



# Quantitative Non-Targeted Analysis for Risk-Based Prioritization of Emerging Contaminants

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# Why Do “We” Need Measurement Data?

- **Measurement data needed to ensure chemical safety**

- Characterize risk
- Regulate use & disposal
- Manage human & ecological exposures
- Ensure compliance under legal statutes

## Toxic Substances Control Act (TSCA) Compliance Monitoring

To protect federal, state, and tribal health and the environment from unreasonable risks of adverse effects from certain chemical substances, EPA requires manufacturers and processors of certain chemical substances to provide data to EPA.

## Safe Drinking Water Act (SDWA) Compliance Monitoring

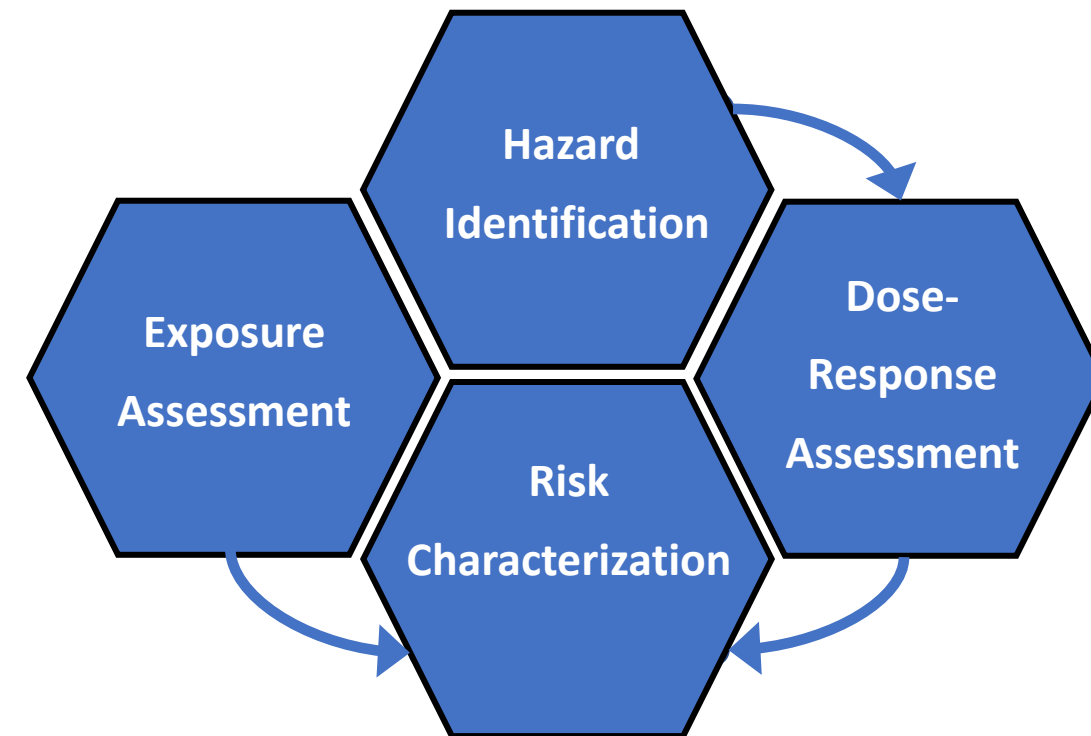
Providing safe drinking water to the public is one of EPA's primary responsibilities. Under the Safe Drinking Water Act (SDWA), EPA requires public water systems to monitor and report on the quality of their drinking water.

