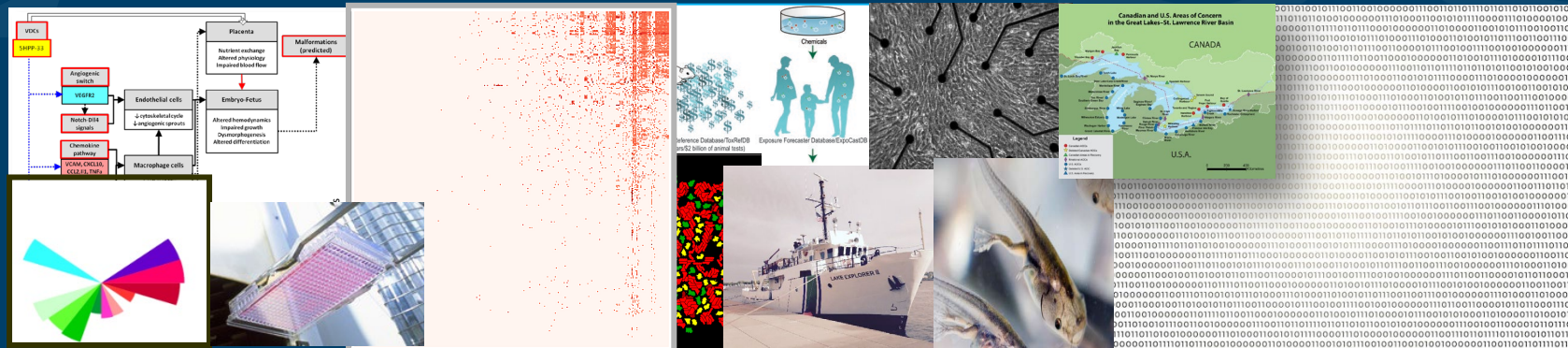


# Understanding the Impacts of Chemicals in Environmental Health

## *A Need for Data or Change in Perspective?*



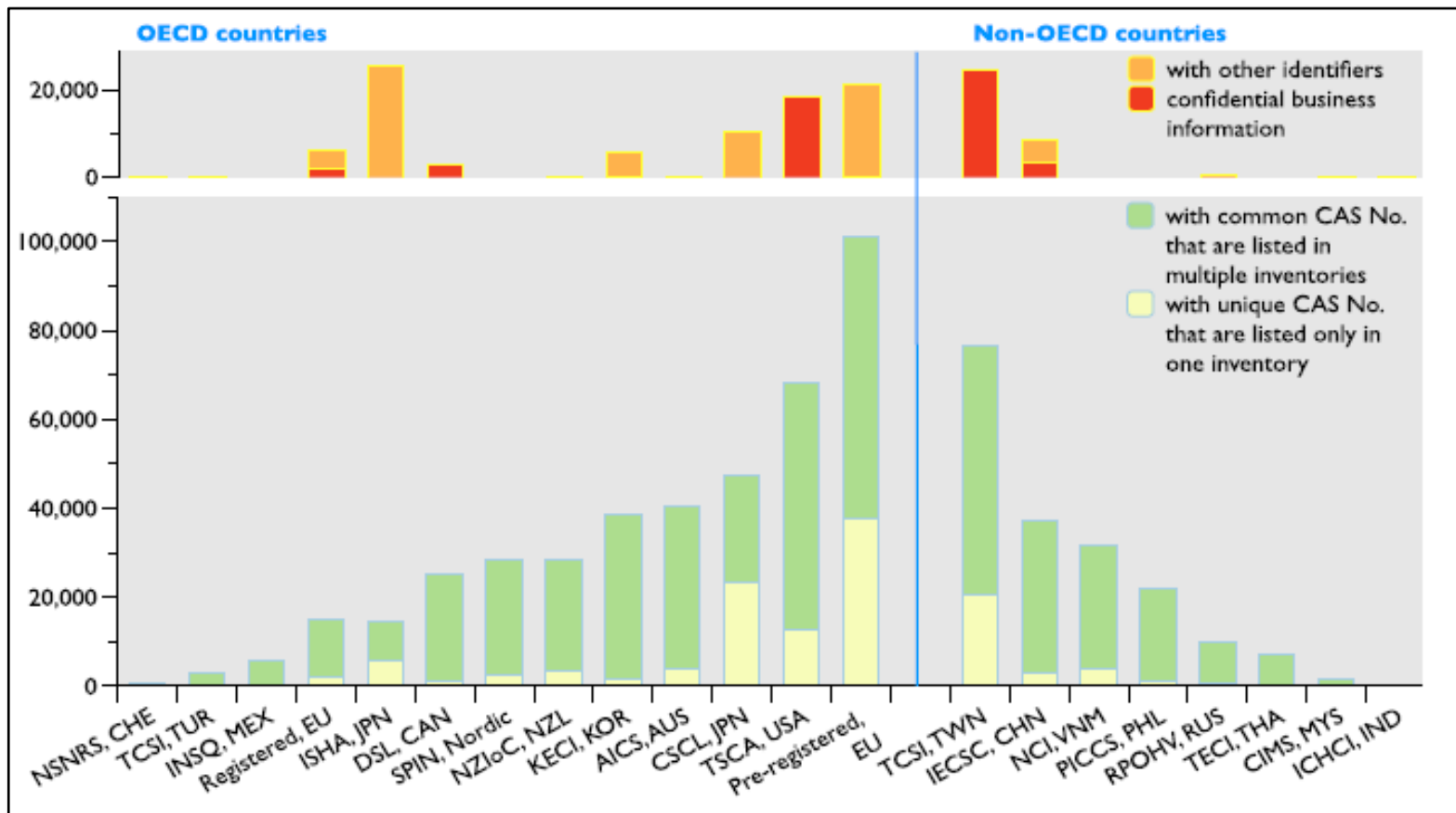
NC Symposium on Life/Data Sciences, Precision Medicine and Environmental Health

May 8, 2023

**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

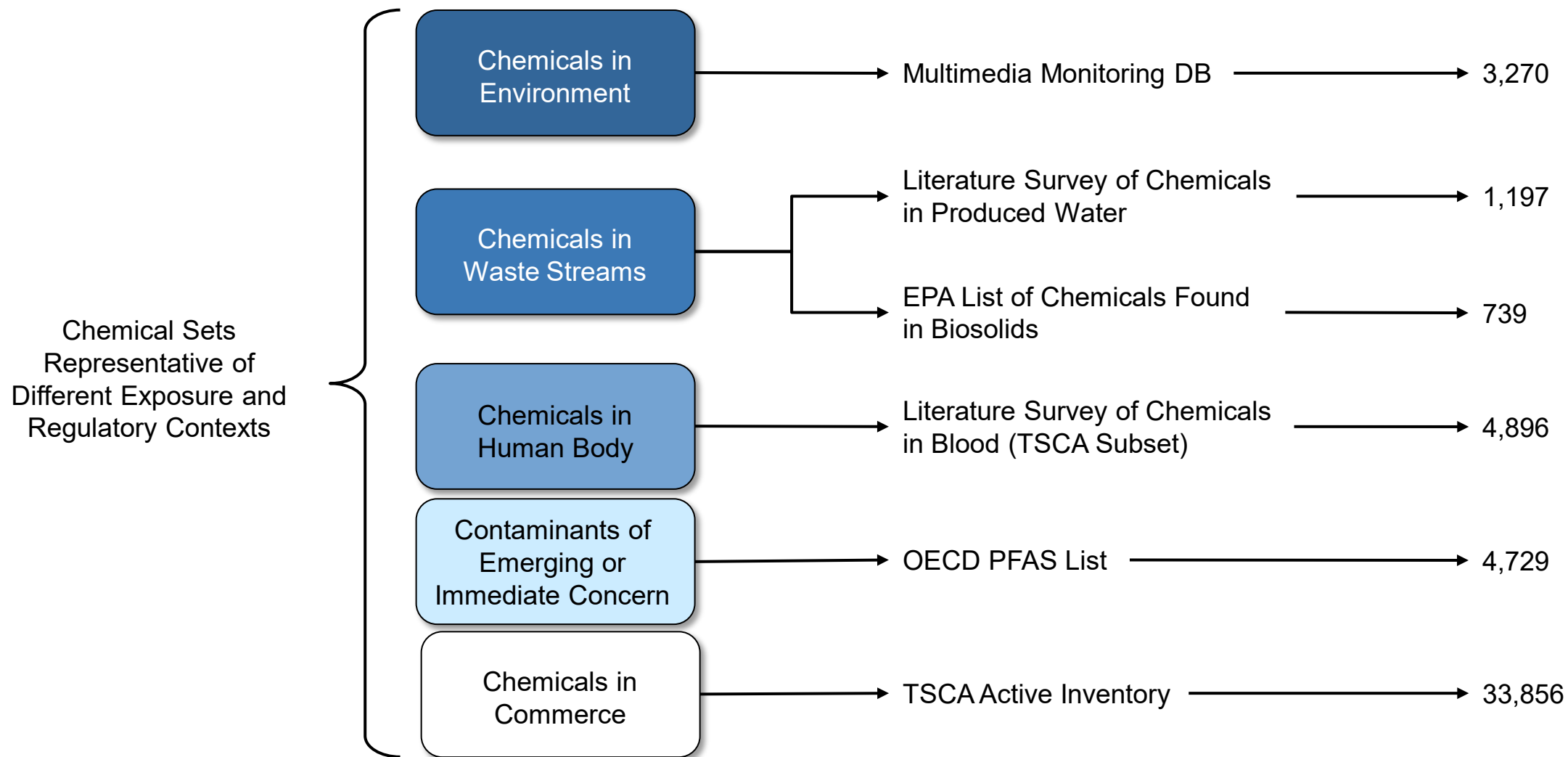
# Magnitude of the Worldwide Chemical Inventory



