

*KUMC Industrial Toxicology Lecture Series*  
*February 22, 2023*



# **Life as Researcher at the US EPA**

*A little about me, the Agency, and some data..*

**Brian N. Chorley, PhD**

Office of Research and Development  
Center for Computational Toxicology and Exposure  
Research Triangle Park, NC, USA

# Disclaimer

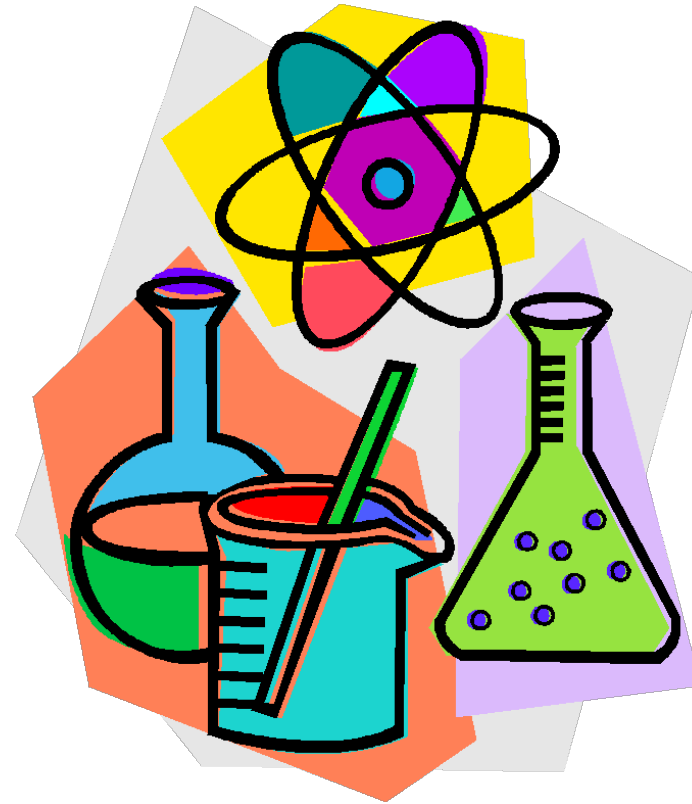
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*This presentation does not necessarily reflect EPA policy. Mention of trade names or commercial products does not constitute endorsement or recommendation for use.*



*About me...*

Where did you first learn to love science?



1976-1994

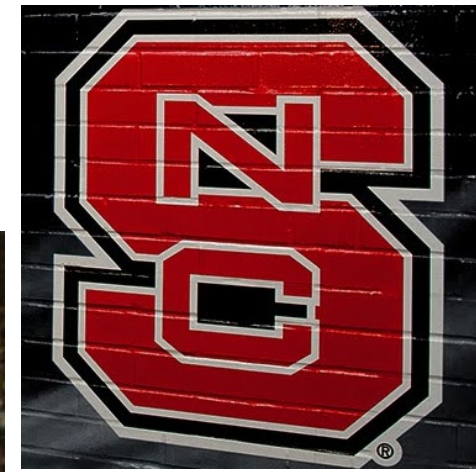


*Camp Lejeune Marine Corps base*

*Jacksonville High School, NC*



1994-1998



*Polk Hall, Animal Science*

1999-2005



*College of Veterinary Medicine, Comparative  
Biomedical Sciences*



*Pylon Park*



*Ken Adler*

**DIFFERENTIAL MUCIN SUBTYPE REGULATION AND ANTI-INFLAMMATORY  
EFFECTS OF INDUCIBLE NITRIC OXIDE SYNTHASE IN STIMULATED  
AIRWAY EPITHELIAL CELLS *IN VITRO***

by

**BRIAN NORRIS CHORLEY**



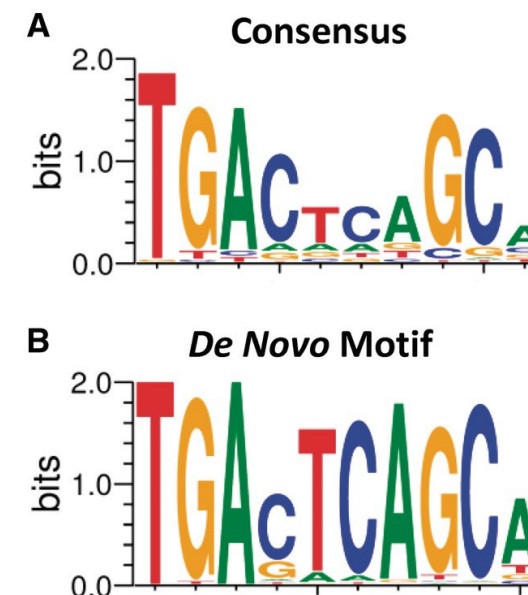
By OpenStax College - Anatomy & Physiology,  
Connexions



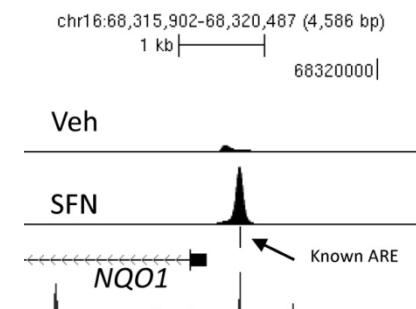
# 2005-2010



*NIEHS, Postdoctoral IRTA fellow*



*NFE2L2 binding motif, ChIP-seq*



Chorley et al. NAR 2012



*Doug Bell*



*Steve Kleeberger*





## Lessons Learned

A love for the molecular

Independence

A way of thinking

Importance of mentorship

Translation and application

# 2010-present



*US EPA-RTP, Research Biologist*



## **Post-docs**

*David Gallegos  
Alysa Suen  
Jason Franklin  
Michelle Angrish  
Natalia Ryan (VanDuyn)  
Jenna Guynn (Currier)  
April Lake*

## **Grad students**

*Bryanna Vacca  
Maureen Malloy  
John Chamberlin  
Javaughn Baker  
Patrice Cagle*

## **Post-bacs**

*Ivy Guyotte  
Nyssa Tucker  
Emily Woolard*

## **Undergrads/High School**

*Arjun Keshava  
Ry Gibson  
Malik Ko  
David Bullock*



*Gail Nelson,  
Biologist*



*Gleta Carswell,  
Biologist*

*About the Agency...*





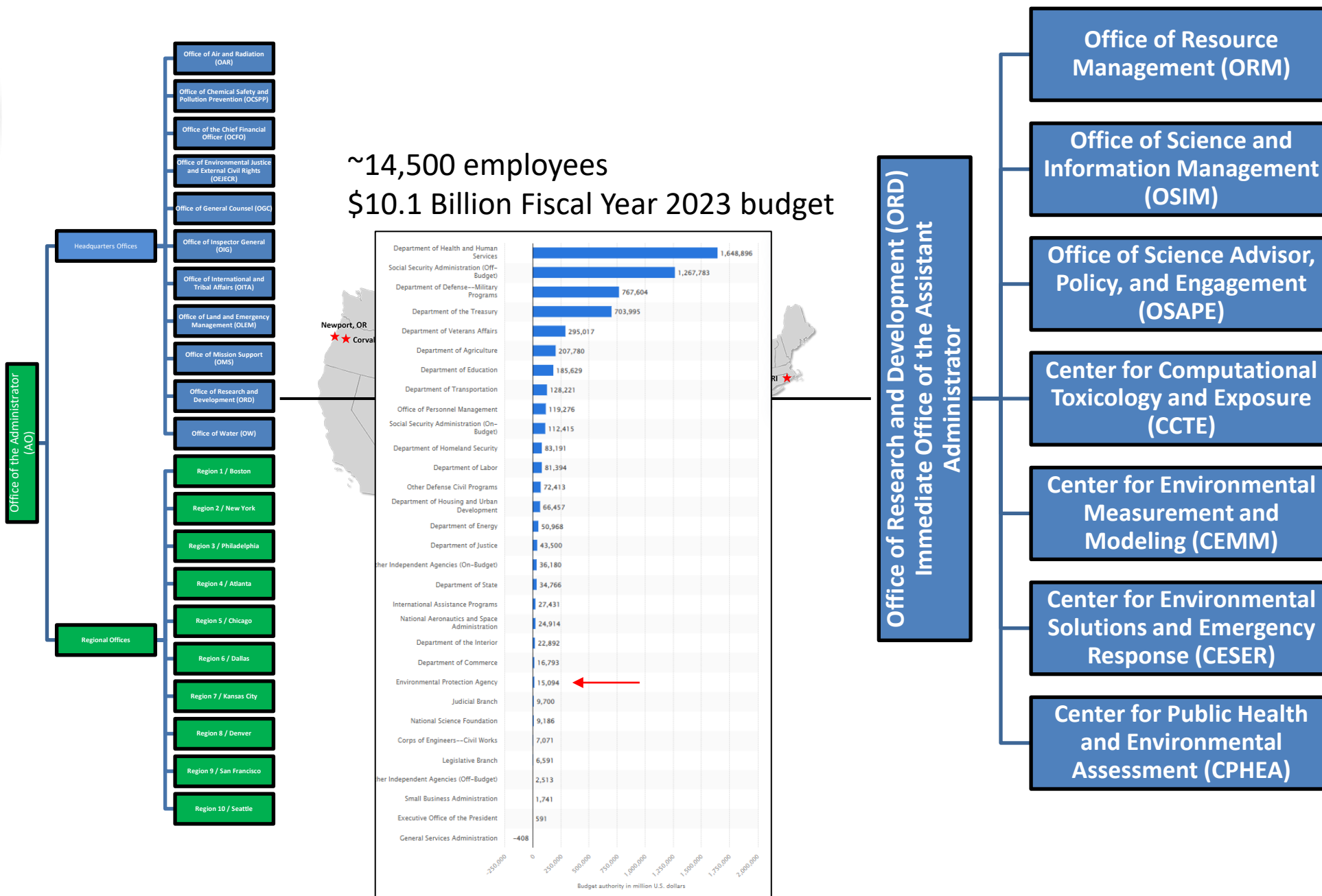
**Our mission is to protect human health and the environment.**

**To accomplish this mission, we:**

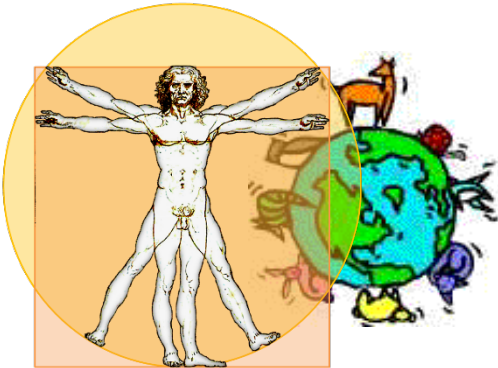
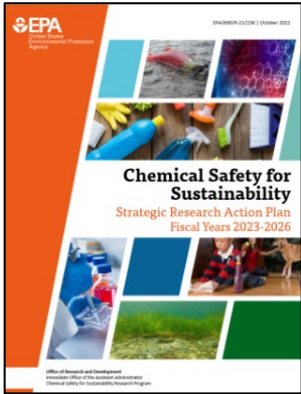
- Develop and enforce regulations
- Give grants
- Study environmental issues
- Sponsor partnerships
- Teach people about the environment
- Publish information



Michael S. Regan  
EPA Administrator



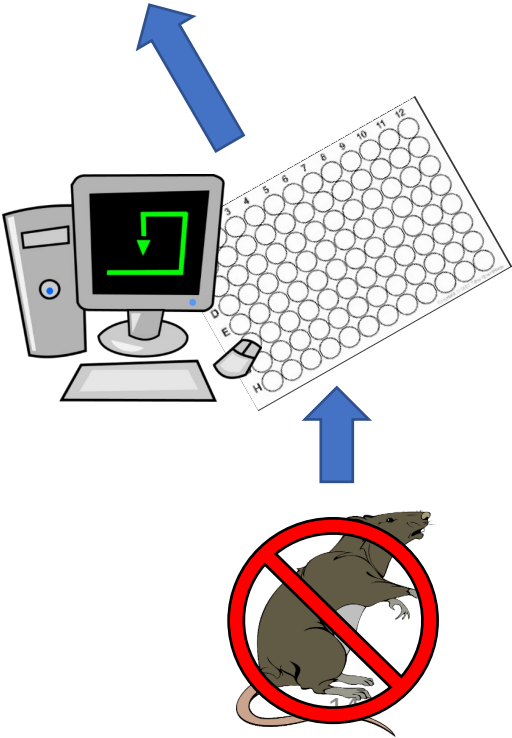
# Strategic Research Action Plan (StRAP)