## Federal Insecticide, Fungicide and Rodenticide Act Compliance Monitoring

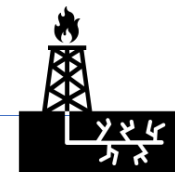
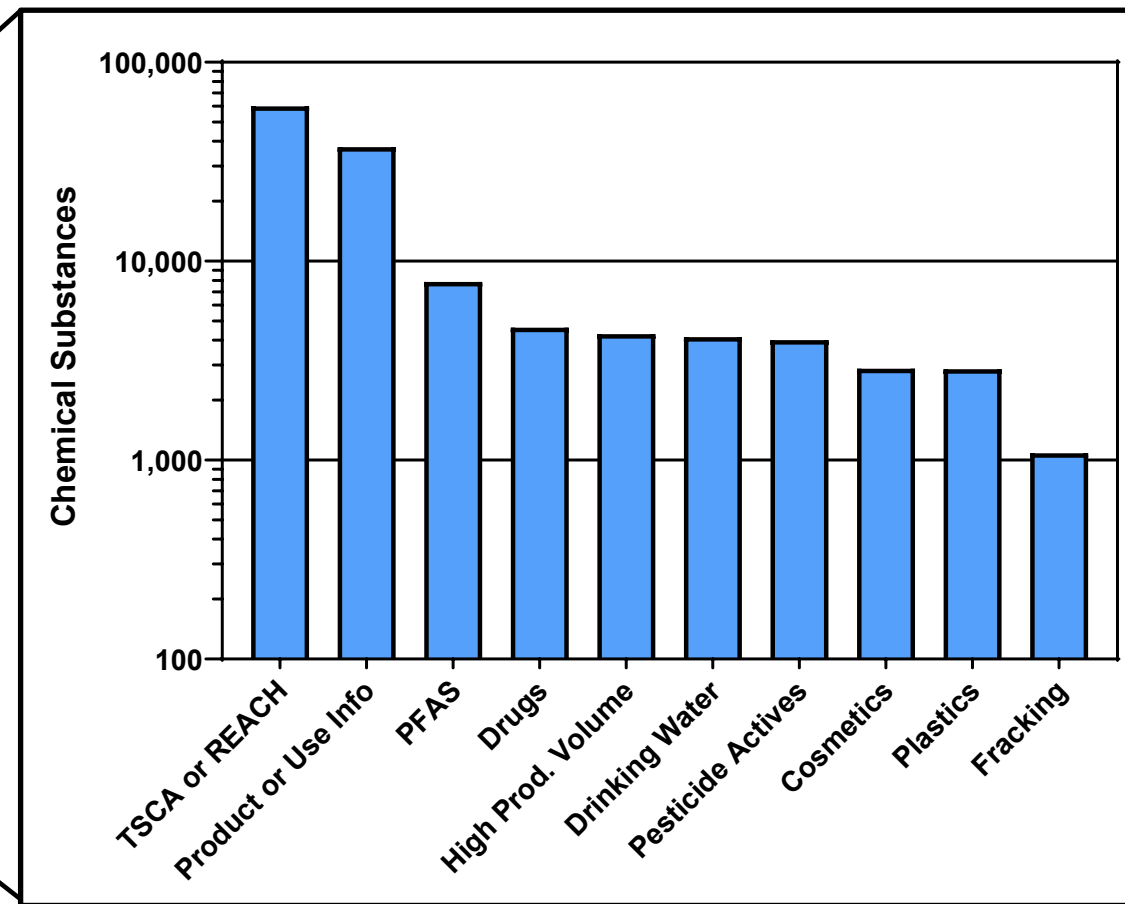
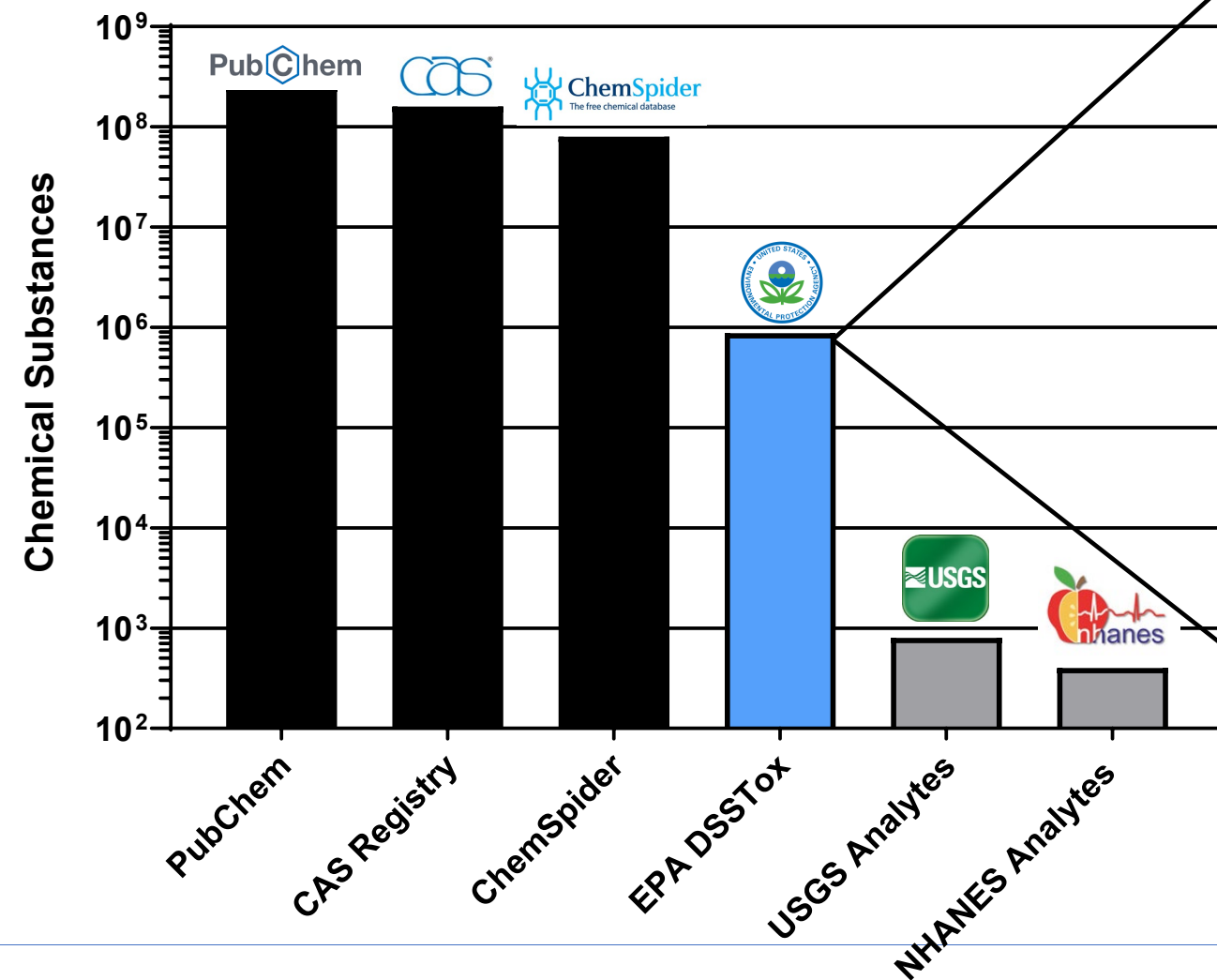
The Federal Insecticide, Fungicide and Rodenticide Act (FIFRA) gives EPA the authority to regulate the registration, distribution, sale and use of pesticides. FIFRA applies to all types of pesticides, including:

Resources and Guidance Documents

## Chemical Monitoring Needs



# Data Disparity: Have vs. Need



# Challenges



- High-quality monitoring data are unavailable for most chemicals
- Measurement data traditionally generated using “targeted” methods
- Targeted analytical methods:
  - Require *a priori* knowledge of chemicals of interest
  - Produce data for few selected analytes (10s-100s)
  - Require standards for method development & compound quantitation
  - Are blind to emerging contaminants
  - Can’t keep pace with the needs of 21<sup>st</sup> century chemical safety evaluations

