

# A collaborative approach to developing models for catchment-lake dynamics

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# Workshop Outline

1. Overview of catchment modeling process
2. Accessing geospatial data from national data products
3. The model-data workflow
4. Research Opportunities in lake-catchment modeling
  - Strategies for a fully coupled lake-catchment model
  - Defining an experimental “Isoscape” for water and carbon
  - The age of water and carbon in lake-catchment systems
6. Discussion

# Essential Data For Water Catchment Modeling

Consistent and accessible continental-scale geospatial data is a requirement for resolving the water cycle at scales relevant to national problems

Critical for detection and attribution of change for climate, landuse and ecosystem services for uncertainty assessment, decision making and policy



2,268 USGS  
HUC 8  
watersheds

# The Catchment - River Basin

## A Basis For Model-Data Collaboration

103,444 USGS  
HUC 12  
watersheds



# ETV: Essential Terrestrial Variables

What they are and,  
Why they are important?

# Essential Terrestrial Variables: A Proposal

- Atmospheric Forcing (precipitation, snow cover, wind, relative humidity, temperature, net radiation, albedo, photosynthetic atmospheric radiation)
- Digital elevation models (30, 10, 3, 1m resolution)
- River/Stream discharge, stage, cross-section
- Soil (texture, C/N, organic, hydrologic & thermal properties)
- Groundwater (levels, extent, hydrogeologic properties, 3D Architecture)
- Land Cover (biomass/leaf area index, phenology,..... )
- Land Use (human infrastructure, demography, ecosystem disturbance, property & political boundaries)
- Environmental Tracers- stable isotopes
- Water Use and Water Transfers
- Lake/Reservoir/Diversion (levels, extent, discharge, operating rules)
- ...to be cont'd.....??

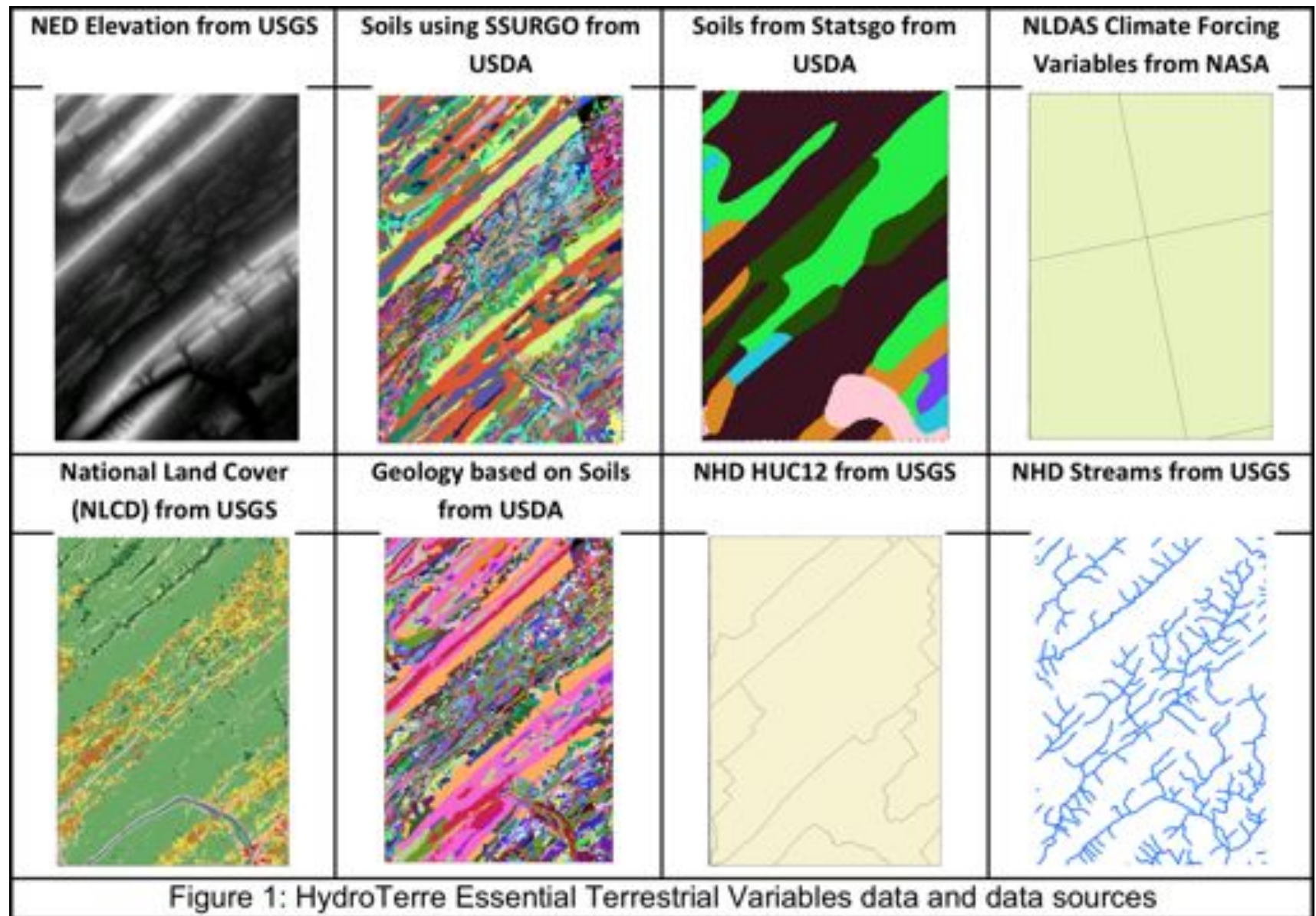
Most data reside on federal and state servers ....many petabytes

# An Initial ETV Data Bundle for CONUS

Category	Variables	Nat. Products	Reference	Size/Resolution
Atmospheric Forcing	precipitation, snow cover wind speed/direction relative humidity temperature atmospheric radiation albedo photosynthetic radiation	NLDAS II,  NAAR	Bailey, 2004  NARR, 2011	8km, hourly, 5 TB per year  .
Digital Terrain	DEM, DTM, Lidar	NHD+	NHD, 2013	30m, 10TB
River/Stream	Discharge, stage	USGS Gauging	USGS, 2011	100 GB
Soil	class, hydrologic properties	SSURGO STATSGO	SSURGO, 2011 STATSGO, 2011	1 TB
Groundwater	Hydrogeological formations Hydrogeological properties Water Levels		NHD, 2011 **  USGS, 2013	
Surface Water Bodies	Lake/Reservoir Geometry Operating Rules Volume/Area/Level	USGS US COE US Bur Rec	USGS, 2013 NHD, 2013	
Land Cover	Leaf area index human infrastructure surface roughness	NLCD, MODIS	MODIS, 2011, NLDAS, 2011	30m, 5TB
Water Use	Wells diversions municipal supply storm flow/sewer networks irrigation drainage	USGS	USGS, 2013 NHD, 2013** ** ** ** **	
				Approximately 185 TB



# HydroTerre: A Prototype for Data Access





# [www.HydroTerre.psu.edu](http://www.HydroTerre.psu.edu): Interface

HydroTerre\_National

hydroterre.psu.edu/Development/HydroTerre\_National/HydroTerre\_National.aspx

cabot Been C2D TVCatchup London CWI PHM Belfor Ryan AT&T Basins Jer - Login DDS BIOMOD UZH CoupMod Faten back UK CJD WEB PHM


HydroTerre Etlbox HydroTerre ETV Services HydroTerre\_National HydroTerre\_National

### HydroTerre CONUS USA [Help](#)

with GSSURGO by Lorne Leonard

[Download ETV Model Data](#)

(Step 1) Enter Your Email Address for link to data results

(Step 2) Select Watershed 

(Step 3) Select Start Date

 PICK 15

(Step 4) Select End Date

 PICK 15

(Step 5) Purpose of downloading data


[Research Project](#)

(Last Step) Click to Retrieve Data

[Generate ETV input Data](#)

Forcing is available for years 1979 to 2020. (20 years or 1 climate norm).

Suggested way to reference data is included in HydroTerre\_Readme.txt file.



Shows for distributed water resources modeling. Environmental Modelling & Software, Volume 50, December 2013, Pages 85-96, ISSN 1364-8152

# HydroTerre: A Prototype for Model-Data Access

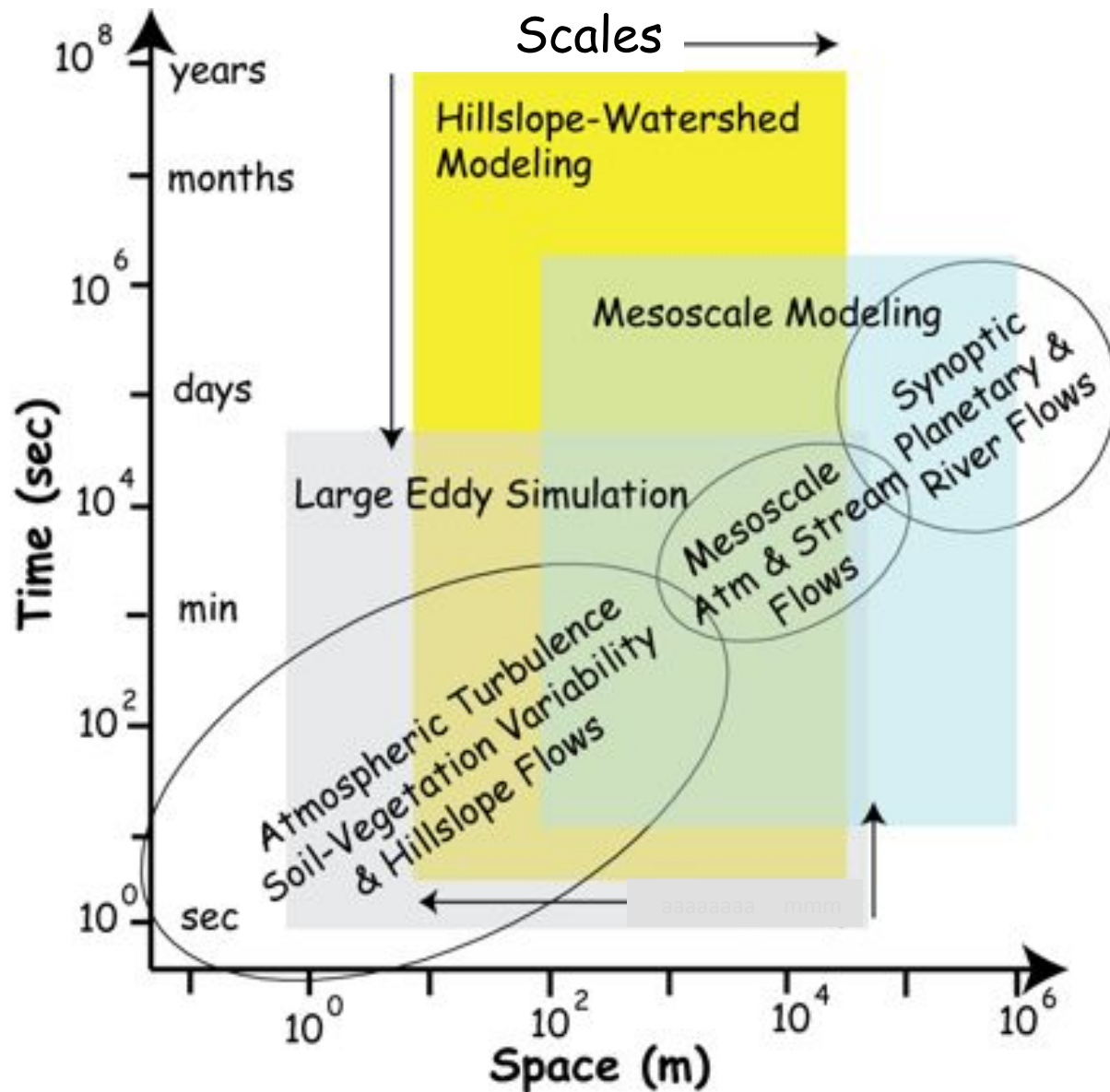


Land Parcel Data; NHD: Stream, Lake, HUC'; USDA: Soils/Crops; NLCD: LU\_LC;

What scale/resolution of  
ETV's is important for  
Catchment research?



# Multi-Scale Processes and Data Support



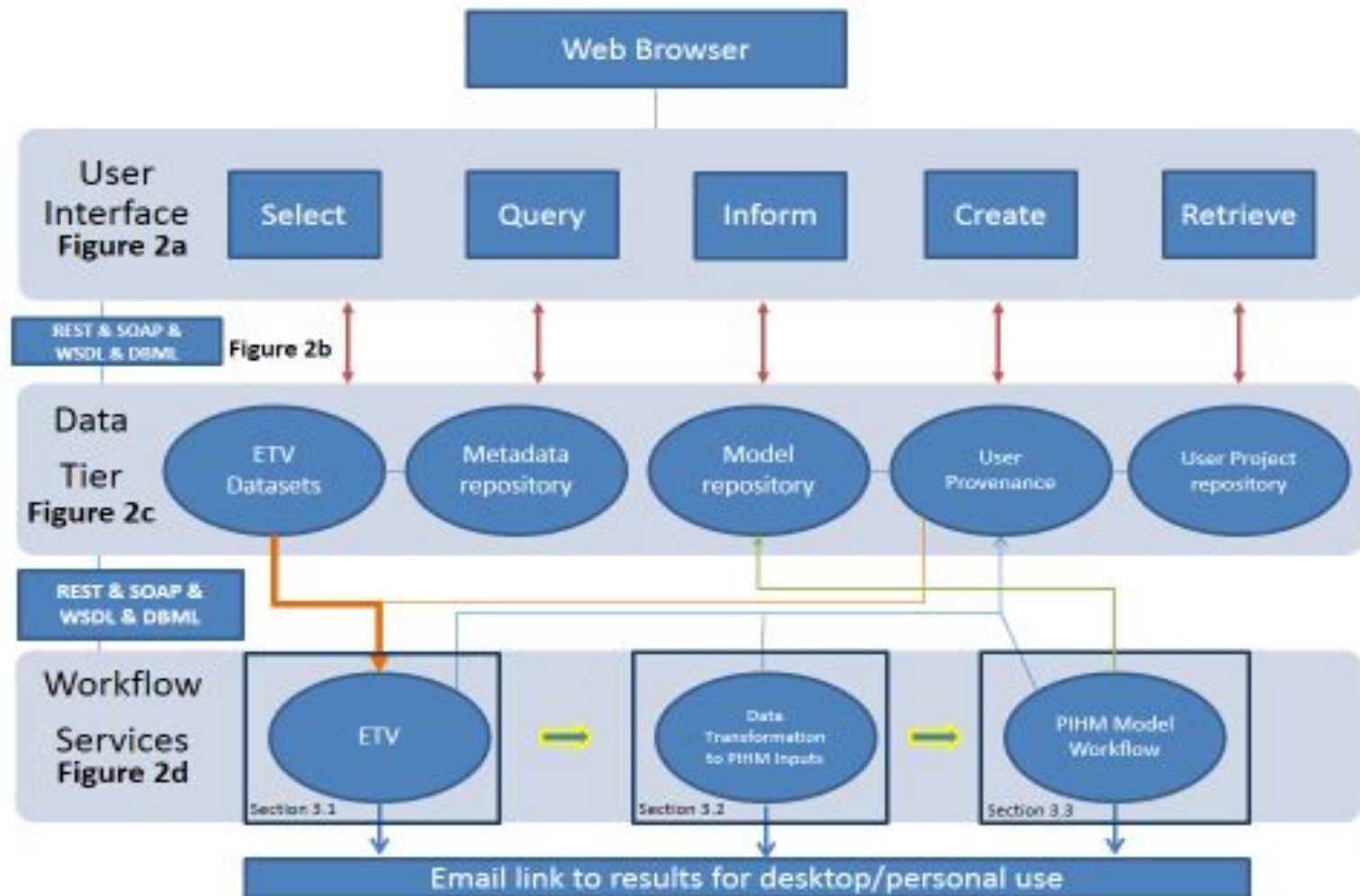


GCM Grid Box

Catchment Models Must Resolve  
Upland Watershed Features

# Automating the Catchment Model-Data Workflow





Service-oriented architecture for data-model workflows consists of three layers. The first layer is the web based user interface, supported by a data tier layer, and a workflow service layer. (under development)

