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# Developing Long-Term Monitoring Strategies for Radiological Contamination Through Modeling & Machine Learning

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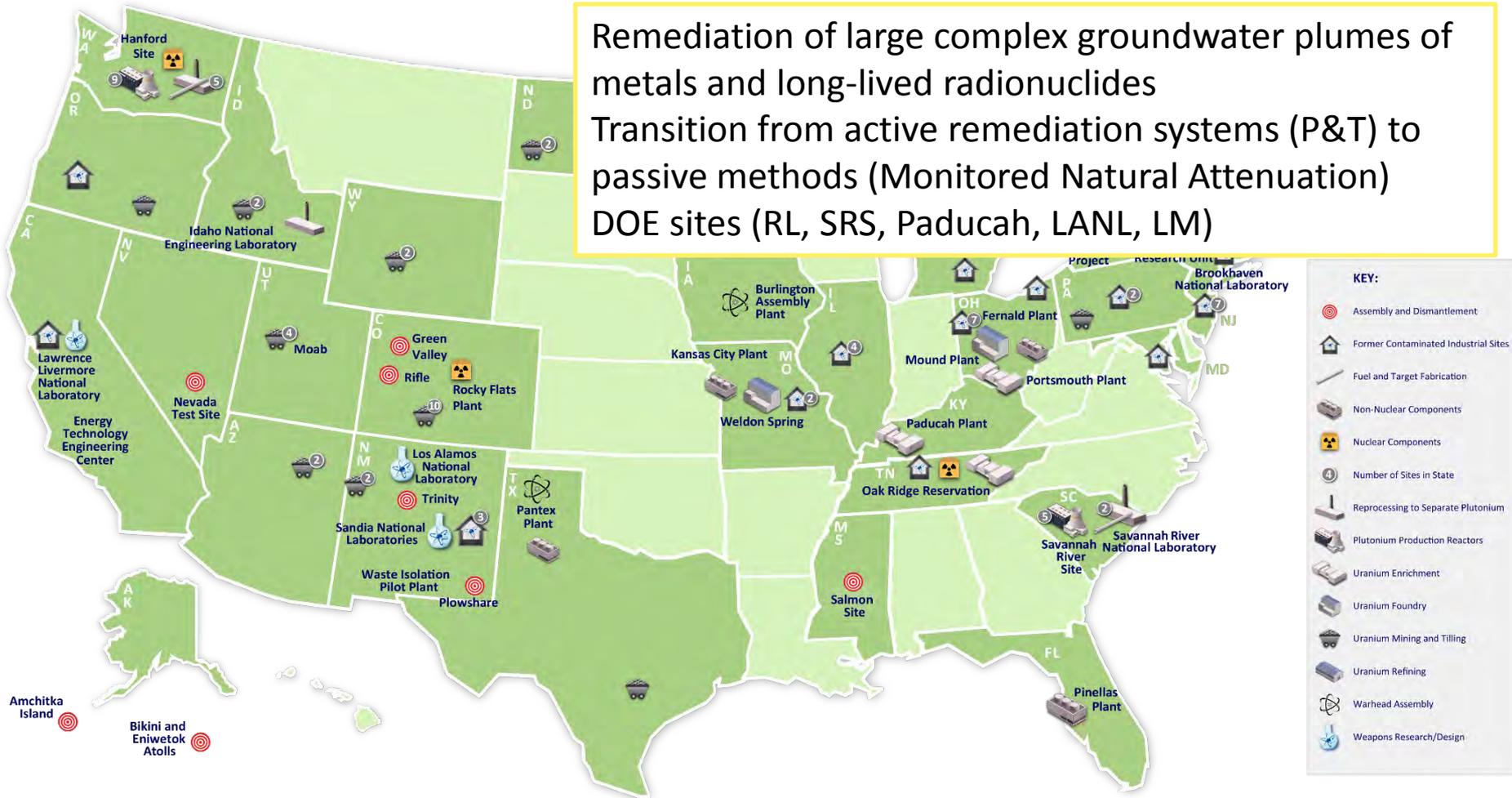
*Presentation to Federal Remediation Technology Roundtable*

*May 22, 2019*



# The DOE - EM Challenge

Remediation of large complex groundwater plumes of metals and long-lived radionuclides  
 Transition from active remediation systems (P&T) to passive methods (Monitored Natural Attenuation)  
 DOE sites (RL, SRS, Paducah, LANL, LM)



107 major sites (1995) → 16 sites (2016)

# Need for a New Approach

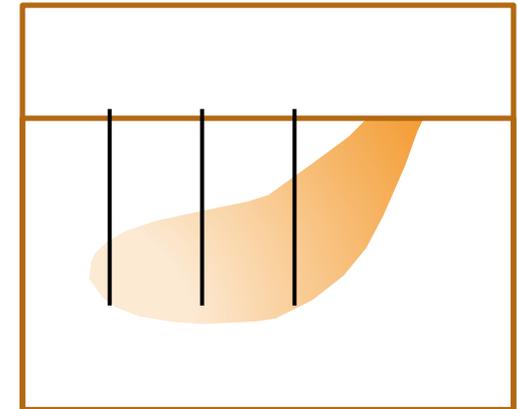
## Current LTM approaches developed for monitoring active remediation sites

- **Pump-and-treat, excavation, etc.**
  - Contaminant removed from subsurface until no future hazard is possible
  - LTM to make sure sufficient mass removed or destroyed

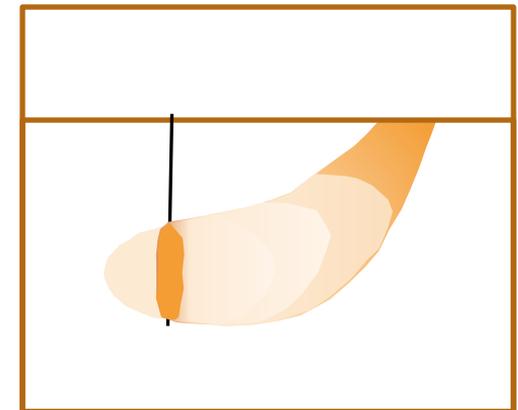
## Current LTM approaches not efficient for sites at which attenuation-based remedies deployed

- **Measurements are not predictive of future remedy failure**
- **Consist of expensive measurements that provide minimal information**
  - Contaminant concentrations will be at or below MCLs until conditions change
- **New approach needed**

