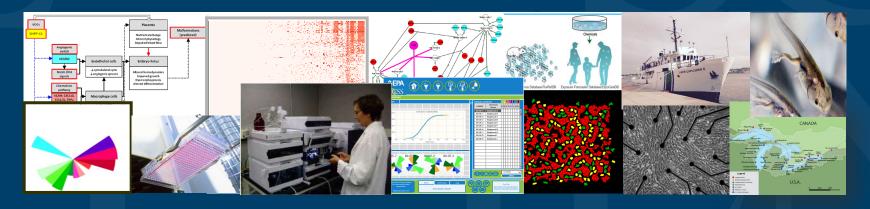
### NAMs Paradox When an Unstoppable Force Meets an Immovable Object



**Alliance for Risk Assessment Workshop XIII** 

February 15, 2022

# Rusty Thomas Director Center for Computational Toxicology and Exposure

The views expressed in this presentation are those of the presenter and do not necessarily reflect the views or policies of the U.S. EPA



### The Original Paradox...

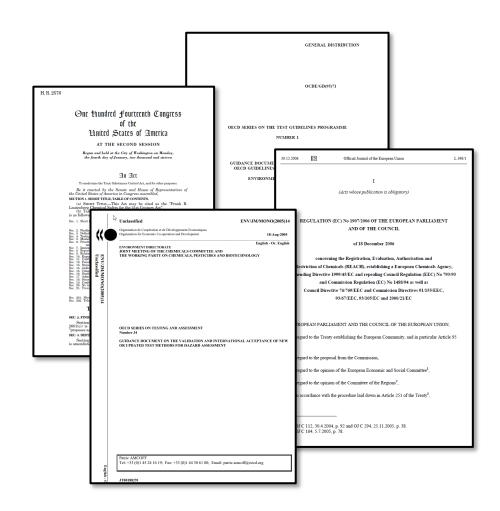


Teumessian fox and the hunting dog Laelaps



### The NAM Paradox...





The unstoppable NAM force and the unmovable regulatory systems and processes



# A 'Zeus-like' Seven Step Plan to Address This Paradox





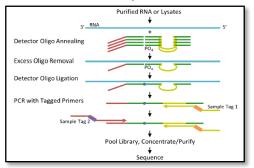
- Continue to innovate with NAMs while systematically address the limitations (a couple examples...)
- 2. Accept that there is likely not a primary mechanism/mode of action for most environmental/industrial chemicals
- 3. Work through how to assemble NAMs in a coherent, practical, fit for purpose testing framework
- 4. Understand how to benchmark new approaches
- 5. Grapple with the issue of protection vs. prediction in our current and future approaches
- Evaluate regulatory flexibilities and develop a fit for purpose validation/confidence framework to evaluating new approaches
- Quantify public health and economic trade-offs of uncertainty, cost, and time in toxicity testing methods



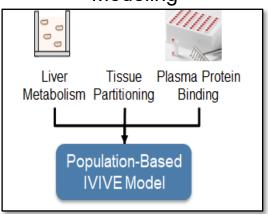
## **Step 1: Continue to Innovate and Address**

### **Limitations in NAMs**

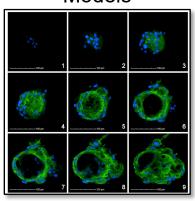
## Whole Genome Transcriptomics



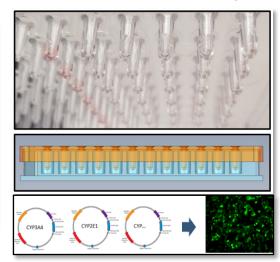
Toxicokinetic
Measurements and
Modeling



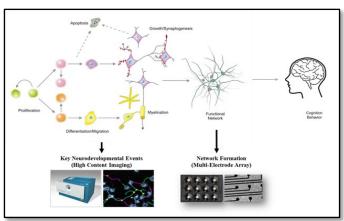
Organotypic Culture Models



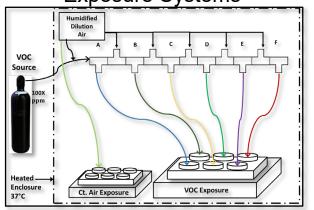
Metabolic Retrofitting



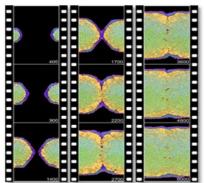
Integrated Approach to Testing and Assessment for DNT