Human and ecological health

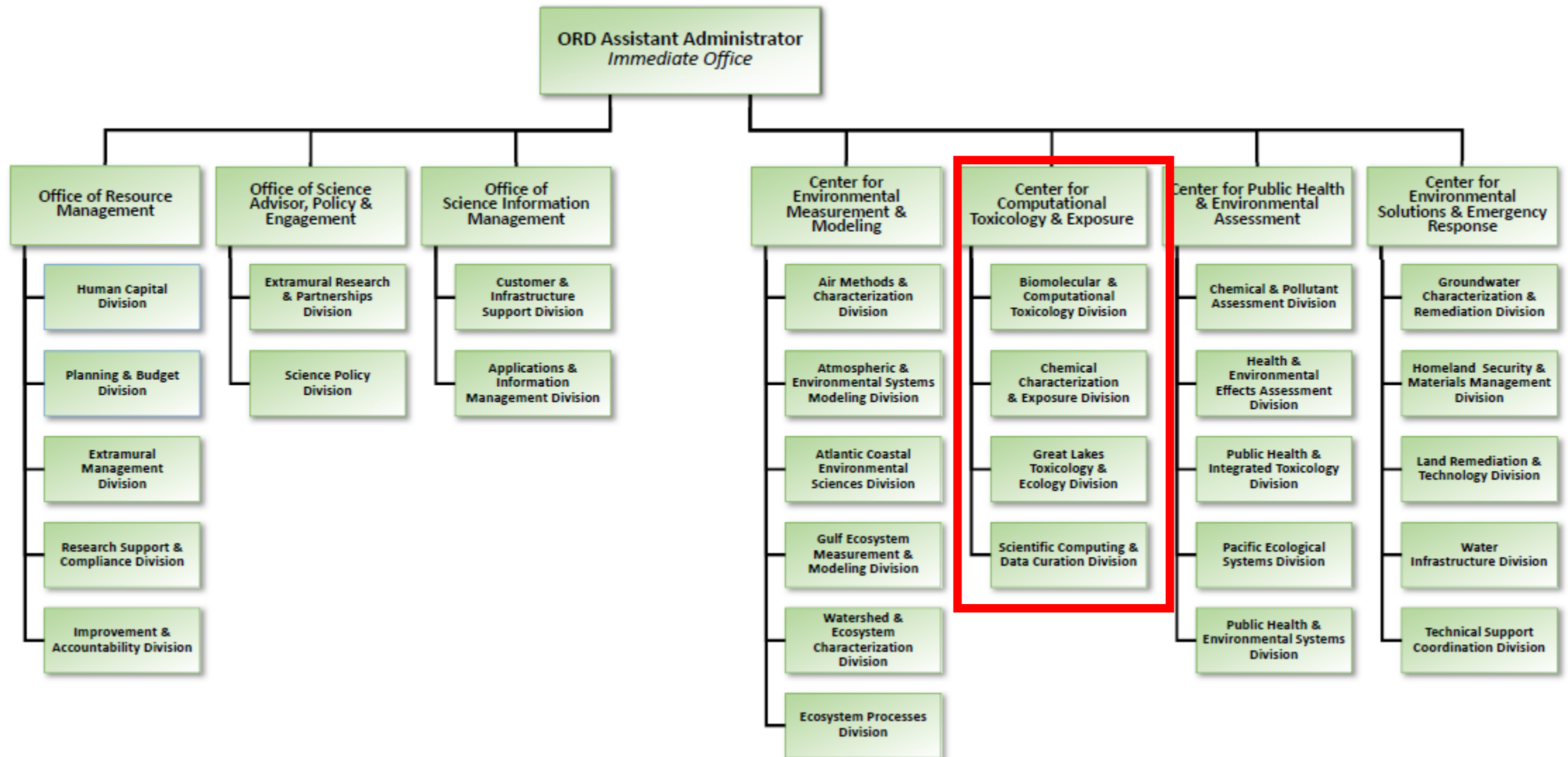


Pollution, toxins, chemicals





# Office of Research and Development



# ORD-CCTE

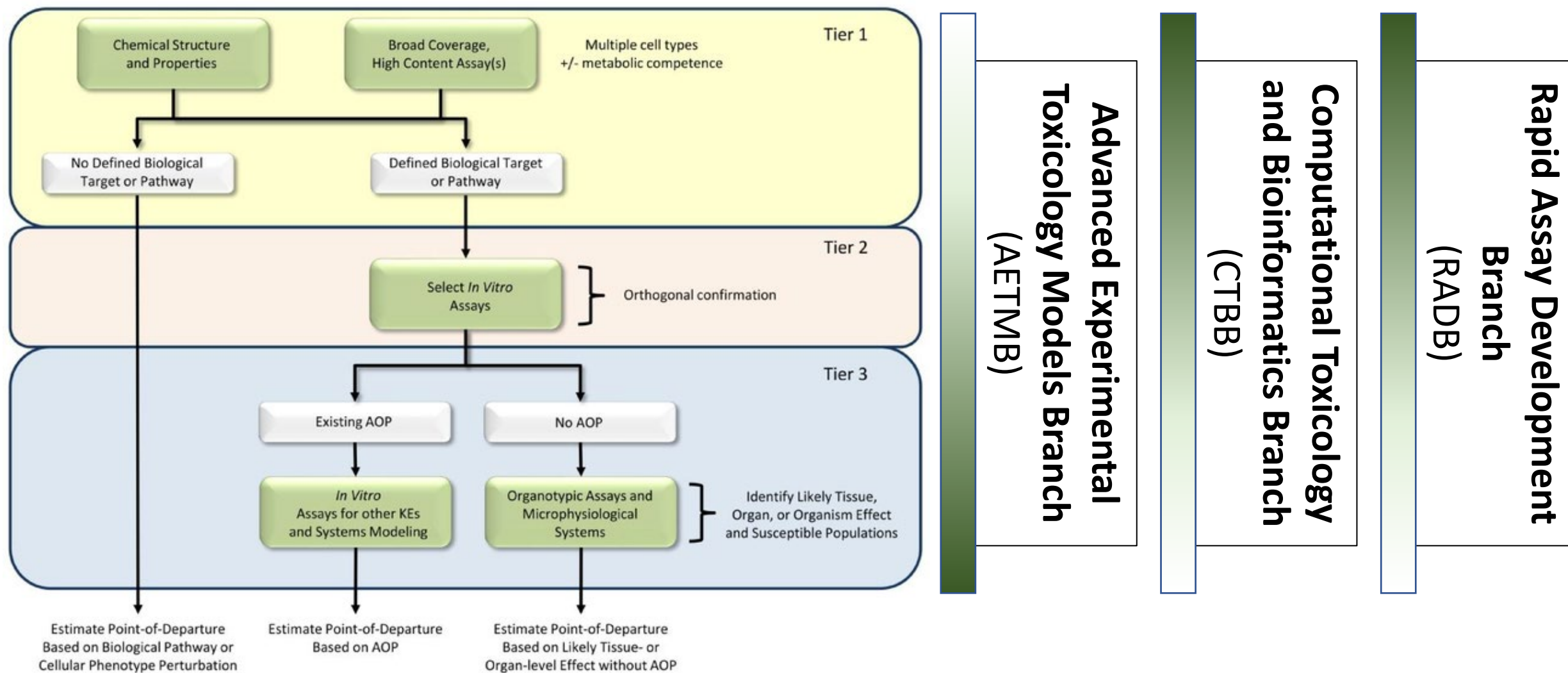


**Rusty Thomas**  
CCTE Center  
Director

**The Center for Computational Toxicology & Exposure (CCTE) research strives to:**

- Reduce the time required to test chemicals
- Expand our understanding exposures for thousands of chemical substances
- Develop a comprehensive information system
- Demonstrate translation of data into regulatory decisions

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







Brian Chorley, PhD  
CCTE/BCTD  
Laboratory studies



Chemical Safety & Sustainability

Safe and Healthy Communities

Adverse Outcome  
Pathways

- Noninvasive biomarker development
- Epigenetic biomarkers of liver disease
- Second generation sequencing tool development for archived samples

Adverse Outcome  
Pathways

- Refining Developmental Neurotoxicant-based AOPs on single cell transcriptomic characterization
- Assessing early epigenetic signatures of cancer susceptibility in archived tissues

High Throughput  
Testing

- Nondestructive epigenetic assay for chemical screening and prioritization
- Function genomic characterization of poorly defined mechanisms-of-action

Virtual Tissues  
Modeling

- System state trajectory and development modeling based on single cell data

Environmental Justice  
and Children's Health

- Noninvasive biomarker development
- Pollutant effects on development

FY19-22

FY23-26

# ORD/CCTE work in summary



- A lot of research that we do at the EPA for Office of Research and Development furthers “next-generation” toxicology
- This simply means we are taking a new approach to increase information, decrease cost, decrease time, and make better informed decisions
- This is influenced by:
  - Improving knowledge
  - New tools and technology (NAMs)
  - New and complex challenges for the Agency

*A break for questions...*



# About my research...

## 1. Scientific drivers for transcriptomic biomarkers

a) Why microRNA?

## 2. Background studies

a) Biofluid-based indicators of liver disease in an PCB-exposed residential cohort

b) Dose-responsive microRNA biomarkers of chemical mode-of-action

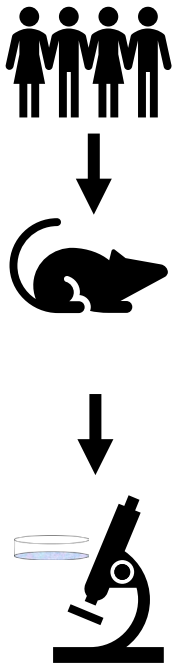
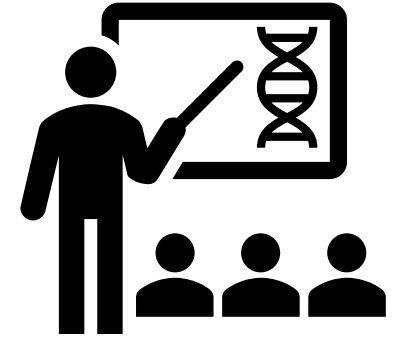
## 3. In vitro screening development using microRNA biomarkers

a) Initial optimization

b) Identification of microRNAs in media with sequencing

c) Chemical exposure study design and preliminary results

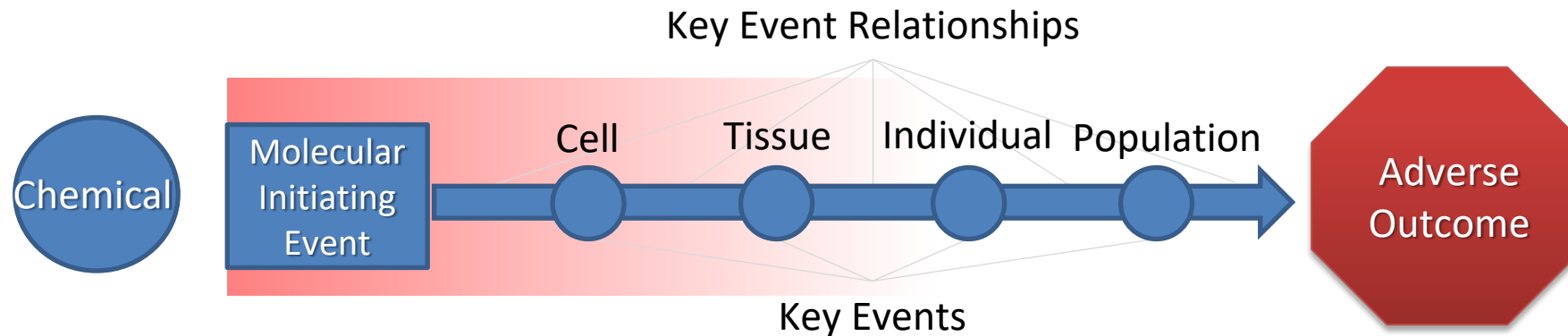
## 4. Conclusions/Future directions

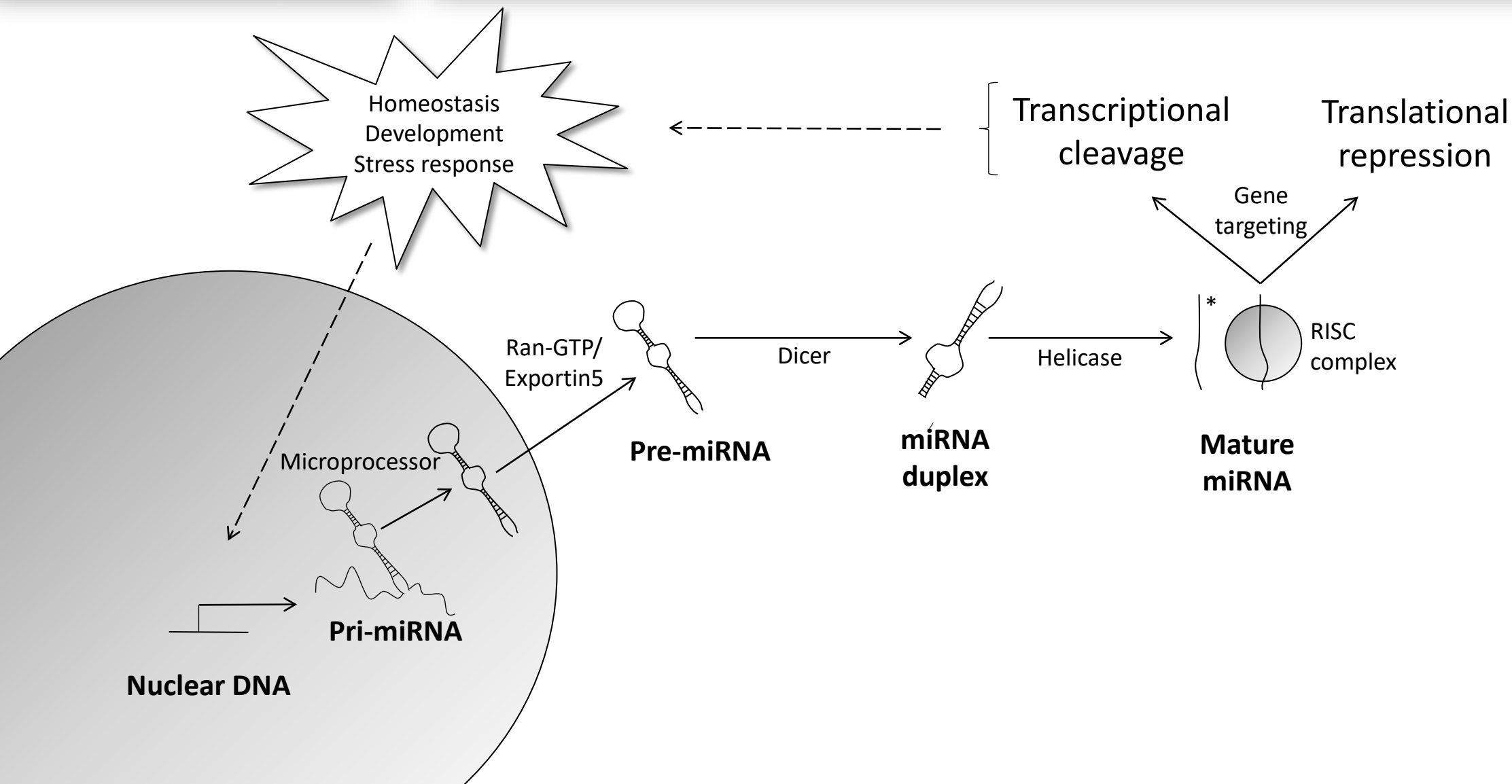




# Transcriptomic biomarkers in toxicology

- Many thousands of chemicals without data to provide a reference value
- Costly and time consuming to generate apical data
- Early transcriptional biomarkers may be sensitive measure of chemical perturbation and link to mechanism of adverse outcome of regulatory interest





