

#### Filling in the Gaps: The Role Functional Genomics Can Play in 21<sup>st</sup> Century Toxicology



SOT Symposium: Effectively Leveraging Cellular Functional Genomics Strategies for Elucidating Chemical Mechanisms of Action March 13, 2018

Keith Houck National Center for Computational Toxicology



# I have no conflicts of interest to disclose!

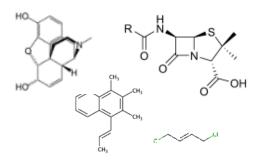
The views expressed in this presentation are those of the author and do not necessarily reflect the views or policies of the U.S. EPA





### Acknowledged Need to Innovate in Toxicology

## Number of Chemicals/Combinations

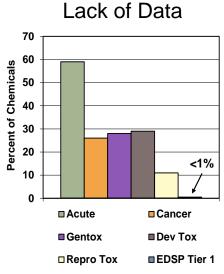




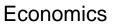
#### **Ethical Concerns**

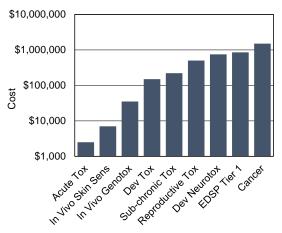


National Center for Computational Toxicology



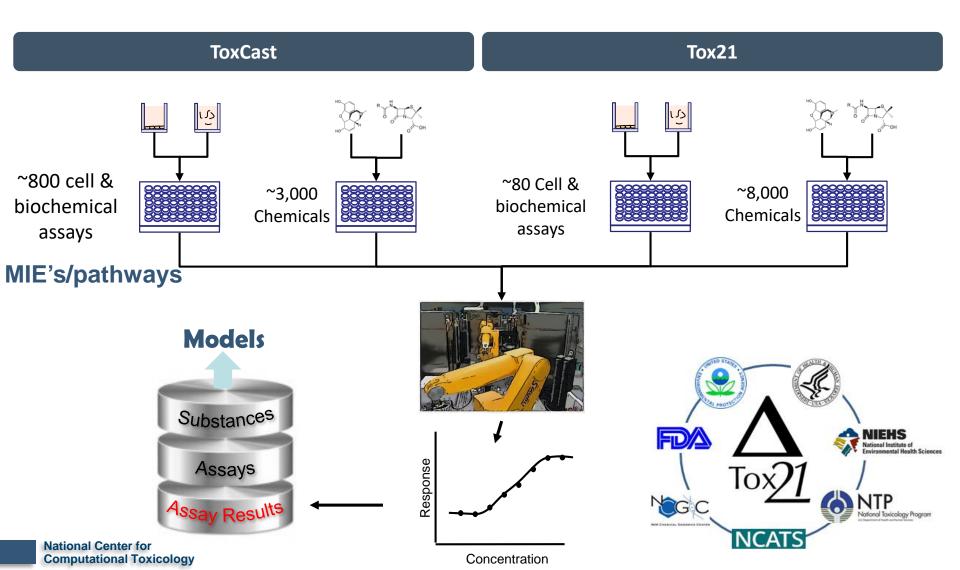
Modified from Judson et al., EHP 2010







