



**Environmental Impact of Nuclear Waste**  
**Insights from US Nuclear Weapon sites**  
**What Can We Learn from Existing Nuclear Contamination?**

Haruko Wainwright

03/09



## Nuclear Waste and Contamination



John Oliver, August 20, 2017



## Nuclear Waste and Contamination



“Nuclear Waste” Sites: Former Nuclear Weapon Production Sites  
Deadly Plutonium: Half life of 24000 years



# Nuclear Waste and Contamination



# Nuclear Waste and Contamination



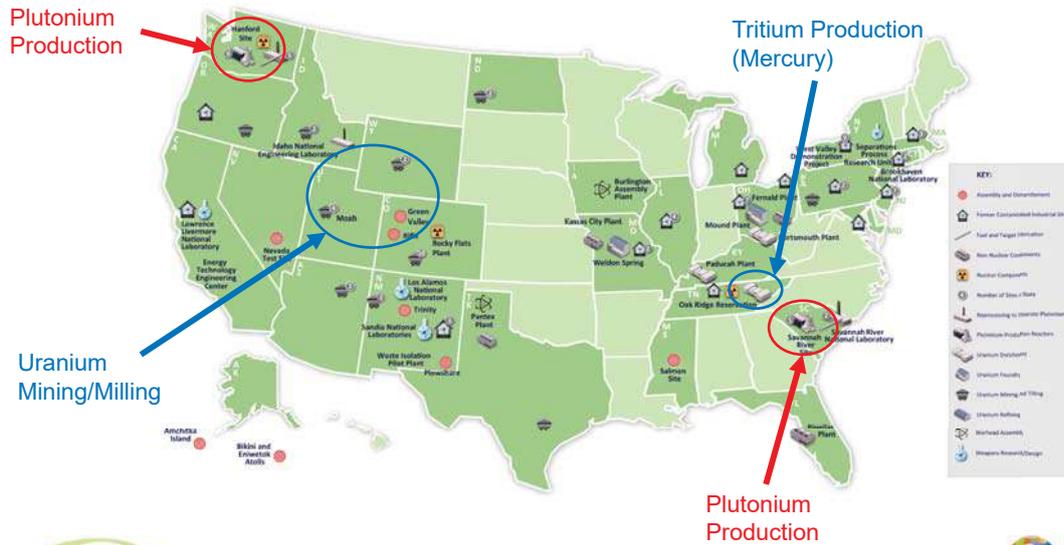
# Nuclear Waste and Contamination



# Nuclear Weapon Production Sites



# Nuclear Weapon Production Sites



# Waste Disposal: Early Days



Savannah River Site F-Area



Rifle, CO



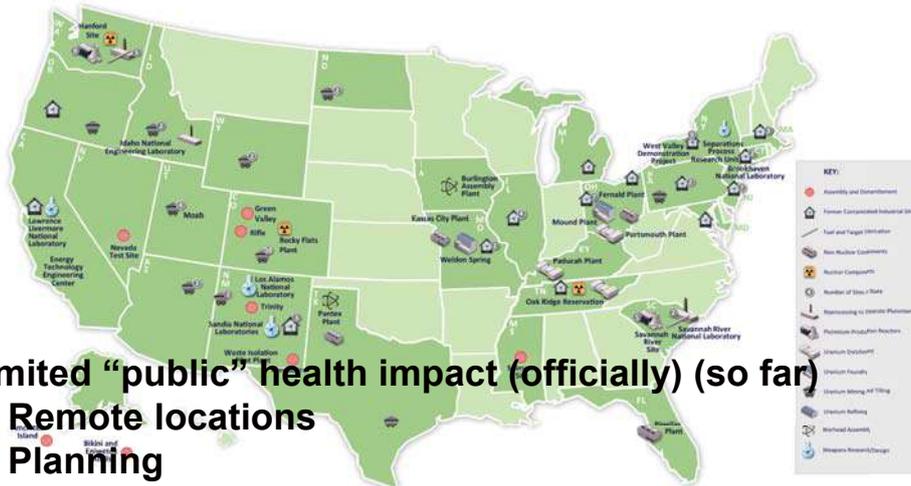
Hanford 300 Area



# Waste Isolation?



# Waste Isolation?



Limited “public” health impact (officially) (so far)

- Remote locations
- Planning
- Regulation



# Nuclear Weapon Production Sites: Waste Isolation?

Science Contents - News - Careers - Journals -

SHARE

Finding mercury, researchers deploy a Mo. aw pump during a 2013 west Pacific GEOTRACES cruise to gather small organic particles to which mercury attaches. [WOLFF LINDNER/WHOI/NOAA/UCSD](#)

Mercury levels in surface ocean have tripled

By Jia You | Aug. 6, 2014, 2:45 PM

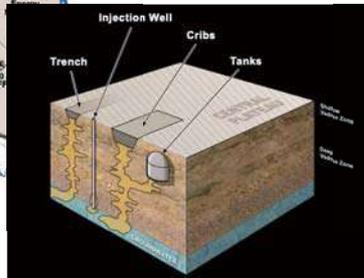
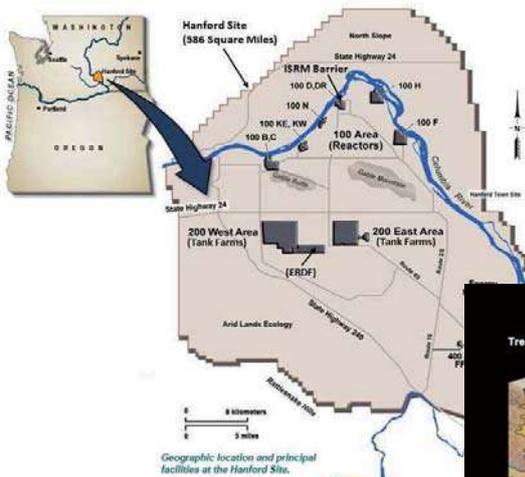


Courtesy to Will Stringfellow



# Hanford Site: Thick Vadose Zone

Technical Document on Waste Disposal, 1943



DECLASSIFIED

TO: L. S. Squires  
FROM: F. S. Squires

DATE: 10/21/71

1 - L. Squires  
2 - F. S. Squires  
3 - F. S. Squires  
4 - J. S. Squires  
5 - F. S. Squires  
6 - F. S. Squires  
7 - F. S. Squires  
8 - Chronological