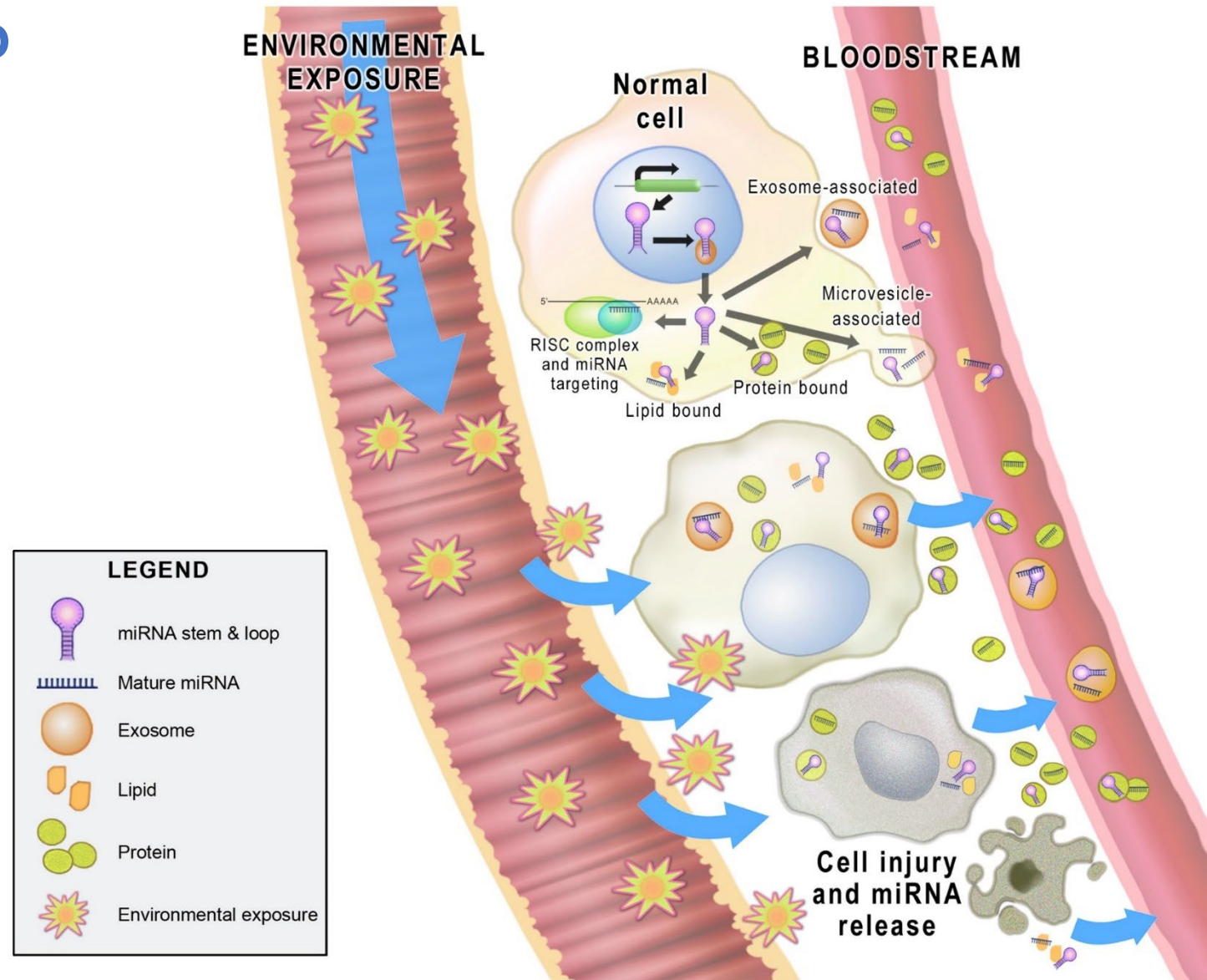
- **MicroRNAs are responsive to exogenous exposures**
- **Regulatory nodes for transcriptional networks**
- **MicroRNAs present in biofluids**

# MicroRNAs in Biofluids

## Non-invasive biomarkers?

*Predictive and non-invasive*

- Passive secretion of microRNA
  - Associated with cell death and toxicity
- Active secretion of microRNA
  - Potentially vesicle-associated and involved in cell-to-cell signaling





**Are biofluid-based miRNA biomarkers informative for health effects due to environmental exposure?**

**Hypothesis:** Previously identified individuals with toxicant-associated fatty liver disease will exhibit an altered liver microRNA profile in serum.

- **Method:** Use targeted panel to directly measure microRNA in archived serum and correlate with other metrics in cohort.





# Anniston Community Health Survey (ACHS)

- PCB (polychlorinated biphenyls) mixtures produced at a chemical plant from 1929-1971 in Anniston, Alabama
- Large, cross-sectional epidemiological study of residential population:
  - Increased PCB levels compared to NHANES reference (2-3 fold)
  - High prevalence of obesity (54%)
  - Associations between PCB exposures and hypertension, diabetes, and dyslipidemia (conditions commonly seen in metabolic syndrome)



*Anniston, AL near former  
Monsanto PCB plant*



*Linda Birnbaum (NIEHS)*

Pavuk et al. Sci Total Environ 2014; Goncharov et al. J Hypertension 2010; Silverstone et al. EHP 2012; Aminov et al. Env. Health 2013; Cave et al. J Occ Env Med 2011; [https://www.atsdr.cdc.gov/sites/anniston\\_community\\_health\\_survey/overview.html](https://www.atsdr.cdc.gov/sites/anniston_community_health_survey/overview.html)

- Toxicant-associated steatohepatitis (TASH) is a form of necrotic liver disease associated with both industrial and environmental chemical exposures.
- Cave *et al.* found evidence of TASH in 738 ACHS samples (Phase I)
  - Fragment analyses of CK18 in serum indicate oncotic necrosis or apoptotic death processes in hepatocytes
  - Can distinguish TASH from other liver disease
  - Positive associations of steatohepatitis with elevated pro-inflammatory cytokines, insulin resistance, hypertriglyceridemia and specific PCB congeners
    - Linked to environmental liver disease



Matt Cave (U. of Louisville)



# Profile screen: liver-associated miRNAs



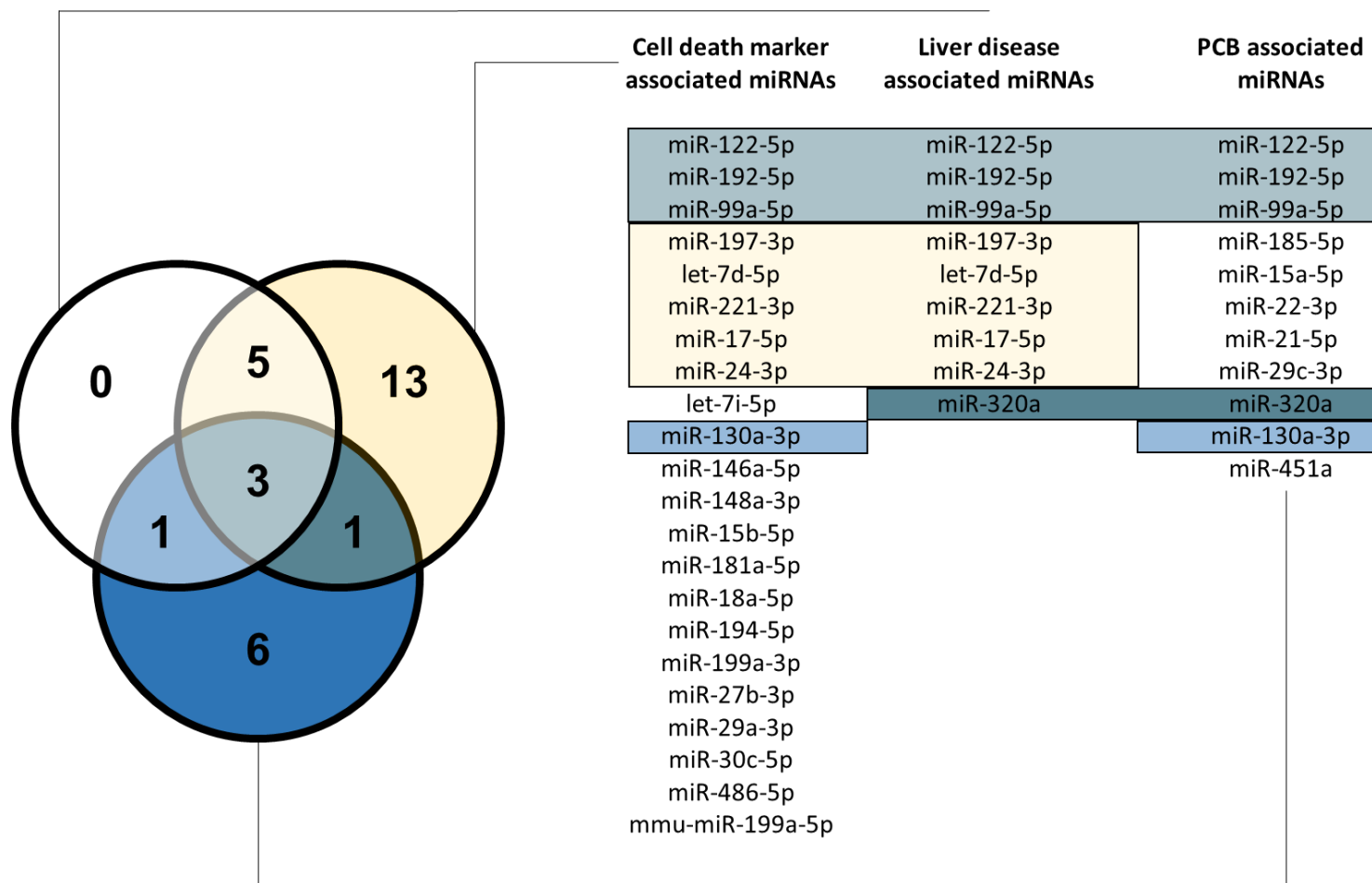
**Bullets indicate location/species of altered miRNAs in liver disease/toxicity, based on published literature**

● human serum  
or plasma

● human  
liver/hepatocytes

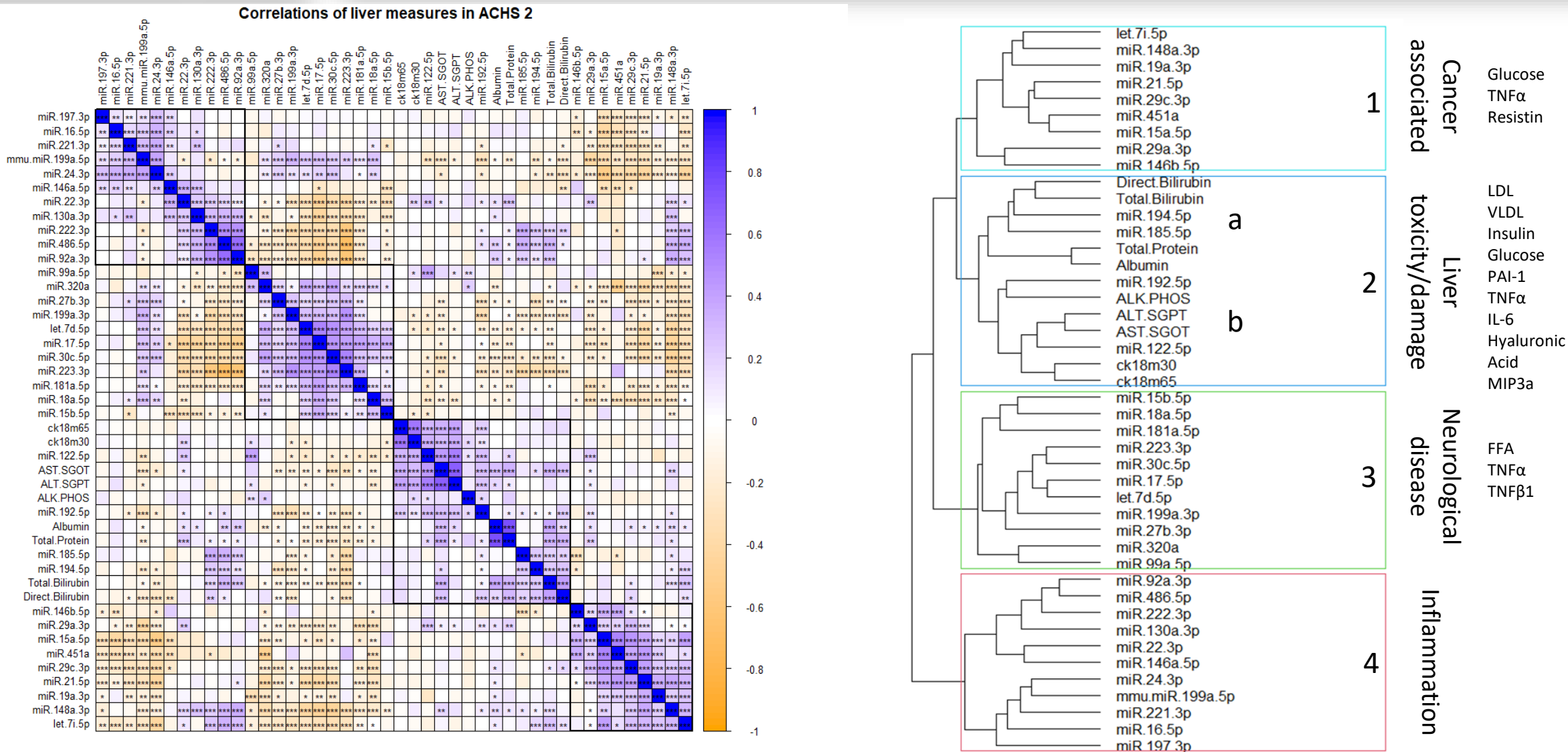
● mouse/rat serum  
or plasma

● mouse/rat liver





# Candidate serum miRNAs correlate with liver toxicity biomarkers and other adverse processes



Unpublished results, please do not cite

- Measured miRNA in biofluid correlated with specific liver injury biomarkers, but also indicated other adverse health processes
- *Are they indicative of adverse mechanisms beyond general toxicity?*
- *Can we link miRNA alterations to specific exposure-mediated mode-of-action?*

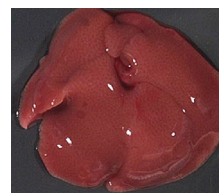


**Hypothesis:** Dose-responsive microRNAs correlates with gene expression and toxicology data in a PPAR $\alpha$  mouse model of liver tumorigenesis

**Method:** Use microRNA profiling after short-term exposure of liver tumorigen

tumorigenic      di(2-ethylhexyl) phthalate (DEHP)

non-tumorigenic      di-n-octyl phthalate (DNOP)  
n-butyl benzyl phthalate (BBP)



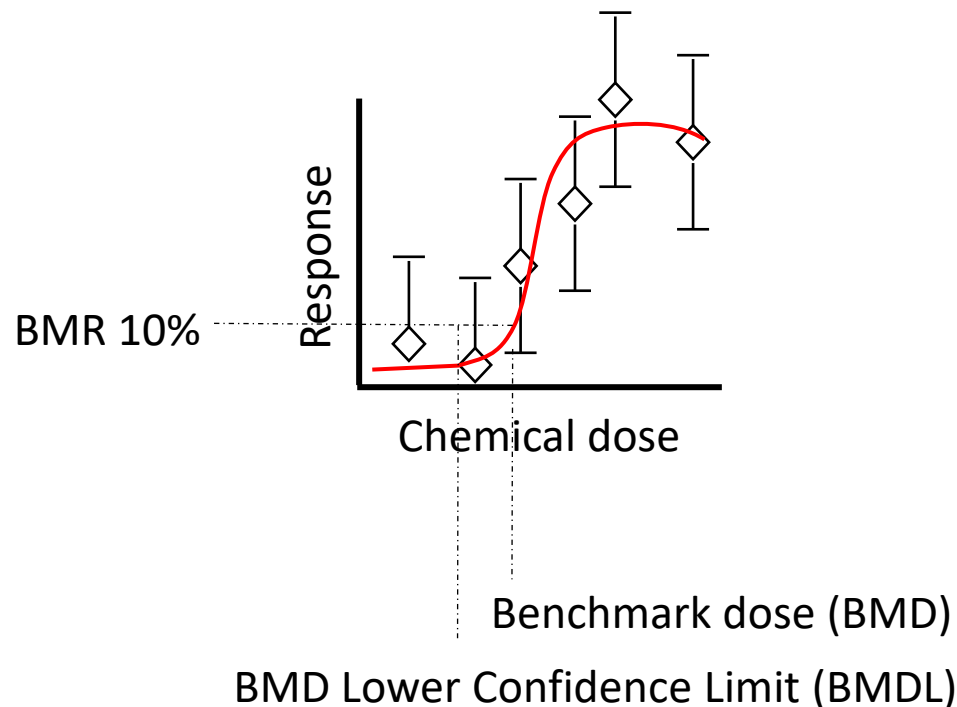
7 days (4 doses)  
and  
28 days (1 high dose)

# Benchmark dose response (BMD) for EPA risk assessment

In the absence of available human data...

