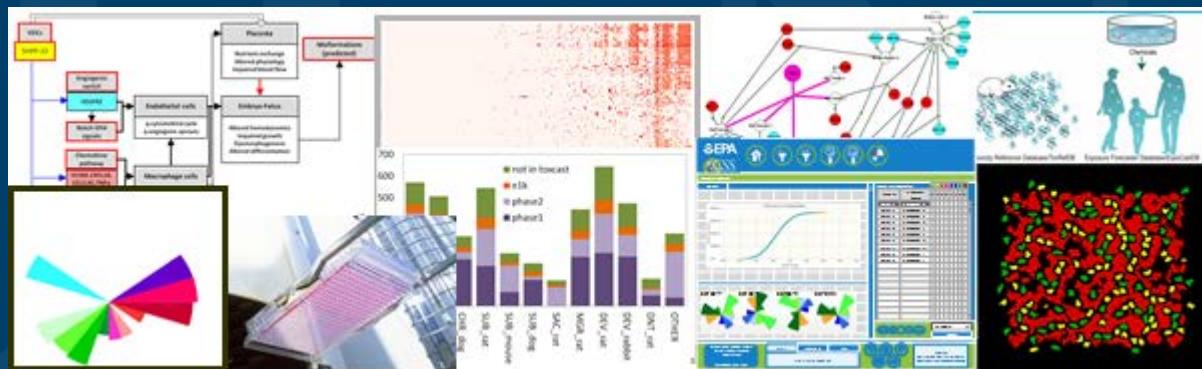


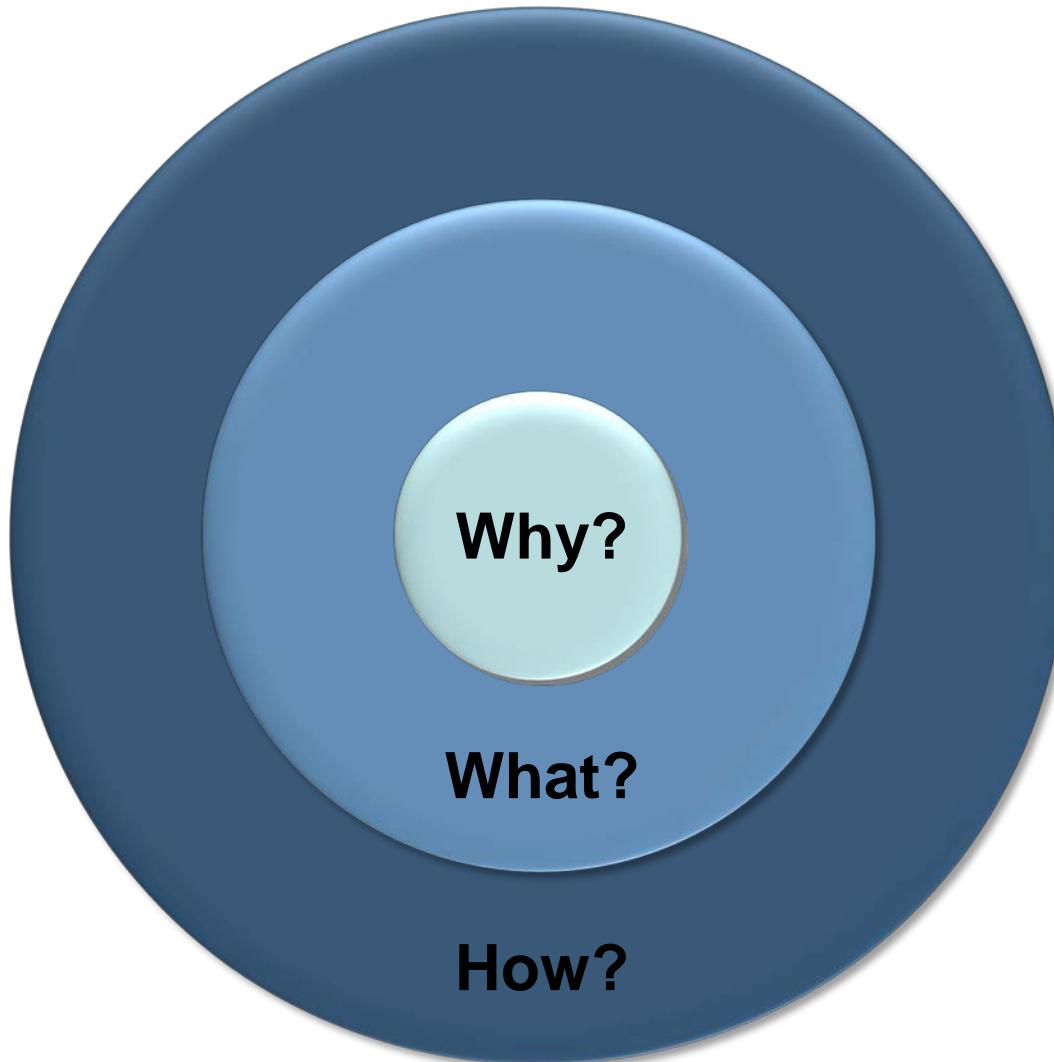
ToxCast and the Use of Human Relevant *In Vitro* Exposures: Incorporating high-throughput exposure and toxicity testing data for 21st century risk assessments



BTS
April 4, 2017

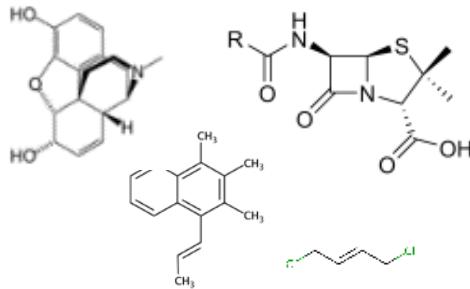
Russell Thomas
Director
National Center for Computational Toxicology

Using the ‘Golden Circle’ for the Transition to 21st Century Risk Assessment



Understanding ‘Why’ We Need to Innovate In This Space...

Number of Chemicals /Combinations

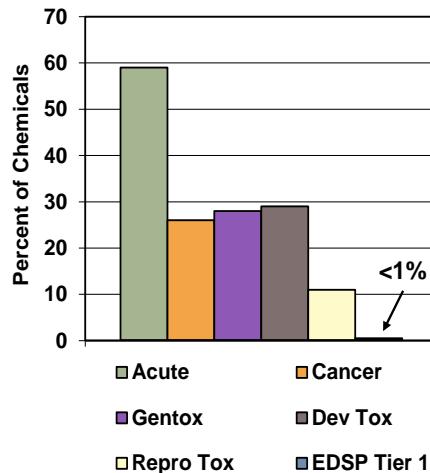


Ethics Concerns



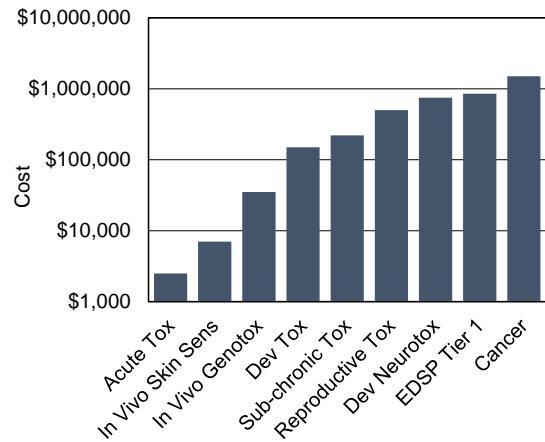
Why?