# HydroTerre: Extending the Prototype

Author Lorne Leonard

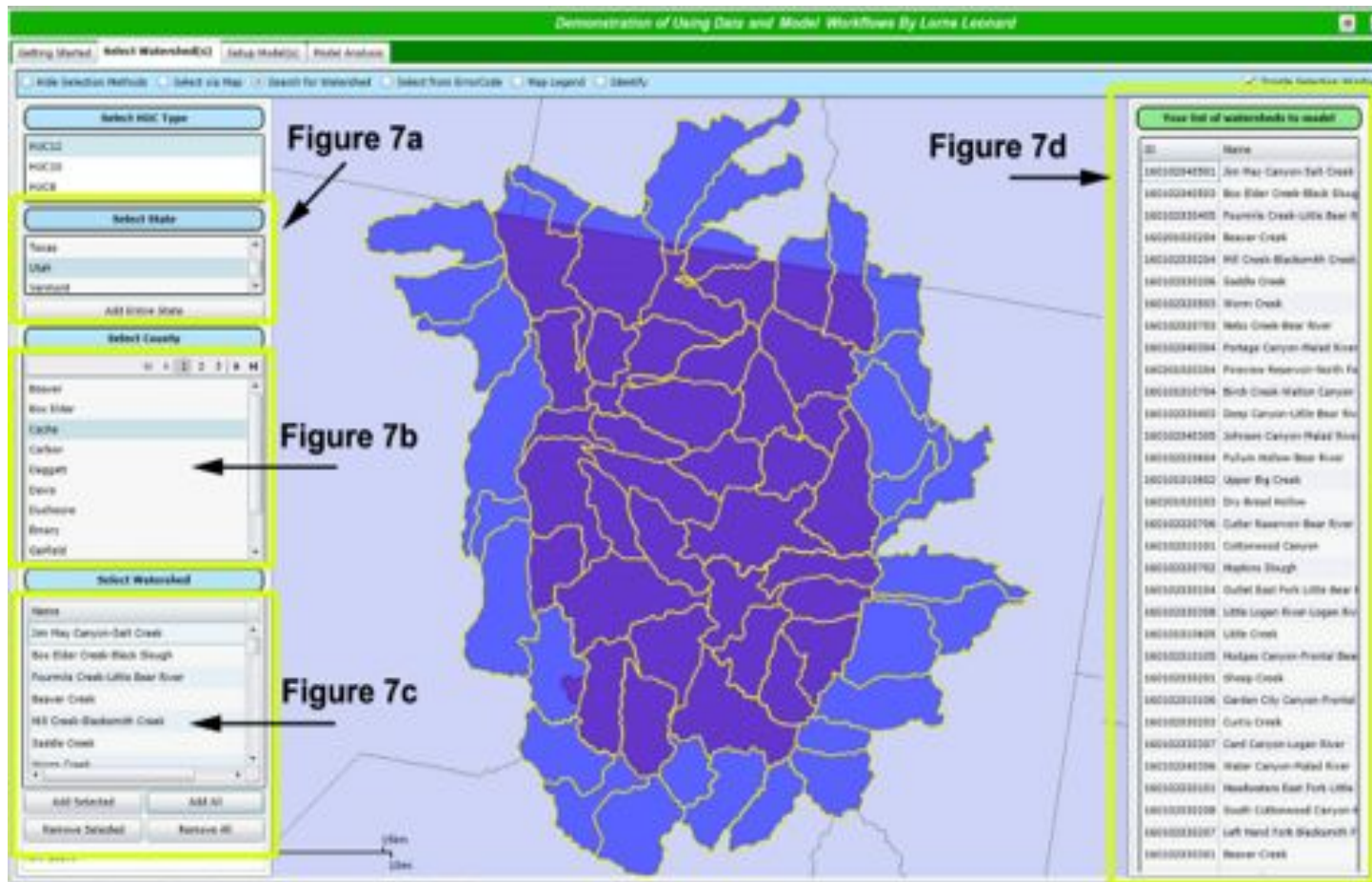
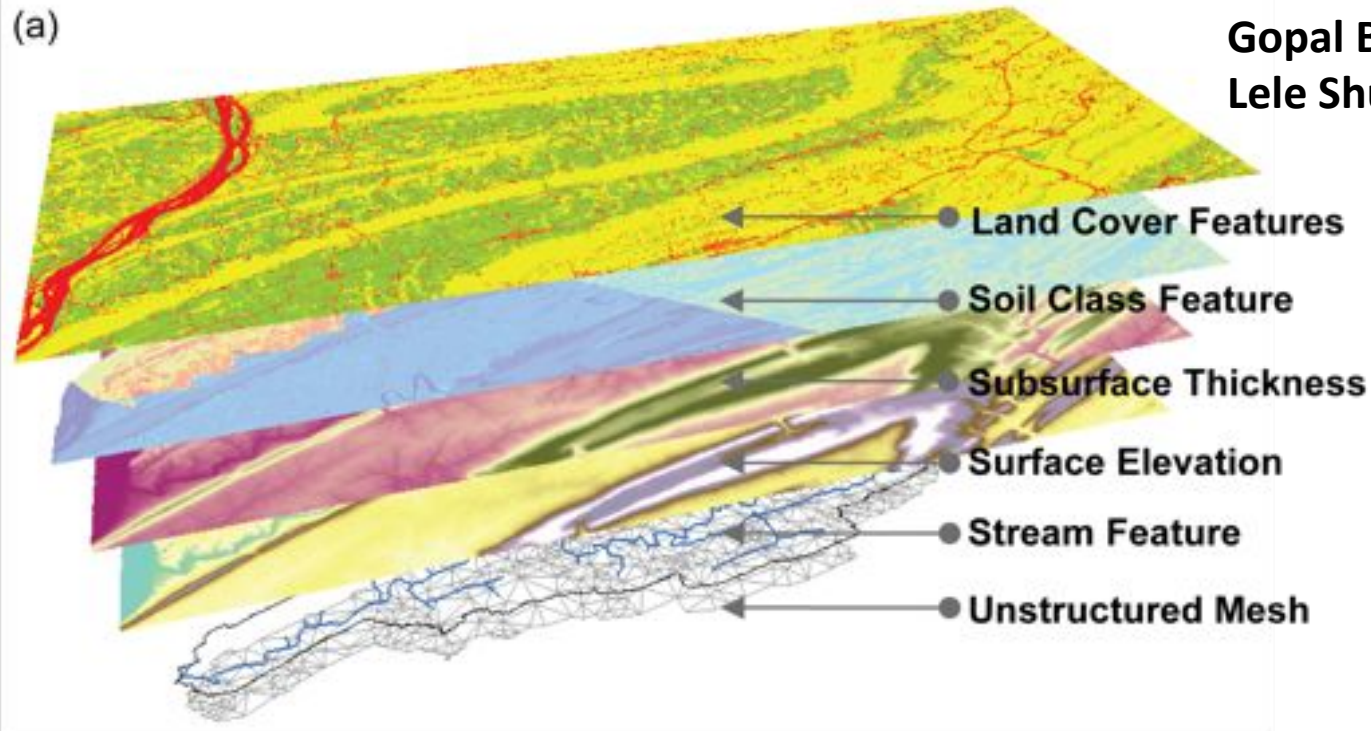


Figure 7: Web application interface to select HUC-12s within the CONUS. The user can select all HUC-12s within a US state (a) or county (b) or select individual HUC-12s (c) to construct a selection list (d). (under development)

# Desktop Data-Model Workflow

Gopal Bhatt  
Lele Shu



**Data Parameterization:** defined by representative parameter value of each data layer for each element

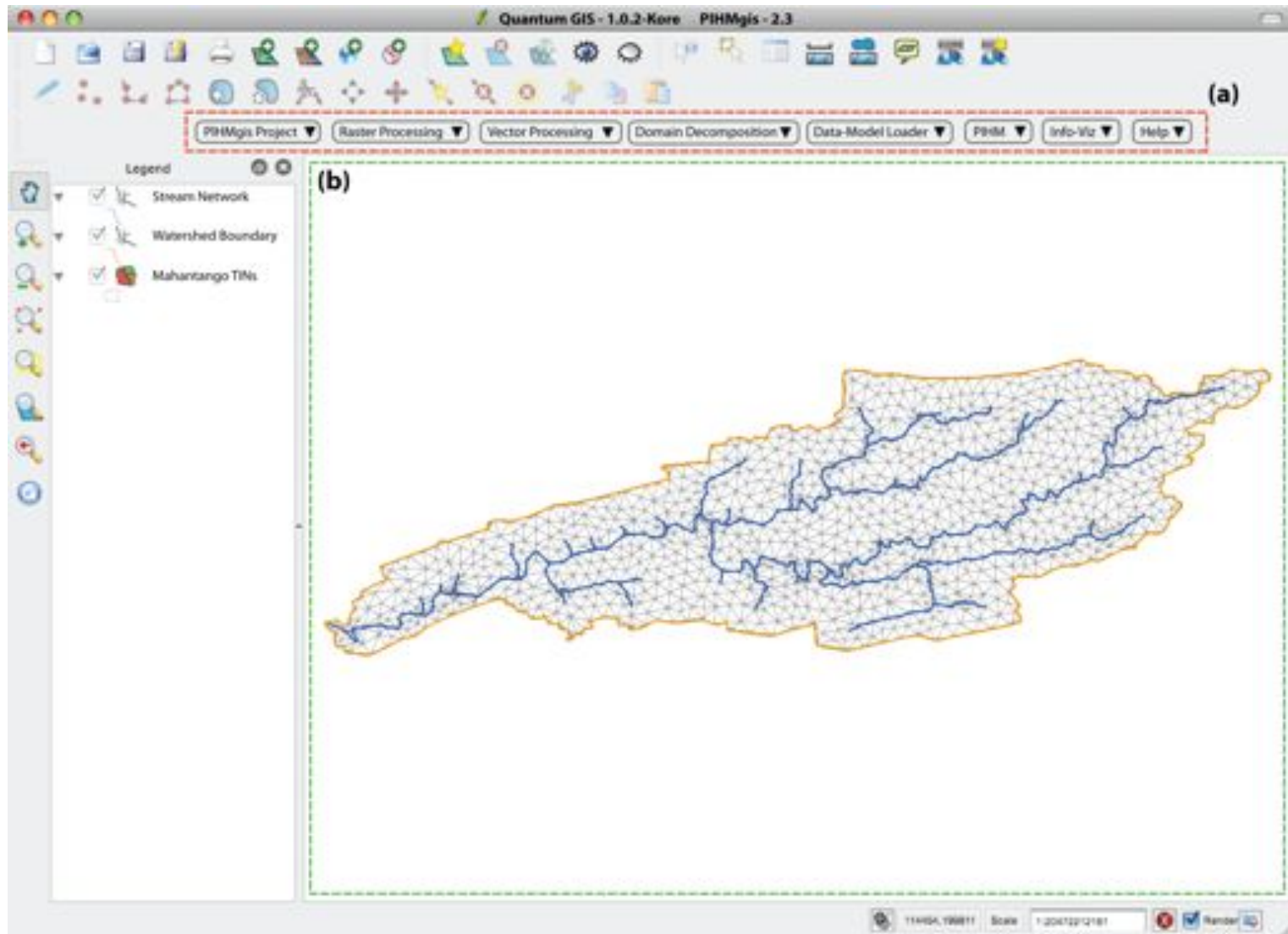


**Topology for channel segments:** defined by From Node, To Node, Upstream Segment, Downstream segment, Left TIN element, Right TIN element



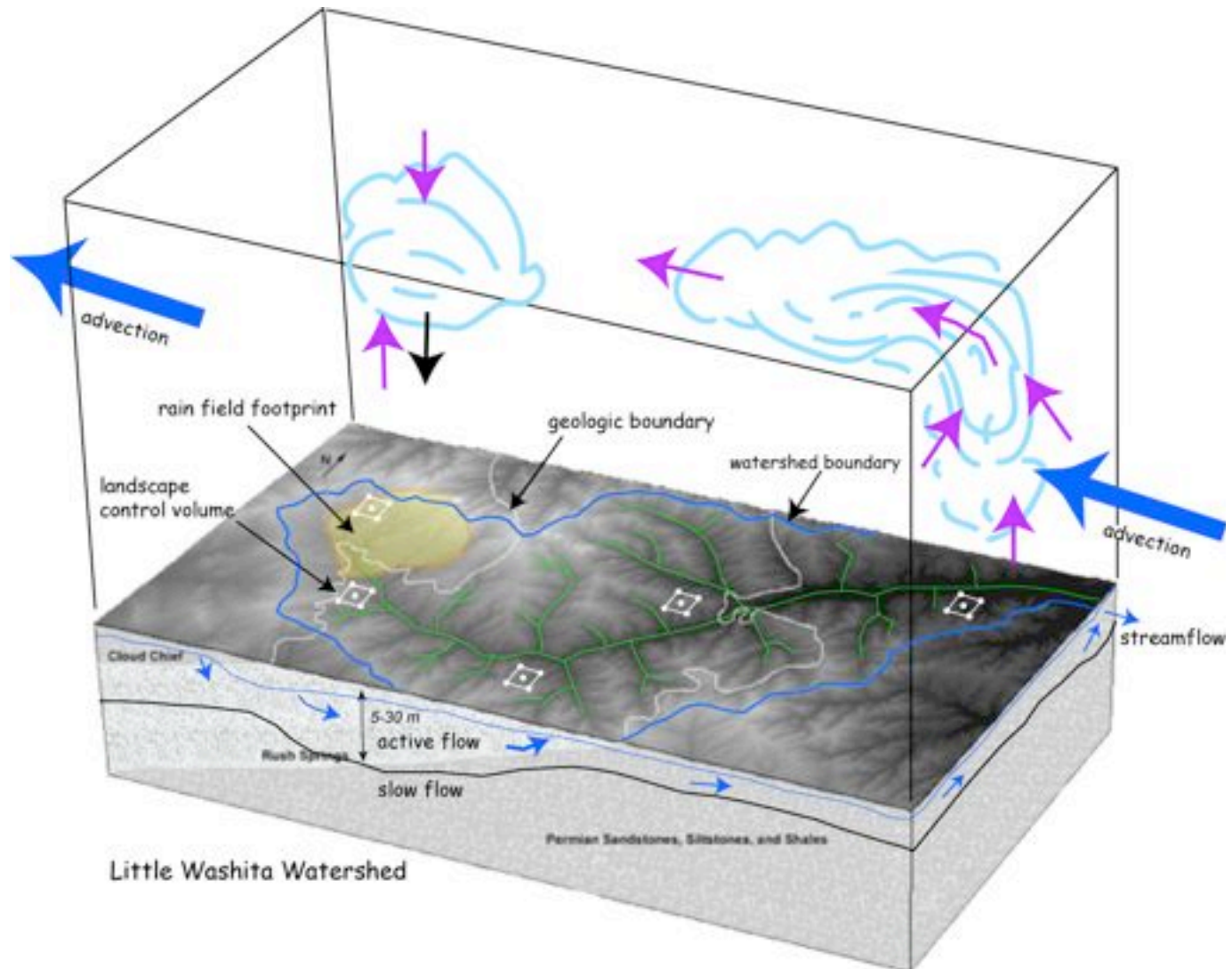
# PIHM GIS: Desktop Tools for collaboration

