

Hazard Characterization and Grouping of PFAS using a Compendium of Human Cell Lines from Different Organs

Lucie Ford

Interdisciplinary Faculty of Toxicology, Texas A&M University

April 10th, 2024



Acknowledgments

- Dr. Ivan Rusyn - PI
- Dr. Weihsueh Chiu
- Dr. Fred Wright
- Dr. Stephen Safe
- Han-Hsuan (Doris) Tsai
- Hsing-Chieh (Candice) Lin
- Dr. Suji Jang
- Dr. Zunwei Chen
- Dr. Sarah Burnett
- Rusyn Lab Members

Collaborators:

Chiu Lab TAMU

Wright Lab NCSU

Sciome (Drs. Sedykh & Shah)



Funding Sources



Grant: P42 ES027704

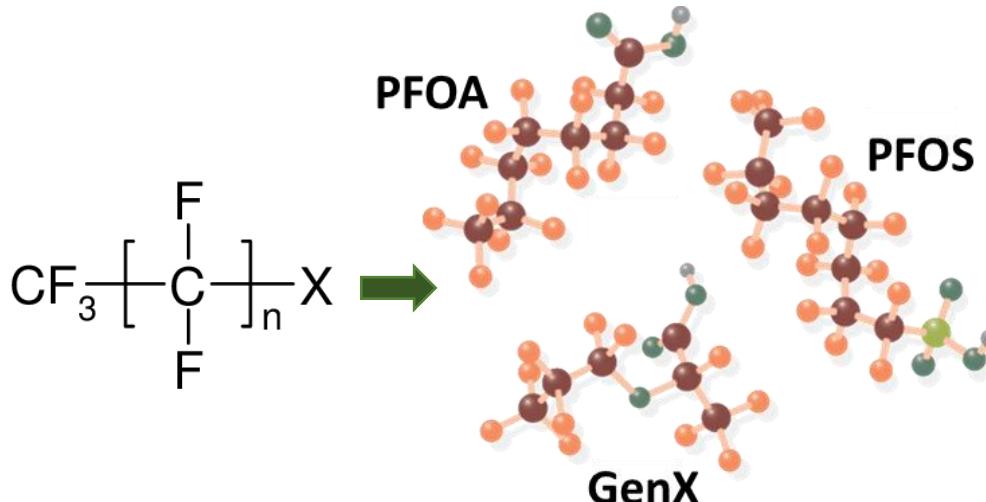
Grant: T32 ES026568



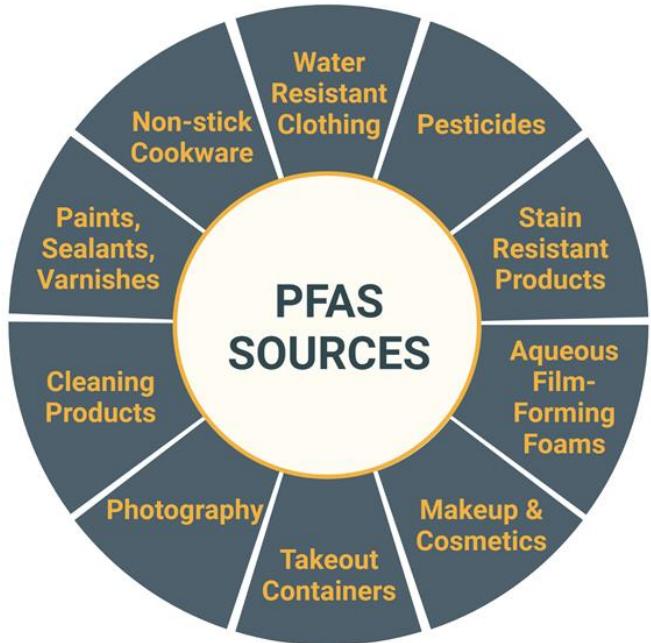
TEXAS A&M
UNIVERSITY®

Texas A&M University
Merit Fellowship

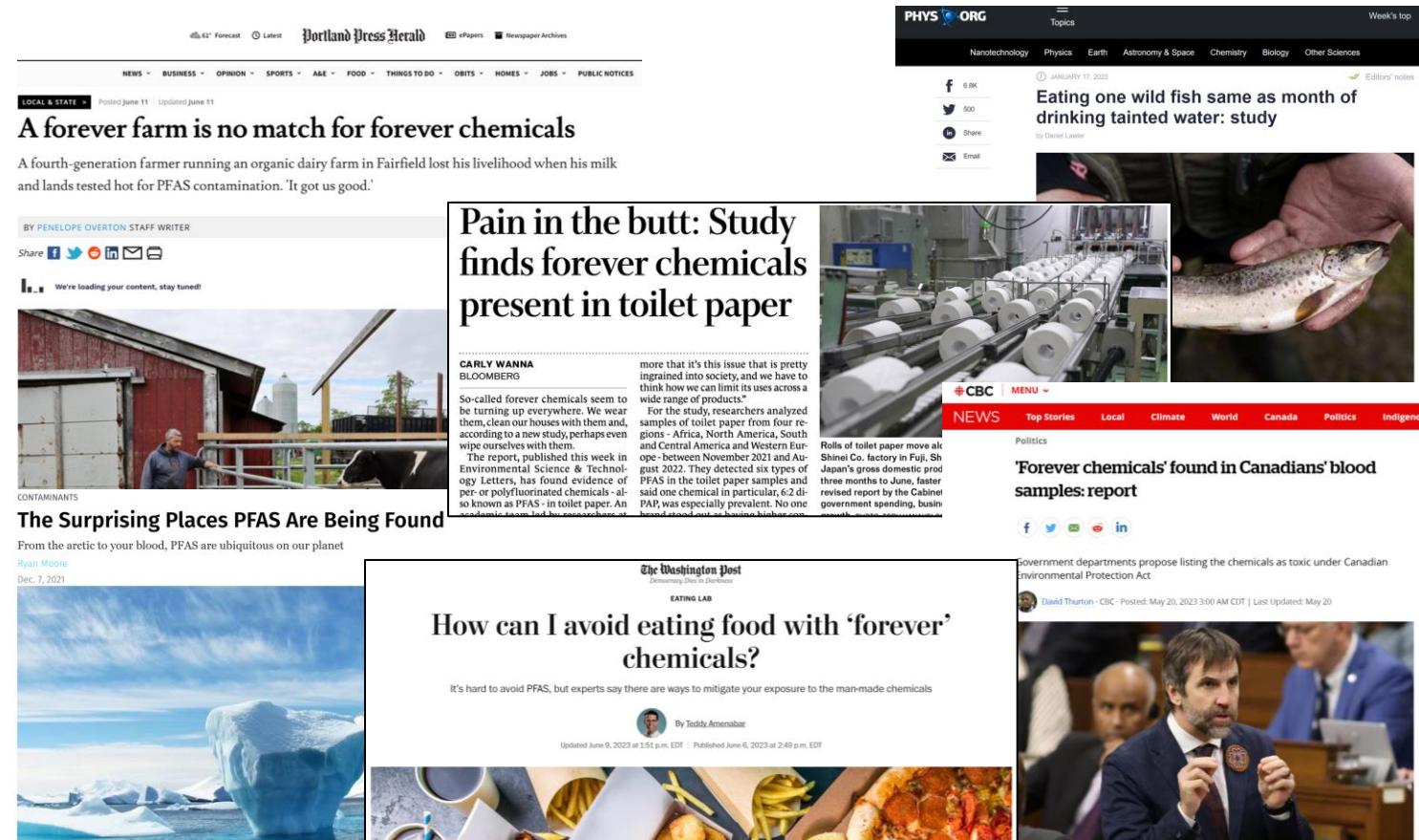
Structural Diversity Scope of PFAS



Use & Applications



- Synthetic chemicals used since the 1940's in a variety of manufacturing facilities and consumer products
- **Defining PFAS:** any substance that contains at least one fully fluorinated methyl (CF₃-) or methylene (-CF₂-) carbon atom (without any H/Cl/Br/I attached to it)
- Currently more than **10,000 PFAS** in commerce



Current Regulations & Restrictions

Pre- 2010

2010-2020

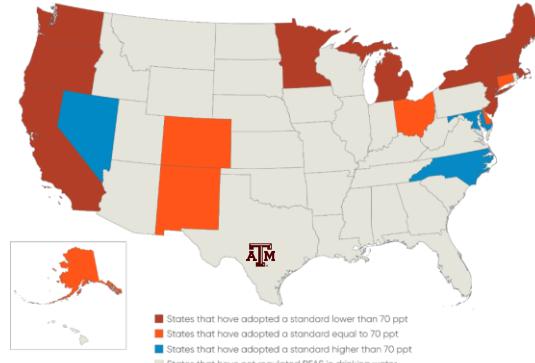
2021-2024

European Union

- PFOS have been included in the Stockholm Convention to eliminate their use
- PFOS restricted in the EU under the persistent organic pollutants (POPs) regulation
- Safety Threshold for PFAS in food
- PFOA banned under the POPs regulation
- Substances of Very High Concern under REACH
 - Based on persistence, mobility, and toxicity
- PFAS restriction proposal submitted to ECHA
 - Option A: Full Ban
 - Option B: Ban with use-specific derogations (proposed restriction)
- Restriction proposal for PFAS in firefighting foams
- PFHxS added to ban for POPs regulation
- Drinking Water Directive: limit of 0.5 ug/L for all PFAS

USA

- EPA published Significant New Use Rules impacting several hundred PFCAs and PFSAs
- EPA drinking water limit for PFOA and PFOS was set to 70 ppt
- Implemented 2010-2015 PFOA Stewardship Program
- 30/50 states have state-level restrictions with levels between the original proposed drinking water levels, and the newly proposed levels
 - California – 5.1 ppt for PFOA & Nevada – 667,000,000 ppt for PFBS
- EPA proposed National Primary Drinking Water Regulation
- EPA designates 2 PFAS: PFOA and PFOS as hazardous substances under CERCLA
- EPA updated drinking water advisories for PFOA and PFOS and a few alternatives
 - PFOS (0.02 ppt), PFOA (0.004 ppt), GenX (10 ppt), PFBS (2,000 ppt)
- EPA Unregulated Contaminant Monitoring Rule to establish nationwide monitoring for 29 PFAS



US Federal Government PFAS Programs

- [CDC/ATSDR](#) – PFAS assessments in communities near current or former military bases (both exposure and health surveys for 6 PFAS)
- [CDC/NHANES](#) – ongoing assessment of the U.S. population's exposure to environmental chemicals (biomonitoring for 17 PFAS in blood and urine)
- [White House Office of Science Technology Policy](#) – State of the Science Report to be used as a “PFAS roadmap” for Federal Agencies
- [U.S. EPA](#) – new data collection through ToxCast, ExpoCast, including IVIVE
- [NASEM](#) – examining health outcomes associated with PFAS on behalf of CDC



NATIONAL ACADEMIES

Sciences
Engineering
Medicine



Centers for Disease
Control and Prevention

ATSDR
AGENCY FOR TOXIC SUBSTANCES
AND DISEASE REGISTRY



National Health and Nutrition Examination Survey

PFAS Data Gaps: How to Group PFAS?



National PFAS Testing Strategy: Identification of Candidate PFAS for Testing

and could further inform the Agency's future research, monitoring, and regulatory efforts. Given the large number of PFAS to which exposures may have occurred or that are currently ongoing, the Strategy is based on an approach that groups similar PFAS into categories. The categories serve as the basis for both identifying PFAS chemicals for testing as well as allowing EPA to establish toxicity levels for PFAS within the identified categories. Thus, rather than seeking data about each of the thousands of individual PFAS, which would require extensive resources in terms of time, costs, and animals, the Strategy aims to identify a representative substance(s) for each chemical category where categories have been constructed to span the landscape of PFAS of interest.

