

# Computational Toxicology and Exposure Communities of Practice



*Sharing research and promoting collaboration*

Thursday, November 14, 11 AM-12 PM ET

## Agenda:

- **Introduction: Sammy Hanf**  
Communications Specialist, ORD Center for Computational Toxicology and Exposure
- **Presenter: Grace Patlewicz**  
Chemist in the Center for Computational Toxicology and Exposure (CCTE)
- **Q&A**
- **Closing remarks: Sammy Hanf**

## Development of Chemical Categories for Per- And Polyfluoroalkyl Substances (PFAS) and The Proof-Of-Concept Approach to the Identification

Per- and Polyfluoroalkyl substances (PFAS) are a class of manufactured chemicals that are in widespread use and many present concerns for persistence, bioaccumulation, and toxicity. While a handful of PFAS have been characterized for their hazard profiles, the vast majority have not been extensively studied. In response, the EPA published the EPA National PFAS Testing Strategy in October 2021 which describes EPA's approach to developing categories of PFAS and identifying substances for further data collection efforts. In September 2024, EPA scientists published a paper that outlines the development of these PFAS categories and the proof-of-concept approach to the identification of potential candidates for tiered toxicological testing and human health assessment.



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*Webinar dates and topics are subject to change.*



## **Air, Climate, and Energy Research**

**November 19:** *Airborne Survey - Methane from U.S. Landfills*

[Registration and Additional Information Coming Soon!](#)

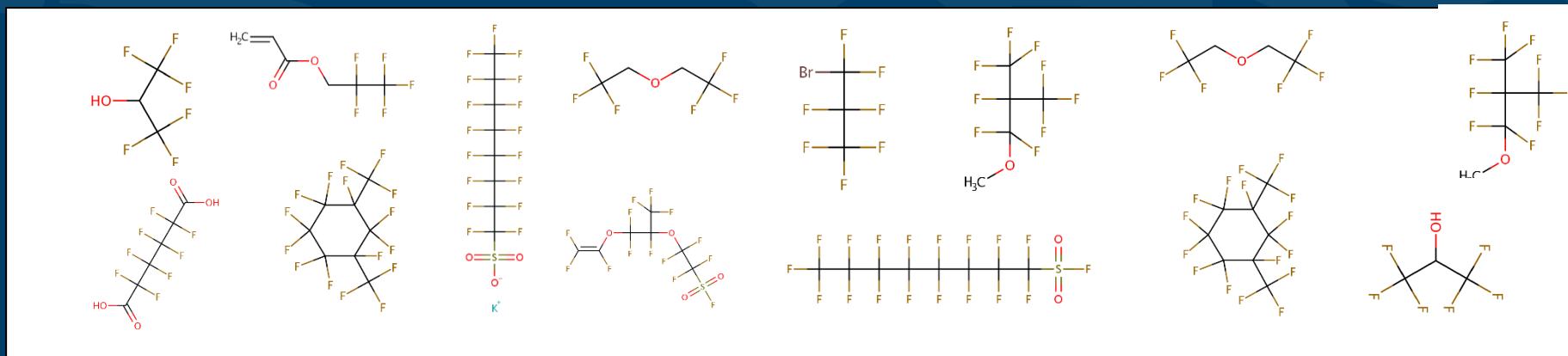


## **Computational Toxicology and Exposure Communities of Practice**

**December 12:** *Updates to the Web-based Interspecies Correlation Estimation (Web-ICE) application*

[Registration and Additional Information Coming Soon!](#)

# Towards the development of chemical categories for Per- and polyfluoroalkyl substances (PFAS)



14th November 2024

Grace Patlewicz

Center for Computational Toxicology and Exposure  
Office of Research and Development

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

# Outline

- **Part 1: Foundations**
- **Part 2: EPA National Testing Strategy for PFAS**
  - Devising a chemical categorisation approach
- **Part 3: Updates to the categorisation approach**
- **Part 4: Operationalising the categorisation approach**
- **Summary**
- **Acknowledgements**



## Part 1: Foundations

- Establish a PFAS Testing Library
- Devise a set of PFAS structural categories to help select ~150 PFAS for testing
- Prompted new research to make category profiling more objective and scalable
- *In vitro* and toxicokinetic testing initiated

# ...Curating the Chemistry...Names, Structures, and Identifiers

November 26, 2015 [Dataset](#) [Open Access](#)

## S9 | PFASTRIER | PFAS Suspect List: fluorinated substances

Trier, Xenia; Lunderberg, David

Other(s)

Schymanski, Emma

This is the collection associated with list S9 PFASTRIER on the NORMAN Suspect List Exchange.

<https://www.norman-network.com/?n=suspect-list-exchange>

S9 PFASTRIER

CSV (Mas...

XLSX (se...

CompTox

Further c...

PFAS in C...

Kindly su...

Referenc...

**OECD**  
 Organisation for Economic Co-operation and Development

ENV/JM/MONO(2018)7

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Unclassified English - Or. English

4 May 2018

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ENVIRONMENT DIRECTORATE  
 JOINT MEETING OF THE CHEMICALS COMMITTEE AND THE WORKING PARTY  
 ON CHEMICALS, PESTICIDES AND BIOTECHNOLOGY

No easy task... Try deriving the structure for this one with the "special characters"

2-Propenoic acid, 3,3,4,4,5,5,6,6,7,7,8,8,9,9,10,10,11,11,12,12,12-heneicosafuorododecyl ester, polymer with 3,3,4,4,5,5,6,6,7,7,8,8,9,9,10,10,10-heptadecafluorodecyl 2-propenoate, (2-methyl-1-oxo-2-propenyl)-(2-methyl-1-oxo-2-propenyl)oxypoly(oxy-1,2-ethanediyl), 3,3,4,4,5,5,6,6,7,7,8,8,9,9,10,10,11,11,12,12,13,13,14,14,15,15,16,16,16-nonacosafuorohexadecyl 2-propenoate, octadecyl 2-propenoate and 3,3,4,4,5,5,6,6,7,7,8,8,9,9,10,10,11,11,12,12,13,13,14,14,14-pentacosafuorotetradecyl 2-propenoate



GLOBAL DATABASE OF PER- AND  
 POLYFLUOROPHENYLENE SULFONATE (PFAS):

OECD 2007 LIST OF PER- AND  
 POLYFLUOROPHENYLENE SULFONATE (PFAS)

	Source_CASRN (incorrect or invalid)	Source_Acronym (incorrect or ambiguous)	Unique_Acronym
	914637-49-3	5:3 acid	5:3 PFOA
		NMeFOSE, MeFOSE	NMeFOSE
	749836-20-2	PFESA Byproduct 2	PFESA Byproduct 2
DTXSID10892352	Perfluoro-2-[[perfluoro-3-(perfluoroethoxy)-2-propanyl]oxy]ethanesulfonic acid	749836-20-2	Ethanesulfonic acid, 2-[1-[[di-[[2,2,2-tetrafluoroethoxy]methyl]-1,2,2,2-tetrafluoroethoxy]ethyl]-2,2,2-trifluoroethyl]perfluorooctanoate
DTXSID70892479	Perfluorodecylsulfonic acid	68259-09-6	Ammonium perfluorodecylsulfonate
DTXSID8071354	Ammonium perfluoropentanesulfonate	68259-09-6	Ammonium perfluoropentanesulfonate
DTXSID40881350	4,8-Dioxa-3H-perfluorononanoic acid	919004-14-4	2,2,3-Trifluoro-3-[[1,1,2,2,3,3-hexafluoro-3-[[2,2,3,3,3-pentafluoroethyl]oxy]propyl]oxy]perfluorobutanoic acid
DTXSID00874026	Ammonium 4,8-dioxa-3H-perfluorononanoate	919004-14-4	Ammonium 2,2,3-trifluoro-3-[[1,1,2,2,3,3-hexafluoro-3-[[2,2,3,3,3-pentafluoroethyl]oxy]propyl]oxy]perfluorobutanoate
DTXSID3037707	Potassium perfluorobutanesulfonate	29420-49-3	Potassium perfluoro-1-butanesulfonate
DTXSID5030030	Perfluorobutanesulfonic acid	375-73-5	Perfluorobutanesulfonic acid
DTXSID60873015	Perfluorobutanesulfonate	45187-15-3	Perfluorobutanesulfonate
DTXSID3040148	Perfluorodecane sulfonic acid	335-77-3	Perfluorodecane sulfonic acid
DTXSID00873014	Perfluorodecane sulfonate	126105-34-8	Perfluorodecane sulfonate
DTXSID60892443	Sodium perfluorodecane sulfonate	2806-15-7	Sodium perfluoro-1-decane sulfonate

Many Lists from EPA Regulatory Offices and Regions

# Assembled a PFAS Chemical Library for Research and Methods Development

PFAS|EPA: ToxCast Chemical Inventory

Search PFAS|EPA Chemicals

Identifier: substructure search

**List Details**

Description: Per- and Polyfluoroalkyl Substances (PFAS) included in EPA's expanded ToxCast chemical inventory and available for testing. These PFAS chemicals were successfully procured from commercial suppliers (with a small number provided by National Toxicology Program partners) and were deemed suitable for testing (i.e., solubilized in DMSO above 5mM, and not gaseous or highly reactive). All or portions of this inventory are being made available to EPA researchers and collaborators to be analyzed and tested in various high-throughput screening (HTS) and high-throughput toxicity (HTT) assays.

The [https://comtox.epa.gov/databases/chemical\\_lists/EPASAF5351](https://comtox.epa.gov/databases/chemical_lists/EPASAF5351) list is a prioritized subset of this larger chemical inventory.









The [https://comtox.epa.gov/databases/chemical\\_lists/EPASAF5350](https://comtox.epa.gov/databases/chemical_lists/EPASAF5350) list were chemicals procured, but found to be insoluble in DMSO above 5mM.

