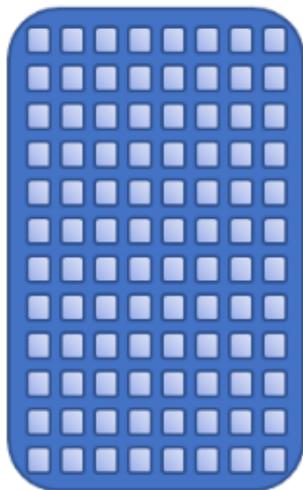


# Evaluation of a Rapid, Generic Human Gestational Dose Model

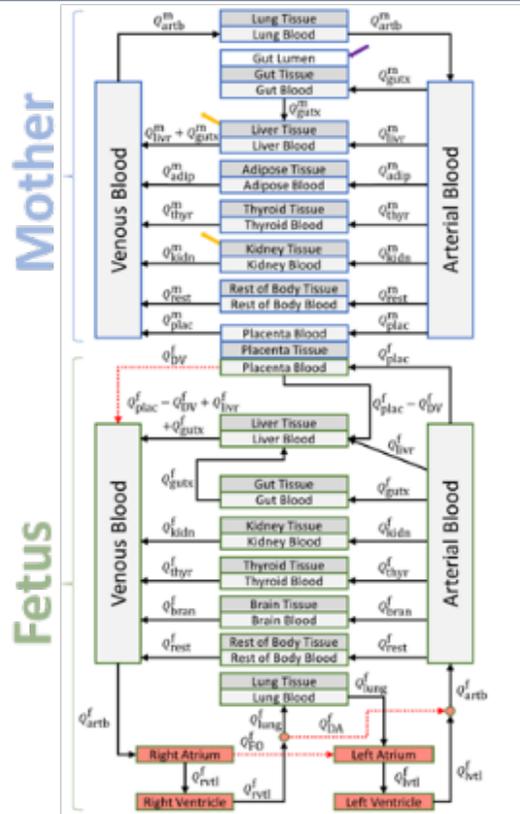
Dustin F. Kapraun<sup>1</sup>, Mark Sfeir<sup>2,3,§</sup>, Robert Pearce<sup>2,3,§</sup>, Sarah Davidson<sup>2</sup>, Annie Lumen<sup>4</sup>, André Dallmann<sup>5</sup>,  
Richard Judson<sup>2</sup>, John F. Wambaugh<sup>2,\*</sup>

- 1) Center for Public Health and Environmental Assessment, U.S. Environmental Protection Agency, Research Triangle Park, NC 27711
- 2) Center for Computational Toxicology and Exposure, U.S. Environmental Protection Agency, Research Triangle Park, NC 27711
- 3) Oak Ridge Institute for Science and Education, Oak Ridge, Tennessee 37831
- 4) National Center for Toxicological Research, U.S. Food and Drug Administration
- 5) Pharmacometrics/Modeling and Simulation, Research and Development, Pharmaceuticals, Bayer AG, Leverkusen, Germany