July 29, 1943

MEMORANDUM

TO: L. S. Squires  
FROM: F. S. Squires

ATTN: TECHNICAL

The attached fibrous material prepared by the Metallurgical Laboratory, this is preliminary report (P.R.) accuracy. The results show the disposal of separation wastes. There are, however, several changes and additions which should be made:

1. The combined sodium carbonate and sodium sulfide precipitation process in the fibrous material has been found to give no better results than can be obtained with sodium carbonate alone. For the neutralization, still further additional precipitation, made by acid, however, is not to be demonstrated and probably should be omitted. It is estimated that the fibrous material waste solution will contain approximately 10% of the original activity. This will make the solution to be treated from the following table:

% of Original Activity	Medium Temperature	Time
10	145°	240 min. after absorption
20	145°	240 "
30	175°	240 "
40	205°	240 "

These values which are based on 200,000 gals. of 60 day 14 metal waste in a 50' x 20' lined tank (1000 sq. ft. area) and an initial temperature of 90°. were obtained by Mr. F. S. Squires.

DECLASSIFIED

EARTH & ENVIRONMENTAL SCIENCES

## Key/Priority Elements



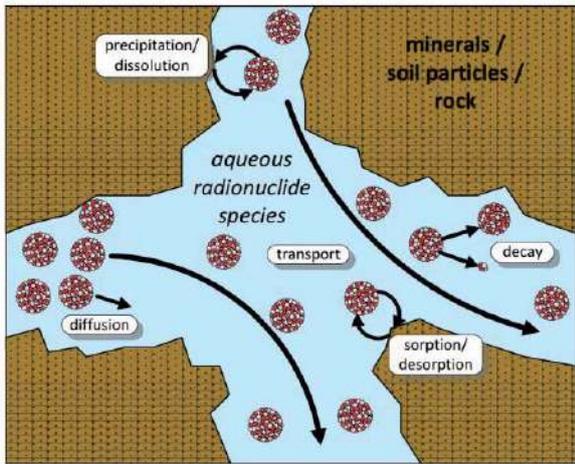
## Key/Priority Elements



# Environmental Mobility Rules!



# Kd: Partition Coefficient



Heuel-Fabianek, 2014

$$K_d = \frac{\text{Solid Conc. } (\frac{\text{mol}}{\text{kg}})}{\text{Aqueous Conc. } (\frac{\text{mol}}{\text{L}})}$$

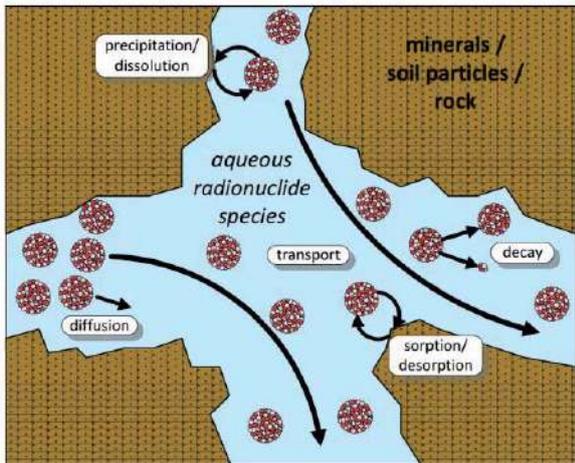
\* Assume linear isotherm and equilibrium

## Mobility/Velocity of Each Species

$$v = \frac{\text{Groundwater Velocity}}{1 + \frac{\rho}{\epsilon} K_d}$$



# Kd: Partition Coefficient



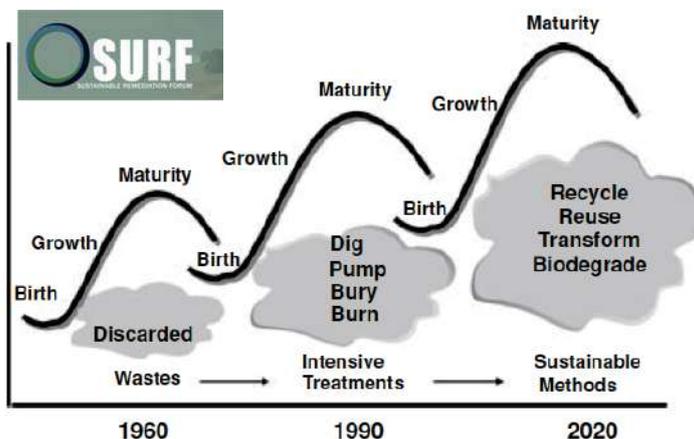
Heuel-Fabianek, 2014

Elements	Kd
H-3	0
I-129	4.5
Tc-99	0.14
Sr-90	20
Uranium	33
Cesium	4.4 x 10 <sup>3</sup>
Plutonium	1.2 x 10 <sup>3</sup>

Yucca Mountain Assessment, Biosphere Model



# Environmental Remediation: Evolution



## Sustainable Remediation

Trade offs:

Contaminant removal vs

- Cost
- Waste
- CO2 emission
- Energy Use
- Ecological Impacts
- Noise, Air pollution



# Long-term Institutional Control



- Attractive Re-development Planning
  - Restrictive use but added value
  - Solar farms, parks, factories
- Longer Institutional Control
  - Long-term monitoring will be a major life-cycle cost



Former Reilly Tar & Chemical Corporation Plant



Rocky Flats National Wildlife Refuge



## Importance Of Long-Term Monitoring

THE DENVER POST

OPINION · OPINION COLUMNISTS

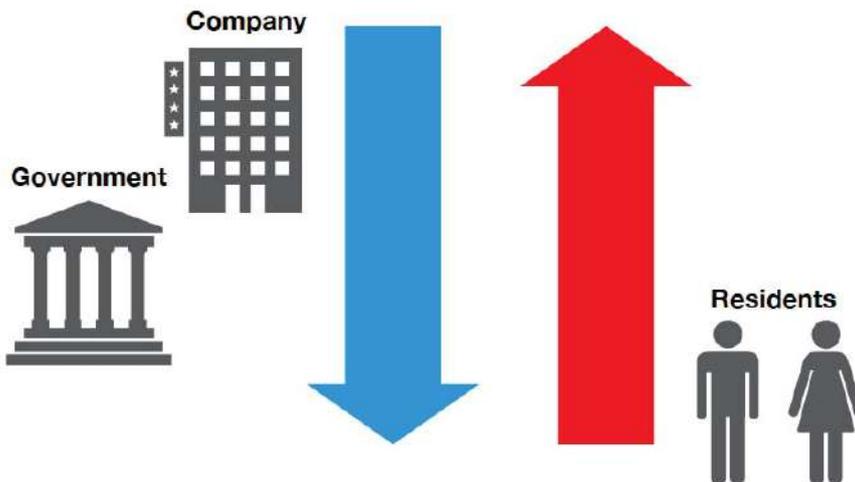
Activists ignore the science that says Rocky Flats National Wildlife Refuge is safe