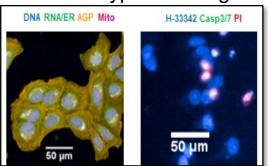
Volatile/Aerosol *In Vitro* Exposure Systems



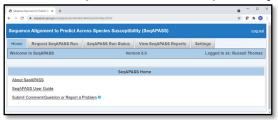
Virtual Tissue Models



Multi-Parameter Cellular Phenotypic Profiling

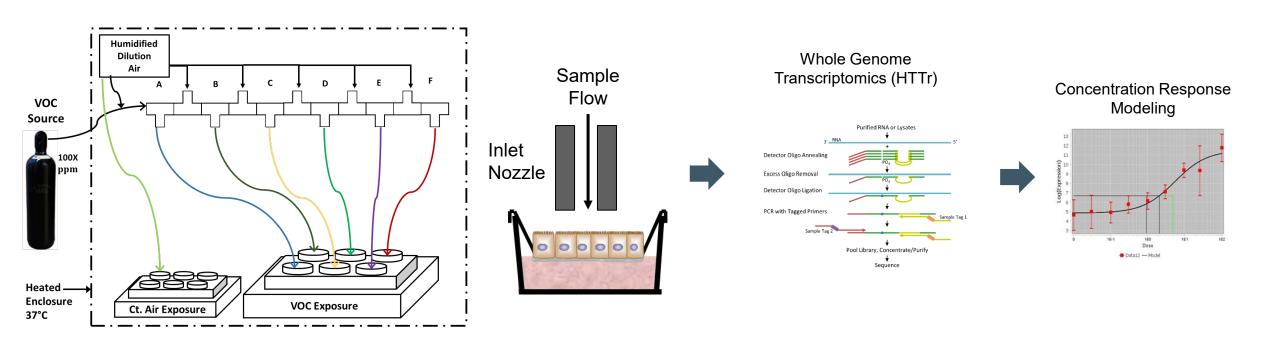


#### Sequence Alignment to Predict Across Species Susceptibility





# Developing *In Vitro* Exposure Systems for Volatile Chemicals



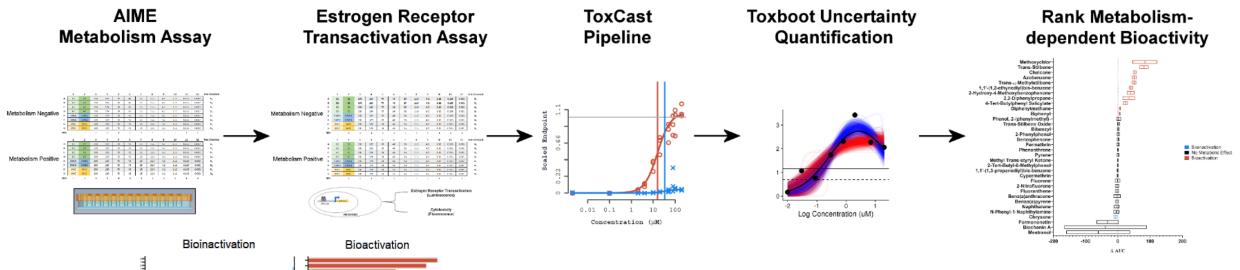
A.Speen (CPHEA), M. Higuchi
(CPHEA), and J. Harrill,
Unpublished

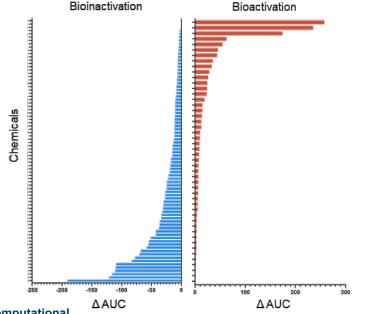
	ACGIH TLV-TWA (ppm)	BEAS-2B HTTr POD (ppm)	HBEC HTTr POD (ppm)
Acrolein	0.1	0.58	
Formaldehyde	0.3	NA	
1,3-Butadiene	10	13.98	
Acetaldehyde	25	NA	
1-Bromopropane	0.1 *	2.25	NA
Carbon Tetrachloride	10	9.56	NA
Trichloroethylene	50	44.8	28.1
Dichloromethane	100	142.13	266.7

<sup>\*</sup> The ACGIH TLV TWA for 1-bromopropane was updated to 0.1 ppm in 2012. Prior to that the TLV-TWA for 1-bromopropane was 10 ppm.



