

National Institute of Environmental Health Sciences Your Environment. Your Health.

www.niehs.nih.gov/srp

# NIEHS Superfund Research Program (SRP) Machine Learning and Artificial Intelligence Activities



#### Heather Henry, Ph.D. Health Scientist Administrator

#### Superfund Research Program National Institute of Environmental Health Sciences (NIEHS)

National Institutes of Health • U.S. Department of Health and Human Services



## **Superfund Research Program Mandates**

Integrating Health and Environmental/Engineering Sciences with Research Translation, Community Engagement, Data Science and Training

Health Effects	<ul> <li>Advanced techniques for the detection, assessment, and evaluation of the human health effects of hazardous substances</li> </ul>	<ul> <li>Artificial Intelligence and Machine Learning</li> <li>Contaminant Detection</li> <li>Gene/Enzyme Discovery</li> <li>Materials Design Optimization</li> <li>Geospatial/Ecosystem- level Information</li> </ul>
Assessing Risk	<ul> <li>Methods to assess the risks to human health presented by hazardous substances</li> </ul>	
Detection	<ul> <li>Methods and technologies to detect hazardous substances in the environment</li> </ul>	
Remediation	<ul> <li>Basic biological, chemical, and physical methods to reduce the amount and toxicity of hazardous substances</li> </ul>	

U.S. Department of Health and Human Services



#### **Superfund Research Program**



- Institutions that Partner with SRP Grantees
- Superfund Sites

Link to Map: https://tools.niehs.nih.gov/srp/sites/www.cfm

#### SRP Grantees: <u>https://tools.niehs.nih.gov/srp/programs/index.cfm</u> SRP Funding Opportunities:

https://www.niehs.nih.gov/research/supported/centers/srp/funding/index.cfm



## **Quantitative Biosciences (QBiSci)**

<u>A Customizable Real-Time Biosensor for Continuous Monitoring of Water Contaminants</u> Scott Cookson, R43ES028993

- Developing "Qube" a customizable online biosensor microfluidic platform
  - Sensitive "sensor strains" (e.g. *E. coli*) customized to fluoresce when a specific target is present
  - Customized optics and image processing platform converts signal into concentration information
  - Process uses machine learning algorithm trained to recognize the type and amount of each contaminant present in continuous water stream, as well as sudden pulses and subtly varying concentrations.



QBiSci's "Qube" uses spatially-isolated microbial strains that fluoresce in presence of specific water contaminants

Phase 1 results (ppb): Arsenic (5), Cadmium (2), Uranium (300), Mercury (1), Lead (30), Nitrate (25), Nitrite (250), Ammonium (250), Phosphate (25). (See Progress Report 2020: <a href="https://tools.niehs.nih.gov/srp/programs/progress\_report.cfm?Project\_ID=R43ES028993">https://tools.niehs.nih.gov/srp/programs/progress\_report.cfm?Project\_ID=R43ES028993</a>)



## **Baylor College of Medicine**

<u>Streamlined Identification of PAHs/PACs in Environmental Samples Using Ultracompact</u> <u>Spectroscopy Platforms and Machine Learning Strategies</u> Naomi Halas (Rice University), Peter Nordlander (Co-PI, Rice University), Ankit Patel (Co-PI), P42ES027725

- Aluminum nanoengineered substrates for streamlined ultrasensitive PAH and PAC detection
  - Polydopamine (biomimetic polymer) selectively extracts and adsorbs PAH and PAC molecules onto the nanosensing platform
  - Uses machine learning to analyze Surface Enhanced Raman Spectroscopy (SERS) and Surface Enhanced Infrared Absorption (SEIRA) spectra signals
  - Ultracompact, ultrasensitive chemical analysis, identifies multiple analytes in a single sample, <u>no need</u> for separation and purification steps





Biomimetic polydopamine polymer inspired by mussel adhesive proteins



## University of California, San Diego

<u>Molecular Mechanisms of Heavy Metal Detoxification</u> <u>and Engineering Accumulation in Plants</u> Julian Schroeder, P42ES010337

- Machine Learning Approaches
  - New powerful screen to identify new genes, gene families, and network principles that function in heavy metal and arsenic resistance (Zhang et al., Nat Commun, 2018; Xie et al., Plant Cell Environ, 2021)
  - Developed genome-wide artificial microRNA libraries that can identify the genes, signal transduction pathways, and mechanisms underlying heavy metal(loid) accumulation in plants (<u>Hauser et al., Plant Cell, 2013</u>; <u>Hauser et al., J Exp Bot, 2019</u>)
  - Screened for genes involved in cadmium hyperaccumulation (Yu et al., Planta, 2021)
  - The UCSD artificial microRNA database is available online at: <u>http://phantomdb.ucsd.edu/</u>





#### **Microbial Insights**

Expanding the Tool Box: Environmental Metabolomics Improves Decision Making and Management of Contaminated (Superfund) Sites Dora Taggart, R43ES030669 Active

- Sampling metabolomes from the environment and comparing profiles from different contaminated sites
- Identification of 80 100 known compounds in samples; thousands of unknown compounds
- Comparison of the overall metabolic profile of samples from different known conditions
- Use statistical analysis and pattern recognition to predict and understand activity of key degraders









## **Individual Research: SUNY at Buffalo**

<u>Model-aided Design and Integration of Functionalized Hybrid Nanomaterials for Enhanced</u> <u>Bioremediation of Per-and Polyfluoroalkyl Substances (PFASs)</u> Diana S. Aga, Ian Bradley, Nirupam Aich, Carla A. Ng

(University of Pittsburgh), R01ES032717

- PFAS biodegradation using enriched microbial communities combined with catalytic hybrid nanomaterial pre-treatment.
- Using molecular modeling and quantum chemistry simulations to bring mechanistic insight into specific PFAS-surface and PFAS-enzyme interactions.
- Screening for enzymes capable of degrading structurally diverse PFAS.