Gopal Bhatt author

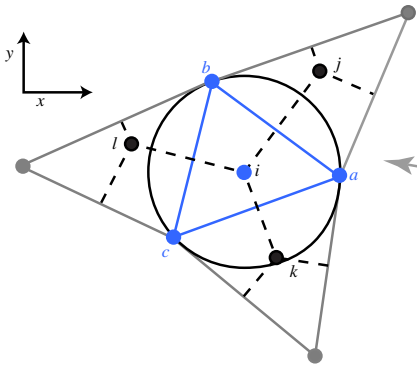


# Role of the Conceptual Model

Defining the model purpose, scale, processes & data resources



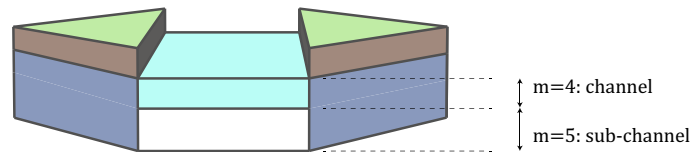
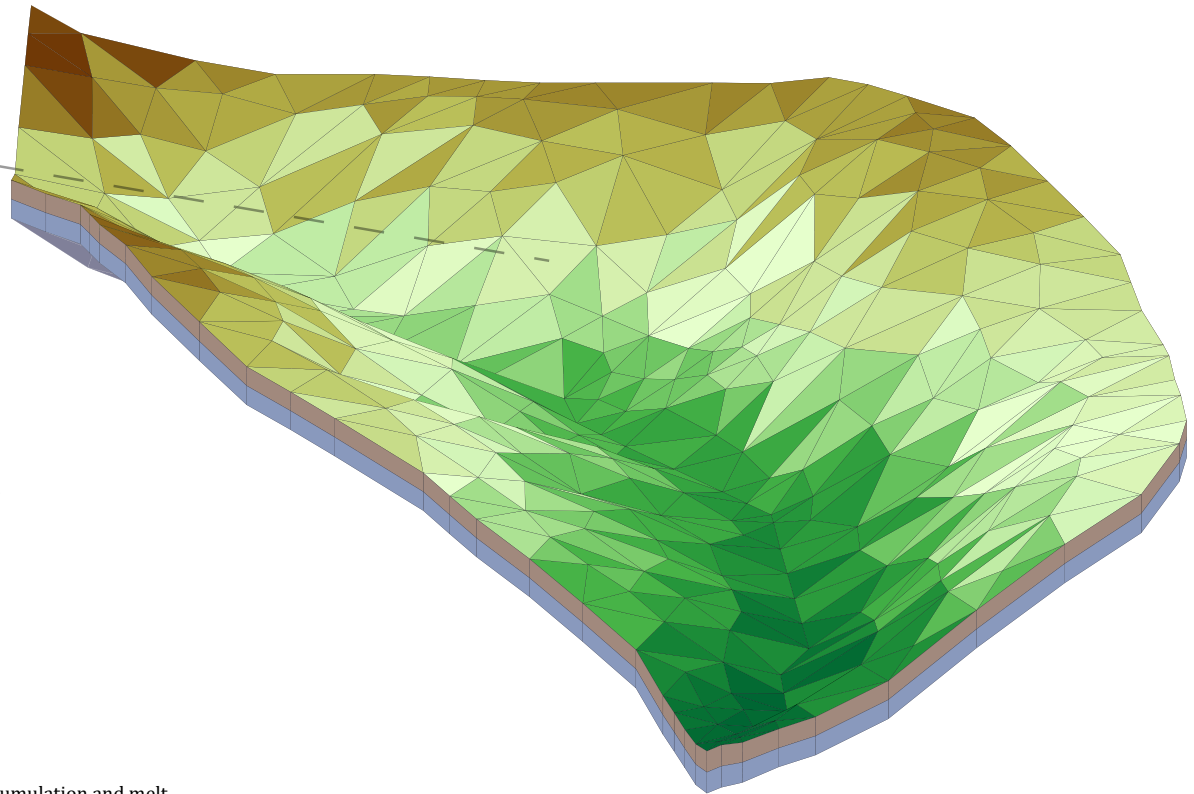
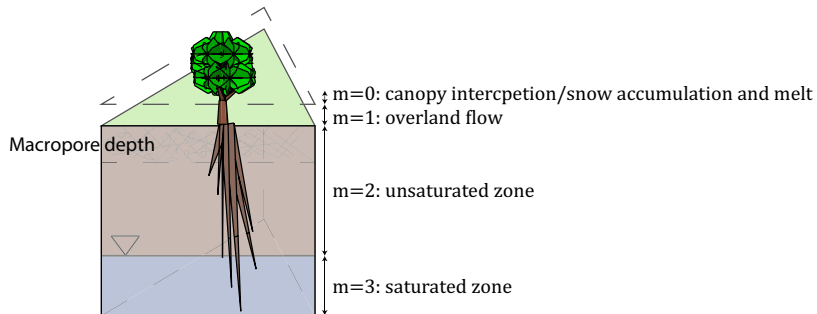
# PIHM



$$\frac{\partial \varphi}{\partial t} = \nabla \cdot (\varphi U) + \nabla \cdot (\Gamma \nabla \varphi) + Q_{ss}$$

$$\frac{\partial}{\partial t} \int_{V_i} \varphi dV = \int_{A_{ij}} \bar{n} \cdot (\varphi U) dA + \int_{A_{ij}} \bar{n} \cdot (\Gamma \nabla \varphi) dA + \int_{V_i} Q_{ss} dV$$

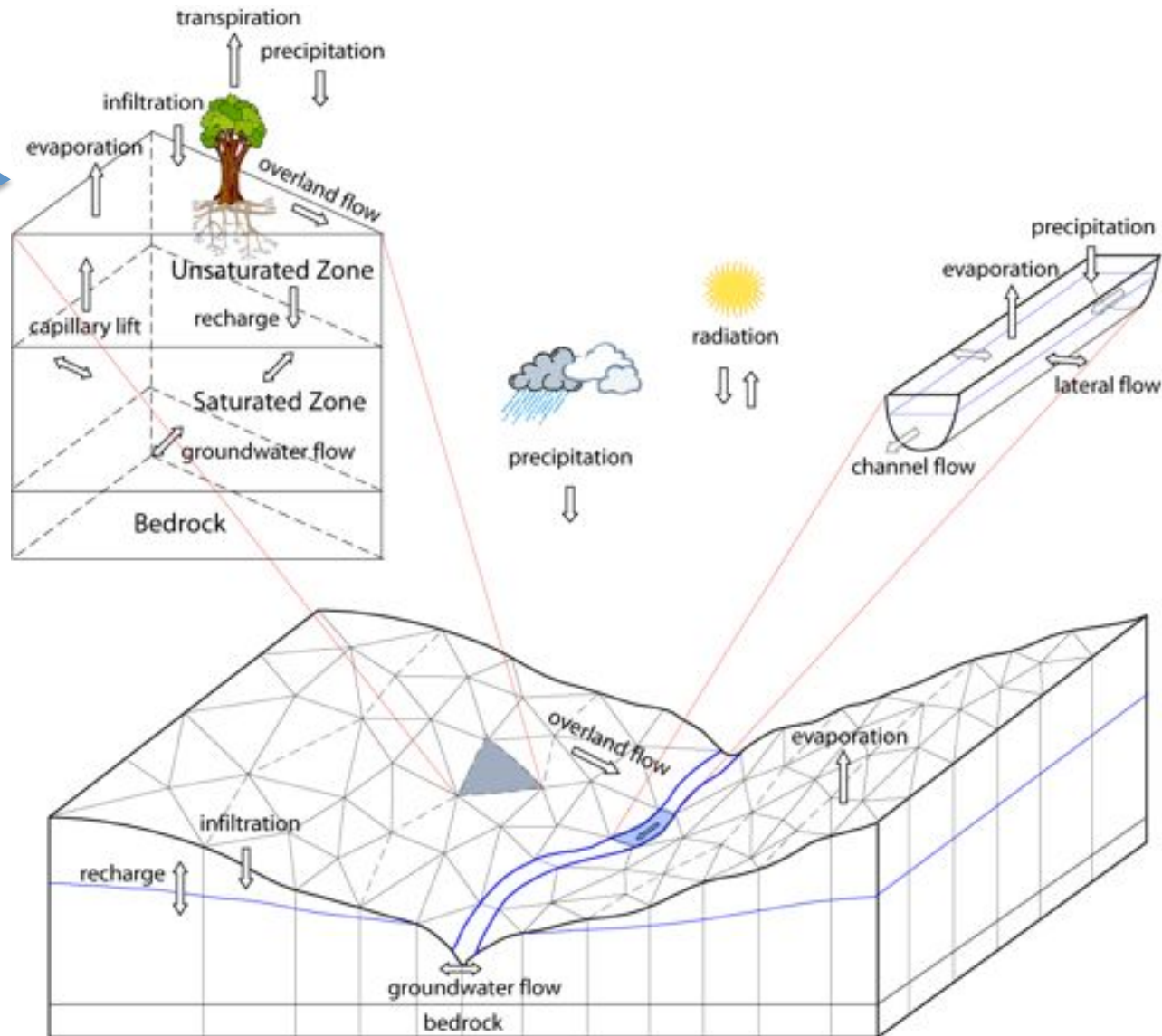
$$\left\{ A_i \frac{d\bar{\varphi}}{dt} = \sum_j \bar{n} \cdot \bar{C} A_{ij} + \sum_j \bar{n} \cdot \bar{D} A_{ij} + \bar{Q}_{ss} V_i \right\}_{m=0,1,\dots,5}$$





# Fully coupled processes but with reduced physics (ASAP)

NOAH Land  
Surface  
Model



# Semi-Discrete Finite Volume Formulation

Process	Governing equation/model	Original governing equations	Semi-discrete form
Channel Flow	St. Venant Equation	$\frac{\partial h}{\partial t} + \frac{\partial(uh)}{\partial x} = q$	$\left( \frac{d\zeta}{dt} = P_c - \sum Q_{gc} + \sum Q_{oc} + Q_m - Q_{out} - E_c \right)_i^{[1]}$
Overland Flow		$\frac{\partial h}{\partial t} + \frac{\partial(uh)}{\partial x} + \frac{\partial(vh)}{\partial y} = q$	$\left( \frac{\partial h}{\partial t} = P_o - I - E_o - Q_{oc} + \sum_{j=1}^3 Q_s^y \right)_i^{[1]}$
Unsaturated Flow	Richard Equation	$C(\psi) \frac{\partial \psi}{\partial t} = \nabla \cdot (K(\psi) \nabla (\psi + Z))$	$\left( \frac{d\zeta}{dt} = I - q^0 - ET_s \right)_i^{[2]}$
Groundwater Flow		$C(\psi) \frac{\partial \psi}{\partial t} = \nabla \cdot (K(\psi) \nabla (\psi + Z))$	$\left( \frac{d\zeta}{dt} = q^0 + \sum_{j=1}^3 Q_g^y - Q_i + Q_{gc} \right)_i^{[3]}$
Interception	Bucket Model	$\frac{dS_i}{dt} = P - E_i - P_o$	$\left( \frac{dS_i}{dt} = P - E_i - P_o \right)_i$
Snowmelt	Temperature Index Model	$\frac{dS_{snow}}{dt} = P - E_{snow} - \Delta W$	$\left( \frac{dS_{snow}}{dt} = P - E_{snow} - \Delta W \right)_i$
Evapotranspiration	Pennman-Monteith Method	$ET_0 = \frac{\Delta(R_n - G) + \rho_a C_p \frac{(e_s - e_a)}{r_a}}{\Delta + \gamma(1 + \frac{r_a}{r_s})}$	$\left( \frac{\Delta(R_n - G) + \rho_a C_p \frac{(e_s - e_a)}{r_a}}{\Delta + \gamma(1 + \frac{r_a}{r_s})} \right)_i$



## *Example 1: The Susquehanna/Shale Hills Critical Zone Observatory*

Advancing interdisciplinary studies of  
earth surface processes

Chris Duffy, PI 07-13

Sue Brantley

Rudy Slingerland

David Eissenstat

Henry Lin

Ken Davis

Kamini Singha

Laura Toran

Pat Reed

Karen Salvage

Eric Kirby

Tim White

Kevin Dressler

Doug Miller

Brian Bills

Beth Boyer

Colin Duffy

Ray Fletcher

Michelle Tuttle

Paul Bierman

Peter Lichtner

Carl Steefel

Rich April

Ryan Mather

David Harbor

Larry McKay

Teferi Tsegaye

HernanSantos

Evan Thomas

Xuan Yu

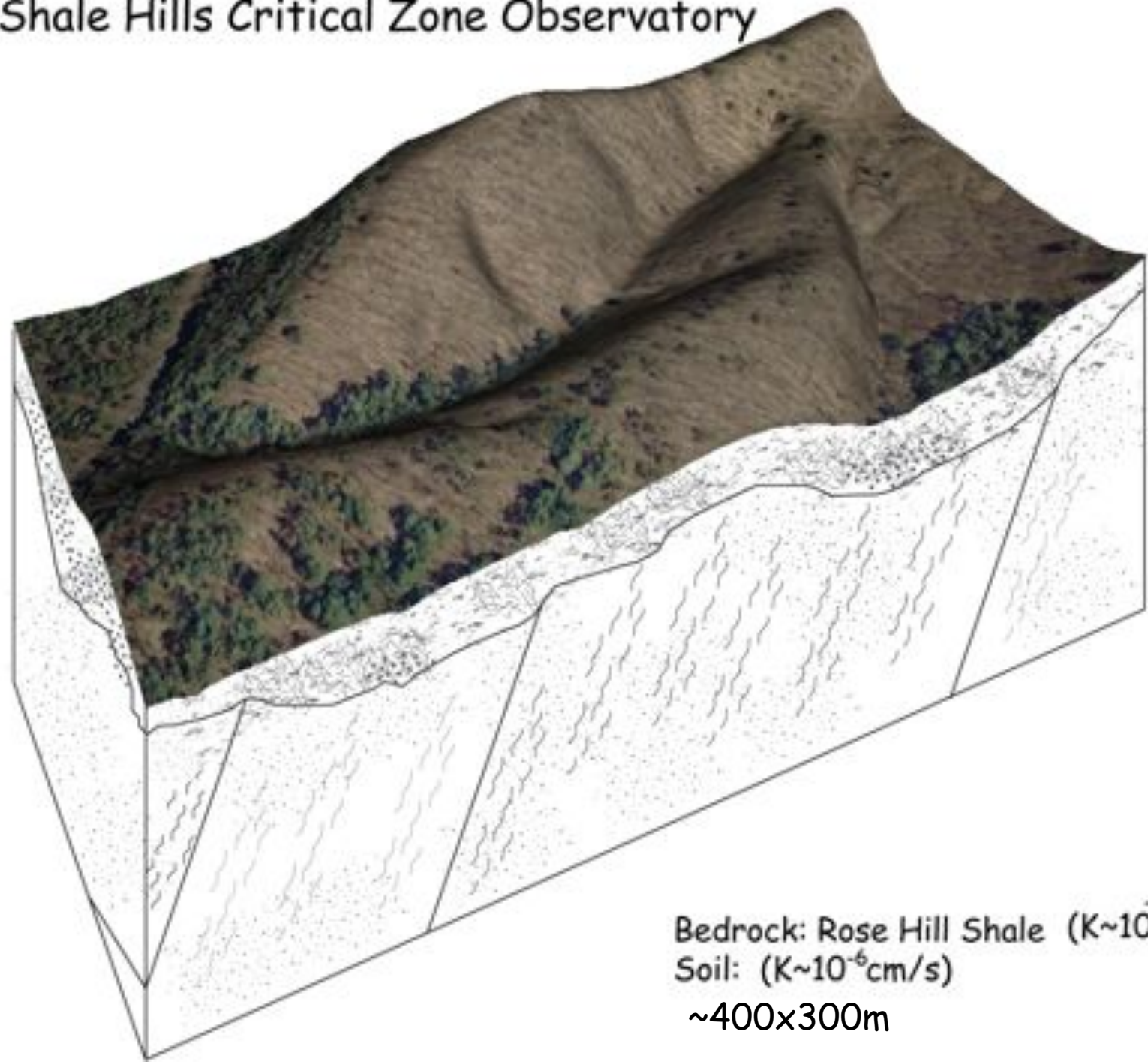
Yu Zhang

Ryan Jones

Beth Boyer



# The Shale Hills Critical Zone Observatory



Bedrock: Rose Hill Shale ( $K \sim 10^{-15}$  cm/s)  
Soil: ( $K \sim 10^{-6}$  cm/s)  
~400x300m



# Legend

\*\* Note: Triangle symbols indicate streaming data.  
 \*\*\*Note: Instruments in dashed box contribute to 5180/5D network.

