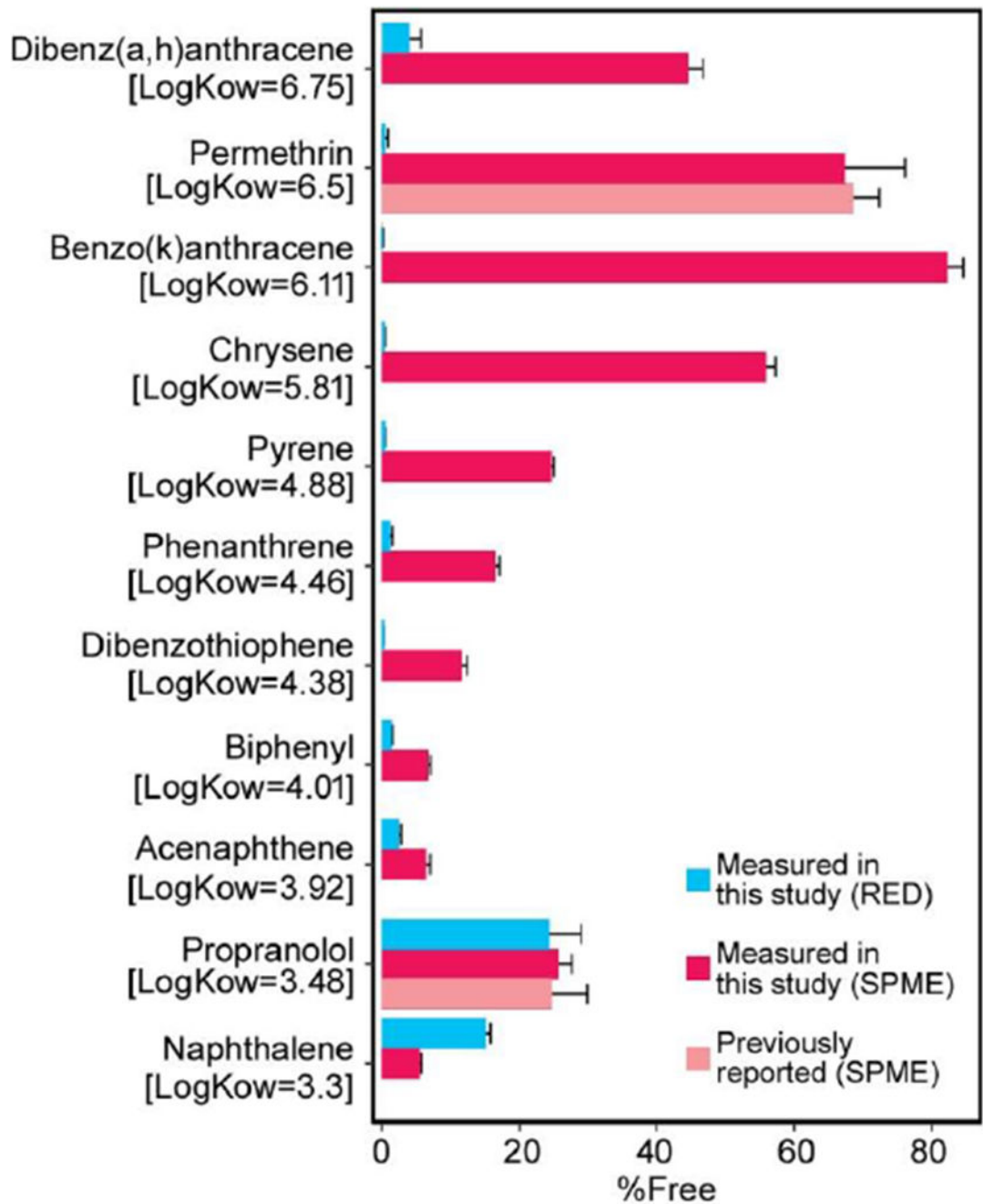


Figure 4. Comparison of RED and SPME results.

Unbound fraction in pooled human plasma measured using rapid equilibrium dialysis, measured using solid phase microextraction, and reported in the literature using solid phase microextraction.

Table 1.

Chemicals Evaluated

Chemical	CASRN	Chemical Class	LogK _{ow}	Literature % unbound (equilibrium dialysis)	Literature % unbound (SPME)
Isoproterenol	51-30-9	drug	0.1	35% ^a	NA
Propranolol	318-98-9	drug	3.48	7% – 39% ^d	25% ^e
Cisapride	260779-88-2	drug	3.18	2-3% ^c	NA
Pirimicarb	23103-98-2	pesticide	1.7	16% ^b	NA
Carbaryl	63-25-2	pesticide	2.36	69% ^b	NA
Prometon	1610-18-0	pesticide	2.99	0% ^b	NA
Permethrin	52645-53-1	pesticide	6.5	0% ^b	NA ^f
Naphthalene	91-20-3	industrial	3.3	1,6% ^b	NA
Acenaphthene	83-32-9	industrial	3.92	4,5% ^b	NA
Biphenyl	92-52-4	industrial	4.01	1,6% ^b	NA
Dibenzot hiop he ne	132-65-0	industrial	4.38	NA	NA
Phenanthrene	85-01-8	industrial	4.46	NA	NA
Pyrene	129-00-0	industrial	4.88	2,4% ^b	NA
Chrysene	218-01-9	industrial	5.81	NA	NA
Benzo(k) fluoranthene	207-08-9	industrial	6.11	NA	NA
Dibenz(a,h) anthracene	53-70-3	industrial	6.75	NA	NA

^a(Kelly and McDevitt, 1978)

^b(Wetmore, 2015; Wetmore et al., 2012)

^cFDA package insert

^d(Fung et al., 2003; Kariv et al., 2001)

^e(Musteata et al., 2006)

^f(Sethi et al., 2014) reported fraction unbound values from 11%-80% depending on concentration, using radiolabeled permethrin and organic solvent extraction.