

# In Vitro to In Vivo Extrapolation Incorporating Toxicokinetics

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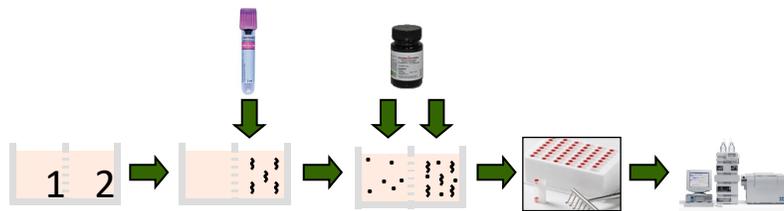
Presentation to EMGS, September 24, 2021

*The views expressed in this presentation are those of the authors and do not necessarily reflect the views or policies of the U.S. EPA or Health Canada. Mention of trade names is not a recommendation or endorsement.*

# High-throughput toxicokinetic (HTTK) approaches enable *in vitro* to *in vivo* extrapolation (IVIVE) of dose for thousands of chemicals

## *in vitro* toxicokinetic data

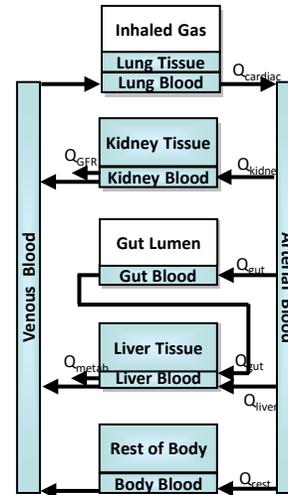
Hepatic clearance from suspended hepatocytes



Plasma protein binding



## Generic toxicokinetic models



## Some high-level assumptions commonly employed to-date:

- (1) bioactive nominal *in vitro* assay concentration  $\sim$  *in vivo* plasma concentration that would correspond to a similar effect;
- (2) external exposures (in mg/kg/day units) that may have resulted in that plasma concentration can be constructed using estimates of species-specific physiology and Phase I and Phase II enzyme-driven hepatic clearance; and,
- (3) Often, we expect that plasma concentration can be approximated by steady-state kinetics (unless we have enough information to use PBTK).

= *httk*

# Many works have applied HTTK to prioritization and assessment case studies over the last decade

Chemical  
Research in  
Toxicology

2011

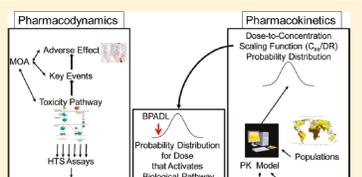
## Estimating Toxicity-Related Biological Pathway Altering Doses for High-Throughput Chemical Risk Assessment

Richard S. Judson,<sup>a,†</sup> Robert J. Kavlock,<sup>†</sup> R. Woodrow Setzer,<sup>†</sup> Elaine A. Cohen Hubal,<sup>†</sup> Matthew T. Martin,<sup>†</sup> Thomas B. Knudsen,<sup>†</sup> Keith A. Houck,<sup>†</sup> Russell S. Thomas,<sup>†</sup> Barbara A. Wetmore,<sup>†</sup> and David J. Dix<sup>†</sup>

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**ABSTRACT:** We describe a framework for estimating the human dose at which a chemical significantly alters a biological pathway *in vivo*, making use of *in vitro* assay data and an *in vitro*-derived pharmacokinetic model, coupled with estimates of population variability and uncertainty. The quantity we calculate, the biological pathway altering dose (BPAD), is analogous to current risk assessment metrics in that it combines dose-response data with analysis of uncertainty and population variability to arrive at conservative exposure limits. The analogy is closest when perturbation of a pathway is a key event in the mode of action (MOA) leading to a specified adverse outcome.



Contents lists available at ScienceDirect



2019

Food and Chemical Toxicology

journal homepage: [www.elsevier.com/locate/foodchemtox](http://www.elsevier.com/locate/foodchemtox)

## Profiling 58 compounds including cosmetic-relevant chemicals using ToxRefDB and ToxCast

Ly L. Pham<sup>a,b</sup>, Lisa Truong<sup>a,b,c</sup>, Gladys Ouedraogo<sup>d</sup>, Sophie Loisel-Joubert<sup>e</sup>, Matthew T. Martin<sup>a,f</sup>, Katie Paul Friedman<sup>a,\*</sup>

Environment International 137 (2020) 105470

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<sup>d</sup>L'Oréal Safety  
<sup>e</sup>L'Oréal Safety  
<sup>f</sup>Currently at G

Contents lists available at ScienceDirect

2020

Environment International

journal homepage: [www.elsevier.com/locate/envint](http://www.elsevier.com/locate/envint)



## High-throughput screening tools facilitate calculation of a combined exposure-bioactivity index for chemicals with endocrine activity

Susanna H. Wegner<sup>a,b,\*</sup>, Caroline L. Pinto<sup>a,b</sup>, Caroline L. Ring<sup>a,c</sup>, John F. Wambaugh<sup>c</sup>

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www.toxsci.oxfordjournals.org

TOXICOLOGICAL SCIENCES, 148(1), 2015, 121–136

doi: 10.1093/toxsci/kfv171  
Advance Access Publication Date: August 6, 2015  
Research Article

2015

## Incorporating High-Throughput Exposure Predictions With Dosimetry-Adjusted *In Vitro* Bioactivity to Inform Chemical Toxicity Testing

Barbara A. Wetmore,<sup>a,\*1</sup> John F. Wambaugh,<sup>†</sup> Brittany Allen,<sup>†</sup> Stephen S. Ferguson,<sup>†,2</sup> Mark A. Sochaski,<sup>†</sup> R. Woodrow Setzer,<sup>†</sup> Keith A. Houck,<sup>†</sup> Cory L. Strobe,<sup>†</sup> Katherine Cantwell,<sup>†</sup> Richard S. Judson,<sup>†</sup> Edward LeCluyse,<sup>†</sup> Harvey J. Clewell,<sup>†</sup> Russell S. Thomas,<sup>a,†,3</sup> and Melvin E. Andersen<sup>†</sup>

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2019

TOXICOLOGICAL SCIENCES, 2019, 1–24

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Research Article

## Utility of *In Vitro* Bioactivity as a Lower Bound Estimate of *In Vivo* Adverse Effect Levels and in Risk-Based Prioritization