Pump-and Treat

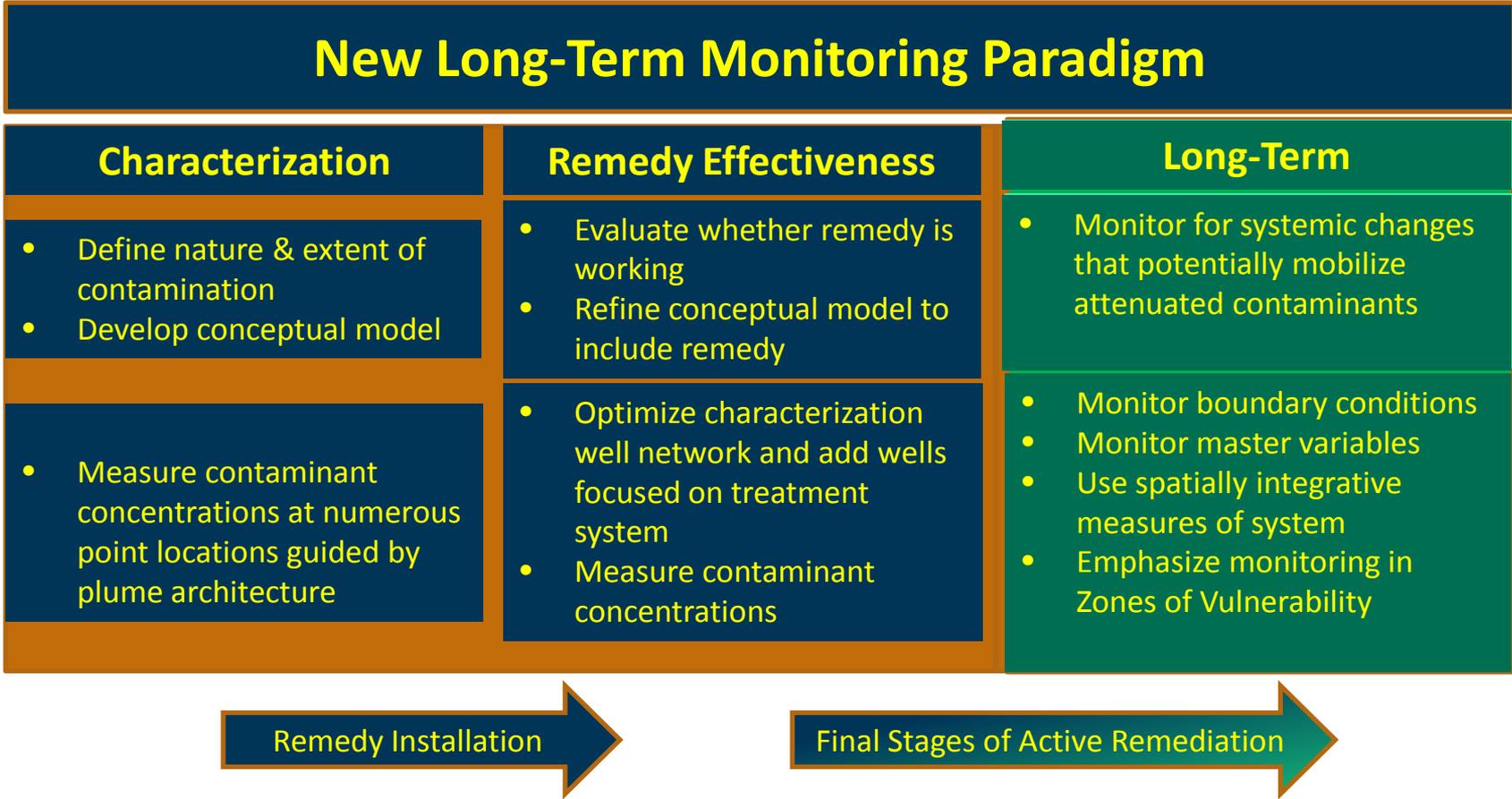


Attenuation-Based



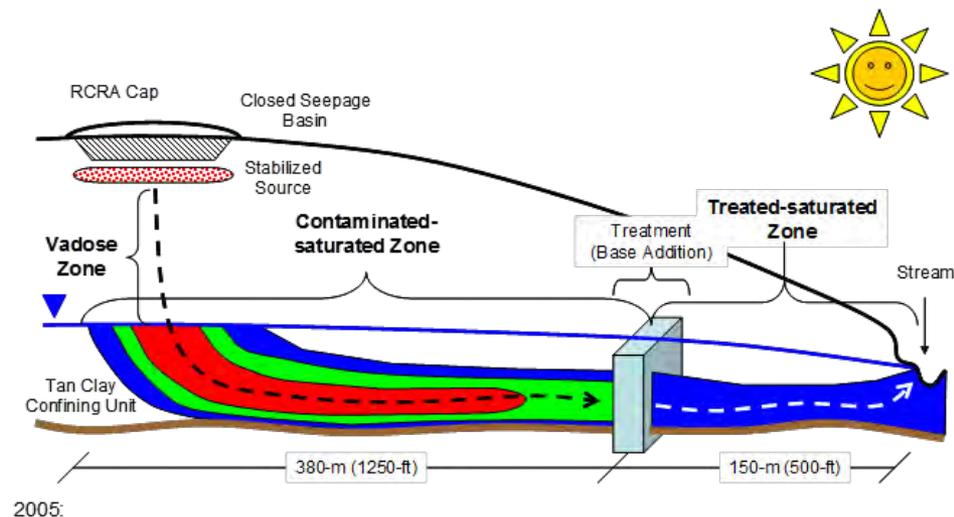
# New Paradigm:

## Long-Term Monitoring as a Separate Monitoring Stage



## How do you test a new paradigm for remediation and long term monitoring?

- ✓ Use historical monitoring data from a waste site with a long history and documented changes to boundary conditions
- ✓ Develop a virtual test bed using 3D reactive flow and transport model

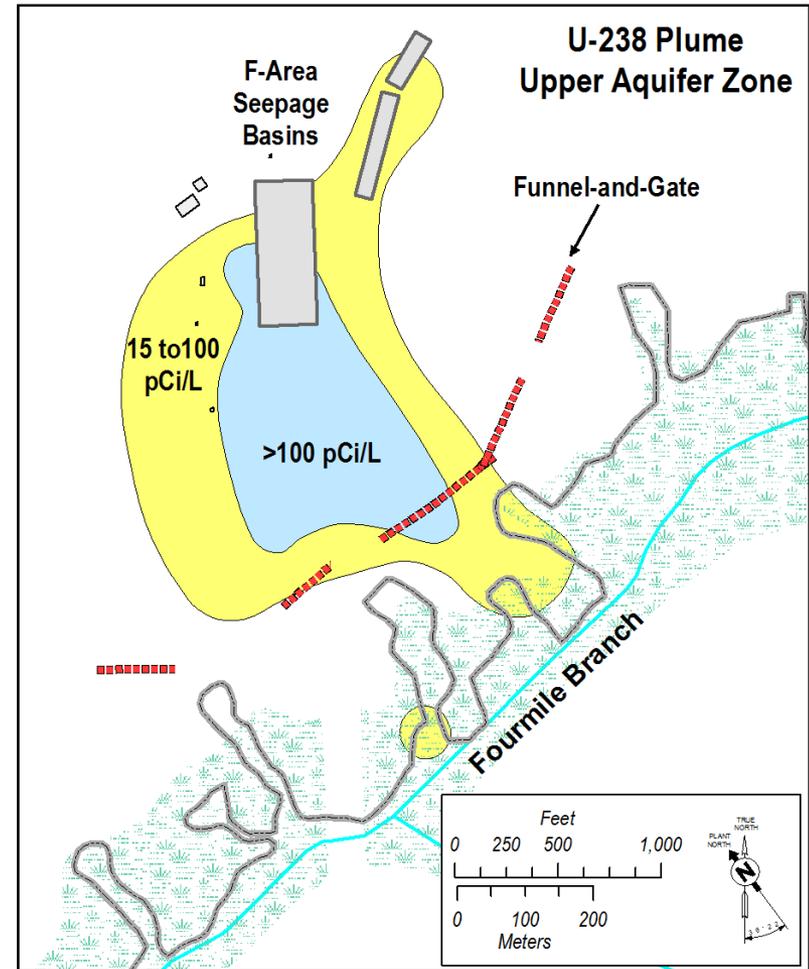


# F-Area Seepage Basins

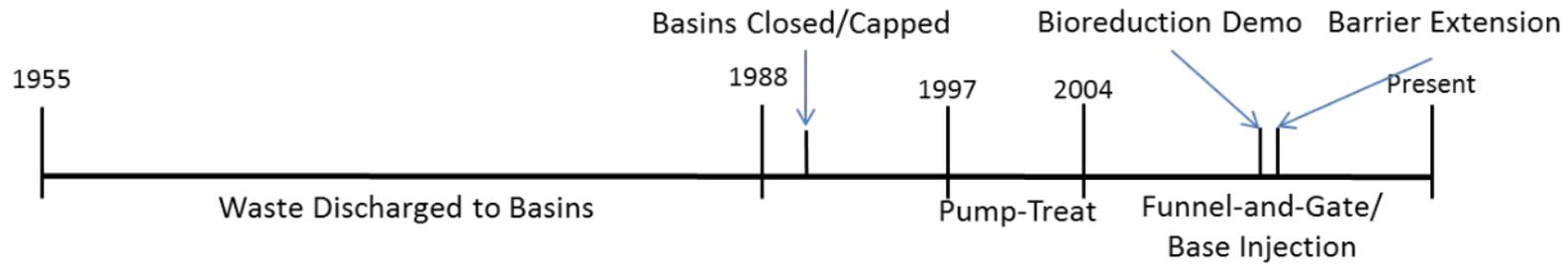
Groundwater plume resulted from 30 years of discharge of low activity wastewater from an industrial nuclear facility. Major contaminants of concern are uranium, tritium, strontium-90 and iodine-129.