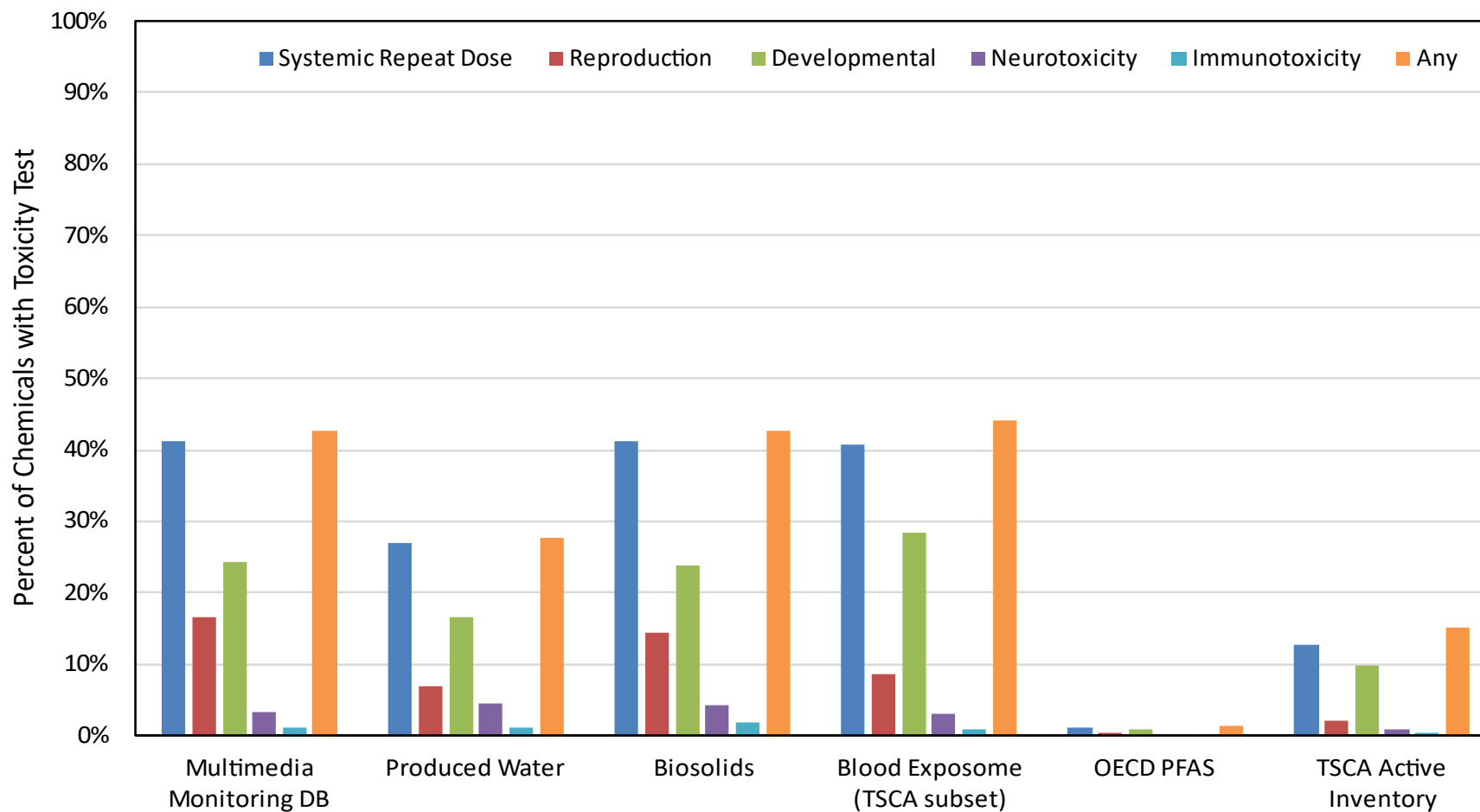
Wang et al., *Env Sci Technol.*, 2020

- A total of 19 inventories surveyed
- 350,000 chemicals and mixtures of chemicals were registered in one or more inventories.
- Total number of substances likely an undercount due to:
  - Thresholds required for registration.
  - Does not include degradation products.
  - Does not include contaminants.

# Contextualizing the Domestic and Worldwide Chemical Inventories



# Less Than Half of Chemicals Within the Representative Sets Have Traditional Toxicity Testing Data



Chemicals in  
Environment

Chemicals in  
Waste Streams

Chemicals in  
Human Body

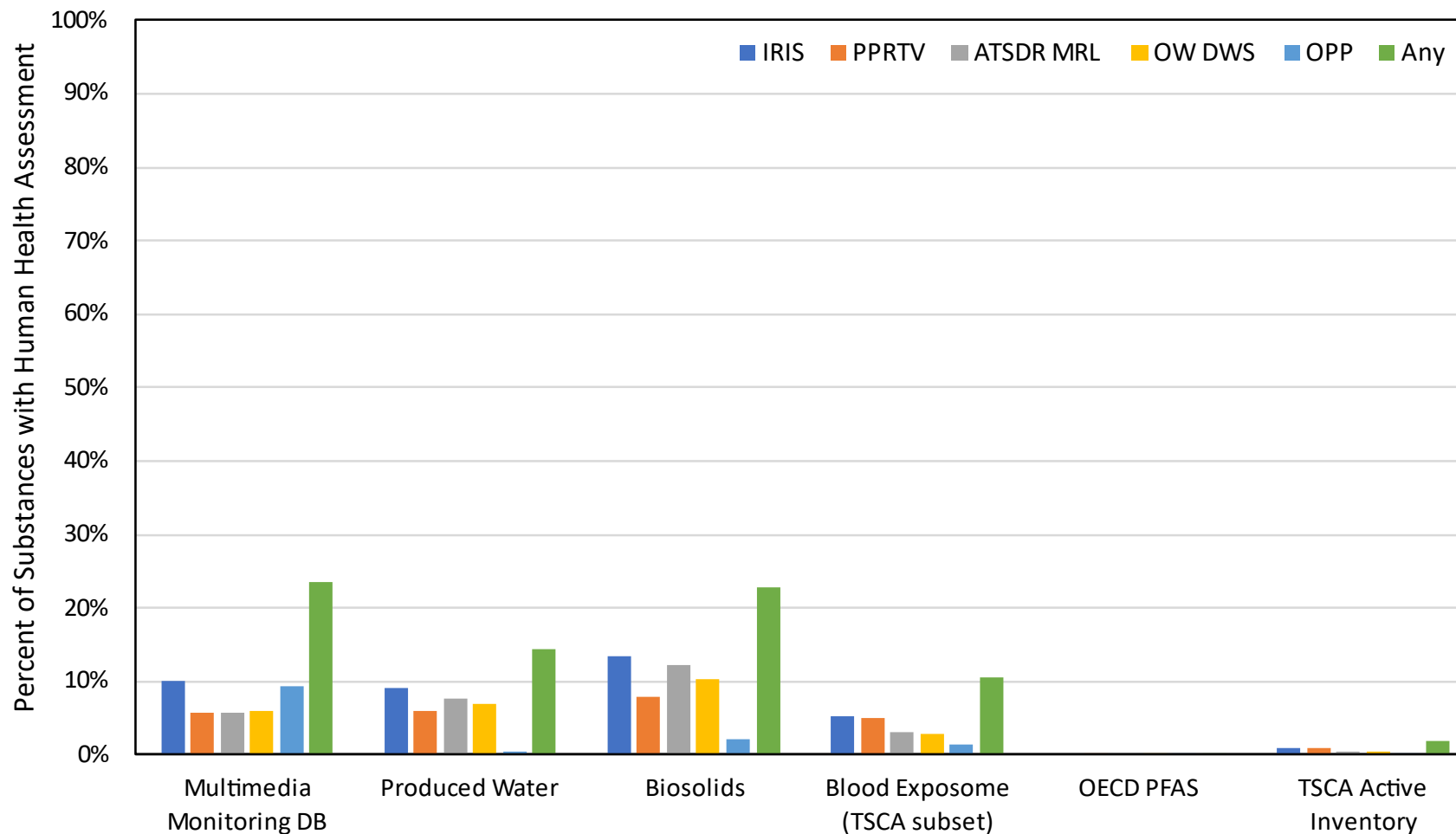
Contaminants of  
Emerging or  
Immediate Concern