Number of Chemicals: 430

430 chemicals

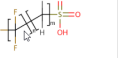
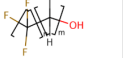
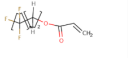
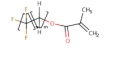
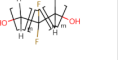
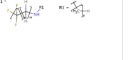
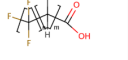
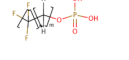
Select all Download Send to Batch Search Default 0 DTXSID CASRN TOXCAST

Hide chemicals that are: Start by Name or CASRN

 <p>2H-Perfluoro-2-propanol DTXSID: DTXSID1022134 CASRN: 302-46-1 TOXCAST: -</p>	 <p>Perfluorooctanesulfonyl fluoride DTXSID: DTXSID0527140 CASRN: 307-26-7 TOXCAST: -</p>	 <p>N-Ethyl-N-(2-hydroxyethyl)perfluorooctanamide DTXSID: DTXSID0627426 CASRN: 1691-09-7 TOXCAST: -</p>	 <p>N-Methyl-N-(2-hydroxyethyl)perfluorooctanamide DTXSID: DTXSID072831 CASRN: 2448-06-7 TOXCAST: -</p>
 <p>8:2 Fluorotelomer alcohol DTXSID: DTXSID0509904 CASRN: 678-39-7 TOXCAST: 574939</p>	 <p>Perfluorobutanesulfonic acid DTXSID: DTXSID0309300 CASRN: 375-73-5 TOXCAST: -</p>	 <p>Perfluorohexanoic acid DTXSID: DTXSID0311860 CASRN: 335-76-2 TOXCAST: 143703</p>	 <p>Perfluorooctanoic acid DTXSID: DTXSID0311862 CASRN: 307-24-4 TOXCAST: 18688</p>

- Attempted to procure ~3,000 based on chemical diversity, Agency priorities, and other considerations

- Obtained 480 total unique chemicals
  - 430/480 soluble in DMSO (90%)
  - 54/75 soluble in water (72%) (incl. only 3 DMSO insolubles)

 <p>Fluorotelomer (linear) sulfonic acids DTXSID: DTXSID05092558 CASRN: NOCAS_892558 TOXCAST: -</p>	 <p>Fluorotelomer (linear) alcohols DTXSID: DTXSID10893581 CASRN: NOCAS_893581 TOXCAST: -</p>	 <p>Fluorotelomer (linear) N:2 acrylates DTXSID: DTXSID0993582 CASRN: NOCAS_893582 TOXCAST: -</p>	 <p>Fluorotelomer (linear) N:2 methacrylates DTXSID: DTXSID09893583 CASRN: NOCAS_893583 TOXCAST: -</p>
 <p>Fluorotelomer symmetric diols DTXSID: DTXSID09893584 CASRN: NOCAS_893584 TOXCAST: -</p>	 <p>Fluorotelomer (linear) amines (secondary) DTXSID: DTXSID09893585 CASRN: NOCAS_893585 TOXCAST: -</p>	 <p>Fluorotelomer (linear) carboxylic acids DTXSID: DTXSID10893586 CASRN: NOCAS_893586 TOXCAST: -</p>	 <p>Fluorotelomer (linear) phosphate esters DTXSID: DTXSID09893588 CASRN: NOCAS_893588 TOXCAST: -</p>

- A number of issues encountered with sample stability and volatility

# Selecting a Subset of PFAS for Tiered Toxicity and Toxicokinetic Testing



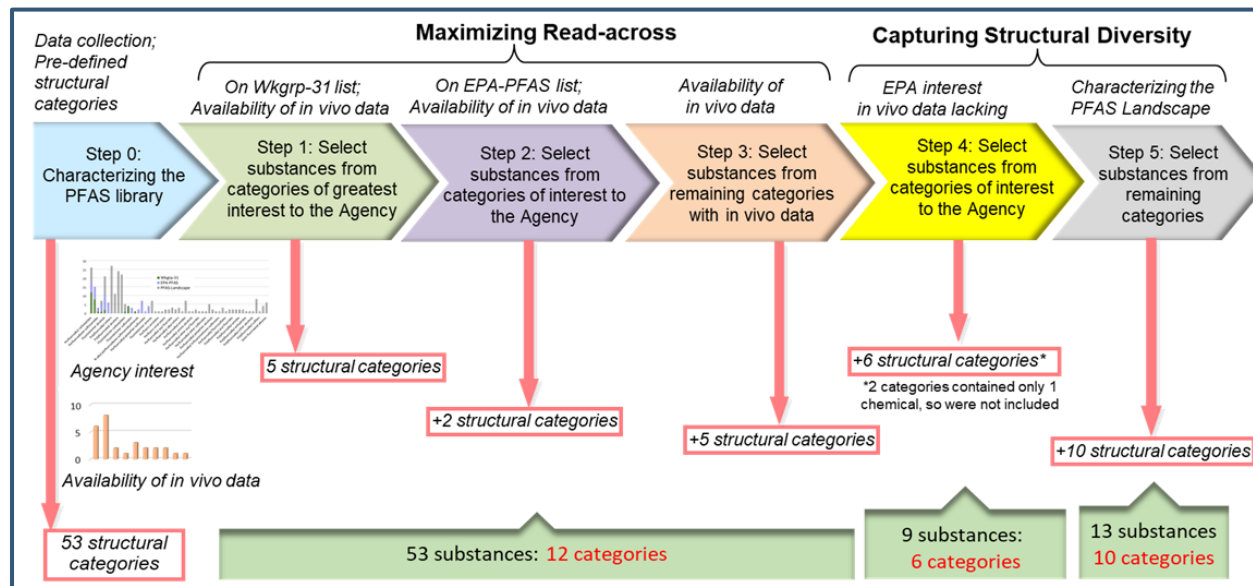
Towards reproducible structure-based chemical categories for PFAS to inform and evaluate toxicity and toxicokinetic testing

Grace Patlewicz, Ann M. Richard, Antony J. Williams, Richard S. Judson, Russell S. Thomas

## Goals:

- Generate data to support development and refinement of categories and read-across evaluation
- Incorporate substances of interest to Agency
- Characterise mechanistic and toxicokinetic properties of the broader PFAS landscape

- Selected 150 PFAS in two phases representing 83 different structural categories
- These structural categories evolved over time..
  - Initially we used Buck et al terminology, CCTE Markush, OECD categories





# In Vitro Toxicity and Toxicokinetic Testing

Toxicological Response	Assay	Assay Endpoints	Purpose
Hepatotoxicity	2D HepaRG assay	Cell death and transcriptomics	Measure cell death and changes in important biological pathways
Developmental Toxicity	Zebrafish embryo assay	Fertilisation, lethality, and structural defects	Assess potential teratogenicity
Immunotoxicity	Bioseek Diversity Plus	Protein biomarkers across multiple primary cell types	Measure potential disease and immune responses
Mitochondrial Toxicity	Mitochondrial membrane potential (HepaRG)	Mitochondrial membrane potential	Measure mitochondrial health and function
Developmental Neurotoxicity	Microelectrode array assay (rat primary neurons)	Neuronal electrical activity	Impacts on neuron function
Endocrine Disruption	ACEA real-time cell proliferation assay (T47D)	Cell proliferation	Measure ER activity
General Toxicity	Attagene cis- and trans-Factorial assay (HepG2)	Nuclear receptor and transcription factor activation	Activation of key receptors and transcription factors involved in hepatotoxicity
	High-throughput transcriptomic assay (multiple cell types)	Cellular mRNA	Measures changes in important biological pathways
	High-throughput phenotypic profiling (multiple cell types)	Nuclear, endoplasmic reticulum, nucleoli, golgi, plasma membrane, cytoskeleton, and mitochondria morphology	Changes in cellular organelles and general morphology

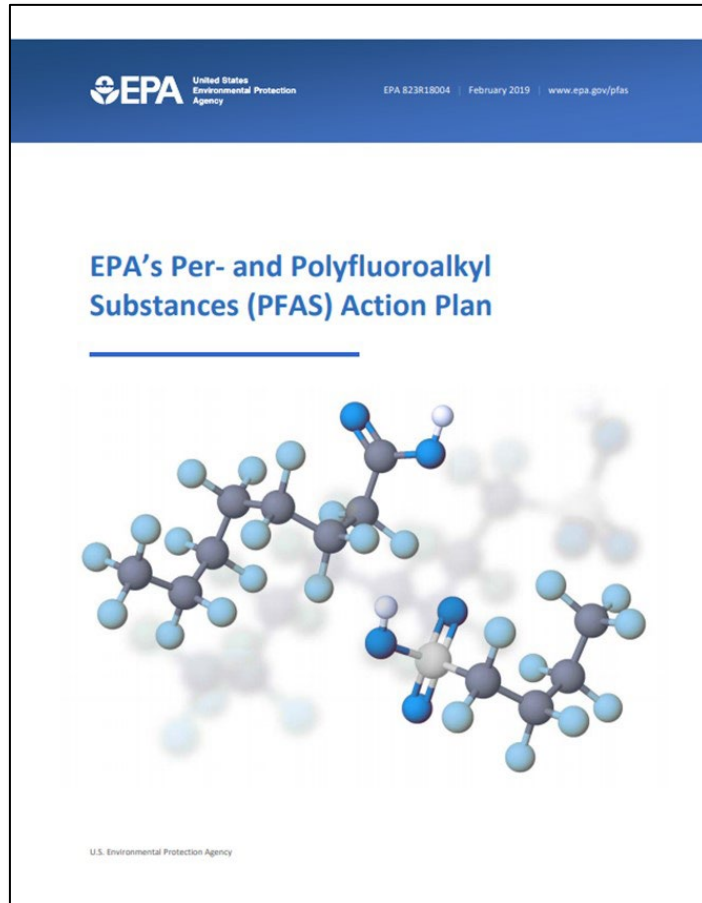
Toxicokinetic Parameter	Assay	Assay Endpoints	Purpose
*Intrinsic hepatic clearance	Hepatocyte stability assay (primary human hepatocytes)	Time course metabolism of parent chemical	Measure metabolic breakdown by the liver
Plasma protein binding	Ultracentrifugation assay	Fraction of chemical not bound to plasma protein	Measure amount of free chemical in the blood

\*Assays being performed by NTP and EPA

# *In Vitro* Toxicity and Toxicokinetic Testing

- **Aimed to inform**
  - **Chemical Category and Read-across approaches**
  - **Bioactive Dose Level (BDL) Approach (*in vitro* to *in vivo* extrapolation to define administered dose equivalent (ADE) values)**
- **Initially use structural categories to evaluate the degree of concordance in NAM results (per technology) within categories and across categories\***

# Using New Approach Methods (NAMs) to Help Fill Information Gaps



**Research Area 1:** What are the human health and ecological effects of exposure to PFAS?

- **Using computational toxicology approaches to fill in gaps.** For the many PFAS for which published peer-reviewed data are not currently available, the EPA plans to use new approaches such as high throughput and computational approaches to explore different chemical categories of PFAS, to inform hazard effects characterization, and to promote prioritization of chemicals for further testing. These data will be useful for filling gaps in understanding the toxicity of those PFAS with little to no available data. *In the near term*, the EPA intends to complete assays for a representative set of 150 PFAS chemicals, load the data into the [CompTox Chemicals Dashboard](#) for access, and provide peer-reviewed guidance for stakeholders on the use and application of the information. *In the long term*, the EPA will continue research on methods for using these data to support risk assessments using New Approach Methods (NAMs) such as read-across and transcriptomics, and to make inferences about the toxicity of PFAS mixtures which commonly occur in real world exposures. The EPA plans to collaborate with NIEHS and universities to lead the science in this area and work with universities, industry, and other government agencies to develop the technology and chemical standards needed to conduct this research.