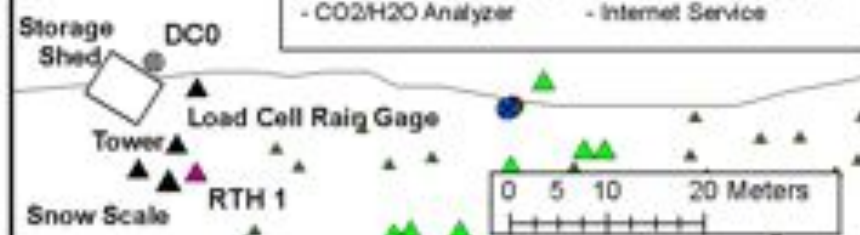
- |                         |                                |
|-------------------------|--------------------------------|
| SapFlow Sensors         | Lysimeters                     |
| Super Sites*            | Daily Water (5180/5D) Sampling |
| Piezometer (Unscreened) | Piezometer (Screened)          |
| RTH net                 | Ridge Tower/Instrumentation    |
| COSMOS                  | Tipping Buckets                |
| Tensiometers            | CZMW (Bedrock Wells)           |
| Soil Moisture Sensors   | Tree Survey                    |
| Soil Gas Sensors        |                                |

## Real-Time Monitoring (RTH net):

- |                     |                            |
|---------------------|----------------------------|
| - Wind Speed        | - Soil Moisture            |
| - Wind Direction    | - Well Water Depth         |
| - Air Temperature   | - Stream Gage Height       |
| - Relative Humidity | - Stream Water Temperature |
| - Leaf Wetness      |                            |

## Instruments Installed on Tower:

- |                               |                                              |
|-------------------------------|----------------------------------------------|
| - Laser Precipitation Monitor | - Air Temperature Probe                      |
| - Phenocam                    | - Relative Humidity Probe                    |
| - Net Radiometer              | - Photosynthetically Active Radiation Sensor |
| - 3-D Sonic Anemometer        | - Leaf Wetness Sensor                        |
| - CO2/H2O Analyzer            | - Internet Service                           |



Communications Shed

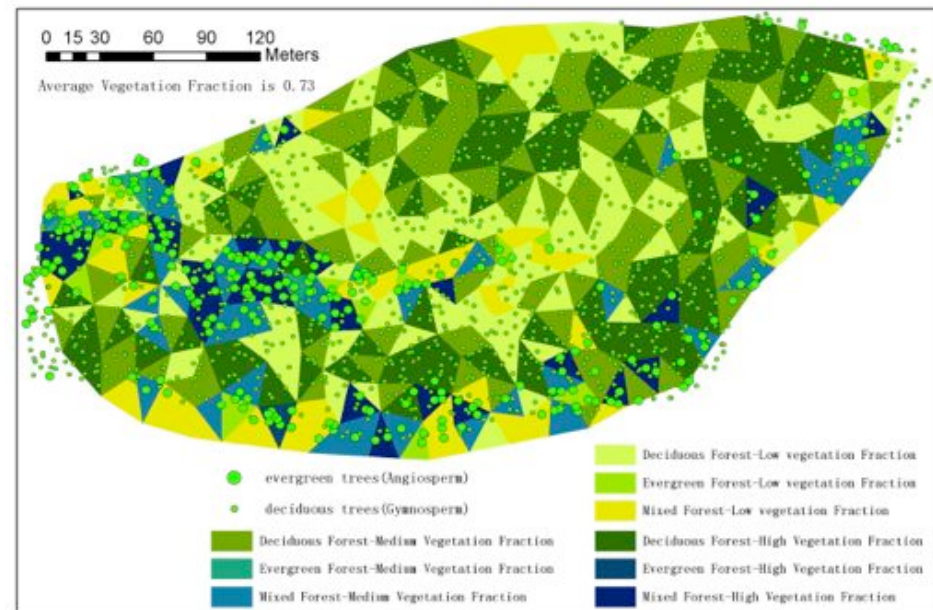
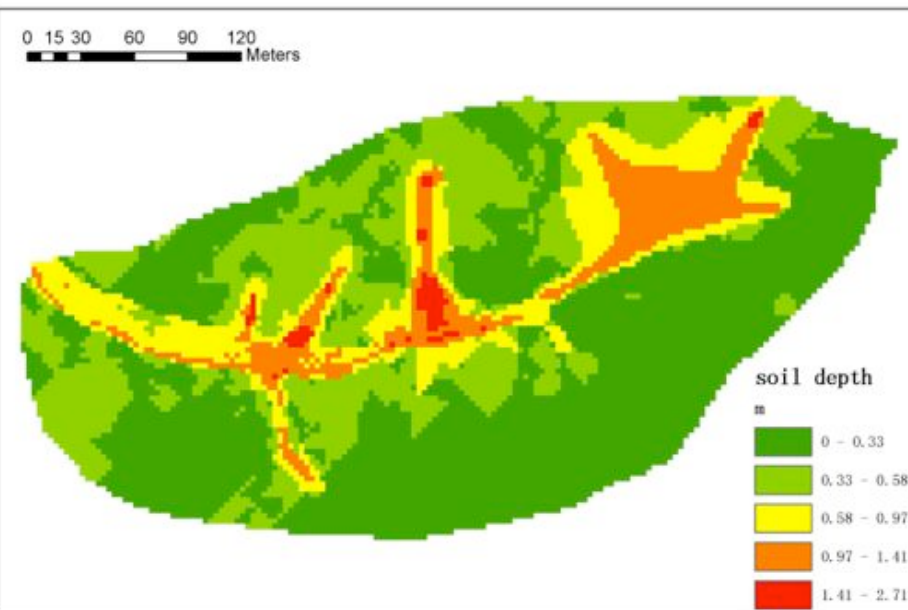
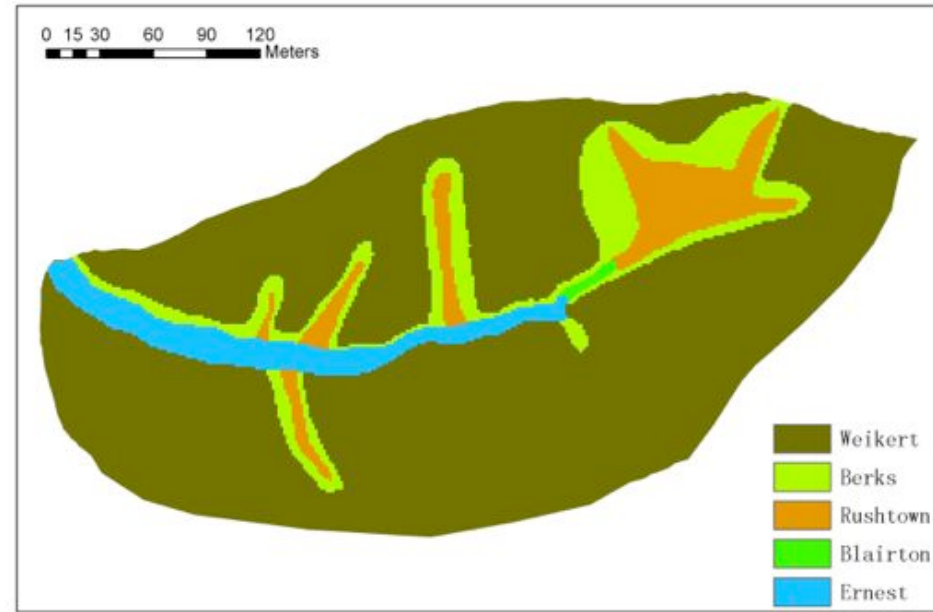
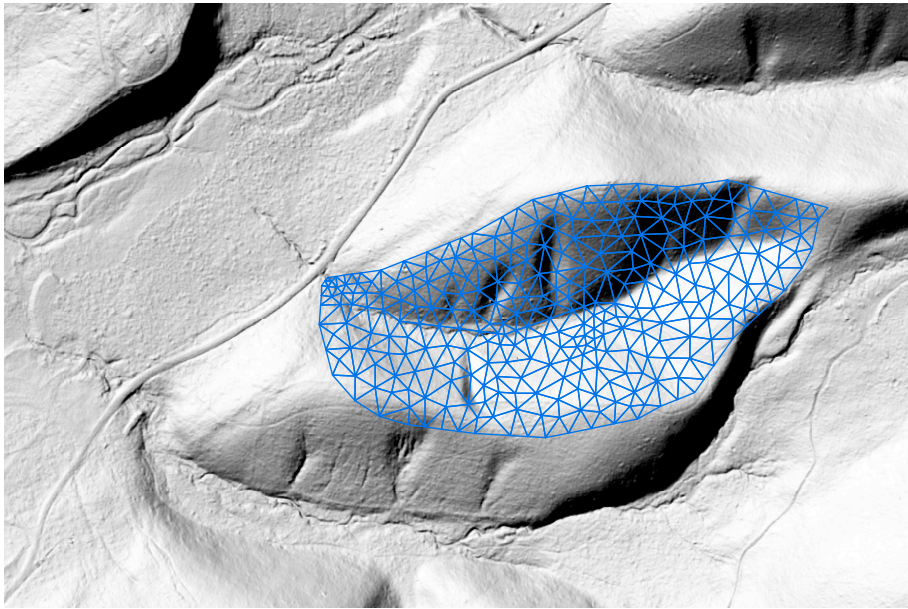


0 12.5 25 50 75 100  
 Meters

## \*Sensors Typically Located in Super Sites

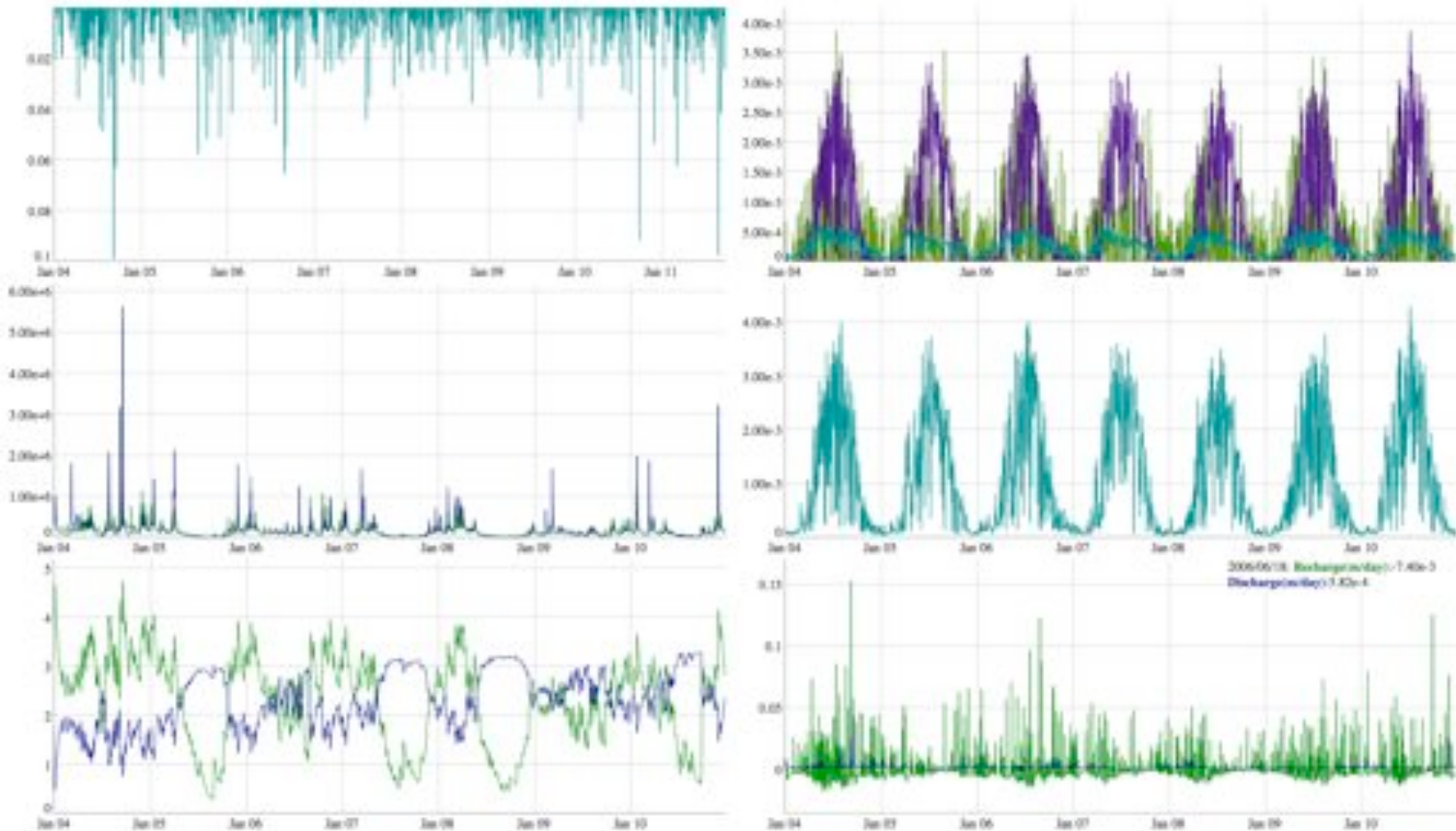
- |                         |
|-------------------------|
| Piezometer (Unscreened) |
| Tensiometers            |
| Soil Moisture Sensors   |
| Tipping Buckets         |

# CZO Data -> lidar, Soil, Regolith, Veg



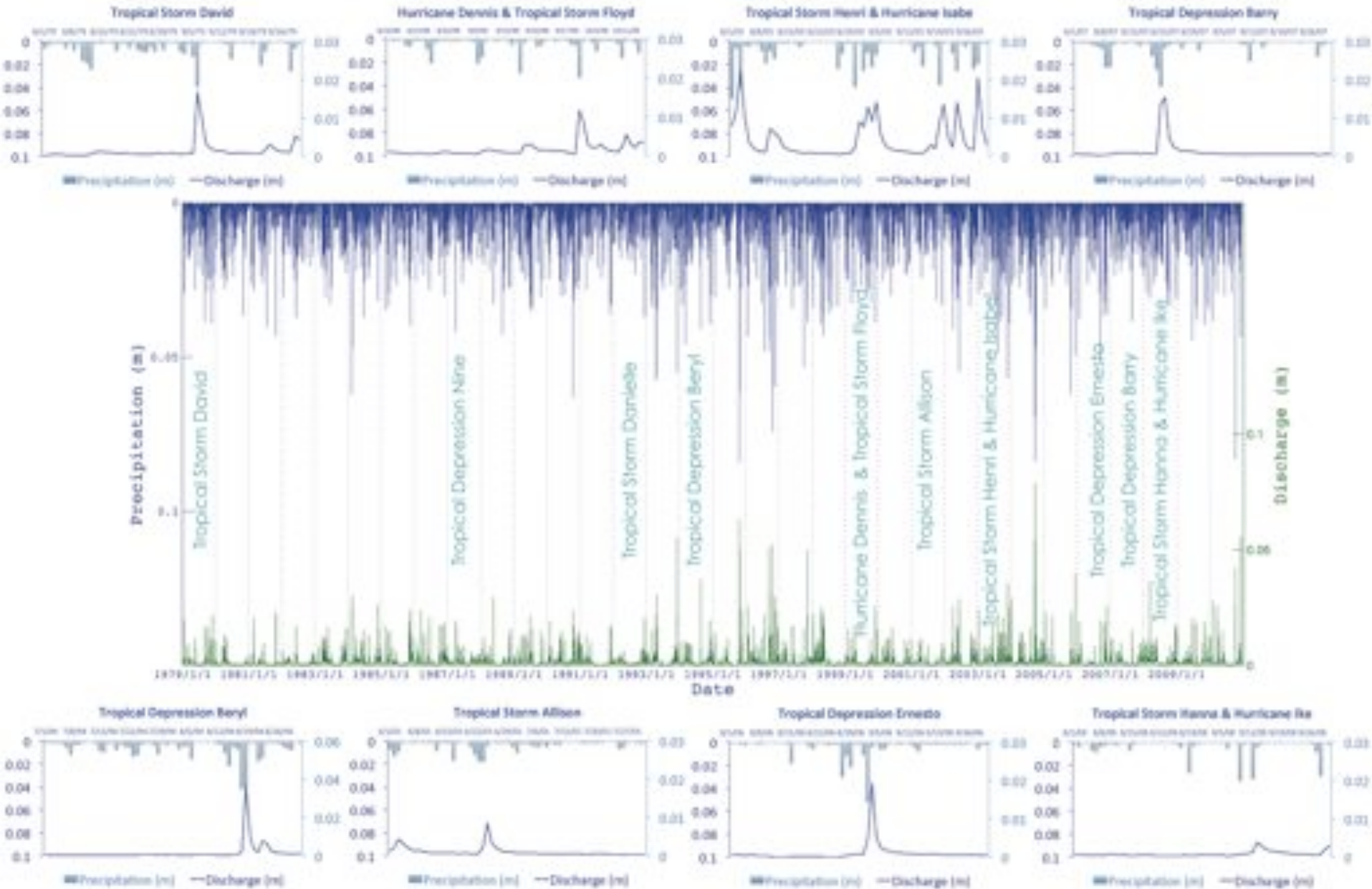


# Reconstructing the Hydrologic Site History: 1979-Present from Reanalysis



<http://www.pihm.psu.edu/applications.html>

# Reconstructing the CZO Storm Library: 1979-2010



# Example 2

## Wetland Vulnerability to Climate Change

### Team

Chris Duffy  
Xuan Yu  
Gopal Bhatt  
Ray Najaar  
Michael Nassry  
Denice Wardrop