Contaminated groundwater crops out at surface in wetlands and Fourmile Branch

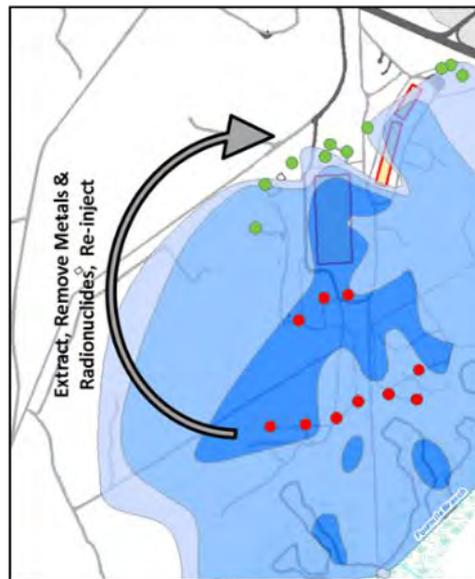
Remediation has focused on limiting migration of contaminants and reducing concentrations in surface water



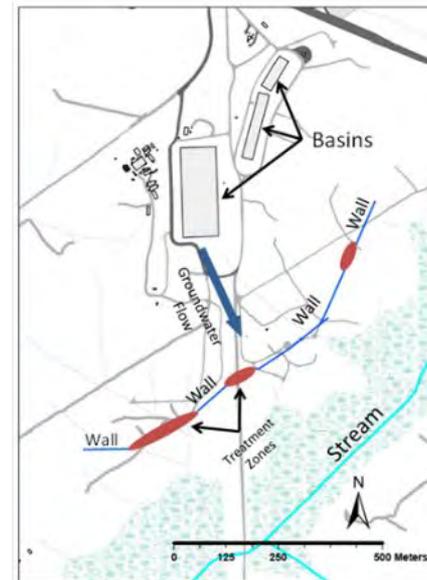
# Remediation History



Basin Operation



Pump/Treat/Re-inject



Funnel-Gate/Base Injection



# Comprehensive Attenuation-Based Remedy

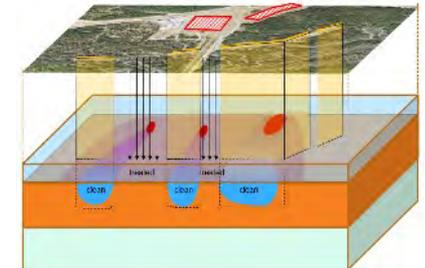
## Basin Capping/Closure

- Contaminants remain in basin soils
- Prevents infiltration that would drive contaminants deeper



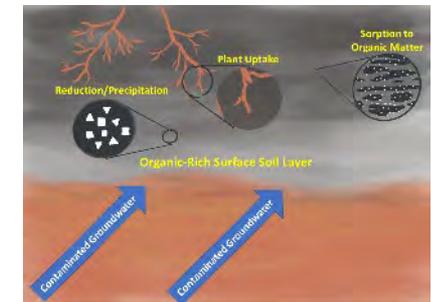
## Subsurface Barrier w/Treatment Zones

- U and Sr-90 attenuated by raising pH
- I-129 attenuated by precipitation of AgI



## Wetlands

- Contaminants attenuated by processes in organic-rich soils
- Sorption to organic matter, plant uptake, reduction/precipitation for some contaminants



# F-Area Virtual Testbed

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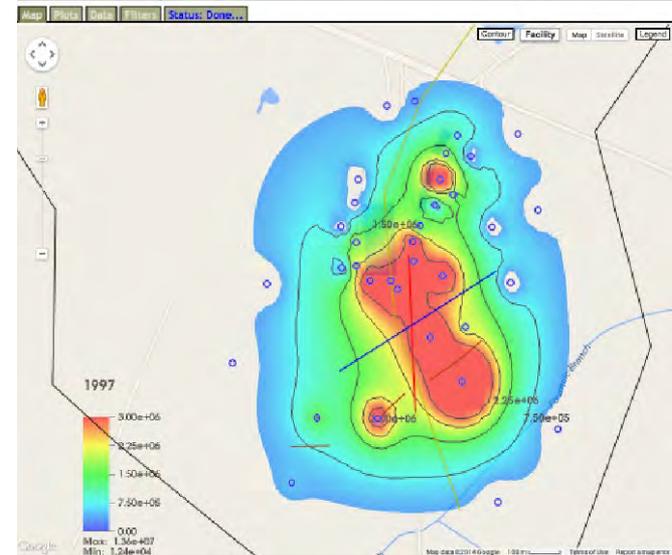
- **Field Test Bed**

- Historical datasets

- Advanced statistical analysis

- Data mining

- Machine learning

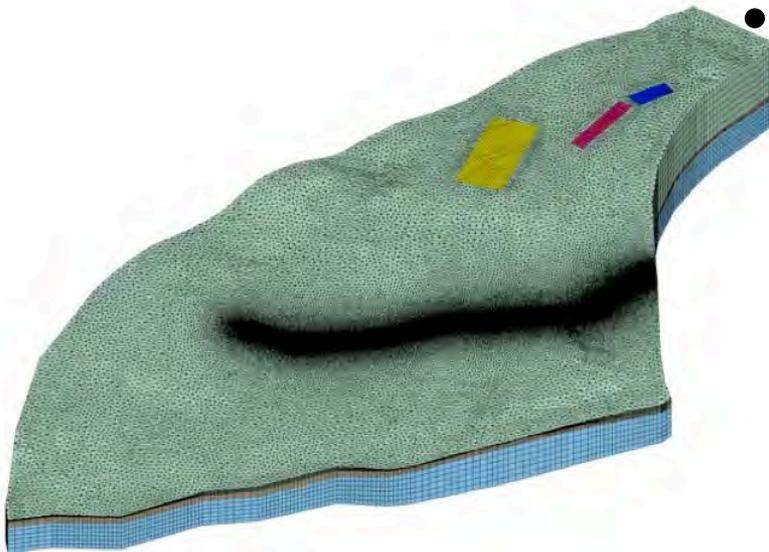


- **Virtual Test Bed**

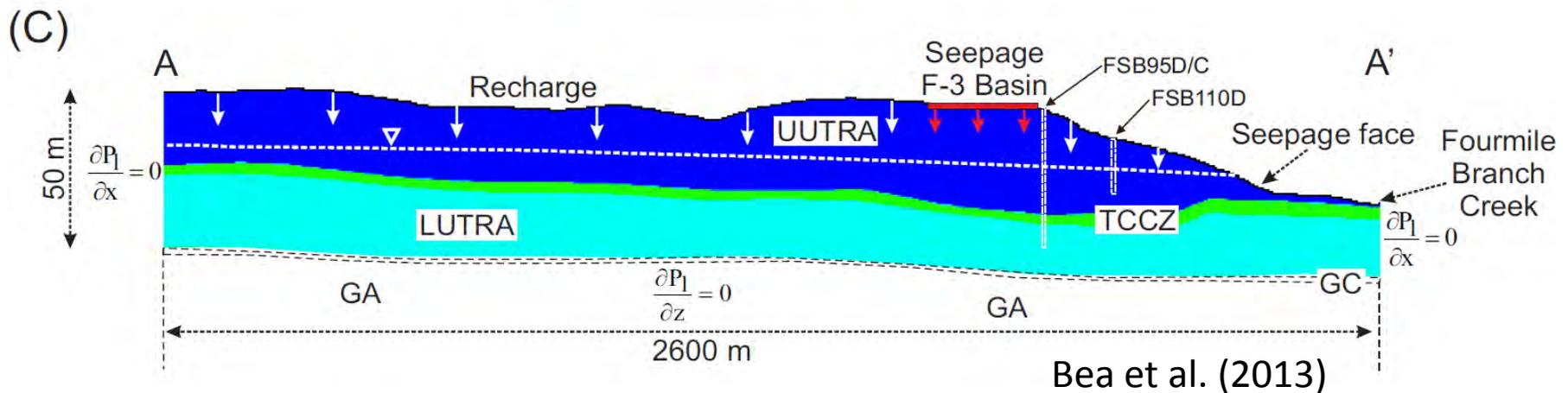
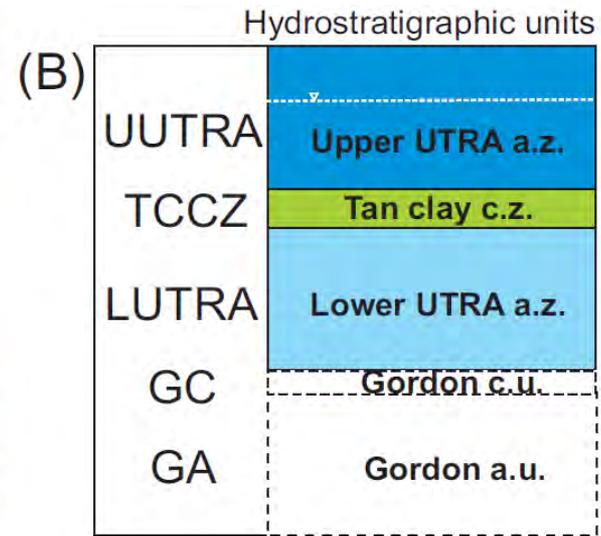
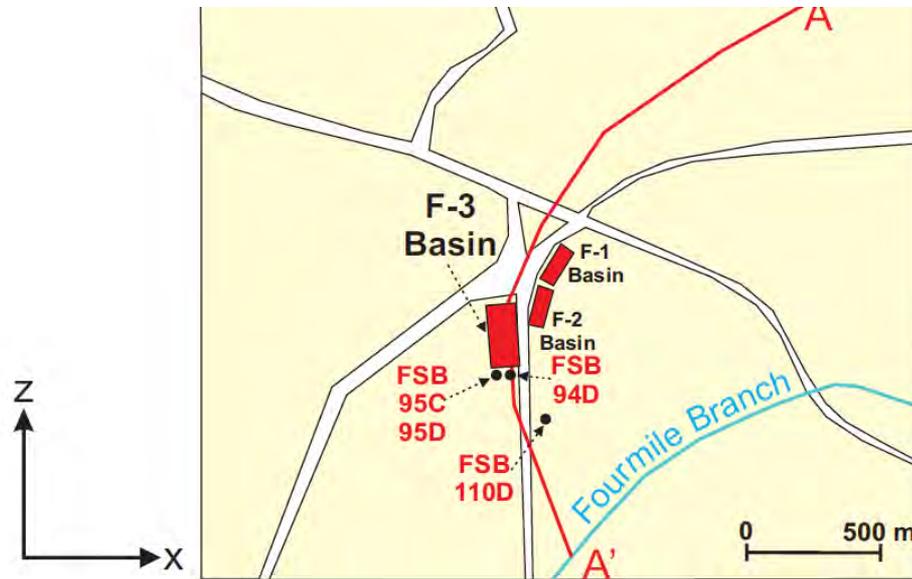
- 3D reactive transport simulations