- Group similar PFAS into categories
- Substances that cover entire PFAS landscape
- Test representative substances for each category



Assessing Groups of PFAS

ECHA's database contains information of several thousand individual PFAS on the EU market. These belong to a variety of subgroups. Assessing and, where relevant, managing risks subgroup by subgroup would require a considerable amount of time. Therefore, ECHA acknowledges that a holistic group approach to regulatory assessment and risk management needs to be explored.

- Subgroup approaches are time intensive
- Holistic group approach to group substances



PFAS Report

Grouping by mechanism of action and/or structure will facilitate development of mechanistically and/or empirically based prediction models to estimate toxicity thresholds for additional PFAS.

- Grouping strategies based on structure and/or mechanism of action
- Subsequent predictive modeling for other PFAS

PFAS Data Gaps: Inter-Individual Variability



Sciences
Engineering
Medicine

Guidance of PFAS Exposure, Testing, and Clinical Follow-Up

The presence of PFAS in everyday consumer products may be an important source of exposure for the general population, but this likely varies greatly by individual (Rodgers et al., 2022). Consumer are not distributed uniformly across populations. Race, ethnicity, poverty, age, life stage, and other social factors can place people at disproportionately high risk for diseases with environmental causes as a result of hazardous exposures at increased levels compared to the general population (Gochfeld and Burger,

Note that interindividual variability in PFAS testing results may be a function of differences not only in exposure but also in pharmacokinetics with respect to excretory clearance. Such host factors as parity, breastfeeding status, menstrual status, age, genetic polymorphisms, concurrent acute or chronic disease, and medication use can affect pharmacokinetics.



- PFAS exposure varies by individual
- Race, ethnicity, life stage, other social factors can introduce additional risk for diseases as a result of hazardous exposures
- Inter-individual variability introduced by differences in exposure and pharmacokinetics



FY 2022 – 2026 EPA Strategic Plan

and evidence that inform local decisions. Finally, where feasible based on availability of data and methods, EPA will explicitly and consistently assess risks to childhood lifestages and other vulnerable populations as part of the Agency's approach for developing risk assessments and in its research agenda.

EPA will support the development of new science to address uncertainties related to the environmental health of children and vulnerable populations, including through intramural and extramural research. EPA



- Assess risks to childhood lifestages and vulnerable populations
- Support research that addresses uncertainties



Annex XV Restriction Report

EUROPEAN CHEMICALS AGENCY

Goldenman et al. (2019) indicate that the contamination may be poorly reversible or even irreversible, and may reach levels that could render natural resources such as soil and water unusable far into the future, resulting in continuous exposure and unavoidable harmful health effects, particularly for vulnerable populations, such as children.



- Continuous PFAS exposure leading to unavoidable harmful health effects to the population including vulnerable individuals

PFAS Data Gaps: Cardiotoxicity



National PFAS Testing Strategy: Identification of Candidate PFAS for Testing

Testing for cardiac sensitization. Certain terminal categories consisting of short-chain volatile PFAS may be considered for testing for cardiac sensitization²⁸ because existing data for halogenated hydrocarbons indicate these compounds may lead to cardiac arrhythmias and occasionally to sudden death resulting from sensitization of the heart muscle to endogenous compounds in the body (e.g., adrenaline).^{29,30}

- Consider testing PFAS for cardiac sensitization
- Read-across indicates that exposure to PFAS may lead to cardiac arrhythmias



Sciences
Engineering
Medicine

Guidance on PFAS Exposure, Testing and Clinical Follow-Up

The committee observed gaps in the evidence, rendering the evidence inadequate or insufficient, for many health effects including the following:

- immune effects other than reduced antibody response, and ulcerative colitis;
- cardiovascular outcomes other than dyslipidemia;

- Gaps in current data or inadequate/insufficient data for a lot of health effects
- Cardiovascular toxicity



Annex XV Restriction Report

Liver toxicity and metabolic disruption	Increased serum alanine transferase (ALT) which is a marker of liver toxicity and fatty liver diseases
	Increases total and LDL-cholesterol
	Increased risk of cardiovascular diseases

- Exposure to PFAS leading to increased risk of cardiovascular diseases

Where do we go from here?

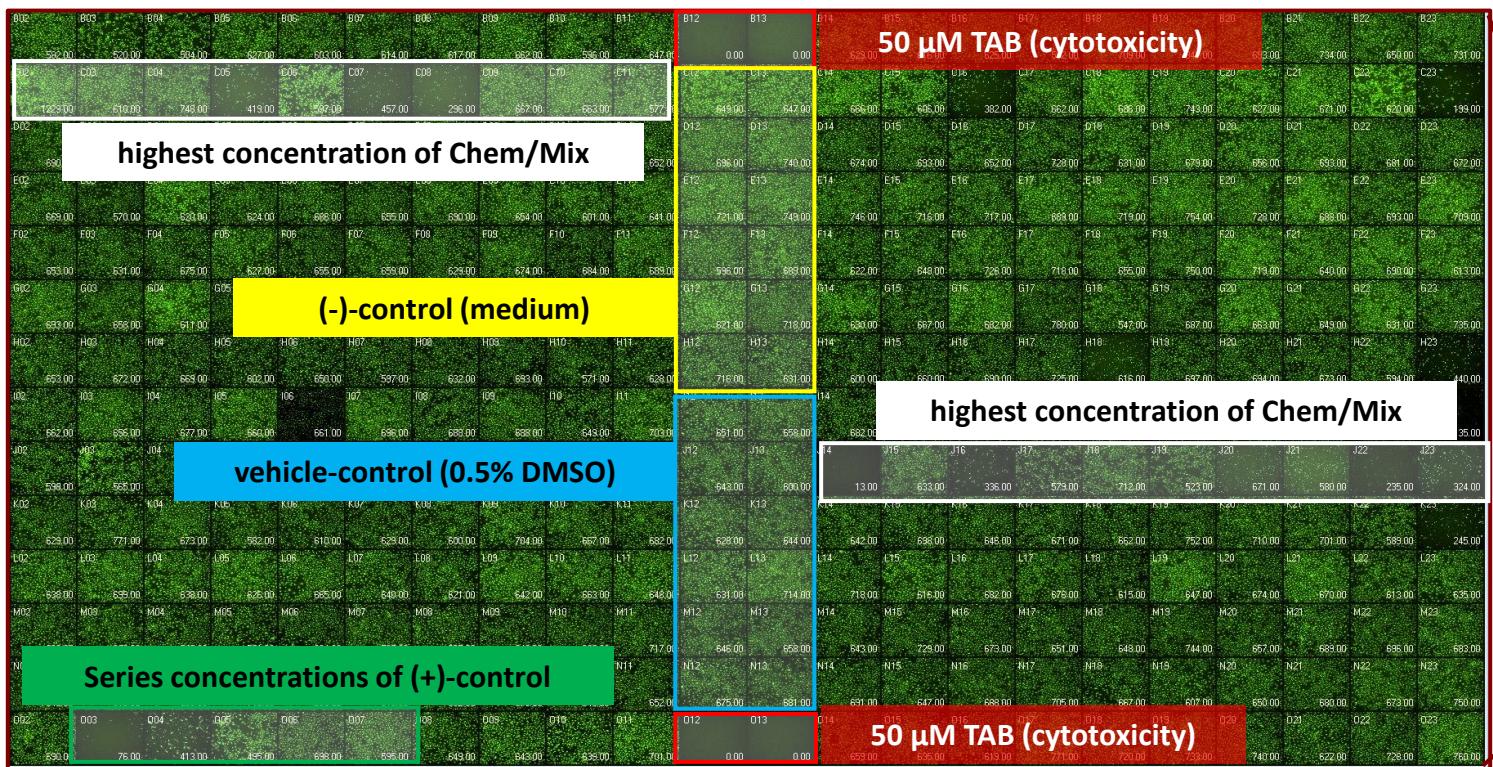
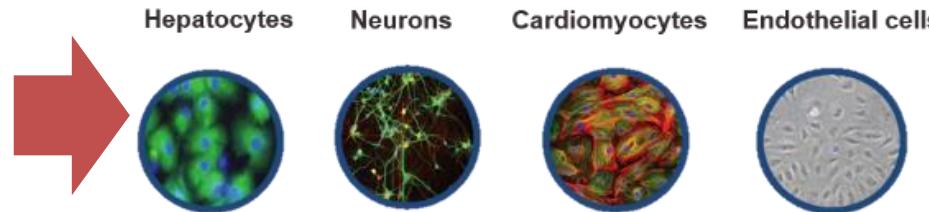
- Test, test, test more!
- Test using *in vitro* battery (**not *in vivo***)
 - Higher-throughput, time, cost, ethical reasoning
- Still, need to prioritize testing of representative PFAS based on hazard and/or exposure, reduce dimensionality
- Most available data cover a limited number of organs; need to address other “-icities” (including cardio)
- Can use *in vitro* models to address human variability



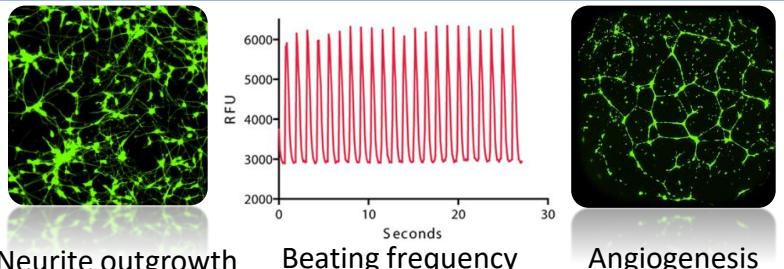
Solution: an optimized human cell-based battery of broad coverage assays

Rusyn Lab Case Studies: Using a Battery of hiPSC-Derived Cells for “Decision Making”

A compendium of Human iPSC-derived cells [96- or 384-well plates]



High content imaging-based phenotyping



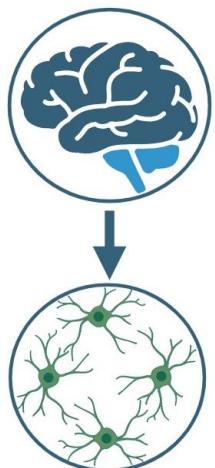
Data Analysis

ToxPi GUI (v 2.0)
(Toxicological Priority Index)

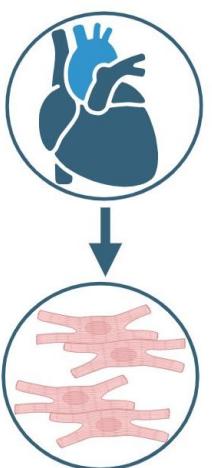


Using a Targeted Assay Battery of hiPSC-Derived Cells for “Decision Making”

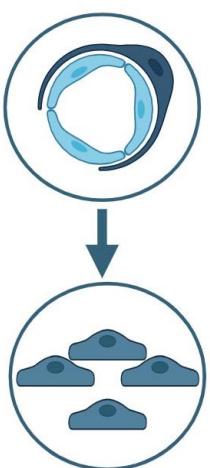
Neurons



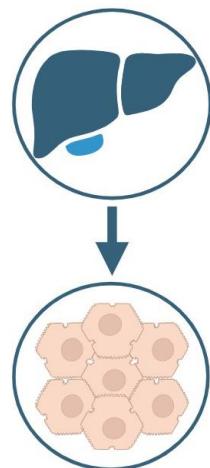
Cardiomyocytes



HUVECs



Hepatocytes

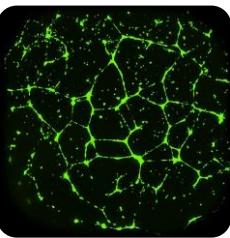
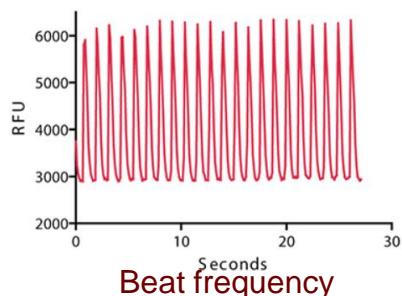
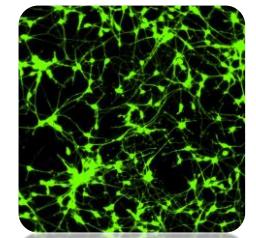


