



# Making Fish Contaminant Data FAIR to Improve Fish Consumption Advisories

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June 3, 2021

# Overview

## Making Fish Contaminant Data FAIR to Improve Fish Consumption Advisories

### Overarching goal:

To create a searchable data platform containing publicly-available fish tissue contaminant and environmental data

### Research question:

Do fish contaminant data support risk evaluation of combined exposures to multiple contaminants for protective fish consumption advisories?



DARTMOUTH

Celia Chen, Arnold Song,  
Scott Shumway, **Pianpian Wu**

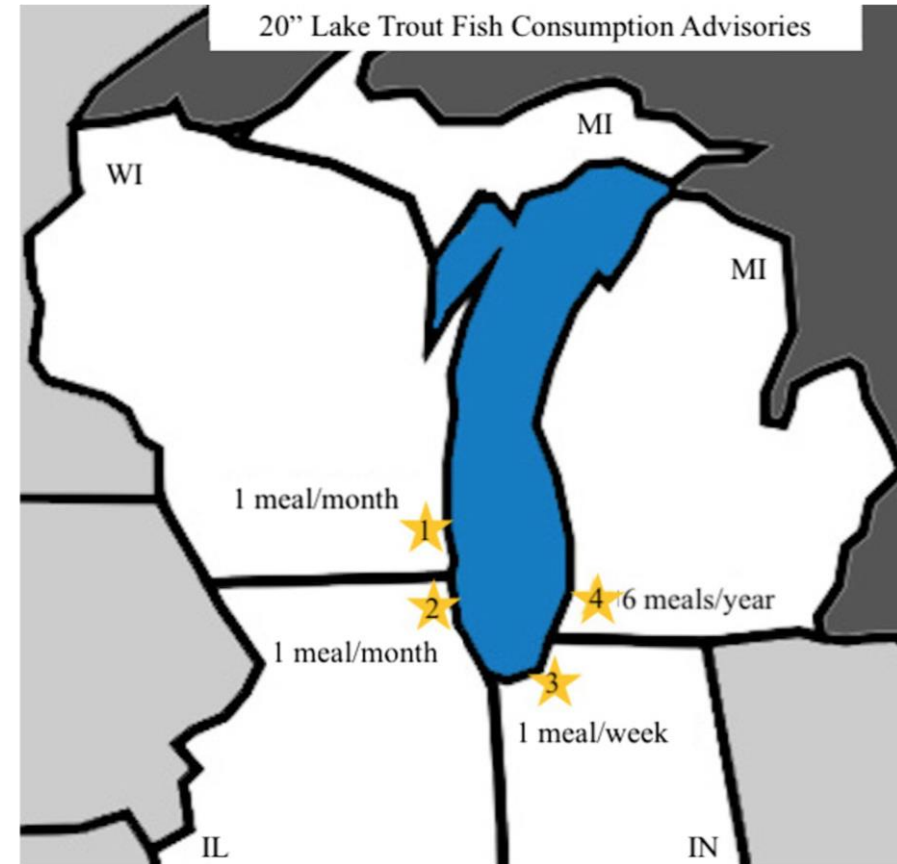


BOSTON  
UNIVERSITY

Wendy Heiger-Bernays,  
**Caredwen Foley**

# Fish Consumption Advisories

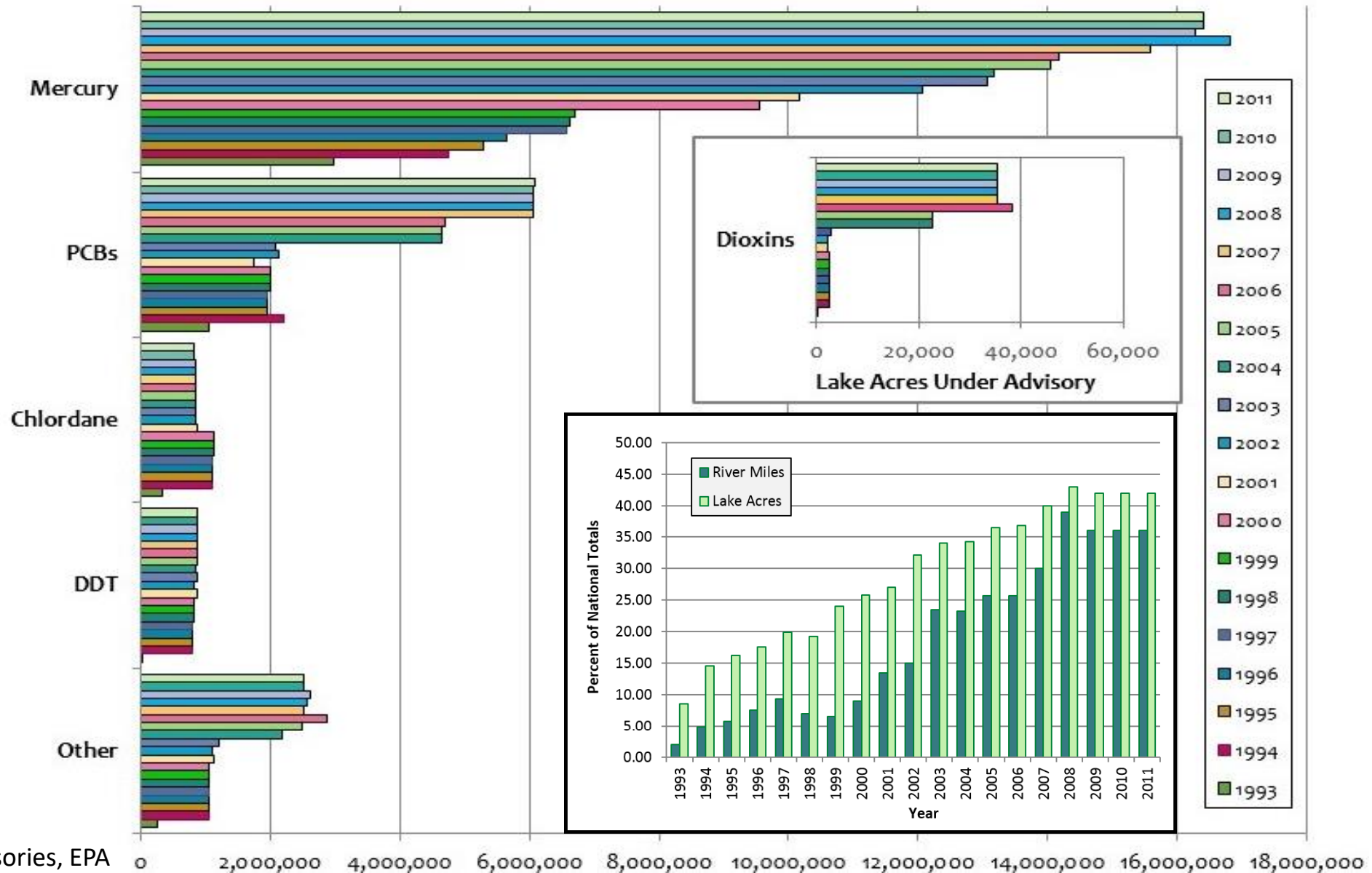
- Data collected across monitoring programs differ in chemicals measured; fish species, sizes, and tissues; and ecological data
- State data collection has primarily addressed mercury; assessment of polychlorinated biphenyls (PCBs), pesticides, and emerging contaminants like per- and polyfluorinated substances (PFAS) has lagged
- Advisories differ across states, bodies of water, and contaminants (Cleary et al., 2021)



Differences in advisories issued by states bordering Lake Michigan (Cleary et al., 2021)

# Fish Consumption Advisories

Total lake acres under advisory for mercury, PCBs, chlordane, dioxins, DDT, and other contaminants from 1993 to 2011.



# Project Significance

- Create a more comprehensive assessment of the totality of risks where multiple contaminants are present
- Increase data transparency to engage communities
- Use fish consumption advisories to inform hazardous waste clean-up and source reduction efforts with the end goal of protecting public health



# Inputs

## Datasets

- USEPA fish contaminant datasets
  - National Rivers and Streams Assessment (NRSA) (2008-9, 2013-4)
  - National Lake Fish Tissue Study (NLFTS) (1999-2003)
- Great Lakes Fish Management and Surveillance Program (GLFMSP) (NCCA Great Lakes) (1999 - 2018)

## Variables

- Species: freshwater fish
- Matrices: filet vs. whole body
- Contaminant concentrations: metals (Hg), organics (cyclodienes, PCBs, PAHs, DDXs, dioxins, PFAS, PBDEs)