# Characterising PFAS into categories

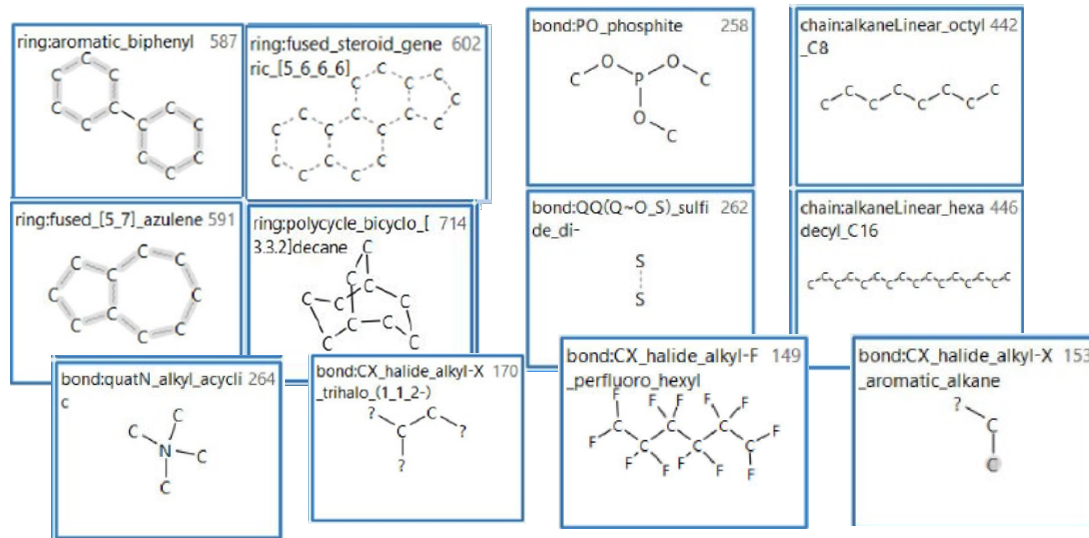
- Structural categories were assigned by visual inspection and whilst nominally consistent since only one individual was making the assignments, the approach was prone to error and not easily reproducible.
- The assignments provided by OECD were similar in their genesis - they were manually assigned by the same person.
- Indeed, authors of many of the published literature studies on PFAS have often end up deriving bespoke naming conventions for categories which has led to “the generation of a lot of parallel nomenclature that differs, creating unintended barriers to effective communication among scientists”
- There was an urgent need existed to develop a reproducible & objective means of developing structure-based categories



United States  
Environmental Protection  
Agency

# PFAS Structure-based Categorisation: ToxPrints

- Publicly available tools exist to generate & download ToxPrints e.g. ChemoTyper, CompTox Chemicals Dashboard
- Provides excellent coverage of PFAS chemical space
- Nested, hierarchical nature lends itself to creating flexible categories tailored to problem at hand, i.e., "fit for purpose"
- Can augment with computed structure properties (s.a., MW, size, etc.)
- Intuitive, easy to work with



## ToxPrints:

- ✓ 729 chemical features
- ✓ Chemically interpretable
- ✓ Coverage of diverse chemistry
- ✓ Includes scaffolds, functional groups, chains, rings, bonding patterns, atom-types

→ Clear, reproducible means for defining regions of local chemistry, i.e. categories!!

- Reconcile the different structural categories schemes initially used - by creating a harmonised set of structure-based categories
- Category assignments should be computationally generated from structure only → reproducible, transferable, standardised, extendable
- Permits nested & overlapping categories such that categories can be tailored to different datasets and decision contexts
- ToxPrints were used to develop 34 structural categories (TxP Cats) which covered >90% of the different PFAS testing inventories...
- But their ability to capture the diversity of much larger inventories (~1000s of PFAS) was a shortcoming which prompted further research to develop PFAS ToxPrints (Richard et al., 2023)

**Side note - These TxPs have since been implemented in the CIM and for a limited set of PFAS in GenRA Version 3.3**

Chemical Research in Toxicology > Vol 36/Issue 3 > Article

Open Access

ARTICLE | March 2, 2023

### A New CSRML Structure-Based Fingerprint Method for Profiling and Categorizing Per- and Polyfluoroalkyl Substances (PFAS)

Ann M. Richard\*, Ryan Lougee, Matthew Adams, Hannah Hidle, Chihae Yang, James Rathman, Tomasz Magdziarz, Bruno Bienfait, Antony J. Williams, and Grace Patlewicz

 Open PDF

 Supporting Information (1)

     
Cite Share Jump to Expand



## Part 1: Foundations

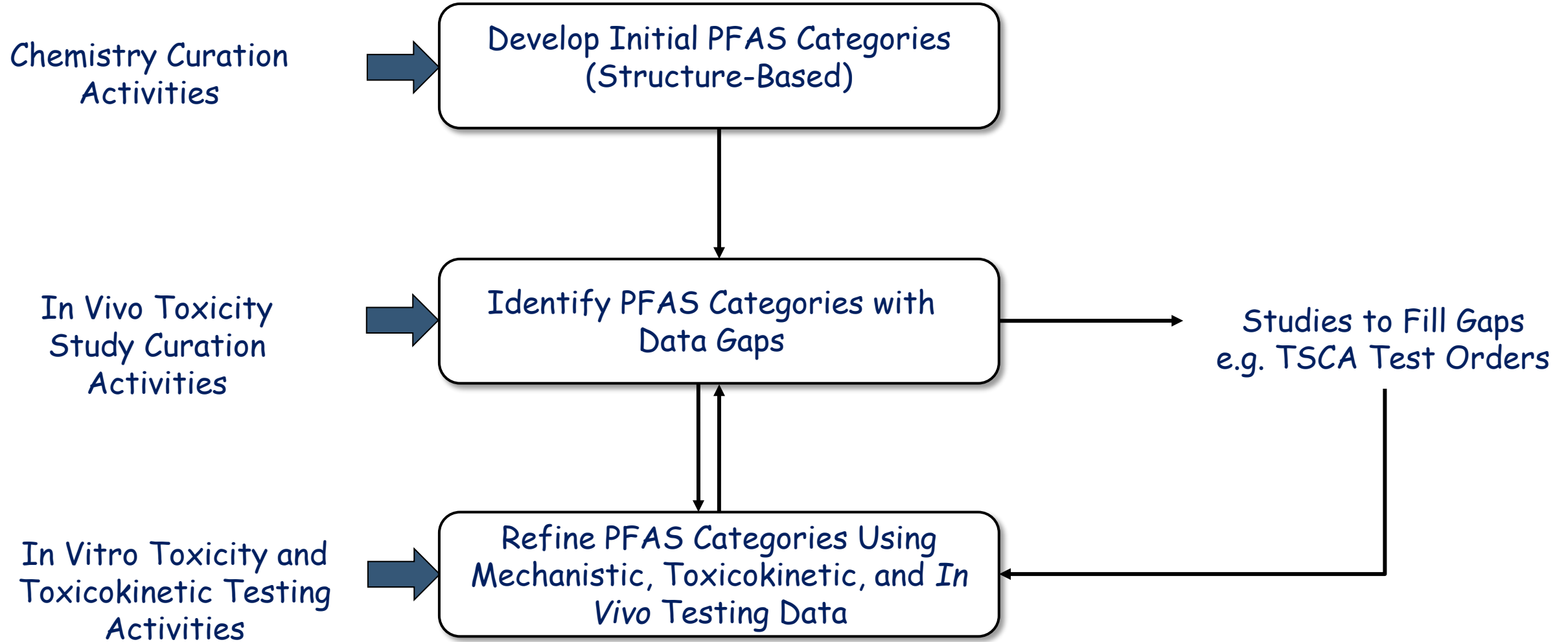
- Established a PFAS Testing Library
- Devised a set of PFAS structural categories to help select ~150 PFAS for testing
- New research lead to the development of ToxPrint PFAS categories and custom PFAS fingerprints to facilitate more efficient category profiling
- *In vitro* testing and toxicokinetic data generated for ~150 PFAS

## Part 2: EPA's National Testing Strategy (NTS) for PFAS

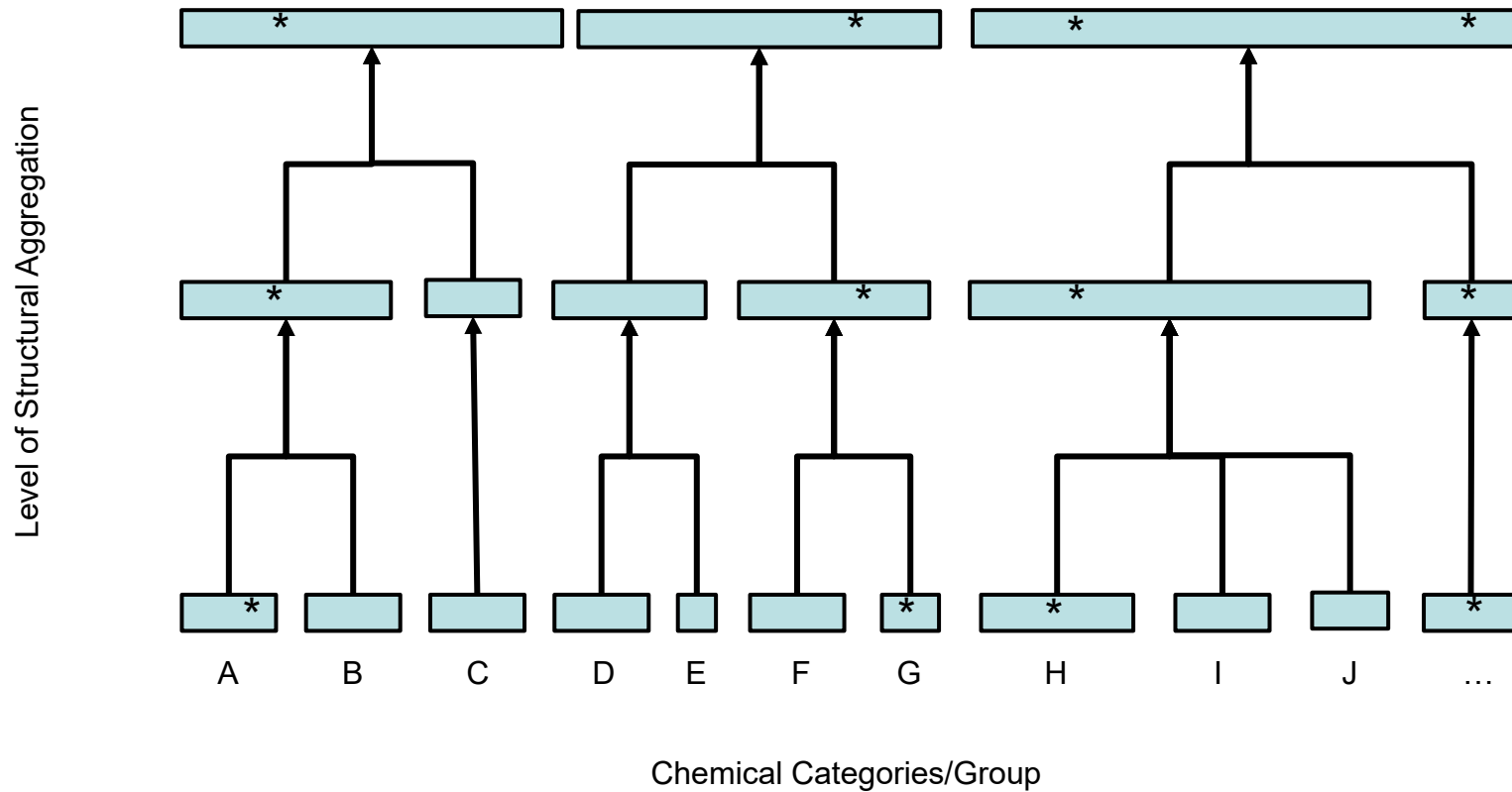
- The EPA needs to evaluate a large number of PFAS for potential human and ecological effects.
- Most PFAS have limited or no toxicity data.
- There was emerging consensus on the need to use category/grouping-based approaches to evaluate PFAS for a range of decision contexts.
- In a category/grouping approach, one or more data rich analogues is used to read-across toxicity values for the remaining data poor substances within the group.
- Historically, for human health assessment within EPA, PFAS analogues and/or groups had been based on a combination of chain-length and functional groups.