Katie Paul Friedman<sup>a,\*1</sup>, Matthew Gagne,<sup>†</sup> Lit-Hsin Loo,<sup>†</sup> Panagiotis Karameris,<sup>†</sup> Patricia Metzger,<sup>†</sup> Tomasz Sobczak,<sup>†</sup> Will A. Fennell,<sup>†</sup> Ann M. Richa,<sup>†</sup> PLOS ONE  
Angrish,<sup>†</sup>  
Bahadori,<sup>†</sup>  
Rasenbei,<sup>†</sup>

2020

RESEARCH ARTICLE

## Using the concordance of *in vitro* and *in vivo* data to evaluate extrapolation assumptions

Gregory S. Honda<sup>a,1,2</sup>, Robert G. Pearce<sup>a,1,2</sup>, Ly L. Pham<sup>a,1,2</sup>, R. W. Setzer<sup>a,1</sup>, Barbara A. Wetmore<sup>a</sup>, Nisha S. Sipes<sup>a,†</sup>, Jon Gilbert<sup>a</sup>, Briana Franz<sup>a,†</sup>, Russell S. Thomas<sup>a</sup>, John F. Wambaugh<sup>†</sup>\*

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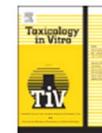
Toxicology in Vitro 47 (2018) 213–227

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2018

Toxicology in Vitro

journal homepage: [www.elsevier.com/locate/toxinvit](http://www.elsevier.com/locate/toxinvit)



Review

## *In vitro* to *in vivo* extrapolation for high throughput prioritization and decision making

Shannon M. Bell<sup>a</sup>, Xiaoqing Chang<sup>a</sup>, John F. Wambaugh<sup>b</sup>, David G. Allen<sup>a</sup>, Mike Bartels<sup>c,1</sup>, Kim L.R. Brouwer<sup>d</sup>, Warren M. Casey<sup>c</sup>, Neepa Choksi<sup>a</sup>, Stephen S. Ferguson<sup>f</sup>, Grazyna Fraczekiewicz<sup>g</sup>, Annie M. Jarabek<sup>b</sup>, Alice Ke<sup>b</sup>, Annie Lumen<sup>i</sup>, Scott G. Lynn<sup>i</sup>, Alicia Paini<sup>k</sup>, Paul S. Price<sup>b</sup>, Caroline Ring<sup>l,2</sup>, Ted W. Simon<sup>m</sup>, Nisha S. Sipes<sup>f</sup>, Catherine S. Sprankle<sup>a</sup>, Judy Strickland<sup>a</sup>, John Troutman<sup>a</sup>, Barbara A. Wetmore<sup>o,3</sup>, Nicole C. Kleinsteuer<sup>e,\*</sup>



Toxicology and Applied Pharmacology 387 (2020) 114774

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Toxicology and Applied Pharmacology

journal homepage: [www.elsevier.com/locate/taap](http://www.elsevier.com/locate/taap)



The role of fit-for-purpose assays within tiered testing approaches: A case study evaluating prioritized estrogen-active compounds in an *in vitro* human uterotrophic assay

Tyler Beames<sup>a,\*1</sup>, Marjory Moreau<sup>a,1</sup>, L. Avery Roberts<sup>b</sup>, Kamel Mansouri<sup>b</sup>, Saad Haider<sup>a</sup>, Marci Smeltz<sup>a</sup>, Chantel I. Nicolas<sup>b</sup>, Daniel Doheny<sup>b</sup>, Martin B. Phillips<sup>a</sup>, Miyoung Yoon<sup>b,2</sup>, Richard A. Becker<sup>a</sup>, Patrick D. McMullen<sup>a</sup>, Melvin E. Andersen<sup>a</sup>, Rebecca A. Clewell<sup>b,3</sup>, Jessica K. Hartman<sup>a,4</sup>

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*A subset of the papers describing the application of a high-throughput toxicokinetic approach – too many to fit*

# A retrospective case study with the Accelerating the Pace of Chemical Risk Assessment (APCRA)

TOXICOLOGICAL SCIENCES, 2019, 1–24

doi: 10.1093/toxsci/kfz201

Advance Access Publication Date: September 18, 2019

Research Article

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## Utility of *In Vitro* Bioactivity as a Lower Bound Estimate of *In Vivo* Adverse Effect Levels and in Risk-Based Prioritization

Katie Paul Friedman ,<sup>\*,1</sup> Matthew Gagne,<sup>†</sup> Lit-Hsin Loo,<sup>‡</sup> Panagiotis Karamertzanis,<sup>§</sup> Tatiana Netzeva,<sup>§</sup> Tomasz Sobanski,<sup>§</sup> Jill A. Franzosa,<sup>¶</sup> Ann M. Richard,<sup>\*</sup> Ryan R. Lougee,<sup>\*,||</sup> Andrea Gissi,<sup>§</sup> Jia-Ying Joey Lee,<sup>‡</sup> Michelle Angrish,<sup>|||</sup> Jean Lou Dorne,<sup>|||</sup> Stiven Foster,<sup>#</sup> Kathleen Raffaele,<sup>#</sup> Tina Bahadori,<sup>||</sup> Maureen R. Gwinn,<sup>\*</sup> Jason Lambert,<sup>\*</sup> Maurice Whelan,<sup>\*\*</sup> Mike Rasenberg,<sup>§</sup> Tara Barton-Maclaren,<sup>†</sup> and Russell S. Thomas <sup>\*</sup>



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*See the forest for the trees*

The big question:

Can *in vitro* bioactivity be used to derive a conservative point-of-departure (POD) for prioritization and screening level risk assessment?