Lack of Data

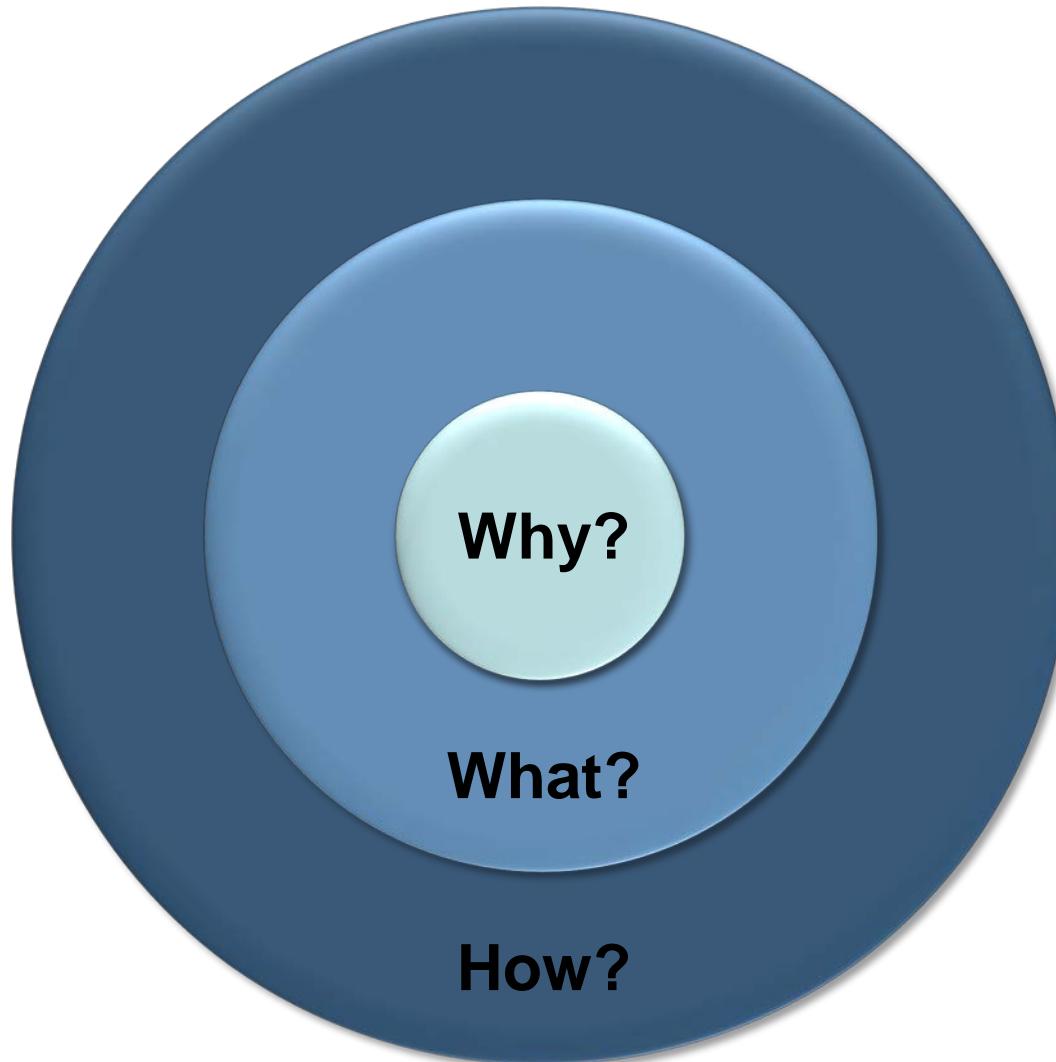


Modified from Judson *et al.*, EHP 2010

Economics



'Golden Circle' of 21st Century Risk Assessment



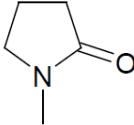
Risk Assessments Generally Contain a Standard Set of Components

 United States Environmental Protection Agency EPA Document # 740-R1-5002 March 2015 Office of Chemical Safety and Pollution Prevention

TSCA Work Plan Chemical Risk Assessment

N-Methylpyrrolidone:
Paint Stripper Use

CASRN: 872-50-4



March 2015

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Phys Chem
Exposure
Hazard
Dose Response,
PK, and PODs

New technologies and approaches will also have to cover these basic components

**Variability
Risk Summary
Uncertainty**

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It All Starts With Chemistry...

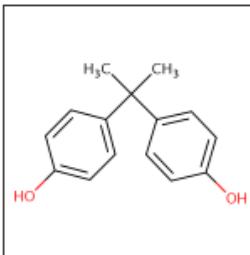
CompTox Dashboard | Bis... CompTox Dashboard | Bis...

https://comptox.epa.gov/dashboard/dsstoxdb/calculation_details?model_id=18&search=20182

20182 Save Report

NCCT Models: Melting Point

Bisphenol A
80-05-7 | DTXSID020182

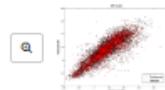


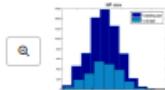
The chemical structure of Bisphenol A is shown, featuring a central carbon atom bonded to two methyl groups (CH_3) and two hydroxyphenyl groups. Each hydroxyphenyl group consists of a benzene ring with a hydroxyl group (OH) at one position.

Model Results

Predicted value: 144 °C
Global applicability domain: Inside ⓘ
Local applicability domain Index: 0.91 ⓘ
Confidence level: 0.65 ⓘ

Model Performance



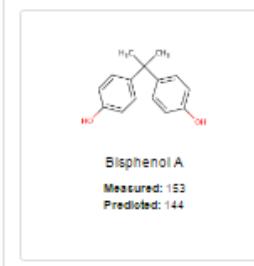


Weighted KNN model

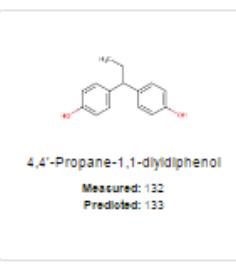
QMRF

6-fold CV (76%)		Training (76%)		Test (25%)	
Q2	RMSE	R2	RMSE	R2	RMSE
0.72	51.8	0.74	50.3	0.73	52.7

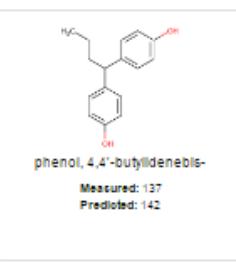
Nearest Neighbors from the Training Set



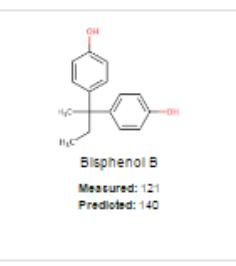
Bisphenol A
Measured: 153
Predicted: 144



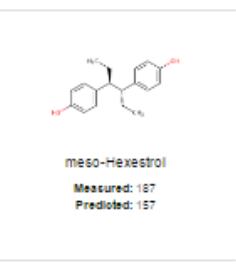
4,4'-Propane-1,1-diyldiphenol
Measured: 132
Predicted: 133