### Ecoregions (4)

Ridge and Valley  
Piedmont  
Unglaciaded Plateau  
Glaciaded Plateau

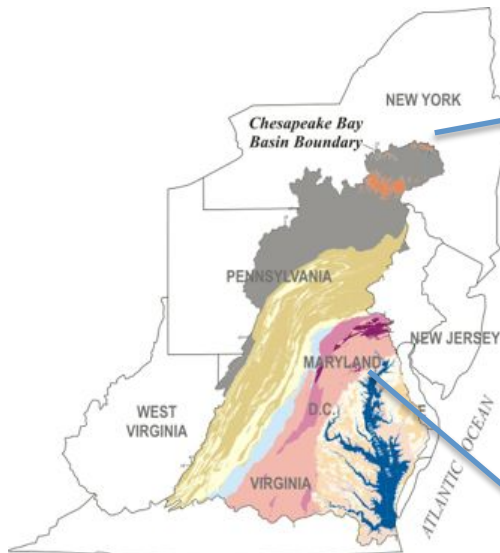
### Watersheds (7)

Muddy Creek  
Kettle Creek  
**Shaver's Creek**  
Young Womans Creek  
East Mahantango Creek  
Little Juniata River  
Lackawanna River

### 20-Year Climate Scenarios (2)

Historical: 1979 - 1998  
Future: 2046 - 2065



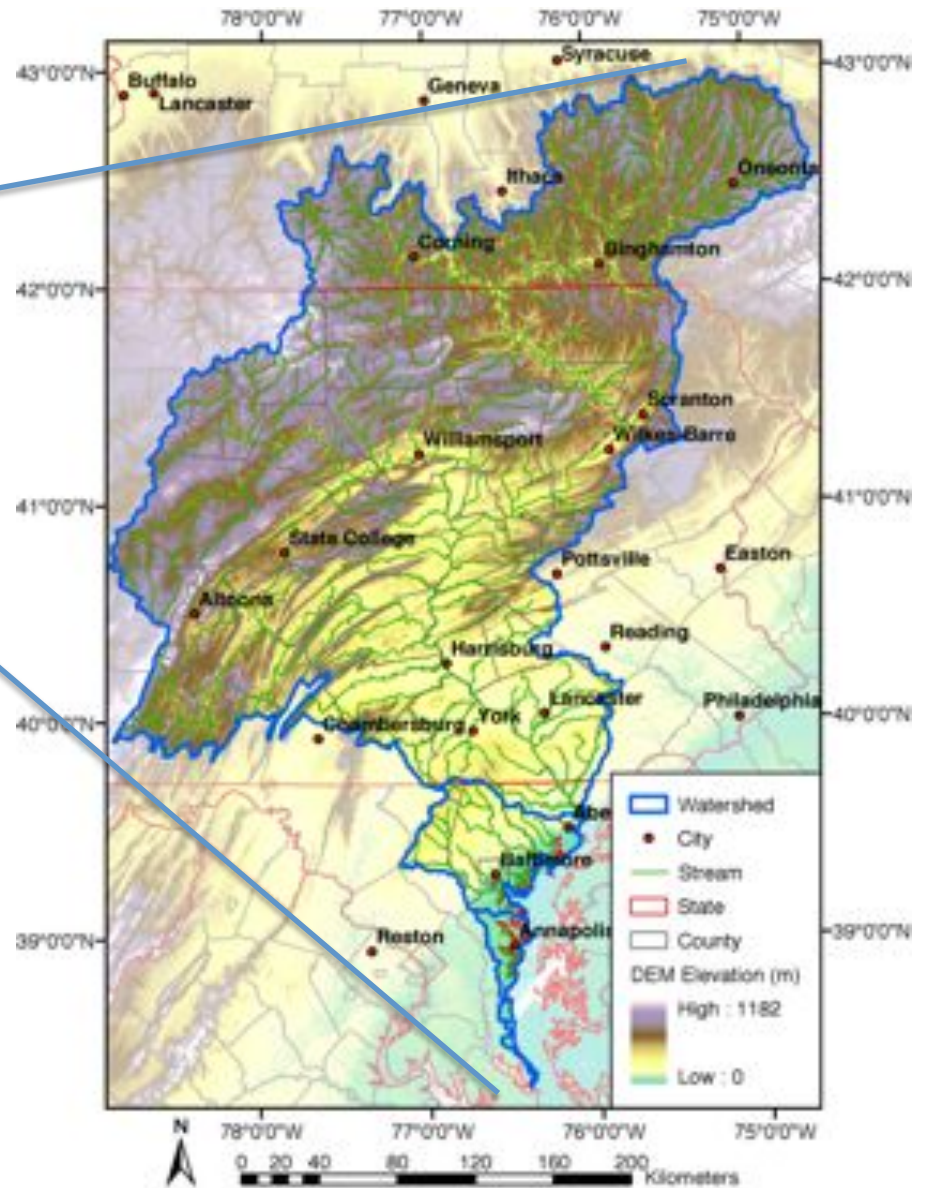


## CHESAPEAKE BAY BASIN

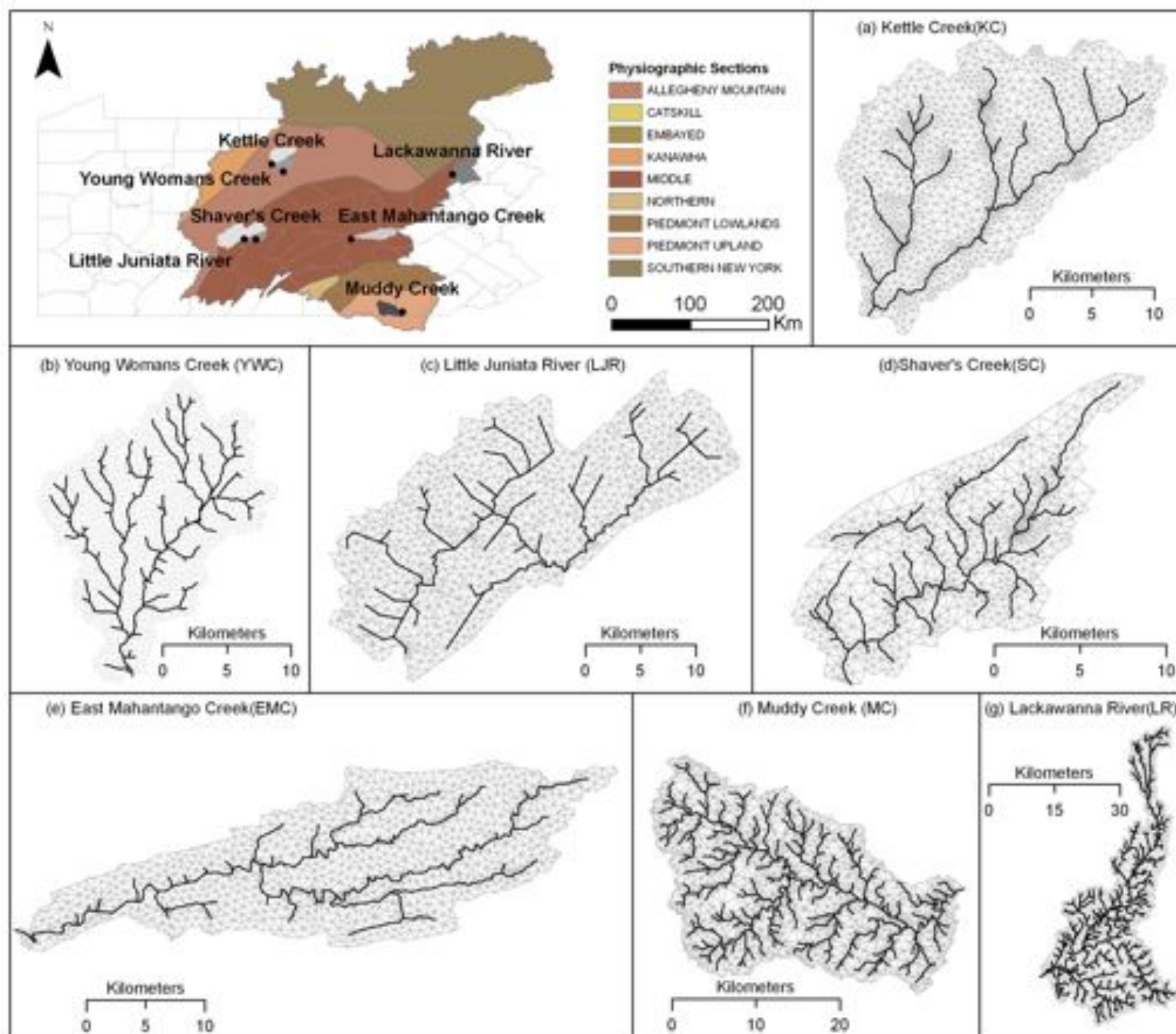
### EXPLANATION

#### HYDROGEOGRAPHIC REGIONS

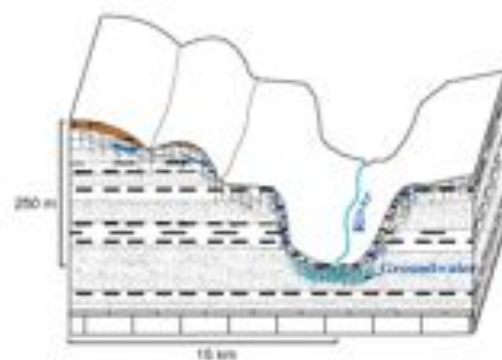
- |                                   |                                |
|-----------------------------------|--------------------------------|
| APPALACHIAN PLATEAU CARBONATE     | MESOZOIC LOWLAND               |
| APPALACHIAN PLATEAU SILICICLASTIC | PIEDMONT CARBONATE             |
| BLUE RIDGE                        | PIEDMONT CRYSTALLINE           |
| COASTAL PLAIN DISSECTED UPLAND    | VALLEY AND RIDGE CARBONATE     |
| COASTAL PLAIN LOWLAND             | VALLEY AND RIDGE SILICICLASTIC |
| COASTAL PLAIN UPLAND              |                                |







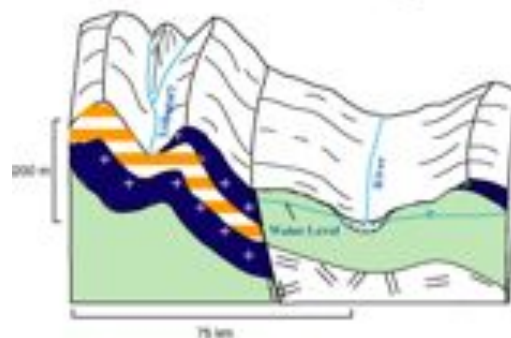
# Conceptual Model for Appalachian Plateau Galciated, Low-Plateau Section



## Generalized Geologic Column



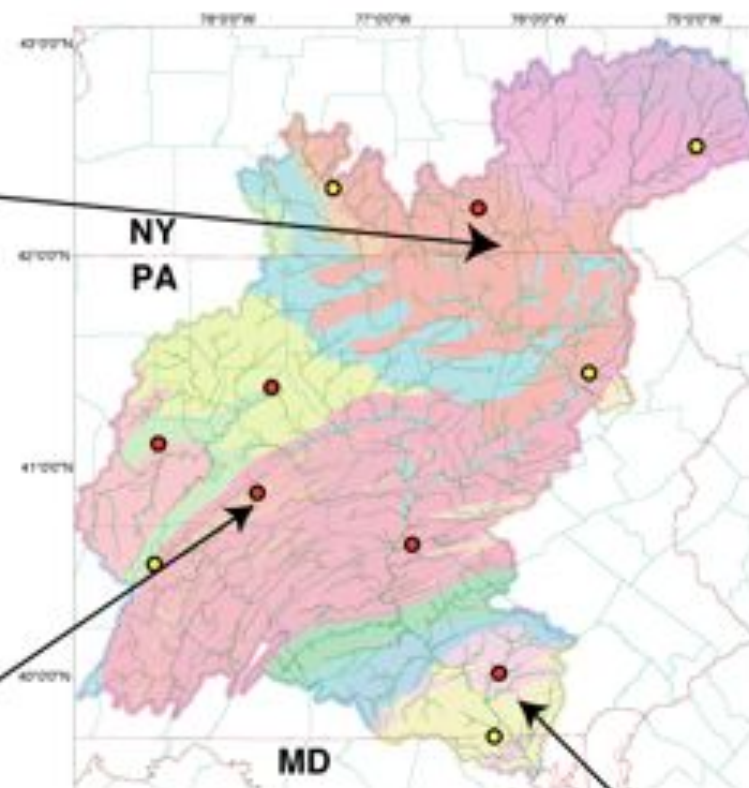
# Conceptual Model for Valley & Ridge, Appalachian Mountain\_Carbonate Valley Section



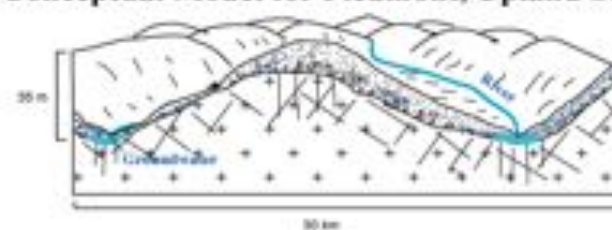
## Generalized Geologic Column



- Legacy testbed
- Proposed testbed



# Conceptual Model for Piedmont, Upland Section



## Generalized Geologic Column





# Workflow

Set up models using HydroTerre data

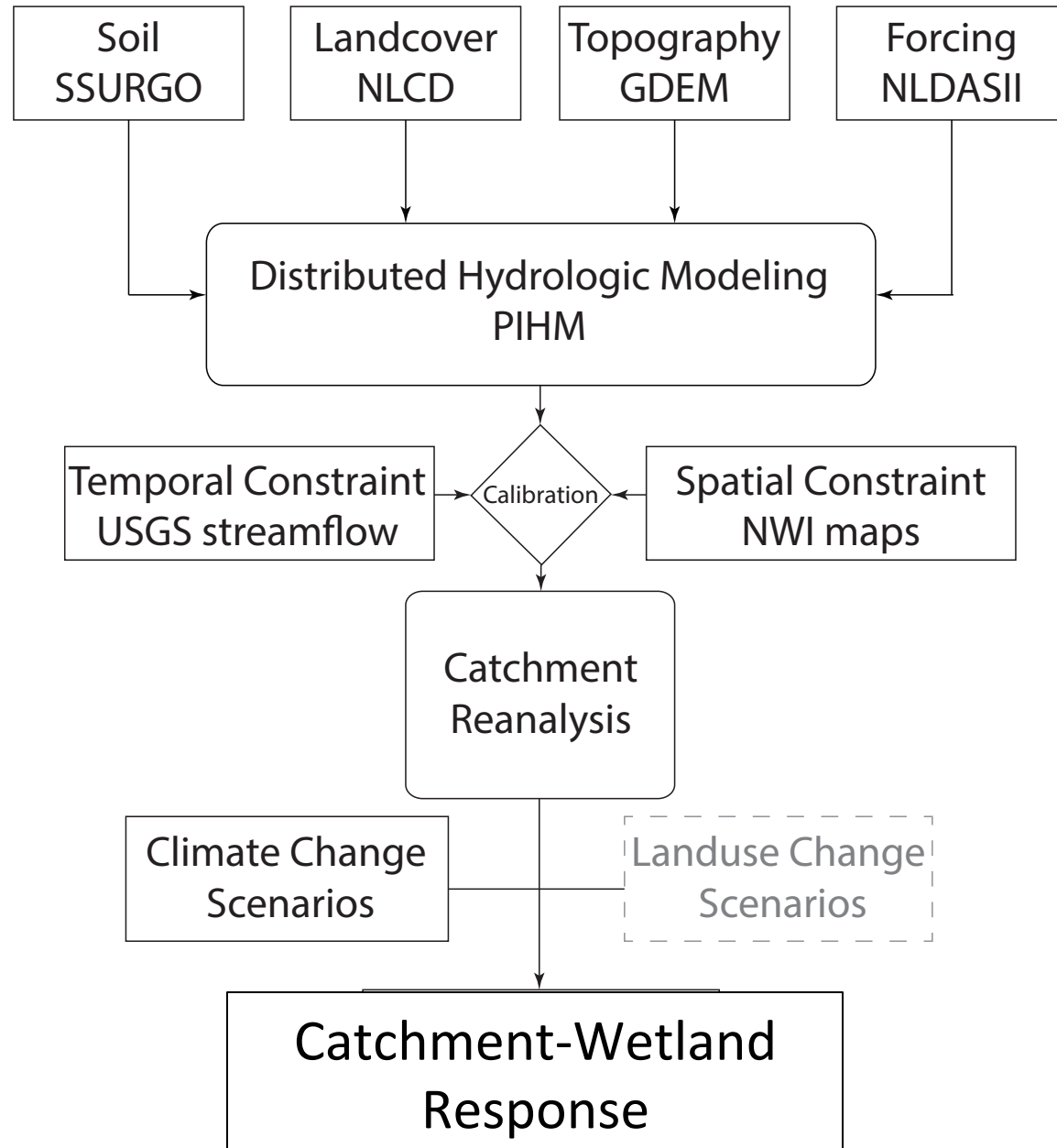
Calibrate catchments on historic data (1979-1998)