- Super computers

- System understanding, long-term predictions, testing different methods

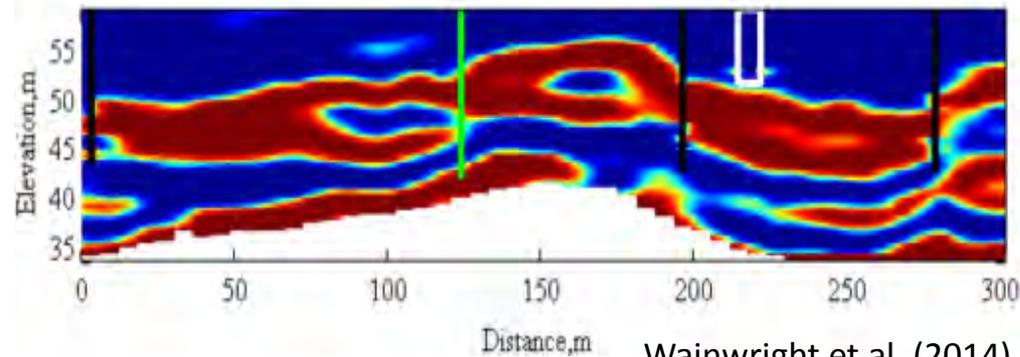
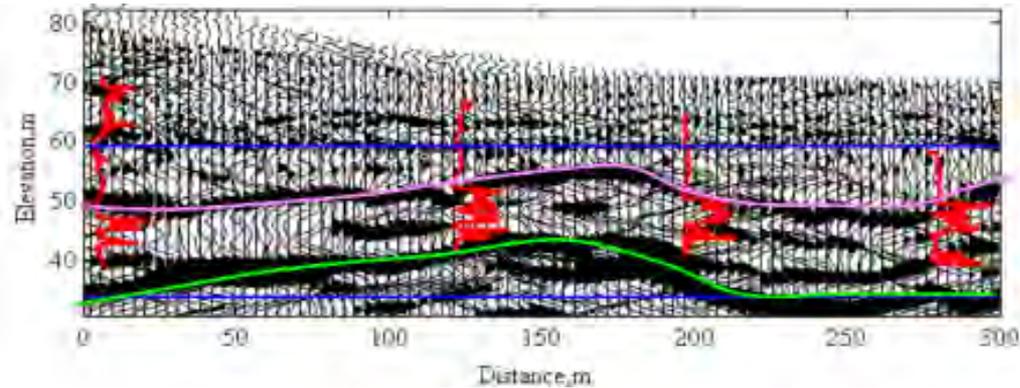


# Flow/Transport Model

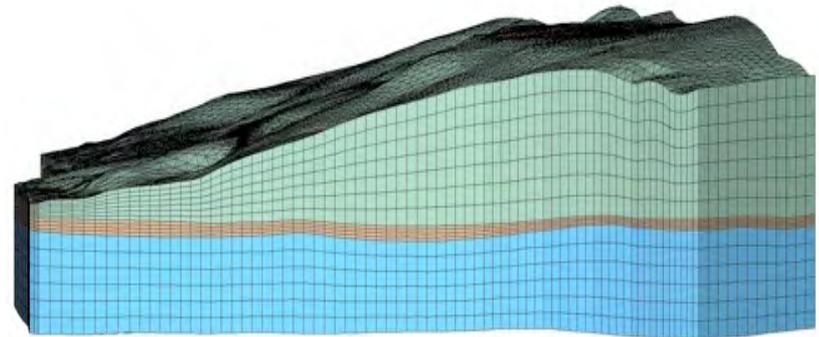
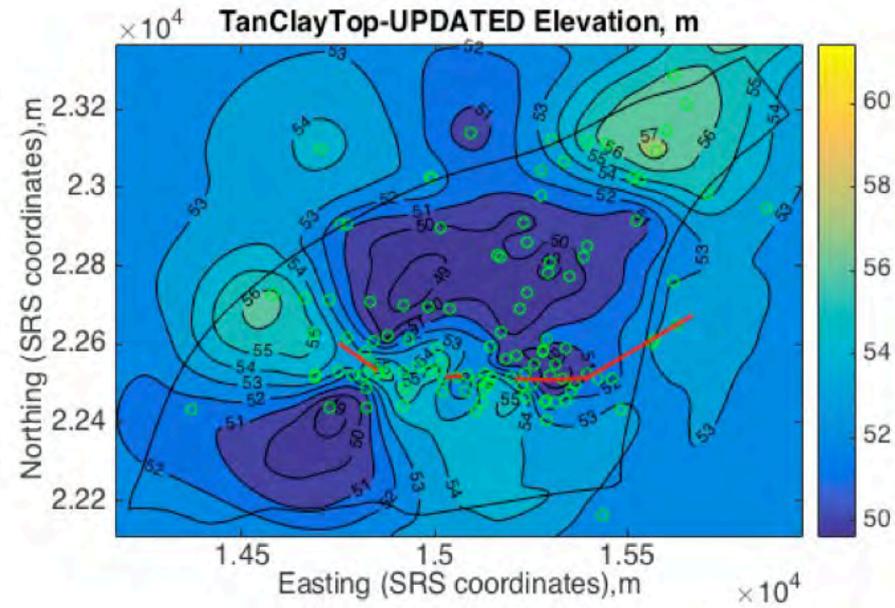


# Seismic Layers

## Surface Seismic Method

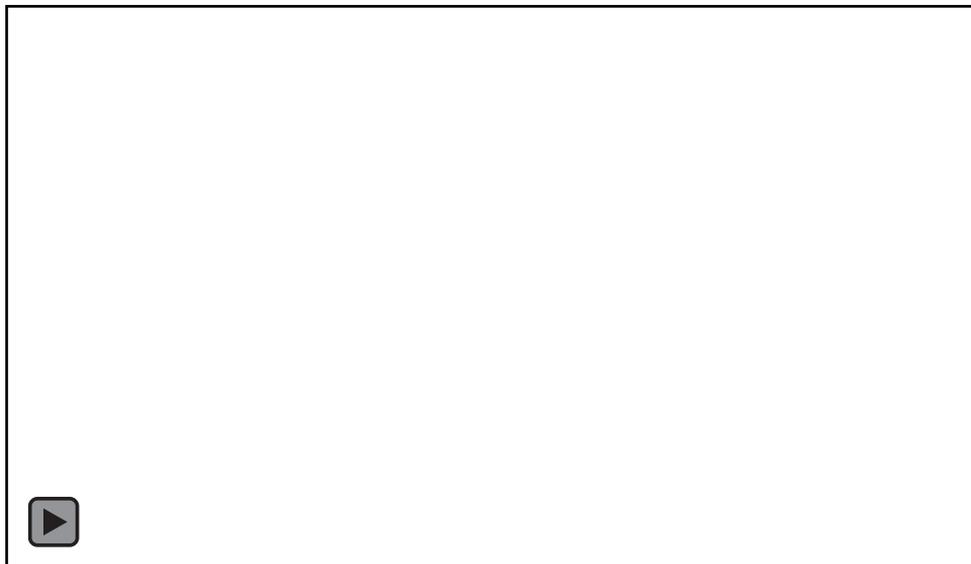


Wainwright et al. (2014)