phenol, 4,4'-butyldienebis-
Measured: 137
Predicted: 142



Bisphenol B
Measured: 121
Predicted: 140



meso-Hexestrol
Measured: 157
Predicted: 157

About

Contact

CompTox

DSTox

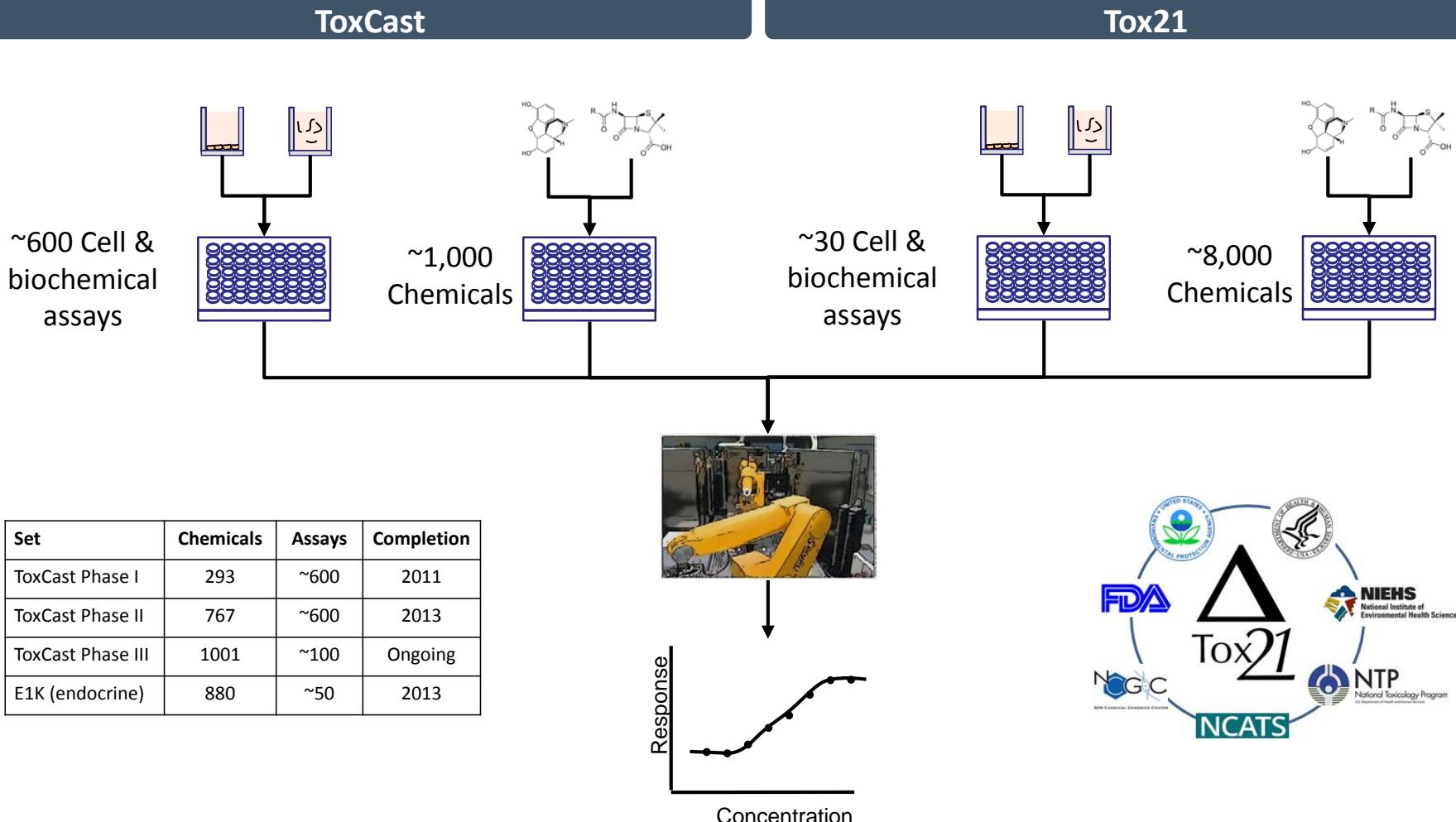
Privacy

Accessibility

Help

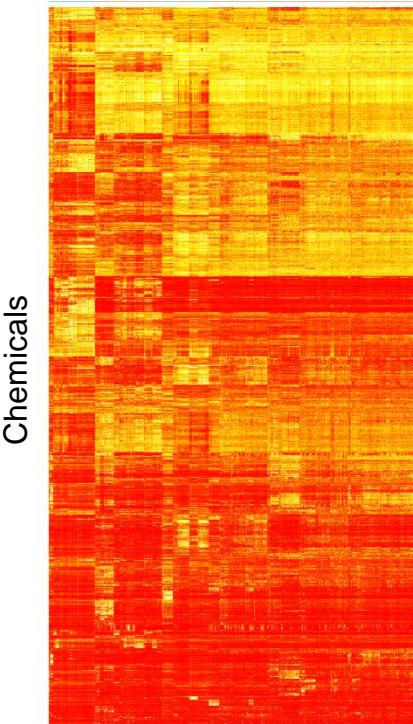
National Center for
Computational Toxicology

Adding the High-Throughput Hazard Screening Component



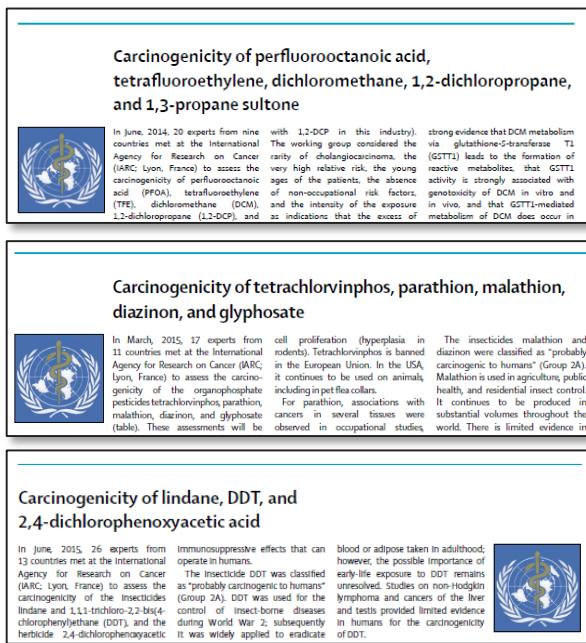
Broad Success Derived from High-Throughput Screening Approaches

Group Chemicals by Similar Bioactivity and Predictive Modeling



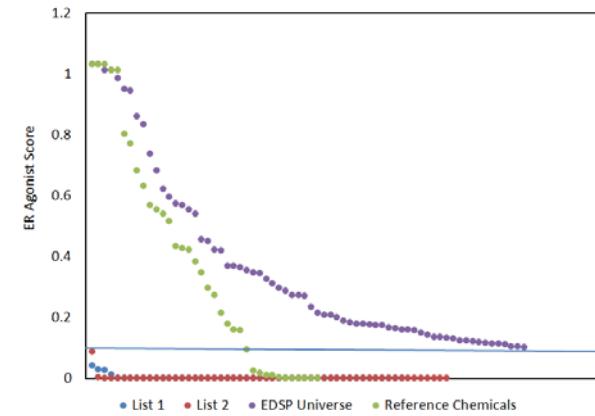
Assays/Pathways

Provide Mechanistic Support for Hazard ID



IARC Monographs 110, 112, 113

Prioritization of Chemicals for Further Testing



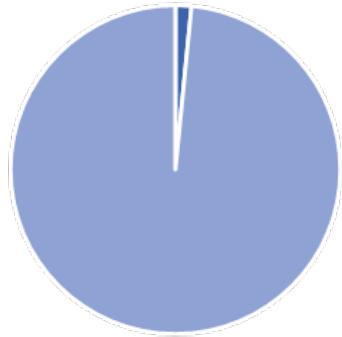
FIFRA SAP, Dec 2014

Selected Criticisms of ToxCast

- You don't include metabolism in your *in vitro* assays
- You don't measure my favorite endpoint
- You don't cover all of biological space
- *In vitro* assays are not normal biology
- Assay (x) in your battery did not get the right answer for my chemical
- My assay disagrees with your assay (x), so your approach is flawed
- You can't test my favorite chemicals because of limitations in your methods (e.g., solvents, high LogP)
- Your assay descriptions do not allow me to reproduce your results
- I get different answers when I analyze your data

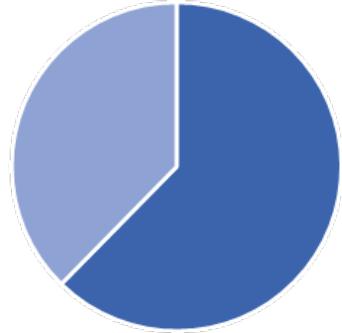
Beginning to Address Concerns for Increased Biological Coverage

Gene Coverage

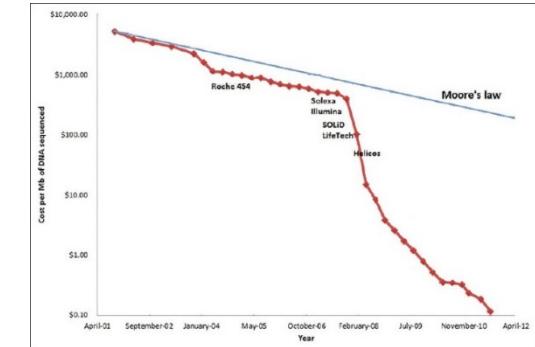


■ ToxCast
■ Not in
ToxCast

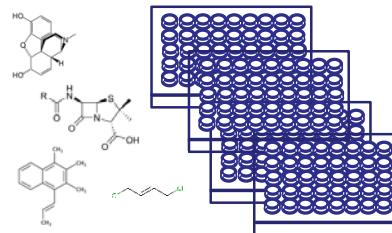
Pathway Coverage*



*At least one gene from
pathway represented



Thousands of chemicals



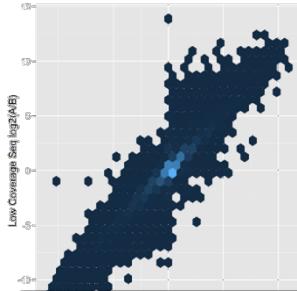
Multiple Cell Types



Requirements:

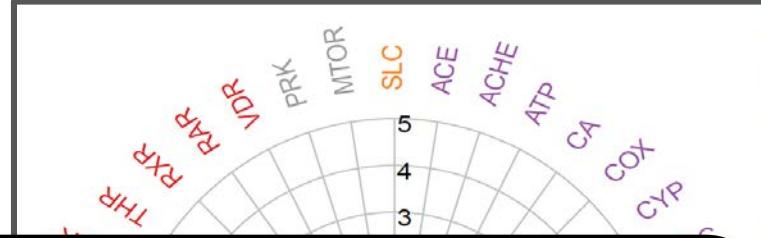
- Low cost
- Whole genome
- 384 well
- Automatable

Comparing Sequencing Platforms and Developing Analysis Approach



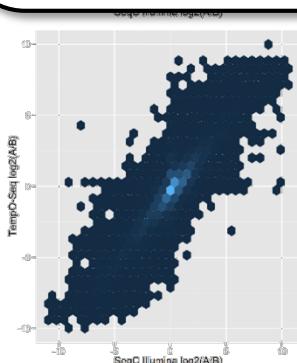
TruSeq
 r^2 0.74

MOA/MIE Analysis Pipeline



COMING
SOON!