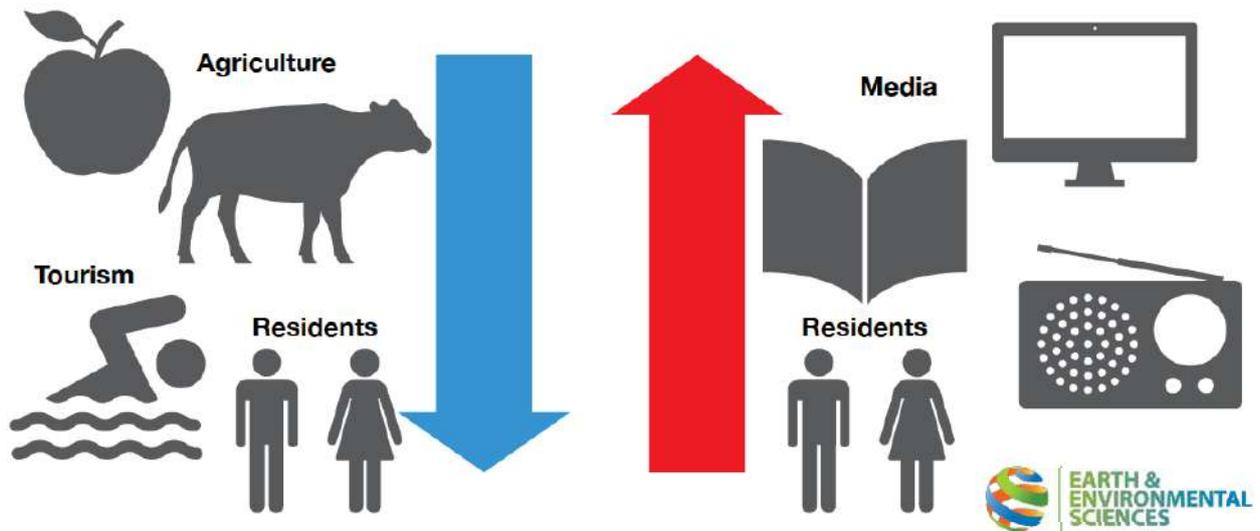
A herd of elk walks through a valley at the Rocky Flats National Wildlife Refuge on Sept. 25, 2015. Andy Cross, Denver Post file



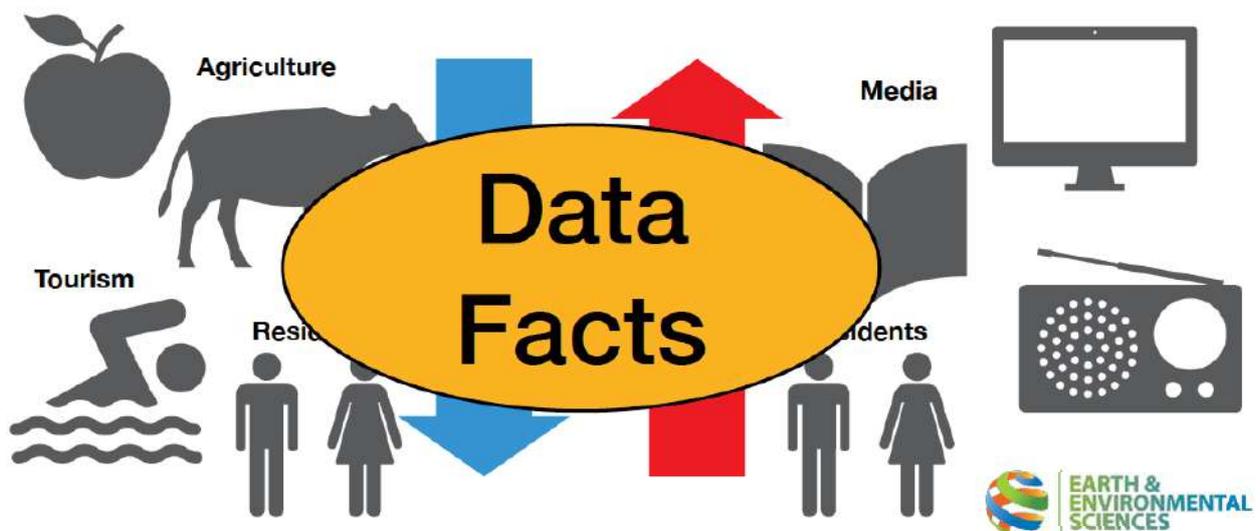
## Information Bias @ Environmental Events



# Information Bias @ Environmental Events



# Information Bias @ Environmental Events



## Two Topics

- Develop Long-term Monitoring Strategies for Nuclear Contaminated Sites
  - Fukushima region
  - Savannah River Site F-Area