- Cytotoxicity
- Neur. growth

- Cytotoxicity
- Beating

- Cytotoxicity
- Angiogenesis

- Cytotoxicity
- Mitochondria



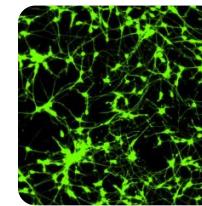
Neurite outgrowth

Beat frequency

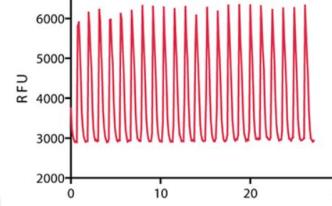
Angiogenesis

48 endpoints
total across
6 cell types

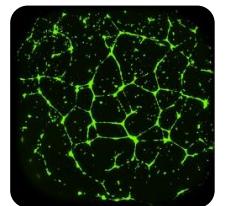
High content imaging-based phenotyping



Neurite outgrowth



Beating frequency



Angiogenesis



Data Analysis

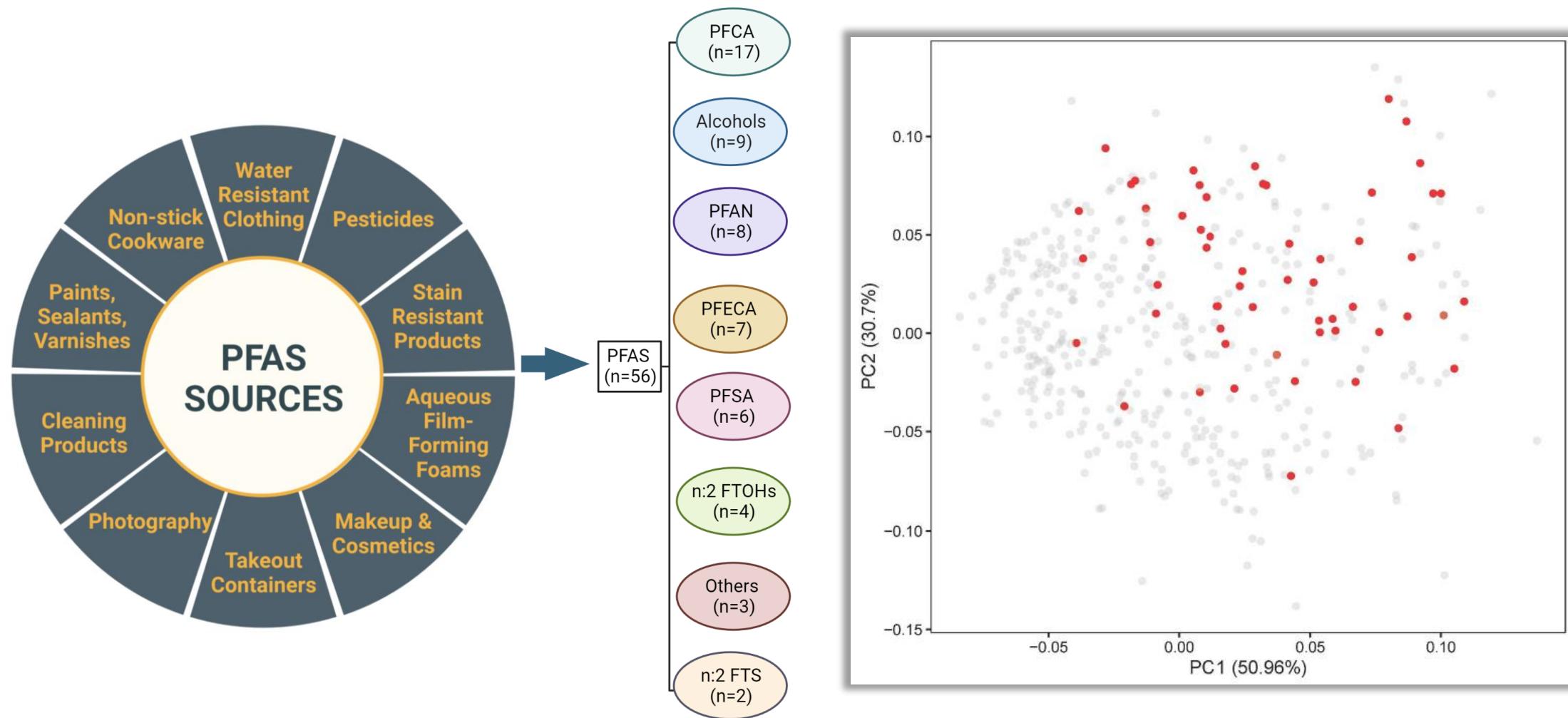
ToxPi GUI (v 2.0)
(Toxicological Priority Index)



Addressing Regulatory Science Questions

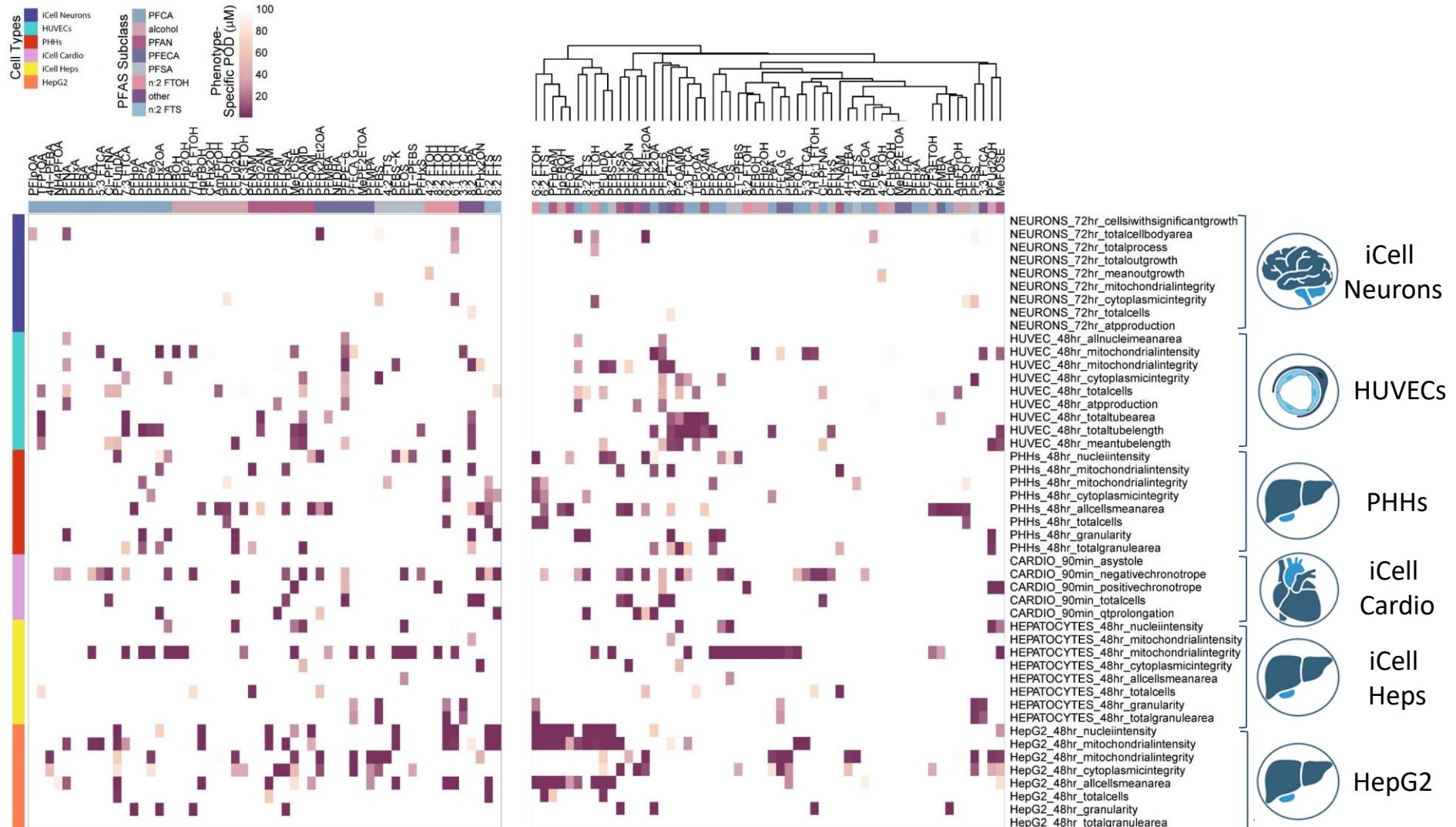
1. Are PFAS subclasses the best way to group PFAS?
2. Can we rank PFAS to identify trends based on the overall bioactivity?
3. Does *in vitro* bioactivity data exceed PFAS exposure levels?
4. How do our PODs benchmark to those from the CompTox Dashboard?
5. Compared to other industrial chemicals, how bad are PFAS?
6. Are PFAS potentially hazardous to cardiomyocytes?
7. Are there particular subpopulations at risk for PFAS exposure?

Conceptual Approach



Are subclasses the best way to group PFAS?

Big reveal of the ending...



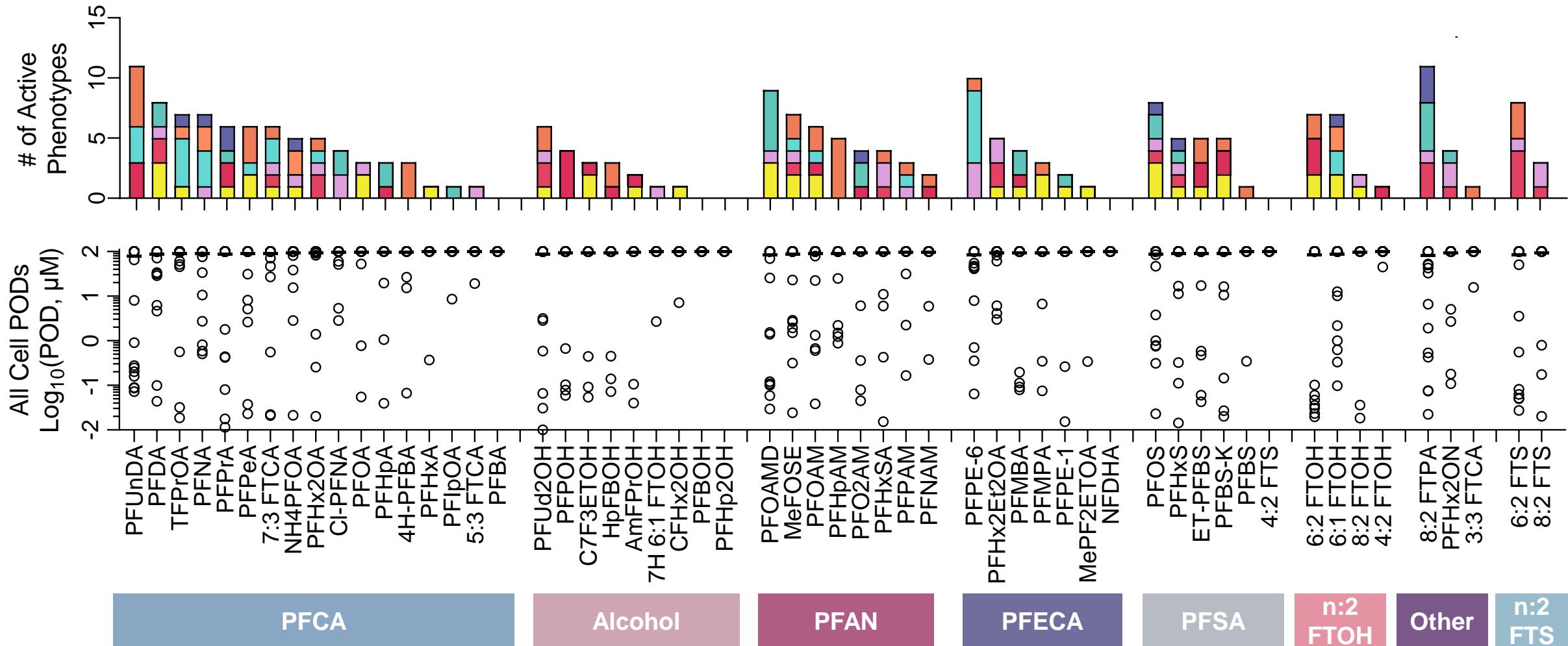
Are subclasses the best way to group PFAS?