# Case study workflow

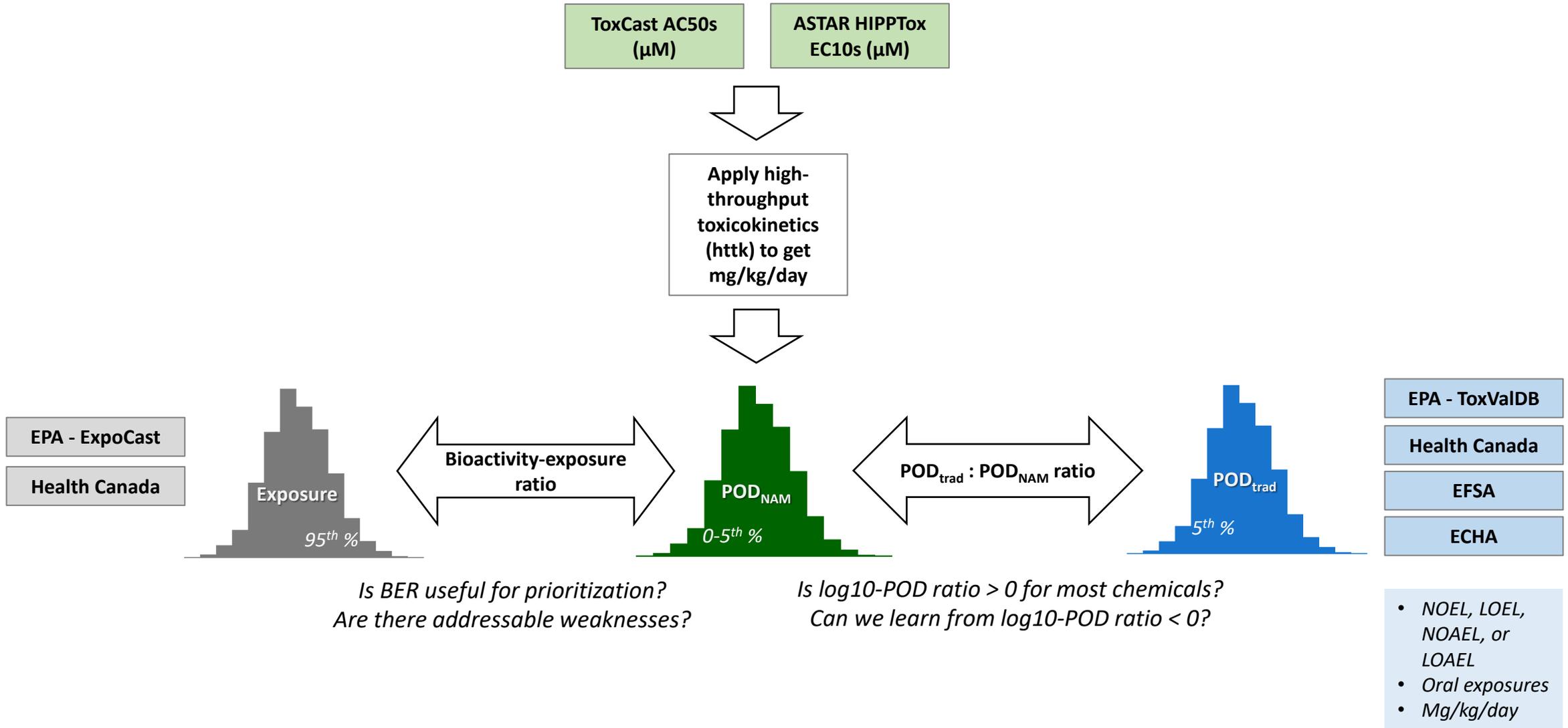


Figure 1, Paul Friedman et al. 2019<sup>6</sup>

$POD_{NAM} < POD_{traditional}$   
(most of the time)

400/448 chemicals =  
89% of the time this  
naïve approach appears  
conservative