# Developing and Refining PFAS Categories



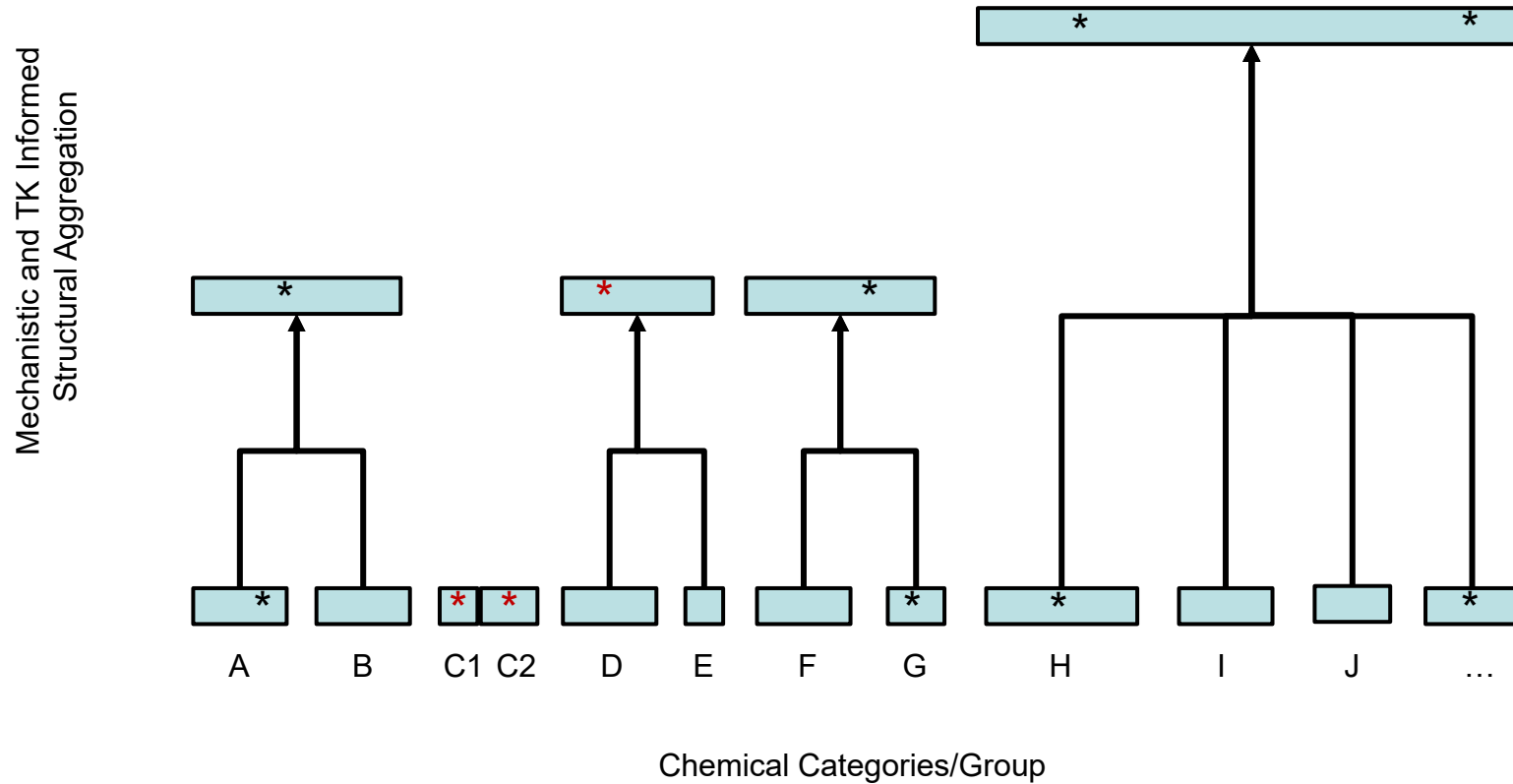
# Hierarchical approach to PFAS structural categories