Big reveal of the ending...

Descriptor ^a	Structure ^b	Descriptor Meaning	ρ ^c	P_{adj}^d	Chemicals with Descriptor	Cell Type (Phenotype)
SGR10703		N-attached double bonded heteroatoms				
SGR10587		Sulfonamide	-0.70	1.08E-05	MeFOSE PFHxSA	
SGR10099		Heteroatom-nitrogen bond				
SGR10668		Heteroatom-bonded methyl group	-0.70	1.08E-05	MeFOSE MePF2EtOA MeFOSE PFBOH MePF2EtOA	PHHs (Mitochondria Intensity)
SGR10199		Two oxygens, 5 bonds apart	-0.57	3.11E-02	MeFOSE PFBOH MePF2EtOA MeFOSE, PFPE-1, PFMBA	
SGR10032		Methyl group	-0.57	3.11E-02	AmFPrOH, PFHxSA, PFOAMD	iCell Heps (Cytoplasmic Integrity)
SGR10343		Any primary amine	-0.56	4.17E-02		
SGR10704		Polyethers	-0.69	2.84E-05	PFPE-6, C7F3ETOH	HUVECs (All Nuclei Mean Area)
SGR10013		Any carbon	-0.57	2.46E-02	All tested PFAS (C # varies)	
SGR10029		Any heteroatom	-0.57	2.79E-02	All tested PFAS (heteroatom # varies)	iCell Cardio (Min POD)
SGR10308		H-bond acceptors	-0.57	3.18E-02	All tested PFAS (# of H-bond acceptors varies)	

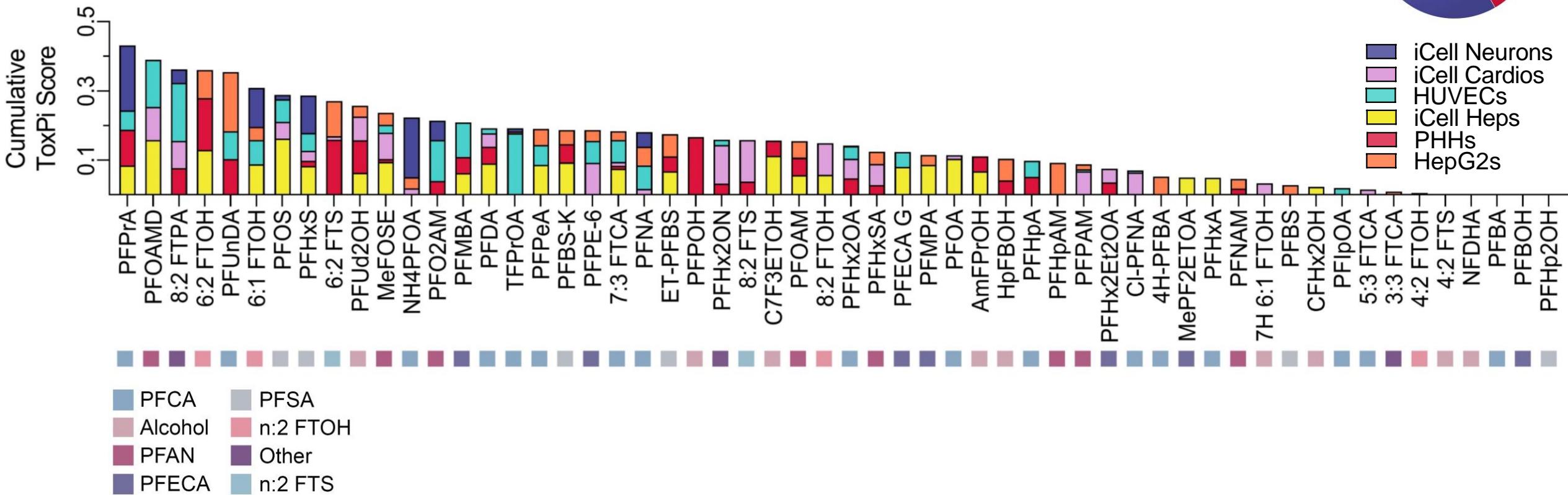
Can we rank PFAS to identify trends based on the overall bioactivity?

Good News! Little Bioactivity Observed across All Cell Types



Can we rank PFAS to identify trends based on the overall bioactivity?

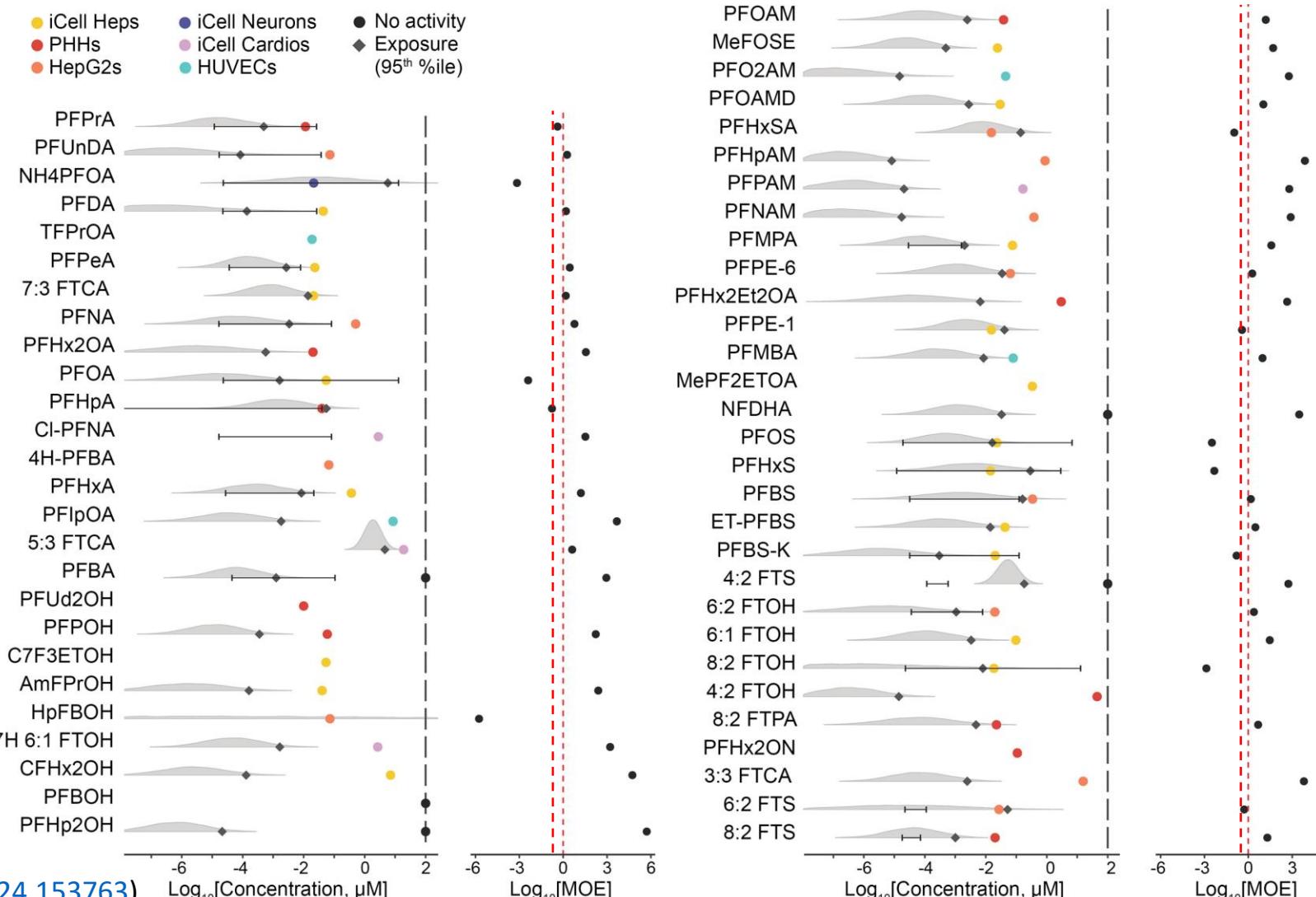
Using ToxPi to Rank and Prioritize PFAS



Does *in vitro* bioactivity exceed PFAS exposure levels? *Using phenotypic PODs*

- Is there overlap between exposure and observed PODs?
- Human health risk assessment considers a margin ≥ 100 “protective”
- Compare exposure predicted data/blood level concentrations to the most sensitive *in vitro* POD

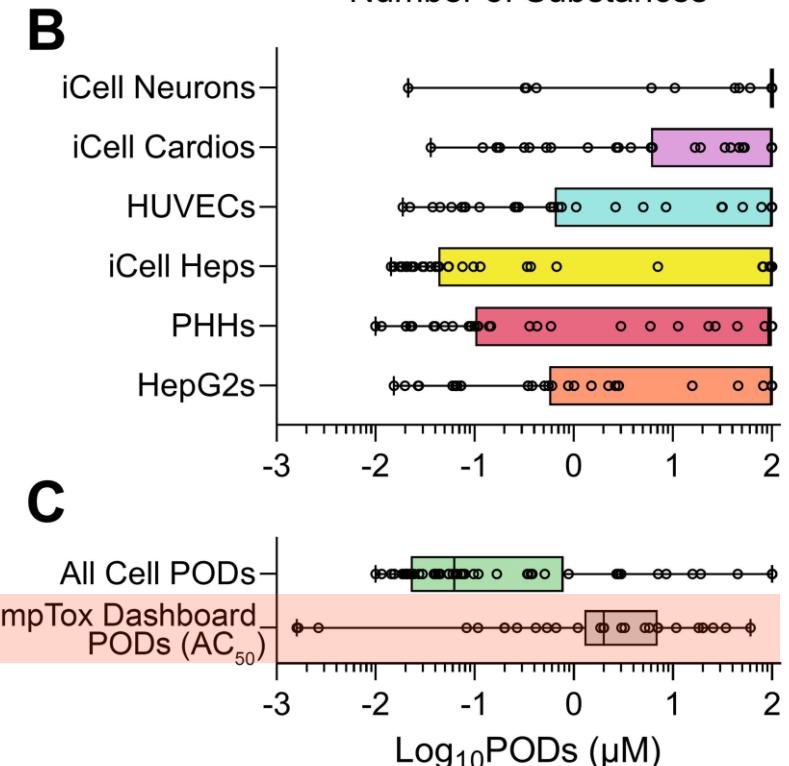
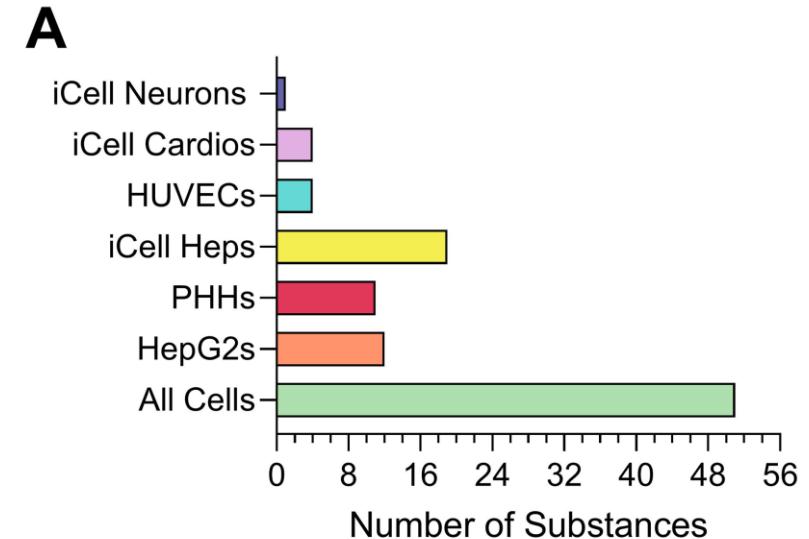
$$\text{Margin of Exposure (MOE)} = \frac{\text{POD or NOAEL}}{\text{Human Exposure}}$$
$$\text{Bioactivity Exposure Ratio (BER)} = \frac{\text{POD or NOAEL}}{\text{Margin of Safety (MOS)}}$$



How do our PODs benchmark to those from the CompTox Dashboard?