Chemicals in  
Commerce

\*Toxicity testing data  
obtained from ToxVal v9.4



# Even Fewer Chemicals Within the Representative Sets Have Human Health Assessments



**IRIS** – US EPA Integrated Risk Information System

**PPRTV** – US EPA Provisional Peer Reviewed Toxicity Values

**ATSDR MRL** – Agency for Toxic Substances and Disease Registry Minimal Risk Levels

**OW DWS** – US EPA Office of Water Health Advisories

**OPP** – US EPA Office of Pesticide Programs

Chemicals in  
Environment

Chemicals in  
Waste Streams

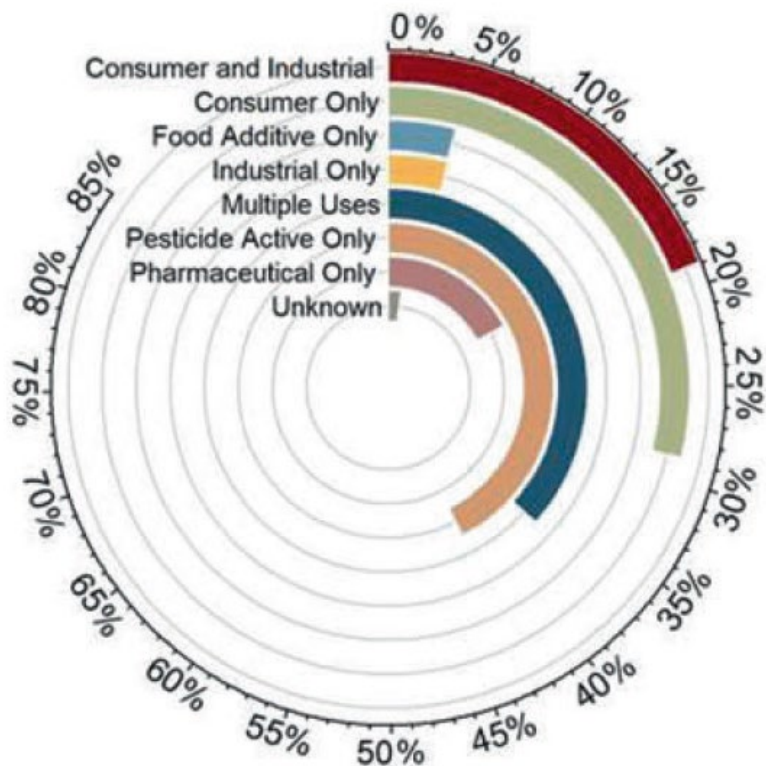
Chemicals in  
Human Body

Contaminants of  
Emerging or  
Immediate Concern

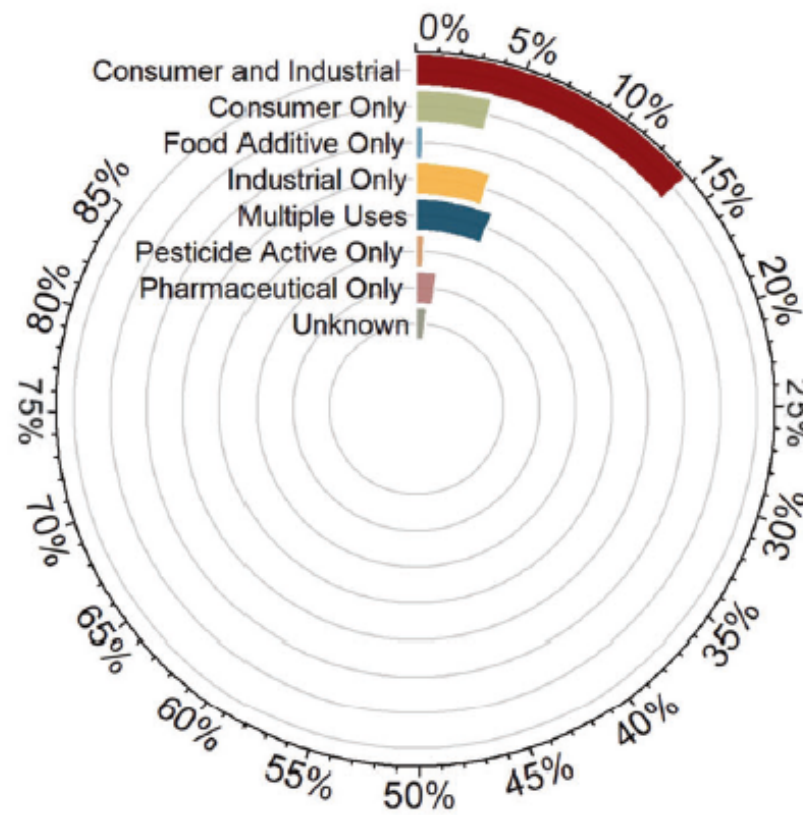
Chemicals in  
Commerce

# Similarly Few Chemicals Have Traditional Exposure Monitoring and Assessments

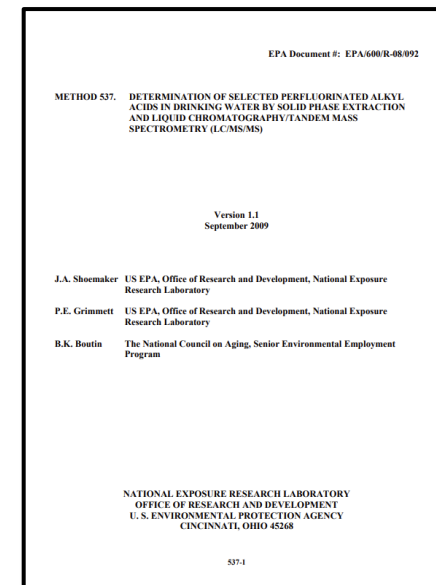
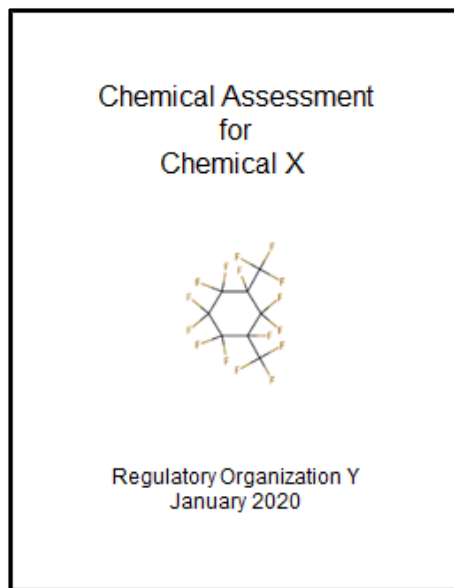
Percent of Chemicals in Sector with Traditional Monitoring Data



Percent of Chemicals in Sector with Traditional Exposure Assessment



# Time From Required to a Understand Human Health Risks Using Traditional Approaches is Significant



Time from chemical identification to finalizing report can range from 2 – 10 years.

- Time to perform a typical human health assessment is **4+ years** (Krewski *et al.*, *Arch Toxicol.*, 2020).
- More complex assessments can take substantially longer (NASEM, 2009).

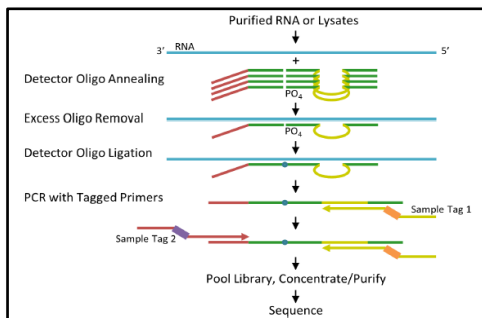
Time to develop an EPA validated analytical method can range from **2 - 5 years**.