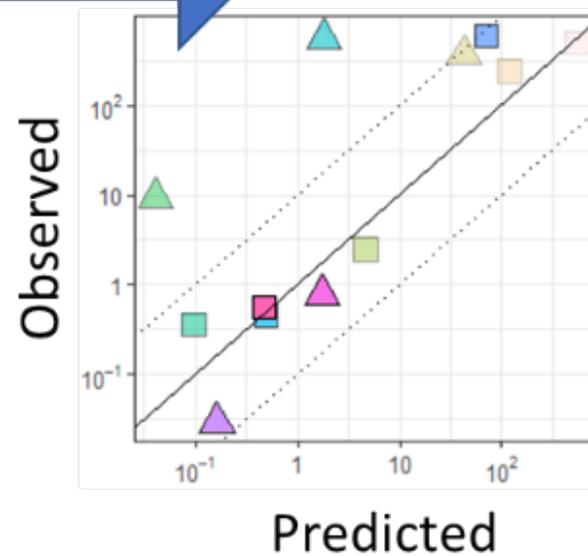
**In Vitro  
Chemical  
Measurements**



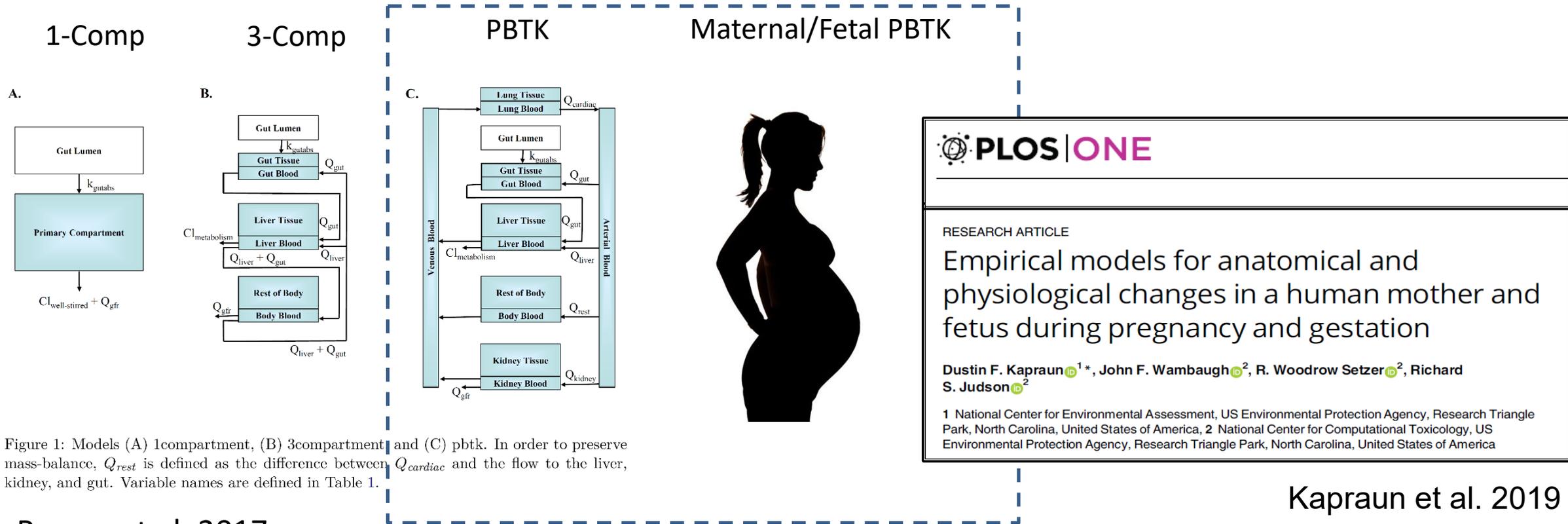
**High Throughput Toxicokinetic Model**



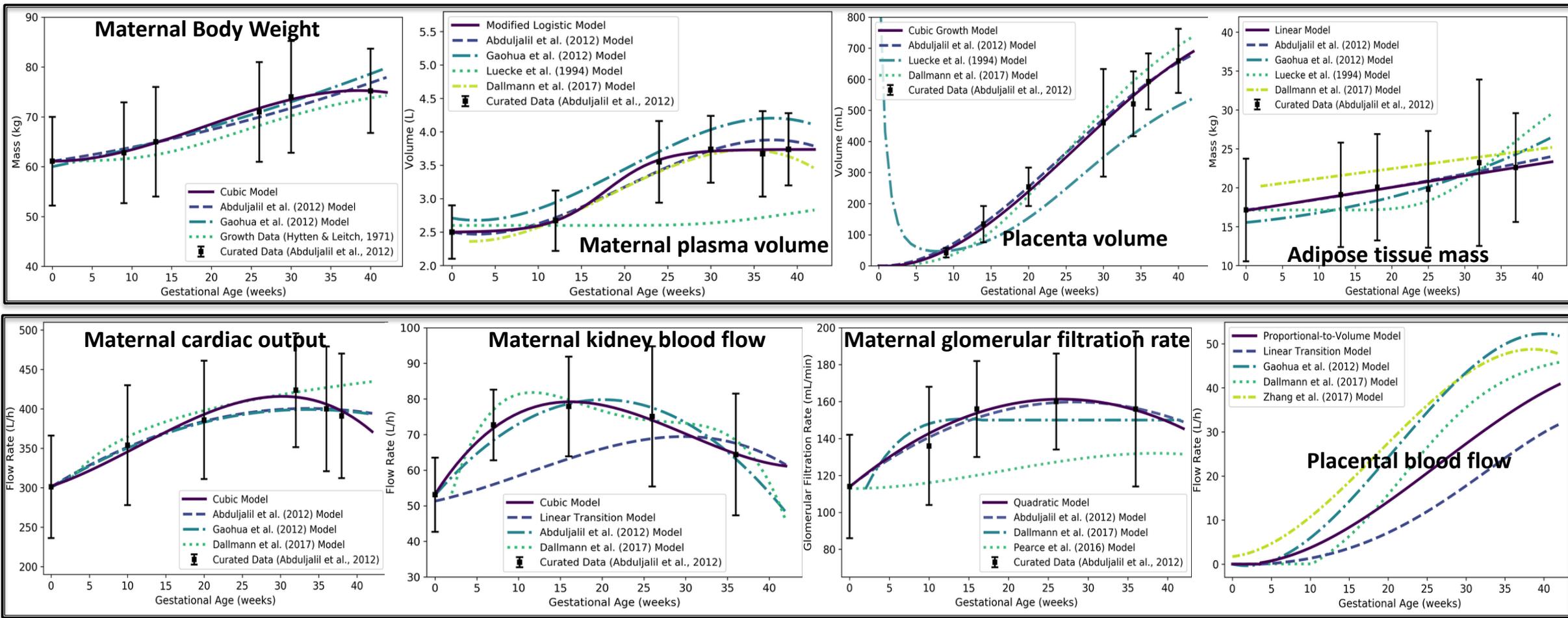
**Evaluation**



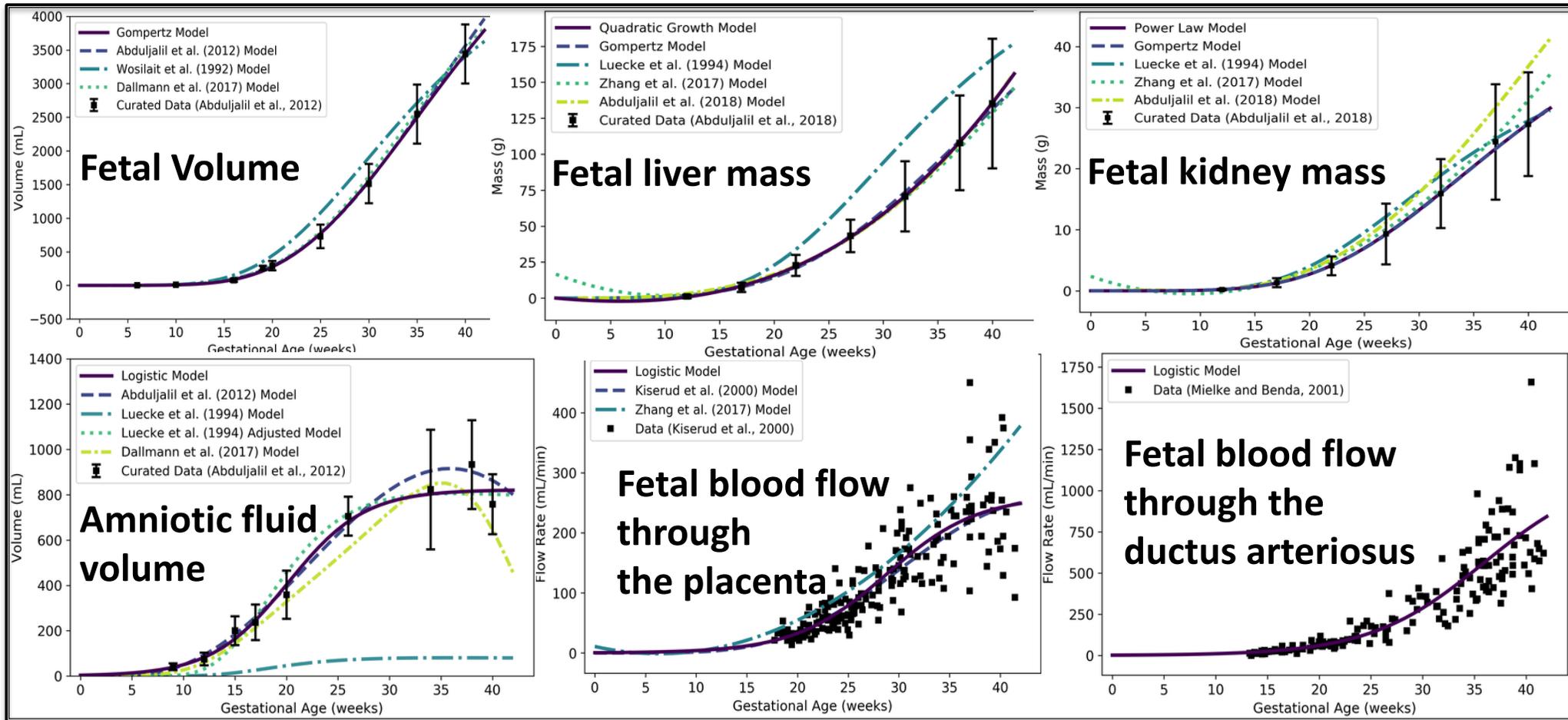
# 'HTTK' R-Package Extended to Pregnancy