48/448 chemicals =  
11% where  $POD_{NAM} > POD_{traditional}$

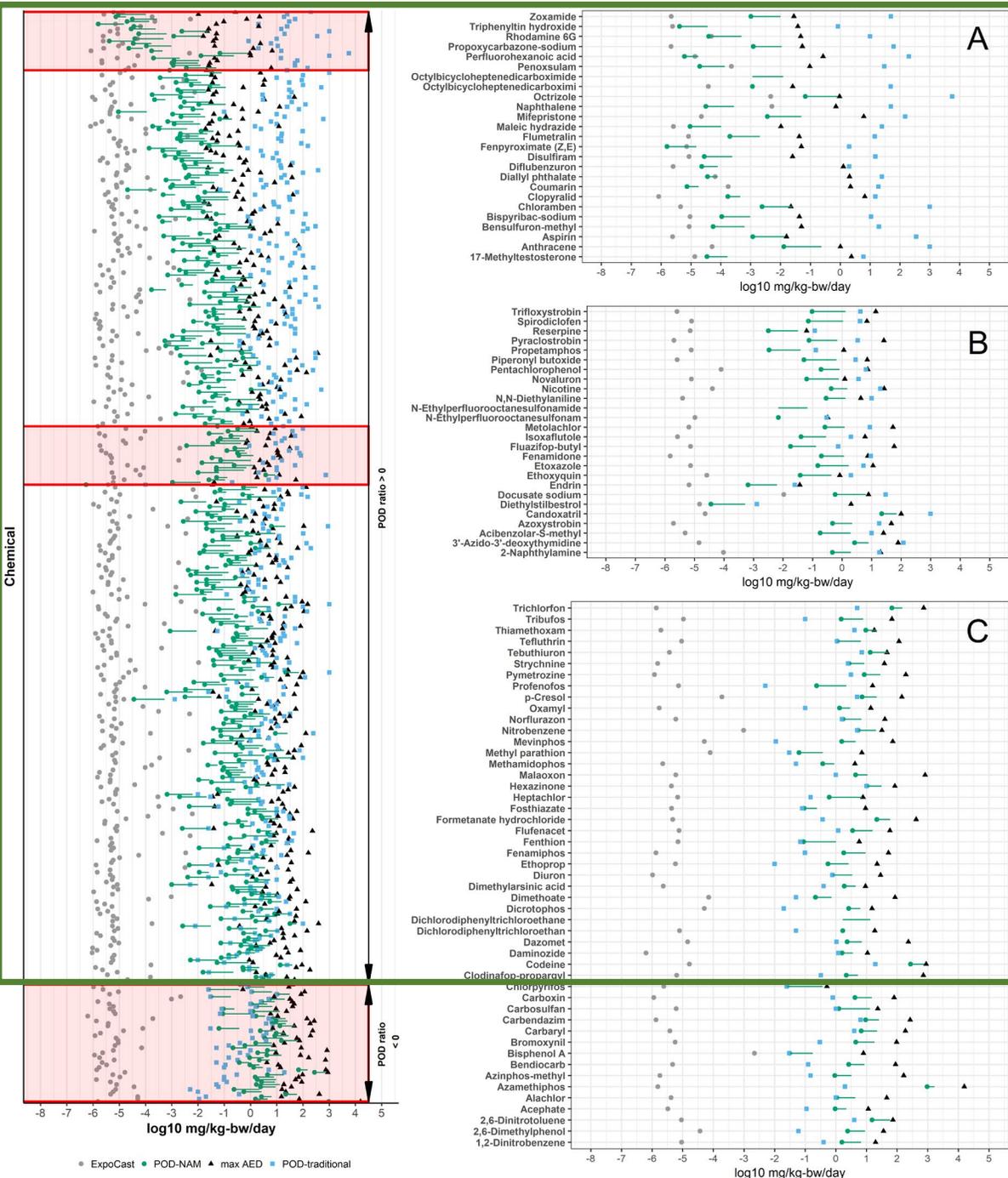
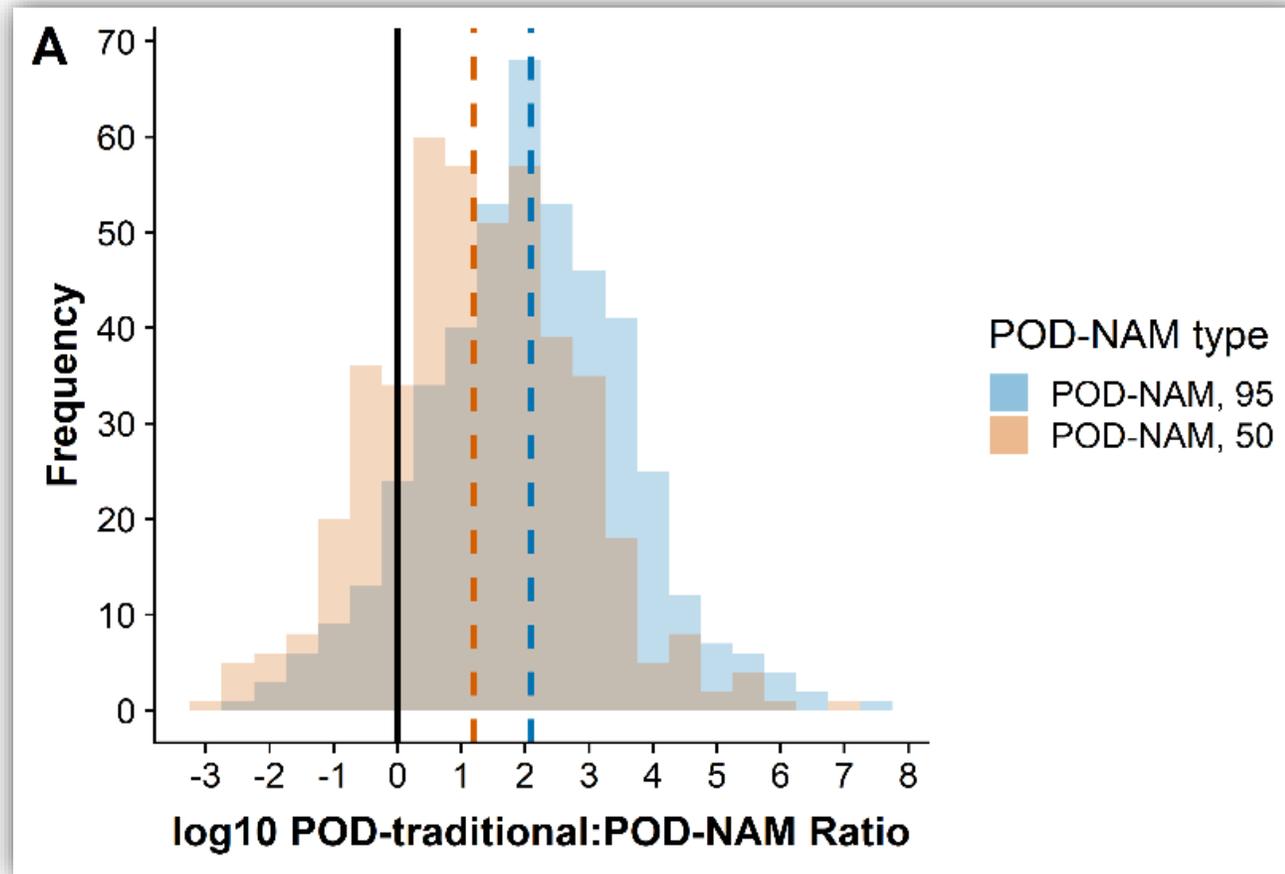