In Vitro Assay Battery Sensitivity Comparison

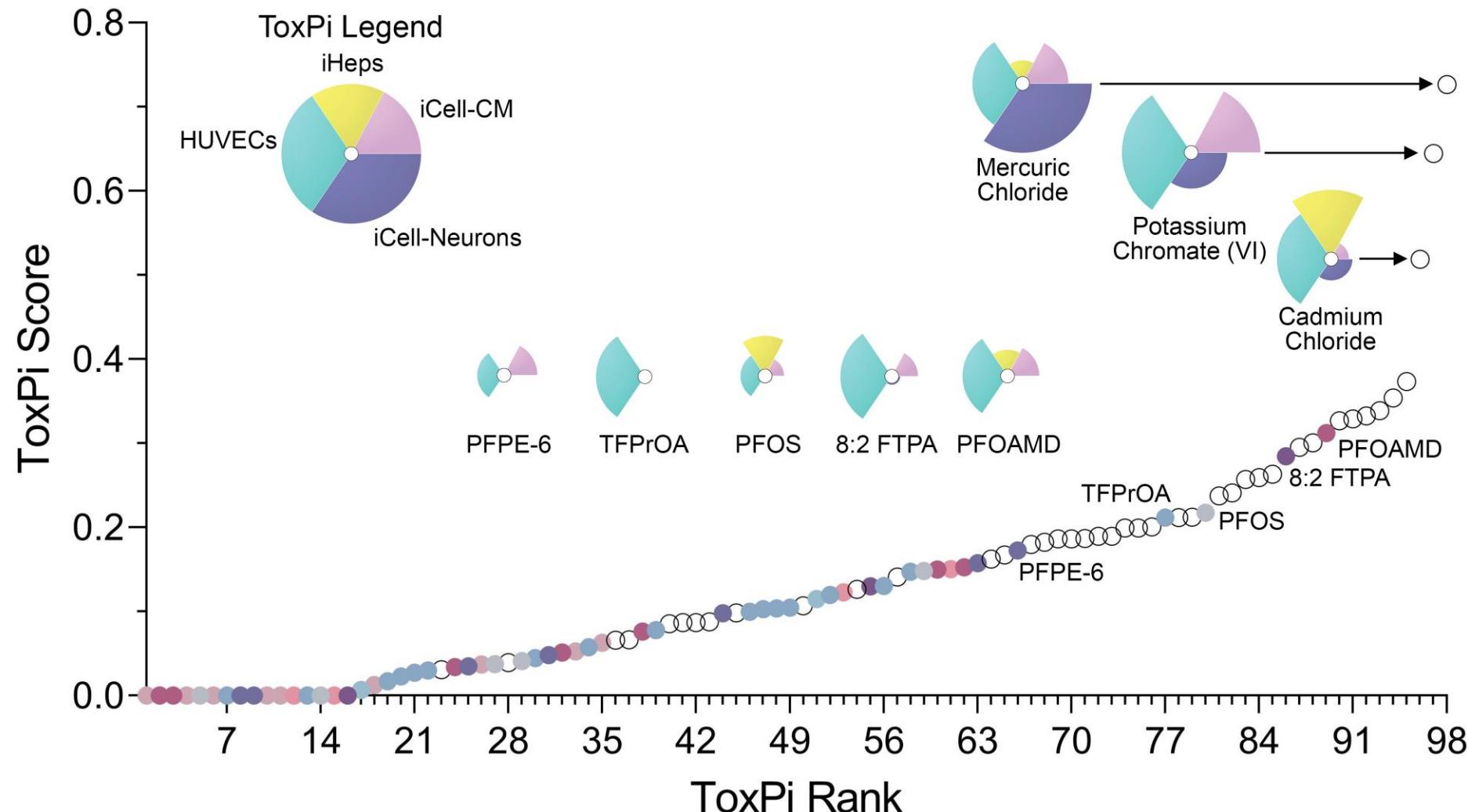
- Using the lowest AC₅₀ value from the human cell-based assays in the EPA CompTox Dashboard
- EPA assays are more sensitive when comparing to individual cell types
- Comparing to all cell types, the 6 cell types are more sensitive than EPA AC₅₀ values (n=20 *in vitro* models)



Compared to other industrial chemicals: how “bad” are PFAS?



VS.



Summary and Significance

- Cannot group by structure, other descriptors can be used for grouping
- Rank individual chemicals, but not subclasses
- Put *in vitro* data in the context of exposure, but still need more exposure data
- Optimized *in vitro* battery comparable sensitivity to ToxCast PODs
- PFAS not amongst the top ranked chemicals, in comparison to other industrial chemicals

PFAS Data Gaps: Cardiotoxicity



National PFAS Testing Strategy: Identification of Candidate PFAS for Testing

Testing for cardiac sensitization. Certain terminal categories consisting of short-chain volatile PFAS may be considered for testing for cardiac sensitization²⁸ because existing data for halogenated hydrocarbons indicate these compounds may lead to cardiac arrhythmias and occasionally to sudden death resulting from sensitization of the heart muscle to endogenous compounds in the body (e.g., adrenaline).^{29,30}

- Consider testing PFAS for cardiac sensitization
- Read-across indicates that exposure to PFAS may lead to cardiac arrhythmias



Sciences
Engineering
Medicine

Guidance on PFAS Exposure, Testing and Clinical Follow-Up

The committee observed gaps in the evidence, rendering the evidence inadequate or insufficient, for many health effects including the following:

- immune effects other than reduced antibody response, and ulcerative colitis;
- cardiovascular outcomes other than dyslipidemia;

- Gaps in current data or inadequate/insufficient data for a lot of health effects
- Cardiovascular toxicity



Annex XV Restriction Report

Liver toxicity and metabolic disruption	Increased serum alanine transferase (ALT) which is a marker of liver toxicity and fatty liver diseases
	Increases total and LDL-cholesterol
	Increased risk of cardiovascular diseases

- Exposure to PFAS leading to increased risk of cardiovascular diseases

PFAS Data Gaps: Inter-Individual Variability



Sciences
Engineering
Medicine

Guidance of PFAS Exposure, Testing, and Clinical Follow-Up

The presence of PFAS in everyday consumer products may be an important source of exposure for the general population, but this likely varies greatly by individual (Rodgers et al., 2022). Consumer are not distributed uniformly across populations. Race, ethnicity, poverty, age, life stage, and other social factors can place people at disproportionately high risk for diseases with environmental causes as a result of hazardous exposures at increased levels compared to the general population (Gochfeld and Burger,

Note that interindividual variability in PFAS testing results may be a function of differences not only in exposure but also in pharmacokinetics with respect to excretory clearance. Such host factors as parity, breastfeeding status, menstrual status, age, genetic polymorphisms, concurrent acute or chronic disease, and medication use can affect pharmacokinetics.



- PFAS exposure varies by individual
- Race, ethnicity, life stage, other social factors can introduce additional risk for diseases as a result of hazardous exposures
- Inter-individual variability introduced by differences in exposure and pharmacokinetics



FY 2022 – 2026 EPA Strategic Plan

and evidence that inform local decisions. Finally, where feasible based on availability of data and methods, EPA will explicitly and consistently assess risks to childhood lifestages and other vulnerable populations as part of the Agency's approach for developing risk assessments and in its research agenda.

EPA will support the development of new science to address uncertainties related to the environmental health of children and vulnerable populations, including through intramural and extramural research. EPA



- Assess risks to childhood lifestages and vulnerable populations
- Support research that addresses uncertainties



Annex XV Restriction Report

EUROPEAN CHEMICALS AGENCY

Goldenman et al. (2019) indicate that the contamination may be poorly reversible or even irreversible, and may reach levels that could render natural resources such as soil and water unusable far into the future, resulting in continuous exposure and unavoidable harmful health effects, particularly for vulnerable populations, such as children.



- Continuous PFAS exposure leading to unavoidable harmful health effects to the population including vulnerable individuals

Why are we interested in population-based *in vitro* methods?

Traditional Toxicity Testing Methods: *In Vivo*

- Time and labor-intensive, expensive, and low throughput
- Challenges with extrapolation to humans
- Models often overlook inter-individual variability
- Ethical concerns



New Approach Methods for Toxicity Testing: *In Vitro*

- Faster, cheaper, and higher-throughput
- Ability to look at biologically-relevant phenotypes
- Can evaluate inter-individual and intra-species variability
- Reduces use of animal testing



Population-Based Human *In Vitro* Models

- Human lymphoblast cell lines (1,000+ donors)
- Human induced pluripotent stem cell-derived cardiomyocytes (~43 donors)
- Assess inter-individual and chemical-specific variability
- Translation to humans



Are PFAS potentially hazardous to cardiomyocytes?

Experimental Design and Quality Control Assessment

iPSC-derived cardiomyocytes
from multiple donors (N=16)



Chemical Exposure to 56
Structurally-Diverse PFAS



Functional and Cytotoxicity
Assays



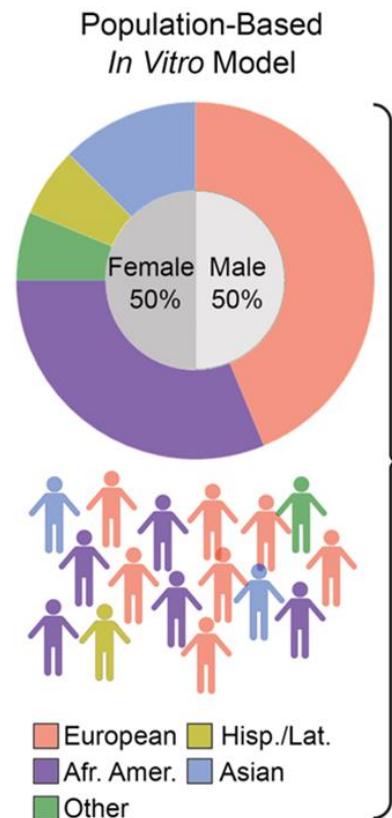
Cell-Line Specific Concentration
Response Modeling



Cumulative Distribution of
 $TDVF_{05}$



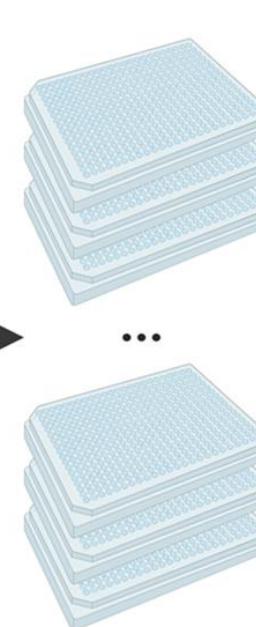
Chemical-Specific MOEs



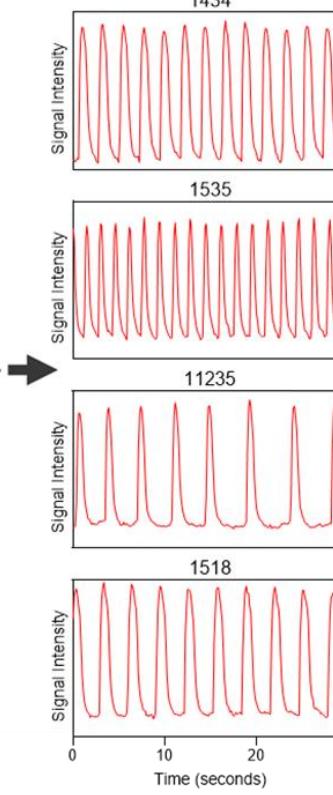
Representative
PFAS Subclasses

- PFCA (n=17)
- Alcohols (n=9)
- PFAN (n=8)
- PFECA (n=7)
- PFSA (n=6)
- n:2 FTOH (n=4)
- n:2 FTSA (n=2)
- Others (n=3)

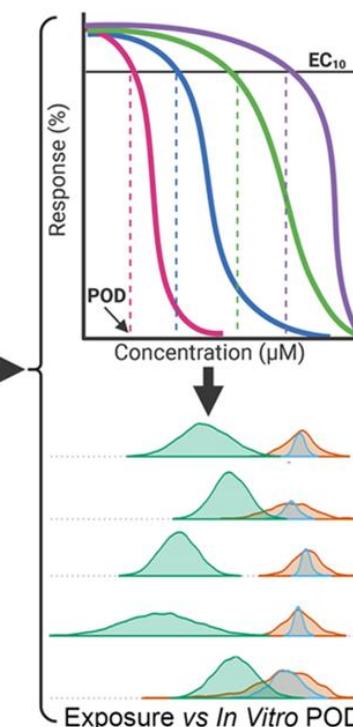
Technical
Reproducibility



Functional and
Cytotoxicity Phenotypes



Concentration-Response
and Margin of Exposure



Are PFAS potentially hazardous to cardiomyocytes?