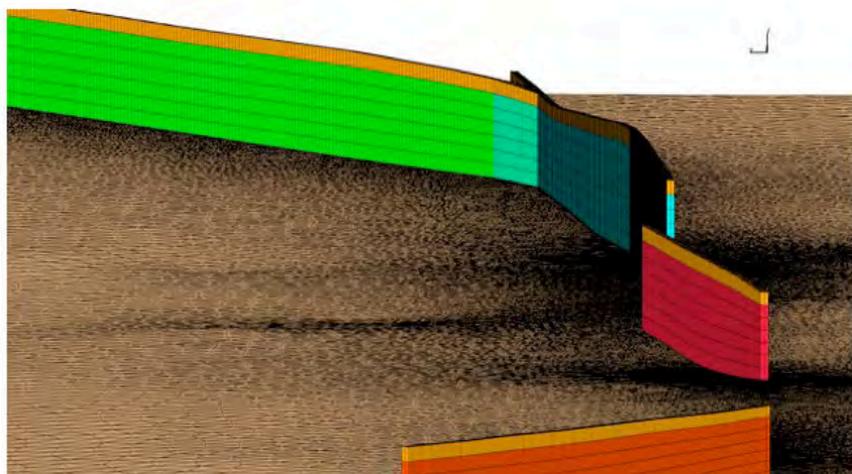
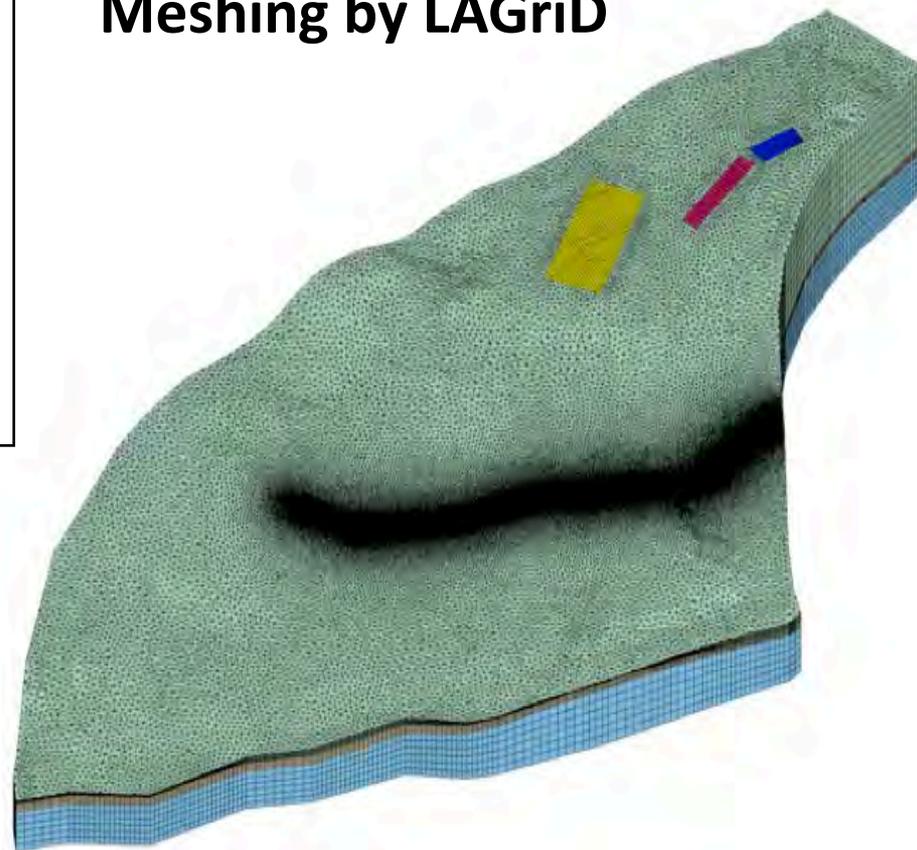