## Retrofitting NAMs for Metabolic Competence



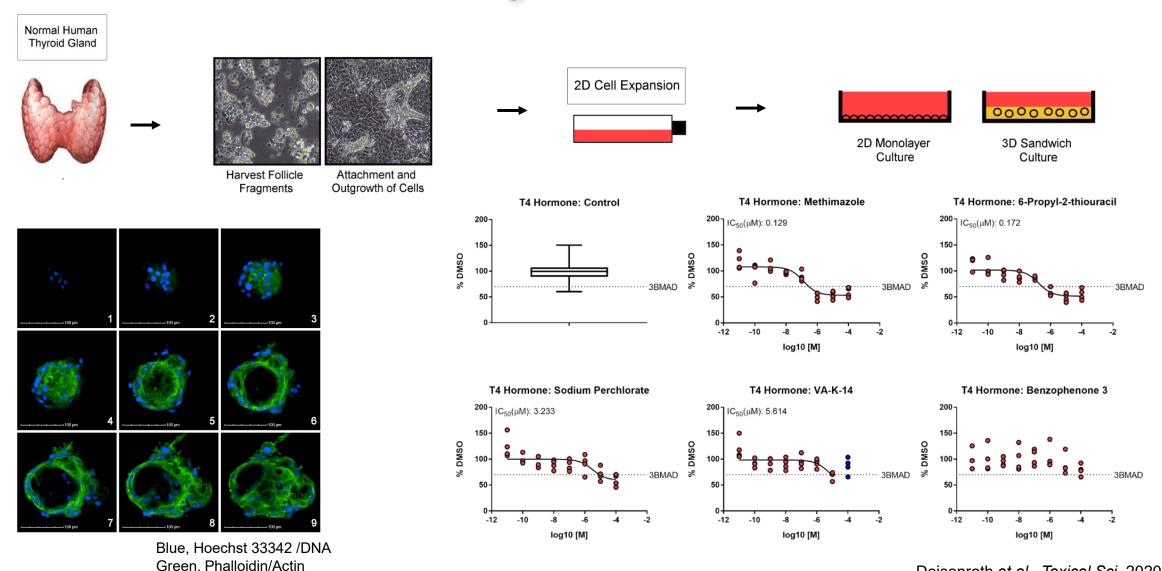


#### **Preliminary Analysis of 768 ToxCast Chemical Screen**

- Application of Deisenroth et al., Toxicol Sci., 2020
- 11% of chemicals exhibit metabolism-dependent changes in ER bioactivity. Most are estrogenic ± metabolism.
- False positive and false negative chemicals represent 3.6% of total chemicals screened.
- Profiles of predicted routes of biotransformation and potential metabolites.

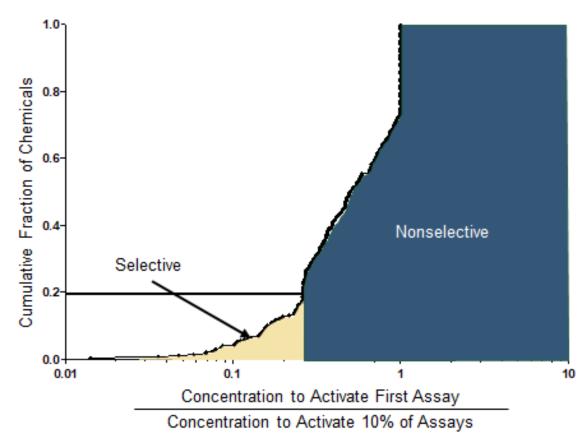


# Developing Complex Organotypic Culture Models to Evaluate Tissue/Organ Effects





# Step 2: Accept that Most Chemicals Non-Selectively Interact with Biological Systems



Implies that bioactivity (*in vitro* or *in vivo*) can be a good surrogate for potential adverse effects in chemical assessments.

