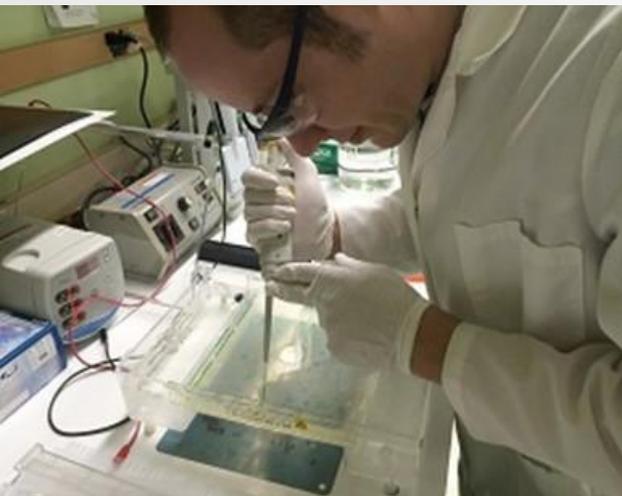




# Complexity and Innovation: Advancing Watershed System Science

Tim Scheibe (PNNL), Susan Hubbard (LBNL)  
& SBR Members

*ESS PI Meeting  
Potomac, MD, May 1-2, 2018*



# Past and Ongoing Visioning

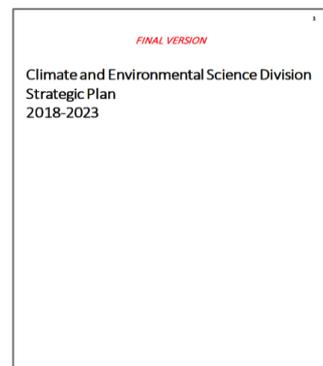
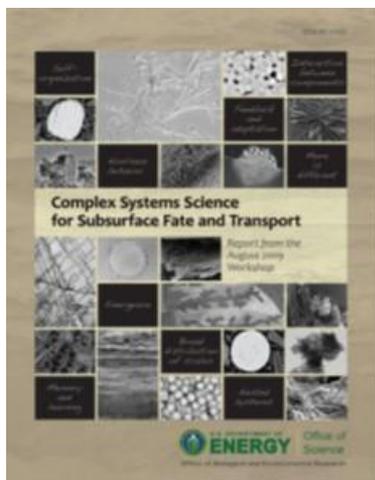
SBR Complexity Workshop, 2010

Many BER workshops  
2011-2017

SBR Visioning Meeting  
2017

CESD Strategic Plan  
2018

SBR Visioning Meeting Report  
2018



New Approaches to Complex Environmental Systems



New Approaches to Complex Environmental and Collaboration Systems

# Presentation Addresses Three Questions:

1. What are the scientific **objectives of the SBR program** and its component projects?
2. How are these scientific objectives being advanced through **three supporting elements**?
3. Can we enable innovation through community coordination – “**what could we advance together that would be difficult or impossible to do alone**”?
  - What are examples of current advances enabled through SBR-SFA based community efforts?
  - What are new opportunities to advance CESD innovation, including enhanced coordination and a few ‘big ideas’.

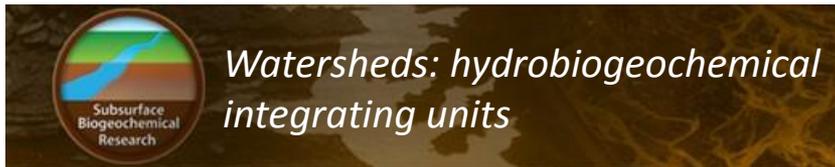
# Scientific Understanding to Enable Water and Energy Security

## DOE Subsurface Biogeochemistry Program

Mechanistic understanding of flow and transport from molecular to watershed scales

► Addressing National Needs in:

- Clean water availability
- Contaminant management
- Nutrient availability
- Water-Energy



**Three Key Elements enable coordination and innovation across SBR.....**

# Element 1: Crosscutting Scientific Questions

1. Quantify how biological behavior, abiotic-biotic interactions and **molecular transformations** control the mobility of contaminants, nutrients and critical biogeochemical elements
2. Quantify and predict how **hydrology drives fine-scale biogeochemical processes** in surface-subsurface systems
3. **Translate biogeochemical behavior across relevant molecular to watershed scales** to accurately and tractably predict flows of water, nutrients and contaminants
4. Identify, quantify, and predict **watershed responses to natural and anthropogenic perturbations** and shifts to new states
5. Translate predictive understanding of watershed system function and evolution into near and long term **energy and environmental strategies.**

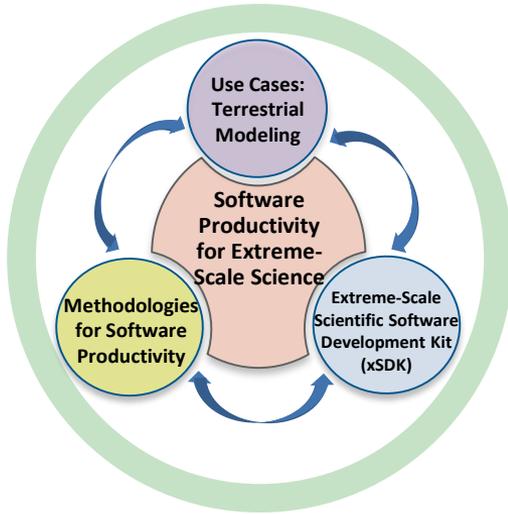
## CESD Strategic Plan Grand Challenges:

- **Biogeochemistry**
- **Integrated Water Cycle**

## BERAC Grand Challenges:

- **Earth and Environmental Systems Sciences - Hierarchy of models from process-resolving to reduced-order**
- **Microbial to Earth System Pathways** – Define the key elements of microbial communities relevant for predicting larger-scale ecosystem phenomena elements from ecosystems.