HydroGeoMorphic (HGM) classification of wetlands

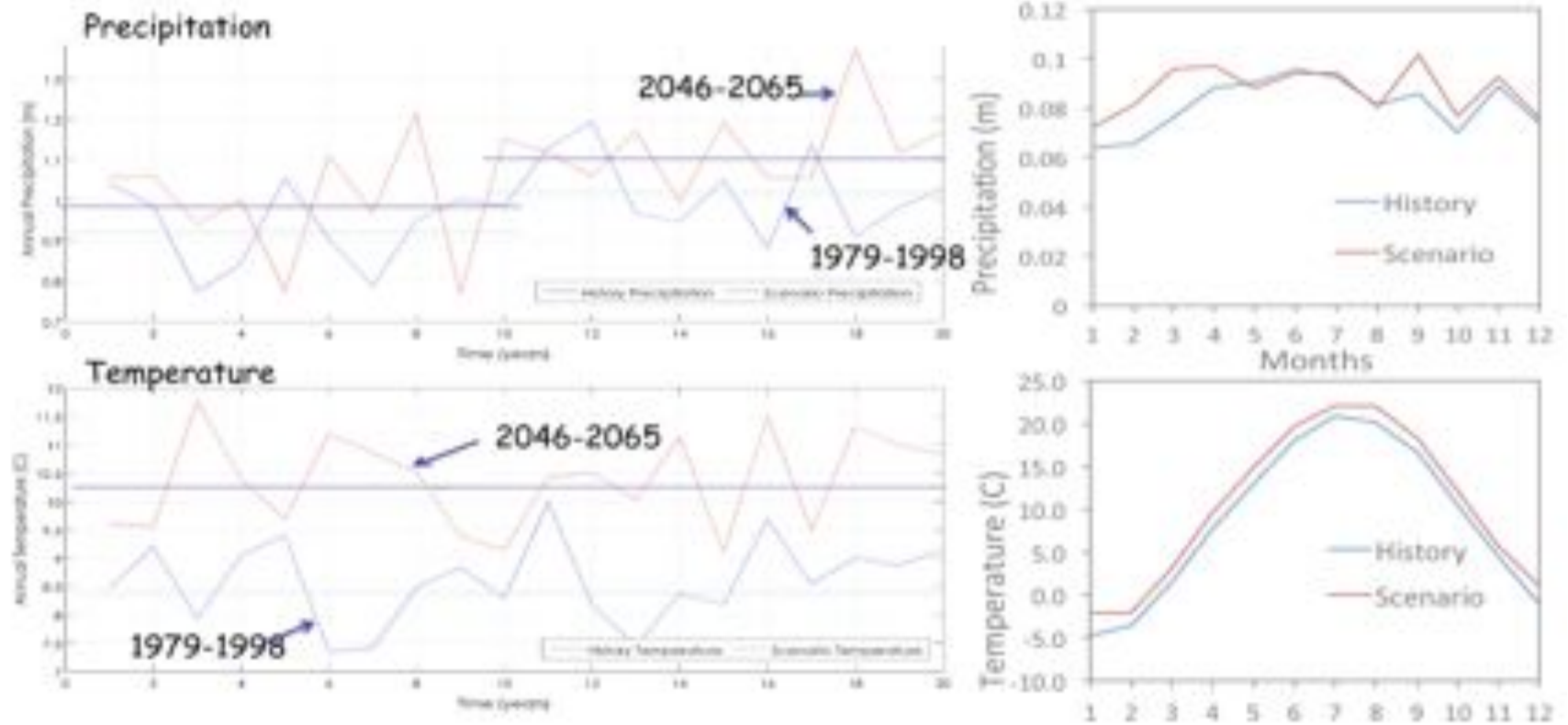
- Riverine
- Slope
- Depression

Run IPCC future climate scenario (2046-2065)

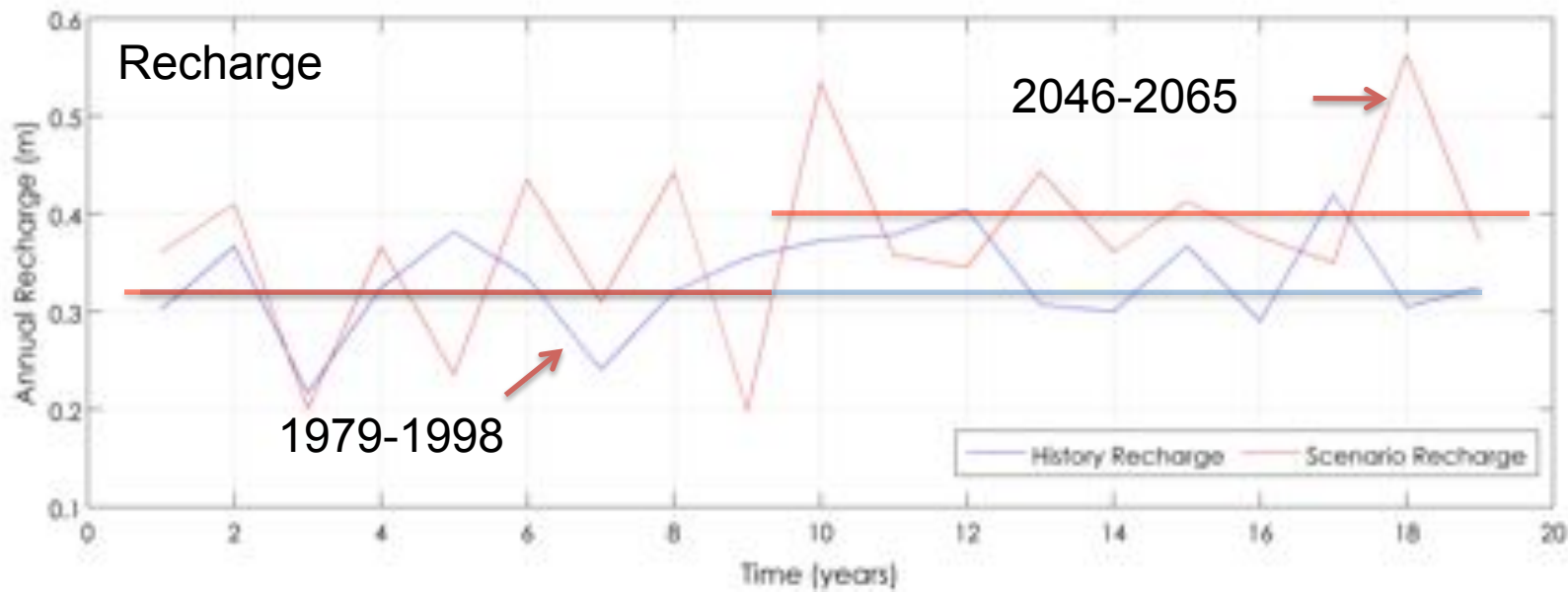
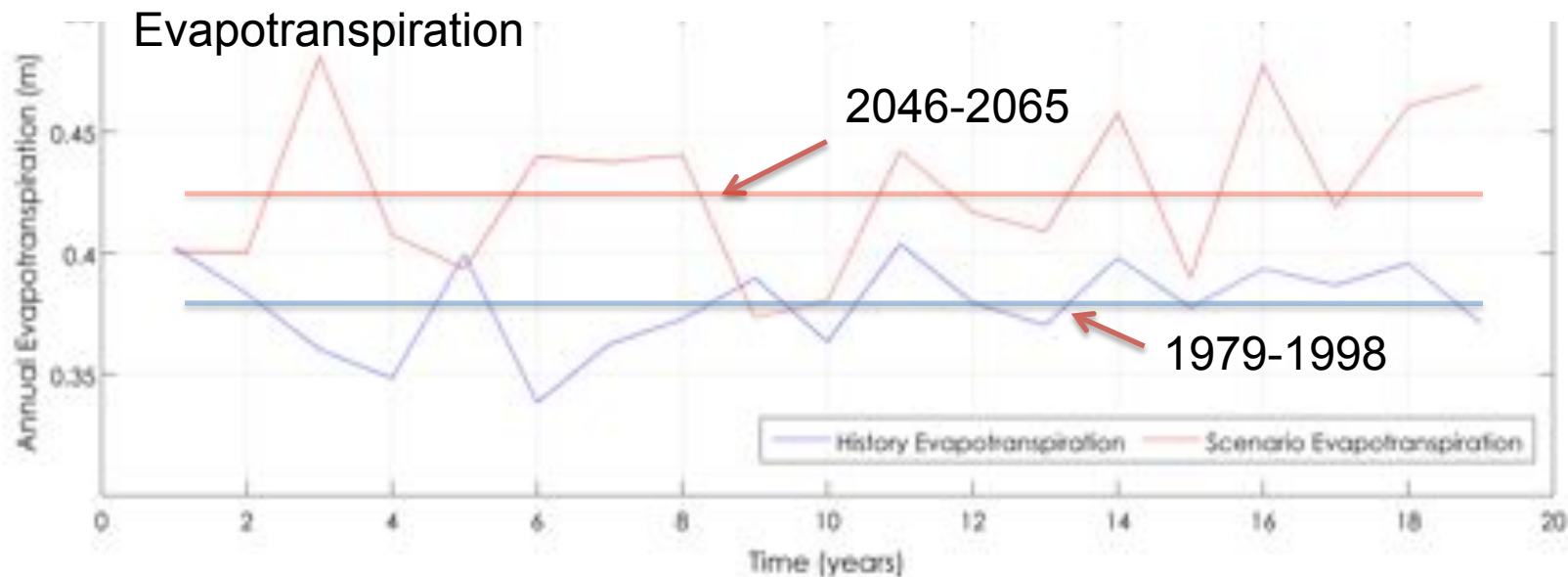
Use relative *gw*/ change to measure wetland vulnerability