# What's So Great About NTA?

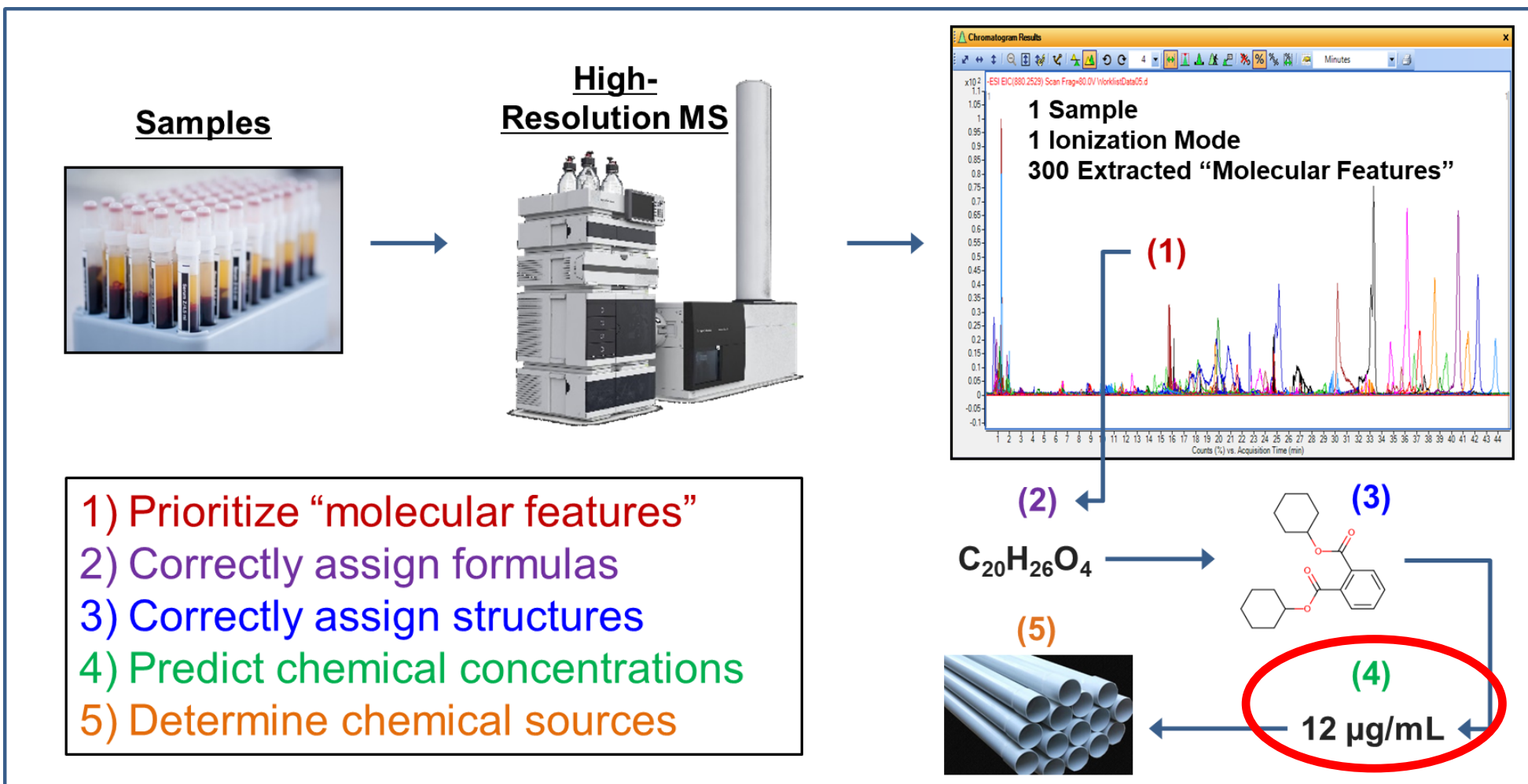


Rapidly screen  
for “knowns”

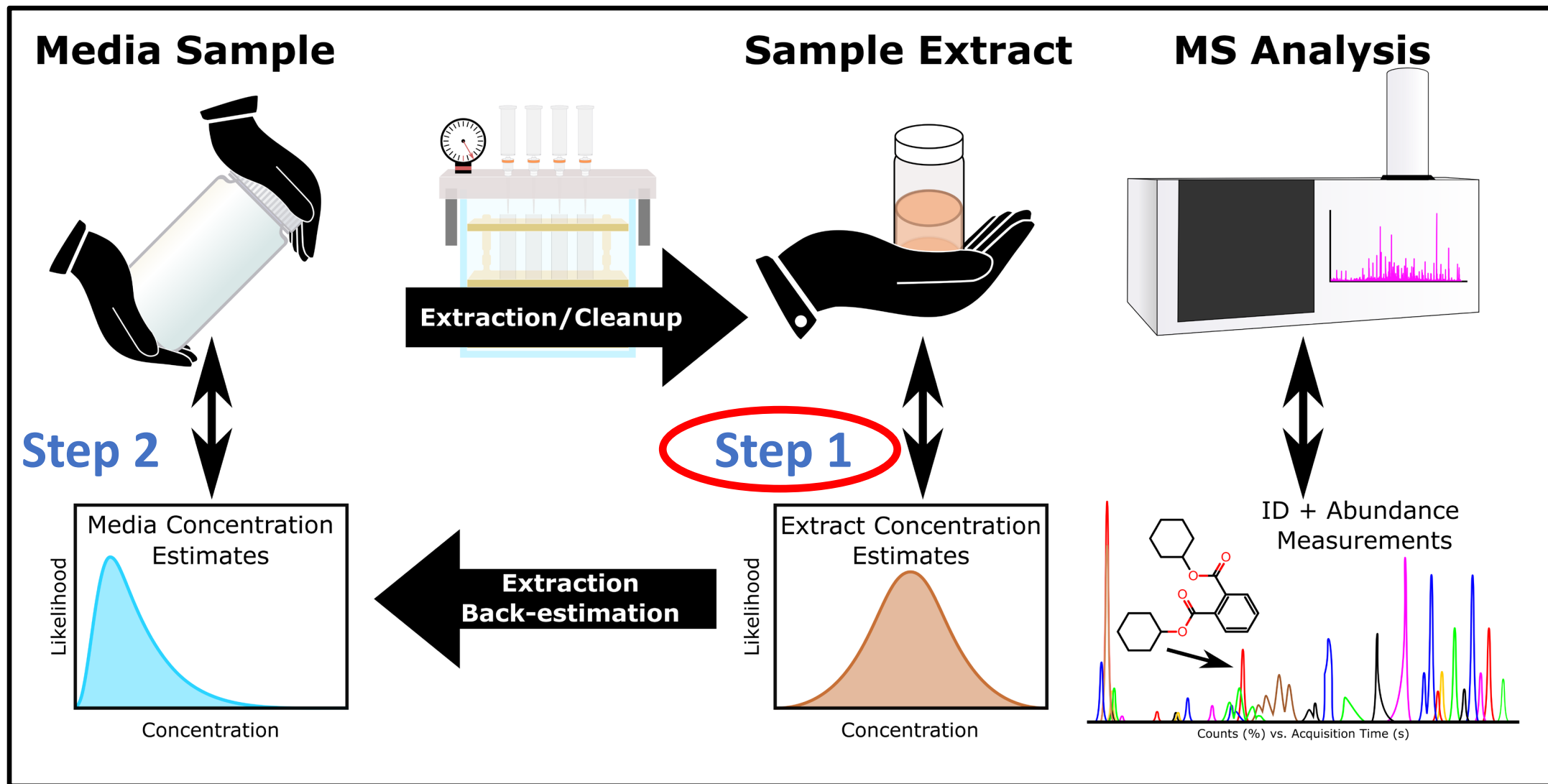
Discover  
“unknowns”