## *Non-cancer risk assessment*

Short term, sub-chronic, and chronic animal studies



### Uncertainty

- cross-species extrapolation
- pharmacodynamic pharmacokinetic variability
- sensitive subpopulations
- exposure duration

Reference values

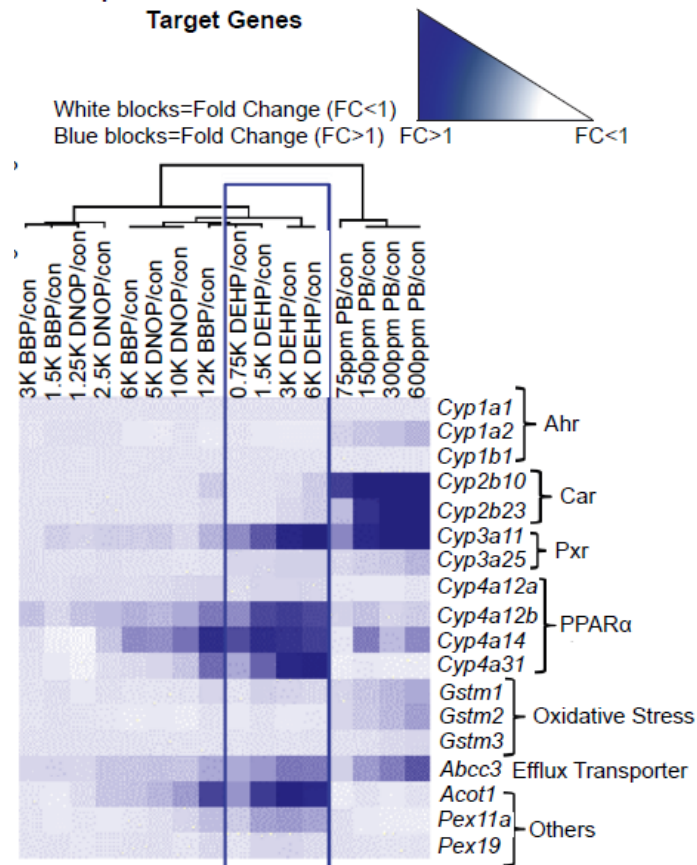


# Phthalate potency predicted using transcriptional measurements

Table 3. Transcriptional (BMD<sub>T</sub>) and apical (BMD<sub>A</sub>) Benchmark Dose Estimates for DEHP DNOP and BBP Exposed Mouse livers.

Illumina Array Genes	DEHP (mg/kg-day) BMD <sub>T</sub>	DNOP (mg/kg-day) BMD <sub>T</sub>	BBP (mg/kg-day) BMD <sub>T</sub>
<i>Acot1</i>	29	370	676
<i>Cyp4a12b</i>	61	64	210
<i>Cyp4a31</i>	57	912	851
<i>Pdk4</i>	150	>958	>1140
<i>Abcc3</i>	35	164	322
qPCR Genes	DEHP (mg/kg-day) BMD <sub>A</sub>	DNOP (mg/kg-day) BMD <sub>A</sub>	BBP (mg/kg-day) BMD <sub>A</sub>
<i>Abcc3</i>	18	NA	NA
<i>Acot1</i>	77	NA	NA
<i>Cyp4a12b</i>	69	NA	NA
<i>Cyp4a31</i>	47	NA	NA
<i>Pdk4</i>	183	NA	NA
Functional Non-Genomic Markers	DEHP (mg/kg-day) BMD <sub>A</sub>	DNOP (mg/kg-day) BMD <sub>A</sub>	BBP (mg/kg-day) BMD <sub>A</sub>
Ki67 (small cells only)	215	>958	>1140
PROD	42	>958	>1140
BROD	532	>958	892
Relative Liver weight	48	NA	311
Hepatocyte cytoplasmic alteration	116	NA	996
2-year Tumorigenic Potency	DEHP (mg/kg-day) BMD <sub>A</sub>	DNOP (mg/kg-day) BMD <sub>A</sub>	BBP (mg/kg-day) BMD <sub>A</sub>
HCC	71	>1268	>1600
HCA+HCC	35	431	>1600

Heatmap of Select Phthalate and PB Target Genes



Potency Rank

DEHP>DNOP>BBP

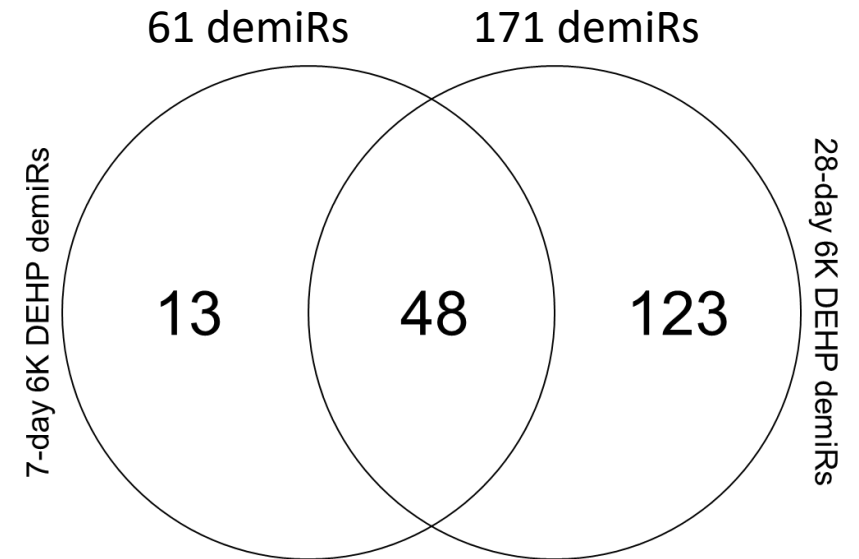
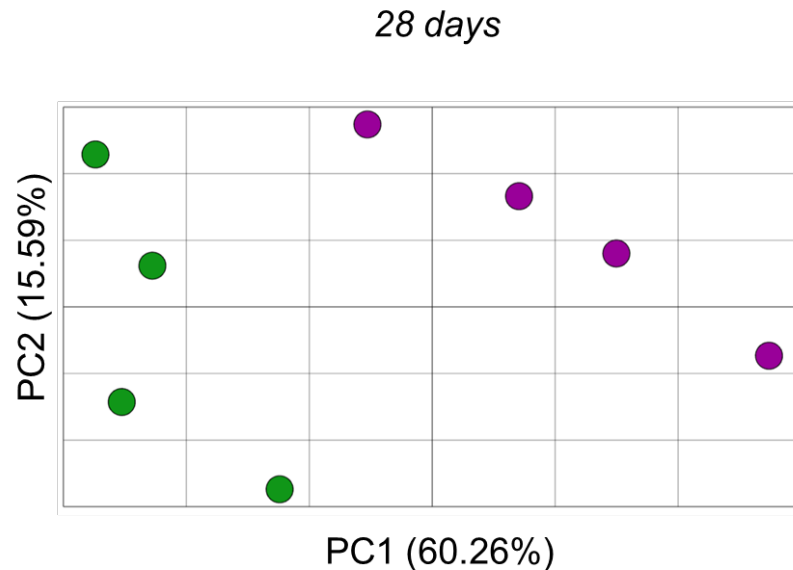
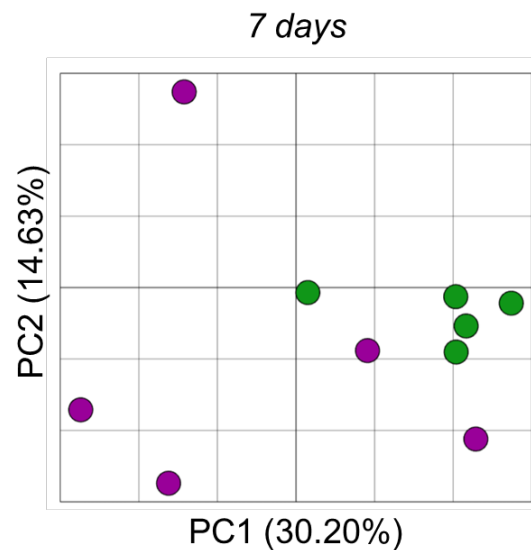
DEHP>BBP>DNOP

DEHP>DNOP>BBP

transcript profile predicts chemical potency for hepatocellular carcinoma

## Sequencing of liver RNA of 7 and 28-day DEHP treated mice

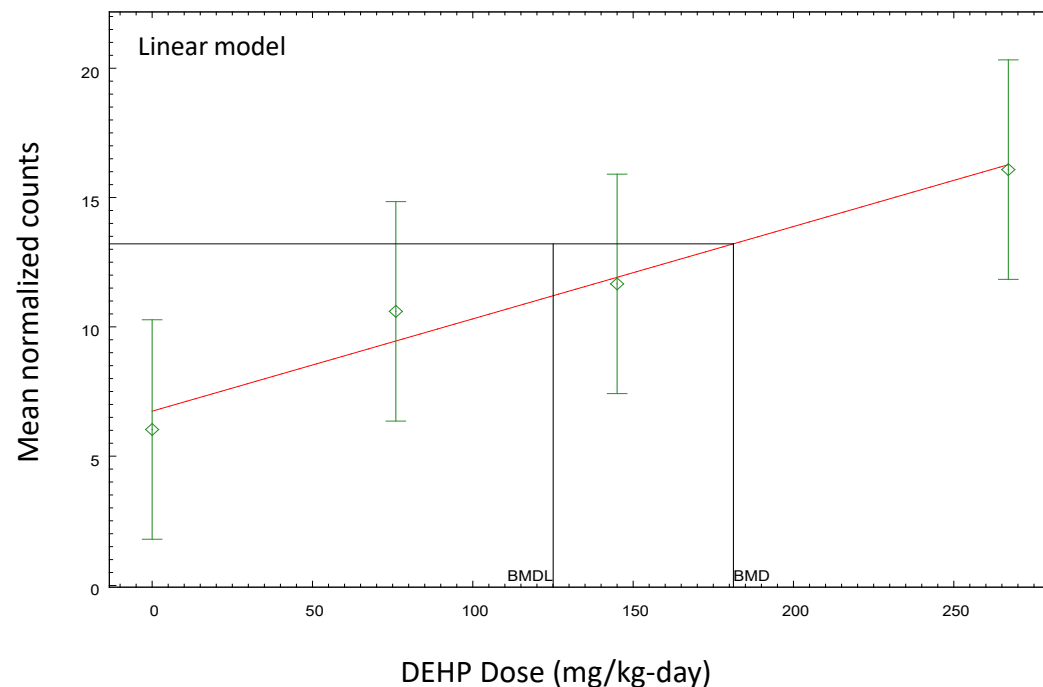
- Separation by PCA plot of liver miRNA expression
- Shared and unique miRNAs after 7 and 28 days



Evidence of persistent miRNA changes

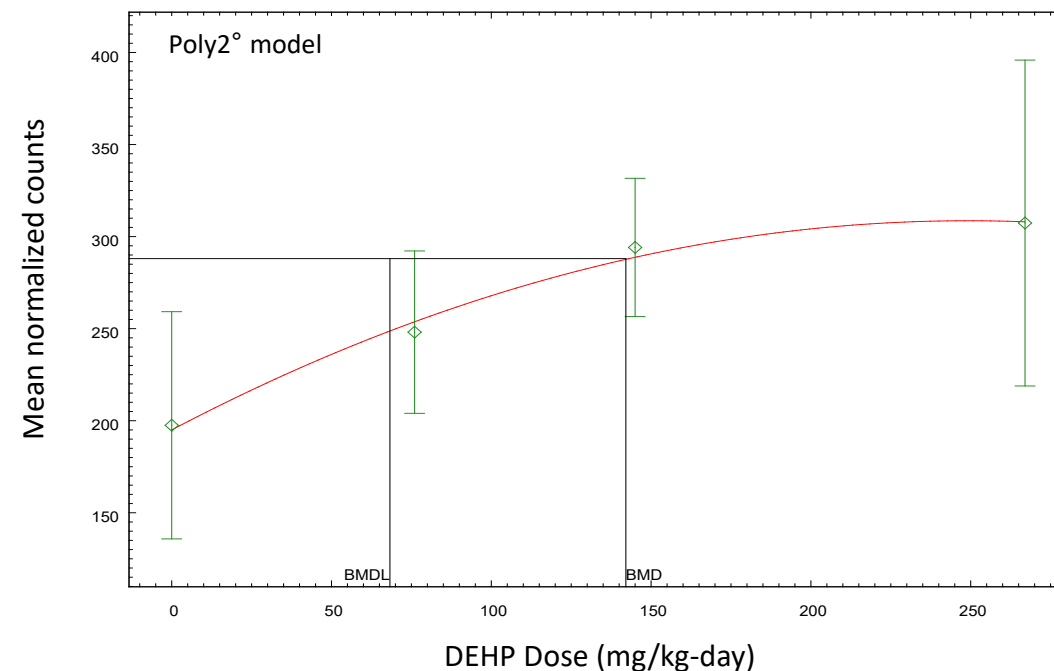
## Benchmark dose (BMD) analysis of dose-responsive miRNA after 7 days