# 3D Mesh for Artificial Barriers

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**Meshing by LAGriD**



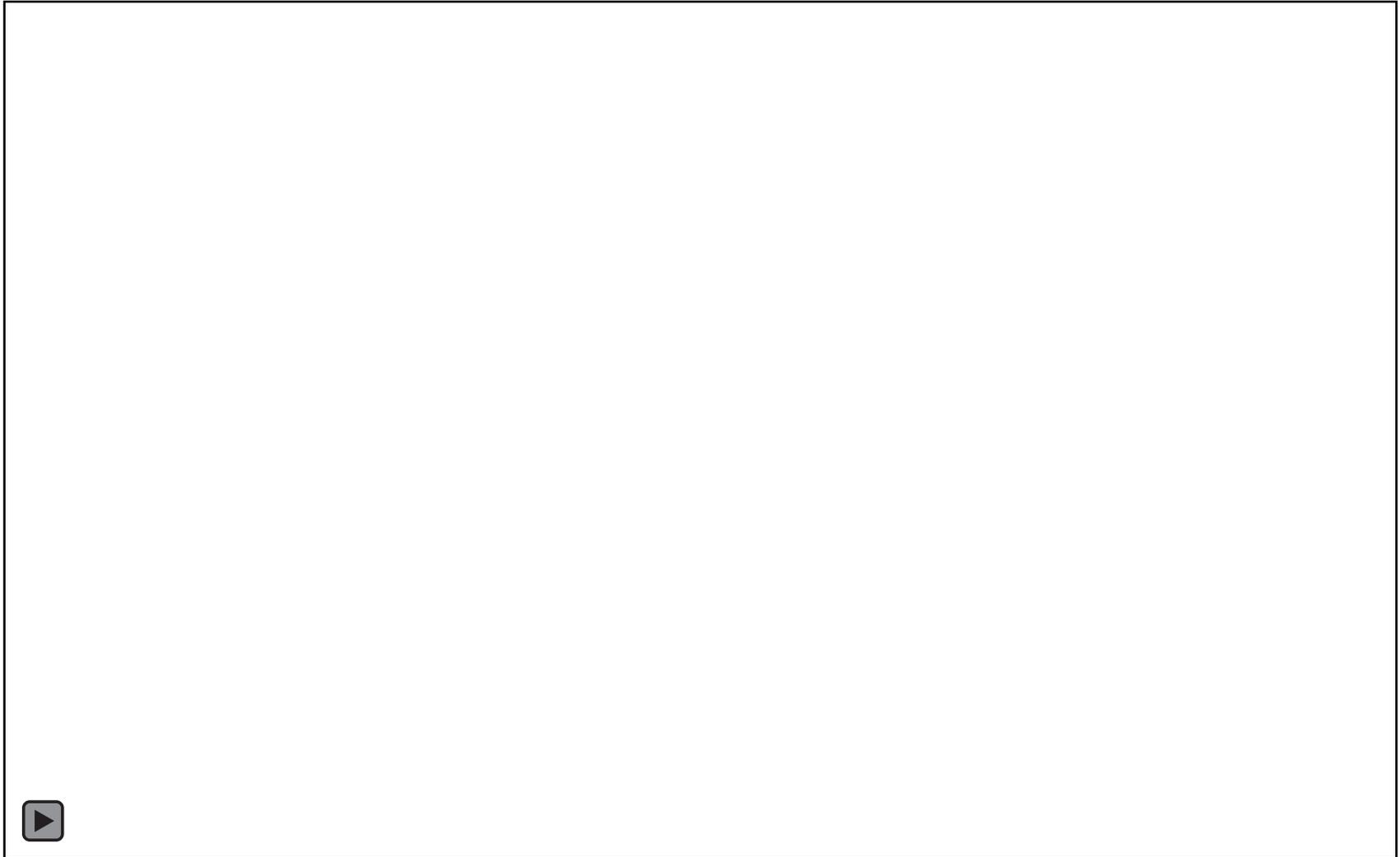
# Geochemistry Development

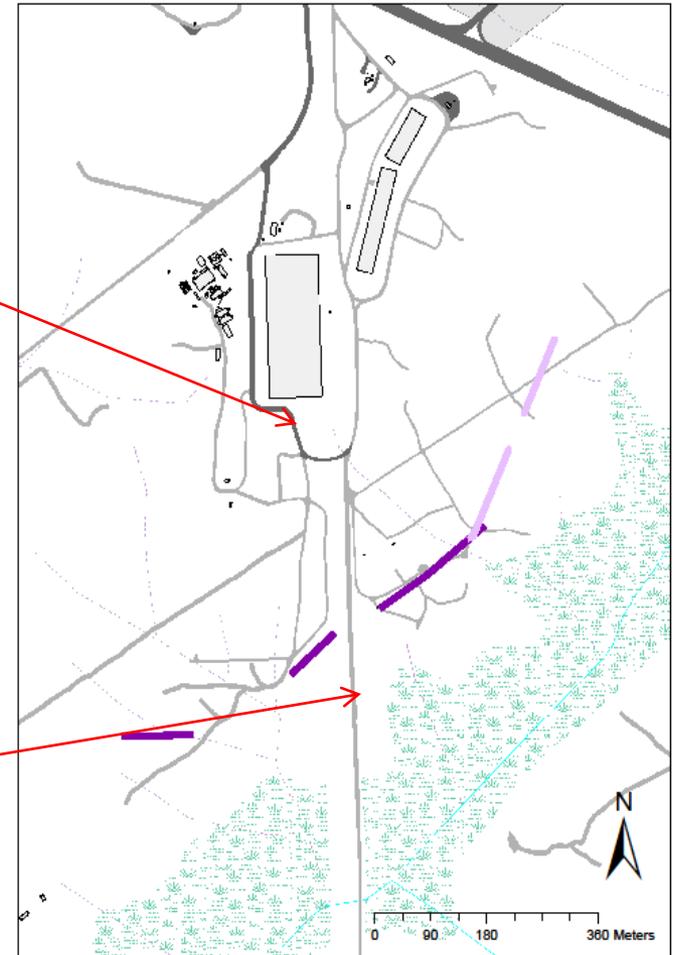
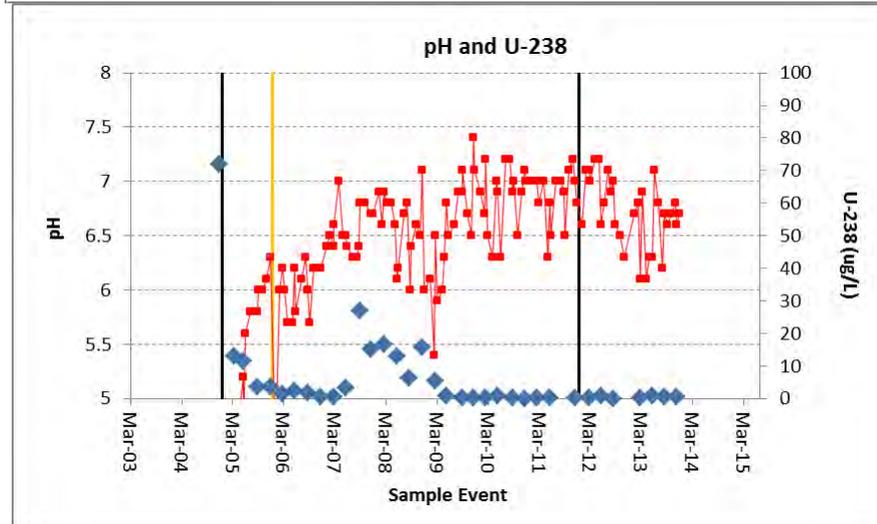
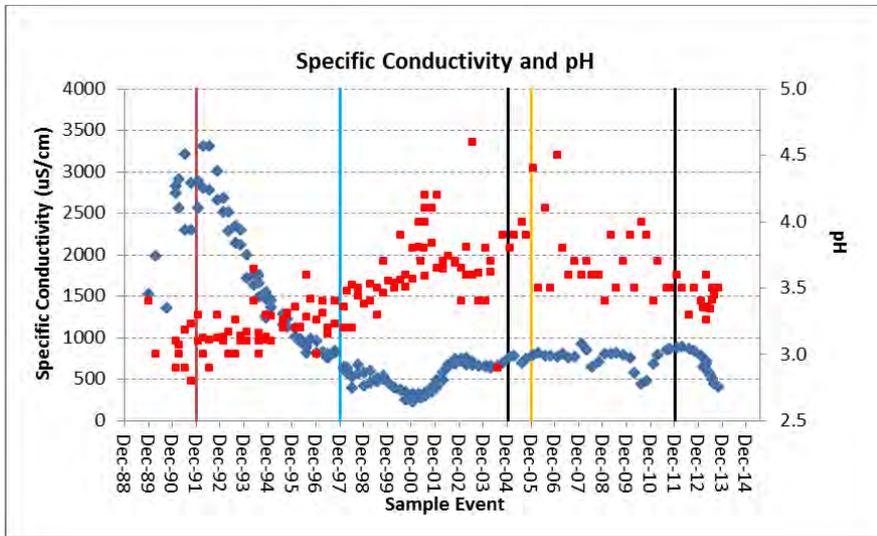
- Complex geochemistry
  - pH Dependent
  - Aqueous complexation
  - Surface complexation
  - Mineral dissolution/precipitation
  - Cation exchange
  - Decay

Surface complexation, cation exchange		$\log_{10} K$ (25° C)
<sup>(1)</sup> Equilibrium Surface Complexation		
$(>SO)UO_2^+ \leftrightarrow >SOH - H^+ + UO_2^{2+}$		-0.44
<sup>(2)</sup> Cation Exchange		
$NaX \leftrightarrow Na^+ + X^-$		1.0
$CaX_2 \leftrightarrow Ca^{2+} + 2 X^-$		0.316
$AlX_3 \leftrightarrow Al^{3+} + 3 X^-$		1.71
$HX \leftrightarrow H^+ + X^-$		0.025
Mineral dissolution/precipitation		
	$\log_{10} K$ (25° C)	Ref.
Quartz $\leftrightarrow SiO_2(aq)$	-3.7501	(1)
Kaolinite $\leftrightarrow 2Al^{+3} + 2SiO_2(aq) + 5H_2O - 6H^+$	7.57	(2)
Goethite $\leftrightarrow Fe^{+3} + 2H_2O - 3H^+$	0.1758	
Schoepite $\leftrightarrow UO_2^{+2} + 3H_2O - 2H^+$	4.8443	(1)
Gibbsite $\leftrightarrow Al^{+3} + 3H_2O - 3H^+$	7.738	(3)
Jurbanite $\leftrightarrow Al^{+3} + SO_4^{-2} + 6H_2O - H^+$	-3.8	(4)
Basaluminite $\leftrightarrow 4Al^{+3} + SO_4^{-2} + 15H_2O - 10H^+$	22.251	(4)
Opal $\leftrightarrow SiO_2(aq)$	-3.005	(5)
Aqueous complexation		
	$\log_{10} K$ (25° C)	
$OH^- \leftrightarrow H_2O - H^+$	13.99	
$AlOH^{2+} \leftrightarrow Al^{3+} + H_2O - H^+$	4.96	
$Al(OH)_2^+ \leftrightarrow Al^{3+} + 2H_2O - 2H^+$	10.59	
$Al(OH)_3(aq) \leftrightarrow Al^{3+} + 3H_2O - 3H^+$	16.16	
$Al(OH)_4^- \leftrightarrow Al^{3+} + 4H_2O - 4H^+$	22.88	
(and more)		

# Plume Visualization

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# Complexities

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Lots of “noise” in the measurements

Small water level changes cause significant changes in measurement of stratified plume.