Followed a goldilocks principle

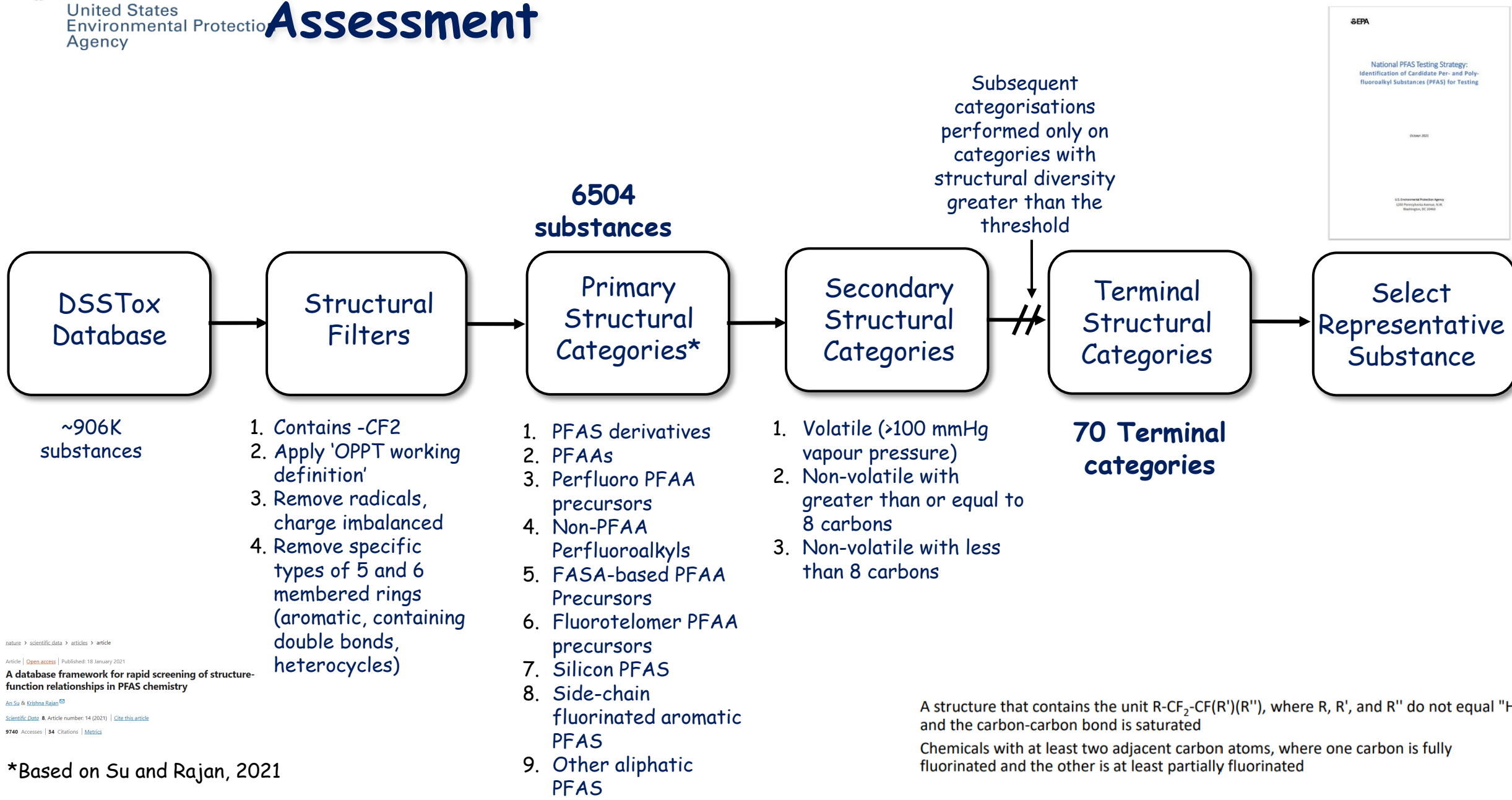
\* Available source *in vivo* tox study

# PFAS Category Aggregation that incorporates Structural, Mechanistic and Toxicokinetic Data



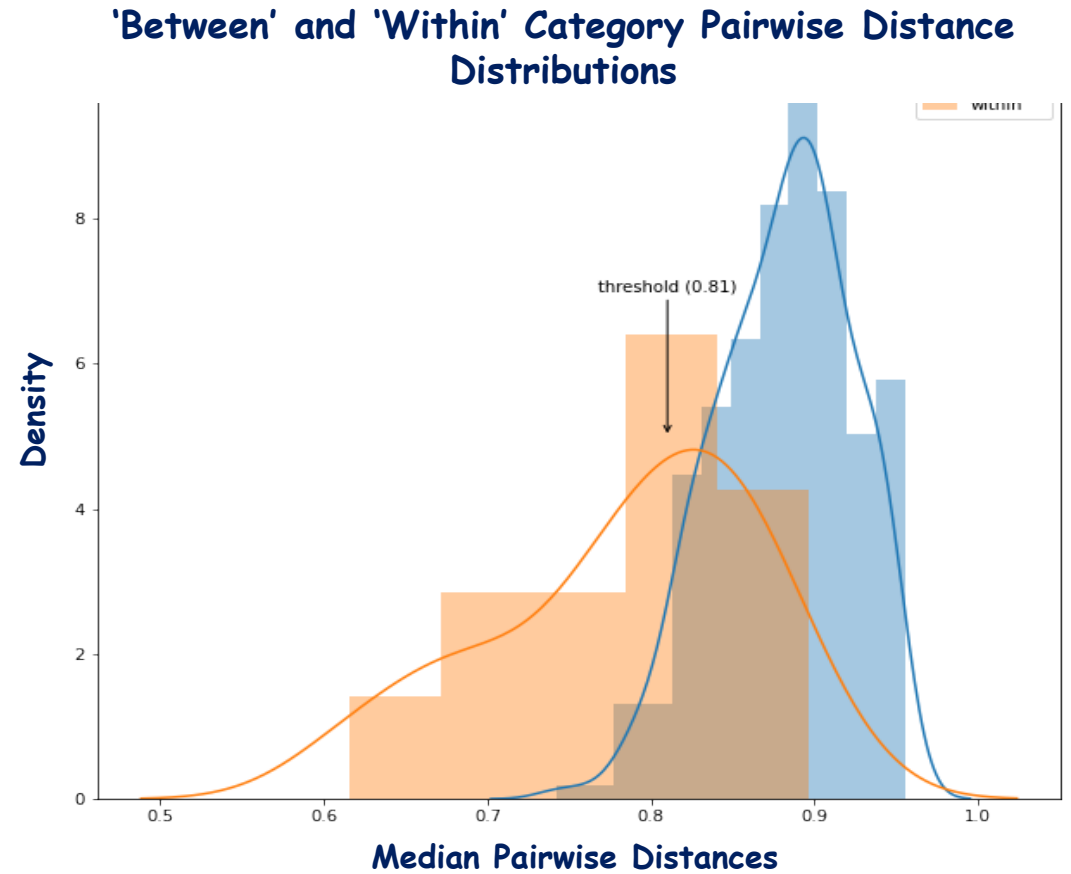
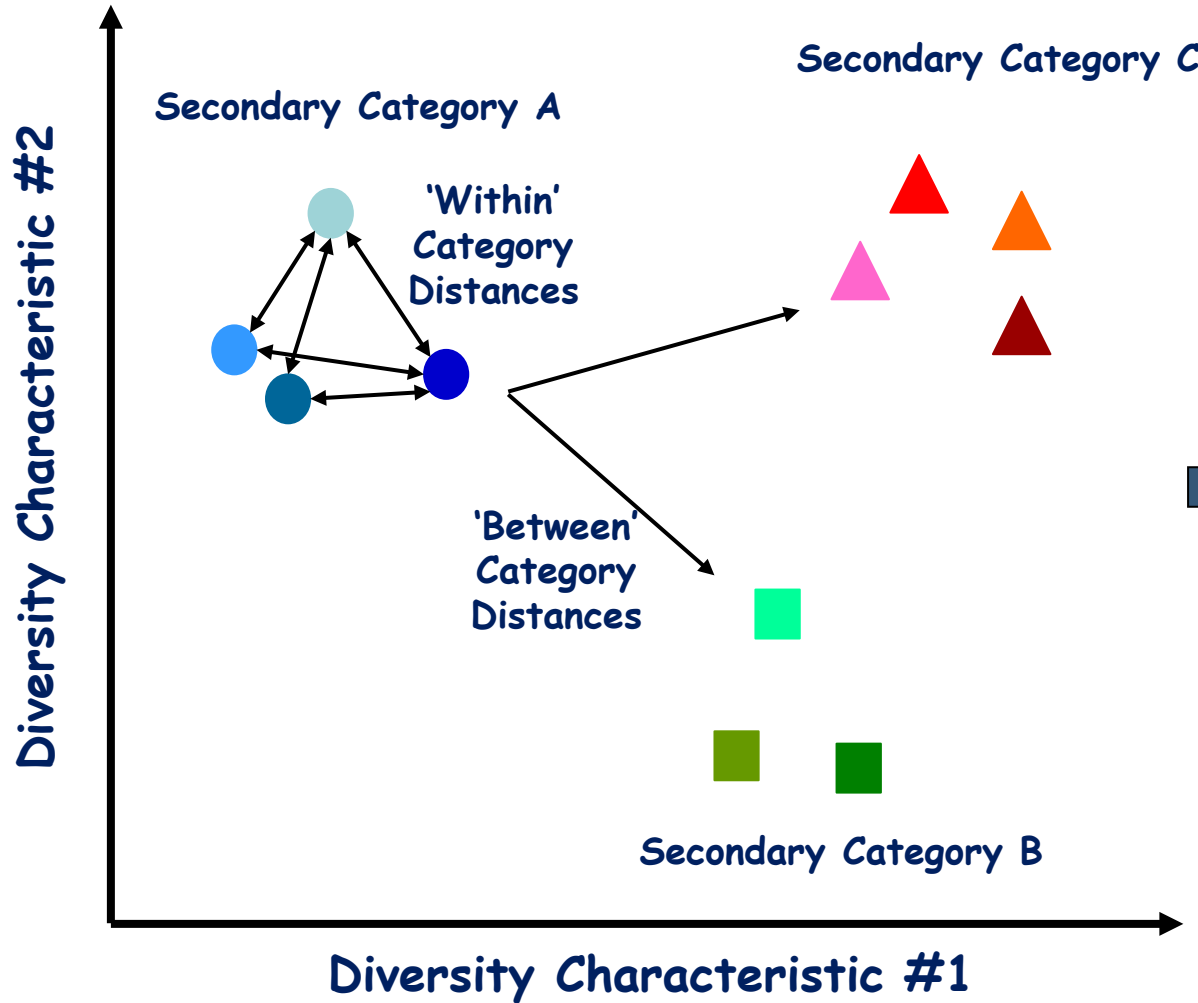
\* Needed *in vivo* tox study   
 \* Available source *in vivo* tox study

# Initial PFAS Structural Categories for Hazard Assessment



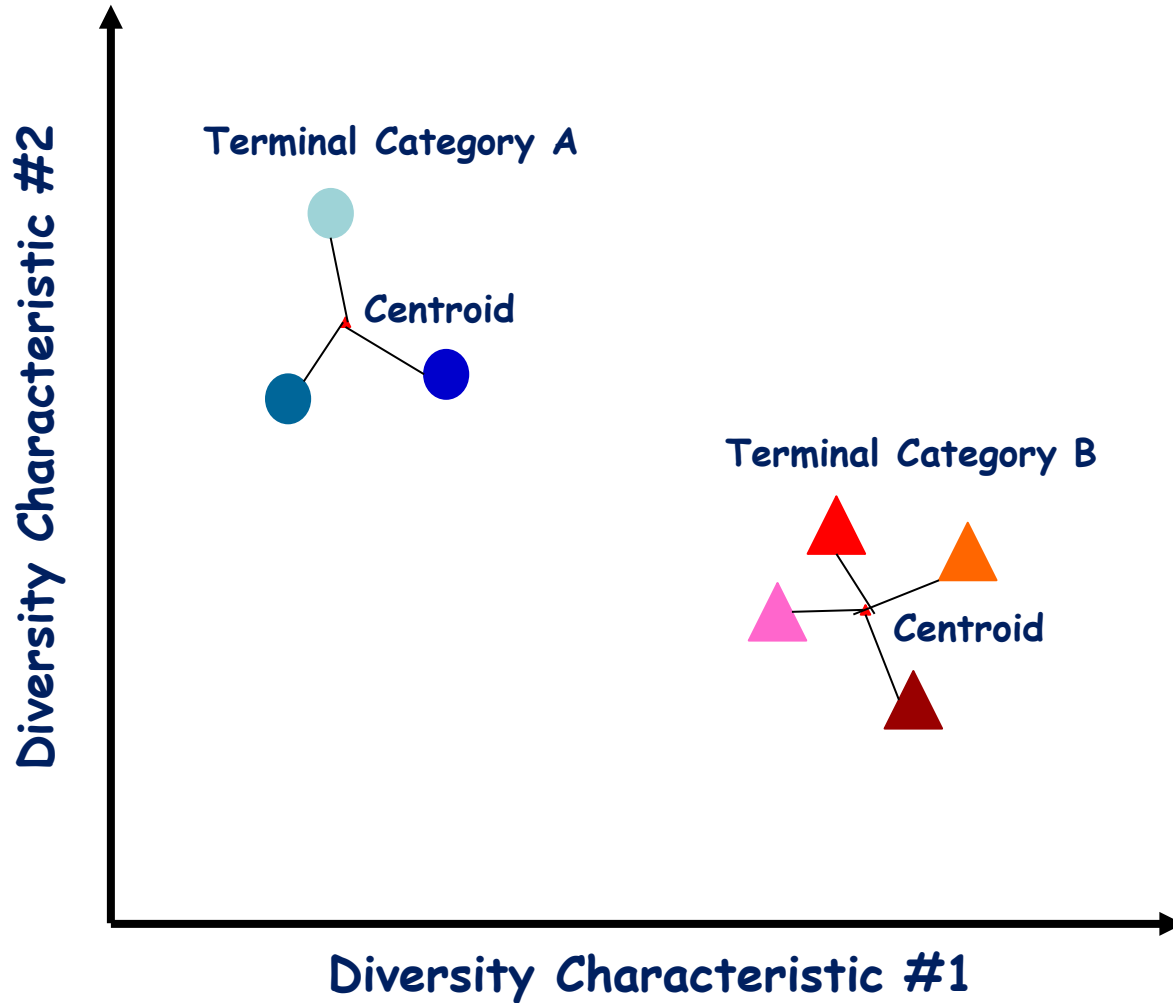
\*Based on Su and Rajan, 2021

# Structural Diversity 'Within' and 'Between' Secondary Categories Used to Set Diversity Threshold



Substances characterised by Morgan chemical fingerprints - Jaccard Pairwise distance

# 'Centroids' Calculated for Each Terminal Category to Help Select 'Most Representative' PFAS for Testing



Minimum pairwise distance in distance matrix used to identify the 'centroid'.

'Centroids' served as the most representative substance for the structural category

## Part 3: Refinements

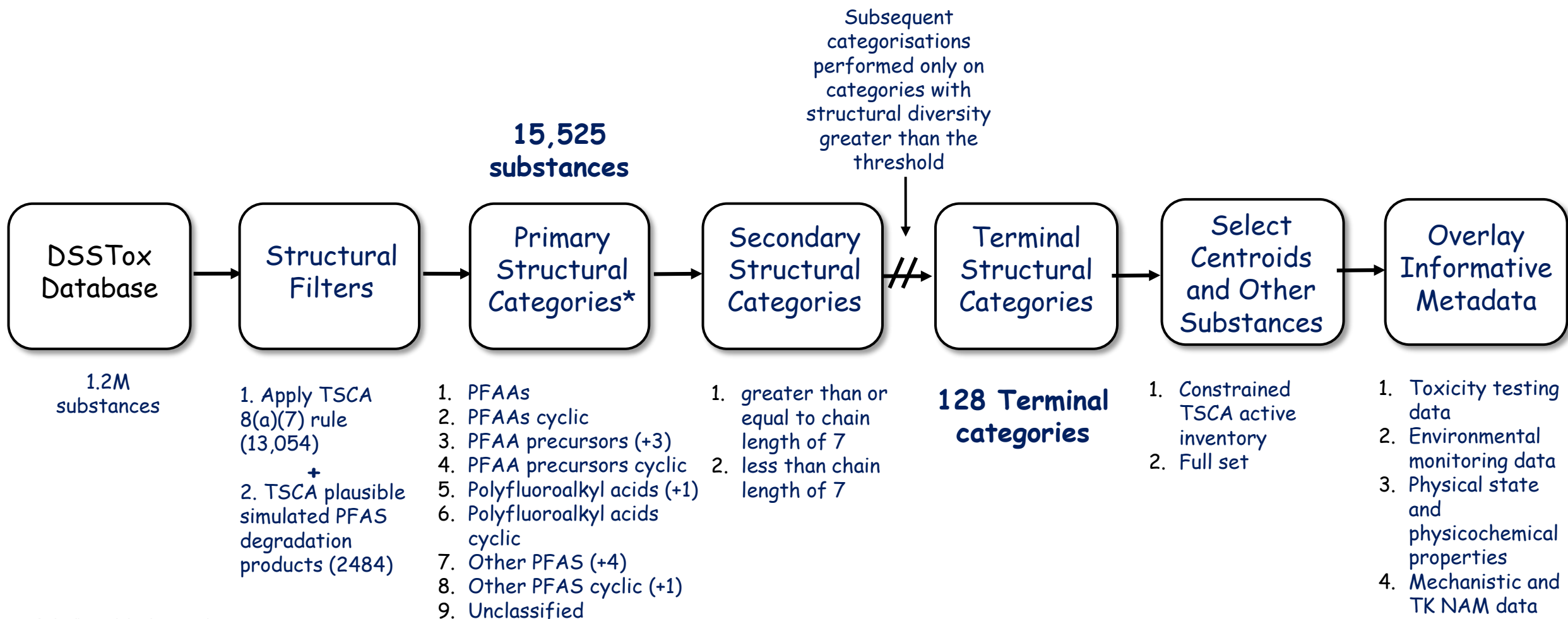
- Universe defined by the TSCA 8(a)(7) rule + plausible degradation products for those PFAS on the TSCA inventory (degradates met the same rule and were simulated using the Catalogic expert system by LMC)
- Updated primary categories based on revised OECD Category scheme as published by Su et al (2023) (replaces the Su and Rajan (2021) scheme)
- Changed secondary category criteria to a fully-fluorinated, consecutive chain length threshold of 7
  - Chain length threshold selected based on upper end as described in the EPA 2009 action plan
  - Replaced carbon number as a criteria
- Removed volatility (using 100 mm Hg threshold) as a criteria of secondary categorisation
- Consideration of physical state and physicochemical properties which could potentially inform toxicity testing, presence in environmental media, and exposure pathways