- Large scale screen of 1,000 chemicals (ToxCast I/II) in single cell type this summer
- Additional screens across multiple cell types/lines
- Additional reference chemicals and genetic perturbations (RNAi/CRISPR/cDNA)



Low Coverage
 r^2 0.83



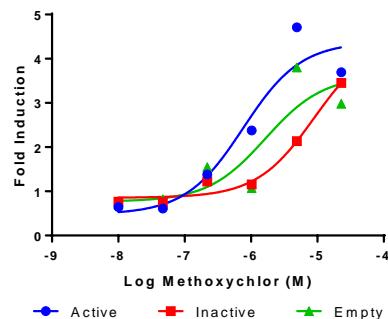
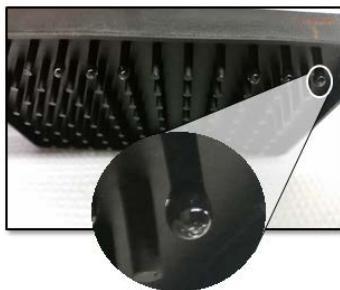
Currently capable of assigning to >40 MOAs/MIEs based on transcriptional responses

Beginning to Address Metabolic Competence

“Extracellular” Approach



Chemicals metabolism in the media or buffer of cell-based and cell-free assays

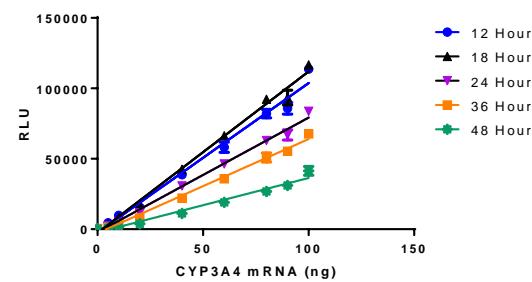
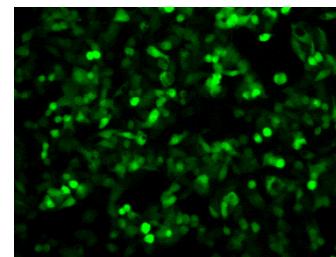


More closely models effects of hepatic metabolism and generation of circulating metabolites

“Intracellular” Approach



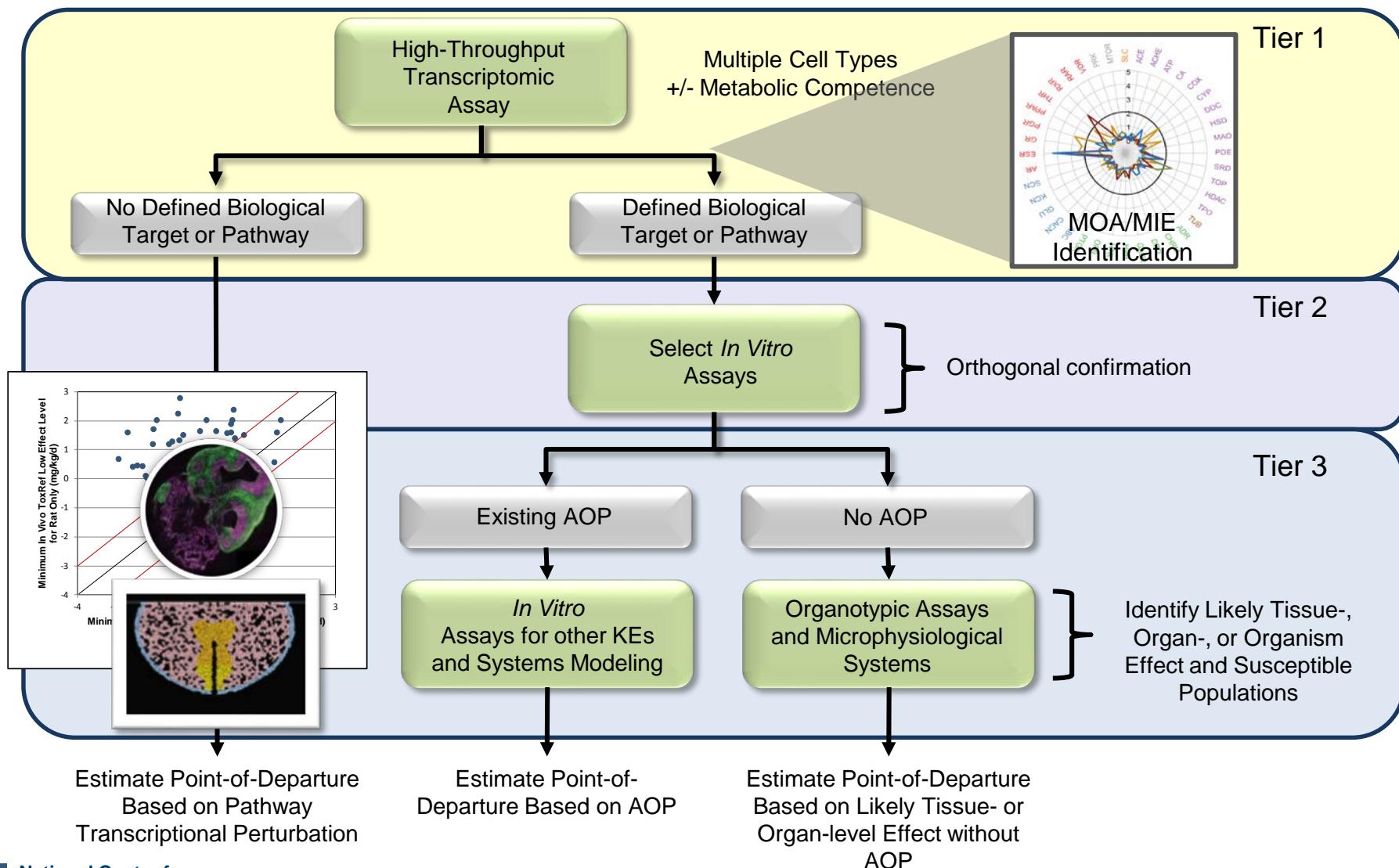
Capable of metabolizing chemicals inside the cell in cell-based assays



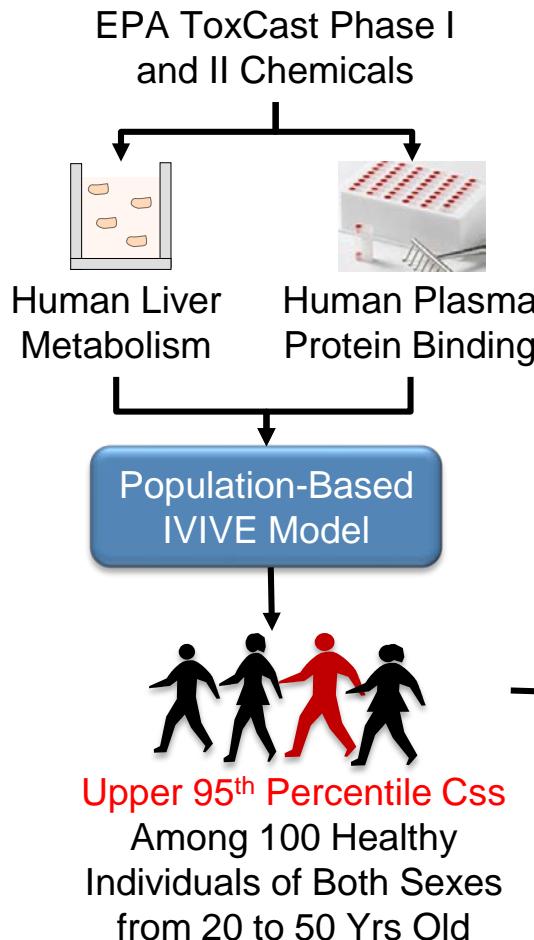
More closely models effects of target tissue metabolism

Integrated approach to model *in vivo* metabolic bioactivation and detoxification

Framework for Integrating Hazard Components...