mmu-miR-182-5p



$BMD_{miR} = 181\text{mg/kg-day}$

mmu-miR-378a-3p

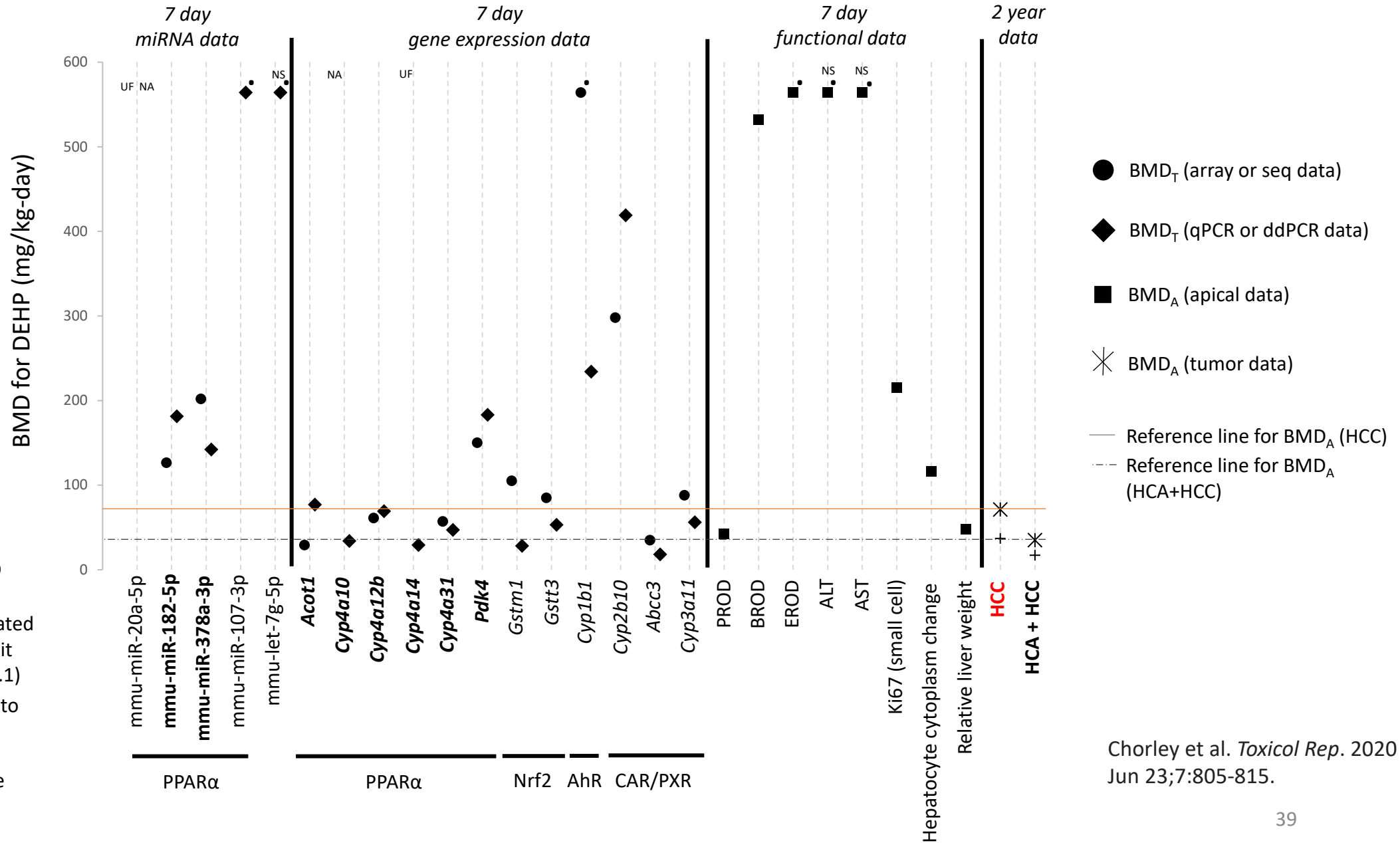


$BMD_{miR} = 142\text{mg/kg-day}$

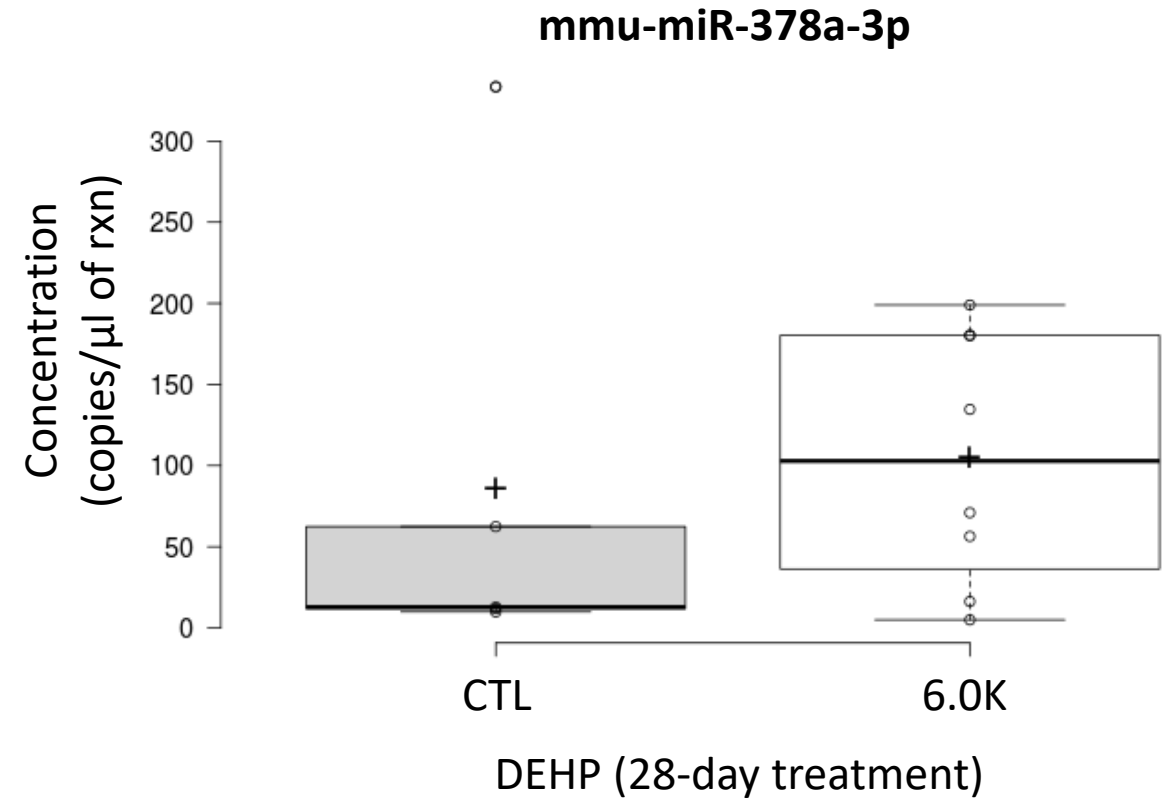
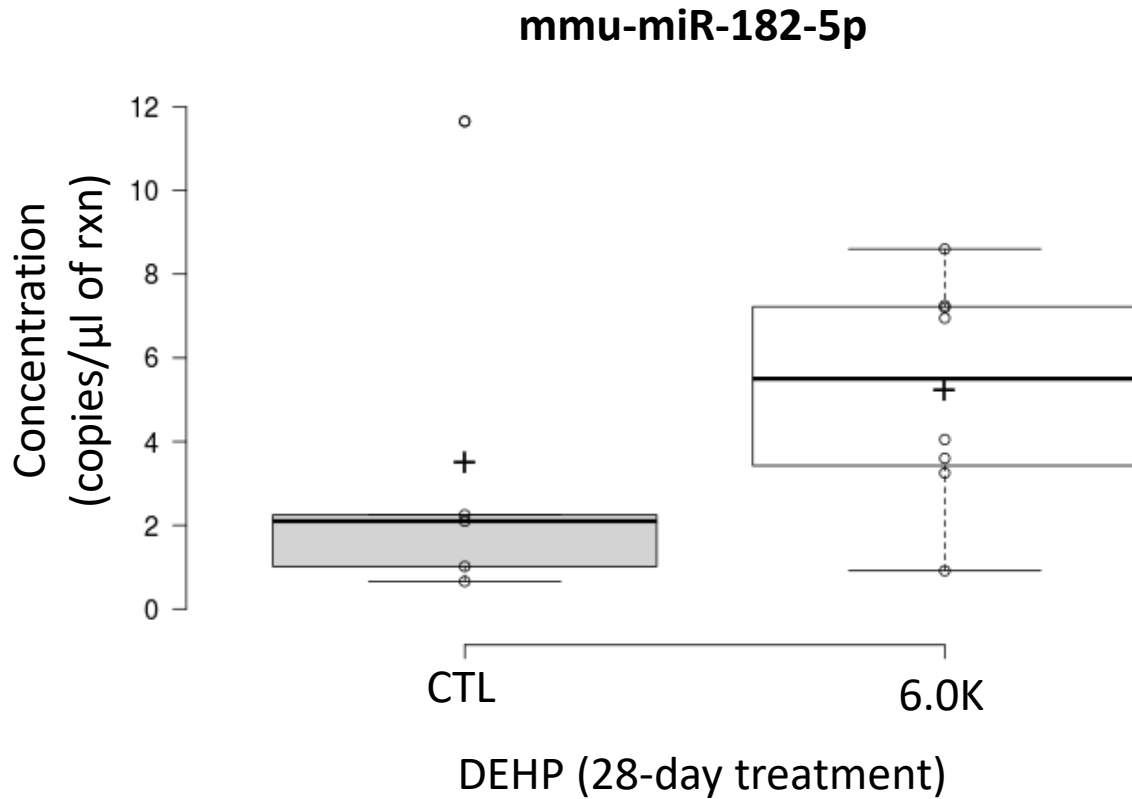
Chorley et al. *Toxicol Rep.*  
2020 Jun 23;7:805-815.



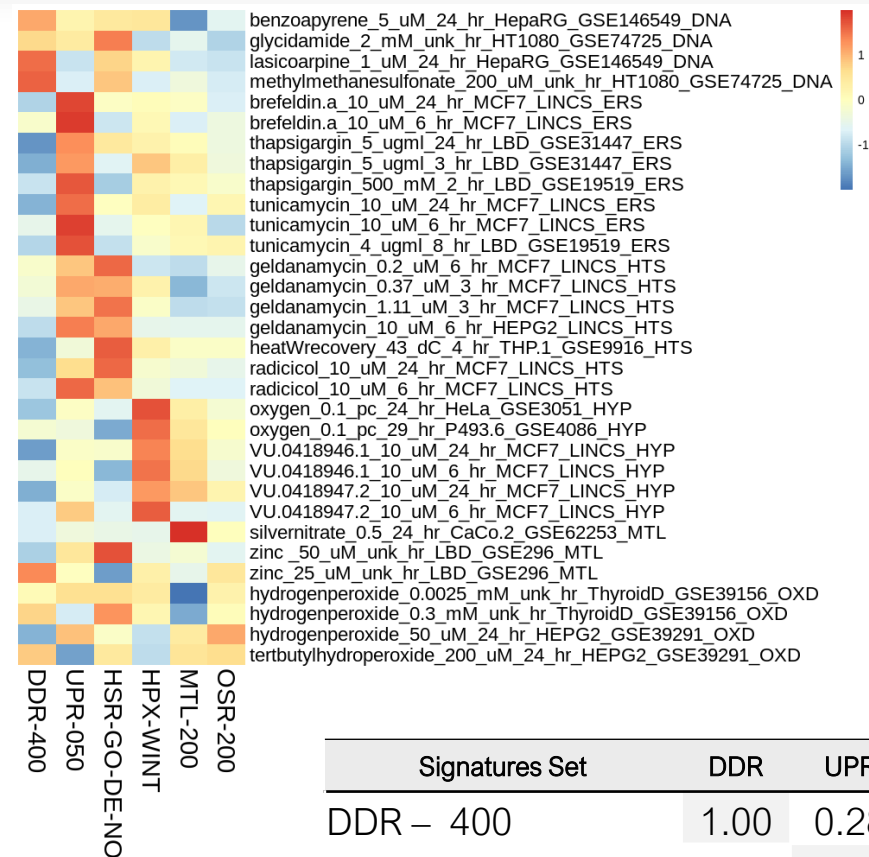
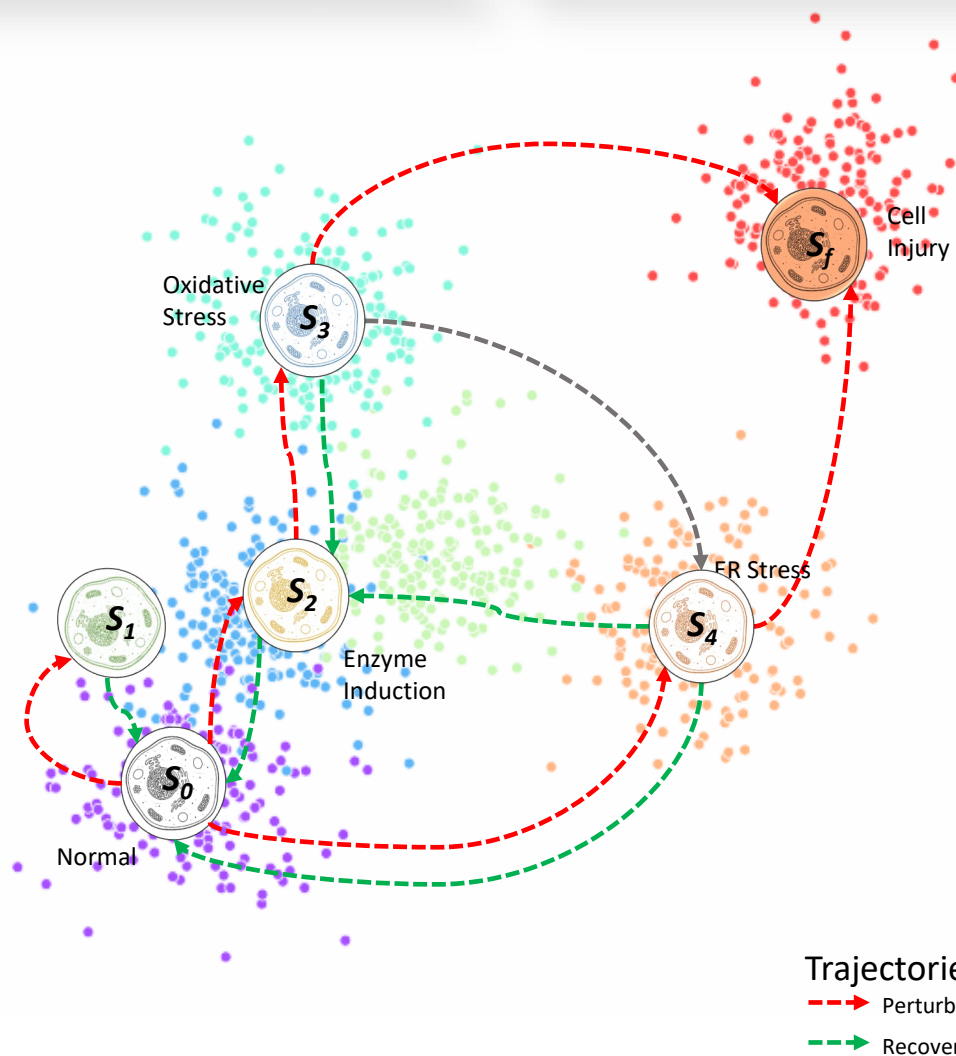
## microRNAs Correlate with Gene Expression and Functional Data



Chorley et al. *Toxicol Rep.* 2020  
Jun 23;7:805-815.