# Fukushima Dai-ichi Nuclear Power Plant Accident

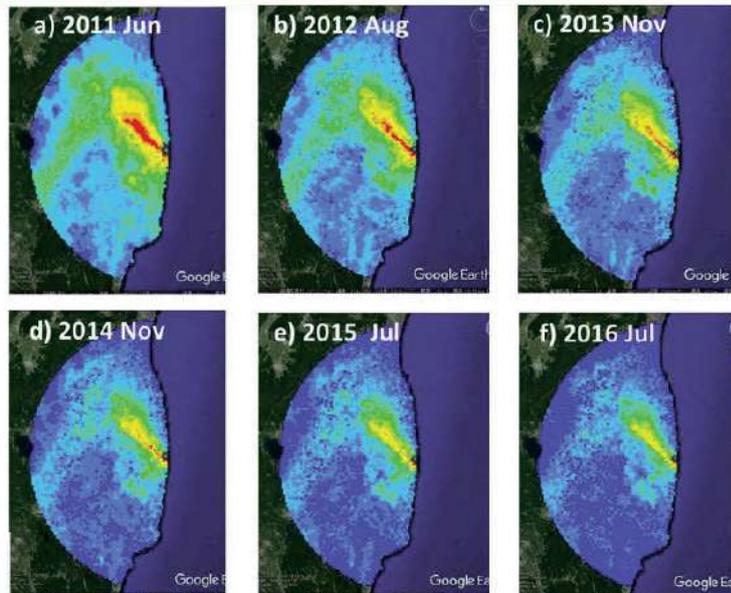
March 11, 2011



NYtimes.com



## Environmental Recovery



## Challenges in Socioeconomic Recovery

Mirror NEWS • POLITICS • SPORT • FOOTBALL • CELEBS • TV • MORE •

### Inside Fukushima ghost town that has laid abandoned since nuclear disaster forced everyone to leave

Thousands of people were forced to flee seven years ago after an earthquake and tsunami caused a nuclear meltdown in Japan

By Rachel Russell 15th JUN 2018



Click for Sound

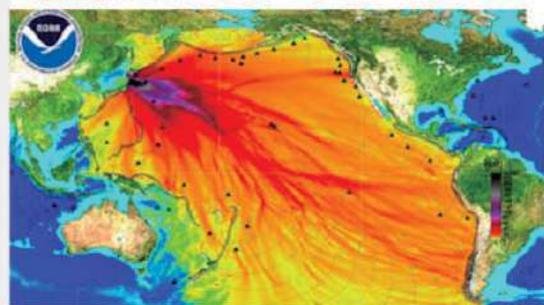
DISCOVER VIDEO PODCAST NEWSLETTERS

BIG THINK

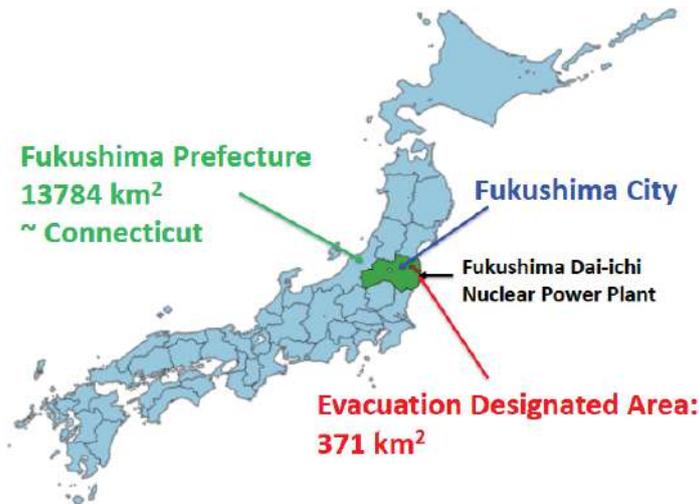
### Take hope: This Fukushima disaster map is a fake

The greatest danger to our planet is not pollution or climate change, but our own despair.

FRANK JACOBI 17 October 2018

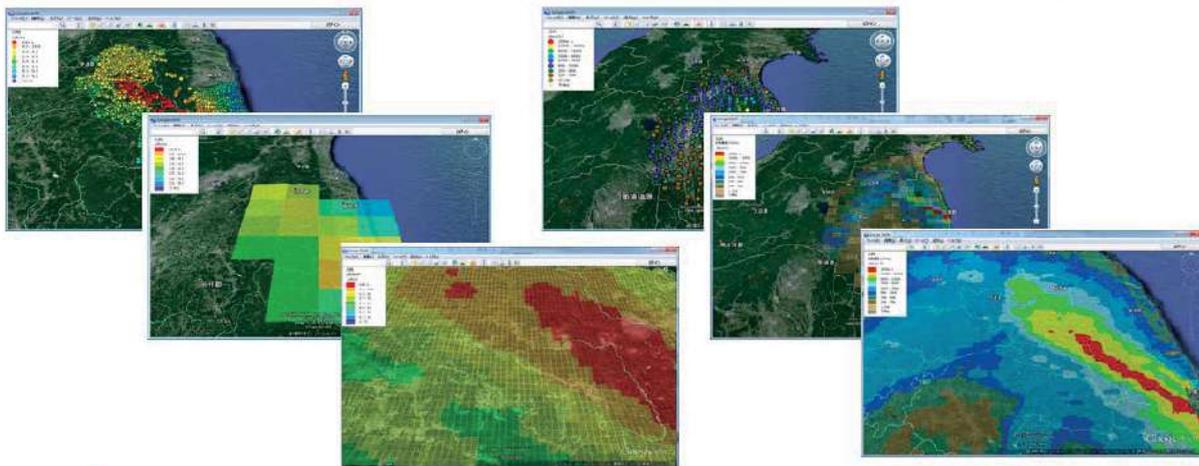


# What is Fukushima?



## Big Data: Multiscale Multitype Data

Database for Radioactive Substance Monitoring Data (Japan Atomic Energy Agency)