# So, Is The Issue A Lack of Data?

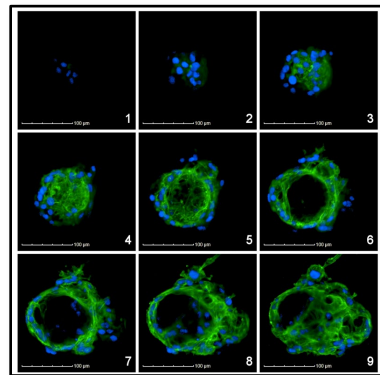


# Broad Range of Technologies and Methods Available for Generating Alternative Data on Chemical Hazard

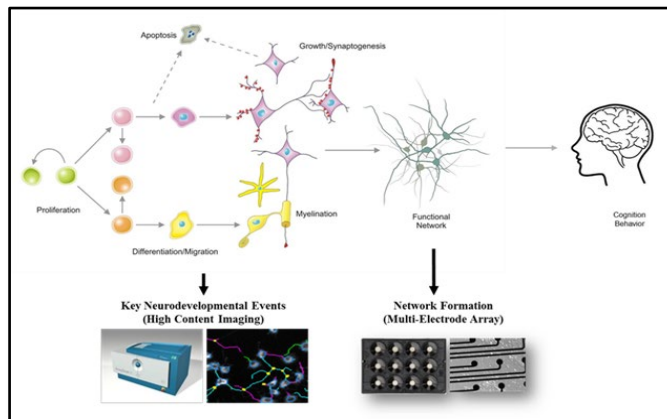
## Whole Genome/Reduced Set Transcriptomics



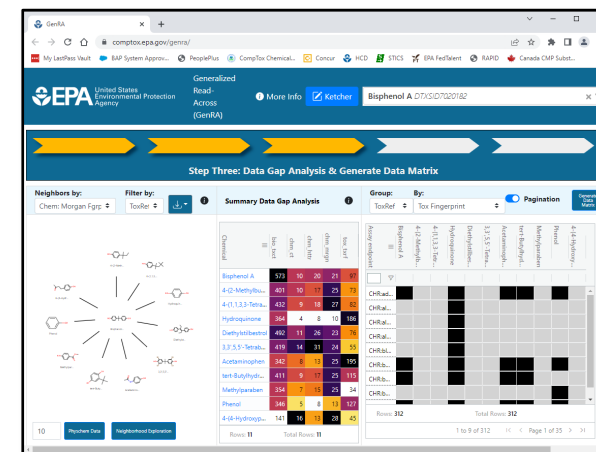
## Organotypic Culture Models



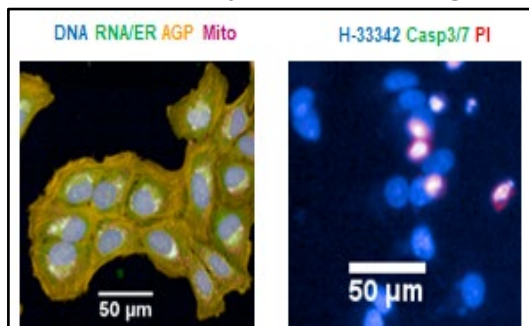
## Integrated Approach to Testing and Assessment for DNT



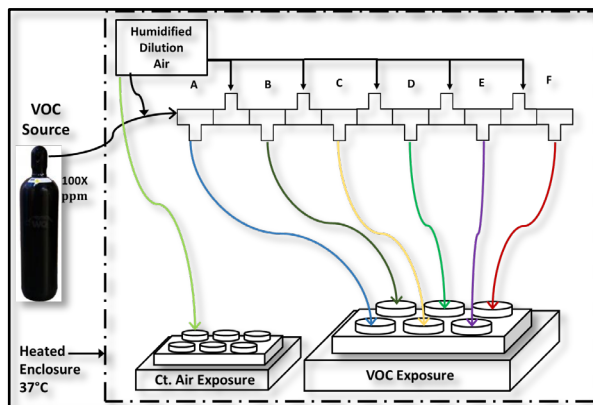
## Generalized Read Across Methods and QSAR Modeling



## Multi-Parameter Cellular Phenotypic Profiling



## Volatile/Aerosol *In Vitro* Exposure Systems



## ToxCast High-Throughput *In Vitro* Assay Battery

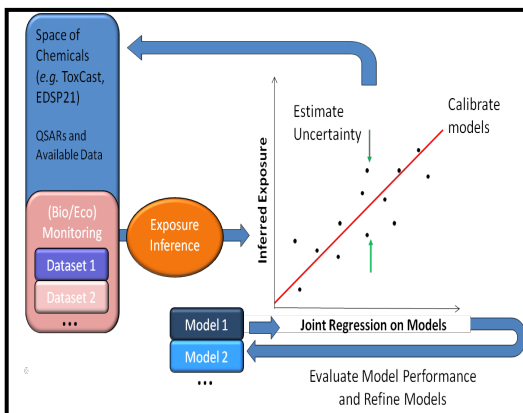
Transcription Factors  
Transporter  
Cytokines  
Kinases  
Nuclear Receptors  
CYP450 / ADME

Cholinesterase  
Phosphatases  
Proteases  
XME metabolism  
GPCRs  
Ion channels

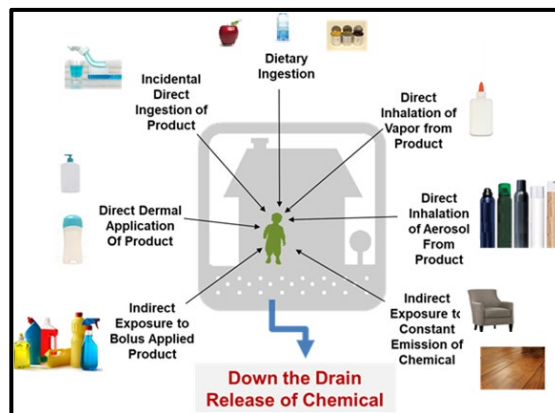
~700 Biochemical/Cellular Assay Endpoints

# Similar Range of Technologies and Methods Available for Exposure and Toxicokinetics

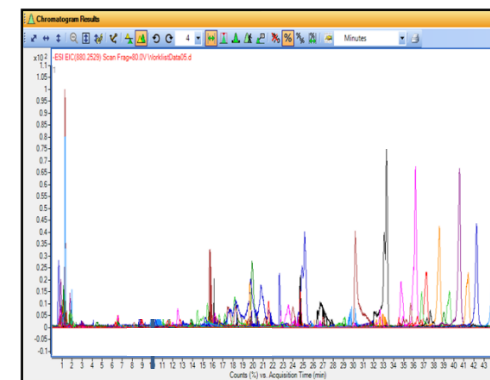
## SEEM Consensus Exposure Model



## SHEDS-HT Exposure Pathway Model



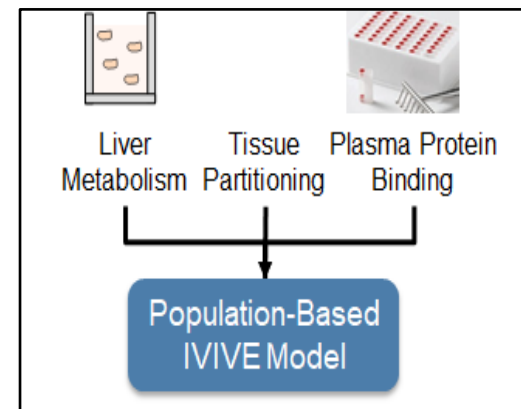
## LC and GC Non-Targeted Analysis



## QSUR Functional Use Machine Learning Models

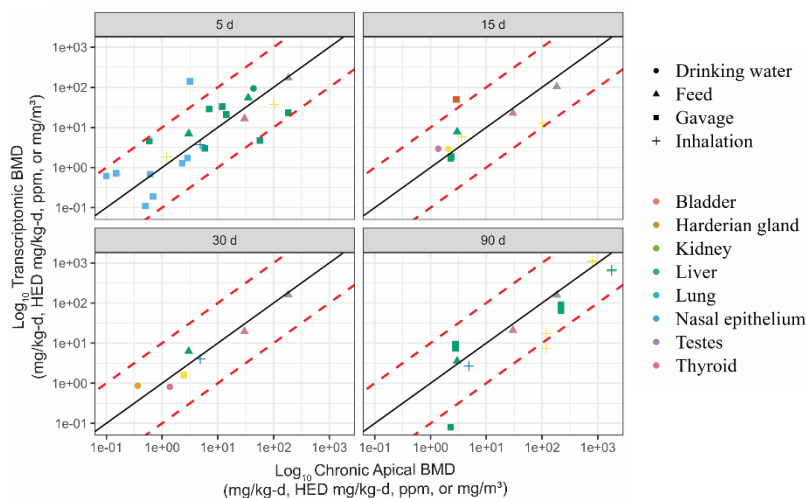
additive	additive for liquid system	additive for rubber	additive promoter	antibacterial	antioxidant	antistatic agent
additive	additive for liquid system	additive for rubber	adhesion promoter	anti-microbial	anti-oxidant	antistatic agent
buffer	buffer	buffer	buffer	buffer	buffer	buffer
buffer	catalyst	chelator	colorant	crosslinker	emollient	emulsifier
emulsion stabilizer	film forming agent	flame retardant	flavorant	foam boosting agent	foamer	fragrance
hair conditioner	hair dye	heat stabilizer	humectant	lubricating agent	masking agent	monomer
oral care	organic pigment	oxidizer	perfumer	pH stabilizer	photo-initiator	plasticizer
pre-servative	reducer	rheology modifier	skin conditioner	skin protectant	soluble dye	solvent
surfactant	ubiquitous	UV absorber	vinyl	viscosity controlling agent	wetting agent	whitener