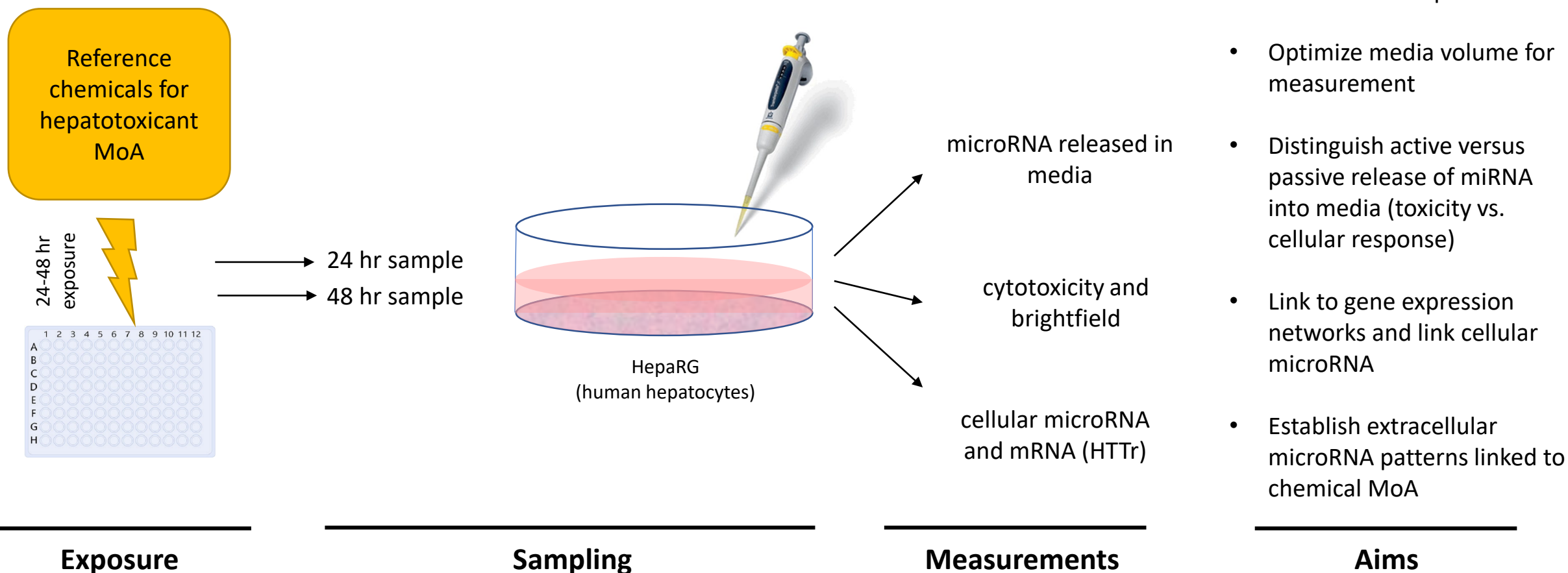
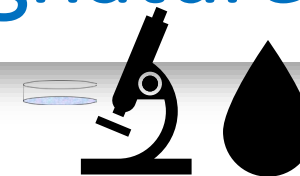


- In this case study, dose-responsive miRNA are linked to the known primary mechanism of action (PPAR $\alpha$ ) for DEHP-mediated mouse HCC
- Indications these miRNAs may be leaked/transferred into circulation
- *Can these miRNA patterns enhance our chemical screening efforts?*



Signatures Set	DDR	UPR	HSR	HPX	MTL	OSR
DDR – 400	1.00	0.28	0.47	0.27	0.60	0.68
UPR – 050	0.23	0.89	0.70	0.38	0.21	0.16
HSR – GO_DE_NO	0.72	0.34	0.97	0.17	0.34	0.50
HPX – WINT	0.28	0.57	0.47	1.00	0.20	0.20
MTL – 200	0.12	0.63	0.33	0.85	0.66	0.28
OSR – 200	0.10	0.50	0.40	0.58	0.57	0.88

## • *Non-destructive measurement of extracellular microRNA to define chemical mechanism-of-action*





## Phase I Chemicals

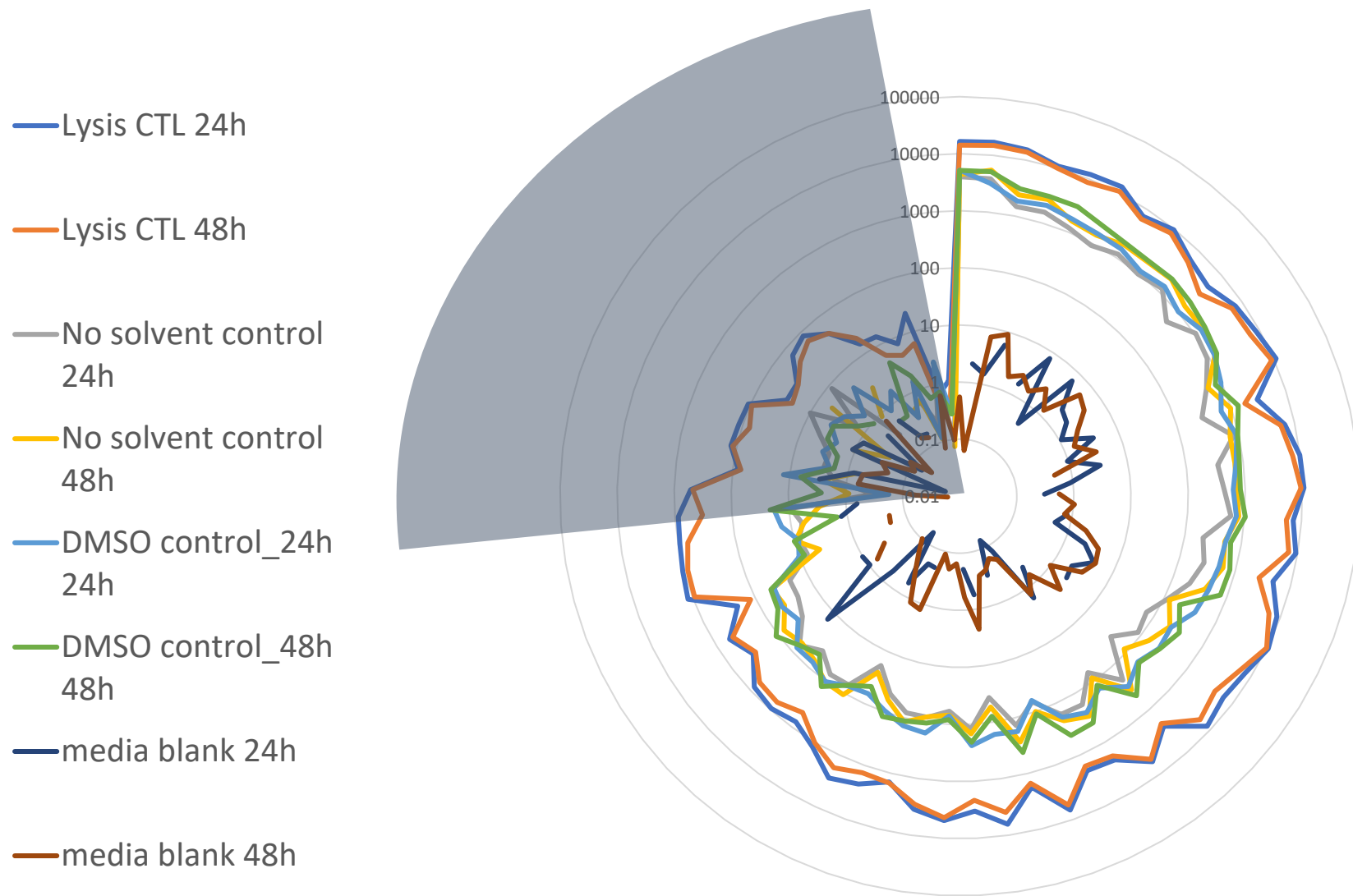
Benzo[a]pyrene – 10, 1, 0.25 uM	Aryl hydrocarbon receptor (AHR) agonist
Pirinixic acid (WY-14643) – 30, 3, 0.3 uM	Peroxisome proliferator-activated receptor (PPAR) $\alpha$ agonist
Menadione – 30, 15, 7.5 uM	Aldehyde oxidase-1 (AOX1) agonist
Ketoconazole – 10, 1, 0.1 uM	Cytochrome P450 3A4 (CYP3A4) antagonist
Retinoic acid – 10, 1, 0.1 uM	Retinoic acid receptor alpha (RAR- $\alpha$ ) agonist
Chenodeoxycholic acid – 200, 100, 50 uM	Farnesoid X receptor (FXR) agonist
Trichostatin A – 3, 0.3, 0.03 uM	Histone deacetylase inhibitors (HDACi)
Rifampicin – 100, 50, 25 uM	Pregnane X receptor (PXR) agonist
Troglitazone – 100, 50, 5 uM	Peroxisome proliferator-activated receptor (PPAR) $\gamma$ agonist
Atorvastatin – 10, 1, 0.1 uM	3-Hydroxy-3-Methylglutaryl-CoA Reductase (HMGCR) inhibitor

## Small RNA sequencing: candidate miRNA identification

- 181 total miRNAs measured in media in small RNA-seq results
- 65 chosen for miRNA Fireplex panel
- Candidates measured at 24h and 48h post exposure



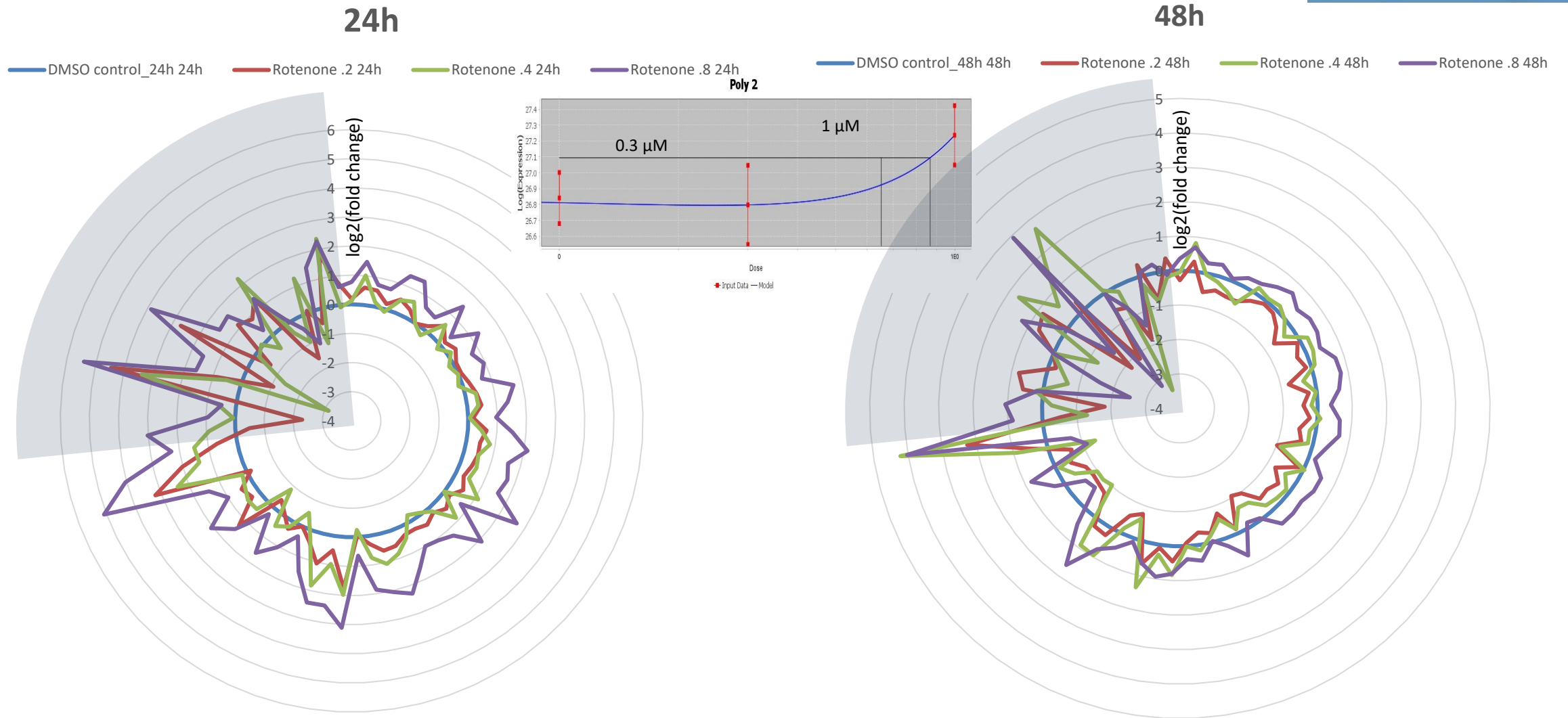
# Phase I Fireplex data: The ceiling and the floor of the assay