# Integrating Data: Repository Development

- Built relational database combining data from US Government datasets (e.g. NCCA, NRSA, NLFTS) including SRP data, allowing users to access these data all at once
- Repository underpins an interactive map visualization to provide a broad view of contamination nationwide (PCBs, mercury, other organic and inorganic pollutants)
- Defined schema for column mapping, data types and lengths
- Open-source reproducible design, including hosting all Extract, Transform, Load (ETL) codes in GitHub, easy to use and share on-premises or cloud hosting solutions



Data source:

NCCA 

Download

#	UID	SITE_ID	DATE_COL	STATE	MATRIX	TAXA_NAME	PARAMETER	PARAMETER_NAME	PARAMETER_CAT	CAS_NO
36	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	BETAHCH	Beta-BHC	PESTICIDE	319-85-7
37	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB180	2,2',3,4',5,5',6-Heptachlorobiphenyl	PCB	35065-29-3
38	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	OPDDT	2,4'-DDT	PESTICIDE	789-02-6
39	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	METHOXY	NaN	NaN	NaN
40	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PPDDE	4,4'-DDE	PESTICIDE	72-55-9
41	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB101	2,2',4,5,5'-Pentachlorobiphenyl	PCB	37680-73-2
42	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	TL	Thallium	METAL	7440-28-0
43	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	ZN	Zinc	METAL	7440-66-6
44	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB156	NaN	PCB	NaN
45	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB170	2,2',3,3',4,4',5-Hexachlorobiphenyl	PCB	35065-30-6
46	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB153	2,2',4,4',5,5'-Hexachlorobiphenyl	PCB	35065-27-1
47	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	GAMMACHL	Gamma-Chlordane	PESTICIDE	5566-34-7
48	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB149	NaN	PCB	NaN
49	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	NI	Nickel	METAL	7440-02-0
50	59	NCCA10-1111	7/1/2010	CA	TISSUE	Umbrina roncador	PCB128	2,2',3,3',4,4'-Hexachlorobiphenyl	PCB	38380-07-3



# Addressing Data Integration Challenges

- A uniform ontology for contaminant monitoring in fish tissue data did not previously exist
- Used metadata from source datasets to map between data sources to normalize inputs
- Aggregated and extended several existing ontologies that encompass the following sets of parameters:
  - Ecological and physiological - ENVO
  - Environmental - ENVO
  - Contaminant - ChEBI

## Towards an ontology for contaminant measurement in fish tissue samples

Caredwen Foley (1), Wendy Heiger-Bernays (1), Arnold Song (2), Celia Chen (3)