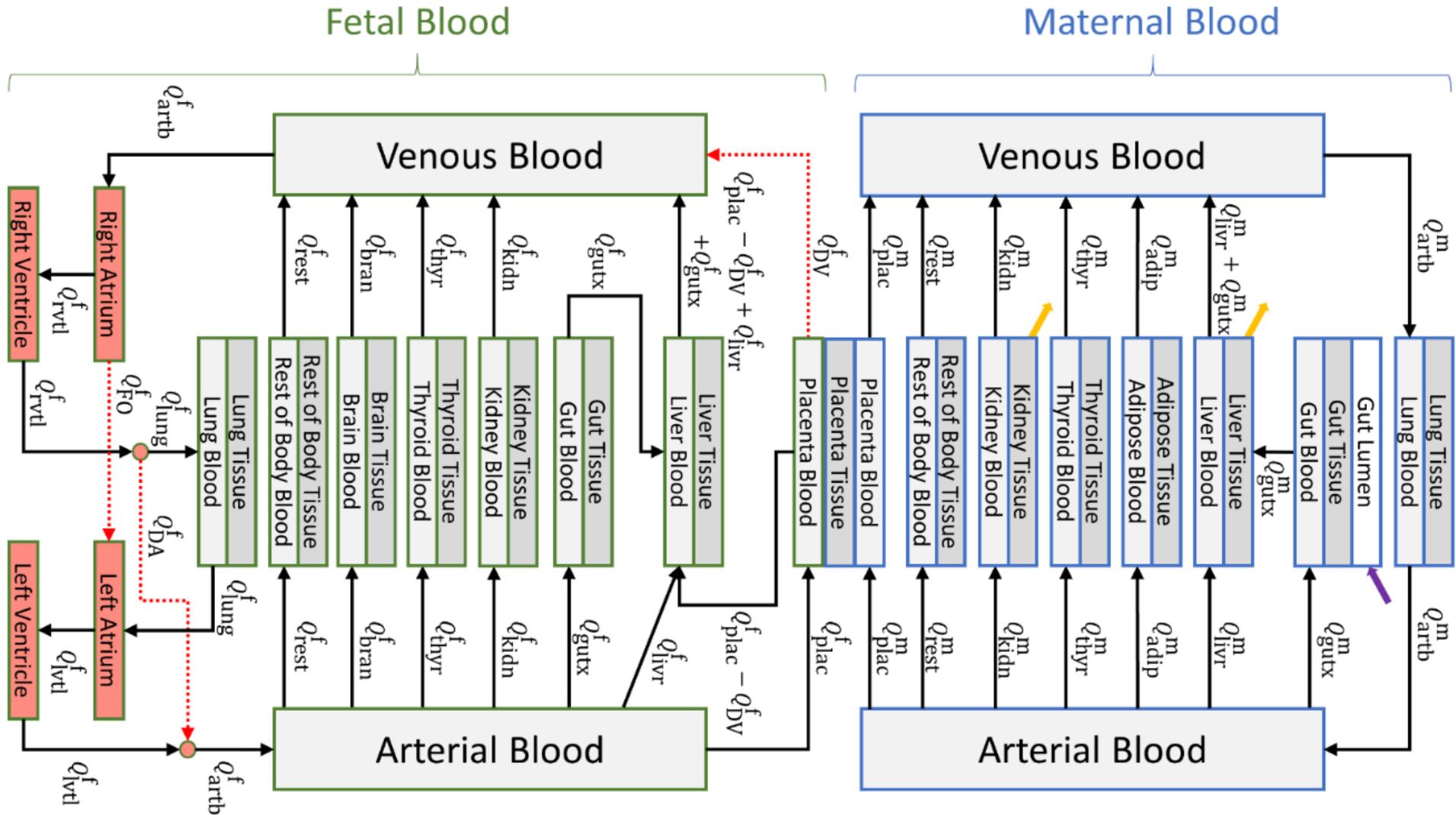
# Representative Physiological Parameter Changes in the Mother