Experimental Design and Quality Control Assessment

iPSC-derived cardiomyocytes
from multiple donors (N=16)



Chemical Exposure to 56
Structurally-Diverse PFAS



Functional and Cytotoxicity
Assays



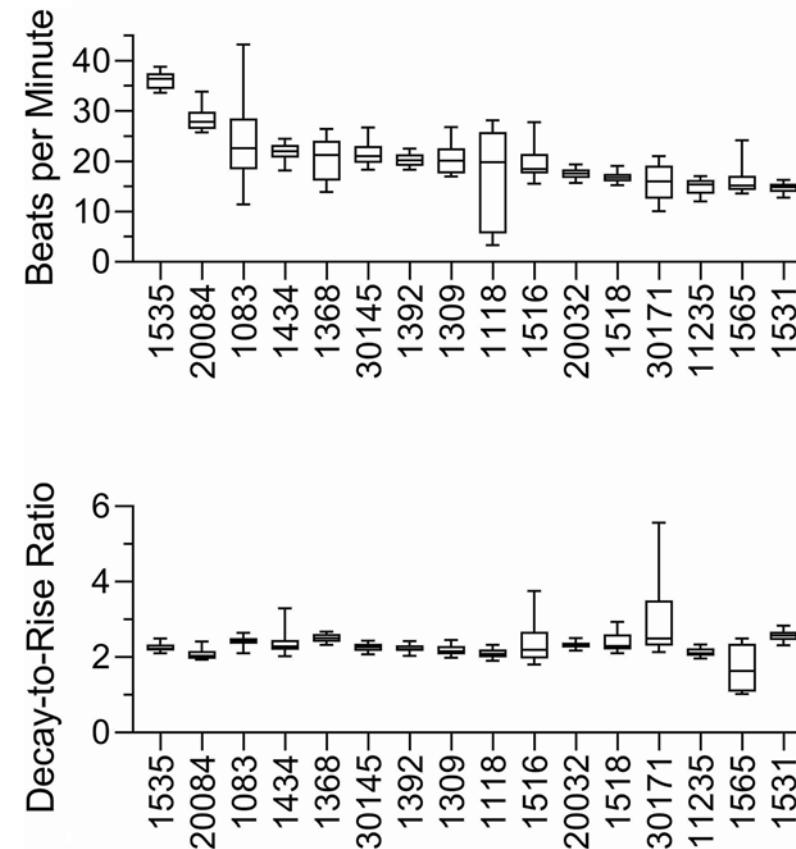
Cell-Line Specific Concentration
Response Modeling



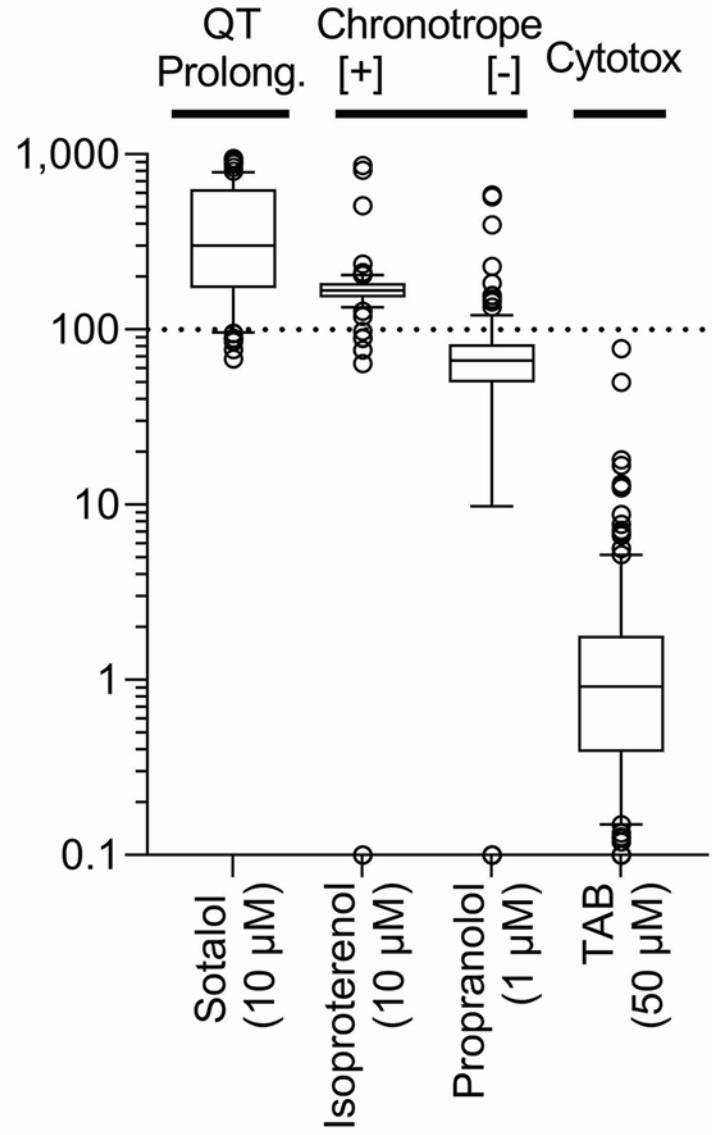
Cumulative Distribution of
 $TDVF_{05}$



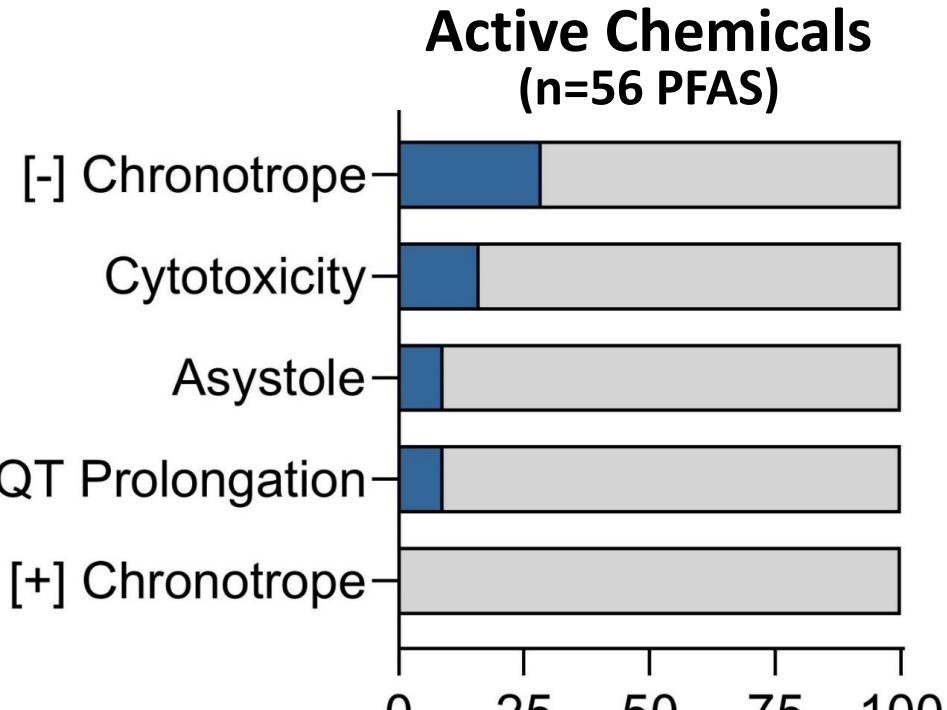
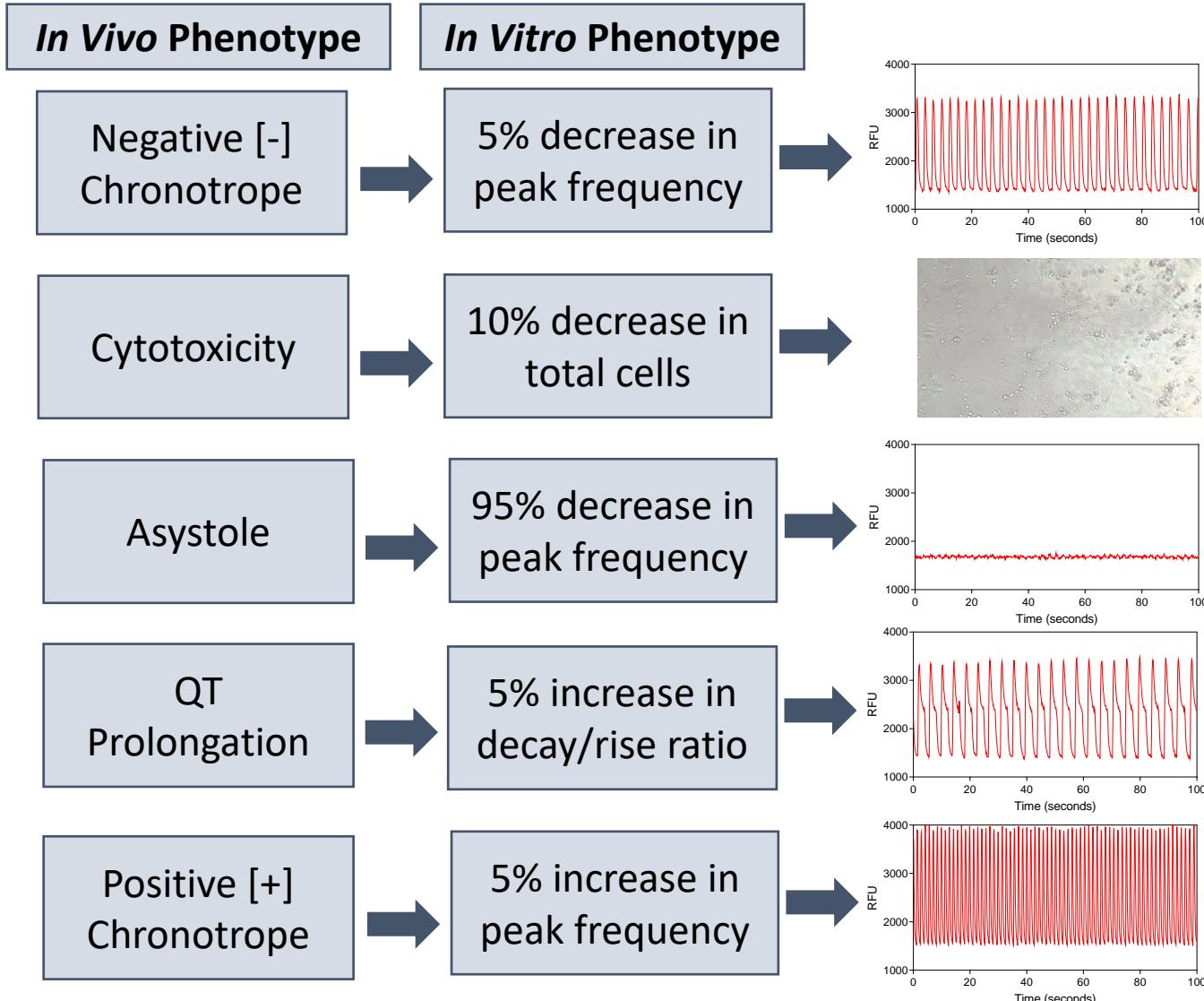
Chemical-Specific MOEs