## Cont..

- Included possibility to select more than 1 “representative” substance from a given terminal category based on maximal structural diversity (also called Max/Min). Important since some categories were particularly large and/or certain categories could be prioritised higher than others.
- Enabled selection of representative substances from both the full set of substances in a terminal category and the subset on the TSCA inventory
- Added qualitative flags for environmental monitoring/exposure, toxicokinetics, and mechanistic data (NAMs)
- Use human relevant benchmark dose based on Aurisiano et al (2023) approach in lieu of NOAELs/LOAELs for evaluating *in vivo* toxicity variability across categories
- Operationalise PFAS terminal categories into a predictive model to enable profiling of new PFAS



# Updated PFAS Structural Categorisation Workflow



An Artificial Intelligence Platform for Automated PFAS Subgroup Classification: A Discovery Tool for PFAS Screening

16 August 2023, Version 1

Working Paper

An Su ©, Yinying Chen, Chengwei Zhang, Yun-Fang Yang, Yuan-Bin She, Krishna Rajan

Show author details

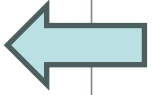
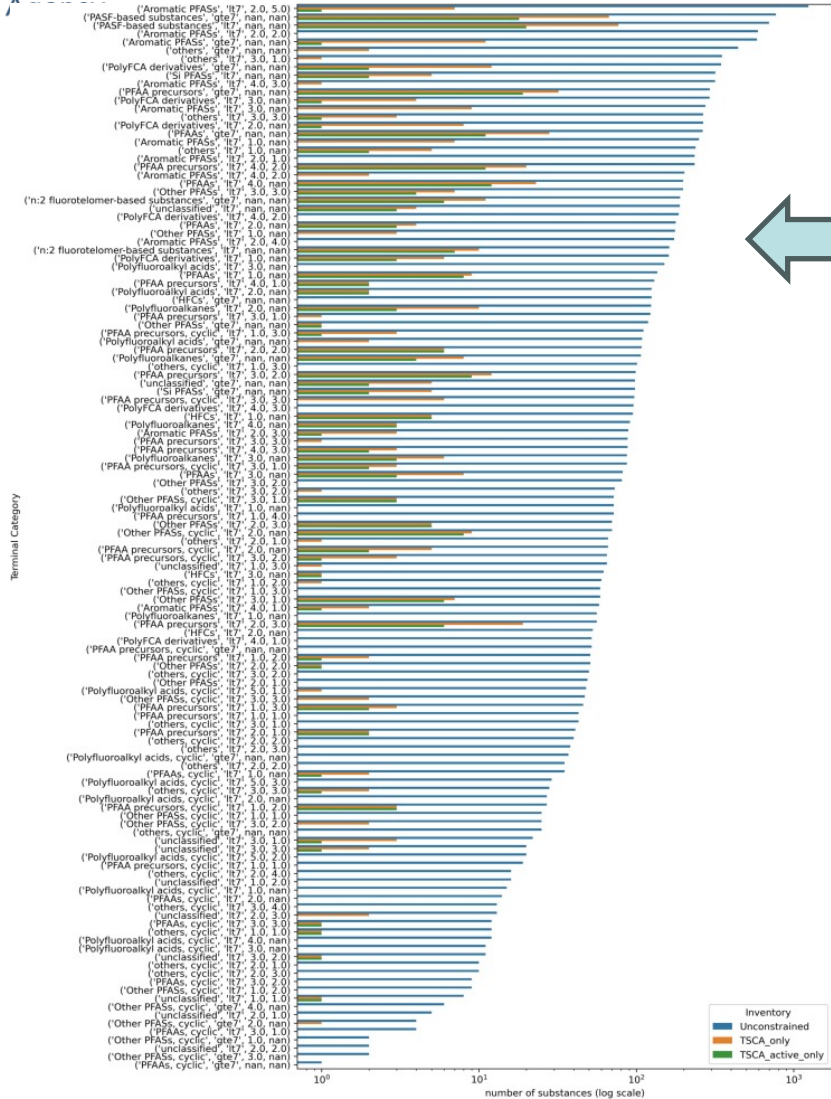
Substances that meet any of the following criteria:

- (i)  $R-(CF_2)_n-CF(R')R''$ , where both the  $CF_2$  and  $CF$  moieties are saturated carbons
- (ii)  $R-CF_2OCF_2-R'$ , where  $R$  and  $R'$  can either be  $F$ ,  $O$ , or saturated carbons
- (iii)  $CF_3C(CF_3)R'R''$ , where  $R'$  and  $R''$  can either be  $F$  or saturated carbons

# Incorporating TSCA Status, Toxicity Testing Data, and Environmental Monitoring Data

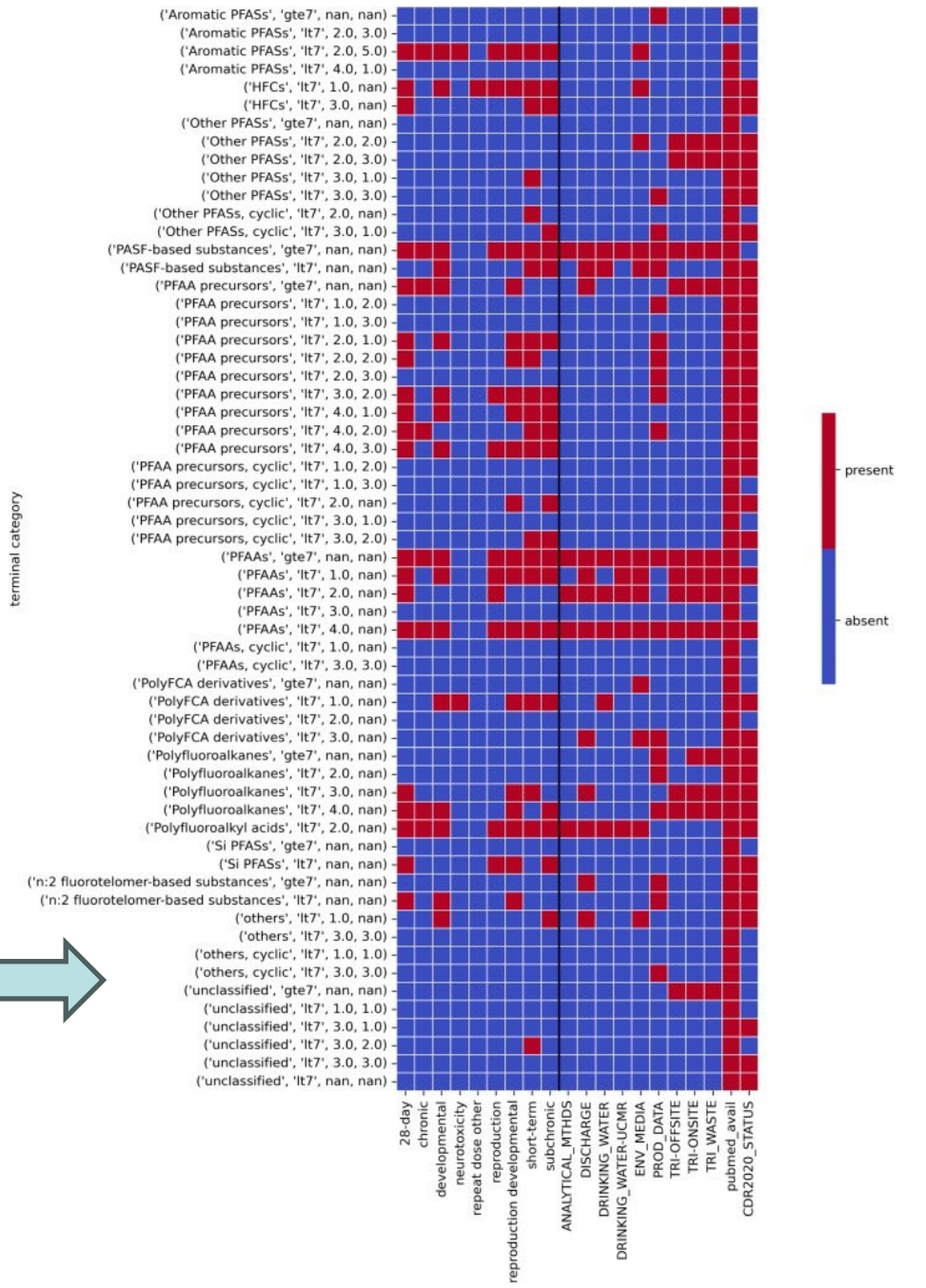
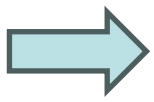
- Presence on the TSCA inventory as surrogate for the ability to identify a manufacturer
  - 80 terminal categories with  $\geq 1$  substance on TSCA inventory
  - 60 terminal categories with  $\geq 1$  substance on TSCA active inventory
- Availability of repeated dose toxicity data (ToxValDB)
  - 94 data poor terminal categories (no repeated dose toxicity data by the oral route)
  - 48 data poor terminal categories with  $\geq 1$  substance on TSCA inventory
  - 31 data poor terminal categories with  $\geq 1$  substance on TSCA active inventory
- Environmental monitoring (EM) lists - regions and states have undertaken environmental monitoring studies for selected PFAS and/or have identified PFAS of interest based on validated analytical methods
  - 21 terminal categories were data poor, had at least 1 substance on the TSCA inventory, and at least 1 substance on EM list.
  - 18 terminal categories were data poor, had at least 1 substance on the TSCA active inventory, and at least 1 substance on EM list.