# Representative Physiological Parameter Changes in the Fetus

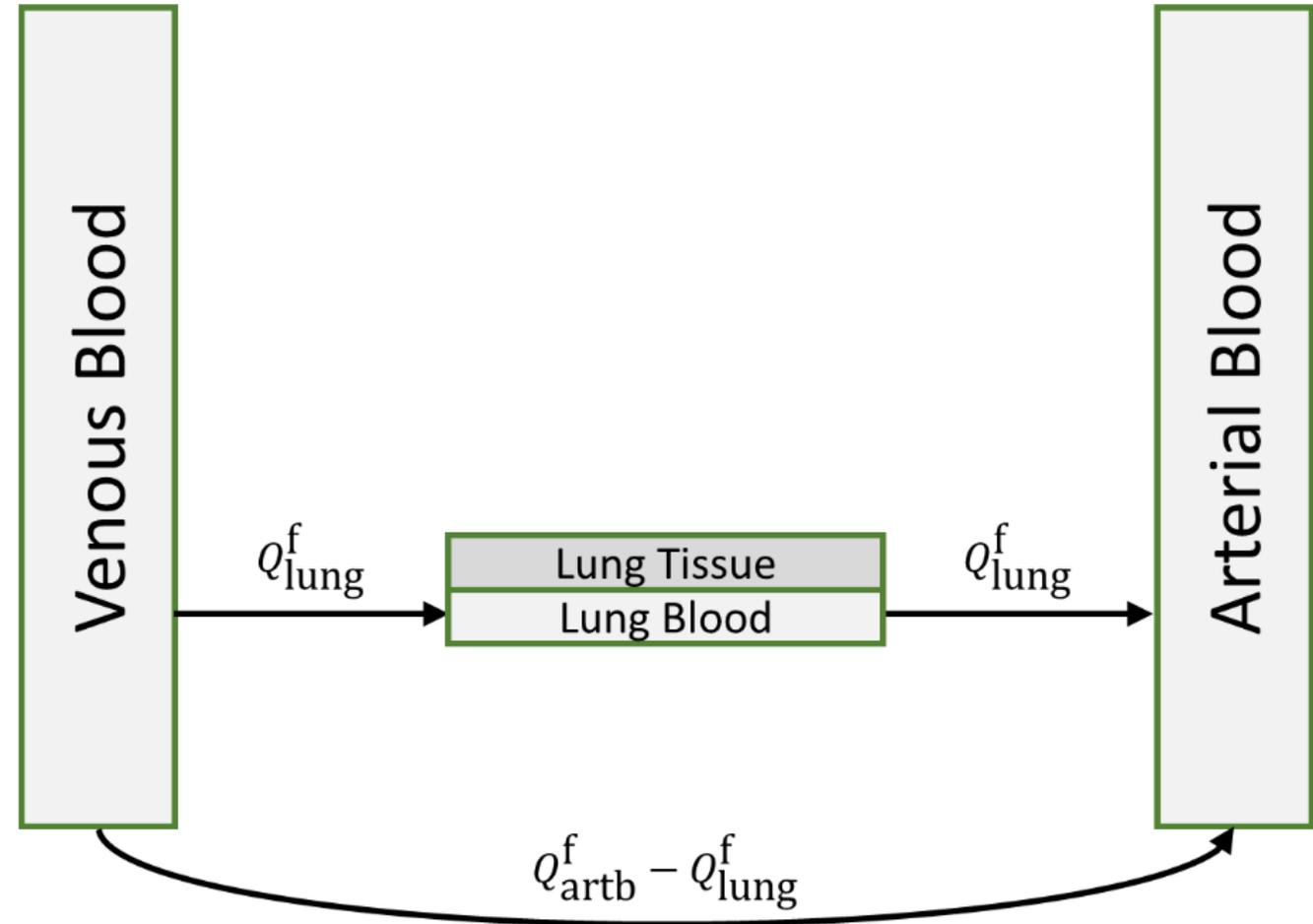


# Generic Gestational PBTK Model



# Fetal Heart

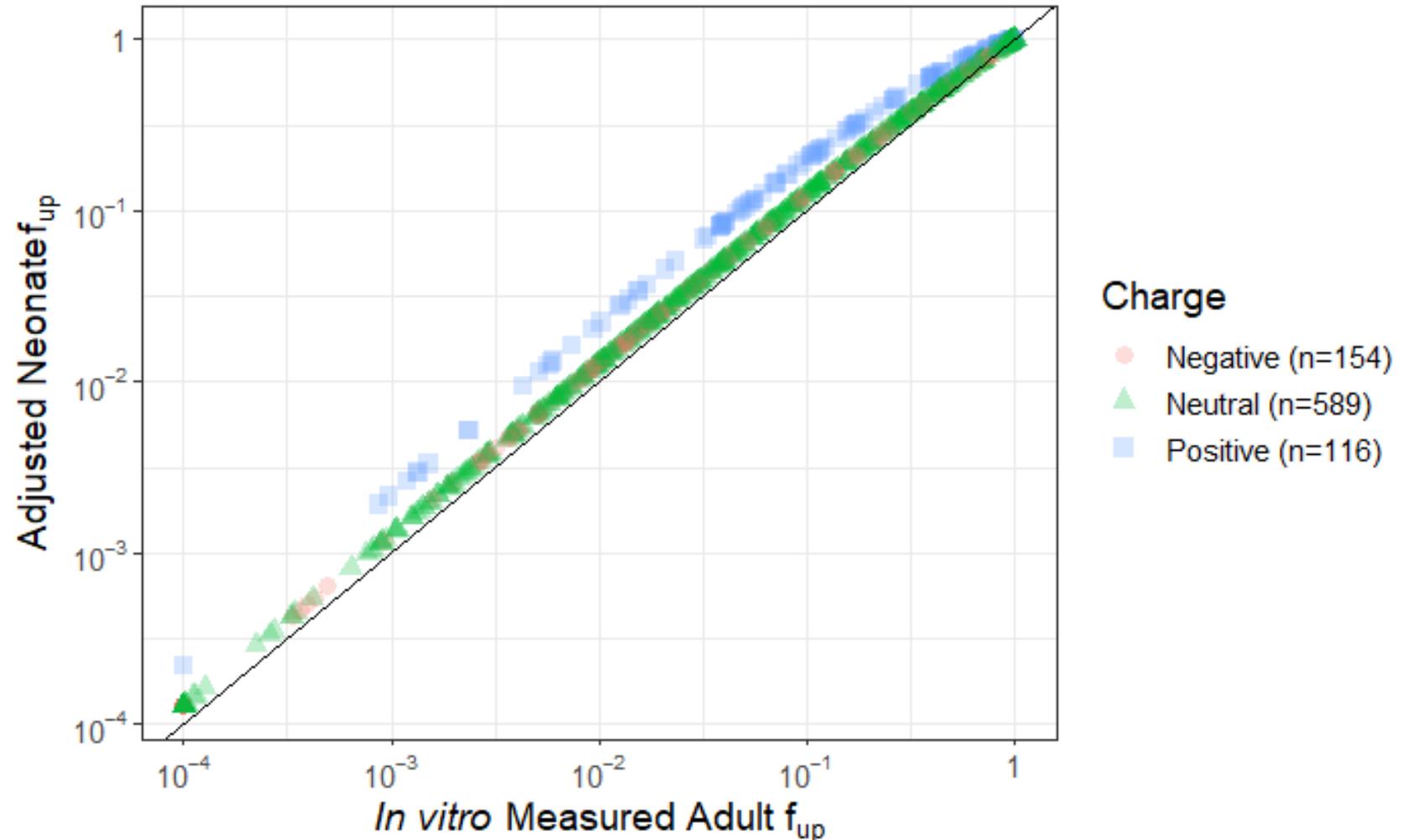
- Simplified partial schematic diagram illustrating effective blood flows in the vicinity of the fetal heart.



# Adjusting Plasma Binding

- The fetal fraction unbound ( $f_{up}^f$ ) is calculated from the maternal fraction unbound and the serum protein concentration ratio in infants vs. mothers based on Equation 6 of [McNamara and Meiman \(2019\)](#):

$$f_{up}^f = \frac{f_{up}^m}{f_{up}^m + (P^f/P^m) \times (1 - f_{up}^m)}$$



# Maternal/Fetal HTKK Model: Features

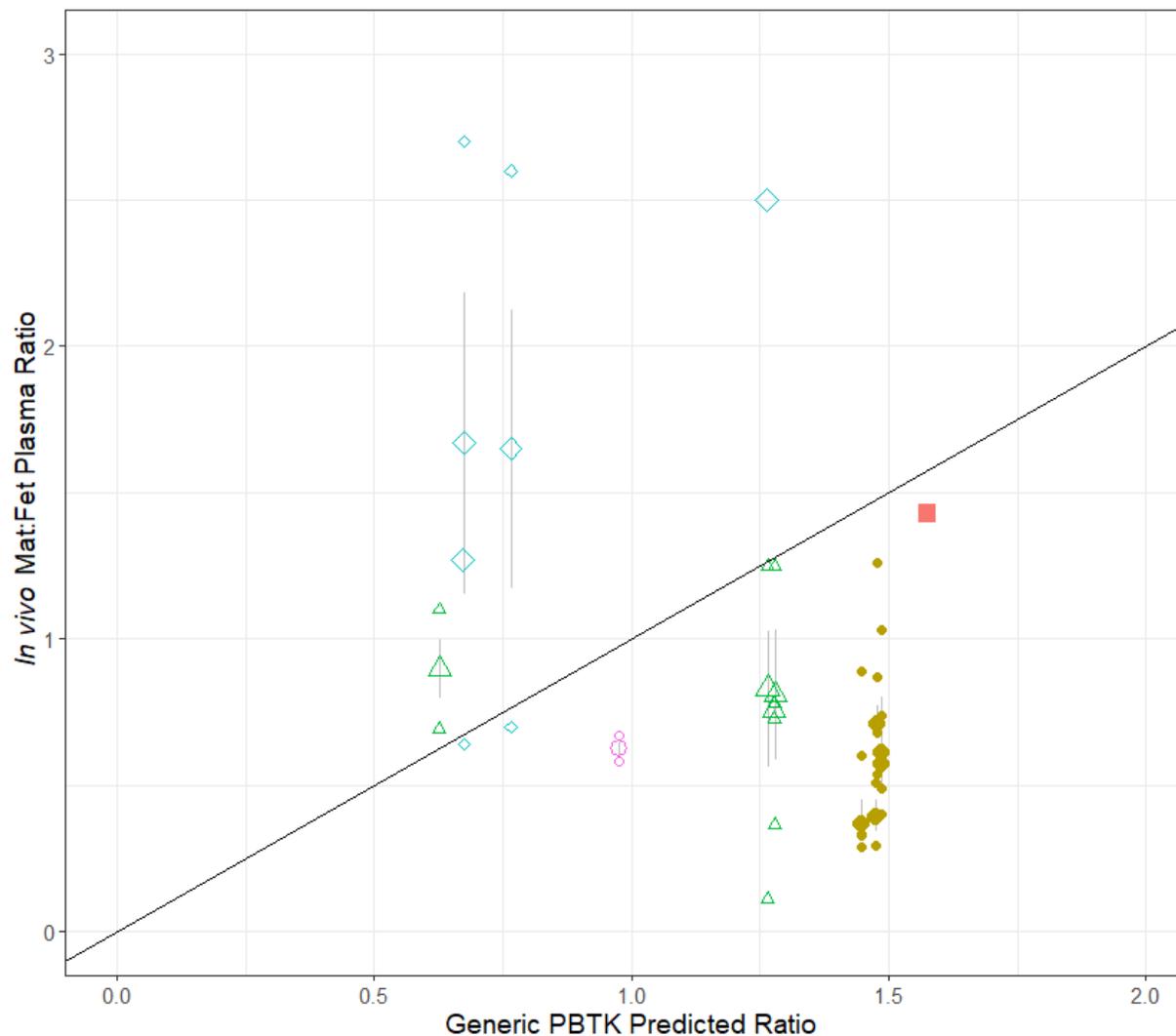
- Description of fetal physiology and the evolving fetal circulatory system in pregnancy PBPK models
- Temporal changes in maternal and fetal physiological parameters (e.g. body weight, blood flow rate, and compartment volumes) informed by the most current human experimental data available
- Designed to simulate ADME in mother and fetus from 13 weeks gestation to term.
- Placental/fetal transfer is described using partition coefficients which might be sufficient for many chemicals
- Accommodates analysis (IVIVE/forward/reverse dosimetry) for >900 chemicals