Unpublished results, please do not cite

# Phase I Fireplex data

## Rotenone controls; “shockwave” toxicity indicator

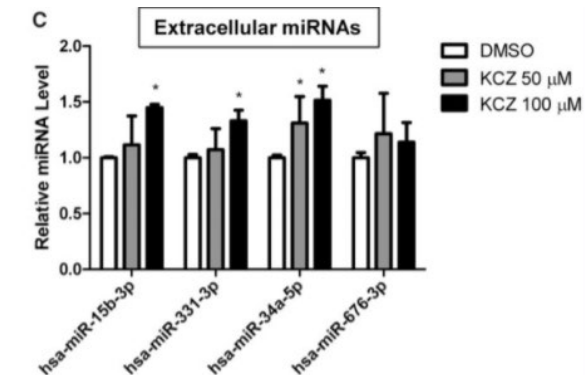
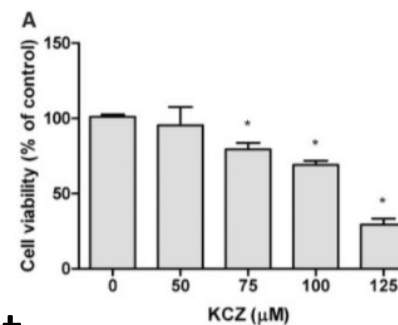




# Phase I Fireplex data

“Black hole”; Suppressed signal

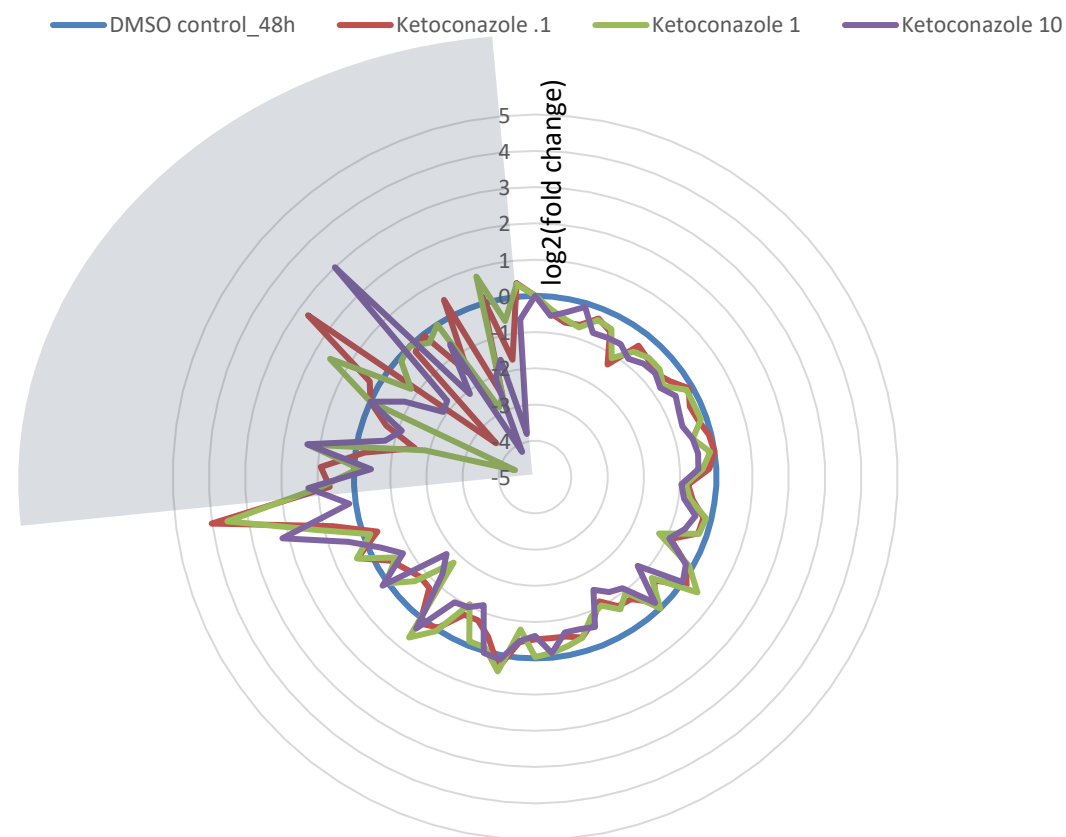
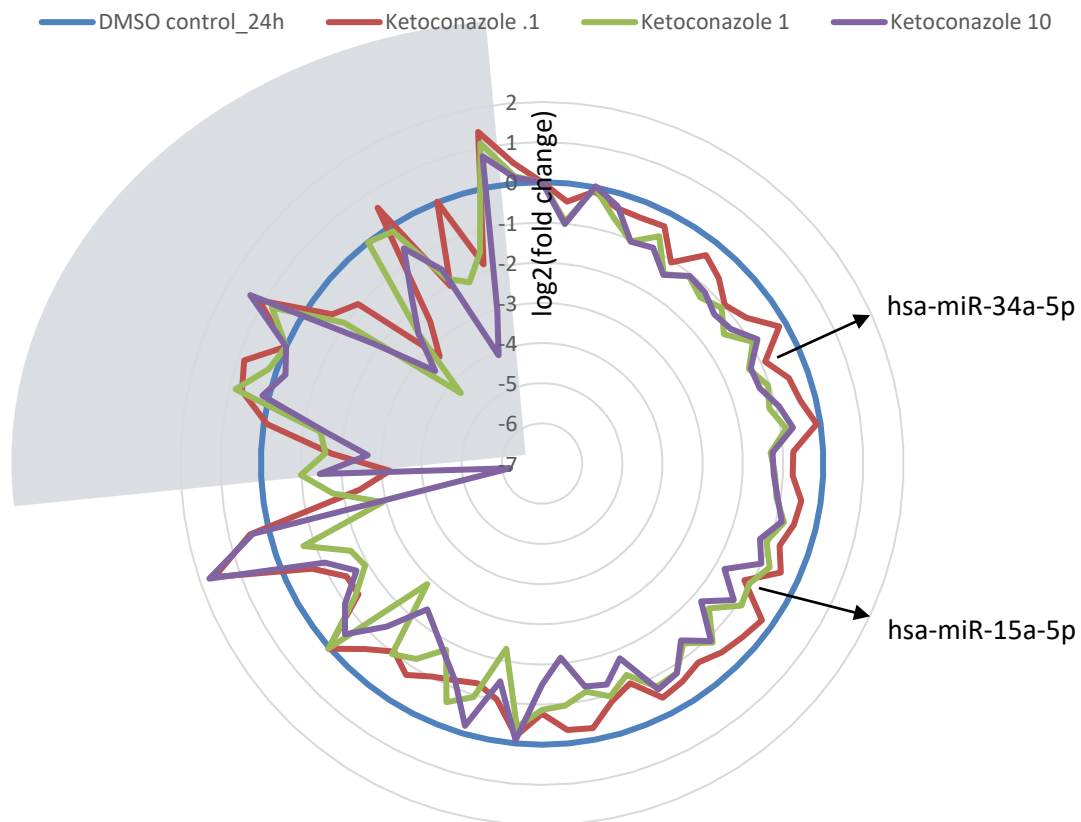
CYP3A4 antagonist



Li et al 2021 Tox Sci

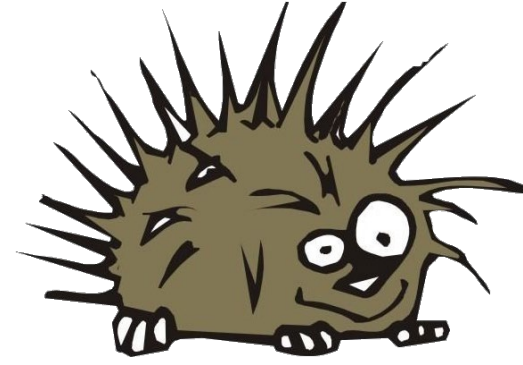
24h

48h



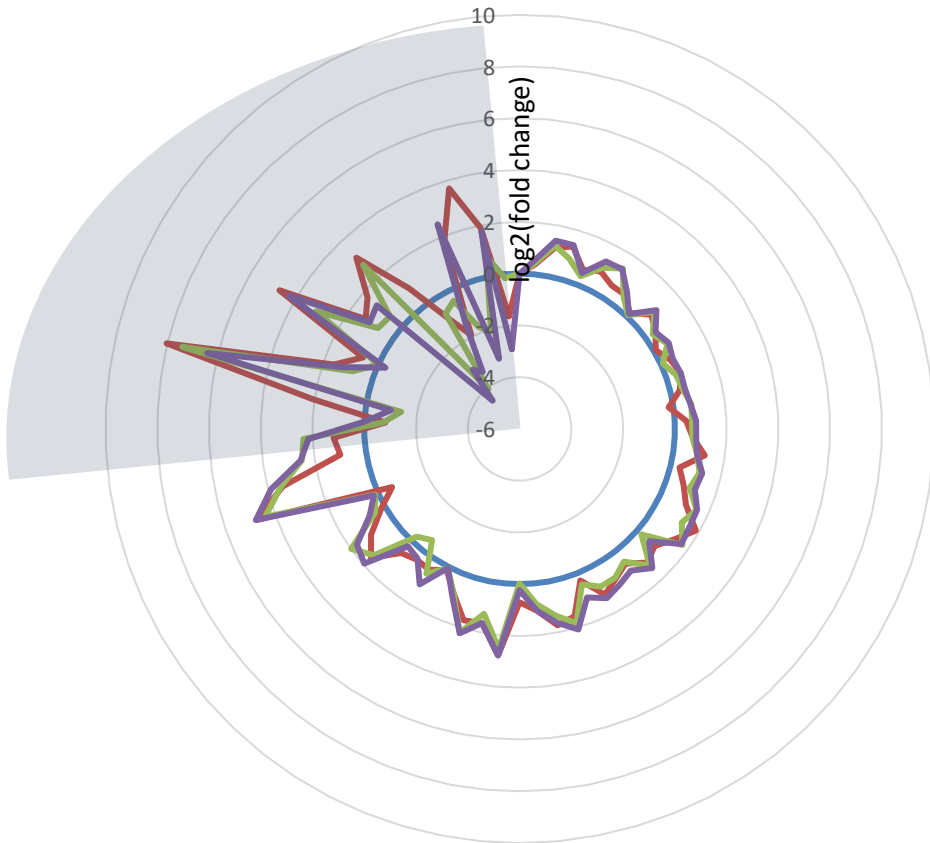
# Phase I Fireplex data

## “Porcupines”; Potential signatures of MoA



24h

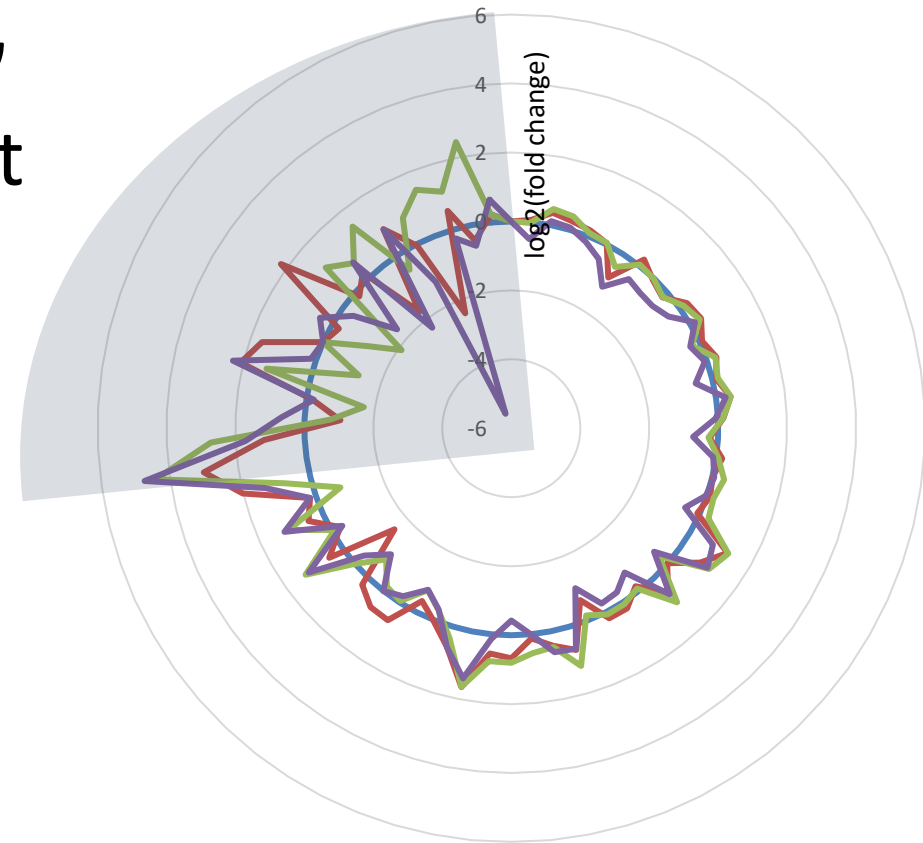
— DMSO control\_24h — Troglitazone 5 — Troglitazone 50 — Troglitazone 100



PPAR $\gamma$   
agonist

48h

— DMSO control\_48h — Troglitazone 5 — Troglitazone 50 — Troglitazone 100



# Phase II Chemicals – Can we replicate signatures?

Omeprazole	Aryl hydrocarbon receptor (AHR) agonist	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
3,3'-diindolylmethane	Aryl hydrocarbon receptor (AHR) agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
Isovanillin	Aldehyde oxidase-1 (AOX1) agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
Hydralazine	Aldehyde oxidase-1 (AOX1) agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
Amiodarone	Cytochrome P450 3A4 (CYP3A4) antagonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
Itraconazole	Cytochrome P450 3A4 (CYP3A4) antagonist	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
GW4064	Farnesoid X receptor (FXR) agonist	10, 3, 1, 0.3, 0.1, 0.03, 0.01 uM
Obeticholic acid	Farnesoid X receptor (FXR) agonist	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
Suberoylhydroxamic acid	Histone deacetylase inhibitors (HDACi)	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
Vorinostat	Histone deacetylase inhibitors (HDACi)	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
Lovastatin	3-Hydroxy-3-Methylglutaryl-CoA Reductase (HMGCR) inhibitor	10, 3, 1, 0.3, 0.1, 0.03, 0.01 uM
Simvastatin	3-Hydroxy-3-Methylglutaryl-CoA Reductase (HMGCR) inhibitor	10, 3, 1, 0.3, 0.1, 0.03, 0.01 uM
Acetaminophen	Peroxisome proliferator-activated receptor (PPAR) $\alpha$ agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
MEHP	Peroxisome proliferator-activated receptor (PPAR) $\alpha$ agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
Rosiglitazone	Peroxisome proliferator-activated receptor (PPAR) $\gamma$ agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
Pioglitazone	Peroxisome proliferator-activated receptor (PPAR) $\gamma$ agonist	100, 30, 10, 3, 1, 0.3, 0.1 uM
AM580	Retinoic acid receptor alpha (RAR- $\alpha$ ) agonist	10, 3, 1, 0.3, 0.1, 0.03, 0.01 uM
Arotinoid acid	Retinoic acid receptor alpha (RAR- $\alpha$ ) agonist	10, 3, 1, 0.3, 0.1, 0.03, 0.01 uM
Tunicamycin	Unfolded protein response (UPR)	100, 30, 10, 3, 1, 0.3, 0.1 uM
Brefeldin A	Unfolded protein response (UPR)	100, 30, 10, 3, 1, 0.3, 0.1 uM
Pyridaben	Unfolded protein response (UPR)/Hypoxia (HPX) response	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
1,10-Phenanthroline	Hypoxia (HPX) response	100, 30, 10, 3, 1, 0.3, 0.1 uM
Quercetin	Hypoxia (HPX) response	100, 30, 10, 3, 1, 0.3, 0.1 uM
Chlorothalonil	Heat shock response (HSR)	100, 30, 10, 3, 1, 0.3, 0.1 uM
Cadmium Chloride	Heat shock response (HSR)	100, 30, 10, 3, 1, 0.3, 0.1 uM
Piperine	Oxidative stress response (OSR)	100, 30, 10, 3, 1, 0.3, 0.1 uM
Tert-butylhydroquinone	Oxidative stress response (OSR)	100, 30, 10, 3, 1, 0.3, 0.1 uM
	Oxidative stress response (OSR)	
1,4-Naphthoquinone	/Hypoxia (HPX) response	100, 30, 10, 3, 1, 0.3, 0.1 uM
Etoposide	DNA damage response (DDR)	30, 10, 3, 1, 0.3, 0.1, 0.03 uM
5-Fluorouracil	DNA damage response (DDR)	100, 30, 10, 3, 1, 0.3, 0.1 uM