# Landscape profile

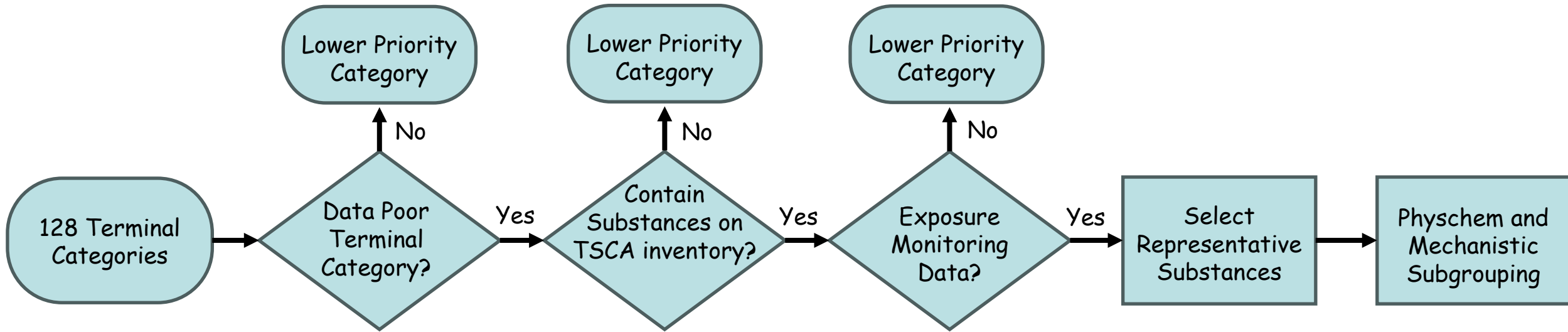


Comparison of categories across unconstrained and constrained landscapes

Data availability across TSCA active landscape to prioritise potential terminal categories

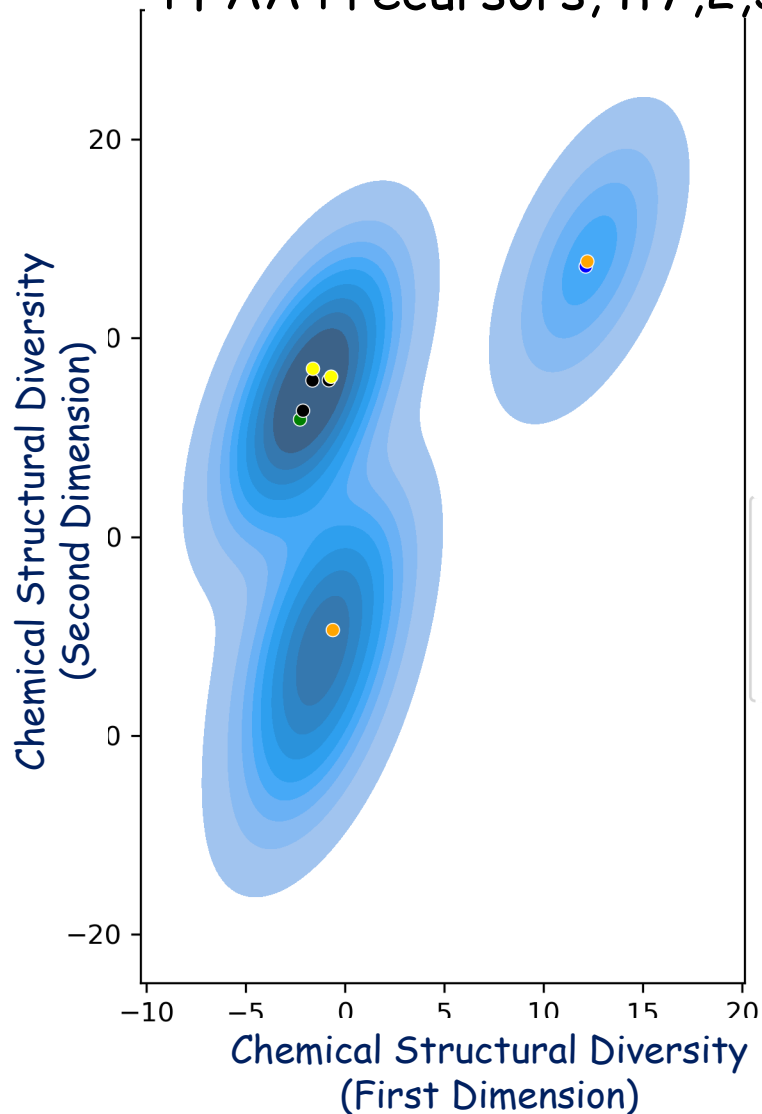


# Integrate Information in Tiered Prioritisation Workflow for Candidate Identification

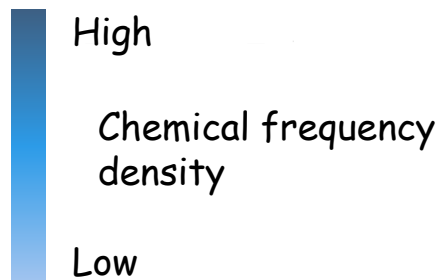


# Selecting Representative Substances in an Illustrative Terminal Category

PFAA Precursors, It7,2,3



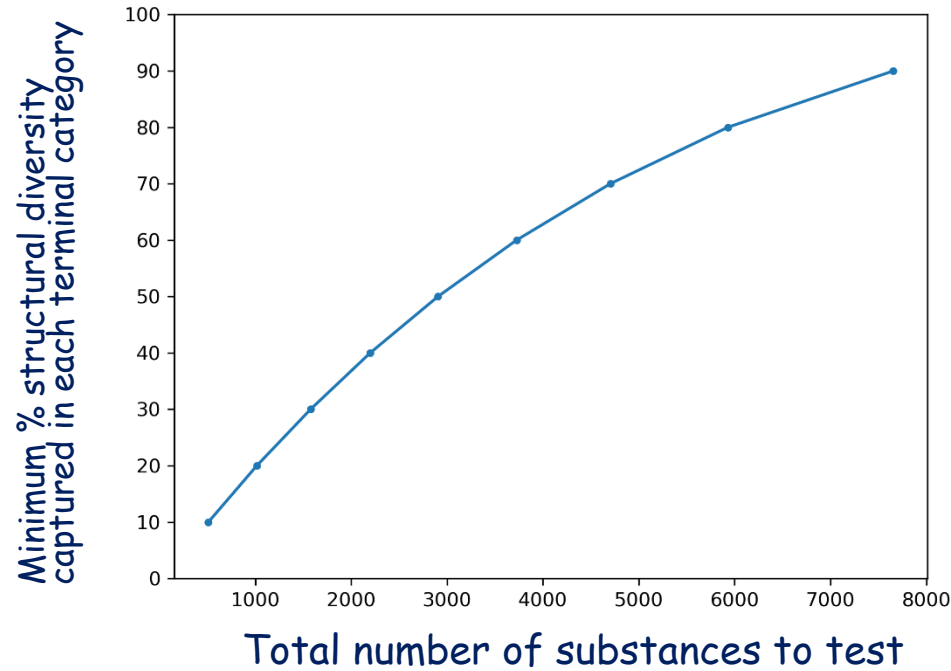
- Centroid (all substances)
- Centroid (TSCA active only)
- Other structurally diverse substances (TSCA active only)
- Other structurally diverse substances (TSCA only)
- Other structurally diverse substances (all substances)



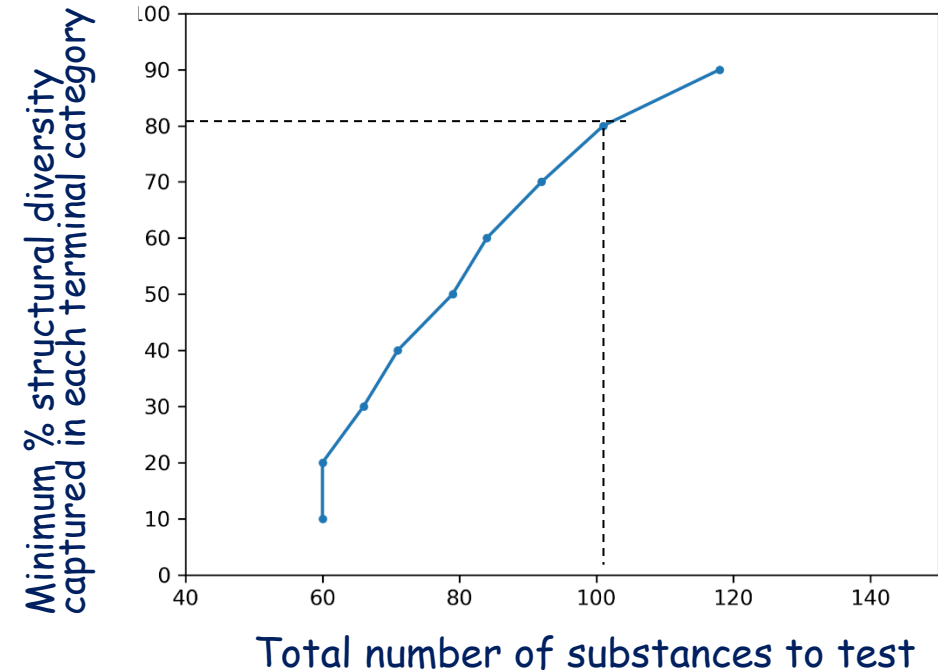
**Illustrative terminal category that is data poor, has at least 1 substance on the TSCA active inventory, and at least 1 substance on the Environmental Monitoring list**

# How many representative substances are really needed?

## Full landscape



## TSCA constrained landscape



Depends on what proportion of structural diversity is desired to be captured and for which Landscape - the full landscape of ~15K substances or one constrained by the TSCA active inventory  
101 substances would be needed to capture 80% of structural diversity in the TSCA constrained inventory\*

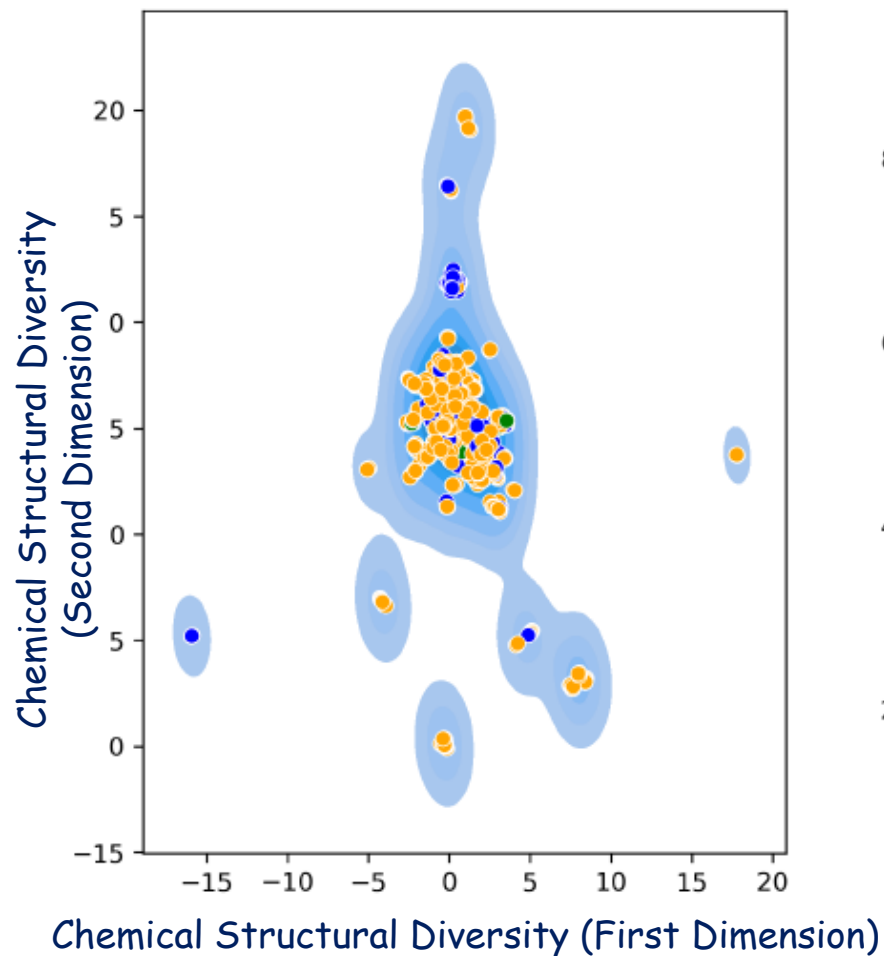
\*25 of the 101 are associated with public toxicity data from EPA's ToxValDB