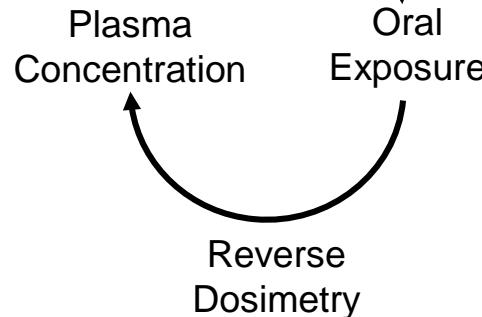


Adding the High-Throughput Toxicokinetic Component



- Currently evaluated ~700 ToxCast Phase I and II chemicals
- Models available through “httk” R package (<https://cran.r-project.org/web/packages/httk/>)

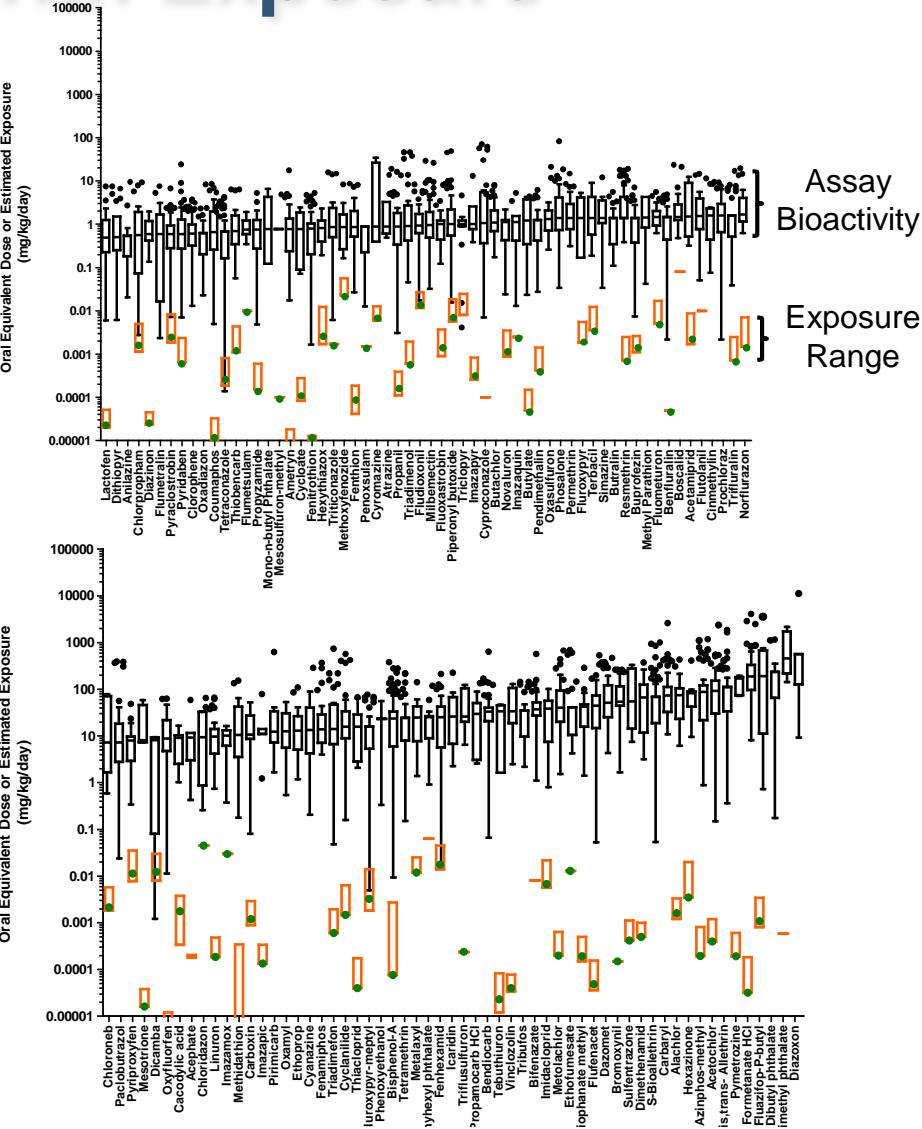
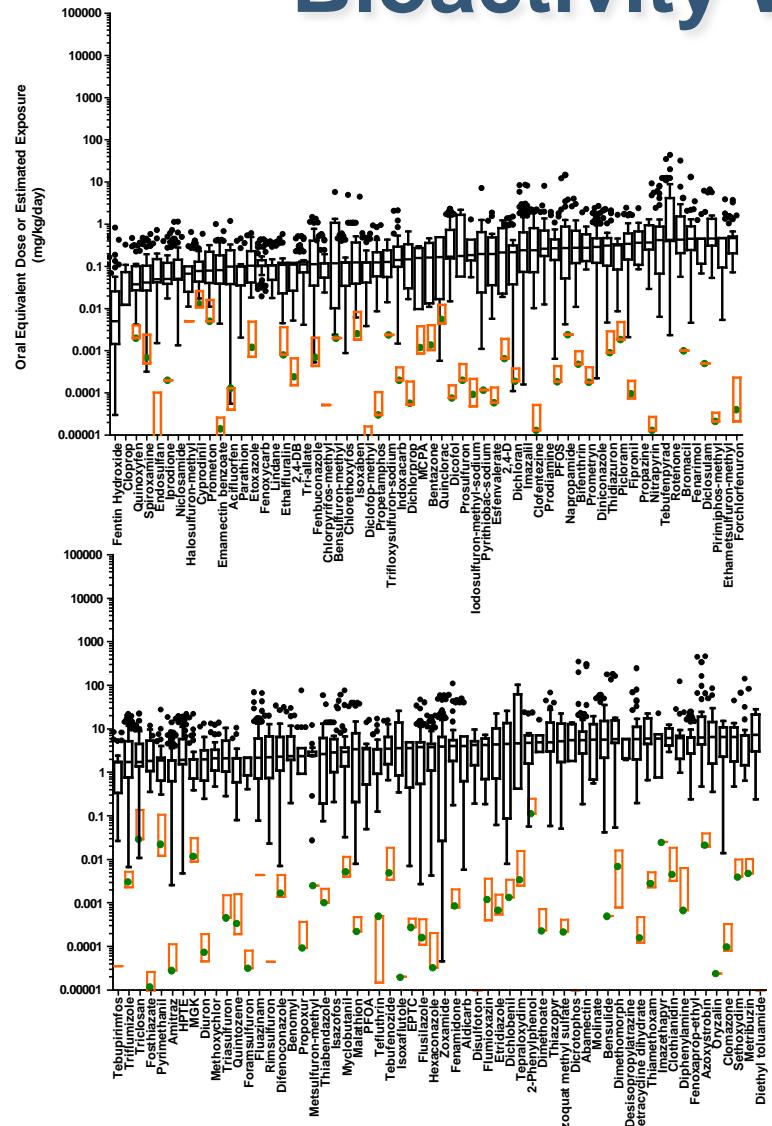
In Vitro Potency Value