Thomas et al., Tox Sci., 2013



# Step 3: Assemble NAMs into a Practical Testing Framework



TOXICOLOGICAL SCIENCES, 169(2), 2019, 317-332

doi: 10.1093/toxasd/ldb058 Advance Access Publication Date: March 5, 2019 Forture

FORUM

### The Next Generation Blueprint of Computational Toxicology at the U.S. Environmental Protection Agency

Russell S. Thomas,\*1 Tina Bahadori,† Timothy J. Buckley,‡ John Cowden,\* Chad Deisenroth,\* Kathie L. Dionisio,‡ Jeffrey B. Frithsen,§ Christopher M. Grulke,\* Maureen R. Gwinn,\* Joshua A. Harrill,\* Mark Higuchi,† Keith A. Houck,\* Michael F. Hughes,† E. Sidney Hunter, III,† Kristin K. Isaacs,‡ Richard S. Judson,\* Thomas B. Knudsen,\* Jason C. Lambert, Monica Linnenbrink,\* Todd M. Martin, Seth R. Newton,† Stephanie Padilla,† Grace Patlewicz,\* Katie Paul-Friedman,\* Katherine A. Phillips,‡ Ann M. Richard,\* Reeder Sams,\* Timothy J. Shafer,† R. Woodrow Setzer,\* Imran Shah,\* Jane E. Simmons,† Steven O. Simmons,\* Amar Singh,\* Jon R. Sobus,† Mark Stynar,† Adam Swank,† Rogelio Tornero-Valez,† Elin M. Ulrich,† Daniel L. Villeneuve, John F. Wambaugh,\* Barbara A. Wetmore,† and Antony J. Williams\*

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5. mail: thorsam-round libous page.

Disclaimer: The U.S. Environmental Protection Agency has provided administrative review and has approved this article for publication. The views expressed in this article are those of the authors and do not necessarily softed the views of the U.S. Environmental Protection Agency.

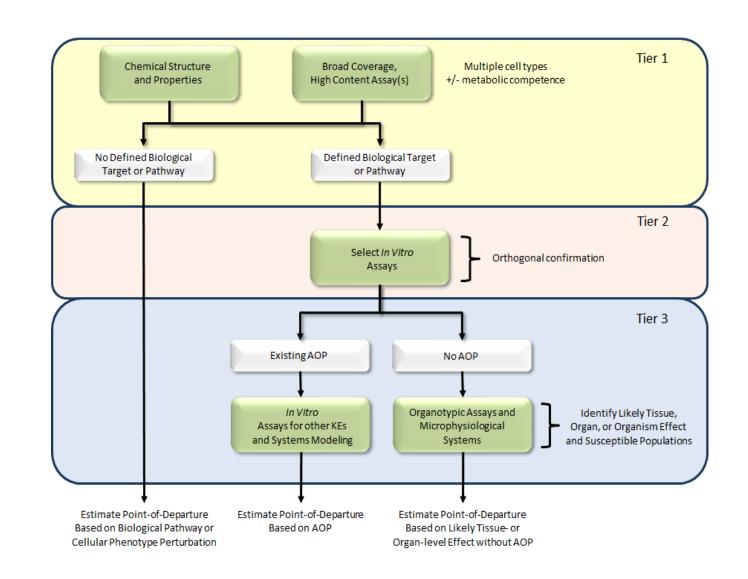
#### ABSTRACT

The U.S. Environmental Protection Agency (IPA) is faced with the challenge of efficiently and credibly evaluating chemical safety often with limited or no available toxicity data. The expanding number of chemicals found in commerce and the environment, coupled with this eard resource requirements for traditional toxicity testing and exposure characterization,

Published by Oxford University Press on behalf of the Society of Toxicology 2019.