# Maternal/Fetal HTKK Model: Not Included

- Changes in maternal metabolic enzyme expression levels and activity
- Changes in fetal metabolic enzyme expression levels and activity
- Changes in renal clearance capacities in fetus across gestational age
- Changes in plasma protein binding for both mom and fetus
- Placental metabolism contributions
- Placental barrier descriptions (permeability rate constants or active transporter function to determine extent of fetal exposure might be important for some chemicals)

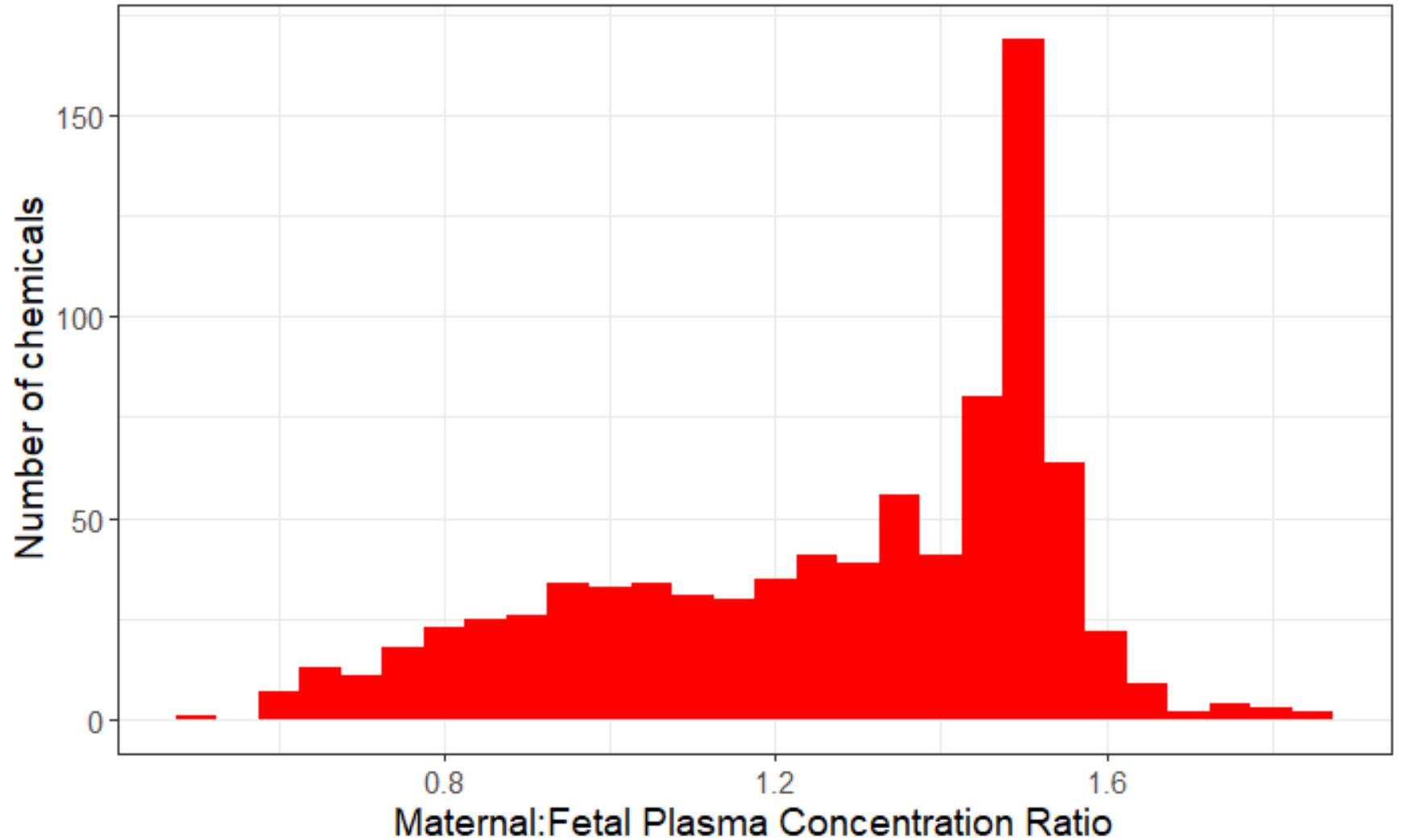
# Observed Maternal:Fetal Plasma Ratio

- Comparison between observed ([Aylward et al., 2014](#)) and predicted maternal-to-fetal plasma concentration ratios at birth. The identity line (solid) indicates a perfect (1:1) correspondence between predictions and observations.
- For any one chemical there is a single prediction (x-value) but there are potentially multiple observations (y-values). The median observation is plotted with a larger symbol, while the 75% interval is depicted with a vertical line and outliers beyond that range are plotted with smaller symbols.