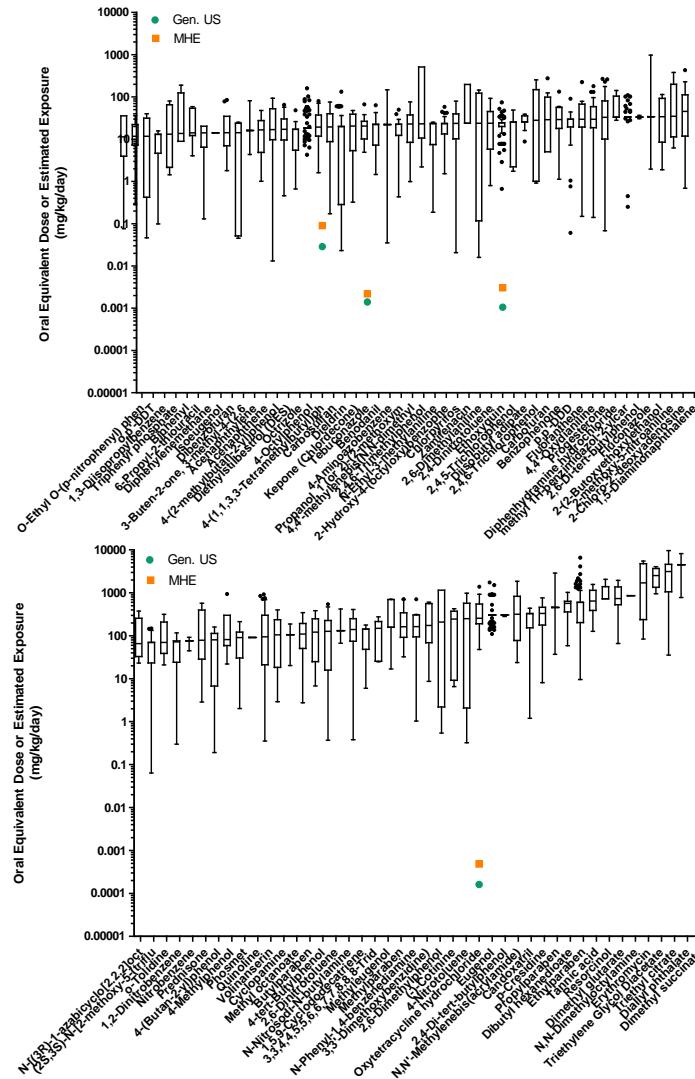
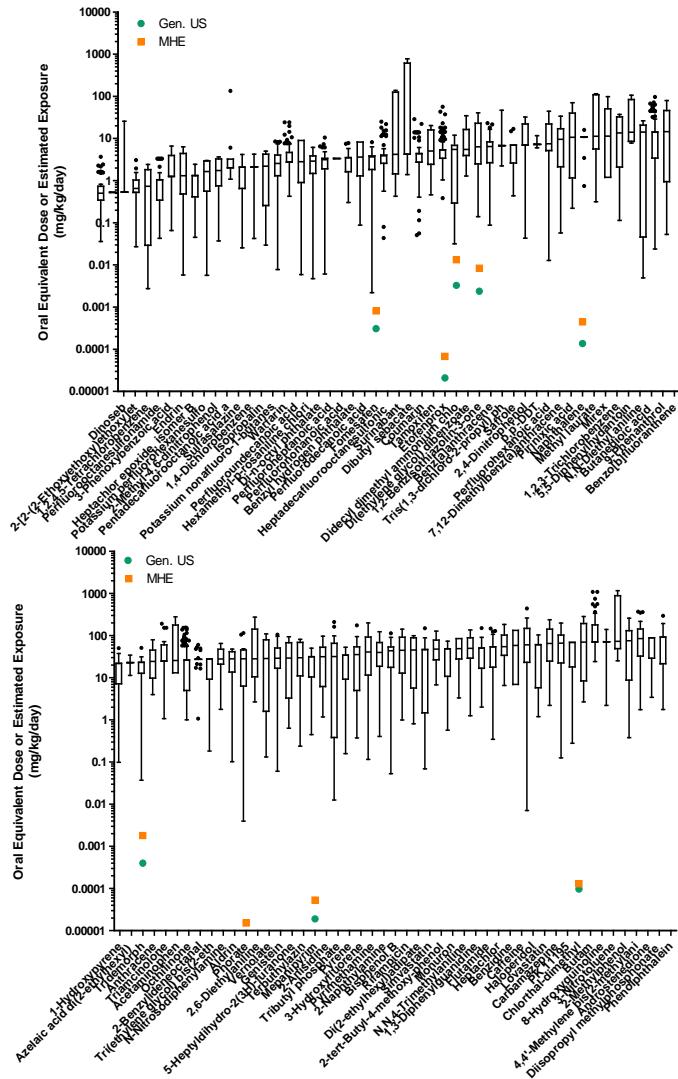
Oral Dose Required
to Achieve Steady
State Plasma
Concentrations
Equivalent to *In Vitro*
Bioactivity

Rotroff et al., *Tox Sci.*, 2010
Wetmore et al., *Tox Sci.*, 2012

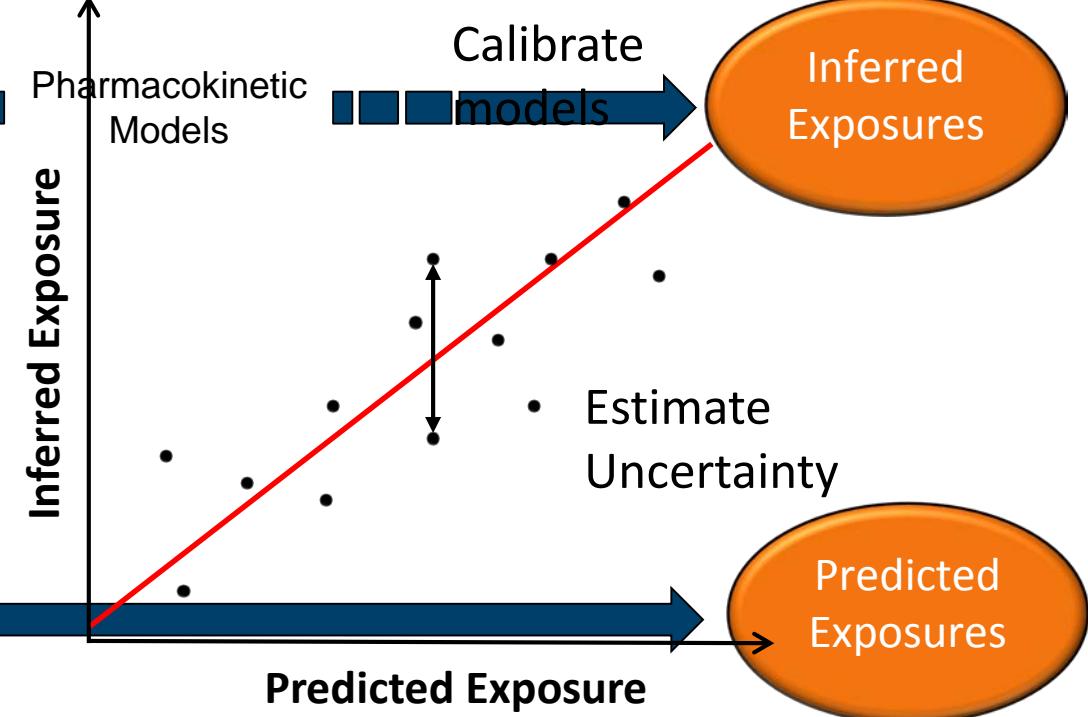
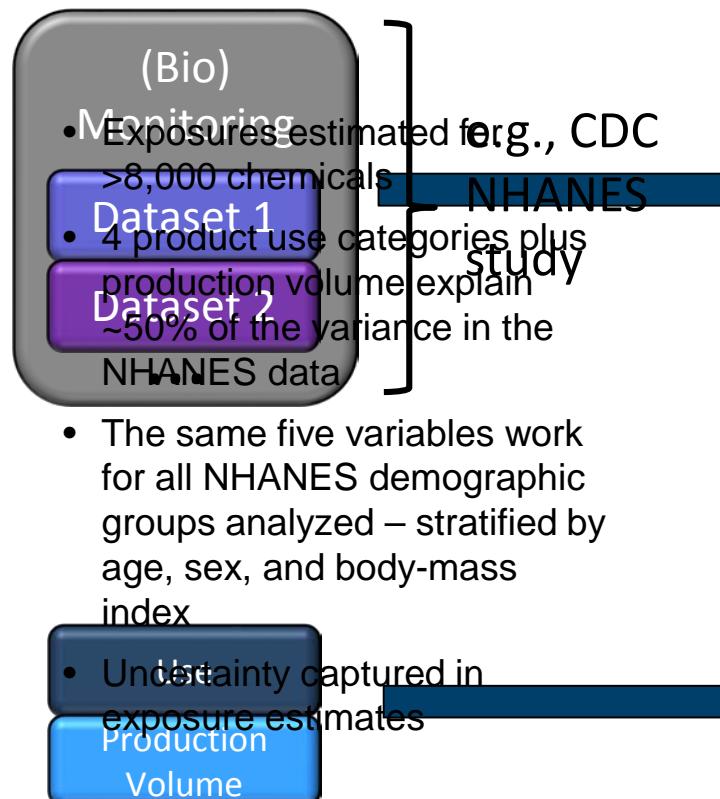
Comparing Dosimetry Adjusted Bioactivity with Exposure