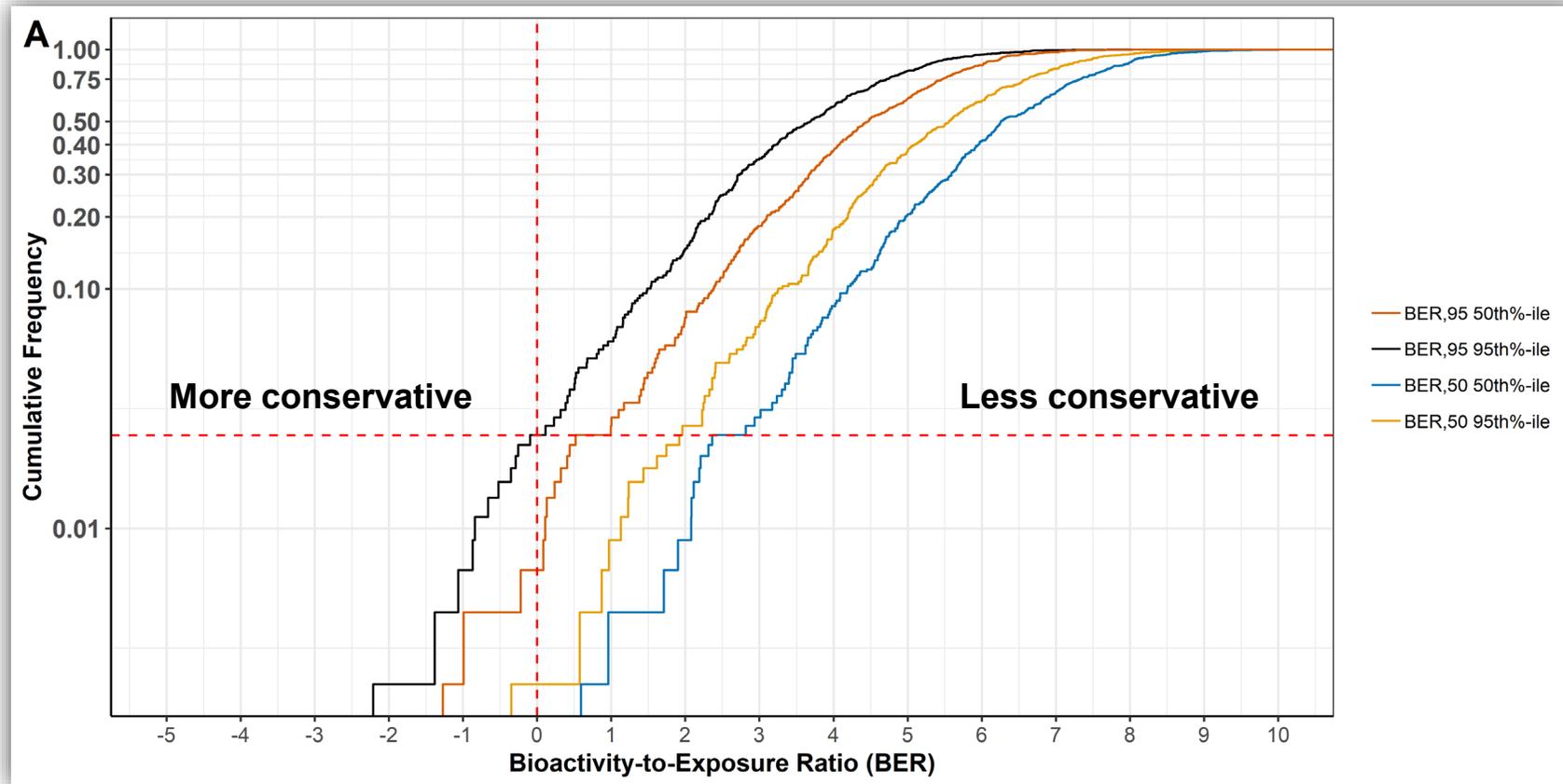
Figure 3, Paul Friedman et al. 2019

The log10-POD ratio distribution shows  $POD_{NAM}$  is generally conservative *and adjustable*



*$POD_{NAM,95}$  includes interindividual variability in the in vitro to in vivo extrapolation and is more often a conservative estimate of  $POD_{traditional}$ .*

The bioactivity:exposure ratio (BER) provides a way of prioritizing substances for further review



*BER<sub>95</sub>, 95<sup>th</sup> percentile did not prioritize an unreasonable number of substances.*

*The BER selected reflects the level of conservatism and uncertainty considered within a screening assessment.*

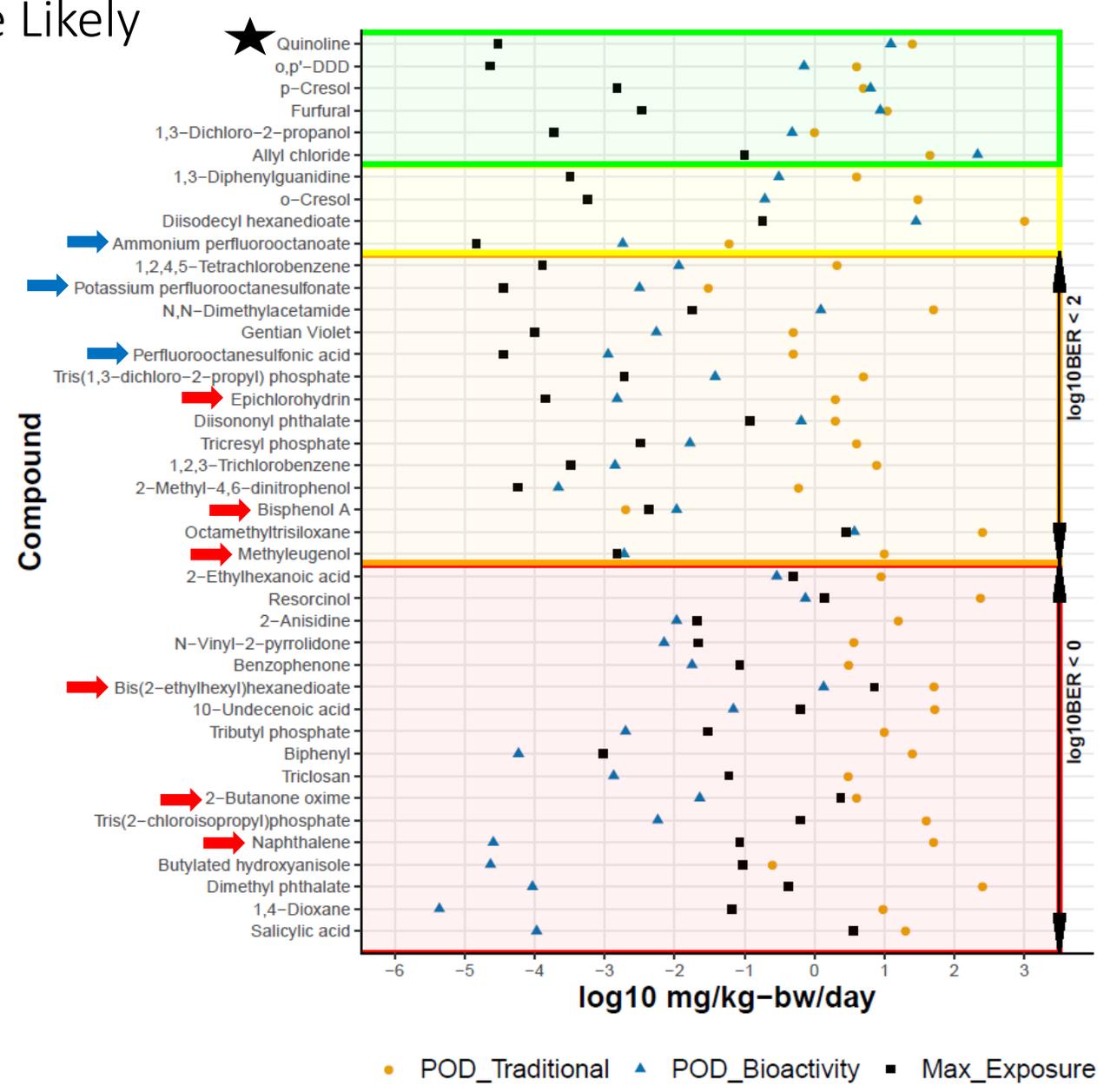
# Case study learnings and limitations

- An approach to using *in vitro* bioactivity data as a POD appears to be a conservative estimate ~ 90% of the time for 448 chemicals.
  - $POD_{NAM}$  estimates appear conservative with a margin of ~100-fold.
  - $POD_{NAM}$  may provide a refinement of thresholds of toxicological concern.
  - When combined with high-throughput exposure estimates, this approach provides a reasonable basis for risk-based prioritization and screening level risk assessments.
- 
- Specific types of chemicals may be currently outside the domain of applicability due to assay limitations, e.g., organophosphate insecticides: how do we identify these in the future?
  - This is the largest retrospective look at this to-date; but what if new chemicals perform differently?
  - Additional research to include expanded and improved high-throughput toxicokinetics and *in vitro* disposition kinetics may help improve  $POD_{NAM}$  estimates.