## In Vitro Toxicokinetic Assays and Modeling

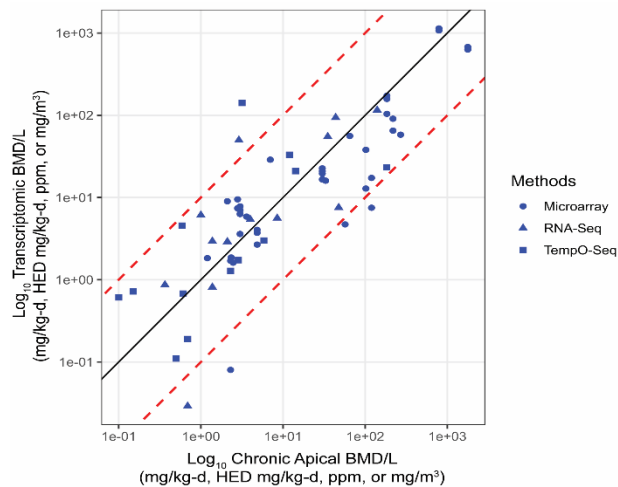




# Literature Review Supports Dose Concordance Between Disruption of Gene Activity and Toxicity

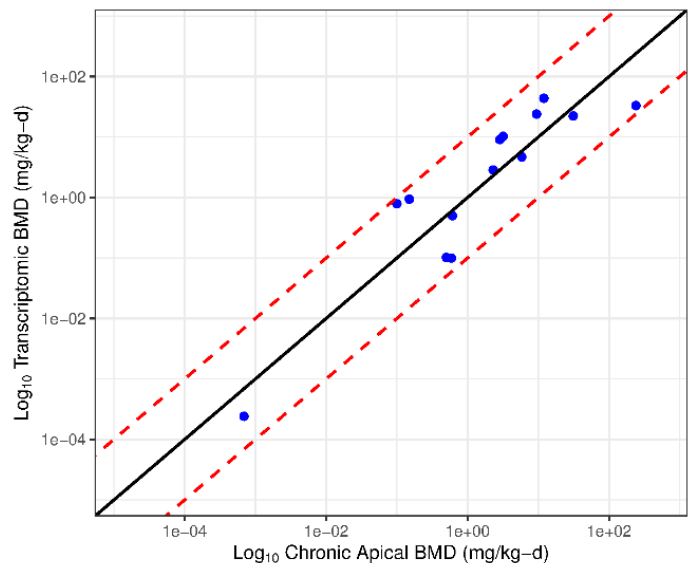
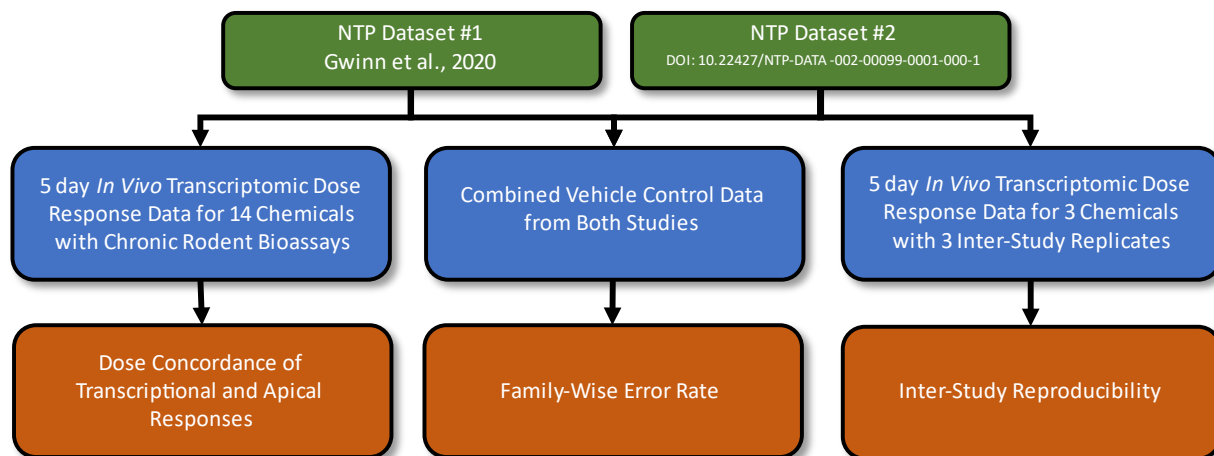


- Literature review identified 140 chemicals in 32 studies.
- Studies covered 4 exposure routes, multiple exposure durations (<1 day to 90 days), 8 tissues, 3 technologies, and broad range of physicochemical properties and toxicokinetic half-lives.
- Across 38 chemicals with chronic bioassays, the Pearson's correlation coefficient for the transcriptomic BMD versus chronic, apical BMD was 0.842 with an RMSD of 0.565 ( $\log_{10}$  mg/kg-d) and a median absolute ratio of  $2.1 \pm 0.7$  (MAD).
- The RMSD is similar to the range of inter-study standard deviation estimates for the lowest observable adverse effect levels (LOAELs) for systemic toxicity in repeated dose studies (0.45-0.56) (Pham *et al. Comp Toxicol.*, 2020).
- Dose concordance was robust across exposure durations, exposure routes, species, sex, target tissues, physical chemical properties, toxicokinetic half-lives, and technology platforms.





# Refining Dose Response Analysis Methods to Derive Transcriptomic Points-of-Departure for ETAP



- Standardized study design based on NIEHS DTT/NTP data sets:
  - 5 day, repeat oral dosing in male Sprague Dawley rats.
  - Transcriptomic measurements in the liver and kidney.
  - Reduced gene set targeted RNA-Seq platform (S1500+) (Mav et al., PLOS One, 2018).
- Concordance of transcriptional and apical responses
  - Pearson's correlation = 0.910
  - RMSD = 0.567
  - Median absolute ratio =  $3.2 \pm 1.9$  (MAD)
- Inter-study reproducibility
  - Inter-study  $\log_{10}$  BMD SD = 0.24
- False positives
  - Family-Wise Error Rate = 0.006

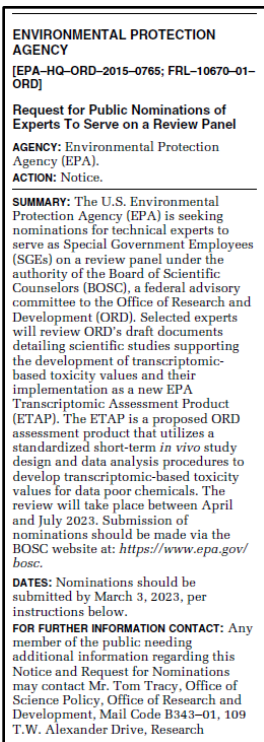
# EPA Announced Proposed Release of a New Human Health Assessment Product Based on Transcriptomics

EPA released public notice for upcoming scientific peer-review and public comment on a new draft ORD human health assessment product for data poor chemicals.

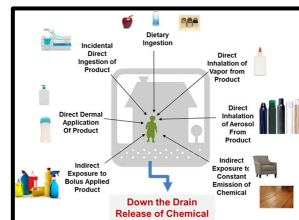
## EPA Transcriptomic Assessment Product (ETAP) *ad hoc* Board of Scientific Counselors FRN

- Development of transcriptomic points-of-departure from short-term *in vivo* studies
- Derivation of transcriptomic toxicity values for chronic toxicity; and
- Incorporation of transcriptomic toxicity values into a new standardized assessment product intended for data poor chemicals.
- Example application of the ETAP to a data poor per- and polyfluoroalkyl substance (PFAS).