## One Approach: High-Throughput Hazard Screening

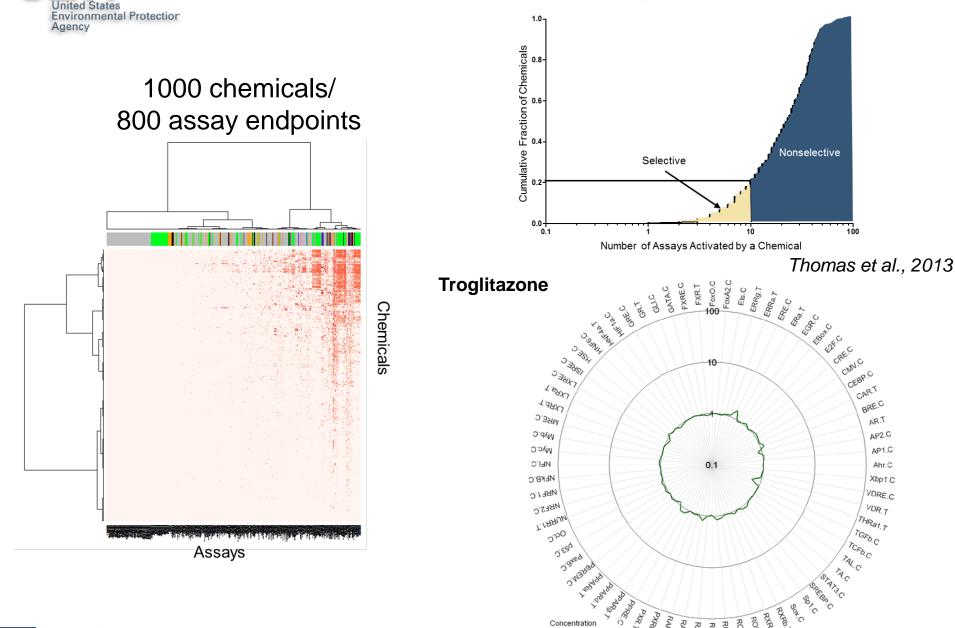




## **Challenges Encountered**

- Promiscuous chemical-target interactions
  - -Which are toxicologically relevant?
  - -How do we identify assay artifacts?
- Limited biological/toxicological diversity screened
  —Thousands of possible MIE's
  —Hundreds of biological pathways

#### **Promiscuous Chemical Response is the Rule**



**National Center for Computational Toxicology**  RXRD.T

RXRa.T

ROR9.T RORE.C

RORb.T

Ptp.7 PXRE.C

lmN

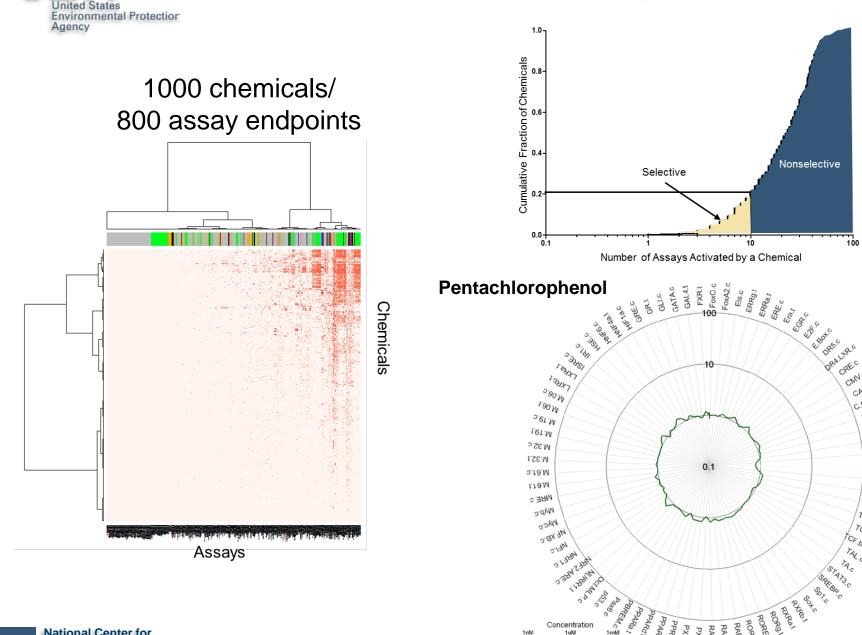
Concentration

RARE.C

RARa.T

RARb.T RARg.T

#### **Promiscuous Chemical Response is the Rule**



**National Center for Computational Toxicology**  100

CRE.C

CMN.C

CAR!

C.EBP.C

BRE.C

AR.I

AP.2.0

AP.1.C

Ahr.c

Xbp1.c

VDRE.c

VDR.1

THRa1.t

TGFb.c

TCF.b.cal.c

TAL.C

KA.C

ROR9.

RORE.C

RORb. RAR9.

RARb.