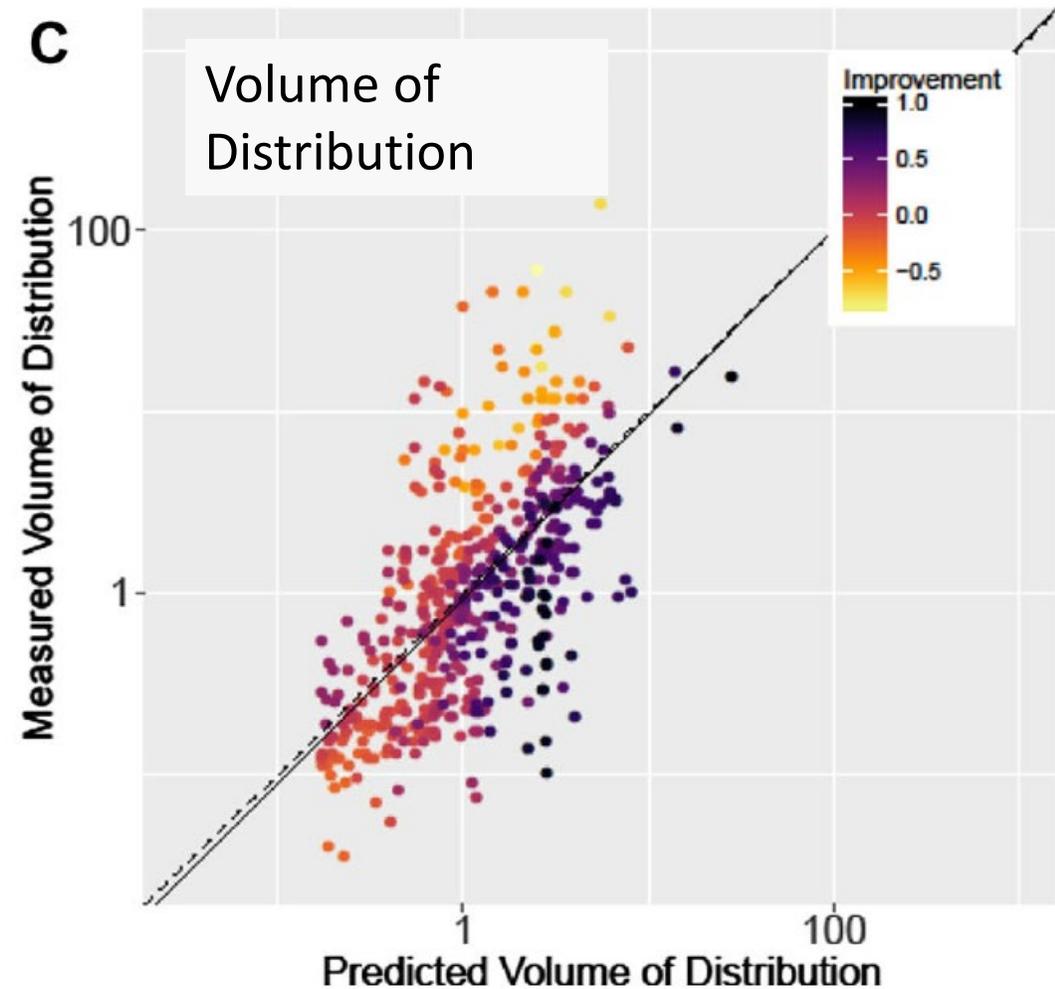
# Predicted Maternal:Fetal Plasma Ratio

- Histogram of predicted maternal-to-fetal concentration ratios across the chemicals for which the HT-PBTK model can be parameterized (omitting volatile and PFAS compounds).



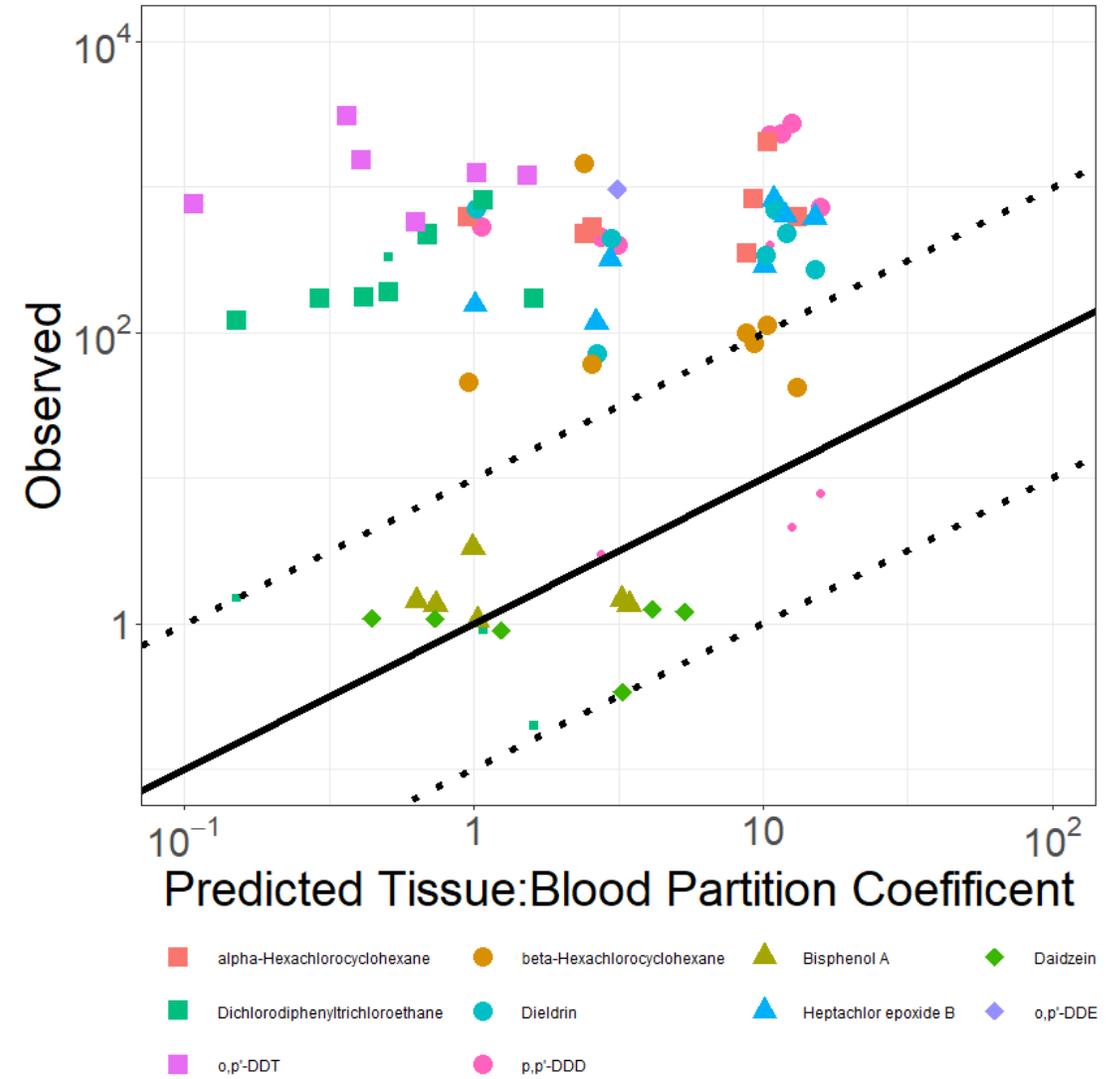
# HTTK Model Calibration and Evaluation

- HTTK attempts to trade precision for broad applicability
- Goal is to make reasonable predictions for many chemicals rather than accurate predictions for a specific chemical
- We can statistically characterize the error in the predictions
- Data from Obach et al. (2008)