<https://www.federalregister.gov/documents/2023/02/15/2023-03194/request-for-public-nominations-of-experts-to-serve-on-a-review-panel>



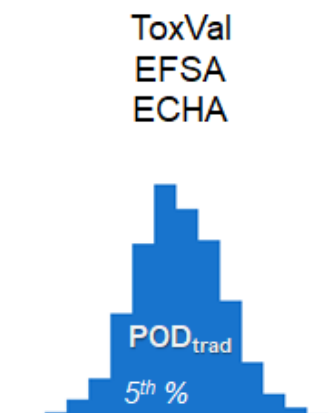
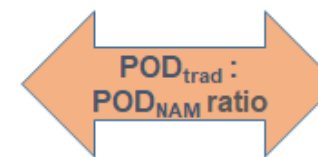
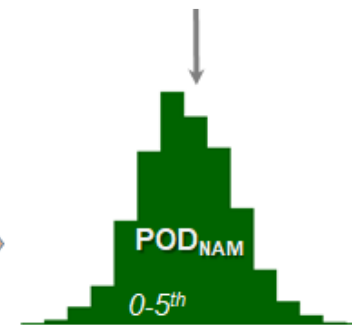
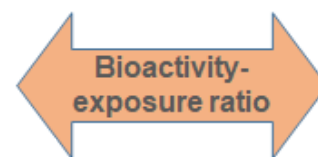
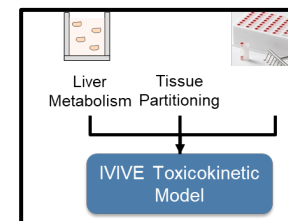
## ExpoCast Exposure Estimates

[illegible]

# ToxCast Evaluation of Biological Targets

Transcription Factors	Cholinesterase
Transporter	Phosphatases
Cytokines	Proteases
Kinases	XME metabolism
Nuclear Receptors	GPCRs
CYP450 / ADME	Ion channels
~700 Biochemical/Cellular Assay Endpoints	

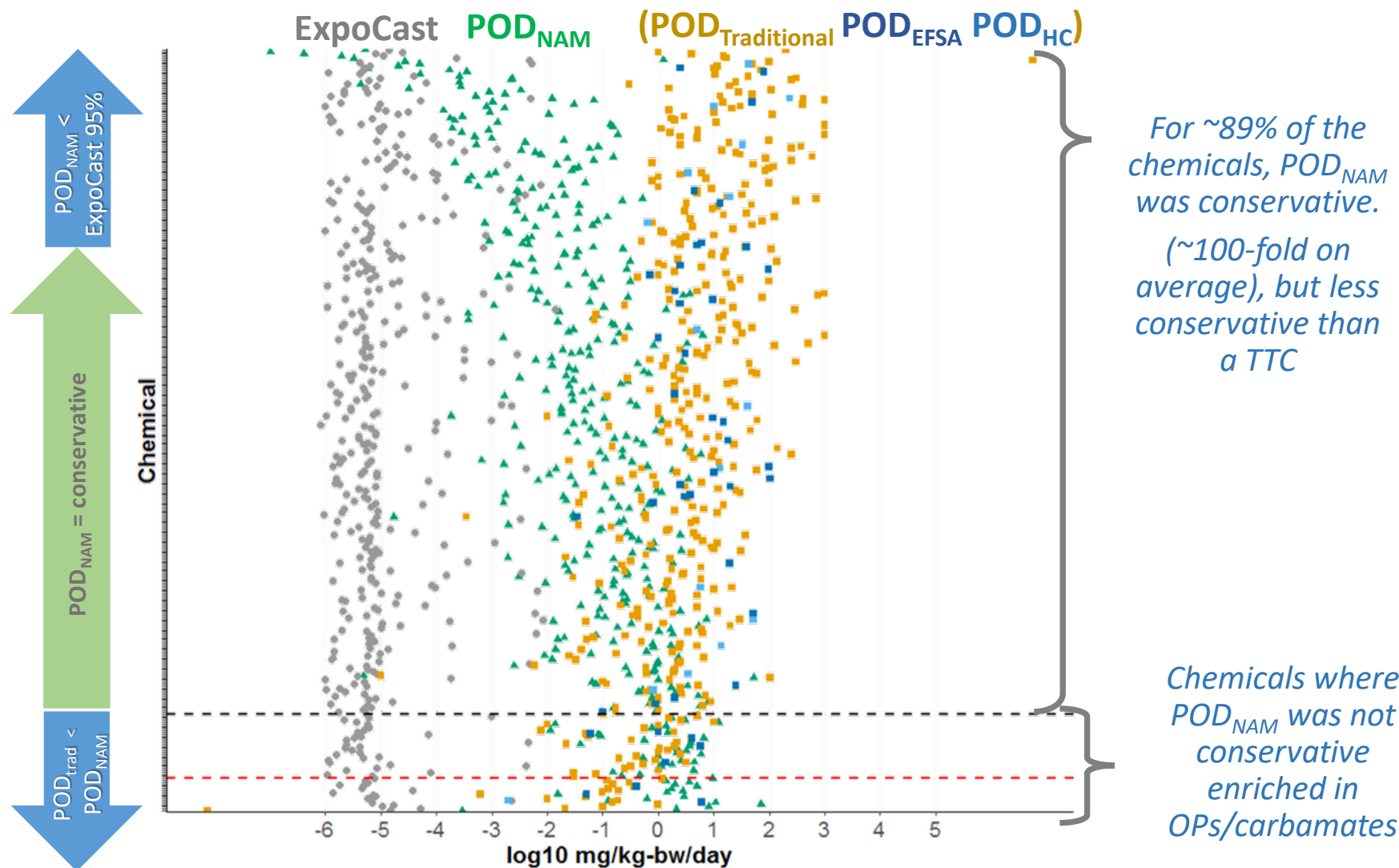
## In Vitro Toxicokinetic Assays and Modeling



- NOEL, LOEL, NOAEL, or LOAEL
- Oral exposures
- Mg/kg-bw/day units

**Center for Computational  
Toxicology & Exposure**

# *In Vitro* Bioactivity and Toxicokinetics Provided Health Protective Screening Assessments for Most Chemicals



# Application of the Methods to Regulatory and Commercial Decision Making

## Science Approach Document

**Bioactivity Exposure Ratio:**  
Application in Priority Setting and Risk Assessment

Health Canada

March 2021

**A Proof-of-Concept Study  
Integrating Publicly Available  
Information to Screen  
Candidates for Chemical  
Prioritization under TSCA**

**EPA**  
EPA/600/R-21-106

Computational Toxicology 7 (2018) 20–26

Contents lists available at ScienceDirect

**Computational Toxicology**

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

**Principles underpinning the use of new methodologies in the risk assessment of cosmetic ingredients**

Matthew Dent<sup>a,\*</sup>, Renata Teixeira Amaral<sup>b</sup>, Pedro Amores Da Silva<sup>b</sup>, Jay Ansell<sup>c</sup>, Fanny Boileve<sup>d</sup>, Masato Hatao<sup>e</sup>, Akihiko Hirose<sup>f</sup>, Yutaka Kasai<sup>g</sup>, Petra Kern<sup>h</sup>, Reinhard Kreiling<sup>i</sup>, Stanley Milstein<sup>j</sup>, Beta Montemayor<sup>k</sup>, Julcemara Oliveira<sup>l</sup>, Andrea Richarz<sup>m</sup>, Rob Taalman<sup>n</sup>, Eric Vaillancourt<sup>o</sup>, Rajeshwar Verma<sup>p</sup>, Nashira Vieira O'Reilly Cabral Posada<sup>q</sup>, Craig Weiss<sup>r</sup>, Hajime Kojima<sup>s</sup>

<sup>a</sup> Unilever Safety and Environmental Assurance Centre, Colworth Science Park, Sharnbrook, Bedfordshire MK44 1LQ, UK  
<sup>b</sup> ABHPEC – Association of the Cosmetics, Toiletry and Fragrance Industry (ABHPEC), Av. Paulista, 1313 Cordeiro César, São Paulo, SP 01311-000, Brazil  
<sup>c</sup> US Personal Care Products Council (PCPC), 1620 L St. NW, Suite 1200, Washington, D.C. 20036, USA  
<sup>d</sup> Johnson & Johnson Sterile Ocular Products, Domaine de Maignemont, CS 10615, F-27106 VAL DE REUIL, Caudebec, France  
<sup>e</sup> Japan Cosmetic Industry Association (JCIA), Metro City Kamayacho 6F, 5-1-5, Shinjuku, Minato-ku, Tokyo 105-0001 Japan  
<sup>f</sup> National Institute of Health Sciences, 1-18-1 Kamiyoga, Setagaya-ku, 158-8501 Tokyo, Japan  
<sup>g</sup> Kao Corporation, External Relations & Government Affairs 2-1-3, Buhe, Saitama-Ku, Tokyo 131-8501 Japan  
<sup>h</sup> Procter and Gamble Services Company NV, Temeldeen 100, B-1823 Spranghaak-Bever, Belgium  
<sup>i</sup> Clariant Products (DE) GmbH, Global Toxicology and Ecotoxicology, Am Unten-Park 1, 65843 Sulzbach, Germany  
<sup>j</sup> US Food and Drug Administration (US FDA), Office of Cosmetics and Colors (OCC), Center for Food Safety and Applied Nutrition (CFSAN), 5001 Campus Drive, College Park, MD 20740, USA  
<sup>k</sup> Cosmetics Alliance Canada, 420 Britannia Road East Suite 102, Mississauga, ON L4Z 3L5, Canada  
<sup>l</sup> Brazilian Health Regulatory Agency (ANVISA), Gerência de Produtos de Higiene, Perfumes, Cosméticos e Saneantes, SA Trêcho 5, Ite 200, Area Especial 57 – CEP 71205-000, Brazil  
<sup>m</sup> European Commission, Joint Research Centre (JRC), Directorate for Health, Consumers and Reference Materials, Chemical Safety and Alternative Methods Unit, Via E. Fermi 27/49, 21027 Ispra, VA, Italy  
<sup>n</sup> Cosmetics Europe, Avenue Hermann Debray 40, 1160 Auderghem, Belgium  
<sup>o</sup> Health Canada (HC), Consumer Product Safety Directorate, Healthy Environments and Consumer Safety Branch, 259 Laurier Ave. W., Ottawa, ON K1A 0K9, Canada  
<sup>p</sup> Independent Cosmetic Manufacturing and Distributors (ICMAD), 21925 Field Parkway, Suite 2015, Deer Park, IL 60010, USA