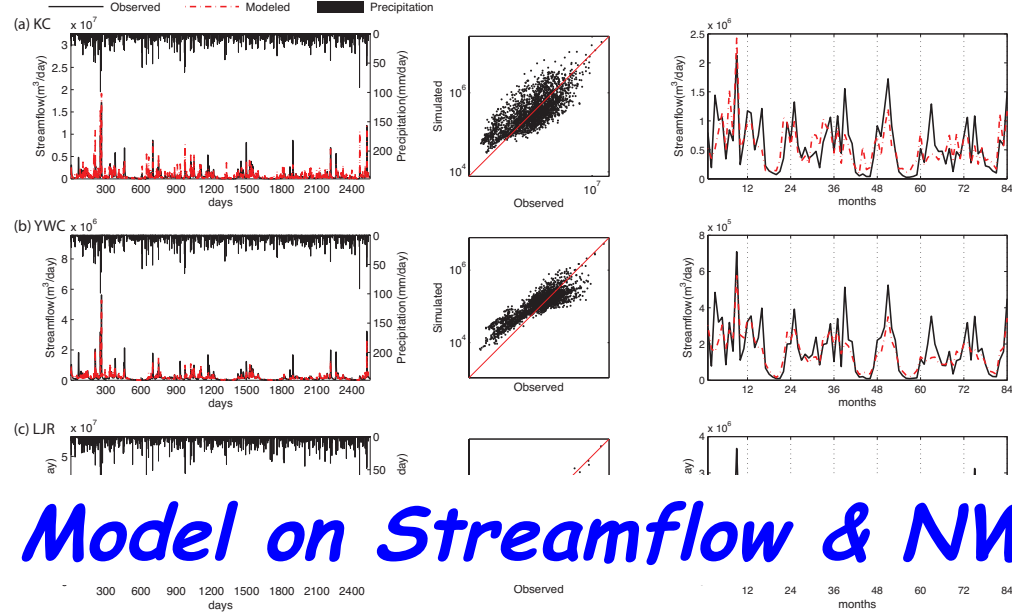
# Historical - IPCC Precip-Temp



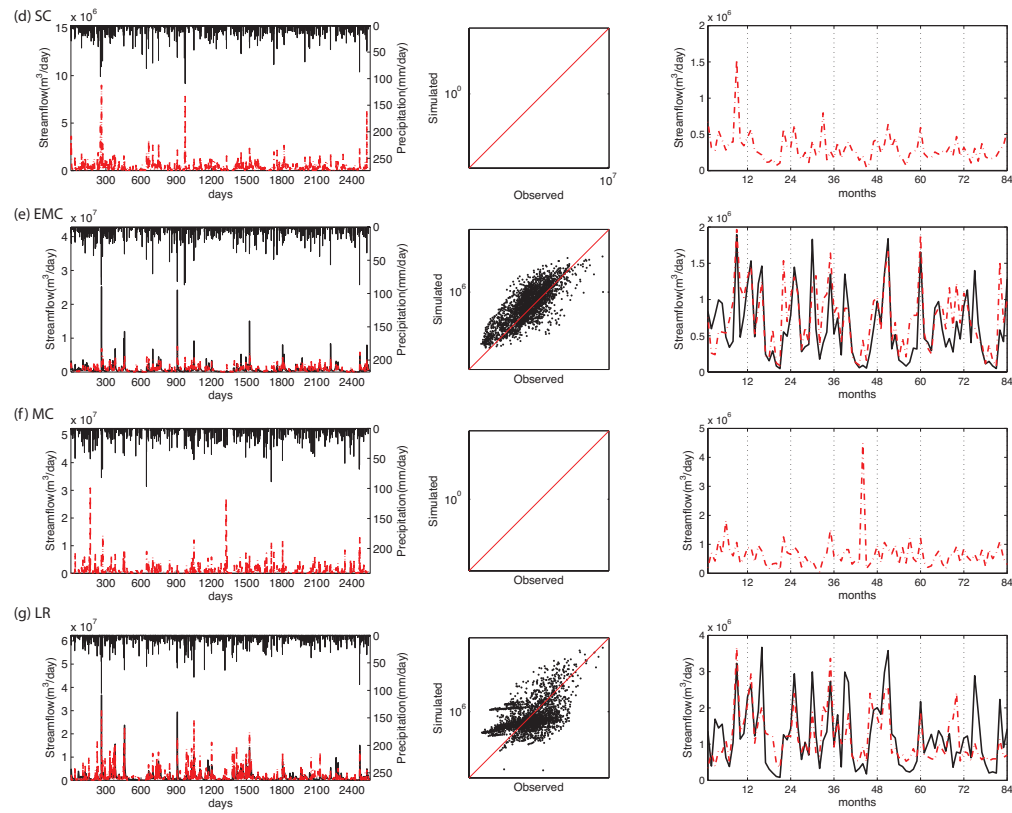
# Historical vs IPCC Simulations



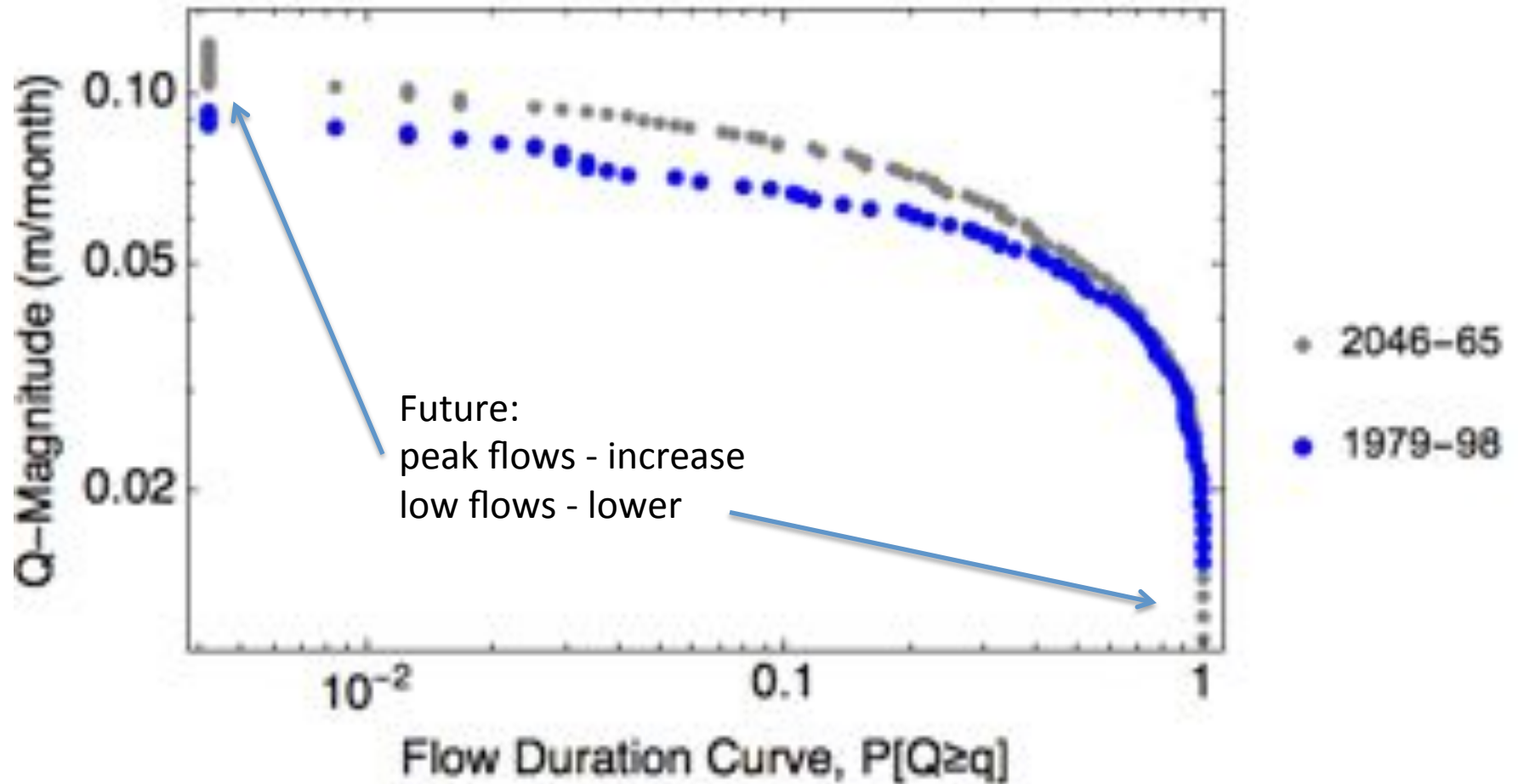




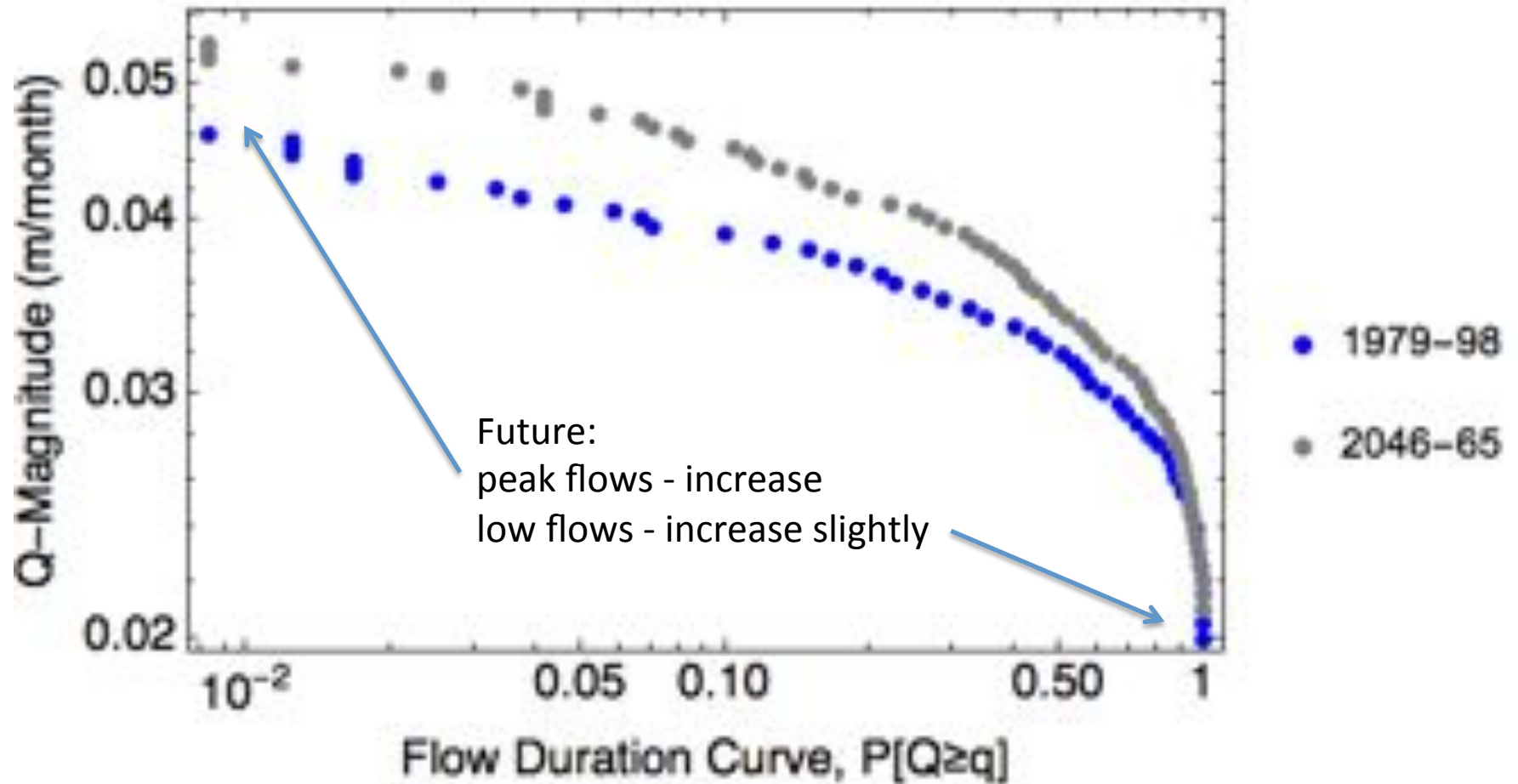
# *"Constrain" Model on Streamflow & NWI Wetlands*