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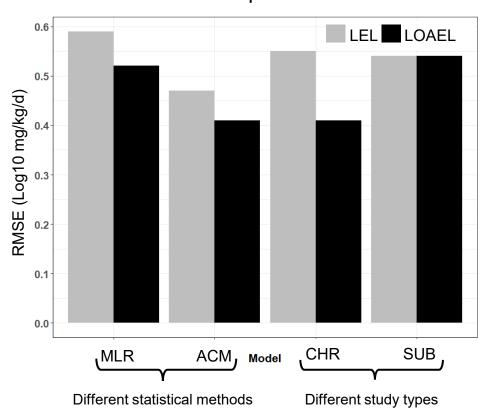
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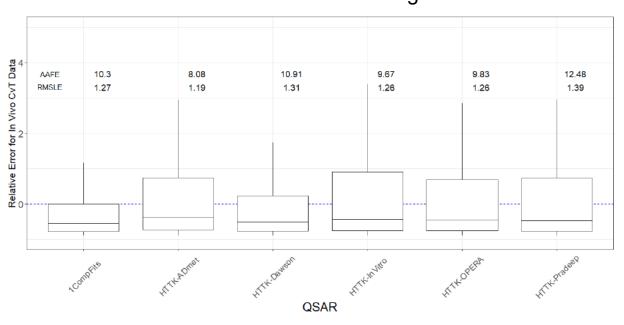
# Step 4: Understand How to Benchmark Approaches

#### Evaluating LEL/LOAEL Variability in Traditional Toxicity Studies to Set Expectations for NAMs



Using an RMSE=0.59, the 95% Prediction Interval of an LEL/LOAEL is +/- 10-fold (e.g., 1 mg/kg/day, 0.07 – 14)

## Comparing *In Silico, In Vitro,* and *In Vivo* Data for Toxicokinetic Modeling



Wambaugh et al., QSAR2021 meeting poster

Pham et al., Comp Toxicol., 2020



# **Step 5: Grapple With the Issue of Protection vs Prediction with Current Models and NAMs**

#### Limited Qualitative Concordance of Rodent and Human Toxicological Responses

Concordance of the Toxicity of Pharmaceuticals in Humans and in Animals Harry Olson, <sup>1</sup> Craham Betton, <sup>2</sup> Denise Robinson, <sup>2</sup> Karluss Thomas, <sup>3</sup> Alastair Monro, <sup>1</sup> Gerald Kolaja, <sup>4</sup> Patrick Lilly, <sup>6</sup> James Sanders, <sup>6</sup> Genn Sipes, <sup>9</sup> William Bracken, <sup>8</sup> Michael Dorato, <sup>6</sup> Koen Van Deun, <sup>8</sup> Peter Smith, <sup>11</sup> Bruce Berger, <sup>12</sup> and Allen Heller <sup>11</sup> AstraZeneca Pharmaceuticals, Macclesfield, England; 

\*ILSI-HESI, Washington, DC, 20036; 

\*Pharm... Updata, Kalamazoo, Michigari, Boeiringer Ingelheim Pharmacouticais, Ridgefield, Connecticut, Parker-Pouler Roer, Collegeville unsylvania; 'University of Arizona, Tueson, Arizona, 'Abotat Laboratories, Abbota Park, Illinois, 'Eli Lilly and Co., Greenfield, Indian, "Monsanto-Sante Laboratories, Sokois, Illinois,' Santof-Synthetion, Co., Malvern, "Monsanto-Sante Laboratories, Sokois, Illinois,' Santof-Synthetion, Co., Malvern, Co., Malvern, "Co., Malvern, Pennsylvania; and "Bayer Corporation, West Haven, Connecticu-A vitally important theme in toxicology is the search onal pharmaceutical company survey and the outome of an International Life Sciences Institute (ILSI) for and the assessment of in vitro and in vivo models orkshop (April 1999), which served to better underthat are predictive for adverse effects in humans ex tand concordance of the toxicity of pharmaceuticals posed to chemicals. The conduct of toxicology studies bserved in humans with that observed in experimen-al animals. The Workshop included representatives laboratory animals is driven by experience, historica om academia, the multinational pharmaceutical inlustry, and international regulatory scientists. The nain aim of this project was to examine the strengths restrictions on the use, or method of use, of the chem d weaknesses of animal studies to predict human assumption that the current choice of animal model oxicity (HT). The database was developed from a sur-ey which covered only those compounds where HTs where identified during clinical development of new human hazard. The reliability of this assumption ha parmaceuticals, determining whether animal toxic-

...data compiled from 150 compounds with 221 human toxicity events reported. The results showed the true positive human toxicity concordance rate of 71% for rodent and non-rodent species, with non-rodents alone being predictive for 63% of human toxicity and rodents alone for 43%.