Uncover historical  
exposures

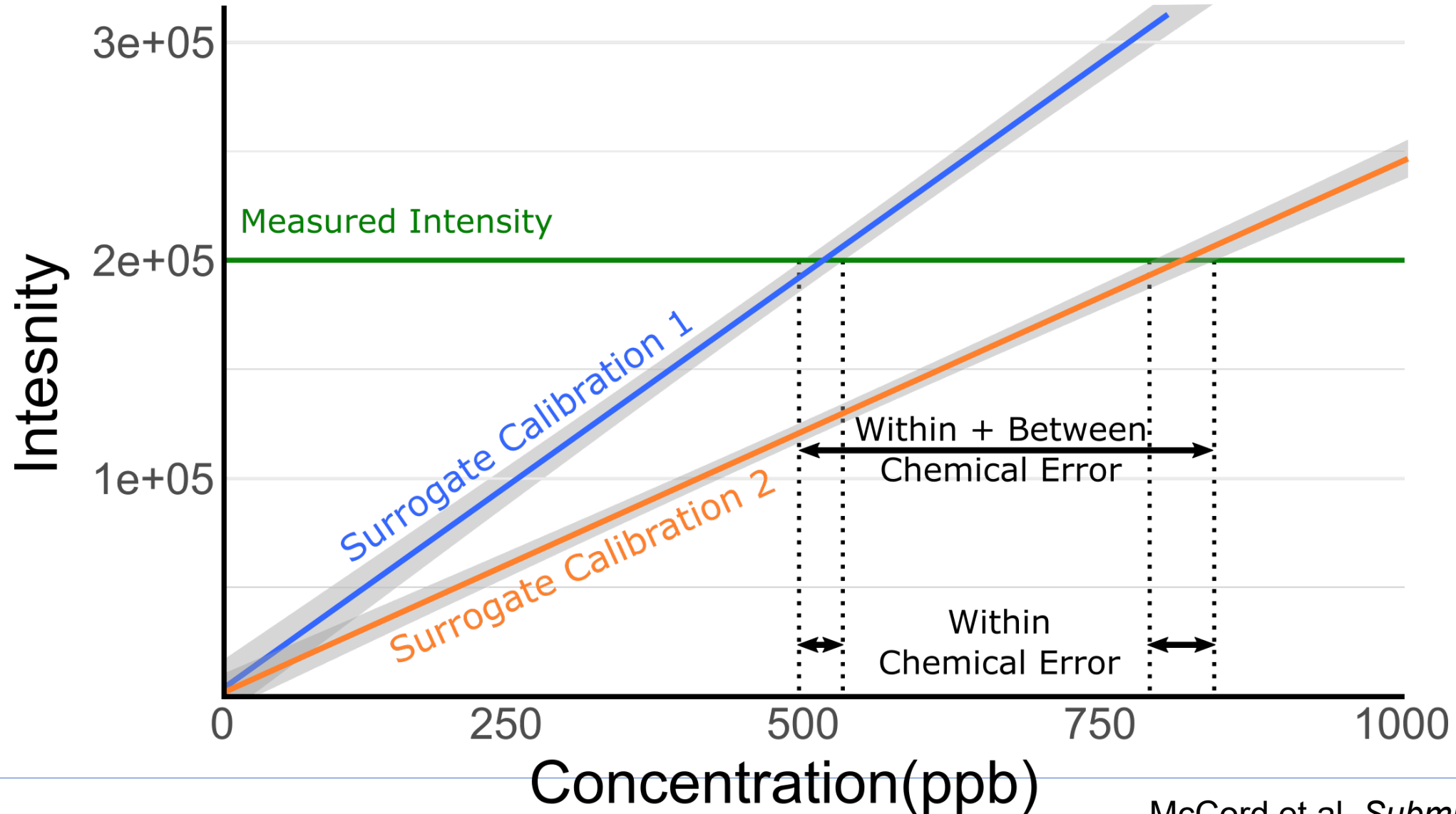
Generate source  
fingerprints...