# Element 2: Community Infrastructure for Data and Computation



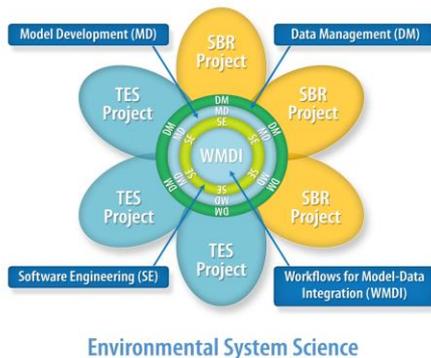
**HPC computational infrastructure**

## Opportunity:

- Publish massive data sets **with interactive capabilities for analysis and visualization**
- Framework to enable **easy iteration between machine learning and mechanistic models**



**Data Cyberinfrastructure**



Environmental System Science

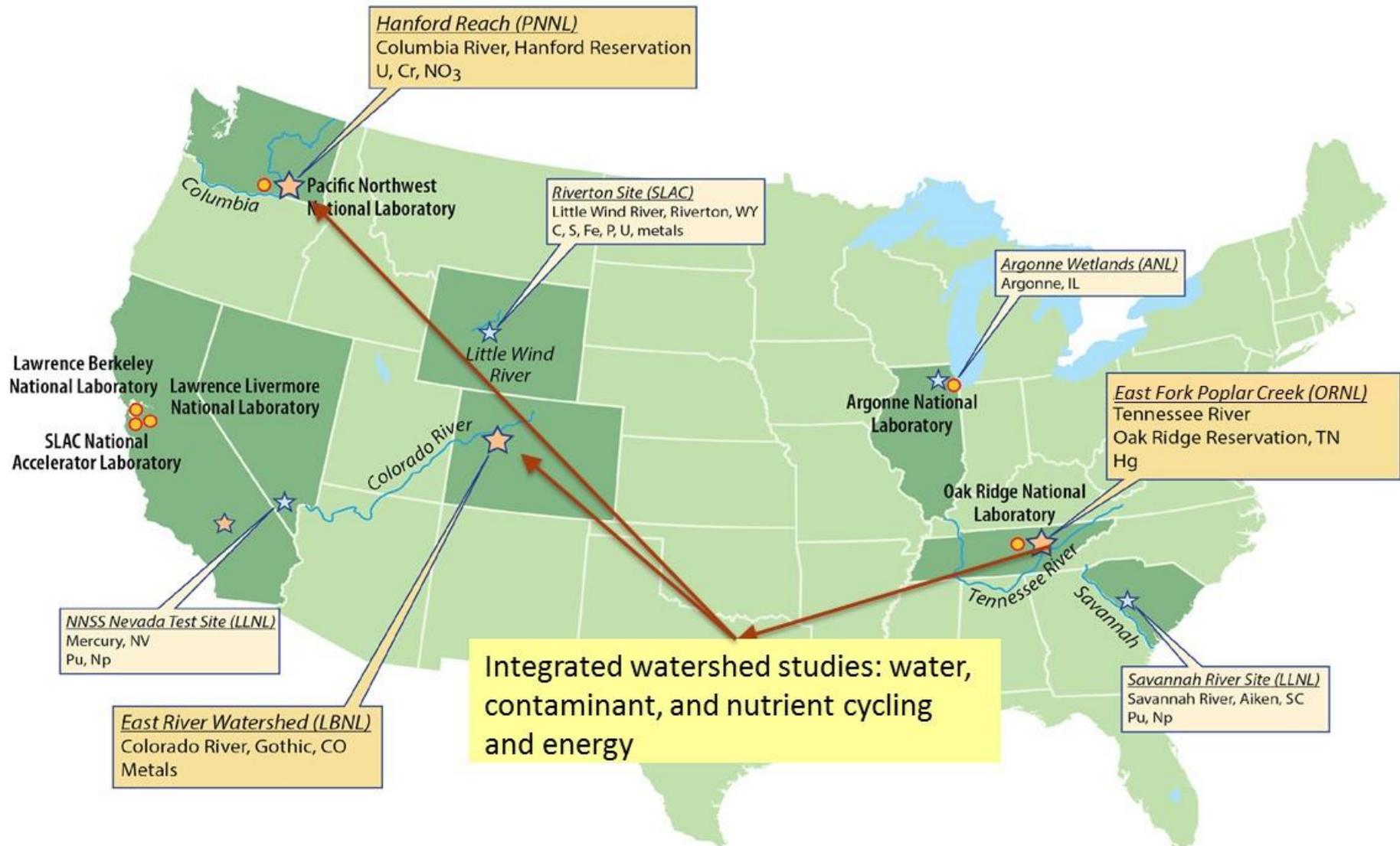
- Model intercomparisons /
- Input to ESS-Dive design
- Topical webinars and work
- Geospatial science to infor
- Exploring model-data integ

## Opportunity:

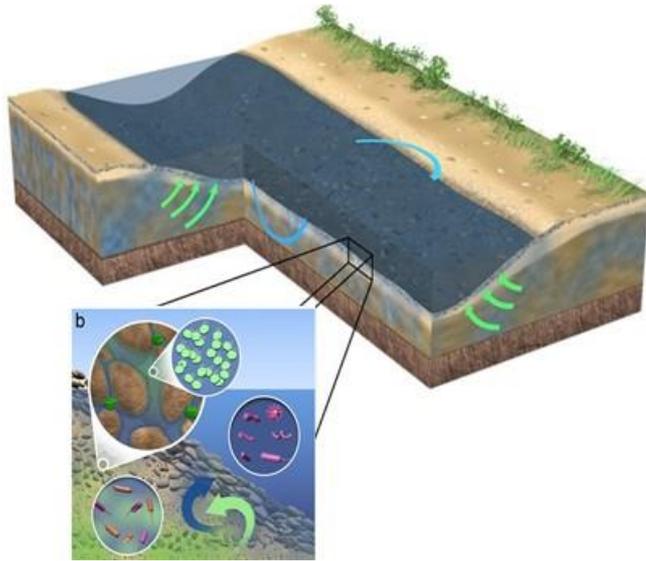
- Seamless data flow between ESS-Dive and K-Base to enable investigations of how biology shapes the environment and how the environment shapes biology