## Multiscale Radiation Data Integration

Walk Survey

Car Survey

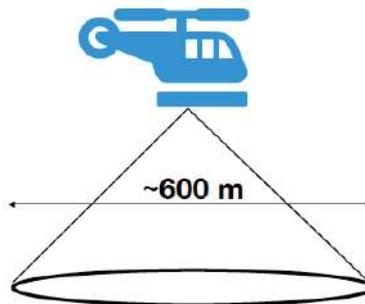
Airborne Survey

Axillary Data

~10 m

~100 m

~600 m



Most Accurate

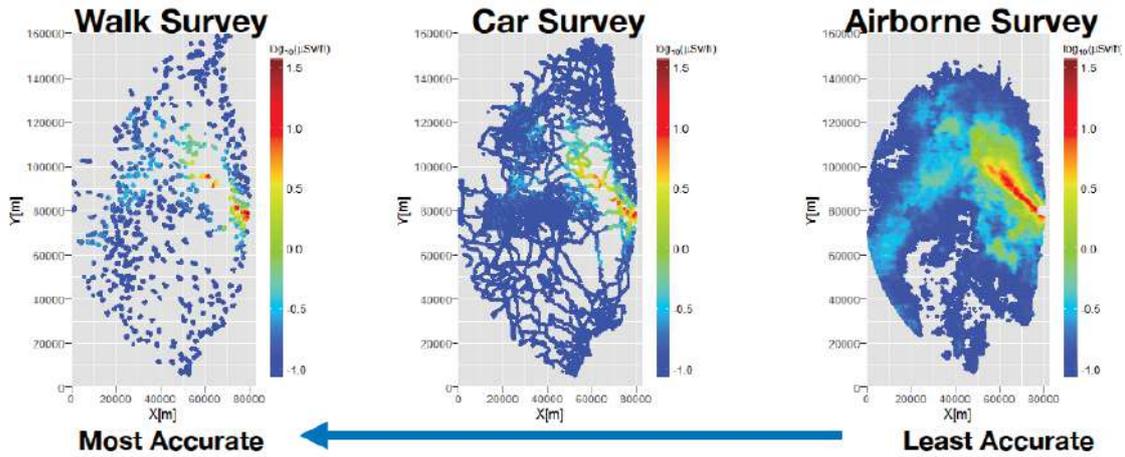
Least Accurate

Limited Coverage

Best Coverage



# Multiscale Radiation Data



Most Accurate

Least Accurate

Limited Coverage

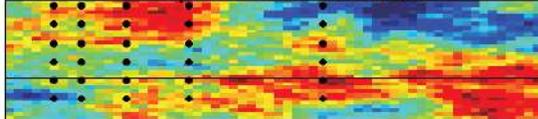
Best Coverage



# Bayesian Data Integration for Radiation Monitoring (BDIRM)

Synthetic Example

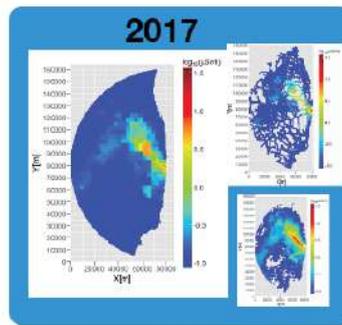
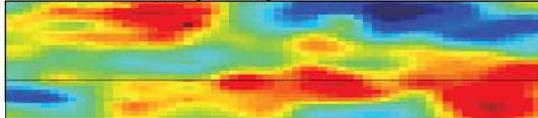
True field and point measurements



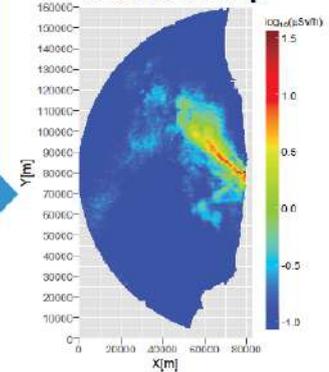
Coarse data (averaging; mimic airborne)



Estimated field (Mean)



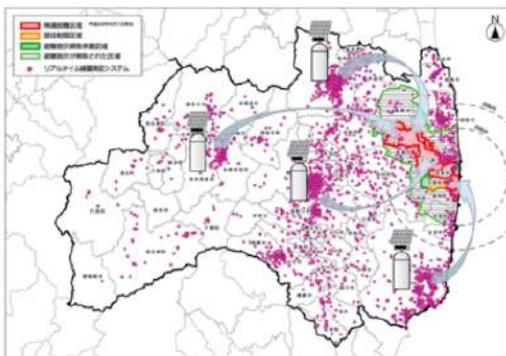
Integrated Radiation Map



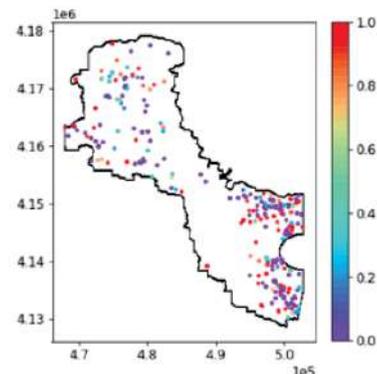
Adopted by Japan Nuclear Regulatory Agency  
Wainwright et al., 2017; 2018, Takemiya et al., 2019

# Monitoring Network Optimization

Emergency Responses → Long-term Monitoring



- Reduce # and cost
- Capture heterogeneity

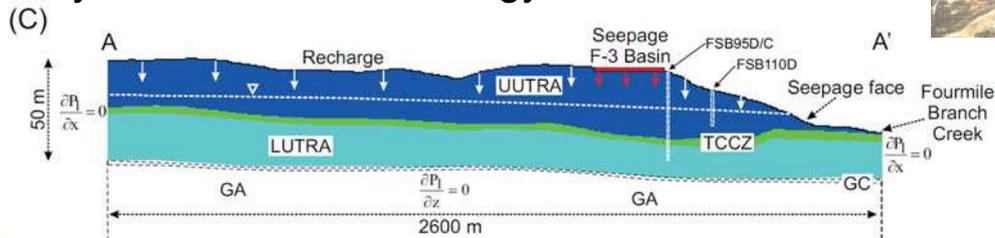


ML methods: Monitoring Importance Map



# Savannah River Site F-Area

- **Disposal activities:**
  - Disposal of low-level radioactive, acid waste solutions (1955–1989)
  - Acidic plume with radionuclides (pH 3–3.5, U,  $^{90}\text{Sr}$ ,  $^{129}\text{I}$ ,  $^{99}\text{Tc}$ ,  $^3\text{H}$ )
- Many datasets → Technology Test Bed

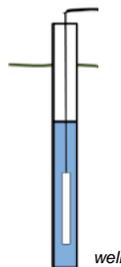


Bea et al., 2013



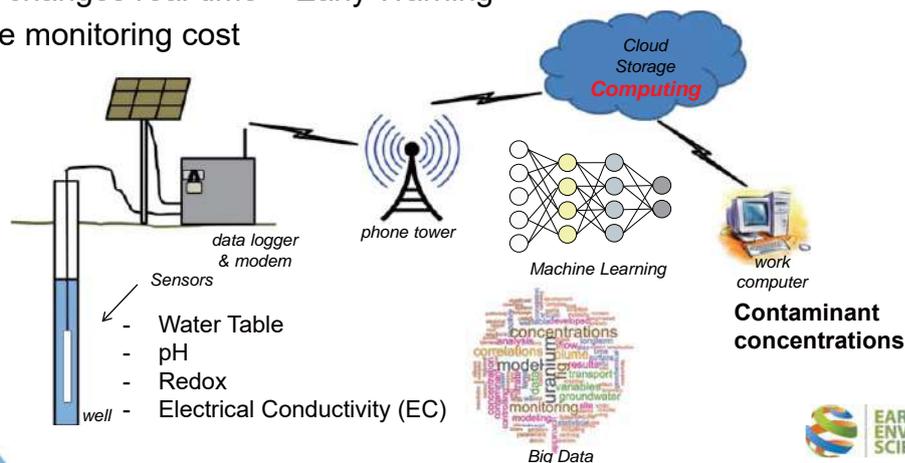
## Current Groundwater Monitoring

- **Groundwater Sampling → Mass Spec**
  - 10s – 100s of wells
  - Contamination issues (requires training, equipment)
  - Temporally sparse: every quarterly, annually → Miss anomalies
  - Compliance only (no analytics)