# Quantitative NTA (qNTA) Workflow



# Step 1 Uses “Surrogate Calibration”



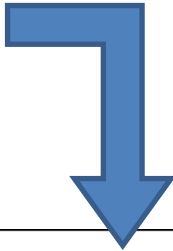


# Considerations for Surrogate Calibration

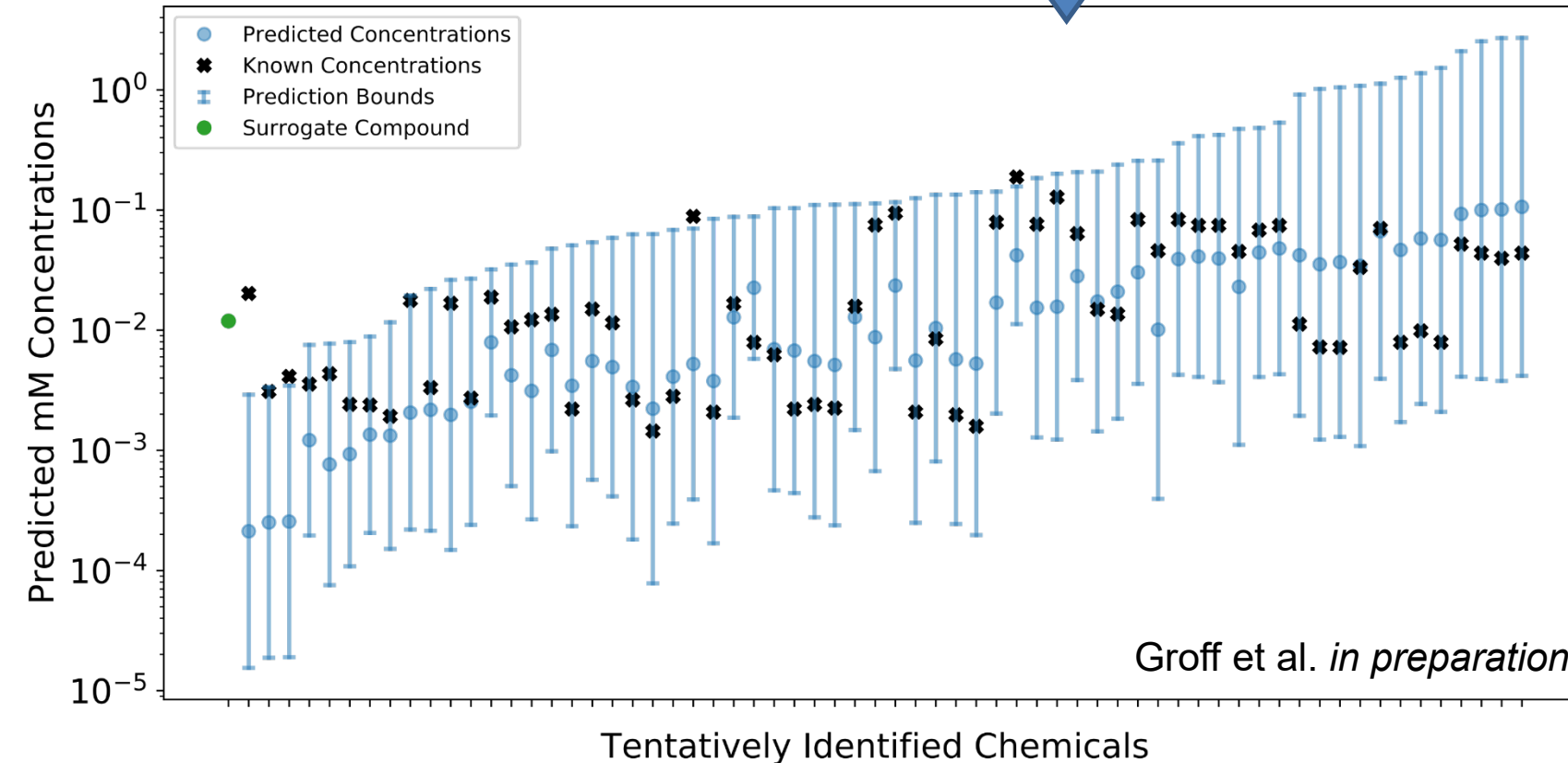
- Multiple methods for choosing a surrogate calibrant
  - Single surrogate (i.e., an “average” responder)
  - Structurally similar surrogate
    - Nearest neighbor (e.g., based on elution time)
    - Within chemical class
    - Based on calculated similarity (e.g., Tanimoto index)
    - Based on known parent/metabolite relationship
  - Model-predicted value (e.g., based on expected ionization efficiency)
- Prediction error within and between chemicals
  - Affected by sample & batch correction techniques
  - Affected by surrogate selection techniques
  - Consider all error when estimating confidence intervals for individual predictions