## ESS Cyberinfrastructure Community Working Groups

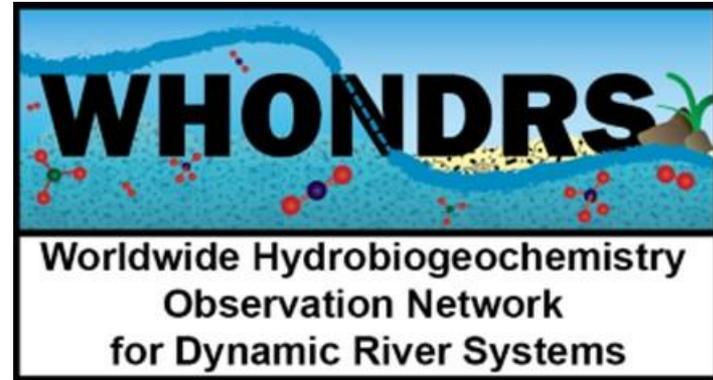
# Element 3: DOE-SBR Network of Complementary Testbeds



# PNNL SBR SFA: Hydrobiogeochemistry of Managed Rivers and Watersheds



Understand the impacts of **river-groundwater exchange** flows on biogeochemical and ecological processes in the **Columbia River corridor**, and the resulting cumulative effects at the watershed scale



WHONDERS seeks to broaden understanding of the impacts of river stage variability on exchange flows, biogeochemistry and ecology – beyond Columbia River research site.

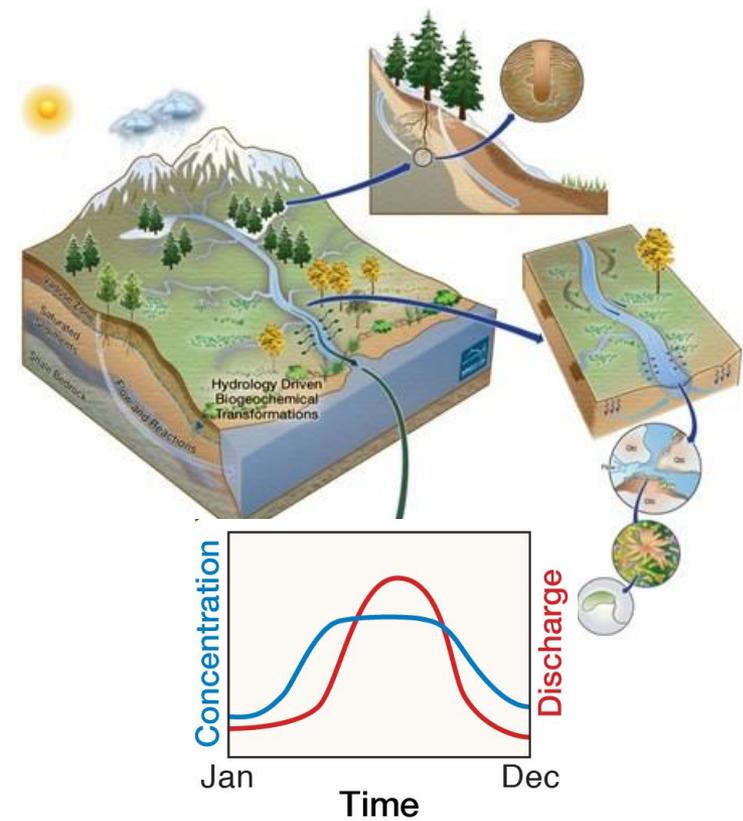
# Berkeley Lab Watershed Function SFA, East River CO

## Testing Scale-Adaptive & System-of-Systems Approaches to Balance Complexity and Tractability, Upper Colorado River Basin

Community Bi-Monthly 'Community Watershed' Telecon – Started in 2007; Over 225 current invitees.

Project has hosted **450 individuals in CO Observatories** including researchers from:

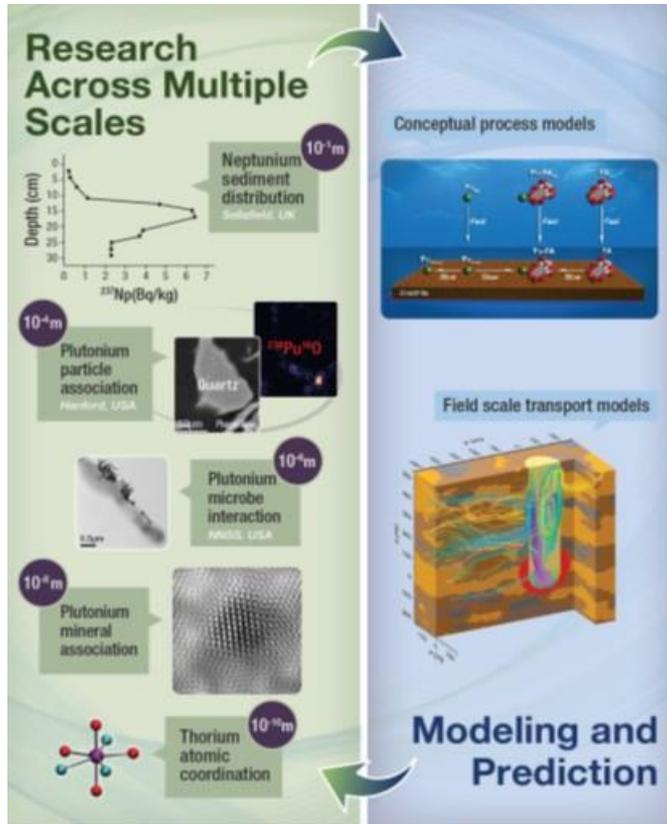
- 7 countries and 33 US states
- 55 academic institutions,
- 16 federal, state and local government institutions (including USGS, NOAA, NASA, EPA)
- 13 private sector organizations.