Chemical  
mechanism-of-  
action

Cellular stress  
response

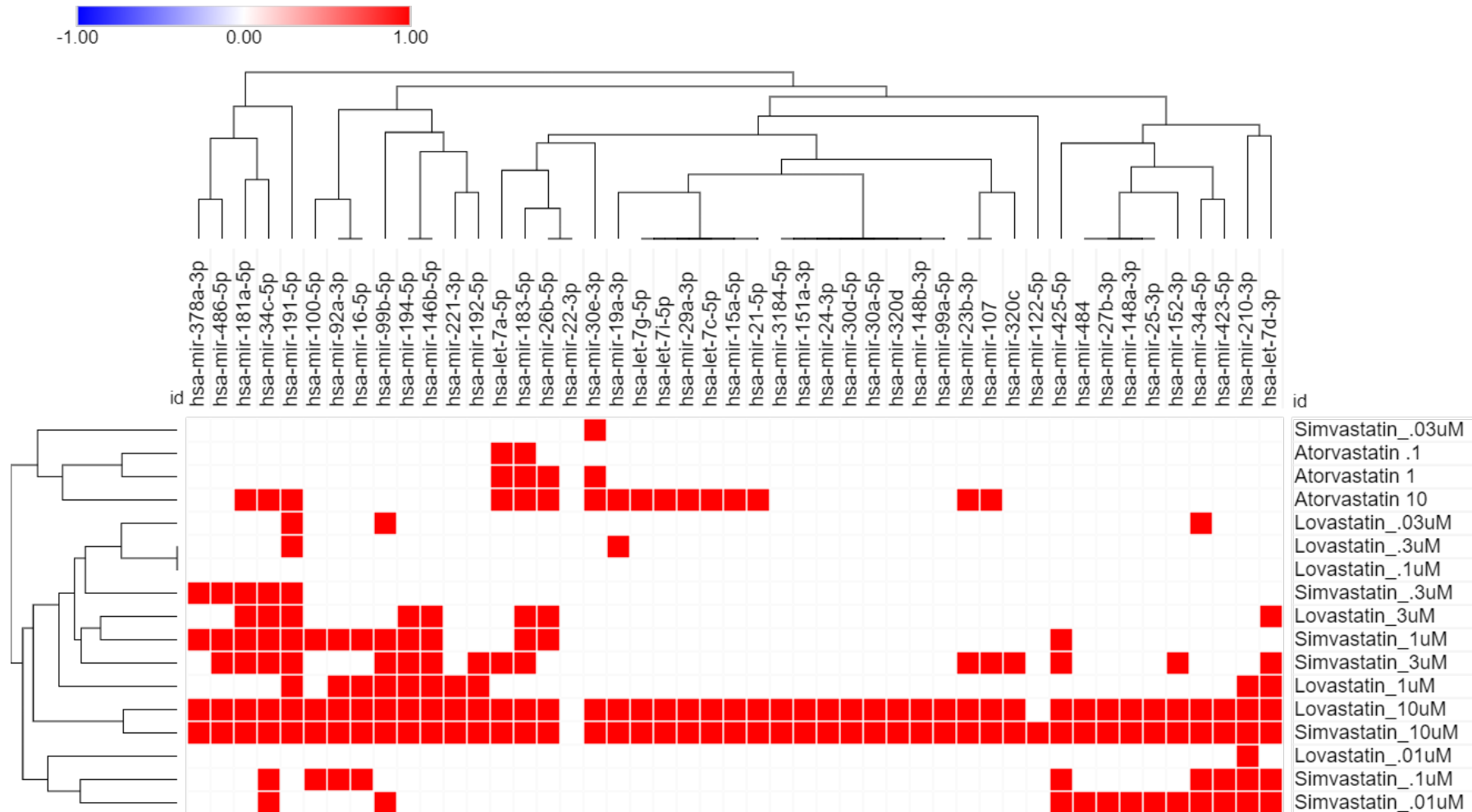




*Unpublished results, please do not cite*

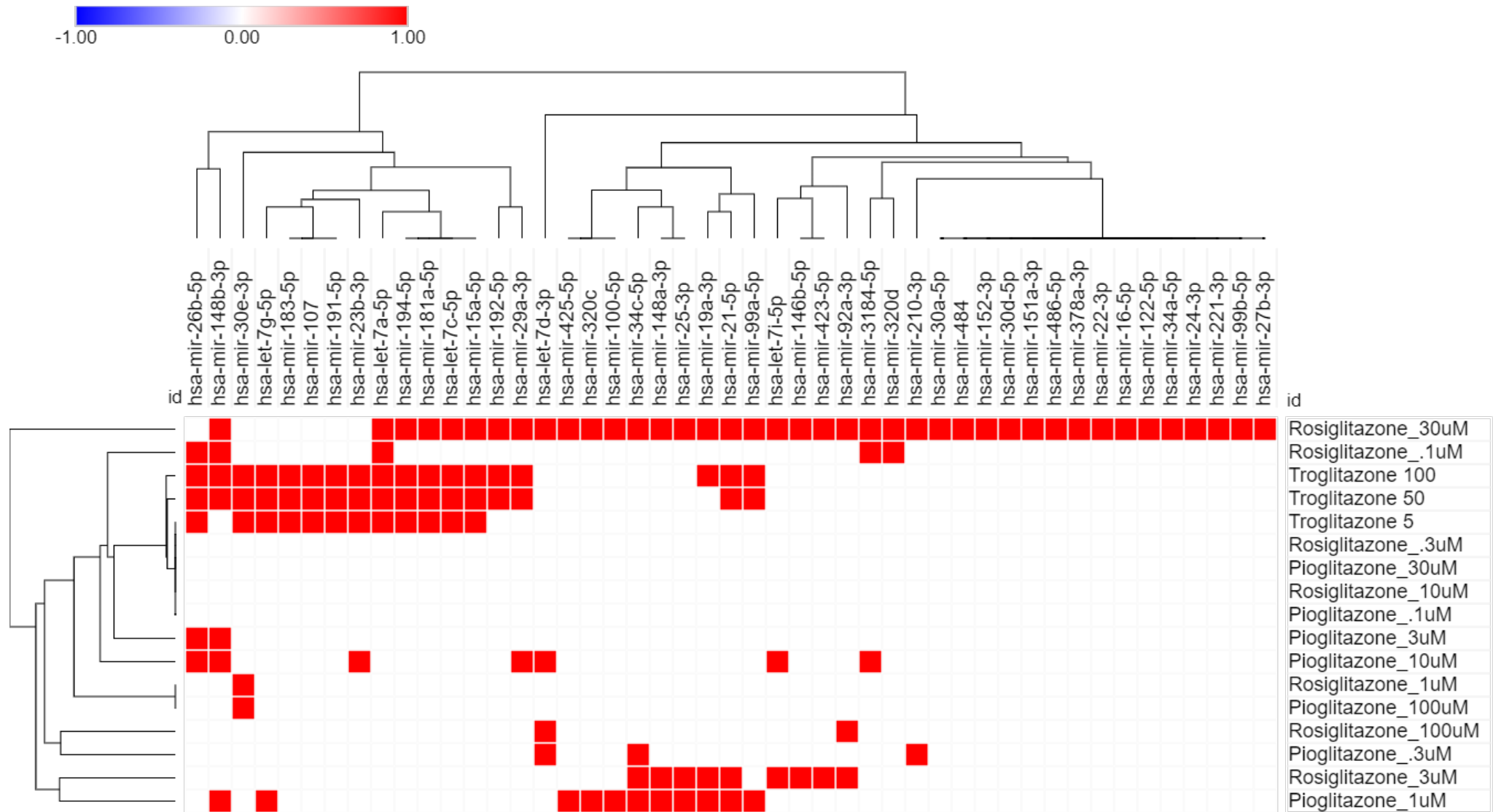


# BMAD threshold calls: Statins (HMGCR inhibitors)





# BMAD threshold calls: PPARg agonist





## Summary: HepaRG media study

- Established extracellular microRNA patterns linked to chemical mechanism-of-action
  - Cellular toxicity due to chemical exposure is correlating highly with the “shockwave” toxicity pattern
  - However, some signatures seen with non-toxic doses. Does this link to a specific MoA? Does it link with more apical cellular effect?
- Will link to gene expression networks and cellular microRNA alterations
  - HTTr data and small RNA sequencing are being performed for cell lysates
  - We will leverage this data and in silico prediction algorithms to identify correlations between miRNAs and gene expression regulation (node identification)
- Distinguish active versus passive release of miRNA into media (cellular response vs toxicity)

# Conclusions

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- **Overall, the evidence in these studies suggest microRNAs may serve as useful biomarkers for chemical screening and hazard identification in multiple toxicological contexts**
- In human populations, miRNAs in blood correlated with disease markers and exposure
- In short-term mouse studies of exposure, miRNAs linked to primary mechanism-of-action dose-dependently responded
- *In vitro*, non-destructive measurements of miRNA in media are indicative of mechanism-of-action
- Future studies will strengthen mechanistic relationship of miRNA alteration and cellular response

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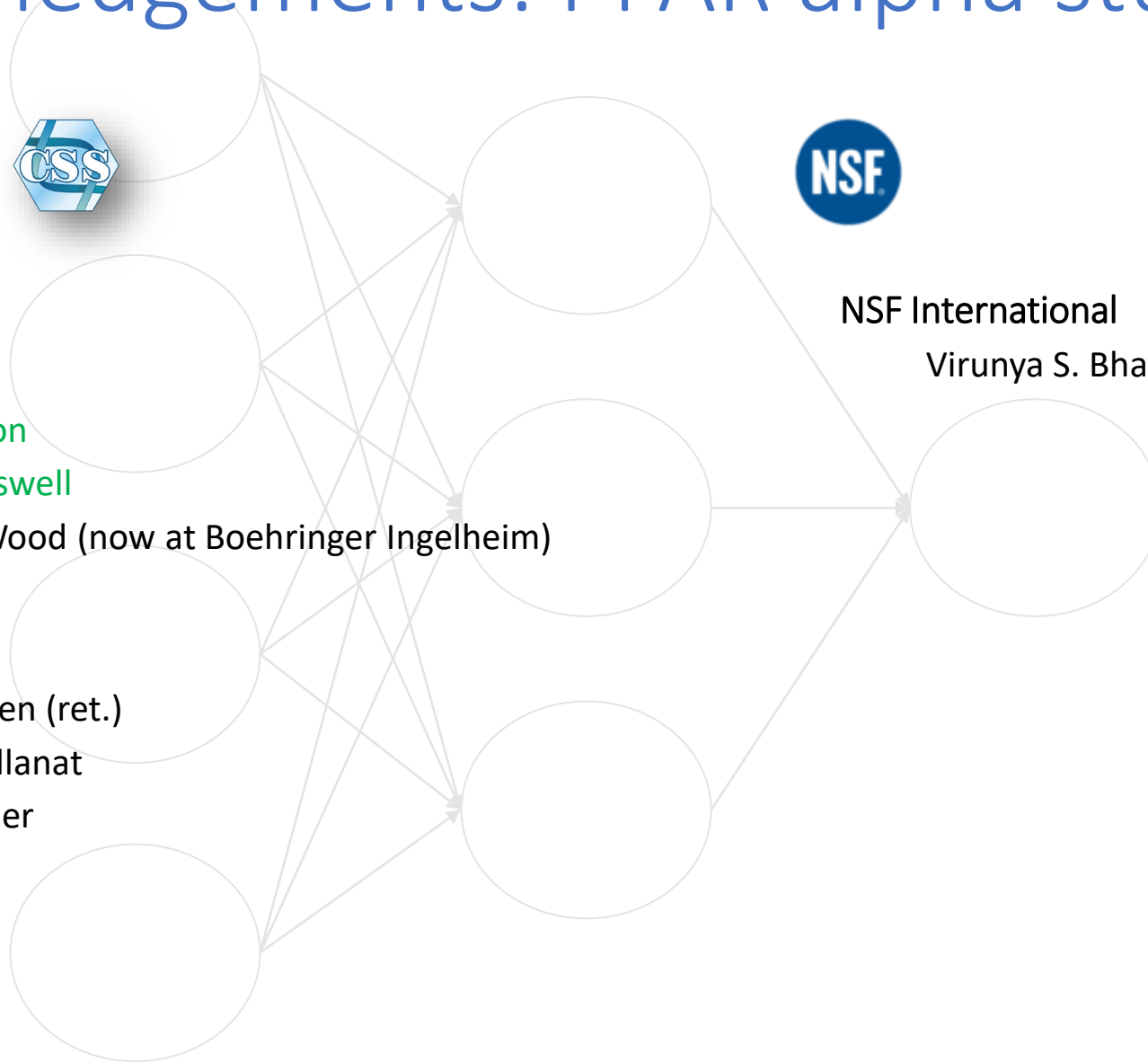
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Pathfinder Innovation Projects challenge EPA scientists to answer the question, "Wouldn't it be amazing if we could ... ?"

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Thank you and any questions?