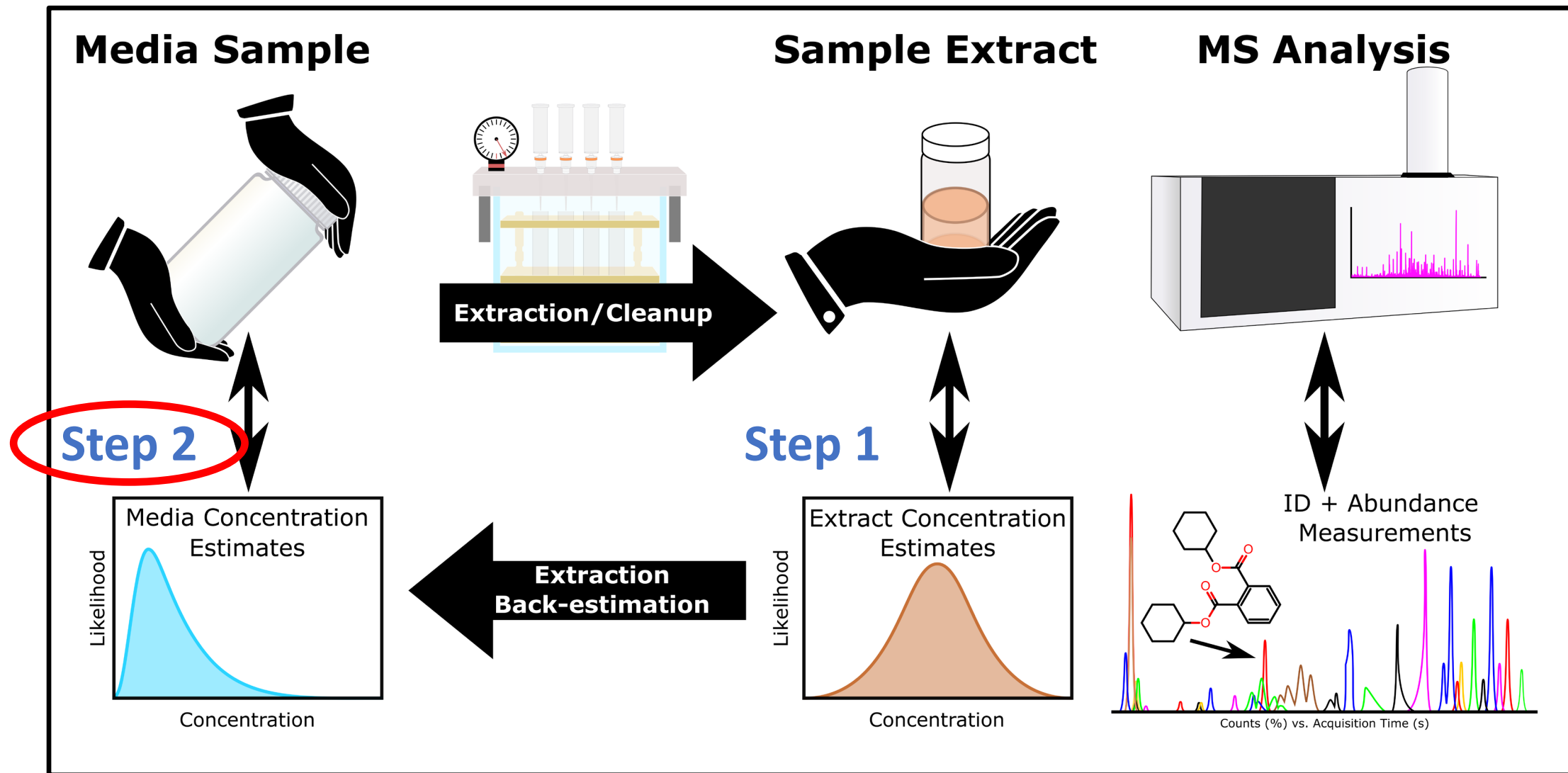
# qNTA Proof-of-Concept



- Analysis of Brita filter extracts via GC-HRMS.
- Single surrogate selected and applied to all identified analytes
- Concentration estimates can be above or below true value.
- Prediction intervals used to bound concentration estimates.
- 95% prediction intervals shown; Can use 99%, 99.9%, etc.
- Tentatively identified compounds ranked by upper-bound estimates.
- **Upper-bound estimates compared to level-of-interest to set priorities.**



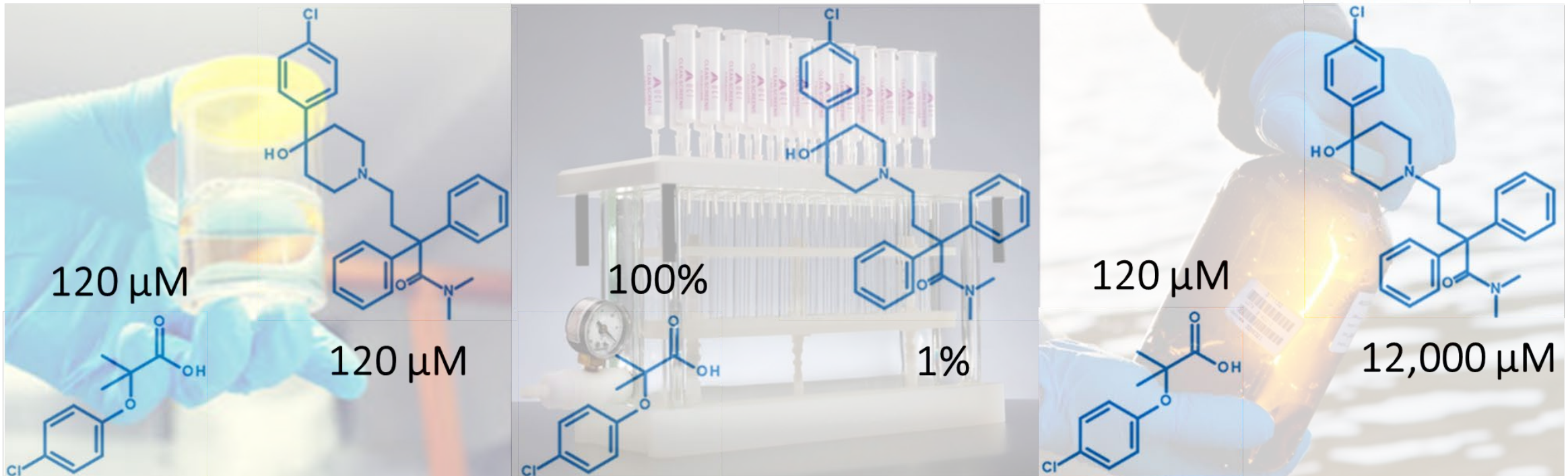
# Quantitative NTA (qNTA) Workflow



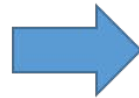
# Why is “Recovery” A Critical Parameter?

Max. Percent Recovery = 100% → known lower bound on media conc.

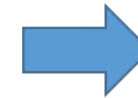
Min. Percent Recovery = ?% → no upper bound on media conc.



Sample Extract  
Estimates



Percent Recovery  
from Media



Media  
Estimates



# No Existing Models for Predicting Recovery

- General rule of thumb:
  - At least 10× more data points than explanatory variables
- Type of media: 10s
- Conditions of media: 10s
- Extraction solvents: 10s
- Extraction conditions: 10s
- Clean-up procedures: 10s
- Interactions terms (e.g., media × condition × solvent...): ???
- >100,000 possible recovery scenarios → >1,000,000 required data points
- So we can't bound it, and we can't predict it. Now what???



# Defining “Margin of Recovery” (MoR)

## Traditional “Recovery” Definition:

$$\frac{\text{Amount in Sample Extract}}{\text{Amount in Sampled Media}} \times 100 = \% \text{Recovery} \quad \longrightarrow \quad \frac{80 \mu\text{g}}{100 \mu\text{g}} \times 100 = 80\% \text{ Recovery}$$