Predictive Understanding of how **Mountainous Watersheds** respond to **Perturbations** and **Retain and Release Water, Nutrients, Carbon and Metals** at **episodic to decadal timescales**



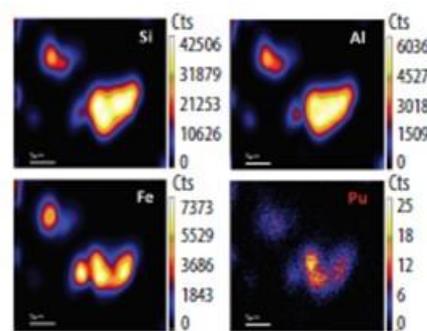
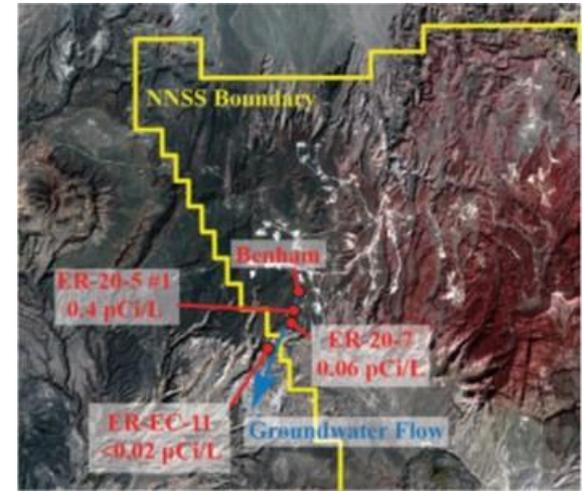
# LLNL SFA: Subsurface Biogeochemistry of Actinides



Building an understanding of actinide behavior from the atomic to field scale to improve prediction of actinide migration at globally relevant sites.

Community science at expanded testbed sites:

- NNSS
- SRS
- Hanford
- Sellafield/Ravenglass estuary -



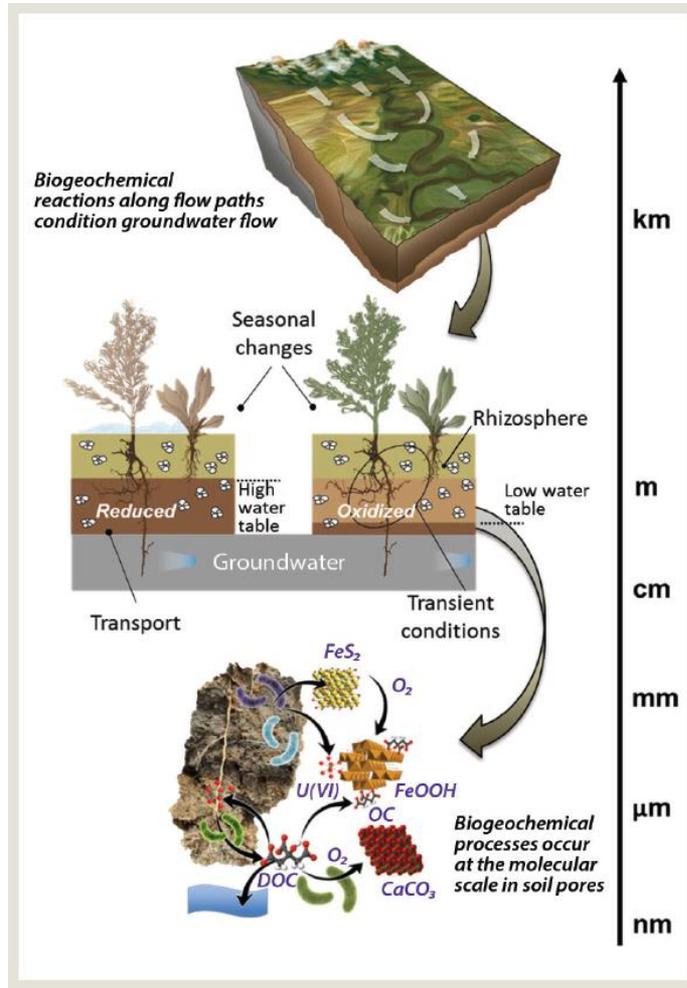
Nano-SIMS

State-of-the-art capabilities to detect and measure actinides

- Open to the SBR community
- Can accept radioactive samples
- Used by research groups worldwide



# SLAC SFA: Groundwater Quality



Community advancement of synchrotron-based approaches for application to biological and environmental research.

- **Synchrotron Environmental Science (SES) Conference** series held at synchrotrons to further integration between synchrotron and environmental scientists.
- **Envirosync**- voice to federal agencies for Biological and Environmental Scientists who use synchrotron radiation in their research.