# Observed Tissue Partition Coefficients

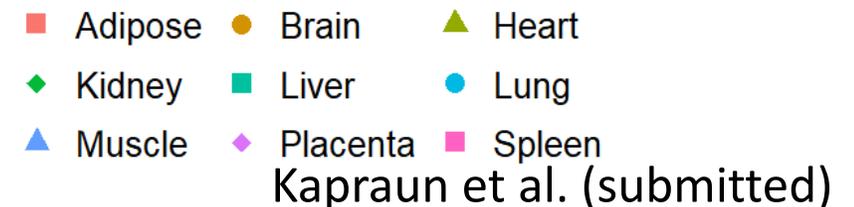
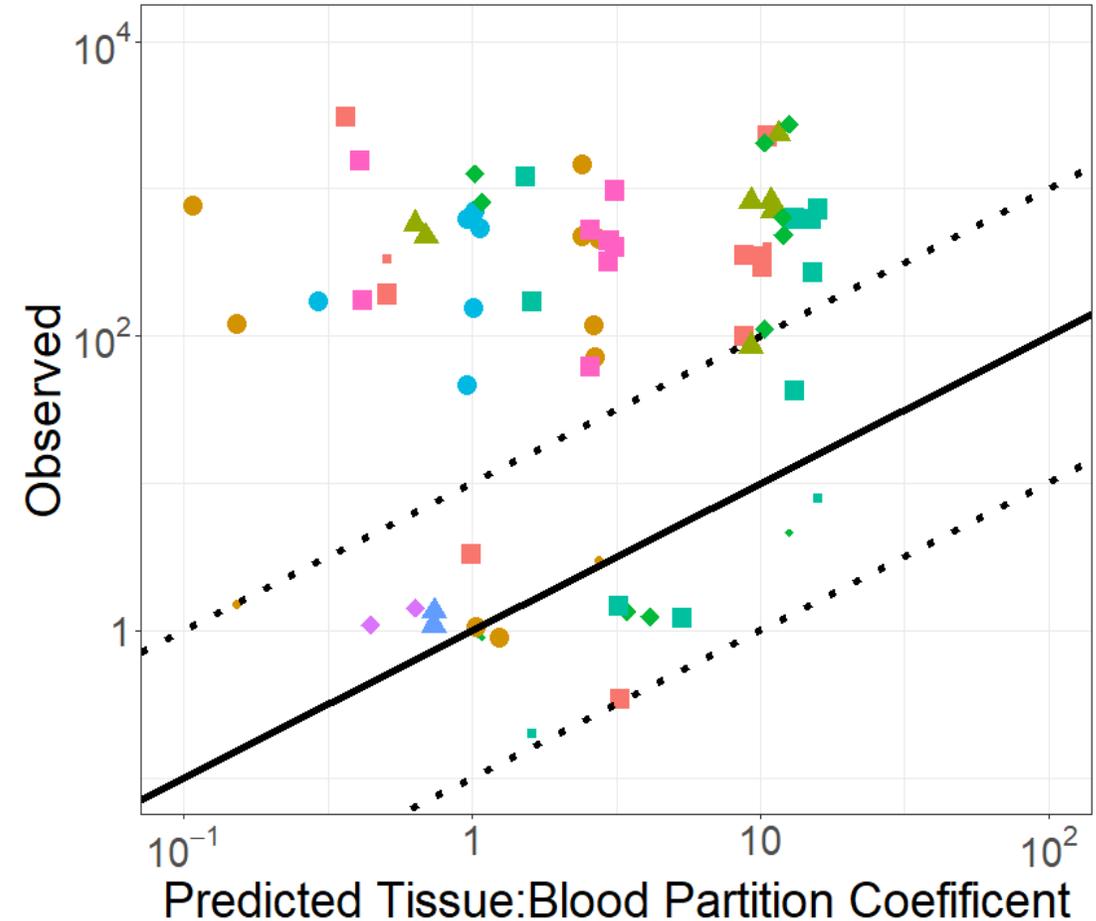
- Fetal tissue-to-blood partition coefficients were determined by [Curley et al. \(1969\)](#) for six pesticides and seven tissues for which we can make predictions with the HT-PBTK model.
- Partition coefficients were measured for tissues, including placenta, *in vitro* by [Csanády et al. \(2002\)](#) for Bisphenol A and Daidzein.
- Small plot points indicate model-predicted, rather than measured, partition coefficients from [Weijs et al. \(2013\)](#) for three of the [Curley et al. \(1969\)](#) chemicals.
- The identity line (solid) indicates a perfect (1:1) prediction while the dotted lines indicate a ten-fold error.



Kapraun et al. (submitted)

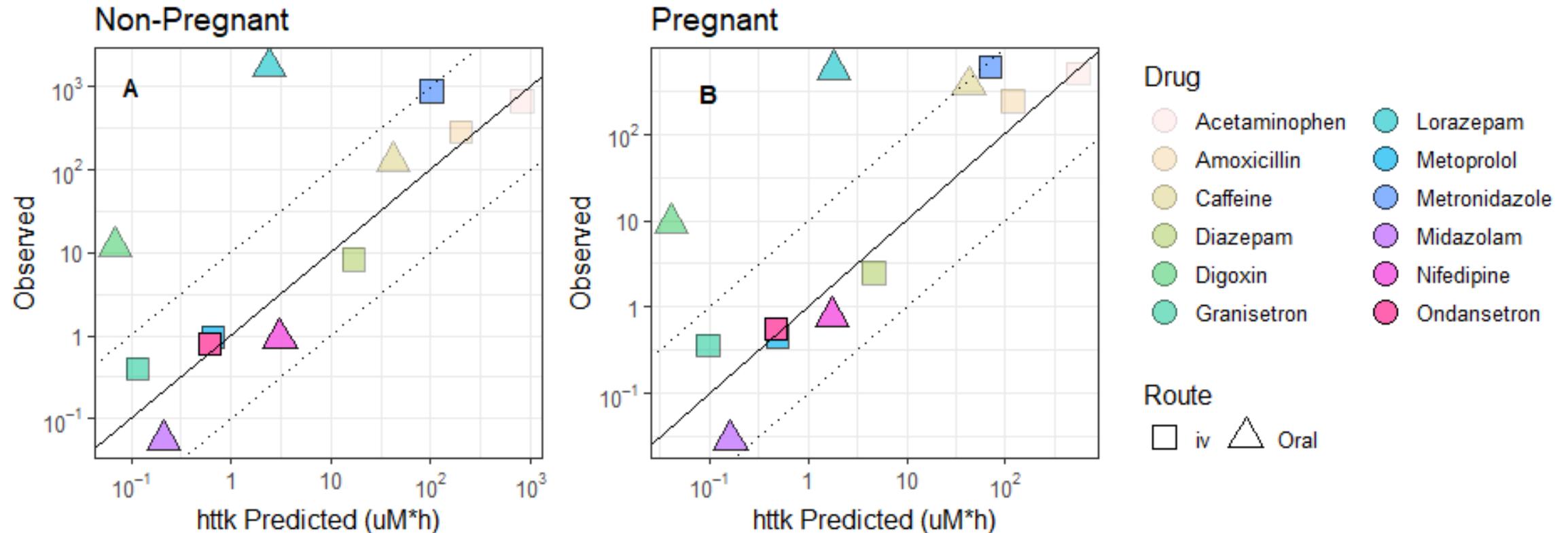
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- The identity line (solid) indicates a perfect (1:1) prediction while the dotted lines indicate a ten-fold error.