Normalized Responses
(% of Vehicle Control)



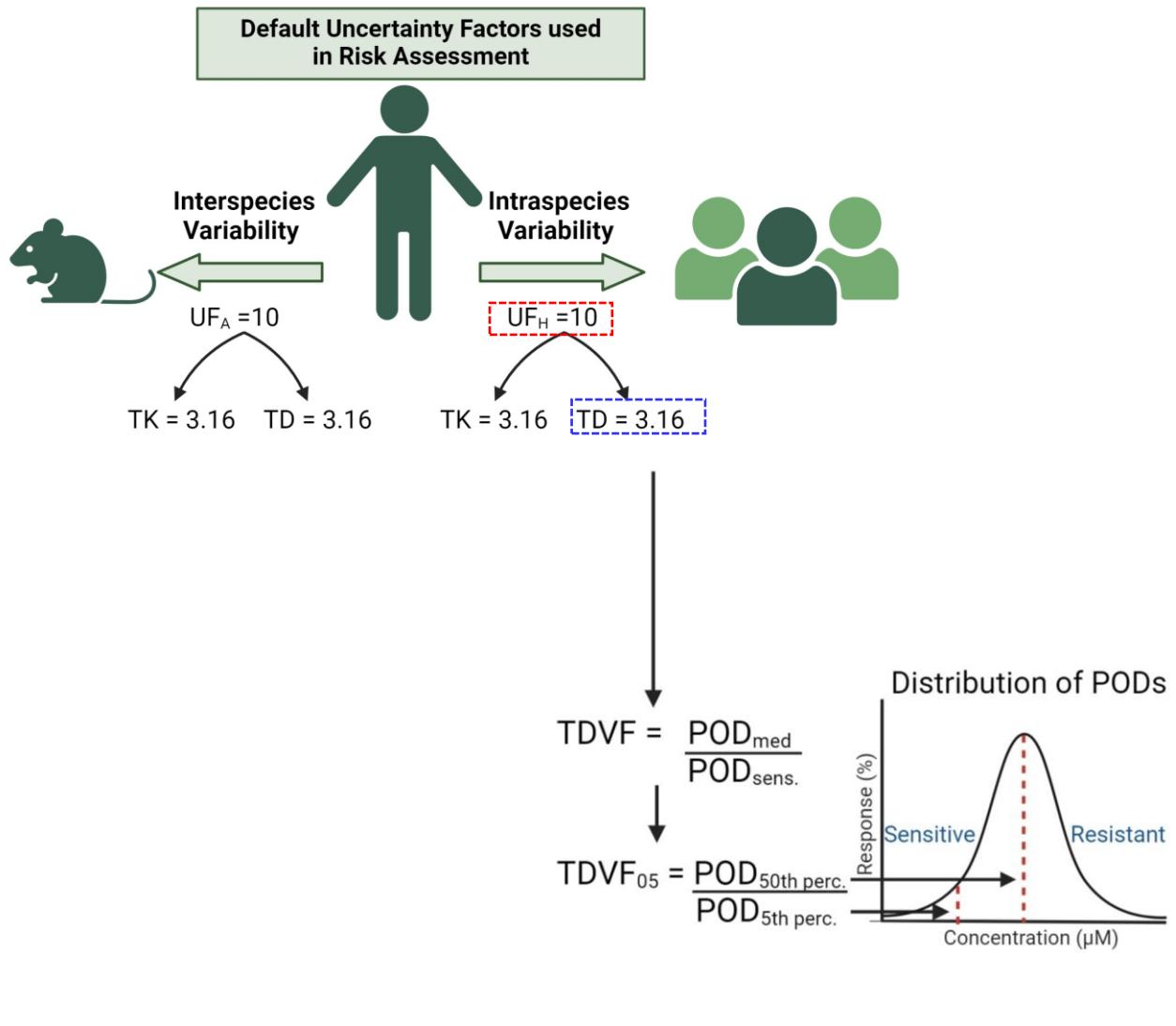
Are PFAS potentially hazardous to cardiomyocytes?



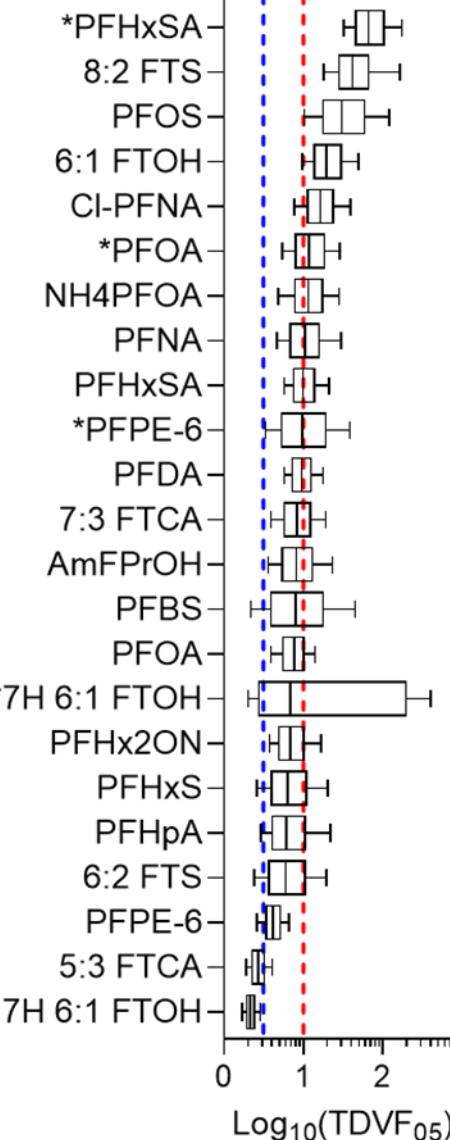
Percent Active

Active Inactive

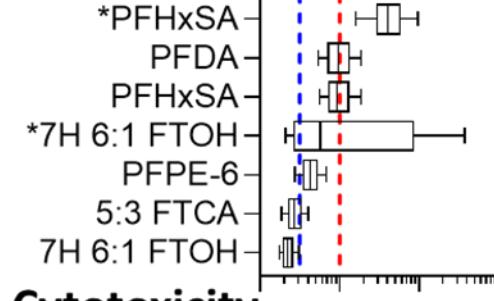
Are there particular subpopulations at risk for PFAS exposure?



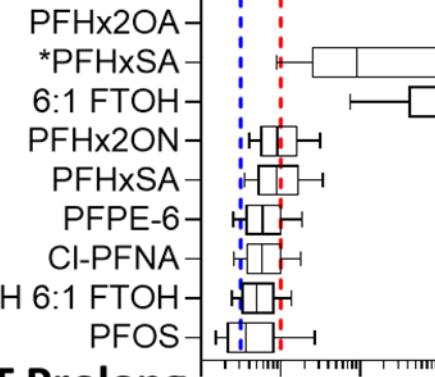
[-] Chronotrope



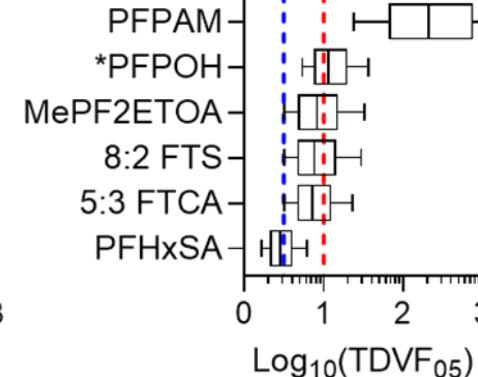
Asystole



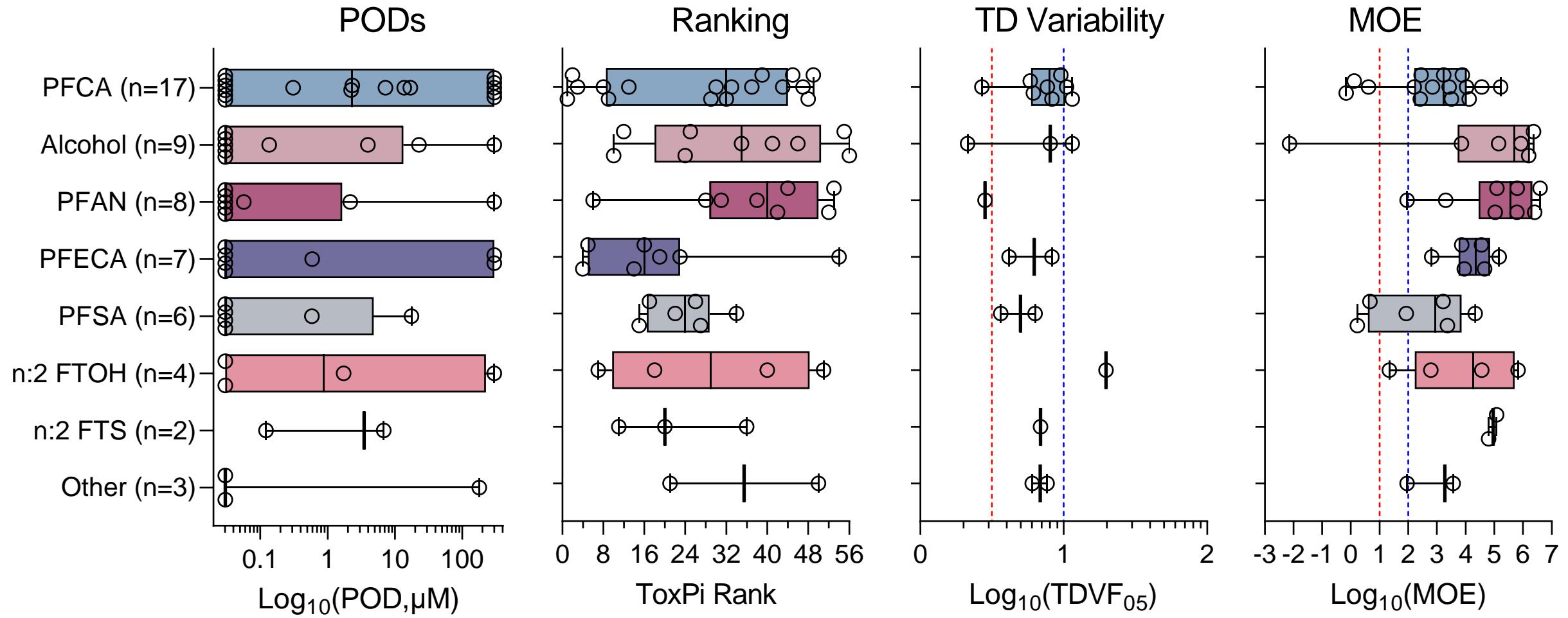
Cytotoxicity



QT Prolong.



Are subclasses the best way to group PFAS?