Advancing predictive understanding of hydrologically driven biogeochemical processes in the capillary fringe controlling water quality

# Opportunities and Big Ideas for Discussion and Feedback



# Strategic Synchrotron Community Advances for Biogeochemistry

## Unparalleled biogeochemical characterization across Synchrotrons:

- Infrared nano-spectroscopic imaging (ALS)
- Hard X-ray *nanoprobe* (NSLS-II)
- Fluorescence-based 3D X-ray microscopy (APS)
- Infrared spectro-microtomography (ALS)
- Machine learning data mining of 2D and 3D image data (SSRL)
- Cryo-electron tomography for protein imaging (SLAC)

**Meet with BER synchrotron reps Wednesday, 12pm-1pm**

- ▶ ALS-; [psnico@lbl.gov](mailto:psnico@lbl.gov), [hyholman@lbl.gov](mailto:hyholman@lbl.gov)
- ▶ APS-; [kemner@anl.gov](mailto:kemner@anl.gov)
- ▶ NSLS-II -; [rtappero@bnl.gov](mailto:rtappero@bnl.gov)
- ▶ SSRL-; [bargar@slac.stanford.edu](mailto:bargar@slac.stanford.edu)

**Opportunity:**  
Collection and  
Analysis of **Common  
Suite** of  
Environmental  
Biogeochemical  
Measurements,

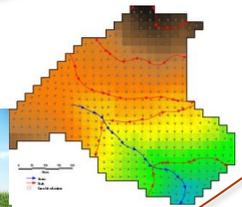
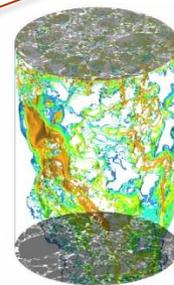
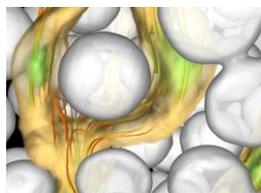
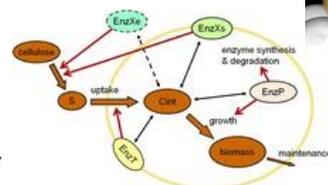
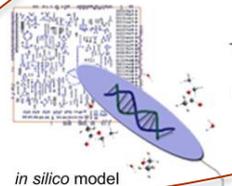
Acquisition and  
analysis coordinated  
across **SBR  
Observatories** and  
**Synchrotrons**

....and **EMSL, JGI**

# Opportunity: Linkages with User Facilities and User Programs

**Opportunity:**  
Iterative Model-  
Experiment  
Integration Across  
Scales (MODEX)

**Meet representatives on  
Wednesday, 12pm-1pm**



# Opportunity: 4D Watershed Imaging

- ▶ Monitoring of **vegetation, microbial ecology, biogeochemistry, hydrogeology & geochemistry** watershed dynamics through **integrating direct and proxy measurements**
- ▶ **Networking** of increasingly **autonomous sensors**
- ▶ **Novel sensors** (biosensors, root imaging, optodes & quantum-based, etc.).
- ▶ **Machine learning** to rapidly explore diverse datasets and identify hot spots and moments

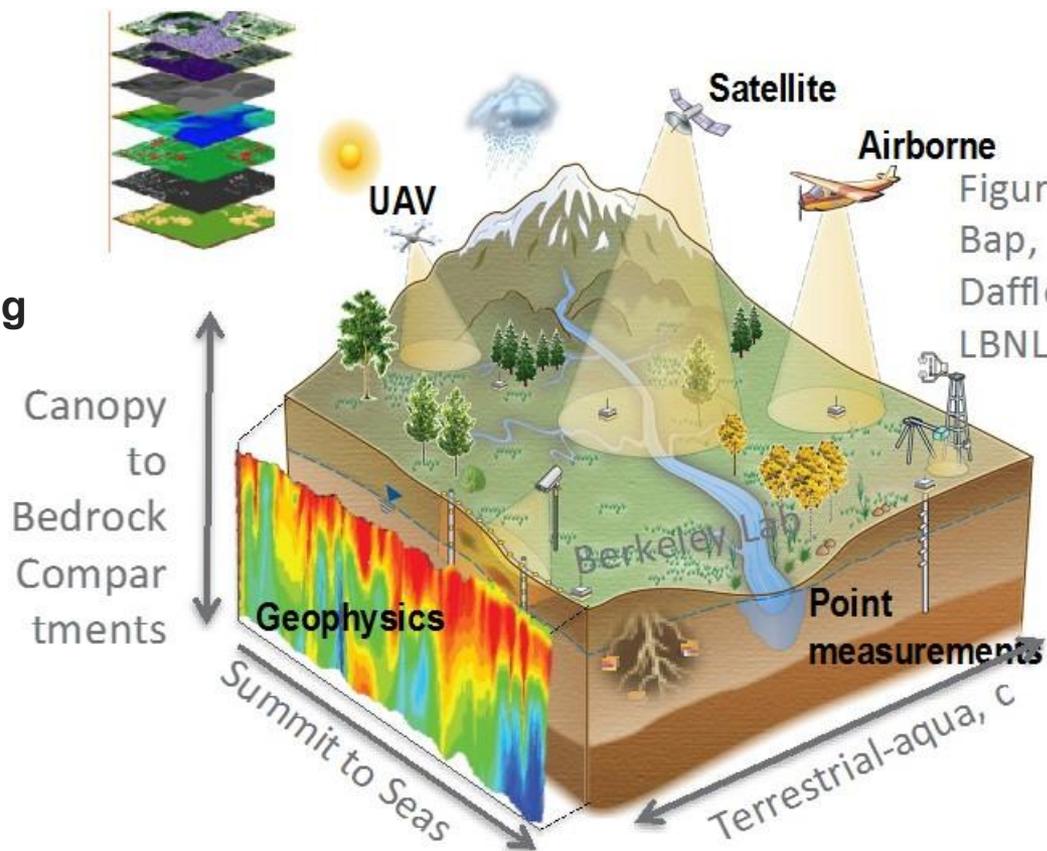


Figure -  
Bap, ste  
Dafflon  
LBNL

## Opportunity:

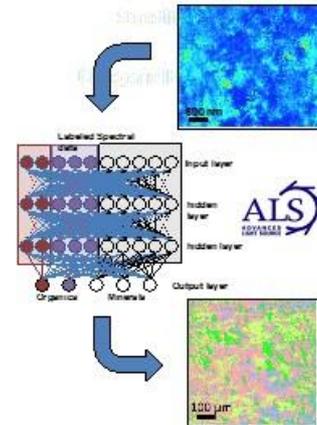
Coordinated ESS effort to develop unparalleled capacity to “watch” watersheds function in real time and to rapidly assimilate information into predictive models