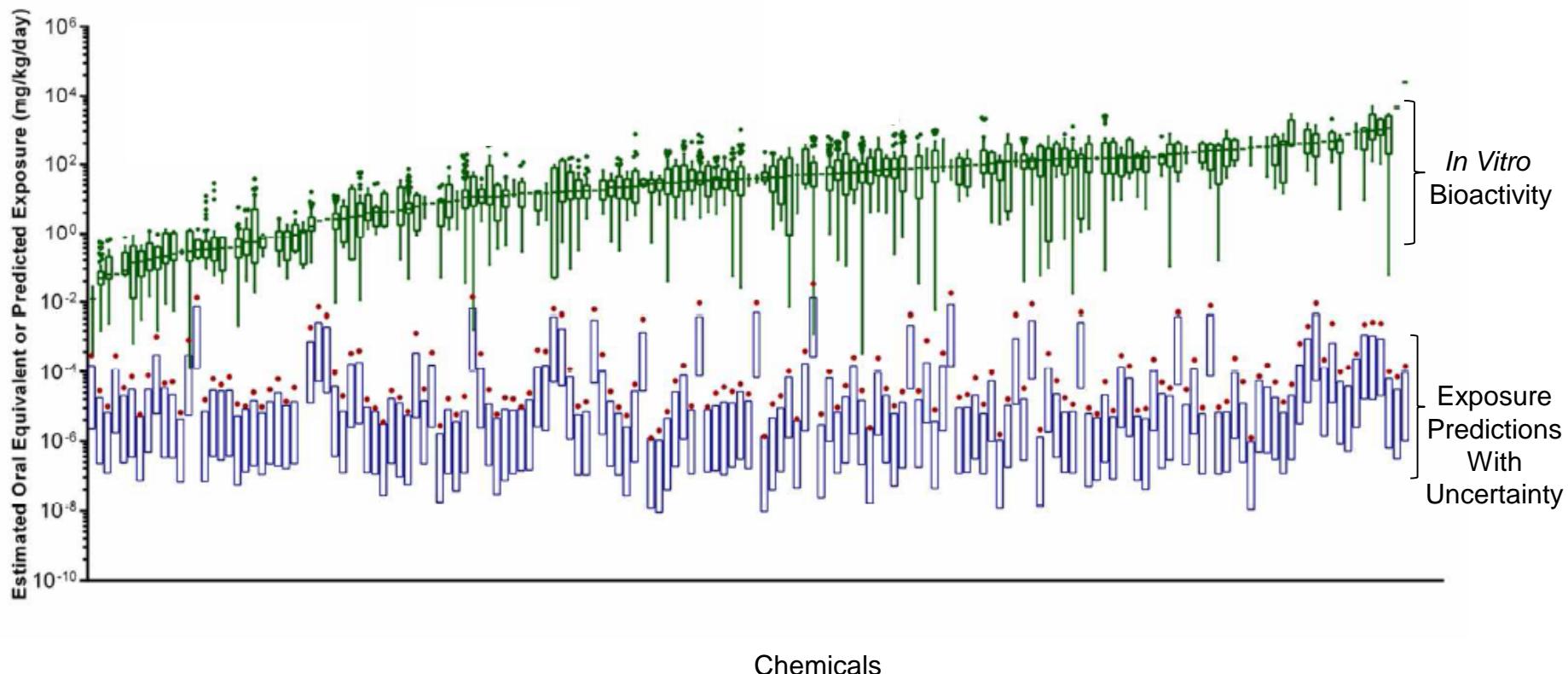
But, Exposure Information is Lacking on Most Chemicals



Adding the High-Throughput Exposure Component



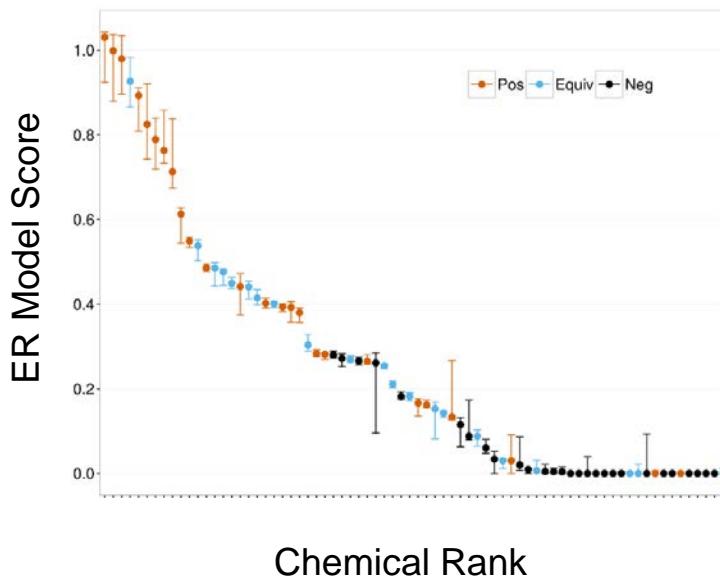
Comparing Bioactivity with Exposure Predictions for Risk Context



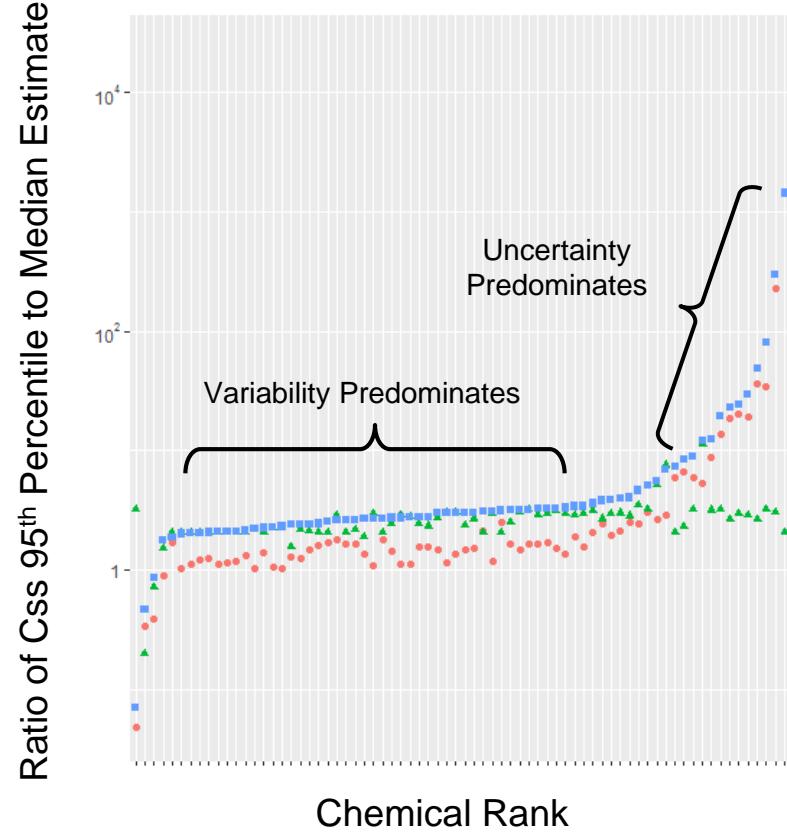
Wetmore *et al.*, *Tox Sci.*, 2015

Adding in Uncertainty and Variability for PD and PK

Propagation of Experimental Uncertainty in Models of ER Potency



Propagation of Experimental Uncertainty in High-Throughput Toxicokinetic Estimates



Covering All the Components of a 21st Century Risk Assessment

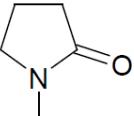
EPA
United States
Environmental Protection Agency

EPA Document# 740-R1-5002
March 2015
Office of Chemical Safety and
Pollution Prevention

TSCA Work Plan Chemical Risk Assessment

N-Methylpyrrolidone:
Paint Stripper Use

CASRN: 872-50-4



March 2015

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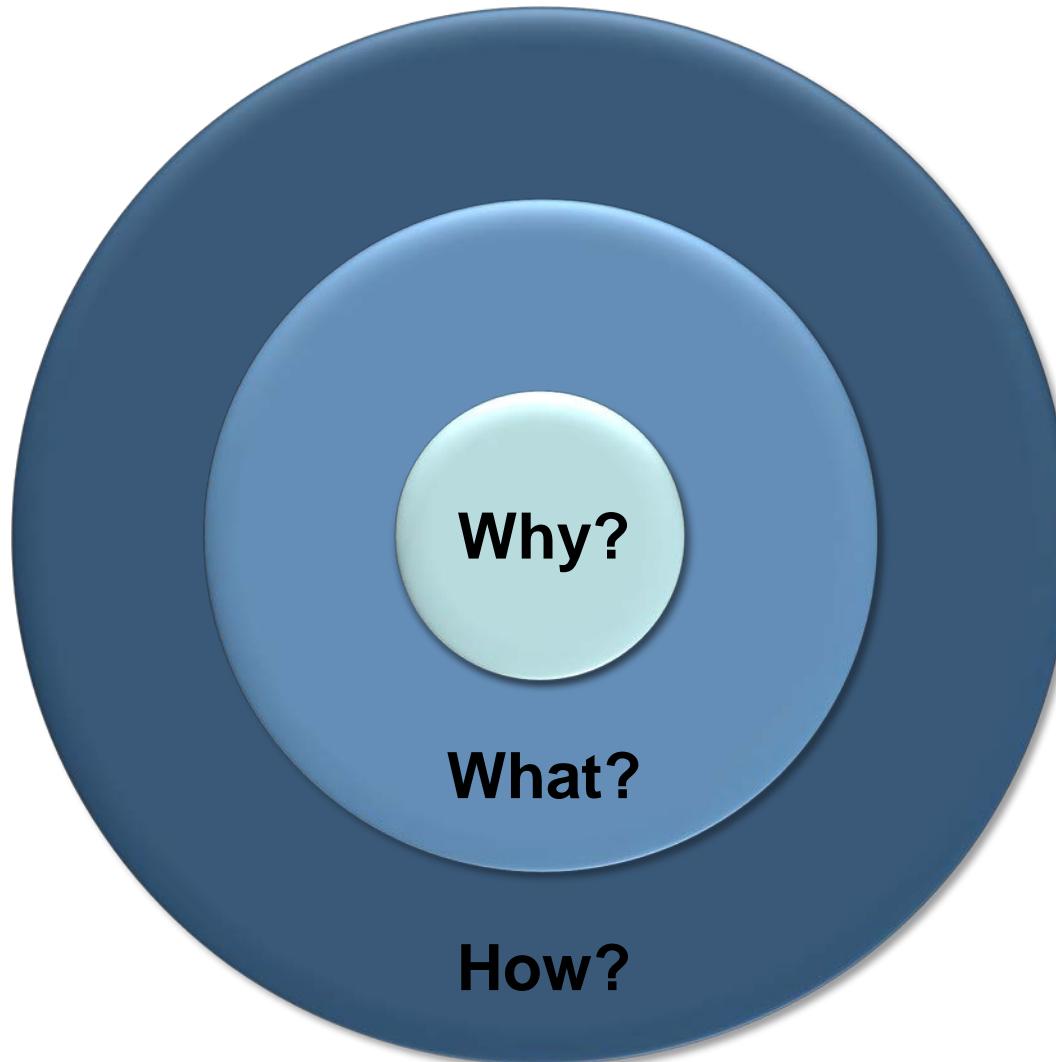
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Hazard
Exposure
Dose Response,
Phys Chem
PK, and PODs