**ARTICLE INFO**

**Keywords:**  
Next Generation Risk Assessment  
New approach methodologies  
Cosmetic risk assessment

**ABSTRACT**

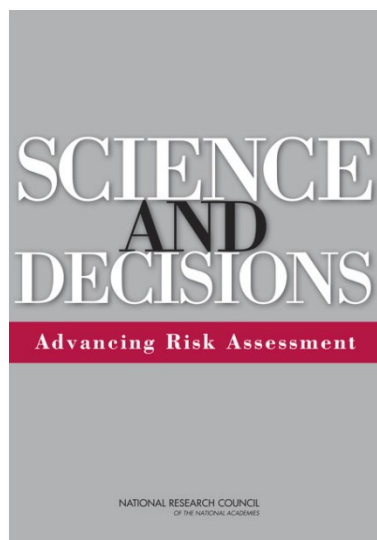
Consumer safety is a prerequisite for any cosmetic product. Worldwide, there is an ever-increasing desire to bring safe products to market without animal testing, which requires a new approach to consumer safety. 'Next Generation Risk Assessment' (NGRA), defined as an exposure-led, hypothesis-driven risk assessment approach that integrates *in silico*, *in chemico* and *in vitro* approaches, provides such an opportunity. The customized nature of each NGRA means that the development of a prescriptive list of tests to assure safety is not possible, or appropriate. The International Cooperation on Cosmetics Regulation (ICCR) therefore tasked a group of scientists from regulatory authorities and the Cosmetic Industry to agree on and outline the principles for incorporating these new approaches into risk assessments for cosmetic ingredients. The ICCR group determined the overall goals of NGRA (to be human-relevant, exposure-led, hypothesis-driven and designed to prevent harm); how an NGRA should be conducted (using a tiered and iterative approach, following an appropriate literature search and evaluation of the available data, and using robust and relevant methods and strategies); and how the assessment should be documented (transparent and explicit about the logic of the approach and sources of uncertainty). Those working on the risk assessment of cosmetics have a unique opportunity to lead progress in the application of novel approaches, and cosmetic risk assessors are encouraged to consider these key principles when conducting or evaluating such assessments.

\* Corresponding author.  
E-mail address: [matthew.dent@unilever.com](mailto:matthew.dent@unilever.com) (M. Dent).

<https://doi.org/10.1016/j.comtox.2018.06.001>  
Received 18 April 2018; Received in revised form 14 June 2018; Accepted 18 June 2018  
Available online 20 June 2018  
2468-1113/© 2018 The Authors. Published by Elsevier B.V. This is an open access article under the CC BY-NC-ND license (<http://creativecommons.org/licenses/by-nc-nd/4.0/>).



# Importance of Considering Time as a Factor in Chemical Risk Assessment

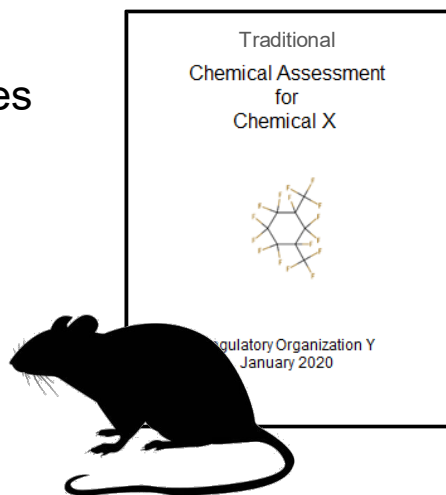


- The NAS committee reflected that **time** is a “major and rarely acknowledged influence in the nature and quality” of a risk assessment.
- Additional studies or improvements in the assessment may reduce uncertainty, but they require additional resources and the delay “can have significant impact on communities who are awaiting risk assessment results.”
- A Value of Information (VOI) analysis listed as a recommendation in the report to provide a more objective decision framework in assessing the trade-offs of time, uncertainty, and cost.
- VOI is a decision analytic method that quantifies the expected value of additional testing/data in reducing decision uncertainty (Tuffaha, 2021).

# Difficult Trade-Offs of Uncertainty, Cost, and Timeliness in Toxicity Testing Methods

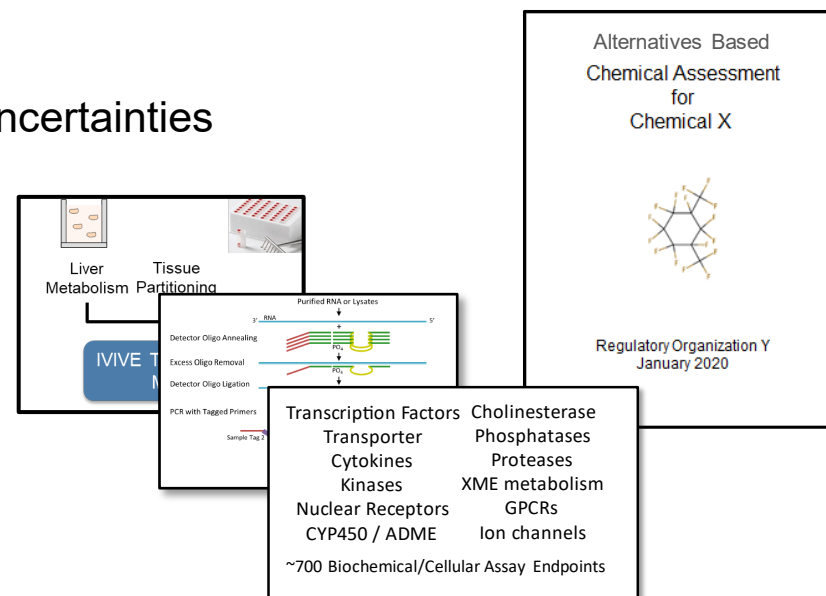
## Option 1

- 6 – 20 years
- “Smaller” uncertainties
- \$Ks - \$Ms



## Option 2

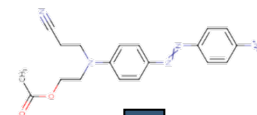
- <1 year
- “Bigger” uncertainties
- \$Ks



What choice would you make?



# Incorporating Important Features in Chemical Risk Assessment Into a Value of Information Framework



Exposure Level  
Population Variability in Exposure  
Affected Population Size  
Health Effects  
Population Variability in Toxicity  
Control Costs

Relevant Chemical  
Characteristics



Uncertainty in Effect Level  
Timeliness  
Cost

Toxicity Testing  
Characteristics



Regulatory Decision  
Context

DOI: 10.1111/risa.13931

## ORIGINAL ARTICLE

### A value of information framework for assessing the trade-offs associated with uncertainty, duration, and cost of chemical toxicity testing

Shintaro Hagiwara<sup>1,2</sup> | Greg M. Paoli<sup>1</sup> | Paul S. Price<sup>3</sup> | Maureen R. Gwinn<sup>4</sup> | Annette Guiseppi-Elie<sup>3</sup> | Patrick J. Farrell<sup>2</sup> | Bryan J. Hubbell<sup>5</sup> | Daniel Krewski<sup>1,6</sup> | Russell S. Thomas<sup>3</sup>

<sup>1</sup> Risk Sciences International, Ottawa, Canada

<sup>2</sup> School of Mathematics and Statistics, Carleton University, Ottawa, Canada

<sup>3</sup> Center for Computational Toxicology and Exposure, Office of Research and Development, US Environmental Protection Agency, Research Triangle Park, North Carolina, USA

<sup>4</sup> Office of Research and Development, US Environmental Protection Agency, Research Triangle Park, North Carolina, USA

<sup>5</sup> Air, Climate, and Energy Research Program, Office of Research and Development, US Environmental Protection Agency, Research Triangle Park, North Carolina, USA