# Current Risk Assessment Practices Geared Towards Protection Not Prediction

December 2002 Final Report A REVIEW OF THE REFERENCE DOSE AND REFERENCE CONCENTRATION PROCESSES Prepared for the Risk Assessment Forum U.S. Environmental Protection Agency Washington DC Reference Dose/Reference Concentration (RfD/RfC) Technical Pane Bob Benson (OPRA/Region 8) Jennifer Orme-Zavaleta (NHEERL/ORD) Gary Foureman (NCEA/ORD) Lee Hofmann (PARMS/OSWER) Deborah Rice (NCEA/ORD) Carole Kimmel (NCEA/ORD)\* Jennifer Seed (OPPT/OPPTS) Gary Kimmel (NCEA/ORD) Hugh Tilson (NHEERL/ORD) Susan Makris (OPP/OPPTS) Vanessa Vu (SAB Staff Office, formerly Table 2-2. Uncertainty/safety factors for various reference values  $UF^a$ FQPA<sup>b</sup> 1, 3, 10 1, 3, 10 1, 3, 10 NA 1 3 10 1, 3, 10  $ND^d$ NA OPP acute and 3, 10 intermediate RfDs 1, 3, 10 1, 3, 10 case-specific 1, 3, 10

> <sup>a</sup> Uncertainty factors:  $U_A = animal$ -to-human;  $U_B = within-human variability$  $<math>U_1 = LOAEL$ -to-NOAEL;  $U_D = database deficiency$ .

Endpoint = lethality, not really a LOAEL-to-NOAEL adjustment in this case.

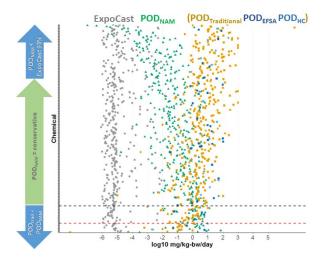
Database deficiencies considered, and a factor may be included for intermediate RfDs if, for

Additional safety factor required under FQPA.

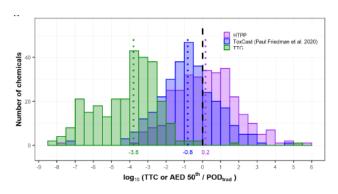
example, there is no reproduction and fertility study.

Overlaps with the FOPA safety factor (see U.S. EPA. 2002b)

## Case Studies Demonstrating Application of Bioactivity as a Protective POD



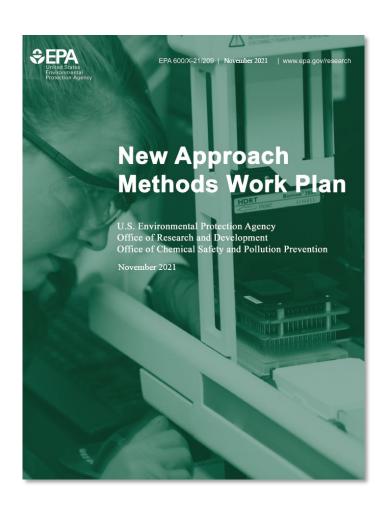
Paul-Friedman et al., 2020



Nyffeler and Harrill, ISMB Poster, 2020



# Step 6: Evaluate Regulatory Flexibilities and Develop a Fit-for-Purpose Scientific Confidence Framework



#### **Deliverables:**

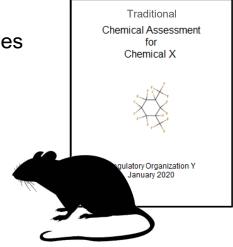
- EPA review of existing statutes, regulations, policies, and guidance that relate to vertebrate animal testing in 2022
- US National Academies of Sciences report on variability and relevance of existing mammalian toxicity tests in 2023.
- Scientific confidence framework to evaluate the quality, reliability, and relevance of NAMs in 2024.