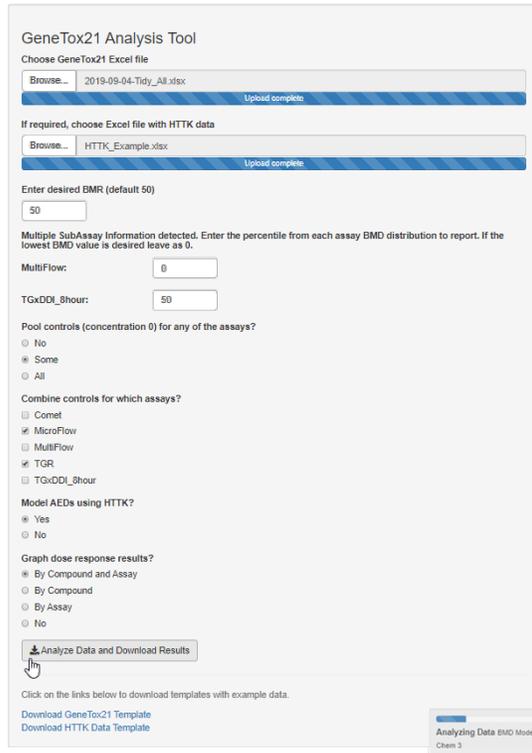


# Chemicals Concluded Toxic Under CEPA More Likely to have Low BERs

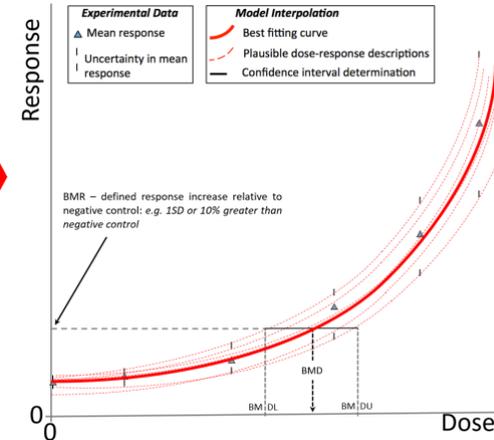
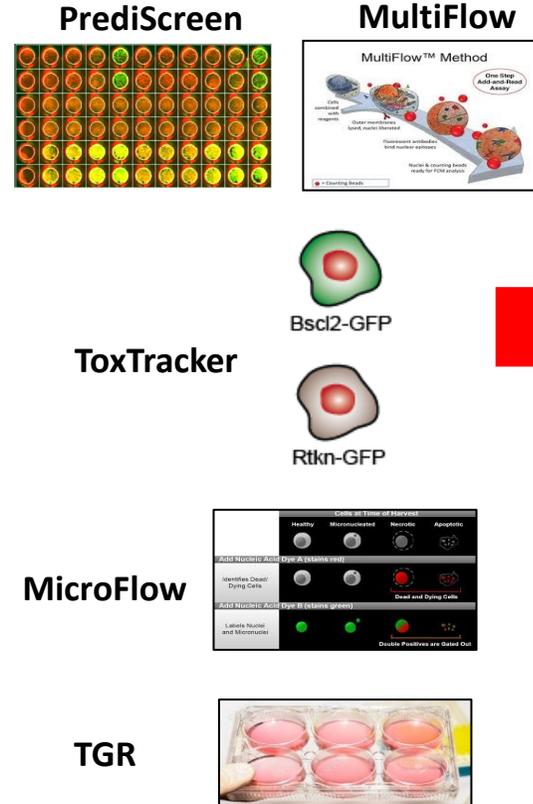
- Health Canada conducted follow-up study to support development of guidance Science Approach Document
- Results show that  $POD_{Bioactivity}$  lower than  $POD_{Traditional}$  for 38 out of 41 chemicals
- All **non-genotoxic** compounds considered toxic to human health (red arrows) or ecotoxic (blue arrows) had a  $BER < \sim 100$
- One toxic chemical (**Quinoline**), considered as a potential genotoxin, was identified as low priority using this approach (star)
- There are only five assays in ToxCast that measure DNA damage or stalled replication and these have low sensitivity
- Thus, a parallel approach that builds on these experiences but uses genotoxicity assays is needed



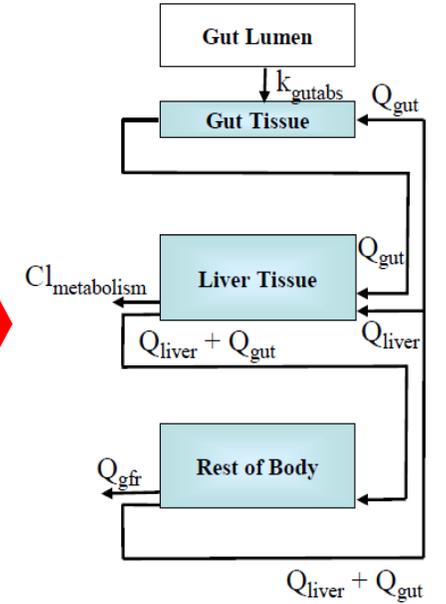
# Complementary Approach that Includes Genetic Toxicology Data is Needed



25  
Reference  
Chemicals



Benchmark  
Concentration  
Modeling



*in vitro* to *in vivo*  
Extrapolation (IVIVE)

[https://mbeal.shinyapps.io/genetox21\\_app/](https://mbeal.shinyapps.io/genetox21_app/)