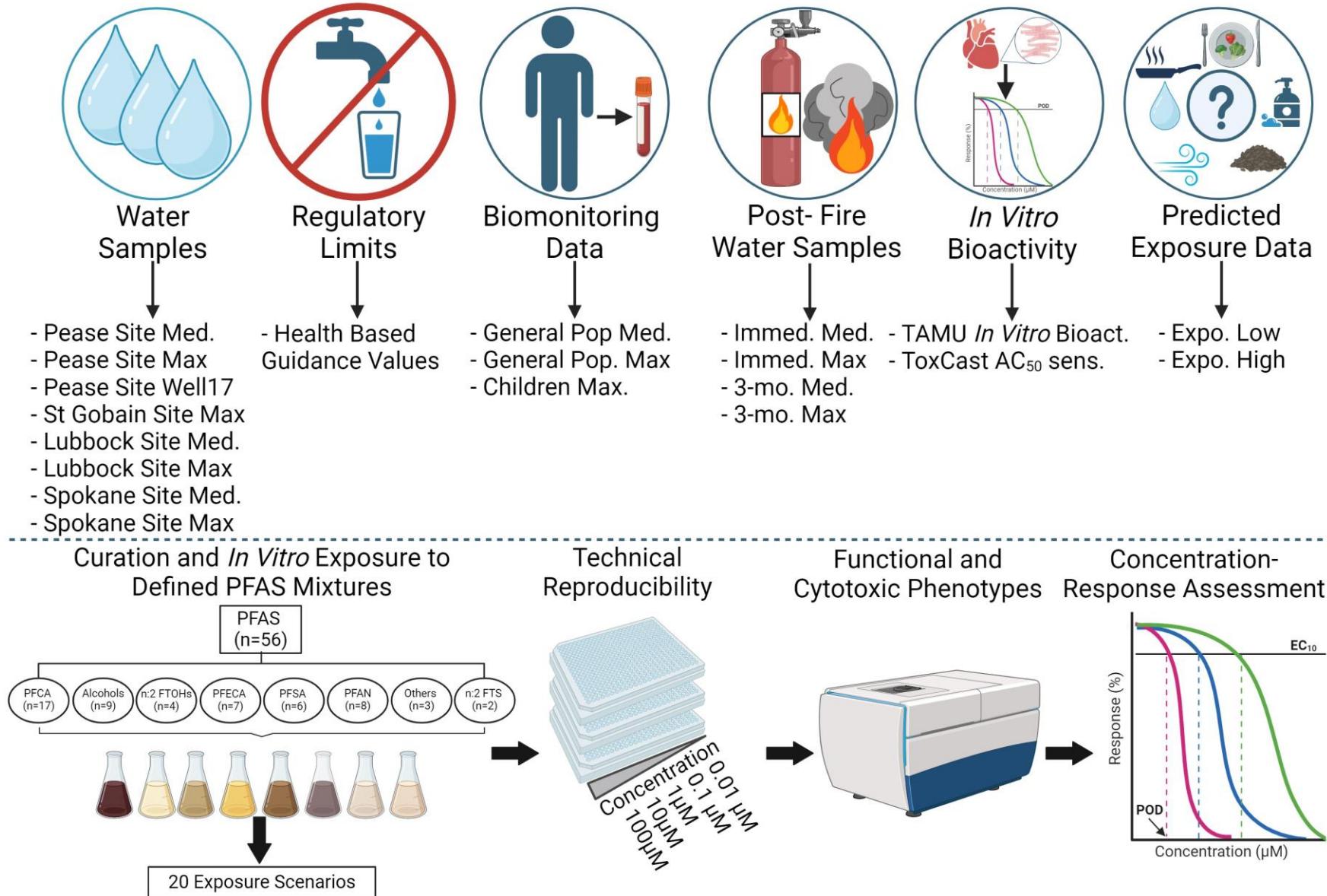
Summary and Significance

- Upon testing across various populations, no particular subpopulation was more/less sensitive
- Chemicals-specific TDVFs were typically HIGHER than the default uncertainty factor of $10^{1/2}$
- Cannot group by structure, but can prioritize chemicals
- We have hazard data, but need more measured exposure data to replace the predicted values

Summary & Takeaways

Regulatory Science Questions	Conclusions
1. Are PFAS subclasses the best way to group PFAS?	Cannot group by structure (shown by phenotypic and transcriptomic data)
2. Can we rank PFAS to identify trends based on the overall bioactivity?	Can rank individual chemicals, but not subclasses
3. Does <i>in vitro</i> bioactivity data exceed PFAS exposure levels?	We have hazard, but more exposure data is needed (not predicted)
4. How do our PODs benchmark to those from ToxCast?	Optimized <i>in vitro</i> battery comparable to ToxCast PODs
5. Compared to other industrial chemicals, how bad are PFAS?	PFAS not amongst top ranked chemicals, in comparison to other industrial chemicals
6. Are there particular subpopulations at risk for PFAS exposure?	Inter-individual variability was observed and can be quantified using <i>in vitro</i> methods

Where do we go from here?... Mixtures



How are mixtures currently assessed?

Current challenges in mixtures risk assessment:

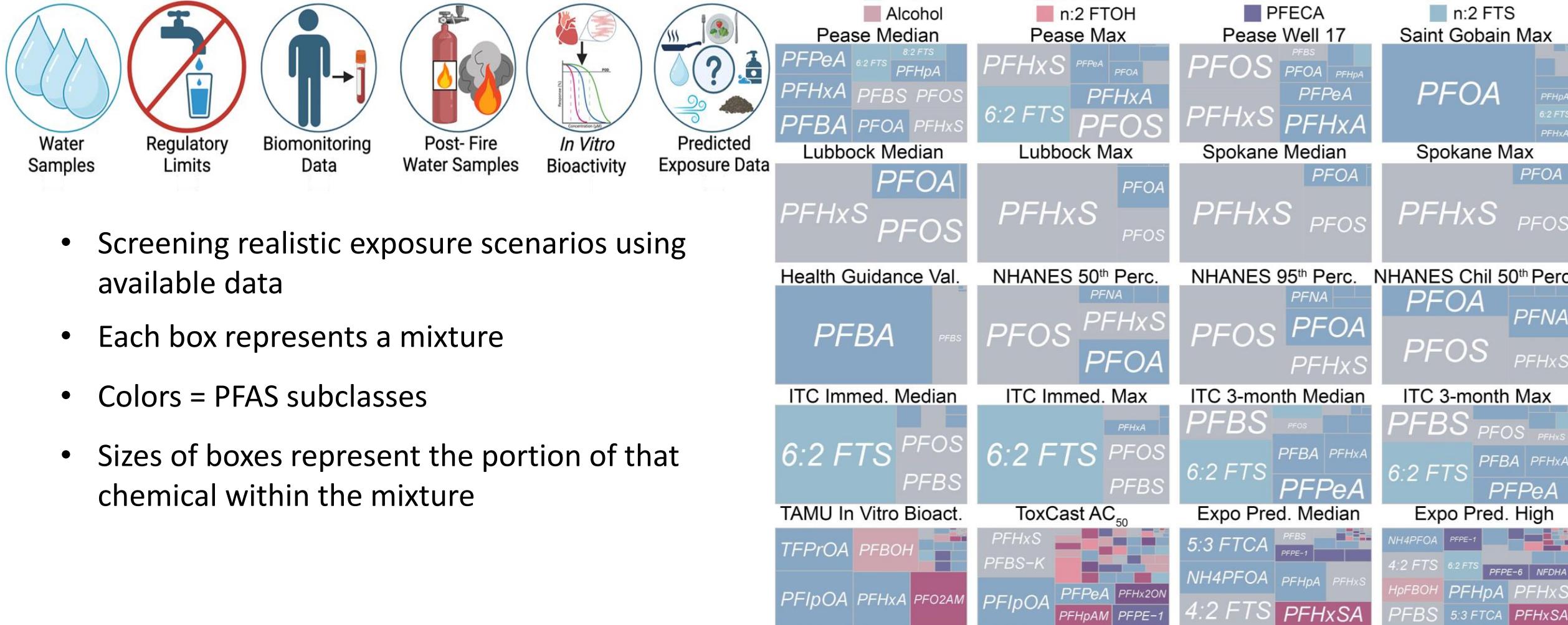
- Existing risk assessment methods rely on data from individual chemicals
- No standardized approach to assess risk of mixtures

- 1) Health effects
- 2) Unknown composition of the mixtures
- 3) Exposure assessment

Two proposed methods:

- 1) Whole-mixture approach
- 2) Component-based approach

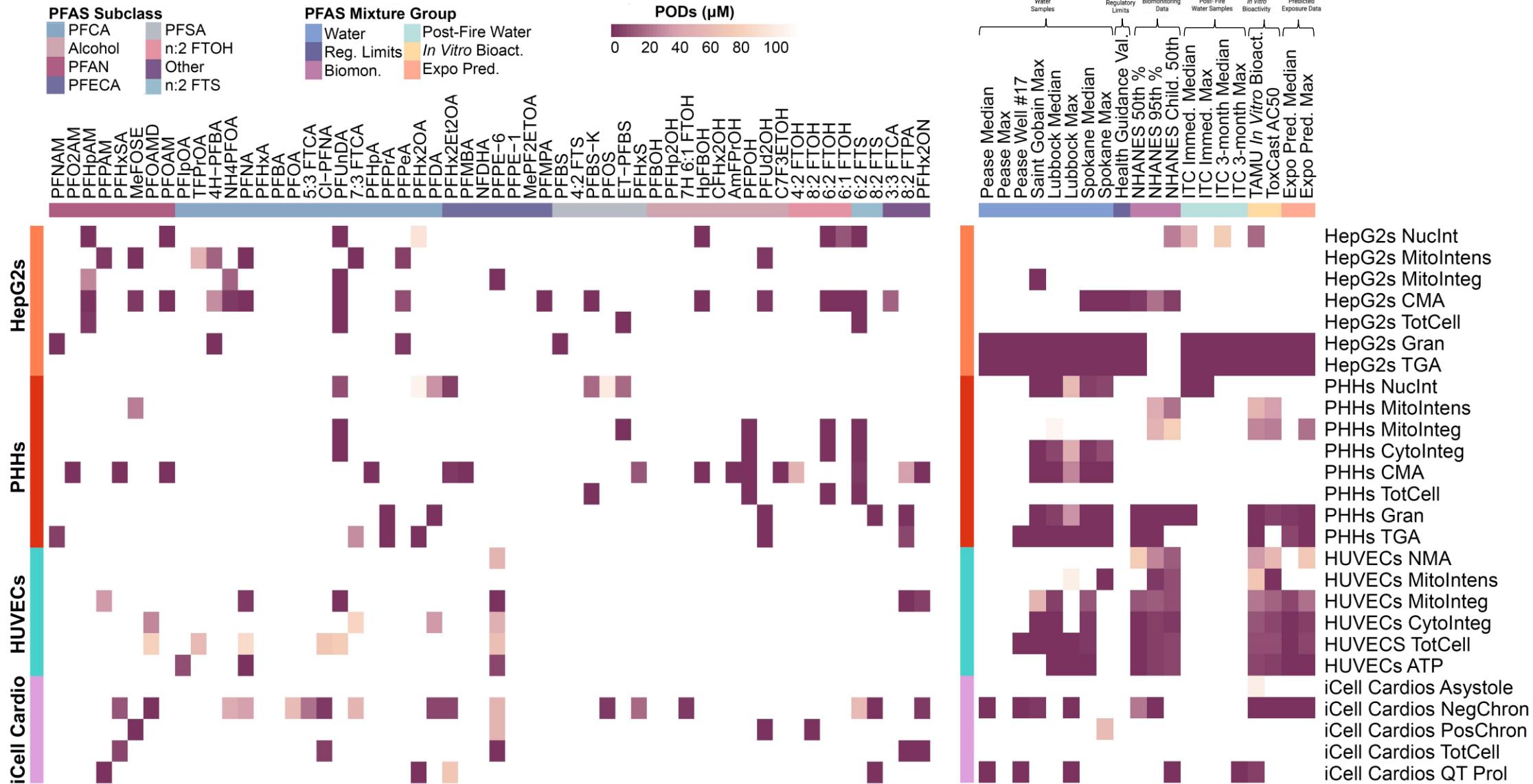
Where do we go from here?... Mixtures



- Screening realistic exposure scenarios using available data
- Each box represents a mixture
- Colors = PFAS subclasses
- Sizes of boxes represent the portion of that chemical within the mixture

Bioactivity Comparison

Single Chemical vs. Mixtures



Thank you!

Questions?