# Step 7: Quantify Trade-Offs of Uncertainty, Cost, and Time in Toxicity Testing Methods

### Option 1

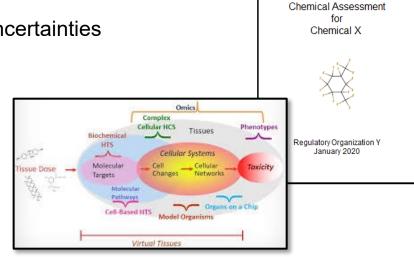
- 6 20 years
- "Smaller" uncertainties
- \$Ks \$Ms



### Option 2

NAMs Based

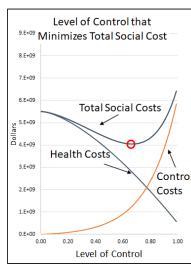
- <1 year</li>
- "Bigger" uncertainties
- \$Ks

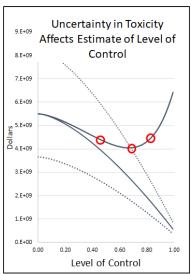


What choice would you make?



## Development of a Value of Information Framework to Evaluate the Trade-Offs in Toxicity Testing





- Value of information (VOI) analysis is a decision analytic method that quantifies the expected value of additional testing/data in reducing decision uncertainty (Tuffaha, 2021).
- VOI requires a method to determine the cost of uncertainty
  - $Total\ Social\ Cost = Total\ Control\ Cost + Total\ Health\ Cost$
- Lots of work in VOI evaluating different tests (e.g., medical tests), but few studies evaluating the impact of time.
- The impact of time can be incorporated by discounting the costs on an annual basis.
- Multiple metrics can be used to compare the value of different toxicity tests adjusted for time and cost of the test
  - **Expected Value of Delayed Sample Information (EVDSI)**
  - Expected Net Benefit of Sampling (ENBS)
  - Return on Investment (ROI)



### General Conclusions From the Value of Information Studies

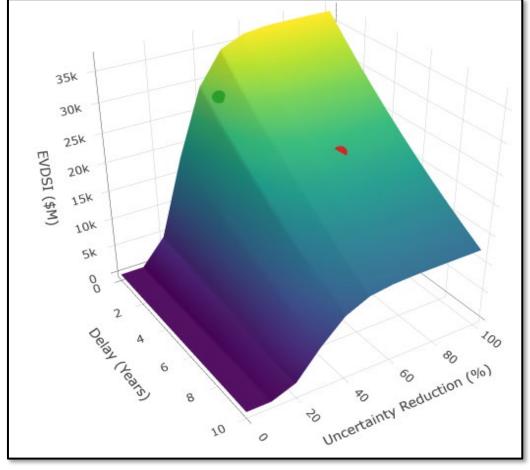
#### **Example Scenarios**

- Two hypothetical toxicity tests
  - Test A lower cost (\$5K), shorter duration (1 yr), higher uncertainty (4 orders of magnitude)
  - Test B higher cost (\$5M), longer duration (5 yr), lower uncertainty (2 orders of magnitude)
- Different health endpoints and decision types
  - Chronic and acute effects
  - Chemicals regulated based on benefit-cost analysis and target risk levels

#### **Overall Conclusions**

- Timeliness has a significant positive impact on the VOI of toxicity tests, even in the presence of smaller reductions in uncertainty.
- The positive impact of the shorter tests may be multiplicatively amplified by the ability to test more chemicals.

Trade-Offs of Uncertainty and Time of Hypothetical Toxicity **Testing Methods** (Chronic Effect, Target Risk Decision Maker)



- S. Hagiwara, G. Paoli, D. Krewski (RSI)
- P. Price, A. Guiseppi-Elie, M. Gwinn, B. Hubbell, R. Thomas (EPA) 15