# Opportunity: Machine Learning for the Environment

- ▶ Many recent advances by SBR investigators

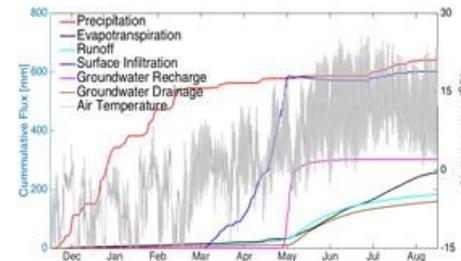
## Opportunities:

- ▶ Significant potential for improved:
  - Cross-scale, cross-compartment imaging
  - Conceptual model development
  - Model-data integration
  - Assimilation of field streaming data into models
- ▶ IDEAS-like framework for data-driven environmental tools and model-data integration frameworks



Linking synchrotron information about shale chemical heterogeneity across nano- and micro-scales

Hao et al., Nature Scientific Reports, 2018



Estimating water partitioning through assimilation of daily autonomous ERT field data into coupled model

Tran et al., in review

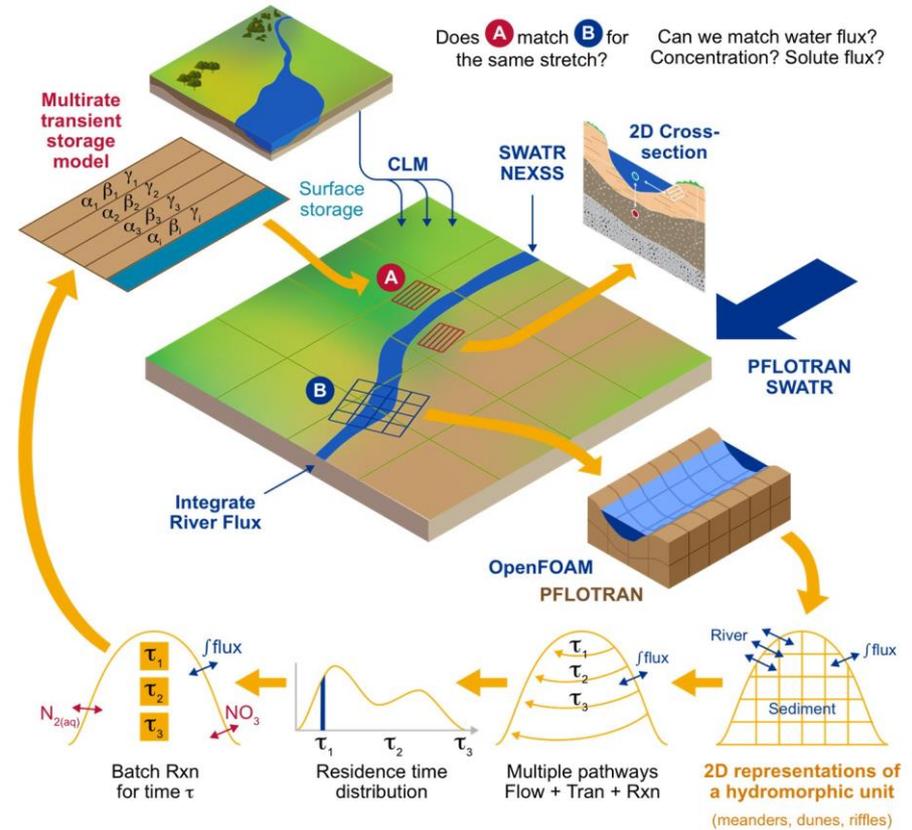


Linking groundwater time-series data with patterns of river water intrusion using deep learning

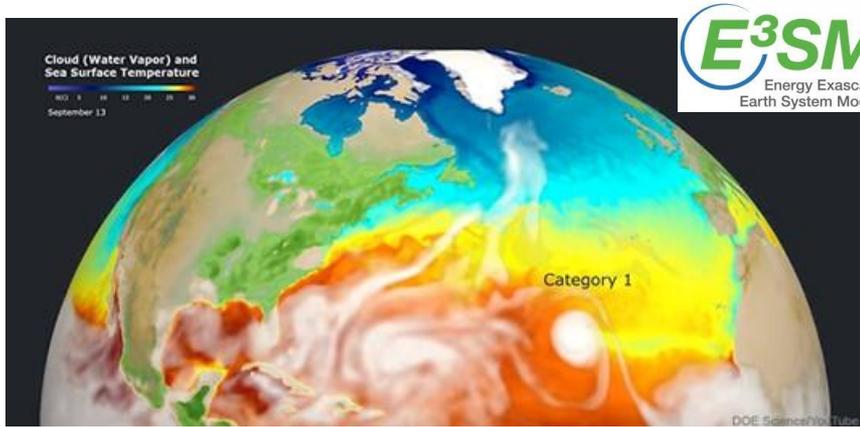
X. Chen with PNNL Deep Science Initiative