<sup>6</sup> McLaughlin Centre for Population Health Risk Assessment, University of Ottawa, Ottawa, Canada

Correspondence  
Shintaro Hagiwara, Risk Sciences International,  
700-251 Laurier Avenue West, Ottawa, ON K1P  
5J6, Canada.  
Email: shintaro.hagiwara@carleton.ca

#### Abstract

A number of investigators have explored the use of value of information (VOI) analysis to evaluate alternative information collection procedures in diverse decision-making contexts. This paper presents an analytic framework for determining the value of toxicity information used in risk-based decision making. The framework is specifically designed to explore the trade-offs between cost, timeliness, and uncertainty reduction associated with different toxicity-testing methodologies. The use of the proposed framework is demonstrated by two illustrative applications which, although based on simplified assumptions, show the insights that can be obtained through the use of VOI analysis. Specifically, these results suggest that timeliness of information collection has a significant impact on estimates of the VOI of chemical toxicity tests, even in the presence of smaller reductions in uncertainty. The framework introduces the concept of the expected value of delayed sample information, as an extension to the usual expected value of sample information, to accommodate the reductions in value resulting from delayed decision making. Our analysis also suggests that lower cost and higher throughput testing also may be beneficial in terms of public health benefits by increasing the number of substances that can be evaluated within a given budget. When the relative value is expressed in terms of return-on-investment per testing strategy, the differences can be substantial.

#### KEYWORDS

cost of delay, return on investment, risk decision making, social cost, toxicity testing, value of information

## 1 | INTRODUCTION

Evidence-based risk assessment has become a cornerstone of public and population health risk decision making, integrating evidence on toxicity and exposure from multiple evidence streams. When the available evidence is insufficient to allow a decision to be made with confidence, consideration can be given to gathering additional evidence to strengthen

the evidence base. The present paper focuses on the use of value of information (VOI) analysis to evaluate the utility of gathering additional evidence on the toxicity of chemicals. Specifically, we present a VOI analytic framework that builds on previous methodological work in this field, explicitly incorporating the value of additional test data resulting from reductions in the uncertainty in estimates of a chemical's toxicity, the cost of delay in decision making that results

This is an open access article under the terms of the [Creative Commons Attribution License](https://creativecommons.org/licenses/by/4.0/), which permits use, distribution and reproduction in any medium, provided the original work is properly cited.

© 2022 Risk Sciences International. *Risk Analysis* published by Wiley Periodicals LLC on behalf of Society for Risk Analysis. This article has been contributed to by U.S. Government employees and their work is in the public domain in the USA.

*Risk Analysis*. 2022;1–18.

[wileyonlinelibrary.com/journal/risa](https://onlinelibrary.wiley.com/doi/10.1111/risa.13931) | 1

# Timeliness Has Significant Positive Impact on Value of Toxicity Tests

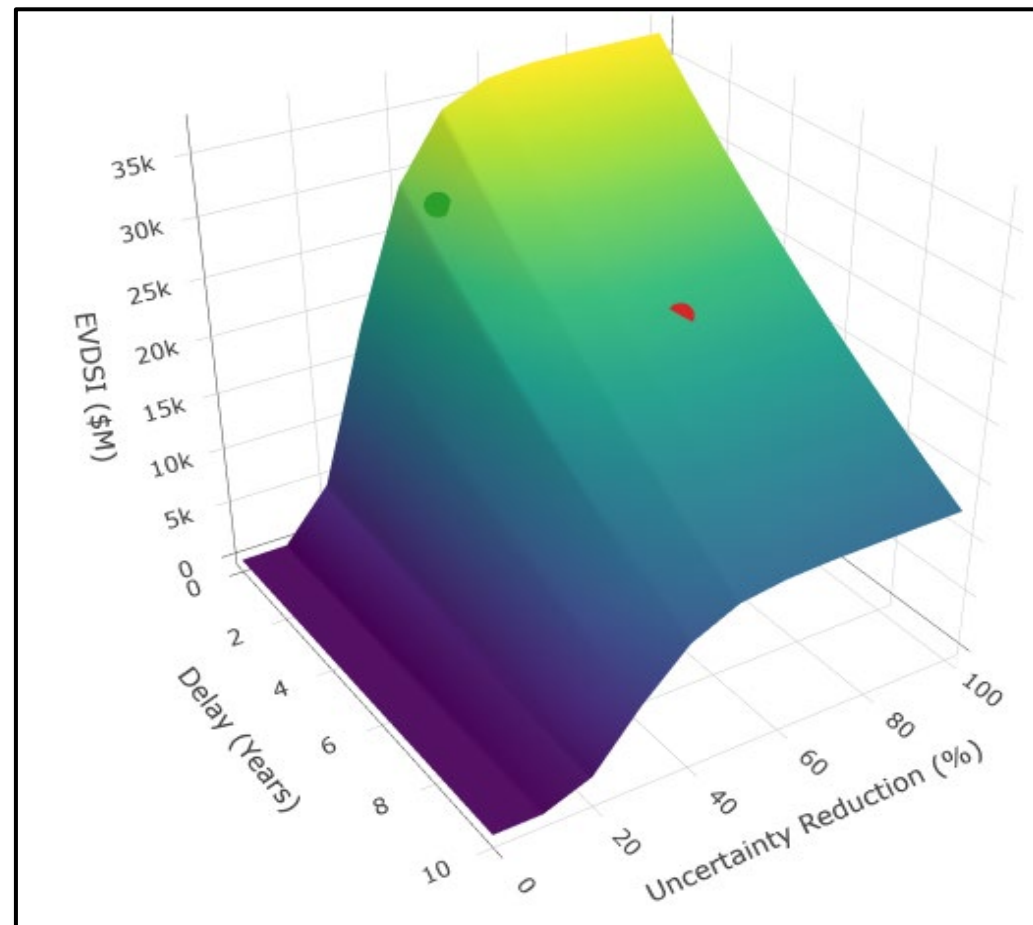
## Example Scenarios

- 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
  - 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 higher 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  
(Target Risk Decision Maker)



# EPA Announced Case Study on Value of Information Analysis of the EPA Transcriptomic Assessment Product

EPA released public notice for upcoming scientific peer-review and public comment on a case study evaluating the public health and economic trade-offs associated with the timeliness, uncertainty, and costs of the draft EPA Transcriptomics Assessment Product (ETAP). .

## ETAP Value of Information Case Study *ad hoc* Board of Scientific Counselors FRN

- Comparison of the ETAP with traditional toxicity testing and human health assessment processes across:
  - Different chemical exposure scenarios
  - Health endpoint valuations
  - Exposure mitigation costs
  - Decision contexts

ENVIRONMENTAL PROTECTION  
AGENCY  
[EPA-HQ-ORD-2015-0765; FRL-10643-01-  
ORD]  
**Request for Public Nominations of  
Experts to Serve on a Review Panel**  
**AGENCY:** Environmental Protection  
Agency (EPA).  
**ACTION:** Notice.  
**SUMMARY:** The U.S. Environmental  
Protection Agency (EPA) is seeking  
nominations for technical experts to  
serve as Special Government Employees  
(SCEs) on a review panel under the  
authority of the Board of Scientific  
Counselors (BOSC), a federal advisory  
committee to the Office of Research and  
Development (ORD). Selected experts  
will participate in the review of the  
ORD's draft report on a case study that  
uses value of information (VOI) analysis  
to weigh the public health and  
economic trade-offs associated with the  
timeliness, uncertainty, and costs of the  
draft EPA Transcriptomic Assessment  
Product (ETAP). The ETAP is a  
proposed ORD assessment product that  
utilizes a standardized short-term *in  
vivo* study design and data analysis  
procedures to develop transcriptomic-  
based toxicity values for data poor  
chemicals. The review will take place  
between April and July 2023.  
Submission of nominations should be  
made via the BOSC website at: [https://  
www.epa.gov/bosc](https://www.epa.gov/bosc).  
**DATES:** Nominations should be  
submitted by March 3, 2023, per  
instructions below.  
**FOR FURTHER INFORMATION CONTACT:** Any  
member of the public needing  
additional information regarding this  
Notice and Request for Nominations

<https://www.federalregister.gov/documents/2023/02/13/2023-03018/request-for-public-nominations-of-experts-to-serve-on-a-review-panel>

# So... The Question is Do We Lack the Data or Need a Change in Perspective to Use New Approaches?





# Acknowledgements

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

### Tox21 Colleagues:

DTT/NTP  
FDA  
NCATS

### EPA Colleagues:

CEMM  
CPHEA  
CESER  
OCSP

### Collaborative Partners:

Unilever  
A\*STAR  
ECHA  
EFSA  
Health Canada



Research Triangle Park, NC



Duluth, MN



Washington, DC



Cincinnati, OH



Athens, GA



Gulf Breeze, FL