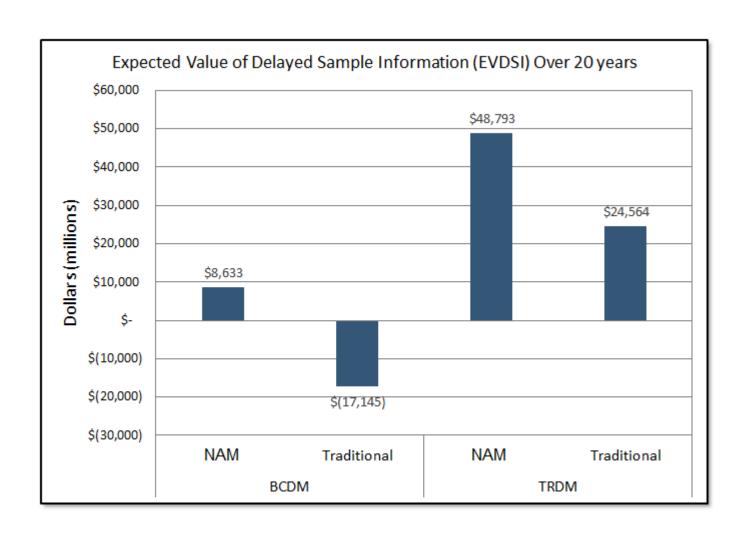


### Focused Case Study on Di (2-Ethylhexyl)Phthalate

#### **Parameters**

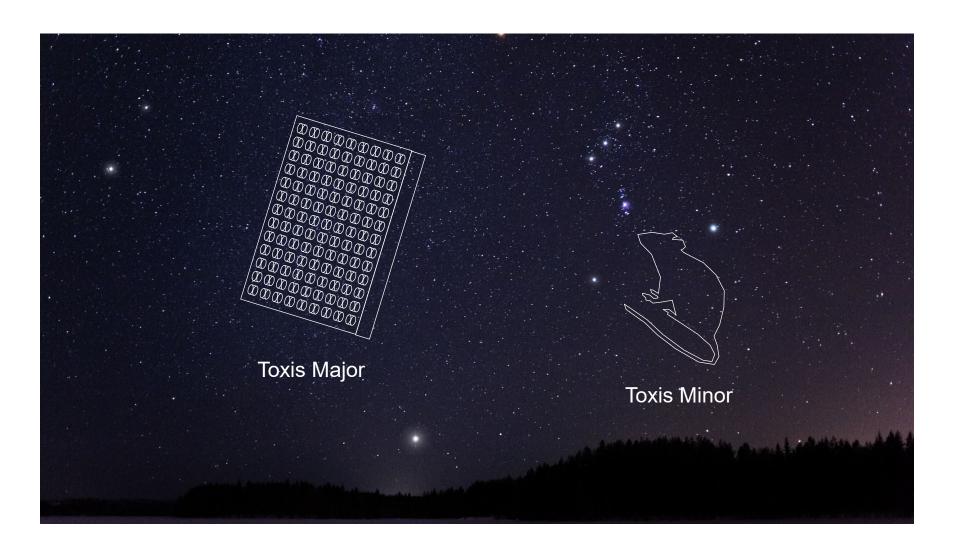
	Values			
Toxicity (Prior)				
$Log_{10}\ \mu_{tox}$	1.699			
Uncertainty in $\mu_{tox}$ (Orders of Magnitude or OM)	7			
$Log_{10} (\sigma_{tox})$	0.697			
Exposure				
$Log_{10}(\mu_{exp})$	-2.87			
Uncertainty in $\mu_{\text{exp}}$ (OM)	1.74			
$Log_{10}(\sigma_{exp})$	0.34			
Toxicity Post Test A – NAM				
Uncertainty in measured $\mu_{tox}$ (OM)	2.74			
Delay	1 yrs			
Cost	\$50,000			
Toxicity Post Test B – Traditional				
Uncertainty in measured $\mu_{tox}$ (OM)	1.76			
Delay	8 yrs			
Cost	\$5,000,000			

- Exposure estimates derived from NHANES biomonitoring data for U.S. adults (Reyes and Price, 2019)
- Toxicity estimates from published standards using methods from Chiu and Slob (2015)
- Evaluated Benefit Cost Decision Maker (BCDM) and Target Risk Decision Maker (TRDM)
- Chronic health effects (mortality)





### Moving from a Paradox to a Practical Solution





### Acknowledgements

#### Center for Computational Toxicology and Exposure (CCTE) Staff

Tox21 Colleagues:

NTP

FDA

**NCATS** 

**EPA Colleagues:** 

CEMM

**CPHEA** 

**CESER** 

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Unilever

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**ECHA** 

**EFSA** 

Health Canada



Research Triangle Park, NC



Cincinnati, OH



Duluth, MN



Washington, DC



Athens, GA



Gulf Breeze, FL