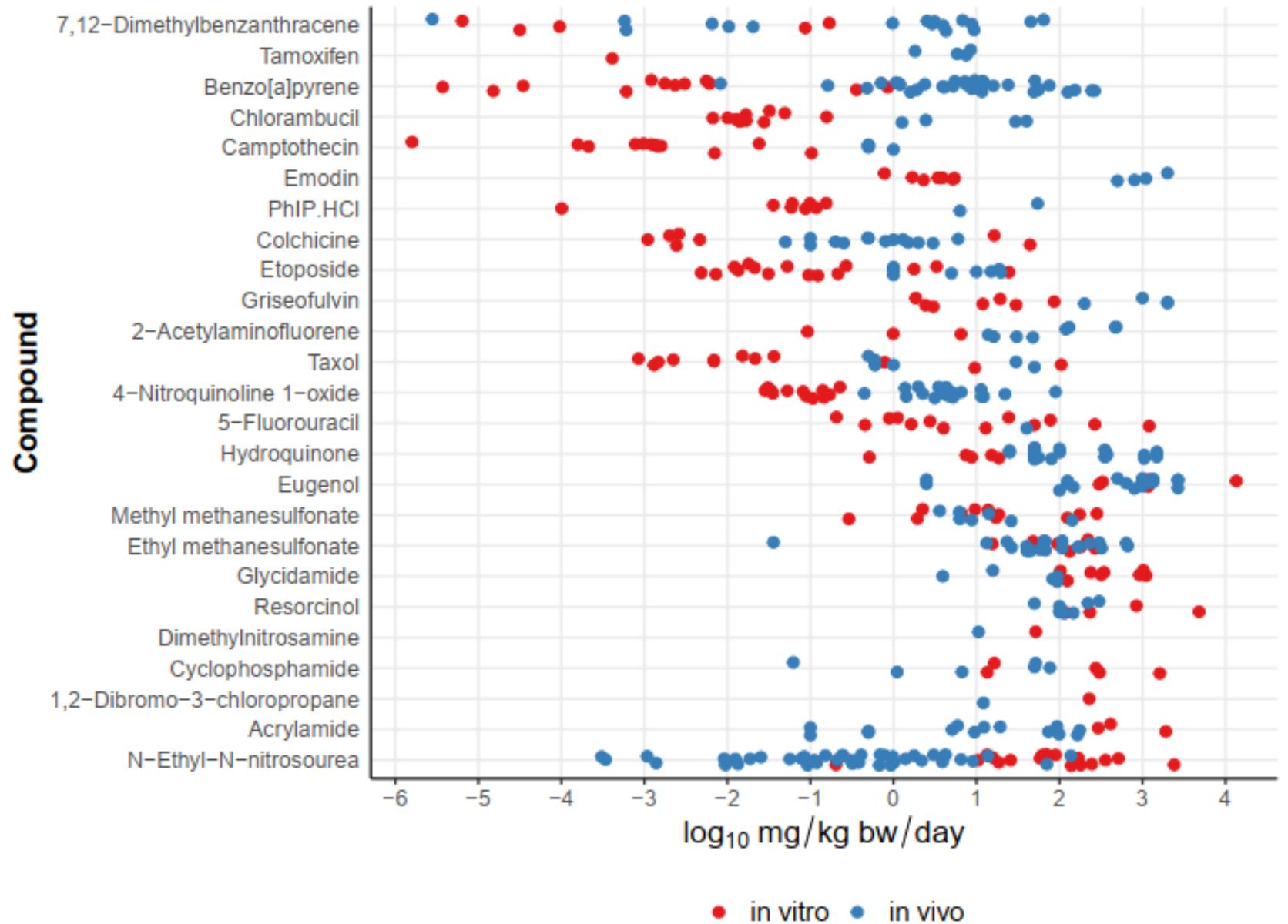
**Genotoxic Administered Equivalent Dose (G-AED; mg/kg bw/day)**



Health and Environmental  
Sciences Institute

**Genetic Toxicology  
Technical Committee**

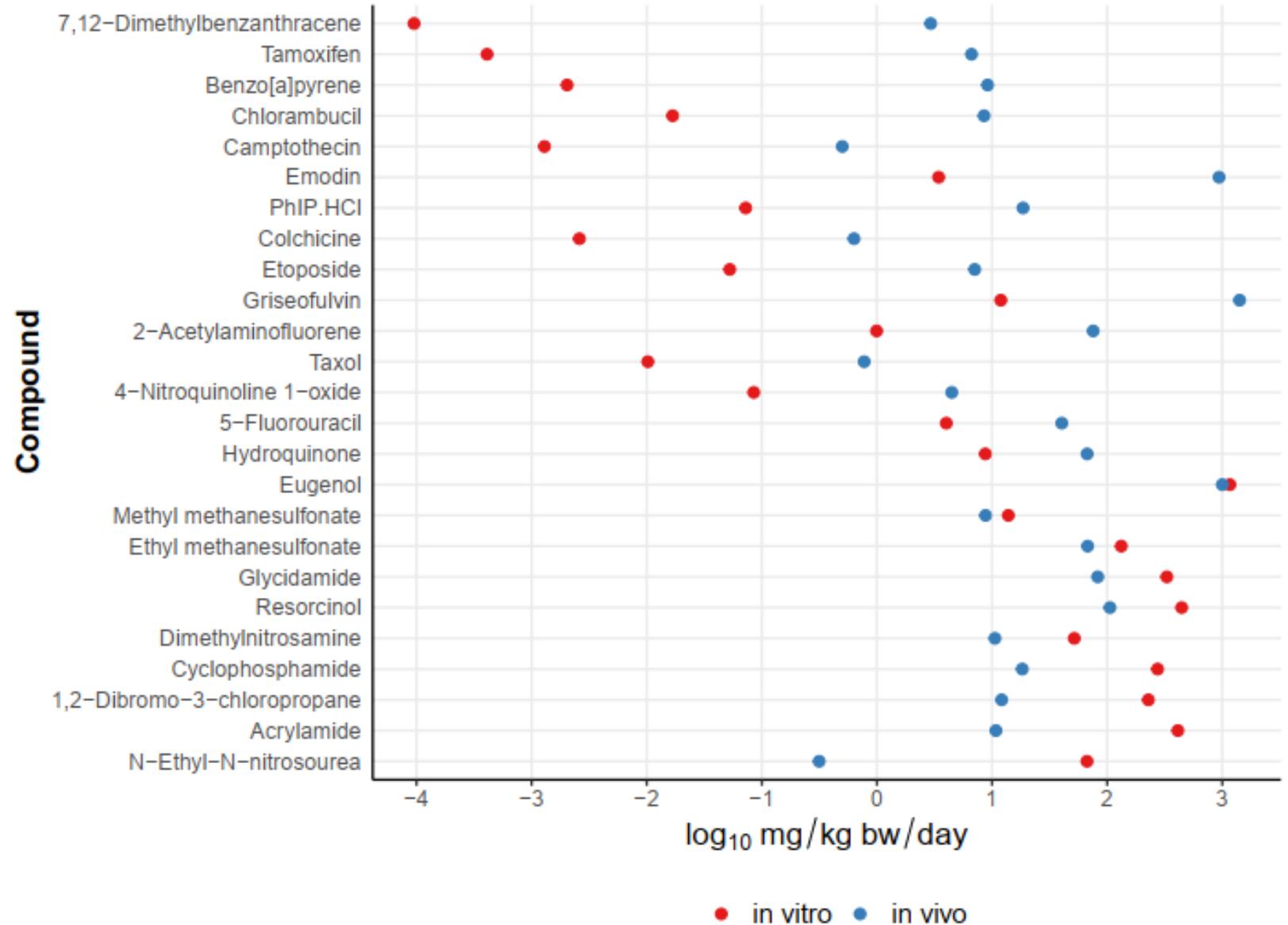
# IVIVE Application to Genetox Data Provides Protective PODs