# Opportunity: Cross-BER Program Linkages

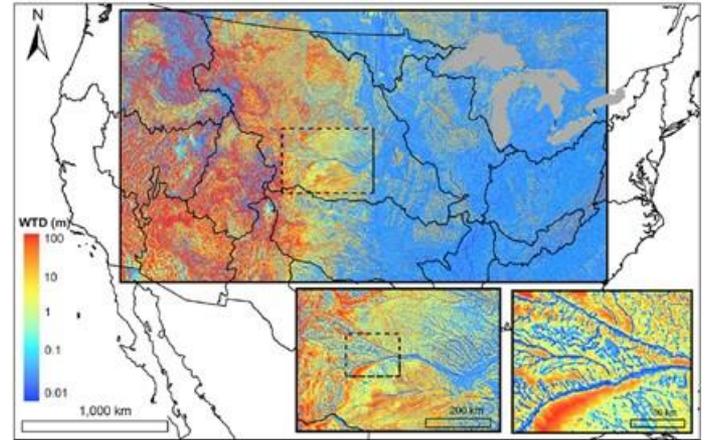
**Opportunity:** Integration of top-down and mechanistic approaches to Earth Systems modeling across ESS and E3SM



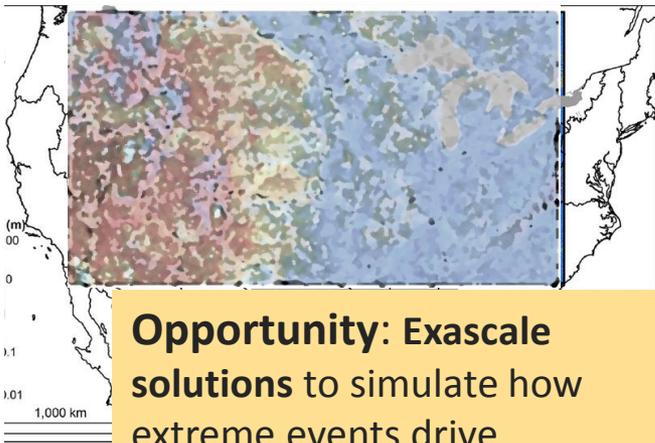
# Big Idea: Quantifying Influence of Extreme Events on Watershed Hydro-Biogeochemistry across CONUS



E3SM for predicting future climate and weather variability



Maxwell et al., 2015 Prediction of surface-groundwater interactions across the CONUS



**Opportunity: Exascale solutions** to simulate how extreme events drive **biogeochemical cycles across CONUS**



**Opportunity: SBR observatories coordinate** assessment of how **extreme events manifest** in different key US watersheds



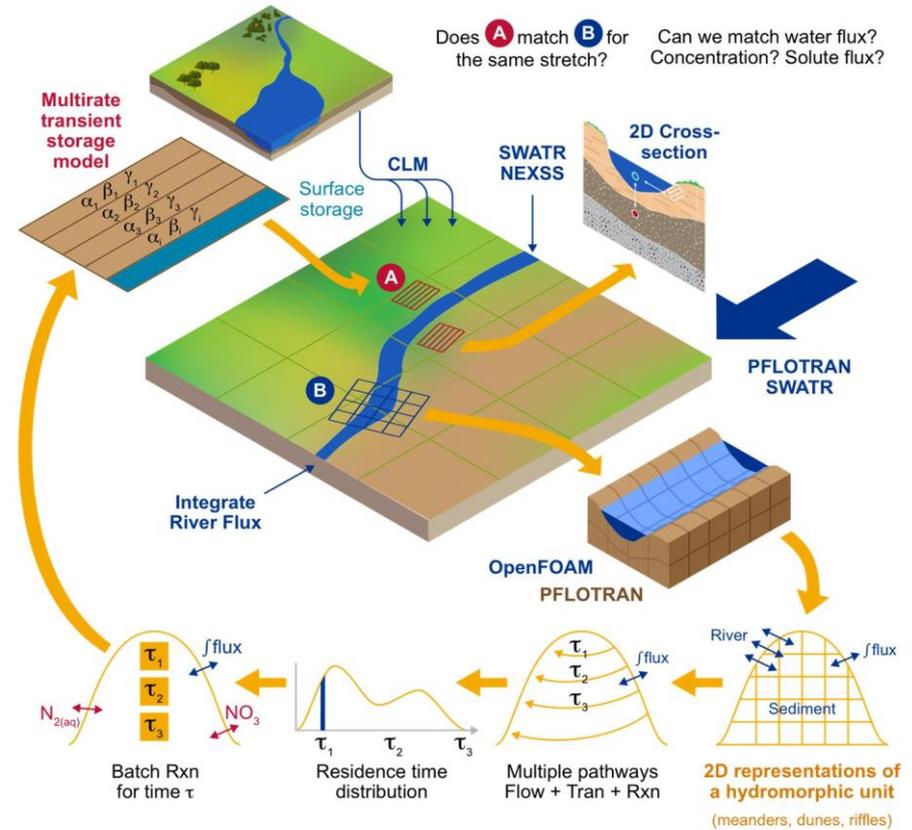
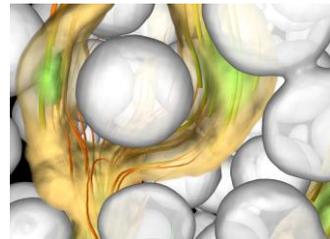
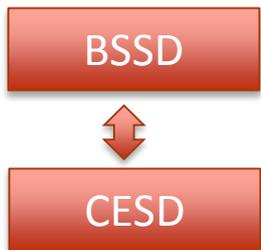
**Predictive understanding of impacts of bomb cyclones, western droughts, Atm rivers and other extreme events on US energy, water availability, nutrients and contaminant mobility**