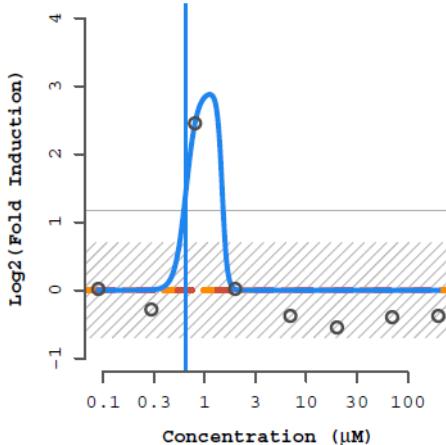
Variability ✓
Risk Summary ✓
Uncertainty ✓

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'Golden Circle' of 21st Century Risk Assessment



Regulatory Applications Require More Focus on Quality and Transparency



ASSAY: AEID117 (ATG ERA_TRANS)

NAME: Thioglycolic acid
CHID: 26141 CASRN: 68-11-1
SPID(S): TX007664
L4ID: 420385

HILL MODEL (in red):

tp	ga	gw
3.1e-11	-2.15	0.416
NaN	NaN	NaN

GAIN-LOSS MODEL (in blue):

tp	ga	gw	la	lw
2.93	-0.184	8	0.173	18
3.56	0.334	9.48	5.82	814

CNST HILL GNL8
AIC: 20.14 26.14 17.79
PROB: 0.23 0.01 0.76
RMSE: 0.92 0.92 0.32

MAX_MEAN: 2.45 MAX_MED: 2.45 BMAD: 0.233
COFF: 1.17 HIT-CALL: 1 FITC: 50 ACTP: 0.77

FLAGS:
Only one conc above baseline, active
Borderline active

- Public release of Tox21 and ToxCast data on PubChem and EPA web site (raw and processed data)
- Publicly available ToxCast data analysis pipeline
 - Data quality flags to indicate concerns with chemical purity and identity, noisy data, and systematic assay errors
- Tox21 and ToxCast chemical libraries have undergone analytical QC and results publicly available
- Public posting of ToxCast procedures
 - Chemical Procurement and QC
 - Data Analysis
 - Assay Characteristics and Performance
- External audit on ToxCast data and data analysis pipeline
- Migrating ToxCast assay annotations to OECD 211 compliant format

Application to Regulatory Decisions for Endocrine Screening

Prioritization of the EDSP Universe of Chemicals

Prioritization of the Endocrine Program Universe of Chemical Receptor Adverse Outcome Computational Toxicology

U.S. Environmental Protection Agency Endocrine Disruptor Screening Program

Jointly developed by:

Office of Chemical Safety and Pollution Prevention
Office of Science Coordination and Policy (OSCP)
Office of Pesticide Programs (OPP)
Office of Pollution Prevention and Toxics (OPPT)

Office of Water (OW)
Washington, DC 20460

Office of Research and Development (ORD)
National Environmental and Effects Health Research
Mid-Continent Ecology Division (MED), Duluth, MN
Toxicity Assessment Division (TAD), RTP, NC 27111

National Center for Computational Toxicology (NCC)
Research Triangle Park, NC 27709

December 2012

Integrated Bioactivity and Exposure Ranking

Integrated Bioactivity and Exposure Ranking: A Computational Approach for the Identification and Screening of Chemicals in Endocrine Disruptor Screens

Environmental Protection Agency Endocrine Disruptor Screening Program

Exposure SAP White Paper

New High-throughput Methods to Estimate Chemical Exposure

Scientific Advisory Panel Meeting, July 2014

SAP December 2-5

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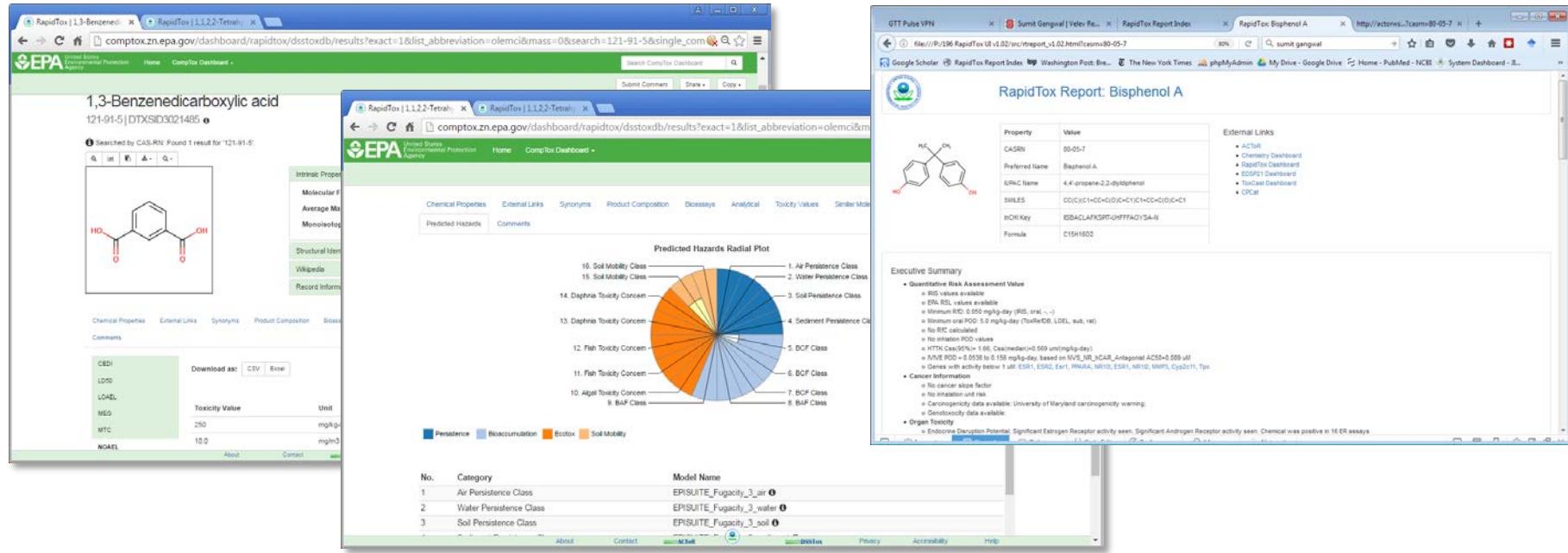
Exposure SAP White Paper

New High-throughput Methods to Estimate Chemical Exposure

Scientific Advisory Panel Meeting, July 2014

SAP December 2-5

Beginning Application to Quantitative Risk Assessment Through New ‘RapidTox’ Dashboard



- Semi-automated decision support tool with dashboard interface for high-throughput risk assessments
- Integrate a range of information related to chemical properties, fate and transport, hazard, and exposure
- Transparent and interactive enough to enable expert users to review the assumptions made and refine the predictions
- Deliver quantitative toxicity values with associated estimates of uncertainty

Thank You for Your Attention!

Tox21 Colleagues:

NTP Crew

FDA Collaborators

NCATS Collaborators

EPA Colleagues:

NERL

NHEERL

NCEA

Collaborators:

Unilever



EPA's National Center for Computational Toxicology