1. Boston University Superfund Research Program, Boston University School of Public Health;

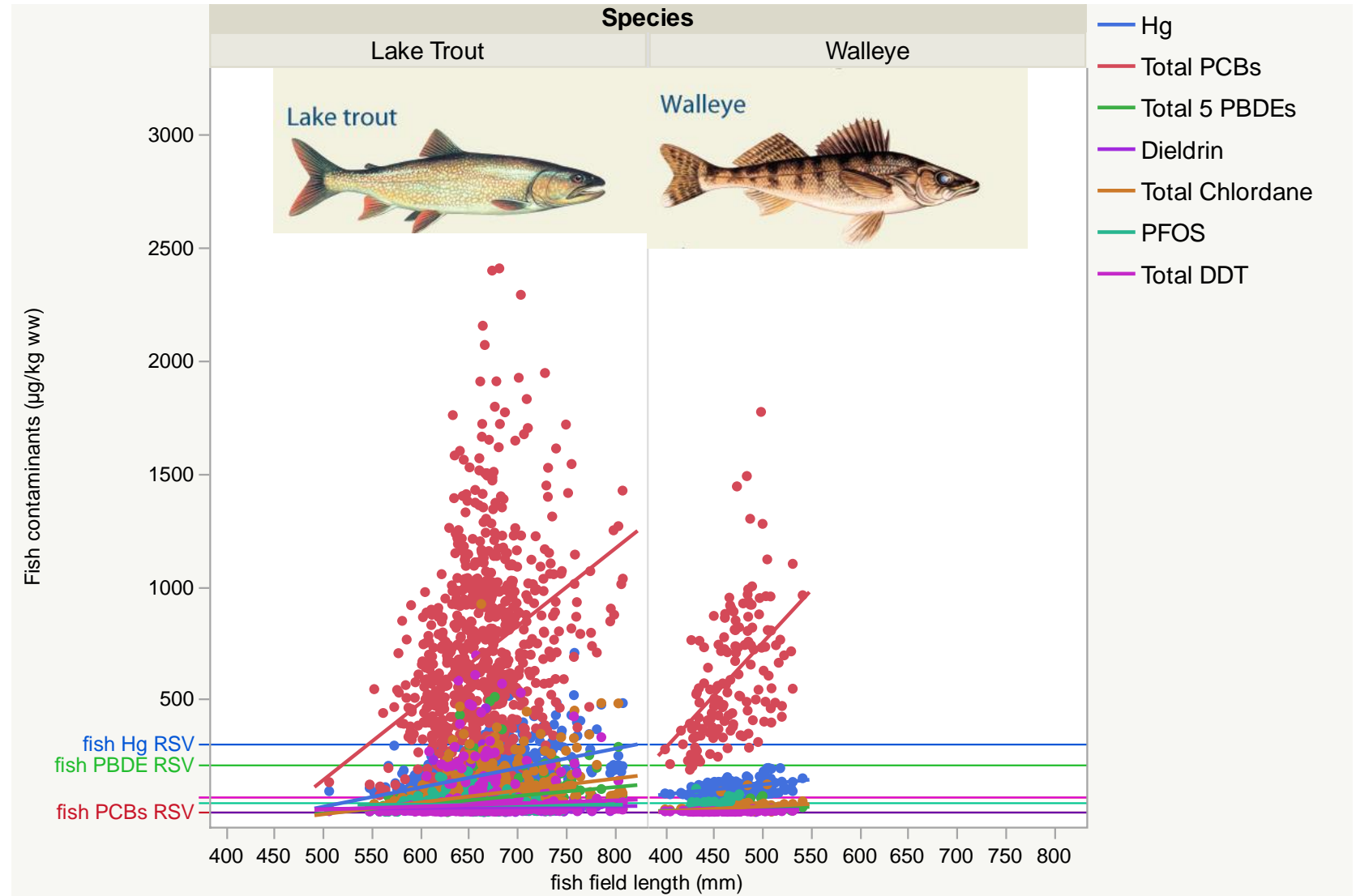
2. Advanced Computing Lab, Dartmouth College;

3. Dartmouth Toxic Metals Superfund Research Project, Dartmouth College

# Preliminary Mixtures Analysis

Great Lakes Fish Management and Surveillance Program (GLFMSP) data:

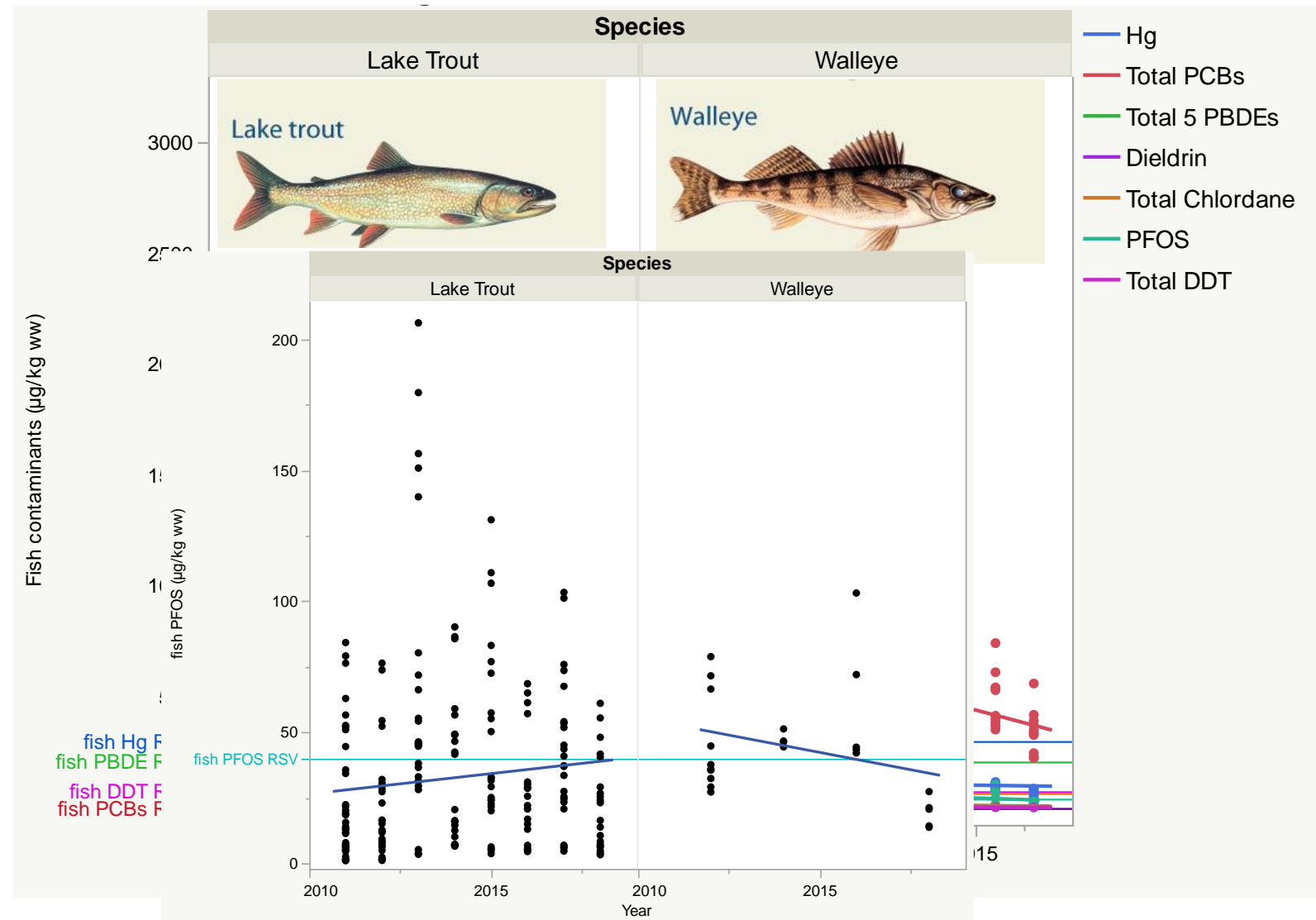
- Mainly lake trout and walleye collected during 1999-2018
- Fish contaminant levels increase with fish sizes, e.g., PCBs and mercury (Hg)



# Preliminary Mixtures Analysis

Great Lakes Fish Management and Surveillance Program (GLFMSP) data:

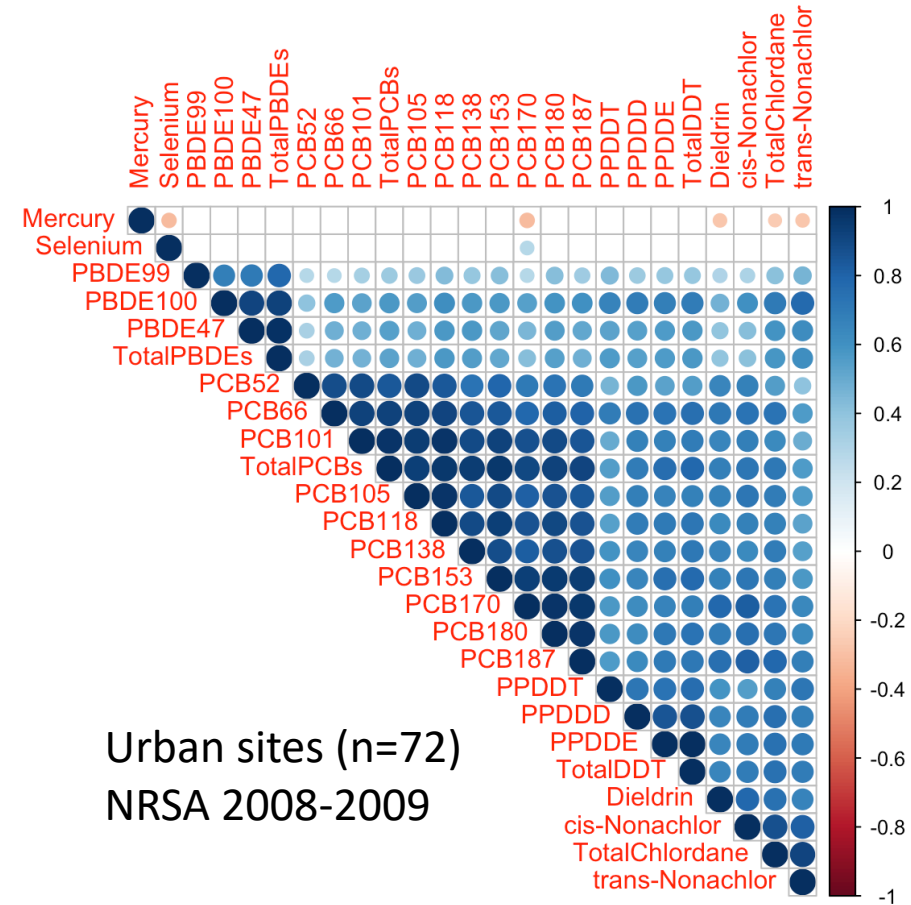
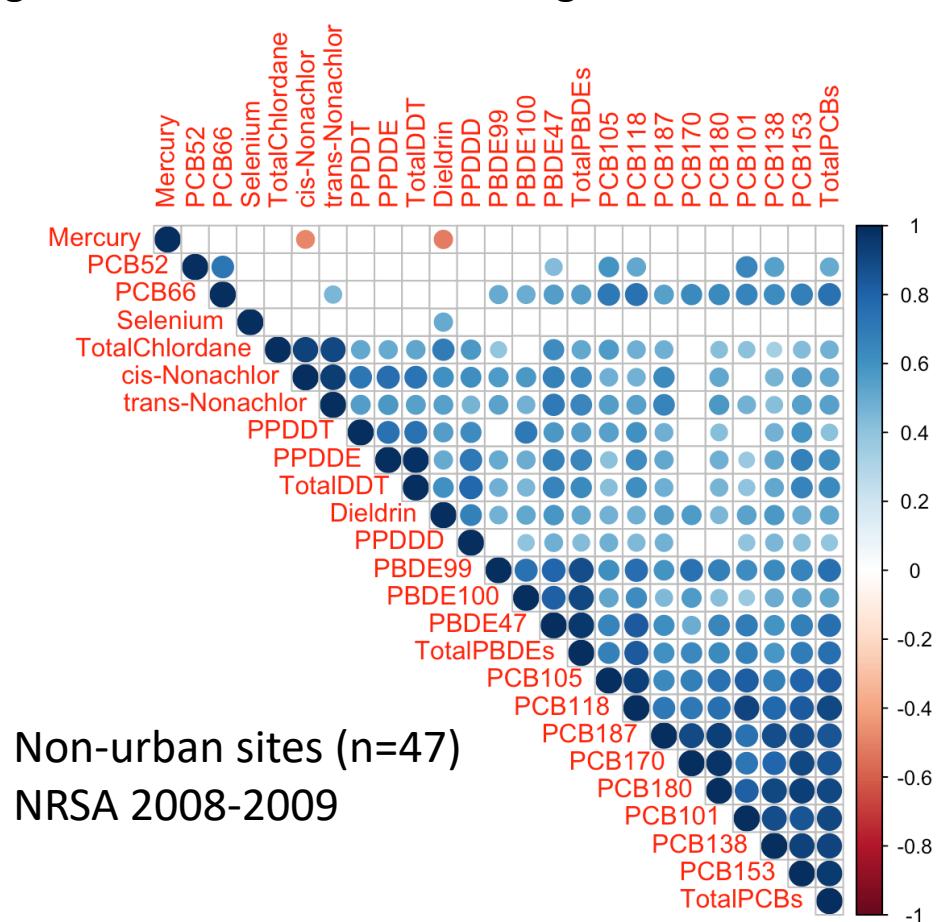
- Fish PCBs levels have decreased over time
- Fish mercury (Hg) levels, as well as pesticides, have remained stable
- Fish polyfluoroalkyl substances (PFOS) still exceed recommended risk screening values for safe fish consumption



# Preliminary Mixtures Analysis

## National Rivers and Stream Assessment (NRSA)

- Data collected during 2008-2009 from streams and rivers in 48 states
- Higher correlations of PCB congeners in urban sites