PARd1

Concentration

1.044

PPARg. PPRE

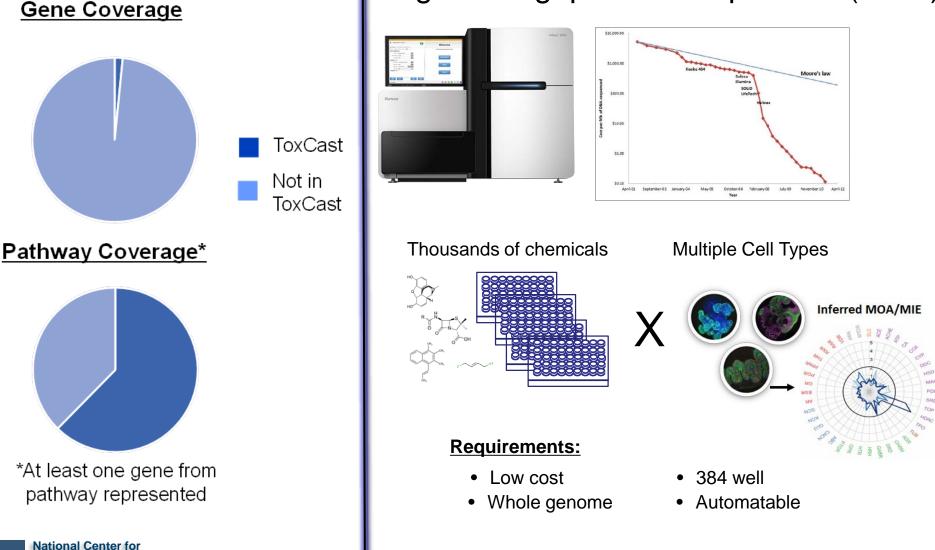
PXR.c RARa. PXR.



**Computational Toxicology** 

## Beginning to Address Concerns for Increased Biological Coverage

High-throughput transcriptomics (HTTr)





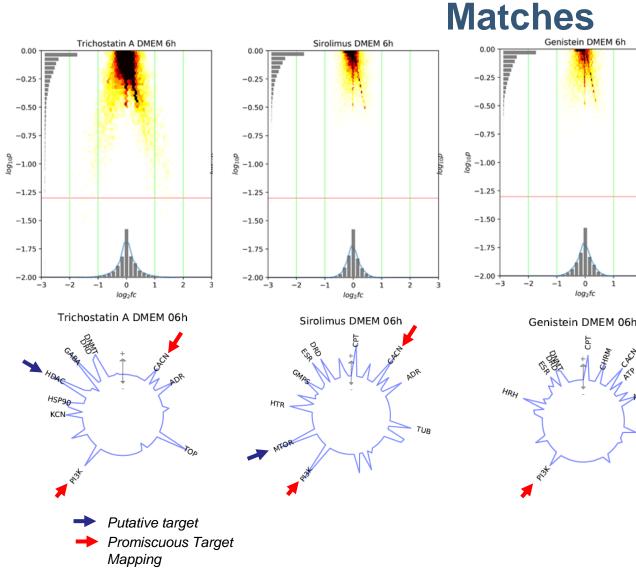
#### **Connectivity Mapping (CMAP) Demonstrates Multiple Pathway**

0

log<sub>2</sub>fc

1

ż

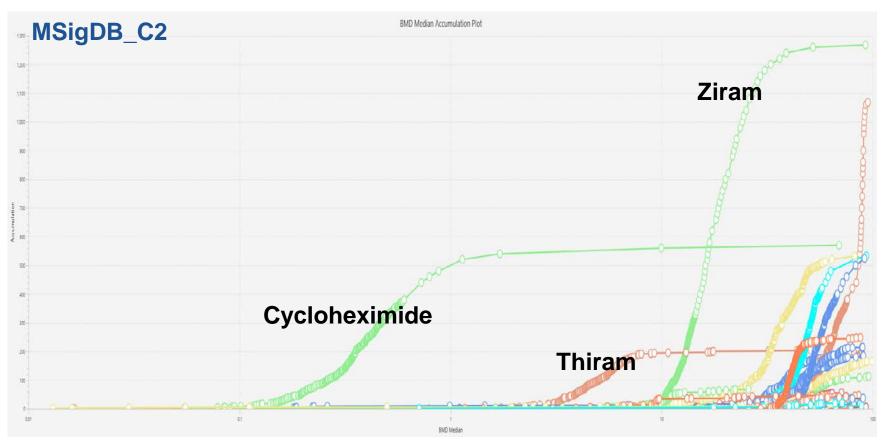


- Differential gene expression observed with reference chemicals
- Putative targets identified using Connectivity Mapping
- Large degree of promiscuity of predicted targets observed
- Currently evaluating additional methods for MIE prediction