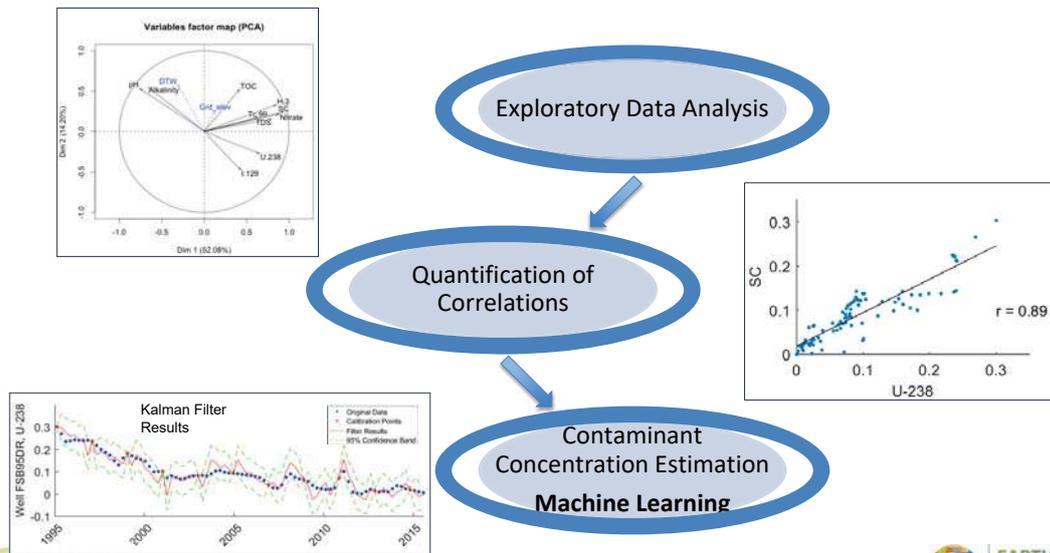


## New Paradigm of Long-Term Monitoring

- **Low-cost in situ sensors, wireless network, cloud computing**
  - Autonomous continuous monitoring
  - Detect changes real-time = Early Warning
  - Reduce monitoring cost



# Data Analytics Workflow



## Big Interest in ML x Environment

The collage includes:

- Environmental Science & Technology:** Article titled "In Situ Monitoring of Groundwater Contamination Using the Kalman Filter" by Franziska Schmidt et al.
- EurekAlert!**: "Algorithm provides early warning system for tracking groundwater contamination" by Berkeley Lab researchers.
- The University Network:** "New Algorithm Provides Real-Time Monitoring Of Groundwater Pollutants".
- Energy Live! News:** "Scientists develop new method to track groundwater pollutants in real-time".
- GCN:** "Machine learning improves contamination monitoring" by Matt Leonard.