# Observed Time Integrated Plasma Concentrations (AUC)

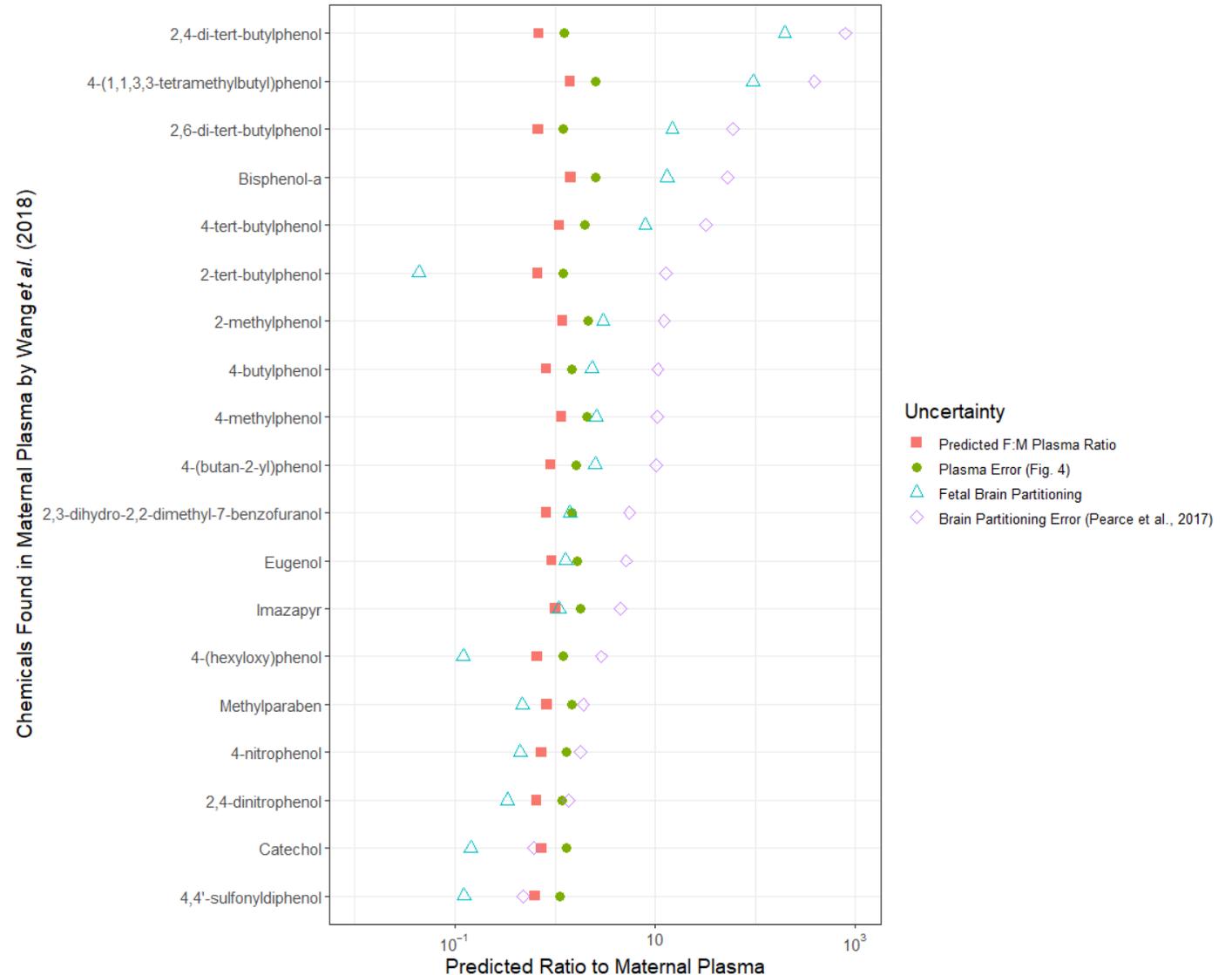
- Comparison of observed and predicted time-integrated plasma concentration (AUC) for the data in for non-pregnant (left) and pregnant (right) mothers across twelve pharmaceuticals (Data from Dallman et al., 2018).



Kapraun et al. (submitted)

# Prioritizing chemicals detected in maternal plasma

- Wang et al. (2018) detected xenobiotic chemicals in the plasma of expectant mothers – here we prioritize those chemicals with respect to potential concentration in the fetal brain
- Ordered from the top are those chemicals with the highest predicted fetal brain concentrations relative to maternal blood
- Estimated error(uncertainty) propagated using upper 95<sup>th</sup> percentiles



# Gestational Model Included in v2.1.0

<https://CRAN.R-project.org/package=httk>

CRAN - Package httk

cran.r-project.org/web/packages/httk/index.html

httk: High-Throughput Toxicokinetics

Generic models and chemical-specific data for simulation and statistical analysis of chemical toxicokinetics ("TK") as described by Pearce et al. (2017) <[doi:10.18637/jss.v079.i04](https://doi.org/10.18637/jss.v079.i04)>. Chemical-specific *in vitro* data have been obtained from relatively high-throughput experiments. Both physiologically-based ("PBTK") and empirical (for example, one compartment) "TK" models can be parameterized with the data provided for thousands of chemicals, multiple exposure routes, and various species. The models consist of systems of ordinary differential equations which are solved using compiled (C-based) code included, which allows for simulating human biological variability (Ring et al., 2017 <[doi:10.1016/j.envint.2017.06.004](https://doi.org/10.1016/j.envint.2017.06.004)>) and calibrated methods are included for predicting tissue:plasma partition coefficients and volume of distribution (Pearce et al., 2017). These functions and data provide a set of tools for *in vitro-in vivo* extrapolation ("IVIVE") of high-throughput screening data (for world exposures via reverse dosimetry (also known as "RTK") (Wetmore et al., 2015 <[doi:10.1093/toxsci/kfv171](https://doi.org/10.1093/toxsci/kfv171)>).

Version: 2.1.0  
 Depends: R (≥ 2.10)  
 Imports: [deSolve](#), [msm](#), [data.table](#), [survey](#), [mvtnorm](#), [truncnorm](#), stats, graphics, utils, [magrittr](#), [purrr](#), methods, [Rdpack](#), [ggplot2](#), [knitr](#), [rmarkdown](#), [R.rsp](#), [GGally](#), [gplots](#), [scales](#), [EnvStats](#), [MASS](#), [RColorBrewer](#), [TeachingDemos](#), [reshape2](#), [viridis](#), [CensRegMod](#), [gmodels](#), [colorspace](#), [cowplot](#), [ggrepel](#), [dplyr](#), [forcats](#), [smatr](#), [gridExtra](#), [testthat](#)  
 Suggests: [ggplot2](#), [knitr](#), [rmarkdown](#), [R.rsp](#), [GGally](#), [gplots](#), [scales](#), [EnvStats](#), [MASS](#), [RColorBrewer](#), [TeachingDemos](#), [reshape2](#), [viridis](#), [CensRegMod](#), [gmodels](#), [colorspace](#), [cowplot](#), [ggrepel](#), [dplyr](#), [forcats](#), [smatr](#), [gridExtra](#), [testthat](#)  
 Published: 2022-03-26  
 Author: John Wambaugh  [aut, cre], Sarah Davidson  [aut], Robert Pearce  [aut], Caroline Ring  [aut], [aut], Matt Linakis  [aut], Dustin Kapraun  [aut], Miyuki Breen  [ctb], Shannon Bell  [ctb], Xi Antonijevec  [ctb], Jimena Davis [ctb], James Sluka  [ctb], Nisha Sipes  [ctb], Barbara Wetmore [ctb]  
 Maintainer: John Wambaugh <wambaugh.john at epa.gov>  
 BugReports: <https://github.com/USEPA/CompTox-ExpoCast-httk>  
 License: [GPL-3](#)  
 Copyright: This package is primarily developed by employees of the U.S. Federal government as part of their official duties.  
 URL: <https://www.epa.gov/chemical-research/rapid-chemical-exposure-and-dose-research>  
 NeedsCompilation: yes  
 Citation: [httk citation info](#)

downloads 1172/month

## R package "httk"

- Open source, transparent, and peer-reviewed tools and data for **high throughput toxicokinetics (httk)**
- Available publicly for free statistical software R
- Allows *in vitro-in vivo* extrapolation (IVIVE) and physiologically-based toxicokinetics (PBTK)
- Human-specific data for 987 chemicals
- Described in Pearce et al. (2017)

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