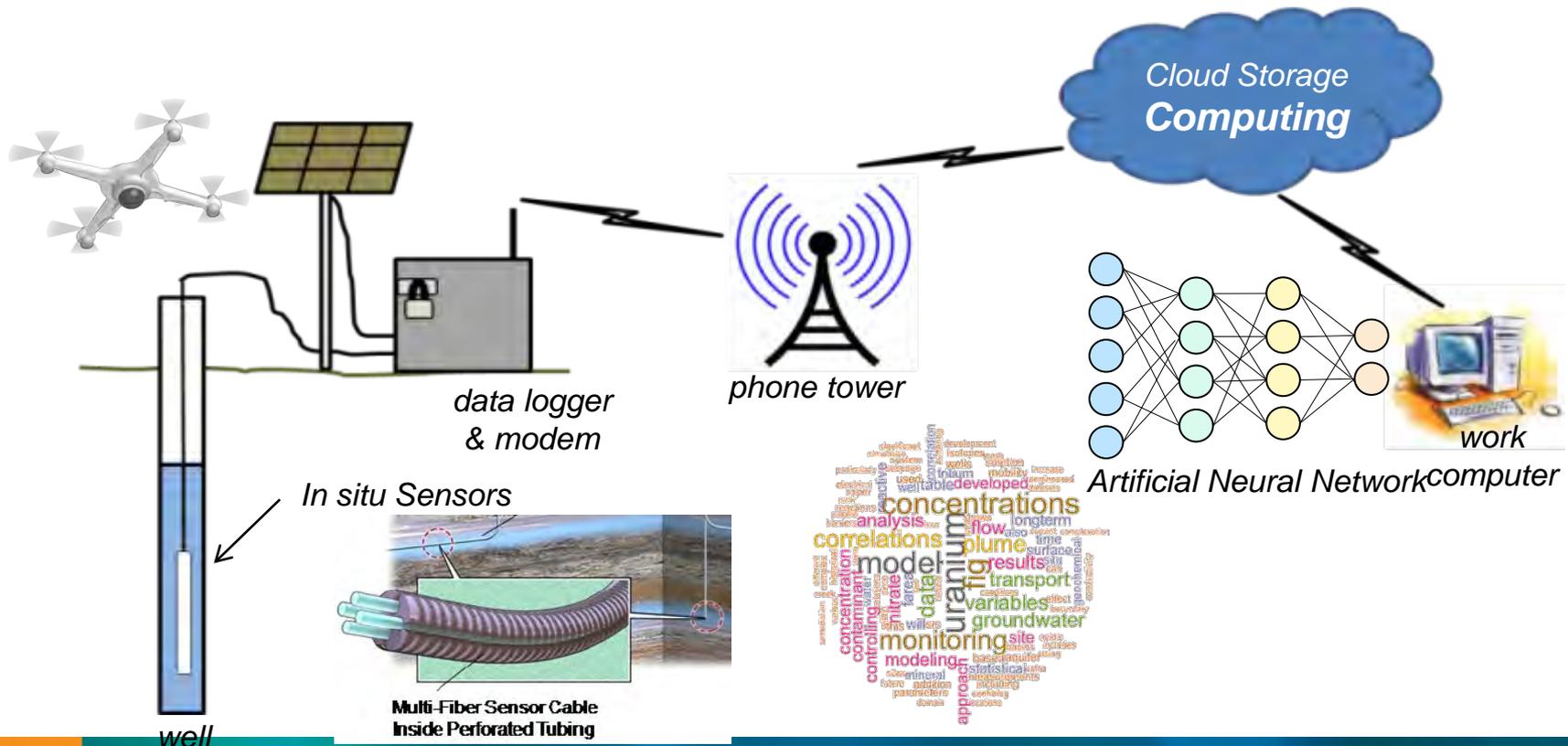
Times scale of change -- Daily, Seasonal, Climatic

What is a significant change? -- Determination of trigger levels.



# Remote Sensing

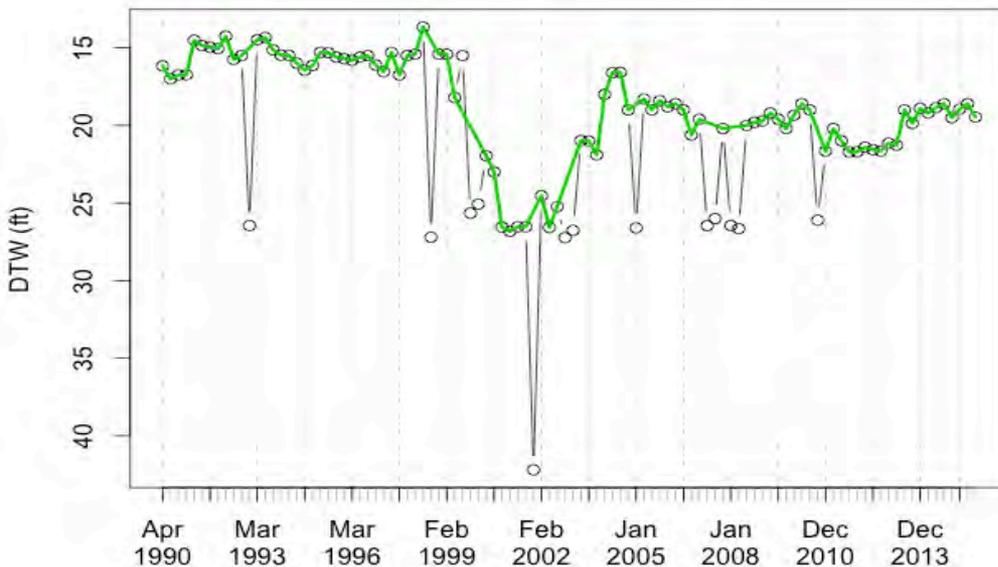
**New sensing technologies** for automated remote continuous monitoring -- In situ sensors, geophysics, fiber optics, UAVs



# Automated QA/QC

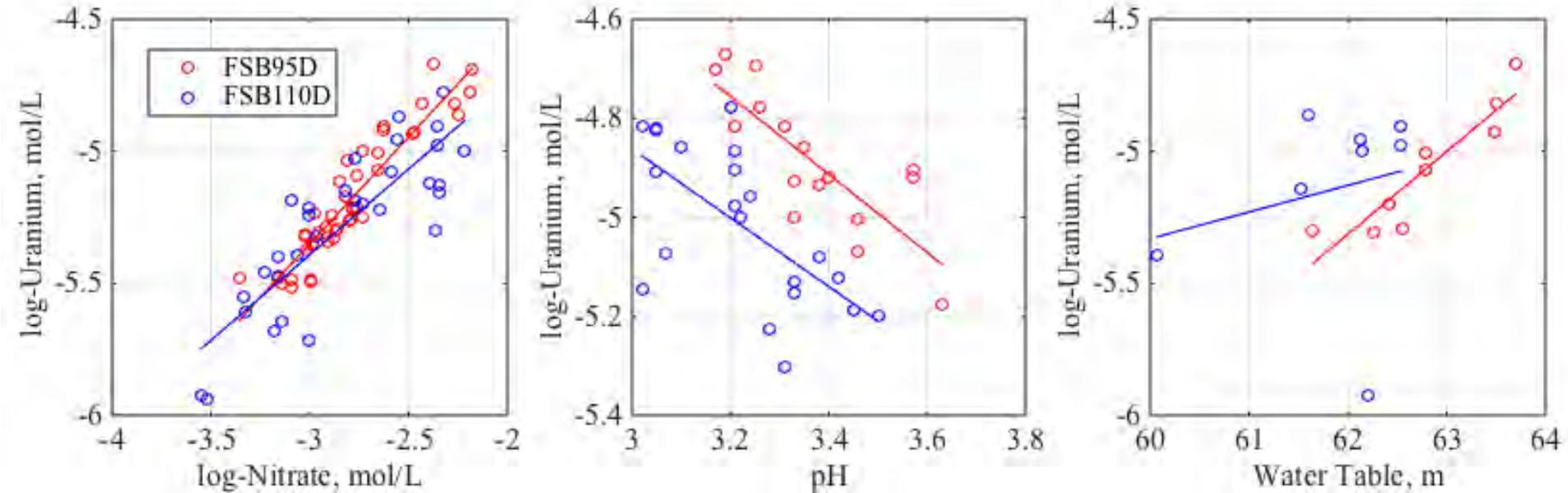
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Well FSB 79, Groundwater level (additive outliers removed)



- Remove outliers or noise using smoothing
- Gap filling
- Detect significant changes