**National Center for Computational Toxicology**  Imran Shah, NCCT, preliminary/unpublished



#### Pathway Potencies by Benchmark Dose (BMD) Analysis: Similar Issues



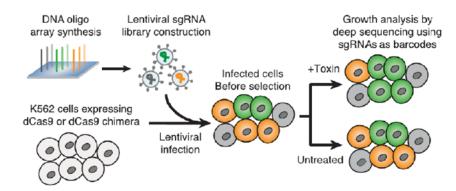
• Broad range of pathway level potency estimates and number of pathways affected across chemicals.

National Center for Computational Toxicology Josh Harrill, NCCT, preliminary/unpublished



# Functional genomics: Help with Defining Mechanistic Relevancy?

- Most chemicals have apparent polypharmacology—what is the critical/relevant MOA?
  - -Could use potency to define but this may not be linked to adversity
  - -Transcriptomics is high content but function is generally inferred
- Functional genomics allows for bridging between genotype and phenotype
- Previously mostly used in prokaryotic systems such as S. cerevisiae
- Advent of CRISPR-Cas9 opens door for higher throughput applications in mammalian cells



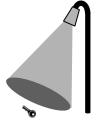
Gilbert et al., Cell, 2014

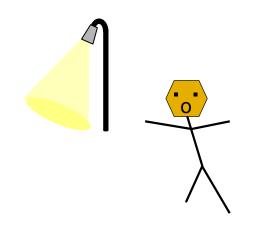


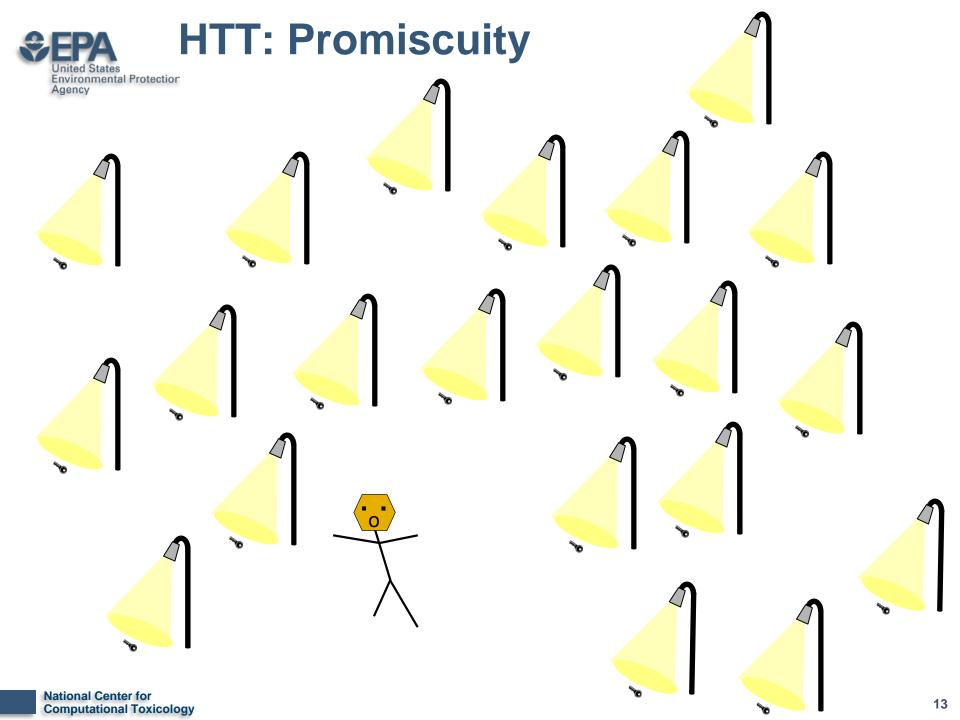
## **Advantages of Functional Assays**

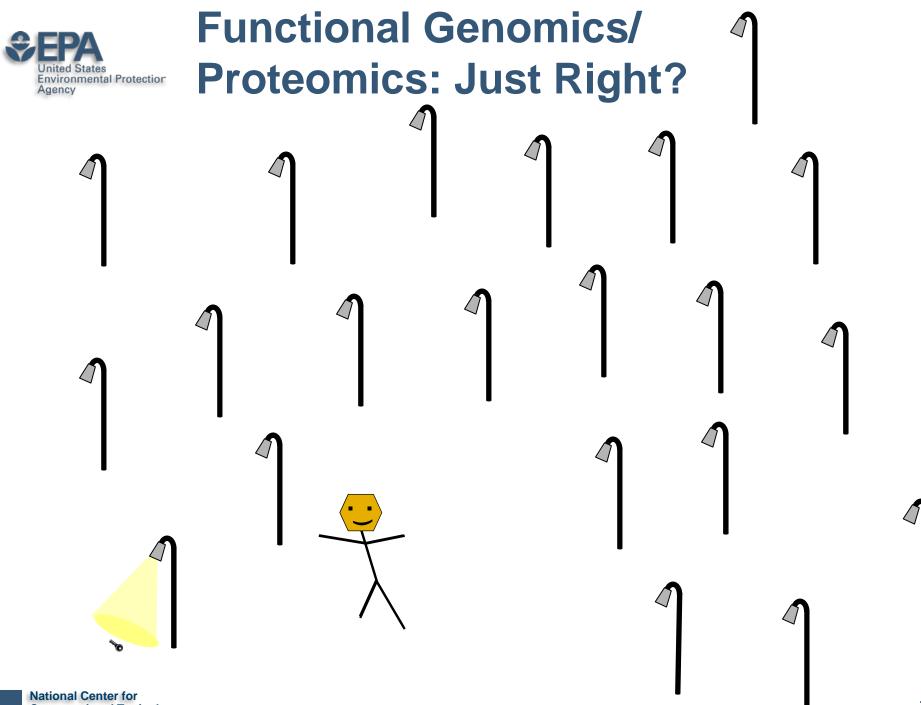
- Non-targeted approach--unbiased (*relatively*)
- Genomics
  - -Full genome/proteome
  - -Critical interactions drive functionality measured
  - -Pathway mapping may be necessary (one-to-many problem)
- Chemical Proteomics
  - Full proteome
  - Direct chemical:target interaction
  - Measured in context of cell milieu
  - Identification of MIEs