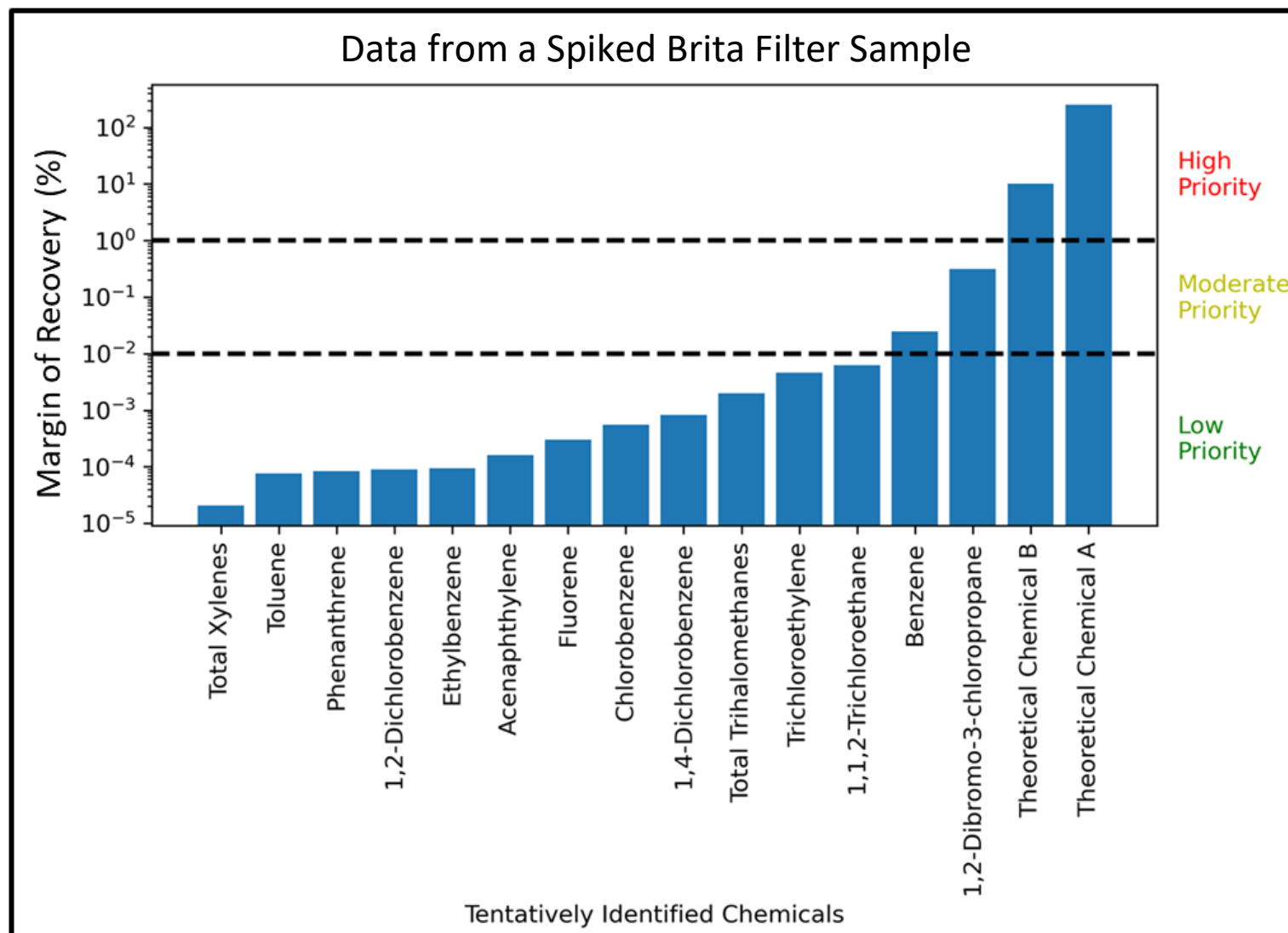
## “Margin of Recovery” (MoR) Definition:

$$\frac{\text{Upper Bound qNTA Estimate (amount in sample extract)}}{\text{Level of Concern (amount in sampled media)}} \times 100 = \% \text{MoR}$$

## Important interpretation:

- ***What recovery is needed for the qNTA estimate to match the level-of-concern?***
- ***Is that calculated recovery plausible enough to warrant further targeted analysis?***

# Example Risk-Based Prioritization



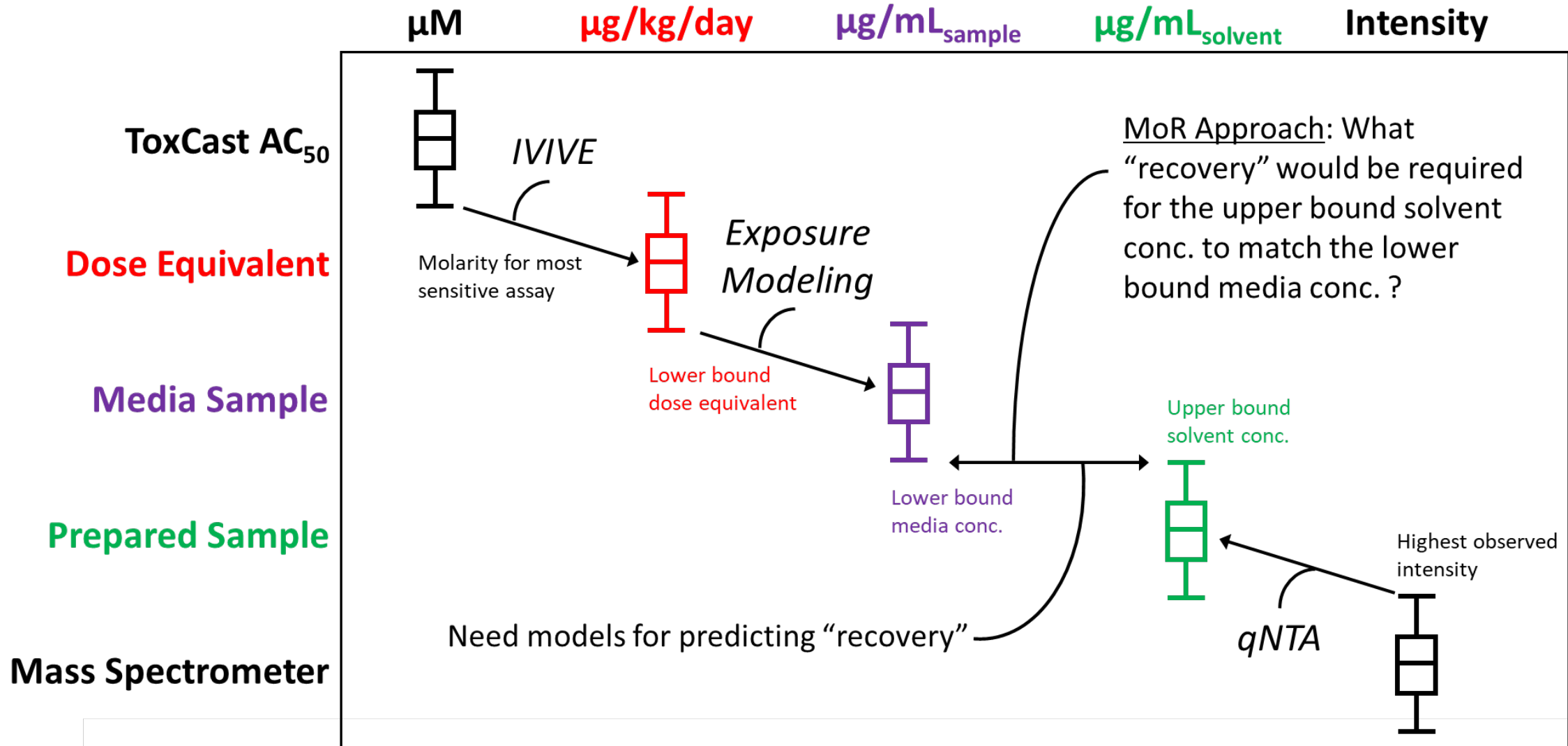
For “**High Priority**” Chemicals, a 1-100% experimental recovery would be needed for the upper bound qNTA estimate to match a drinking water concentration associated with bioactivity/toxicity.