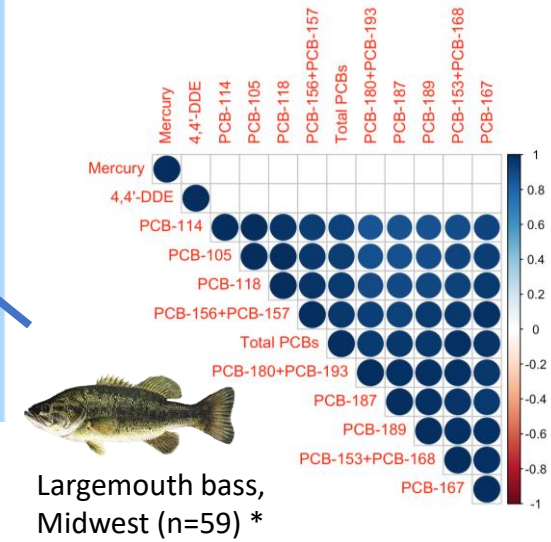
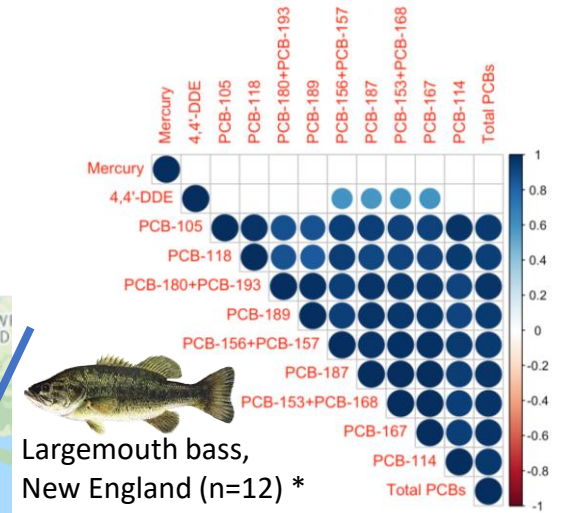
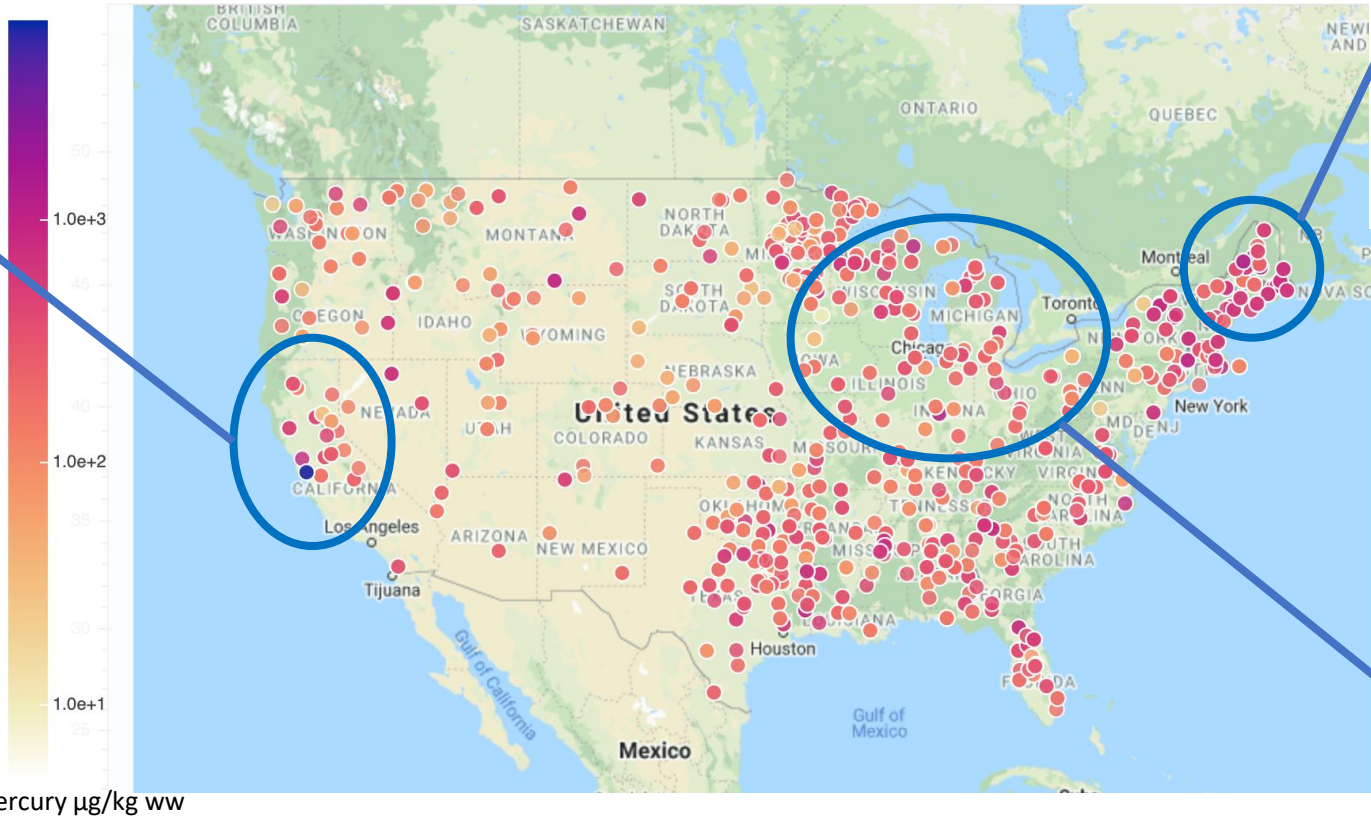
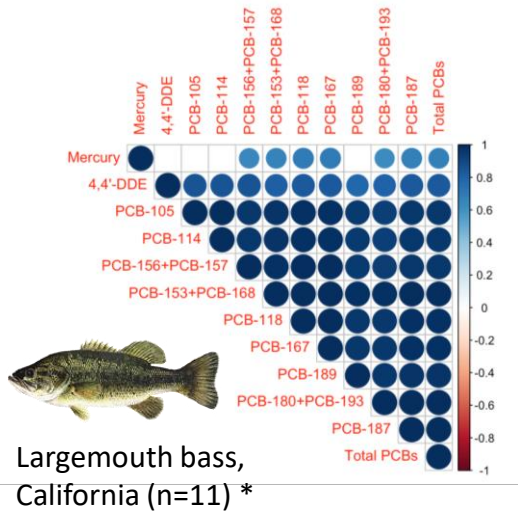