## **Florida State University**

<u>Enhancing Bioremediation of Groundwater Co-contaminated by Chlorinated Volatile</u> <u>Organic Compounds and 1,4-Dioxane Using Novel Macrocyclic Materials</u> Youneng Tang, Yuexiao Shen (Texas Tech University), R01ES032692

- Synthesizing macrocyclic materials to enhance bioremediation of CVOCs and 1,4-dioxane.
- Developing mathematical models of macrocyclic sorbents and using computational approaches to gain insight into binding mechanisms.
- Using 1,4-dioxane-metabolizing culture for bioremediation that is more effective at low, environmentally relevant concentrations.









#### Small Business: Microvi Biotechnologies, Inc. <u>An Agent-Based Modeling Platform for Environmental Biotechnology</u> Fatemeh Shirazi, R44ES026541

- Developed EnviroABM, an agent-based modeling platform that predicts interactions between microbial ecosystems and hazardous groundwater contaminants.
- Integrating publicly available databases with machine learning to develop tailored microbiomes for degrading mixtures of polyfluorinated compounds (PFCs), volatile organic compounds (VOCs), and heavy metals separately.
- Developing a continuous-flow, lab scale prototype for real-world bioremediation using Microvi's Multi-Zone MicroNiche Engineering (MZ-MNE) platform, which uses biological organisms to degrade organic compounds into harmless by-products.





#### **Northeastern University**

Effect of Extreme Weather on Potential Exposure of Contaminant Mixtures in Karst Water Systems Ingrid Y. Padilla (University of Puerto Rico at Mayaguez) Contextigators: Damian E. Helbling (Cornell University), Philip Larges, Casanova, Paul

Co-Investigators: Damian E. Helbling (Cornell University), Philip Larese-Casanova, Raul Macchiavelli (University of Puerto Rico at Mayaguez), Dorothy Vesper (West Virginia University) P42ES017198

- Geospatial artificial intelligence and machine learning to discover patterns in groundwater flow and contaminant transport in karst systems in Puerto Rico
- Construct predictive models of the fate and transport of contaminants in groundwater, and aims at classifying damage after disasters, including near Superfund sites after Hurricane Maria
- Part of a KC Donnelly award to Luisa Feliciano for collaboration with Geospatial Research Laboratory, Engineering Research and Development Center, US Army Corps of Engineers



Maria with US ACE



National Institute of Environmental Health Sciences Your Environment. Your Health.

#### Questions: Heather Henry heather.henry@nih.gov

SRP Webpage: www.niehs.nih.gov/srp

#### Special thanks to Megan Boland, MDB, Inc.

SRP Grantees: <u>https://tools.niehs.nih.gov/srp/programs/index.cfm</u> SRP Funding Opportunities: https://www.niehs.nih.gov/research/supported/centers/srp/funding/index.cfm

#### **Ongoing NIEHS Solicitations**

Small Business Innovative Research Grants with new initiatives on Climate Change

Mechanism for Time-Sensitive Research Opportunities in Environmental Health Sciences (R21) Monthly receipt dates

Spending by: <u>Awarding Agency</u> ~			
iew a list of the top Agencies from highest to lowest. View your results by warding Agency, Sub Agency, or Office, and hover over the bars for more detailed formation.	Agencies	Sub-Agencies	Offices @ Coming Soon
Department of Defense (DOD) Environmental Protection Agency (EPA)			-
Department of Health and Human Serv	_		
Departmen         USA Spending, Federal C           National Ae         https://www.usaspending	Grant D . <u>gov/</u>	atabase	<b>:</b>
Department of Agriculture (USDA)			

# SRP 35<sup>th</sup> Anniversary Annual Meeting System AppRoAches for Innovative and Inclusive Environmental Health Solutions December 14 – 16, 2022 Raleigh, NC



#### **Current SRP Funding Mechanisms**

Multi-Project Centers (P42)	<ul> <li>Designed for integration across disciplines: Biomedical and Non- Biomedical Research; Community Engagement, Research Translation, and Training. Basic and application-oriented.</li> </ul>		
Individual Research Projects (R01)	<ul> <li>Designed to address specific issues to complement the multi-project research program; tackle issues of emerging concern for Superfund.</li> </ul>		
Small Business Research Grants (SBIR) (R43-44)	<ul> <li>Foster the commercialization of technologies, relevant to hazardous substance clean-up and monitoring.</li> </ul>		
Time-Sensitive Grants (R21)	<ul> <li>Research on unpredictable events with a limited window to collect samples or data.</li> </ul>		
Conference Grants (R13)	<ul> <li>Provides funding for conferences related to SRP mandates.</li> </ul>		
Supplement Awards	<ul> <li>Trainee externships/work exchanges, technology transfer opportunities.</li> </ul>		
SPR Crantage, https://toola.nicha.nih.gov/arp/programe/index.afm			

SRP Grantees: <u>https://tools.niehs.nih.gov/srp/programs/index.cfm</u> SRP Funding Opportunities: <u>https://www.niehs.nih.gov/research/supported/centers/srp/funding/index.cfm</u>

National Institutes of Health U.S. Department of Health and Human Services