# Physical state and physicochemical designations (PSPD)

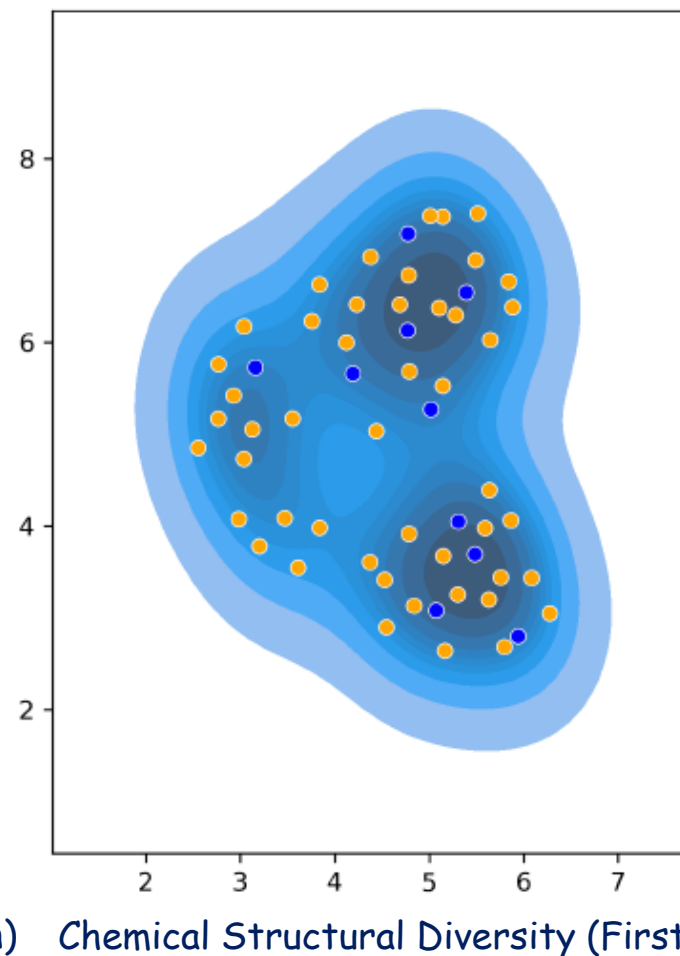
Physical state and physicochemical designations	Full Landscape	TSCA active constrained Landscape
<b>A</b> (insoluble solids)	2060 (13%)	25 (12.6%)
<b>B</b> (soluble solids and soluble non-volatile liquids)	9824 (63%)	71 (35.7%)
<b>C</b> (soluble volatile liquids/insoluble liquids and soluble gases)	3115 (20%)	85 (42.7%)
<b>D</b> (insoluble gases or highly volatile gases)	95 (0.6%)	10 (5%)
No designation	431 (2.8%)	8 (4%)

# Distribution of PSPD Within Illustrative Terminal Categories

Aromatic PFAS, It7, 2,5



Aromatic PFAS, It7, 4,1



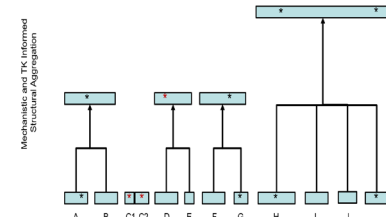
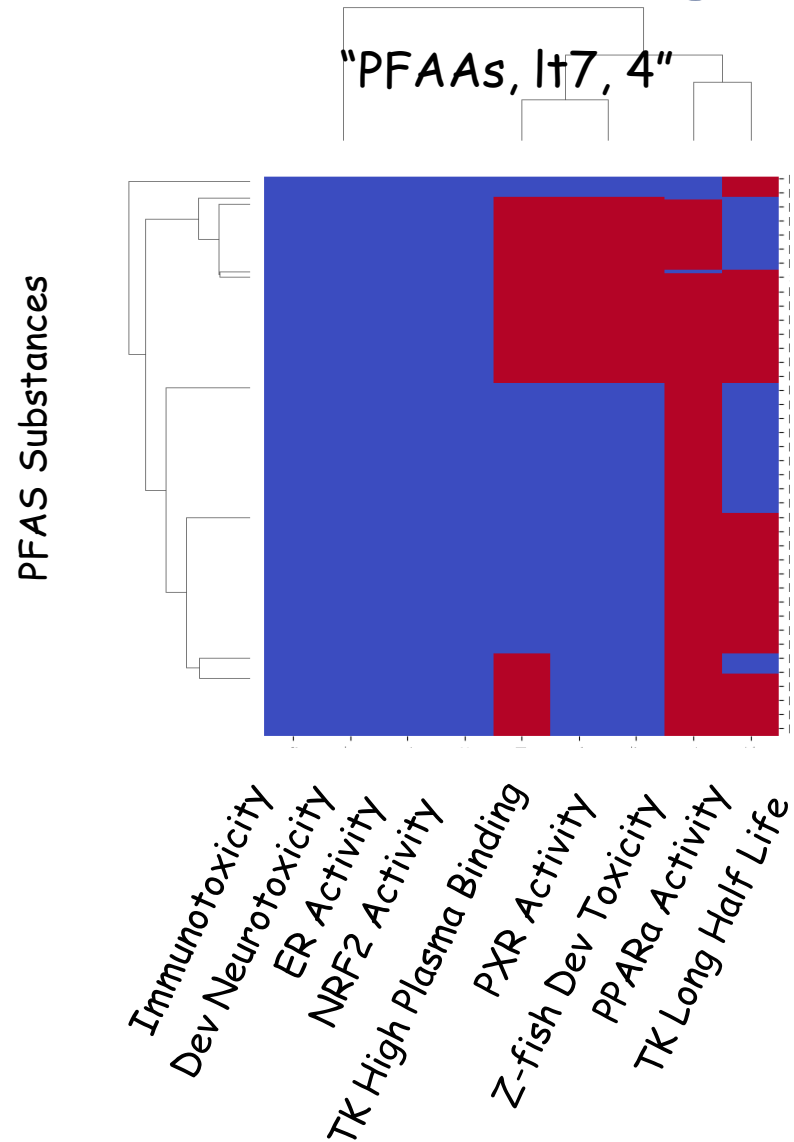
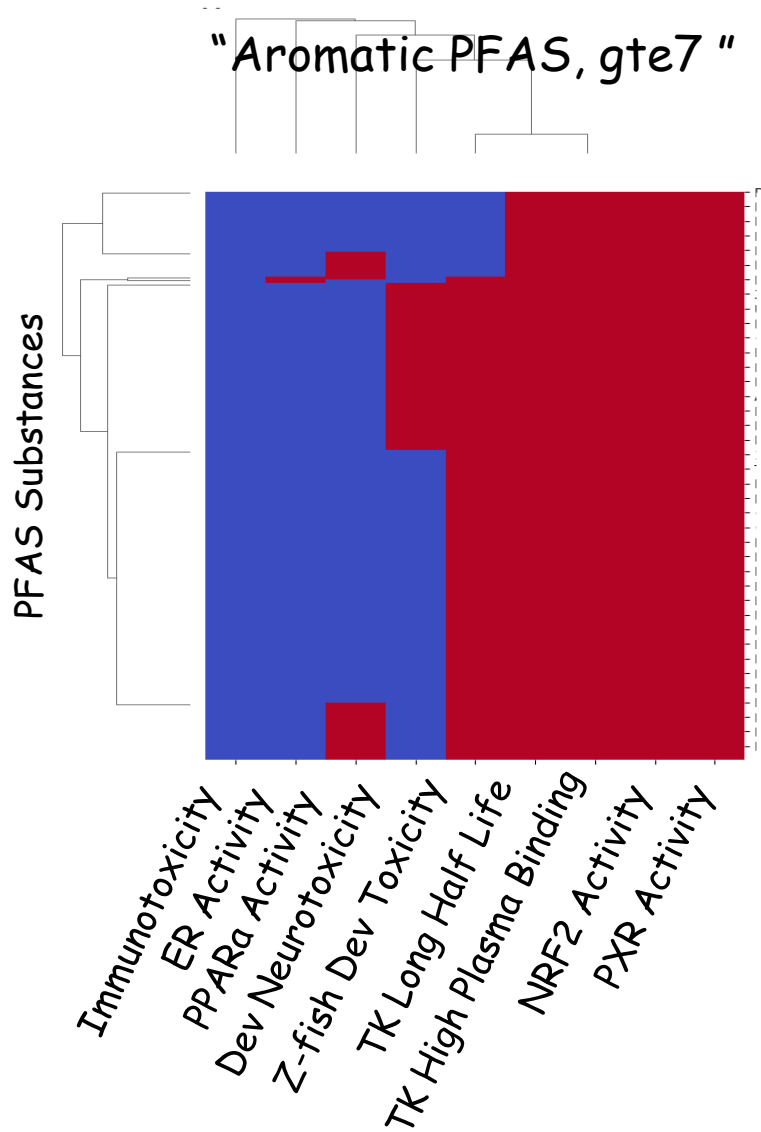
- Soluble volatile liquids/insoluble liquids and soluble gases
  - Insoluble solids
  - Soluble solids and soluble non-volatile liquids
  - Insoluble gases or highly volatile gases
- High  
Chemical frequency density  
Low



# Incorporating Mechanistic and TK NAM Data

- NAM data has only been generated for only ~1% of the PFAS landscape which posed challenges in extrapolating to the larger PFAS landscape in a quantitative manner.
- Qualitative flags for each of the NAM data streams were created from which preliminary structural based alerts were derived as a means of providing indicators of potential mechanistic, toxicological and TK related concerns.
- TK half-life predictions were generated using the QSAR-based model developed by Dawson et al. (2023)
- Collectively these qualitative flags were used to facilitate evaluation of the mechanistic and TK consistency within a terminal category and informing what tests may be needed.

# Illustrative Terminal Categories with Qualitative Mechanistic and TK Flags



# Chapter 4: Operationalising Terminal Categories for Re-Use

- PFAS Landscape continually evolving as new PFAS are being identified
- Needed an efficient means of profiling new PFAS and assigning them into one of the 128 Terminal categories developed
- Built a random forest model that uses chemical structural features + primary category labels + chain length to predict most likely terminal category label
- Overall balanced accuracy\* was 86% but this varied across terminal categories.

\*Balanced accuracy is the arithmetic mean of sensitivity and specificity, i.e. the mean of how good you are at picking up the positives as a percentage of all positives and how good you are at picking up the negatives as a percentage of all negatives

# Summary

- The PFAS Landscape was updated using the TSCA 8(a)(7) definition for a PFAS and incorporating plausible degradation products originating from PFAS on the TSCA inventory
- The updated PFAS Landscape was subcategorised into 128 terminal categories
- A conceptual workflow was defined to prioritise terminal categories based on whether they are data poor, contain members that are on the TSCA inventory and/or members that are under the purview of different State environmental monitoring efforts
- Potential test order candidates could be selected based on centroid and other structurally diverse picks from either terminal categories based on the full landscape or from categories constrained by TSCA (active) members only
- Mechanistic and toxicokinetic information was incorporated to inform testing requirements and provide confidence in category membership

# Summary

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Terminal categories were operationalised using a predictive model to facilitate prospective profiling of new PFAS

Next TSCA test orders are yet to be determined



Full Length Article

Development of chemical categories for per- and polyfluoroalkyl substances (PFAS) and the proof-of-concept approach to the identification of potential candidates for tiered toxicological testing and human health assessment

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