## Reactive Transport Modeling: Amanzi



**Amanzi Driver**

Flow and transport  
 - Richards' equation  
 - Mimetic finite element method



Alquimia

Enforces a signature for geochemical subroutines

**Pflotran Engine**

Non-electrostatic Surface Complexation

**CrunchFlow**

Electrostatic Surface Complexation

Other



# SRS F-Area: Geochemical Model

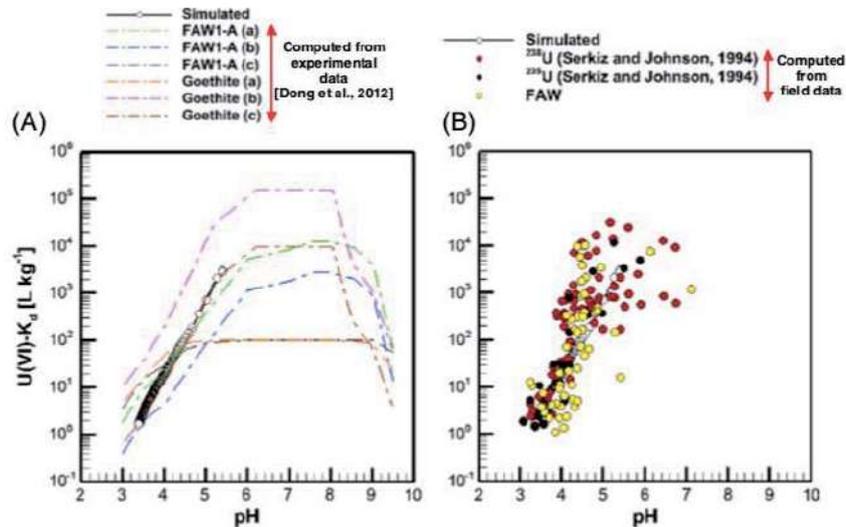
Reaction	log K (25 °C)
<b>Aqueous species<sup>1</sup></b>	
$(\text{UO}_2)_2(\text{OH})_2^{+2} \leftrightarrow 2\text{UO}_2^{+2} + 2\text{H}_2\text{O} - 2\text{H}^+$	5.62
$(\text{UO}_2)_2\text{CO}_3(\text{OH})_3^- \leftrightarrow 2\text{UO}_2^{+2} + 3\text{H}_2\text{O} + \text{HCO}_3^- - 4\text{H}^+$	11.18
$(\text{UO}_2)_2\text{OH}^{+3} \leftrightarrow 2\text{UO}_2^{+2} + \text{H}_2\text{O} - \text{H}^+$	2.7
$(\text{UO}_2)_3(\text{CO}_3)_6^{+6} \leftrightarrow 3\text{UO}_2^{+2} + 6\text{HCO}_3^- - 6\text{H}^+$	7.97
$(\text{UO}_2)_3(\text{OH})_4^{+2} \leftrightarrow 3\text{UO}_2^{+2} + 4\text{H}_2\text{O} - 4\text{H}^+$	11.9
$\text{UO}_2(\text{OH})_2^{+2} \leftrightarrow \text{UO}_2^{+2} + 2\text{H}_2\text{O} - 2\text{H}^+$	32.4
$(\text{UO}_2)_3(\text{OH})_5^{+1} \leftrightarrow 3\text{UO}_2^{+2} + 5\text{H}_2\text{O} - 5\text{H}^+$	15.55
$(\text{UO}_2)_3(\text{OH})_7 \leftrightarrow 3\text{UO}_2^{+2} + 7\text{H}_2\text{O} - 7\text{H}^+$	32.2
$(\text{UO}_2)_3\text{O}(\text{OH})_2(\text{HCO}_3)^+ \leftrightarrow 3\text{UO}_2^{+2} + 3\text{H}_2\text{O} + \text{HCO}_3^-$	9.68
$(\text{UO}_2)_4(\text{OH})_7 \leftrightarrow 4\text{UO}_2^{+2} + 7\text{H}_2\text{O} - 7\text{H}^+$	21.9
$\text{UO}_2\text{NO}_3^+ \leftrightarrow \text{UO}_2^{+2} + \text{NO}_3^-$	-0.3
$\text{UO}_2(\text{OH})^+ \leftrightarrow \text{UO}_2^{+2} + \text{H}_2\text{O}$	5.25
$\text{UO}_2(\text{OH})_2(\text{aq}) \leftrightarrow \text{UO}_2^{+2} + 2\text{H}_2\text{O} - 2\text{H}^+$	12.15
$\text{UO}_2(\text{OH})_3^- \leftrightarrow \text{UO}_2^{+2} + 3\text{H}_2\text{O} - 3\text{H}^+$	20.25
$\text{UO}_2\text{CO}_3(\text{aq}) \leftrightarrow \text{UO}_2^{+2} + \text{HCO}_3^- - \text{H}^+$	0.39
$\text{UO}_2(\text{CO}_3)_2^{+2} \leftrightarrow \text{UO}_2^{+2} + 2\text{HCO}_3^- - 2\text{H}^+$	4.05
$\text{UO}_2(\text{CO}_3)_3^{+4} \leftrightarrow \text{UO}_2^{+2} + 3\text{HCO}_3^- - 3\text{H}^+$	9.14
$\text{CaUO}_2(\text{CO}_3)_2^{+2} \leftrightarrow \text{Ca}^{+2} + \text{UO}_2^{+2} + 3\text{HCO}_3^- - 3\text{H}^+$	3.8
$\text{Ca}_2\text{UO}_2(\text{CO}_3)_3(\text{aq}) \leftrightarrow 2\text{Ca}^{+2} + \text{UO}_2^{+2} + 3\text{HCO}_3^- - 3\text{H}^+$	0.29
$\text{MgUO}_2(\text{CO}_3)_3^{+2} \leftrightarrow \text{Mg}^{+2} + \text{UO}_2^{+2} + 3\text{HCO}_3^- - 3\text{H}^+$	5.19
$\text{UO}_2\text{SiO}(\text{OH})_2^+ \leftrightarrow \text{SiO}_2(\text{aq}) + \text{UO}_2^{+2} + 2\text{H}_2\text{O} - \text{H}^+$	2.48

Surface and exchange species <sup>2</sup>	log K
$(> \text{k-OH})_2\text{UO}_2^{+2} \leftrightarrow 2 > \text{k-OH}^{-0.5} + \text{UO}_2^{+2}$	-5.3
$(> \text{k-OH})_2\text{UO}_2\text{CO}_3^- \leftrightarrow 2 > \text{k-OH}^{-0.5} + \text{UO}_2^{+2} + \text{HCO}_3^- - \text{H}^+$	-6.2
$> \text{k-OH}_2^{+0.5} \leftrightarrow > \text{k-OH}^{-0.5} + \text{H}^+$	-4.9
$> \text{k-OHNa}^{+0.5} \leftrightarrow > \text{k-OH}^{-0.5} + \text{Na}^+$	2.1
$> \text{k-OH}_2\text{NO}_3^{-0.5} \leftrightarrow > \text{k-OH}^{-0.5} + \text{H}^+ + \text{NO}_3^-$	-4.9
$> \text{k}_2\text{UO}_2 \leftrightarrow 2 > \text{k}^- + \text{UO}_2^{+2}$	-7.1
$> \text{kNa} \leftrightarrow > \text{k}^- + \text{Na}^+$	-2.9
$> \text{kH} \leftrightarrow > \text{k}^- + \text{H}^+$	-4.5
$> \text{k}_2\text{Ca} \leftrightarrow 2 > \text{k}^- + \text{Ca}^{+2}$	-6.8
$> \text{k}_3\text{Al} \leftrightarrow 3 > \text{k}^- + \text{Al}^{+3}$	-8
$(> \text{Fe-OH})_2\text{UO}_2^{+2} \leftrightarrow 2 > \text{Fe-OH}^{-0.5} + \text{UO}_2^{+2}$	-14.11
$(> \text{Fe-OH})_2\text{UO}_2\text{CO}_3^- \leftrightarrow 2 > \text{Fe-OH}^{-0.5} + \text{UO}_2^{+2} + \text{HCO}_3^- - \text{H}^+$	-4.35
$> \text{Fe-OH}_2^{+0.5} \leftrightarrow > \text{Fe-OH}^{-0.5} + \text{H}^+$	-9.18
$(> \text{Fe-OH})_2\text{CO}_3^- \leftrightarrow 2 > \text{Fe-OH}^{-0.5} + \text{H}^+ + \text{HCO}_3^- - 2\text{H}_2\text{O}$	-12.23
$> \text{Fe-OCO}_2\text{Na}^{-0.5} \leftrightarrow > \text{Fe-OH}^{-0.5} + \text{Na}^+ + \text{HCO}_3^- - \text{H}_2\text{O}$	-3.28
$> \text{qz-OH}_2^+ \leftrightarrow > \text{qz-OH} + \text{H}^+$	1.1 <sup>3</sup>
$> \text{qz-O}^- \leftrightarrow > \text{qz-OH} - \text{H}^+$	8.1 <sup>3</sup>
$> \text{qz-ONa} \leftrightarrow > \text{qz-OH} - \text{H}^+ + \text{Na}^+$	6.8 <sup>4</sup>