\*Circles in grids represent significant correlation at  $\alpha=0.05$ . Size of circle scales with the size of correlation coefficient. Color gradient illustrates whether correlations are positive (blue) or negative (red).

# Preliminary Mixtures Analysis

National Study of Chemical Residuals in Lake Fish Tissue

- Data collected during 1999-2003 from lakes in 47 states (n=72)
- Regional differences in correlations of PCB congeners with mercury, esp. California



\*Circles in grids represent significant correlation at  $\alpha=0.05$ . Size of circle scales with the size of correlation coefficient. Color gradient illustrates whether correlations are positive (blue) or negative (red).

# Communication and Collaboration Opportunities

This repository creates opportunities for scientific collaboration in:

## **Data access:**

- SRP/other academic environmental health researchers
- “Citizen” (resident) scientists and community groups
- Federal, state, and local researchers

## **Data collection:**

- Explore opportunities for external partners to submit data
  - Will require investigation into quality control and security
  - Consult with other researchers aggregating data to establish QA/QC protocols

# What's next?

- **Truly protective consumption advisories require more consistent, comprehensive data collection—especially for multiple contaminants**
  - Extrinsic (water chemistry, land-use activities) and intrinsic (species, trophic level, tissue type, feeding behavior, food availability) variables
  - Chemical characteristics, e.g., persistent/degradable, hydrophobic/hydrophilic, biomagnifying chemicals
- **More funding and support needed to continue efforts to protect public health**
  - Funding for data scientists and infrastructure
  - Funding for addressing research questions relevant to community engagement
- **More collaboration across disciplines (e.g., public health, contaminant chemistry, and ecology), borders (states, federal, and international), and organizations (private sector, government, NGOs)**

# Acknowledgement

Funding from National Institute of Environmental Health Sciences:  
Superfund Hazardous Substance Research and Training Program

- NIEHS/NIH, P42 ES007381-21S1
- NIEHS/NIH, P42 ES007373-23S3



A young girl with blonde hair, wearing a blue and white striped life vest, is smiling and holding up a small fish on a boat. She is also holding a red fishing rod. The background shows a body of water and a clear blue sky.

# Thank you!

Contact us if you have more questions!

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- [caredwen@bu.edu](mailto:caredwen@bu.edu)