Computational Toxicology



#### Pathway to Integration of Functional Genomics into Environmental Risk Assessment

- More proof-of-concept and validation studies with wellcharacterized toxicants
- Development of assay technology that facilitates expansion of functional endpoints beyond cell viability
  - cell line engineering of pathway reporter lethality assays, sorting on reporter gene expression, sorting/single cell RNA sequencing, etc.
  - in vivo assays in organisms suited to HTT such as C. elegans or Danio rerio
- Use of physiologically relevant cells and cell systems



- The Use of CRISPR-Cas9 Technology for Validation and De-Validation of Targets from Functional Genomics Peter Newham, AstraZeneca, Cambridge, United Kingdom.
- CRISPR Genetic Screens on Cellular Stress Response to Proteo-Toxicants. Quan Lu, Harvard T.H. Chan School of Public Health, Boston, MA.
- Genome-Wide CRISPR-Cas9 Screens in Human Cell Lines Provide Novel Mechanistic Insights into Toxic Responses to Arsenic and Acetaldehyde Amin Sobh, University of California Berkeley, Berkeley, CA.
- Pooled Genome-Wide Screens as a Powerful Tool for Studying Drug Mechanism of Action in Cancer. Federica Piccioni, Broad Institute of MIT and Harvard, Cambridge, MA.
- Development of a Hybrid Chemical Proteomics Platform for Proteome-Wide Identification of Protein Targets of Environmental Chemicals. David Ross Hall, University of Toronto, Toronto, ON, Canada.

#### Panel Discussion

National Center for Computational Toxicology