# Opportunity: Cross-BER Program Linkages

**Opportunity:** Integration of top-down and mechanistic approaches to Earth Systems modeling across ESS and E3SM

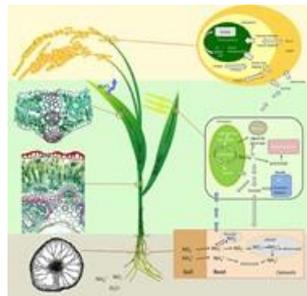
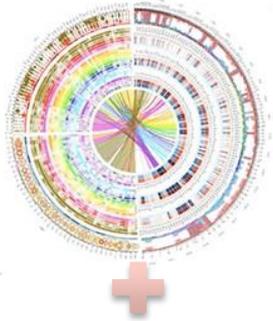


**Opportunity:** Integrating microbial and plant biological understanding into earth and environmental systems models

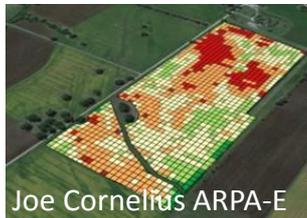


# Big Idea - Managed Biosystems: Realizing the potential of G x E x M with designer crops in novel environments to meet future Energy and Food Demands

Genome-Based  
Trait Associations

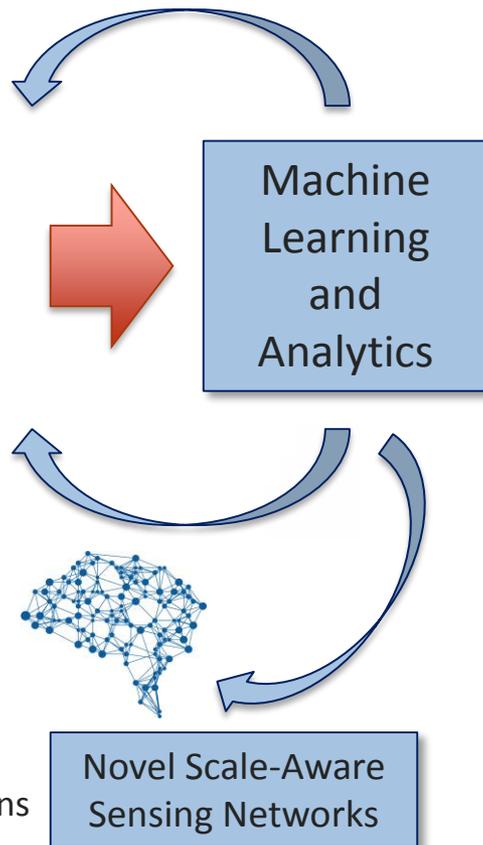


Virtual Plant Model



Environmental Variations  
and Perturbations

**G (Genotype) x E (Environment) x M (Management)  
Mechanistic Models to Predict System Performance**



## Opportunity:

- ▶ Multiscale approach to biodesign and management
- ▶ Virtual plant model for many combinations of G x E
- ▶ Machine learning / big data analytics to identify interesting combinations of genotype and environment
- ▶ Iterate with modeling/experiments
- ▶ Define optimal management strategies

# Opportunity: Network of Networks

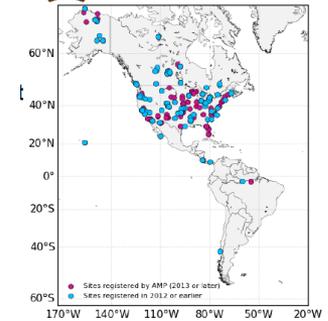
## NSF and International ESS Networks



### Opportunities:

- US Integrated Field Laboratories (IFLs)—measurements across gradients and compartments
- Global network to address gaps and challenge models

## DOE Networks



# “Yes, and...”

Thanks to SBR Leads for their Input:



Annie Kersting  
LLNL



Eric Pierce  
ORNL



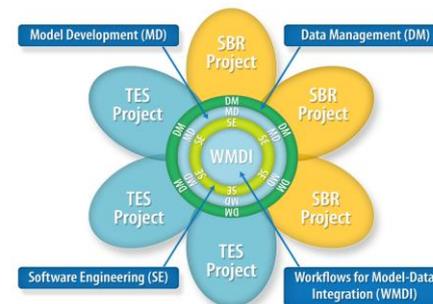
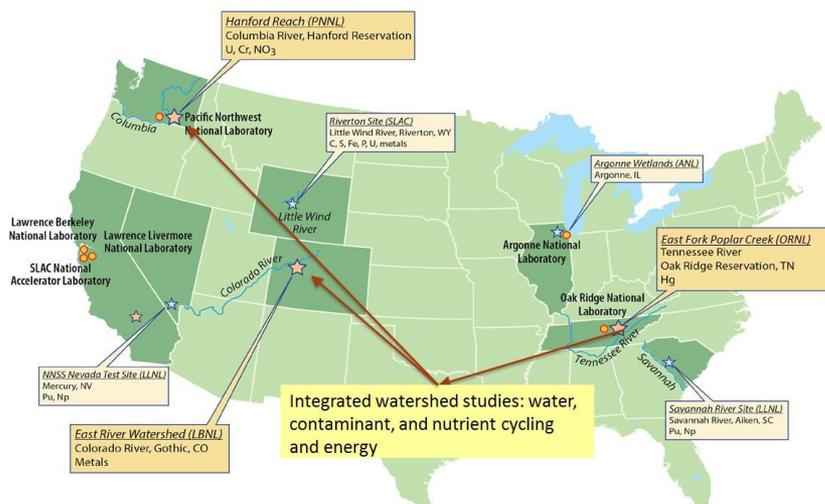
John Bargar  
SLAC



Ken Kemner  
ANL



EMSL



Environmental System Science