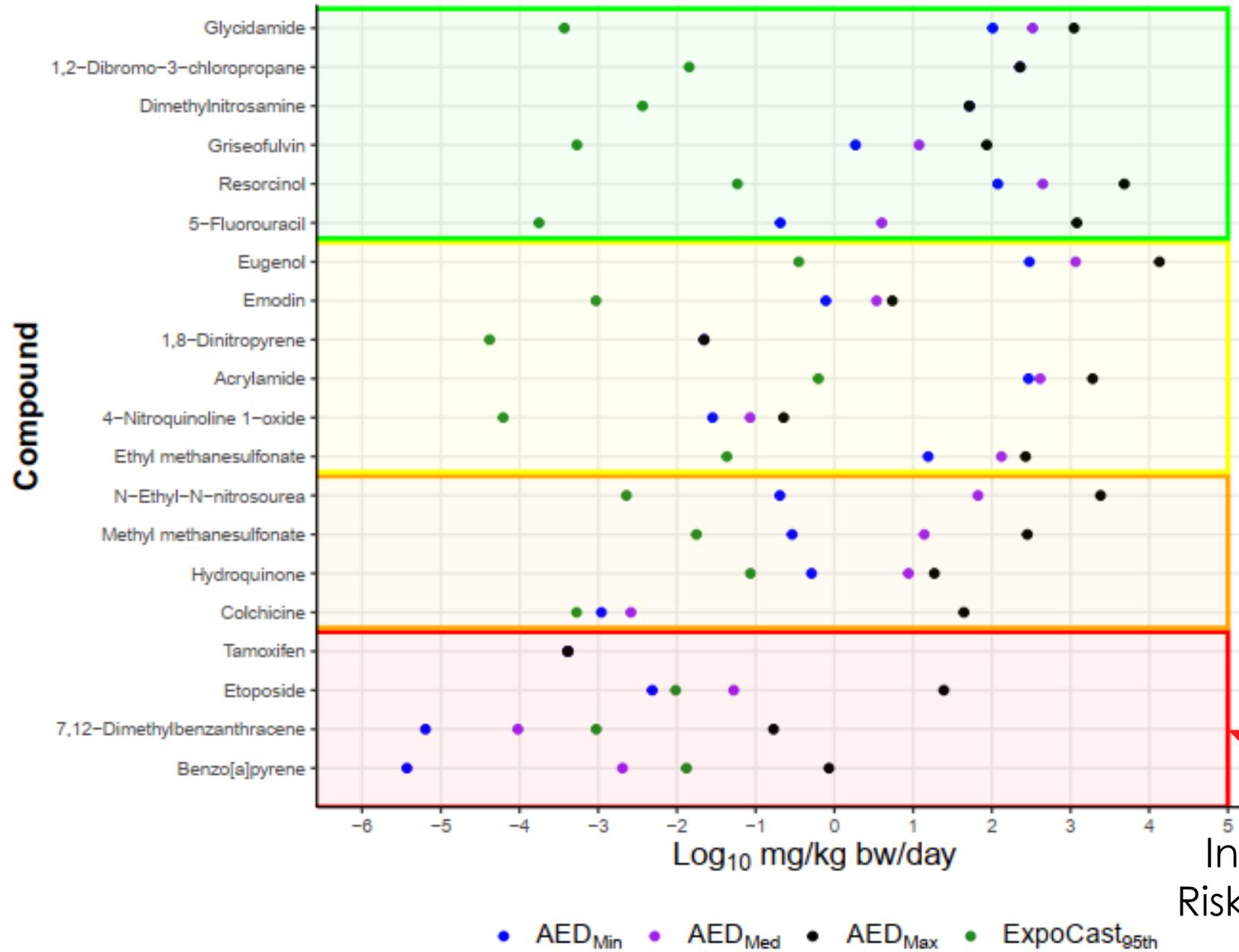
(1) Median AED Lower than Median *in vivo* POD for Most Chemicals

(2) AEDs that are not protective tend to be within one order of magnitude of *in vivo* POD

(3) ENU positive control had an AED that was much higher than POD



Bioactivity  
Exposure  
Ratios Help  
to Identify  
Chemicals  
with the  
Highest  
Potential for  
Concern



Increased  
Risk Potential

# Conclusions and Future Directions

- **Reverse dosimetry is a powerful tool for deriving NAM-based PODs for different chemical screening and assessment applications**
- **IVIVE supports *in vitro* testing strategy for deriving conservative PODs**
  - Protective trend first demonstrated with bioactivity data from ToxCast
  - Trend consistent with genotoxicity NAM endpoints
  - Opportunity to explore other models to enhance the approach for chemicals where the PODs were not conservative
    - Decision trees that include thresholds of toxicological concern or other *in silico* alerts
    - Higher tier PBTK models
    - Mass balance modeling to account for *in vitro* disposition
    - Refinement of assumptions on a chemical basis in IVIVE, e.g. bioavailability, renal transport, restrictive clearance
- **IVIVE/Genetox approach could support chemical safety evaluation without the use of animals**
  - Rapid screening and priority setting
  - Guidance documents
- **Need to build confidence using a broad chemical space**
  - Genetic toxicology case study limited to well-established genotoxicants
  - Prospective case studies needed to evaluate emerging chemicals of concern
  - Ongoing work to compare  $POD_{NAM}$  to existing PODs as well as to values obtained through other PBTK approaches will provide important benchmarks on HTTK approaches to increase the acceptance of  $POD_{NAM}$  and BERs.

# Acknowledgements



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**APCRA**  
ACCELERATING THE PACE OF  
CHEMICAL RISK ASSESSMENT

...too many to list



Stephen Dertinger  
Jeff Bemis  
Steve Bryce



Giel Hendriks  
Inger Brandsma



Jon Arnot  
Alessandro Sangion  
James Armitage



Marc Audebert  
Laure Khoury



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Hannah Battaion  
Lorrie Boisvert

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