# In situ Variables vs. Contaminants

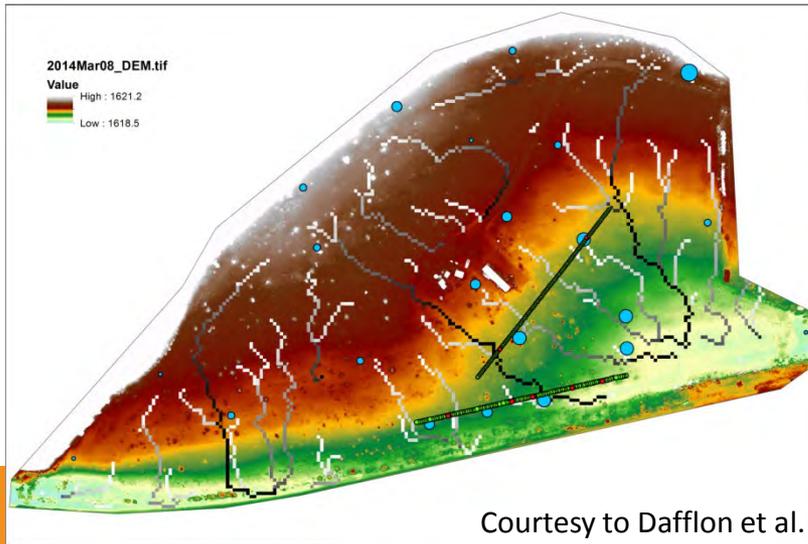


→ Feasibility of In situ Monitoring



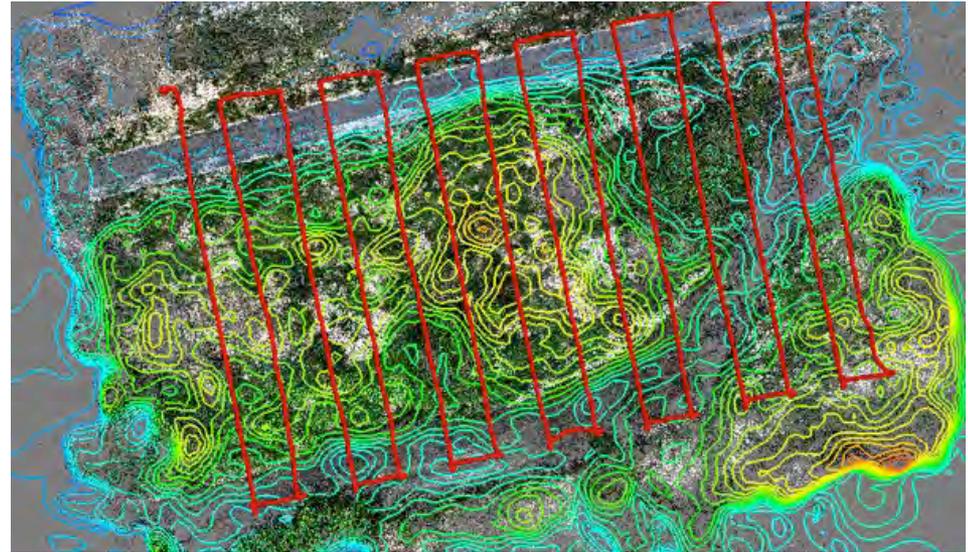
# Drone-based Sensing Technologies

## Soil Moisture/Surface Drainage Mapping



Courtesy to Dafflon et al.

## Fukushima Gamma Source Mapping



Courtesy to Kai Vetter et al.

- Microtopography
- Surface deformation
- Vegetation dynamics/characteristics
- Surface temperature
- Radioactive contamination

# Summary

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## Real/Virtual Test Bed at SRS F-Area

- Data analysis confirmed the feasibility of in situ monitoring
- ASCEM 3D flow and transport simulations quantified the correlations (spatially and temporally variable) but also the future trajectory
- UQ/sensitivity analysis: the long-term feasibility of monitoring

## Cost-effective strategies for long-term monitoring of contaminants (incl. Tritium)

- **In situ sensors, data streaming and data analytics** for automated continuous monitoring
- **Advanced technologies:** geophysics, fiber optics, UAVs
- **Data Analytics: QA/QC, correlations** between master variables and contaminant concentrations
- **Integrated approach** (data + modeling) for system understanding/estimation



# Establishing Action Criteria

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Action criteria, or “trigger levels”, define the window of parameter values, conditions, or rate of change of conditions that require more detailed monitoring

- Manual survey of conditions
- Analysis of samples for contaminant concentrations

Trigger levels established using integrated approach

- Geochemical knowledge of contaminant behavior
- Predictive modeling
- Data analytics

# Example LTM Plan for F-Area Seepage Basins

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**Objective: To detect systemic changes that could lead to mobilization of attenuated contaminants from zones of vulnerability**

➤ **Basin Caps**

- Primarily spatially integrative tools
- Downhole sensors in compliance wells to measure water levels and master variable

➤ **Subsurface Treatment Zones**

- Primarily downhole sensors to monitor water levels and master variables

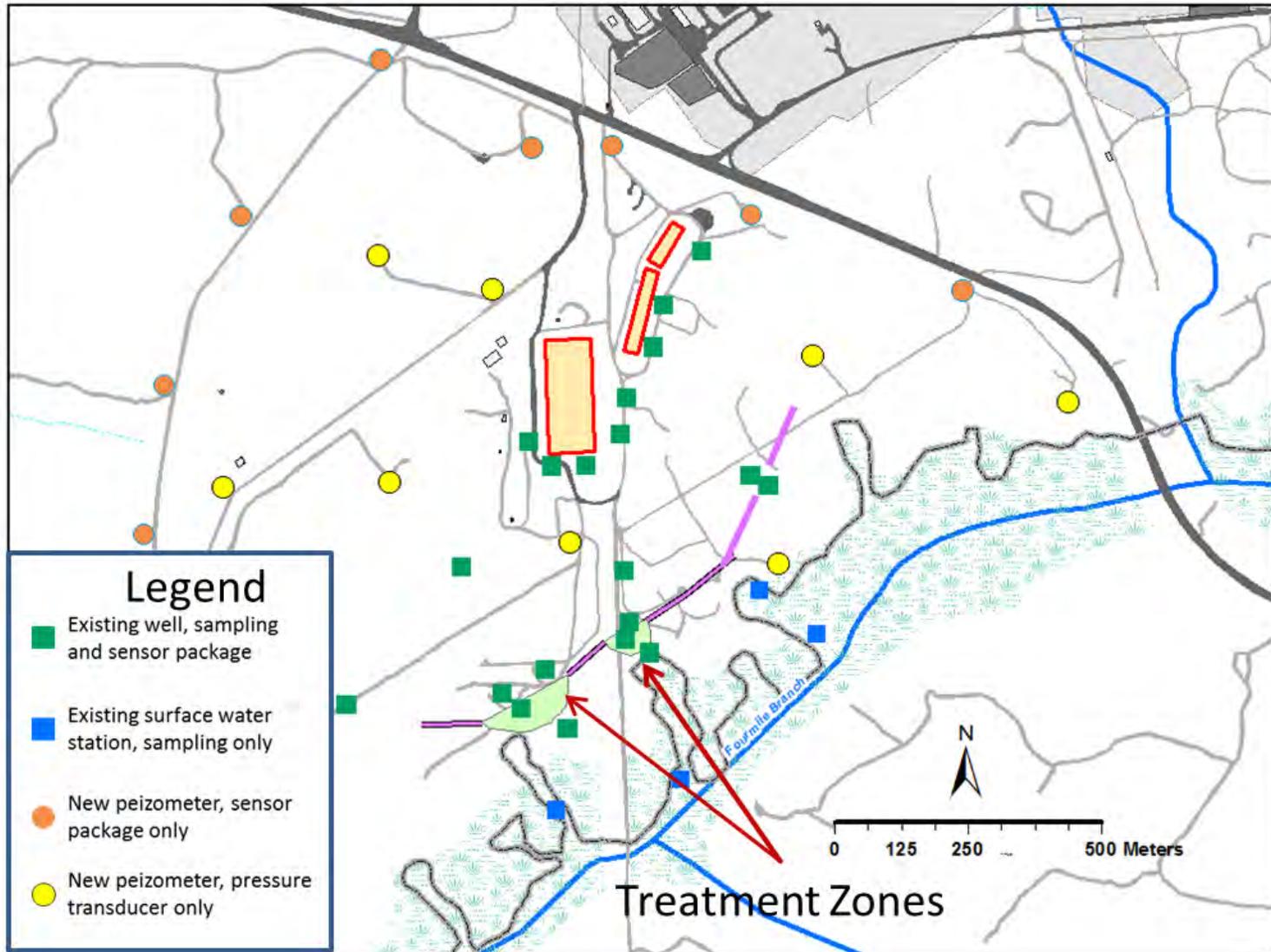
➤ **Wetlands**

- Combination of spatially integrative tools and sensors in surface water to measure master variables

➤ **Additional subsurface sensors to measure water levels and master variables in groundwater**

- Background
- Upgradient of zones of vulnerability

# Potential Network of Point Source Measurements



# Potential Use of Integrative Tools



## UAV & Satellite Imaging

- Evidence of degradation of cap

## Geophysics

- Evidence of increased infiltration through cap

Potentially geophysics to image subsurface treatment zones

## UAV & Satellite Imaging

- Seep locations, hot spots, evapotranspiration, topographic changes, vegetation changes, etc.

## Distributed Fiber Optic Sensors

- Seep locations, moisture content of soils, specific conductance, gamma emissions



# Benefits of New Paradigm for Long-Term Monitoring

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- Focusing on vulnerabilities using point source and integrative measurements provides more complete picture of conditions at the site
- Monitoring of conditions that can mobilize attenuated contaminants, rather than just contaminants themselves, facilitates proactive decisions
  - *Just measuring contaminant concentrations (a lagging indicator) results in crisis when concentrations increase*
    - Little time to understand why concentrations are increasing and to consider appropriate actions
    - Crisis mode decisions
  - *New paradigm emphasizes measurement of leading indicators that warn of potential problem*
    - Allows ample time to assess situation and consider appropriate actions and make better decisions
- New paradigm is more efficient
  - *Large long-term cost savings for taxpayer*