Arora et al, 2017



# SRS F-Area: Surface Complexation Model

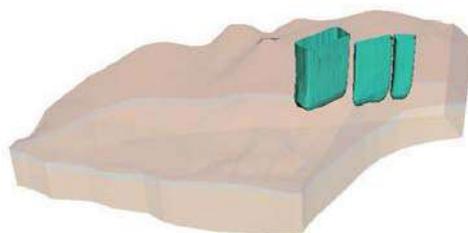


Dong et al., 2012; Bea et al, 2013



# 3D Uranium Plume Evolution

DB: plot\_data.VisIt.xmf  
Time: 1956



**Uranium Plume:**  
**Residual contaminants**

- Under the basins
- Within Tan Clay

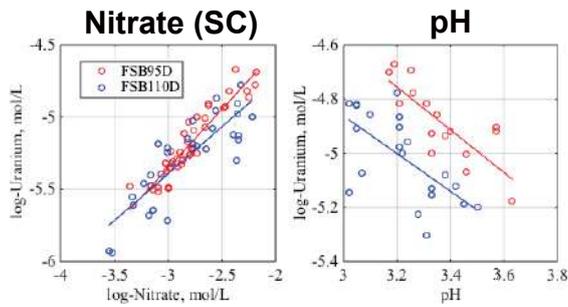


User: US9F  
Sun Apr 14 10:34:15 2019

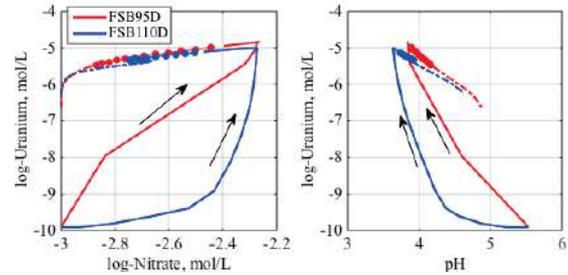


# In situ Variables vs Contaminant Concentrations

Measured

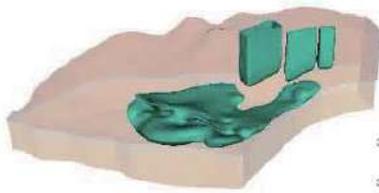


Simulated

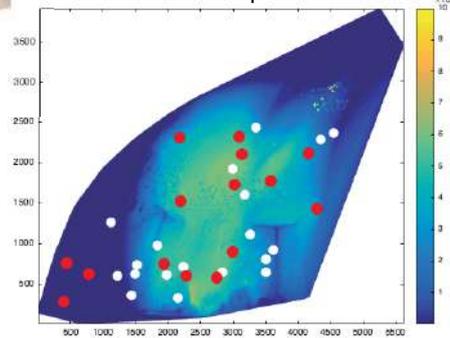


## Monitoring Optimization

3D Simulation Result



Plume Map

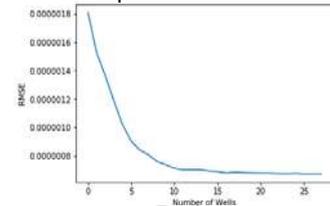


- Reduce # wells effectively
- Capture the spatial heterogeneity of the plume with minimal # wells

Algorithm

- Gaussian Process Models
- Greedy Algorithm

Interpolation Error



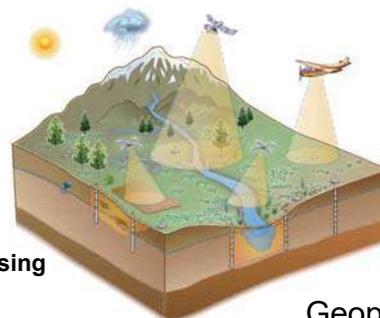
## Long-term Monitoring: Next Step



ML/AI

Sensing

Modeling



Geophysics  
Fiber optics

- Remote sensing
- Wetland
  - Surface Barrier
  - ET



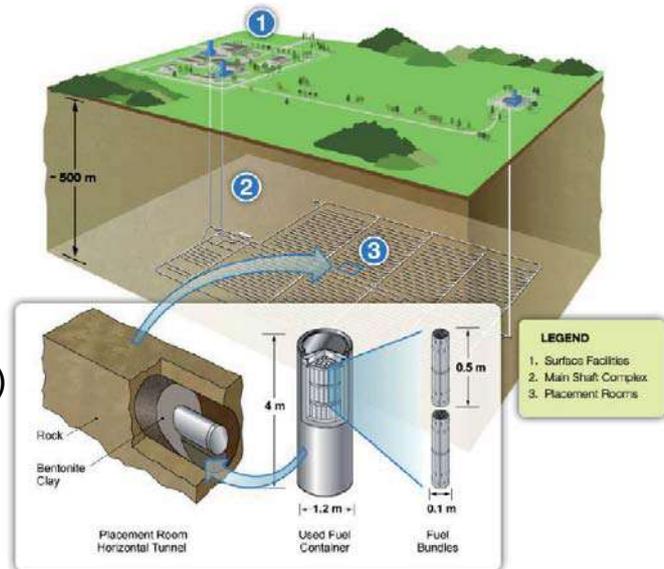
# Nuclear Waste Disposal Site

## Engineered barrier system:

- Canister
- Buffer (Clay/Bentonite)

## Natural barrier system:

- Deep subsurface
- Host rock (low permeability rock)



## Summary

- **What can we learn from existing nuclear contamination for nuclear waste?**
  - Environmental mobility of radionuclides is critical
  - Engineering solutions for isolation could be possible
    - Nuclear sectors: more awareness, tighter regulations
  - Net environmental impact or broader environmental perspective is needed
    - Rads vs others; contaminant removal vs side effects
  - Long-term monitoring is important for public assurance
- **New paradigm for long-term monitoring based on new sensors/ML/AI**
  - Multiscale data integration and monitoring placement optimization for long-term monitoring: → B-DRAM and machine learning
  - Real-time monitoring of groundwater contamination
  - Public assurance, early warning, cost reduction



Thank You!

## Contact

Haruko Wainwright

[HMWainwright@LBL.gov](mailto:HMWainwright@LBL.gov)

\* Summer internship positions and exchange programs at LBNL

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DOE Office of Environmental Management

DOE Office of Science

Japan Atomic Energy Agency