Recoveries < 1% and > 0.01% are considered somewhat unlikely. Chemicals in this range are therefore considered “**Moderate Priority**”

Recoveries < 0.01% are considered highly unlikely. Chemicals in this range are therefore considered “**Low Priority**”



# Conceptual Model for Rapid Risk Evaluation

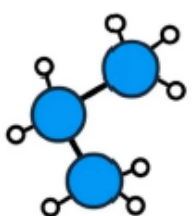


# The Future of NTA and Chemical Risk Assessment



- The number of labs performing NTA will increase dramatically!
- We're expecting a wealth of NTA data for known (but data-poor) chemicals
  - These data cannot be interpreted using traditional performance metrics
    - **How will risk assessors use new NTA data to support decisions?**
- We're expecting a steady stream of NTA data for newly discovered chemicals
  - Chemical standards won't be readily available (via purchase or synthesis)
    - **How will risk assessors rapidly evaluate the safety of these CECs?**
- ORD efforts will enable translation of NTA data to support Agency decisions

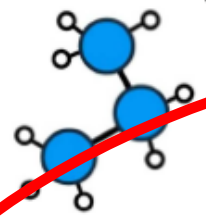




# INTRODUCING...

## BP4NTA

BENCHMARKING AND PUBLICATIONS  
FOR NON-TARGETED ANALYSIS



### WHAT IS BP4NTA?

A consensus organization of >100 members from ~55 worldwide, multi-sector institutions.

BP4NTA was formed in 2018 to address challenges in non-targeted analysis (NTA) studies using mass spectrometry. We hope to accelerate the broad acceptance and use of HRMS studies in scientific and regulatory communities.

### BP4NTA PRODUCTS

Visit [www.nontargetedanalysis.org](http://www.nontargetedanalysis.org) for more information.

#### 1. Collated resources for new NTA researchers traversing the learning curve

Access detailed, NTA reference content at [www.nontargetedanalysis.org/reference-content/](http://www.nontargetedanalysis.org/reference-content/)

#### 2. The NTA Study Reporting Tool (SRT)

Access a peer-reviewed tool that aids study design & review of NTA manuscripts at [www.nontargetedanalysis.org/srt/](http://www.nontargetedanalysis.org/srt/)

#### 3. A glossary of commonly used NTA terms, concepts, and performance metrics

Access the list of NTA definitions at [www.nontargetedanalysis.org/glossary/](http://www.nontargetedanalysis.org/glossary/)

### UPCOMING EVENTS

SETAC SciCon4 2021:  
Nov. 14-17

- **Poster:** Non-Targeted Analysis Study Reporting Tool: A New Framework to Improve Reproducibility and Transparency (4.08.13)
- **Session:** Non-Targeted Analysis: Approaches Toward Identification of Chemical Contaminants (4.08.01- 4.08.25)
- **Session:** Non-Target Analysis: Prioritization of Organic Contaminants for Monitoring and Toxicological Studies (4.09.01- 4.09.20)

SETAC Focused Topic Meeting: May 22-26, 2022  
"Non-Target Analysis for Environmental Assessment"

# THE STUDY REPORTING TOOL (SRT)

## A FRAMEWORK FOR CONSISTENT PEER REVIEW

Section	Category	Sub-Category	Example Information to Report	Score	Rationale
NTA Study Chronology	Study Design	Objectives & Scope	Study goals, hypothesis, scope, expected chemical coverage	1	Space for reviewer to explain assigned score (i.e., typical peer review rationale)
		Sample Info & Preparation	Sampling collection, processing, description, intended use of data	2	
		QC Spikes & Samples	Number of replicates, controls	2	
	Data Acquisition	Analytical Sequence	Sample run order, analysis methods	NA	
		Chromatography		0	
		Mass Spectrometry		1	
	Data Processing & Analysis	Data Processing		2	
		Statistical & Chemometric Analysis		3	
		Annotation & Identification		3	
	Results	Data Outputs	Statistical & Chemometric Outputs	3	
		ID & Confidence Levels	Reported IDs and confidence levels & supporting data	3	
	QA/QC Metrics	Data Acquisition QA/QC	Method reports on adequate chemical space, accuracy & precision of chromatography, data error, abundance	1	
		Data Processing & Analysis QA/QC	Method reports on adequate chemical space, abundance measures for accuracy, reproducibility of results	0	

Enables rigorous evaluation of reporting quality in NTA studies

## READILY VISUALIZE REVIEWER FEEDBACK



Excel auto-plot function provides quick visual representation of peer-reviewer and self-assigned scores

Download the SRT:

[www.nontargetedanalysis.com/srt/](http://www.nontargetedanalysis.com/srt/)

Evaluation of the SRT:

[10.1021/acs.analchem.1c02621](https://doi.org/10.1021/acs.analchem.1c02621)

# Contributing Researchers



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\* = ORISE/ORAU



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# Questions?

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