

# Leveraging the US EPA ToxCast chemical library to benchmark suspect screening and non-targeted analysis methods

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## Abstract

Suspect screening (SSA) and non-targeted analysis (NTA) methods offer practical means to characterize xenobiotic chemicals in a variety of environmental and biological media more efficiently and with broader scope than is possible with targeted methods. These approaches use a variety of analytical instrumentation, data processing methods, acceptance criteria, and reporting standards.

We are conducting a round-robin collaborative trial to evaluate a range of approaches currently used in SSA and NTA. Experiments will evaluate method performance as a function of increasing experimental complexity based on the number of compounds in the mixtures as well as the components in the underlying matrix.

The results will be compared to the actual chemical list to assess the best approaches based on correct identifications, identification certainty, false negatives, and false positives.

GOAL: Produce benchmark method(s) for analytical, reporting, and data analysis to facilitate further analyses and identify areas for improvement.

## Background

## Exposome

 Totality of enviro exposures throughout lifetime; includes diet, lifestyle, indirect exp. (Wild, 2005)



environmental (Rappaport and Smith, 2010)

 >84,000 chemicals registered for U.S. use, but little is known about exposure from them

## Toxicity ForeCaster (ToxCast<sup>™</sup>) and Tox21

https://www.epa.gov/chemical-research/toxicity-forecaster-toxcasttm-data



- Launched in 2007 · High throughput toxicity screening for hazard prioritization
- Over 3,800 chemicals in EPA's libraries
- Over 1,100 assays on portions of library
- Well curated library of chemicals tested
- · Chemical purity QA information available

Chemical Structures

## Distributed Structure-Searchable Toxicity Database (DSSTox)

- https://www.epa.gov/chemical-research/distributed-structure-searchable-toxicity-dsstox-database
- · Includes all ToxCast chemicals (and more!) · Highly curated with matching:
- CASRN
- Structure (SMILES, InChI)
- Name
- 154,000+ substances with ≥ QC level 4 will be shared as suspect screening list
- DB contains molec, formula for test substance Can calculate monoisotopic mass after desalting

 Access >700K chemicals, physchem properties, advanced searches for structure identification at iCSS Chem Dashboard https://comptox.epa.gov/

#### Suspect screening and non-targeted analysis at EPA



MIX+ B Description 1 Curated, validated 4,535

-	multiple sources	1010
*****		
101310	EPA SRS, no conflicts in	
	GhemID or PubChem	
4	ChemID, no conflicts in	101K
	PubChem	
<b>B</b>	ACToR or PubChem	594K
33222233		10033001001001
6	Conflicts in public sources	310K

- Entails complex workflows combining:
  - Analytical chemistry
  - Data Processing & Analysis
  - Mathematical and QSPR modeling
  - Informatics and Web Services
  - Test/evaluate each step, whole process
  - · Evaluate performance characteristics-% correct, false positive/negative rates



Experimental





- methods suspect screening lists
  - data processing

**Chemical Standards** 

- ~20 groups expressed interest
- Extracts of standardized environmental matrices provided to reduce variability

in-house instrumentation

Three categories of experiments will be used:

Ten mixtures with high structural diversity

~100-400 per mixture, some replicates

dust

Each laboratory will/may use their own:

· Focus on environ chems with exposure potential

**Environmental Matrices Unspiked and Spiked** 

• NIST SRM 1957- Organic contaminants in non-

fortified human serum Silicone passive sampler, environmentally exposed

NIST SRM 2585- Organic contaminants in house

Known chemicals from ToxCast

- Liguid and gas chromatography used to assess coverage of chemical space
- List of known chemicals will be disclosed after initial analyses and reports
- · Individual chemicals comprising each mixture will be available upon request

## **Research Questions**

- · What percentage of standard mixture chemicals are correctly identified?
- · Which methods perform better overall? For specific chemical classes?
- Does the complexity of the mixture/matrix impact performance?
- What types of method/analysis parameters improve performance?

· What chemical space is being covered by each method? Overlap? Can we model these behaviors?

· What can be done to expand coverage?

Suspect list

- Physicochemical parameters
  - Matrix effects

Sensitivity

· What unintended components or by-products are in standard mixtures? Impurities Reaction products Degradation products

· In environmental samples, what chemicals do methods agree are present? Does this agree with SRM reported data? Is this predictable?

## **Example Outputs**

- ToxPi prioritizations
- · Heat maps
- molecular features • known chemicals
- Concentration estimates
- Hierarchical clustering
- analysis parameters
  - chemical exposure
- Benchmark method(s)





Short Presentation, tentatively in the Auditorium Monday ~17:15 in workshop #3 "Suspect screening in the environment"

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