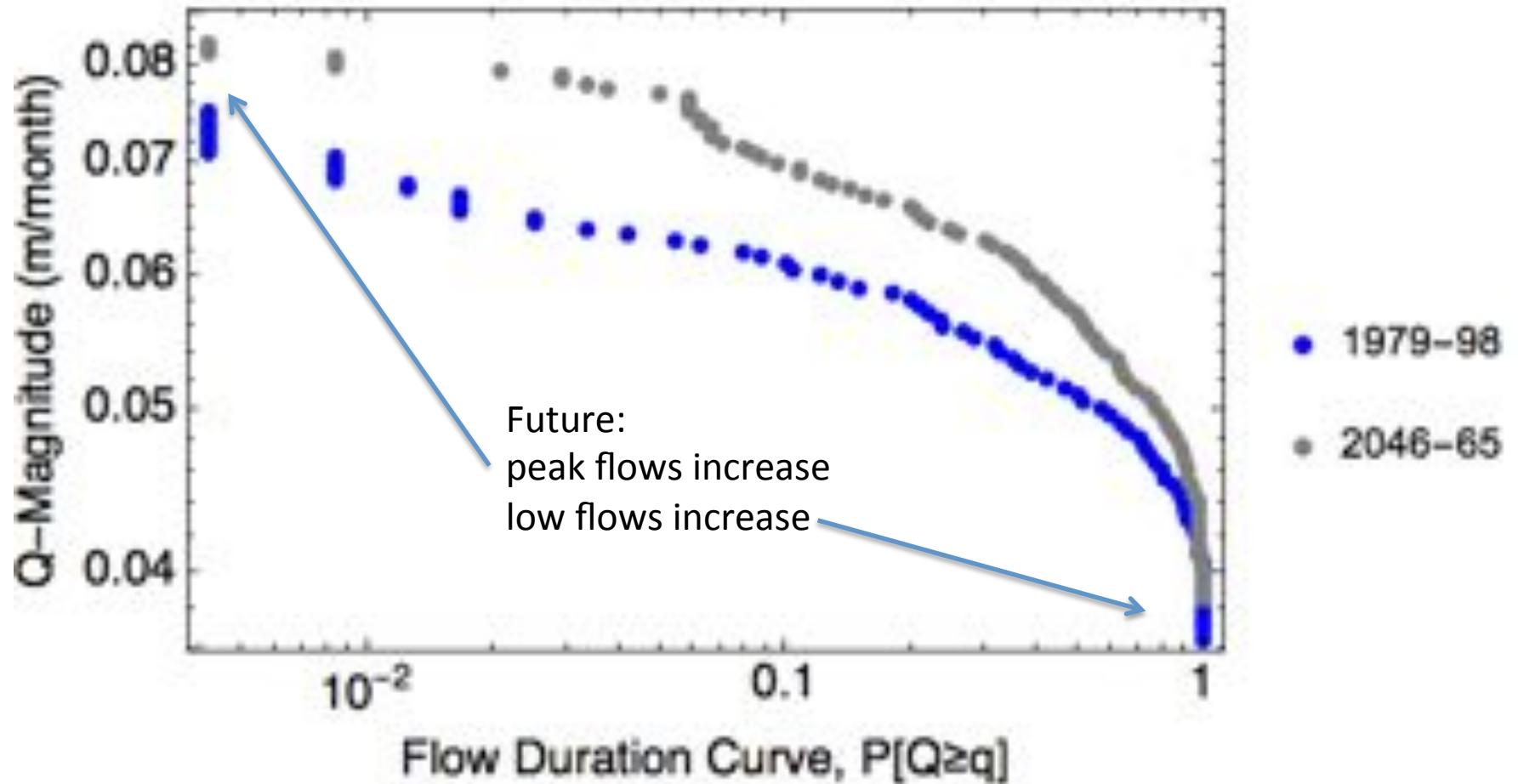
# *FDC Young Woman's Creek*



# *FDC Shaver Creek*

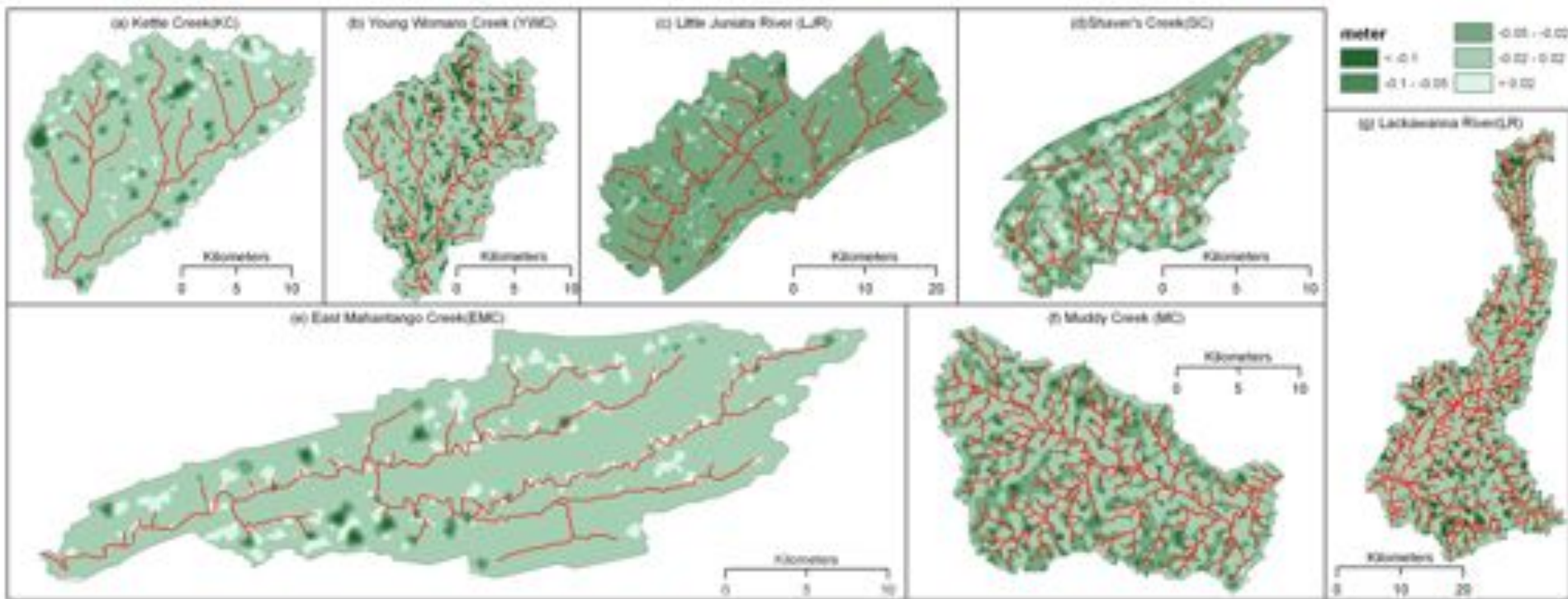


# *FDC Lackawanna*



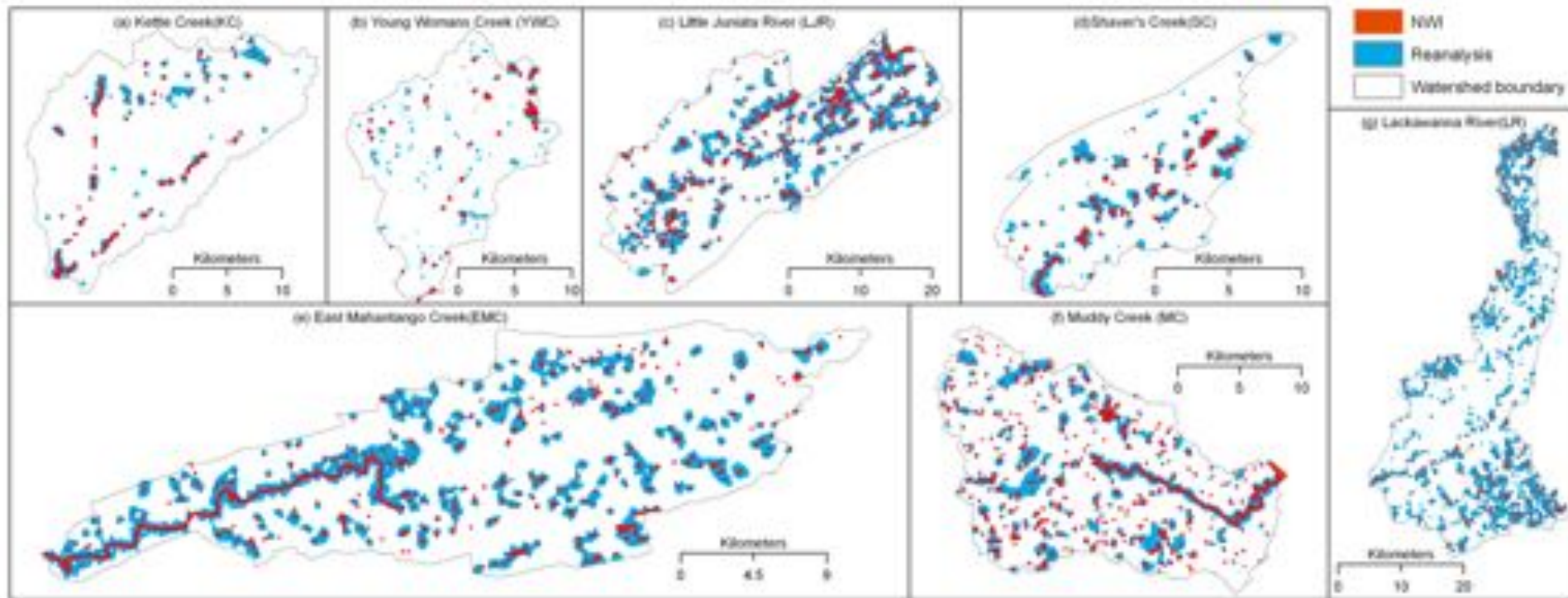


# 2046-2065 Scenario for Depth to Water Table

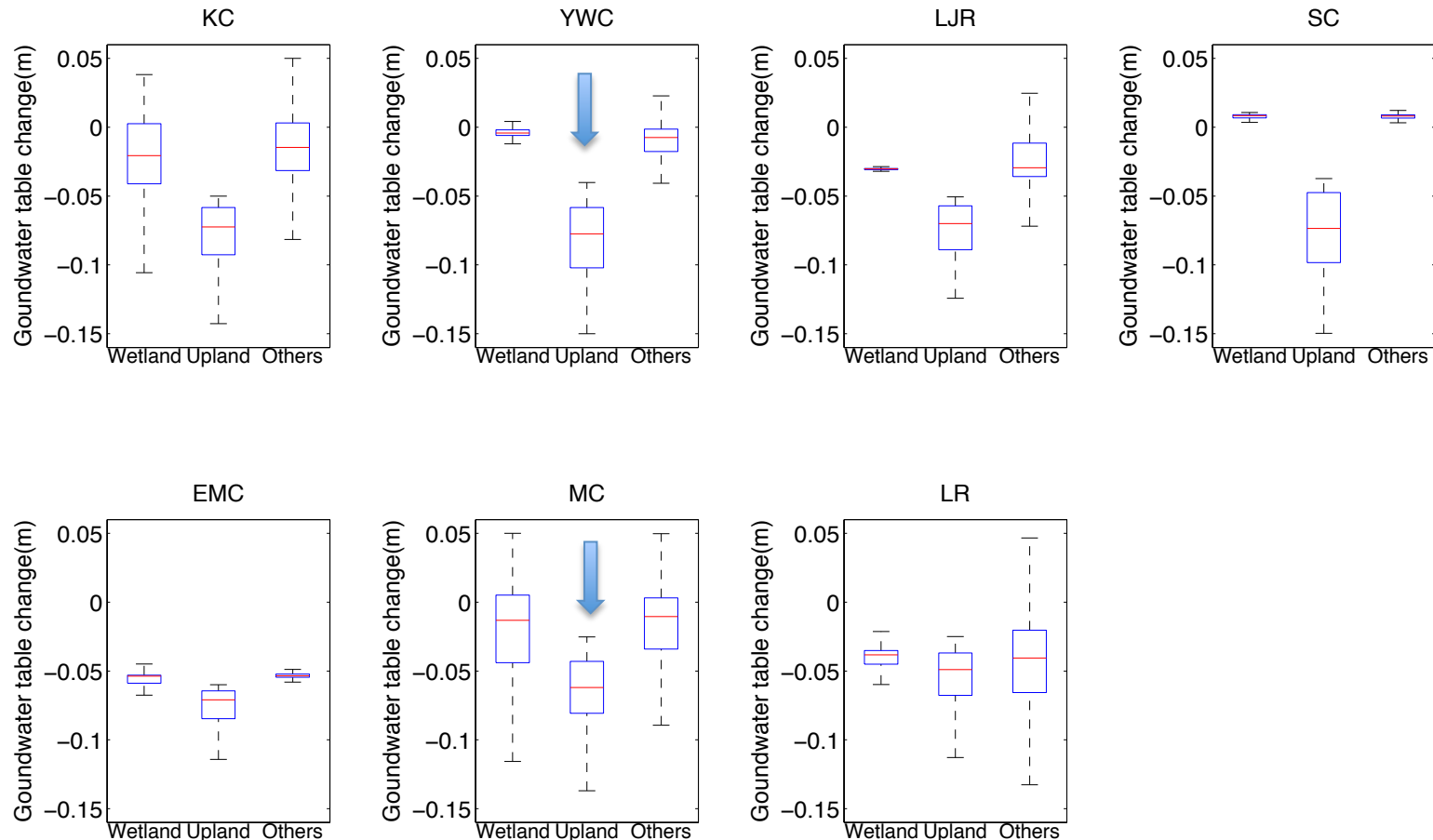


# *Simulated-Observed Wetlands*

Working definition: wetland is defined as having a water table within 30 cm of the surface



# Upland catchments are the most impacted landscape Based on depth to groundwater



# Detailed View of Shaver Creek Catchment

## Shaver's Creek

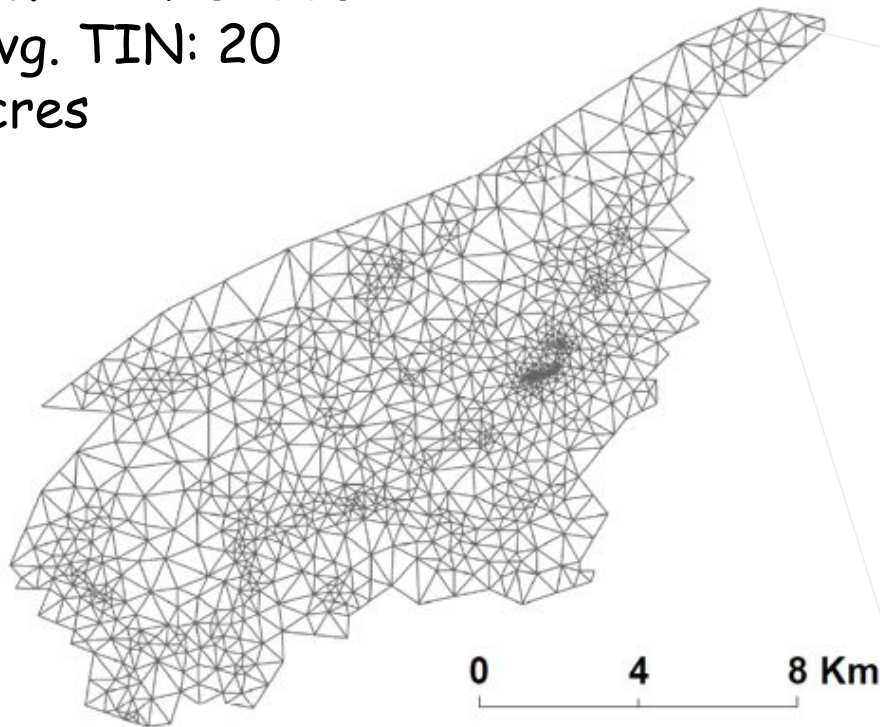
163 km<sup>2</sup>

Total TINs: 1986

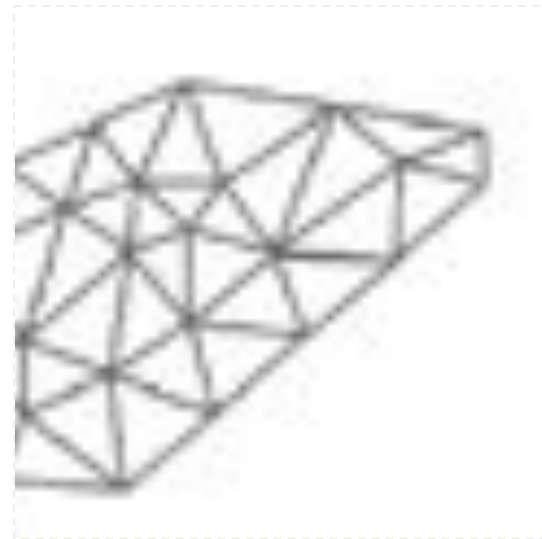
NWI TINs: 335

Avg. TIN: 20

acres



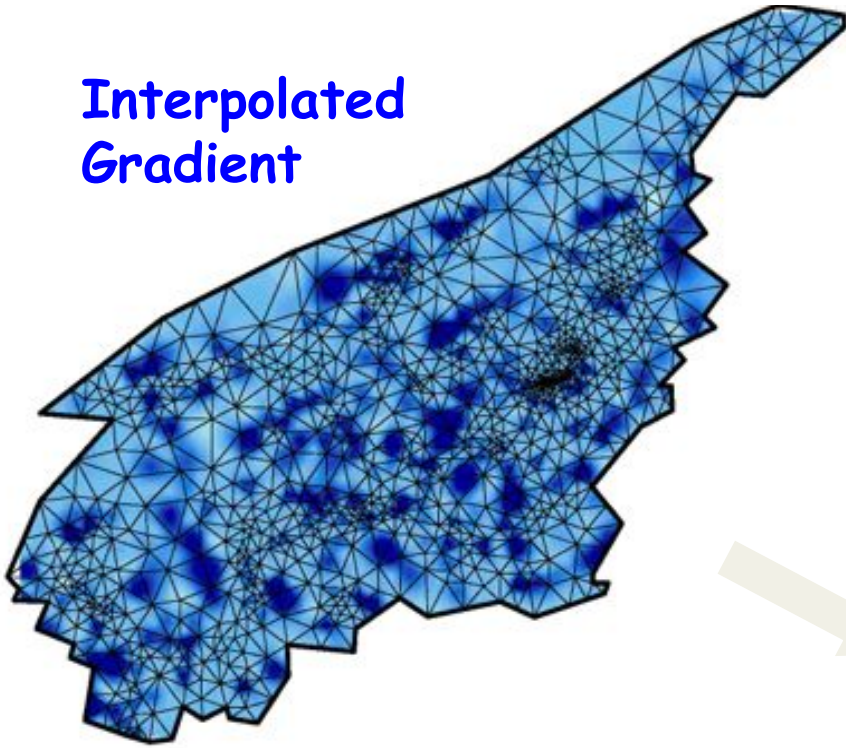
**TINs**  
Triangular Irregular  
Network



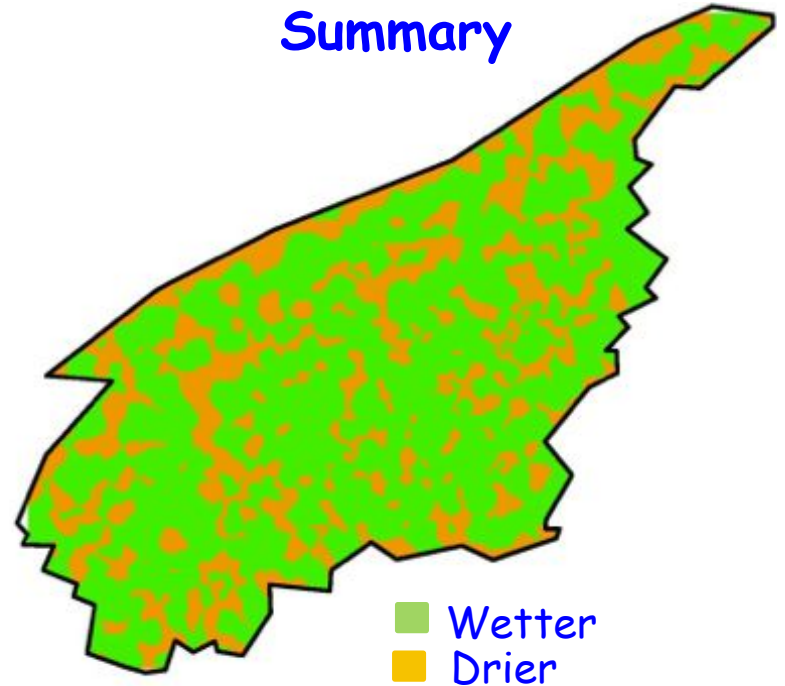


# Groundwater Change

Interpolated  
Gradient



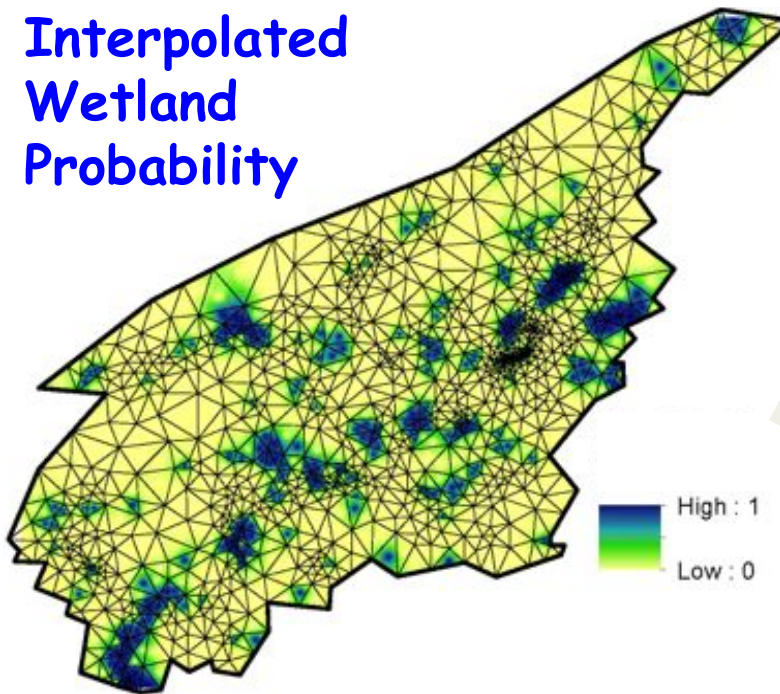
Categorical  
Summary



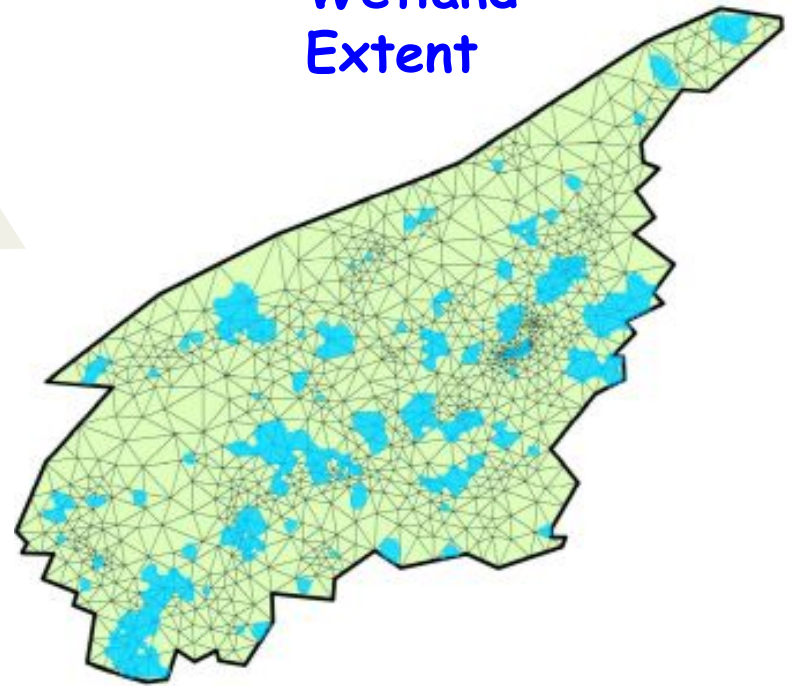
■ Wetter  
■ Drier

# Modeling Wetland Extent

Interpolated  
Wetland  
Probability

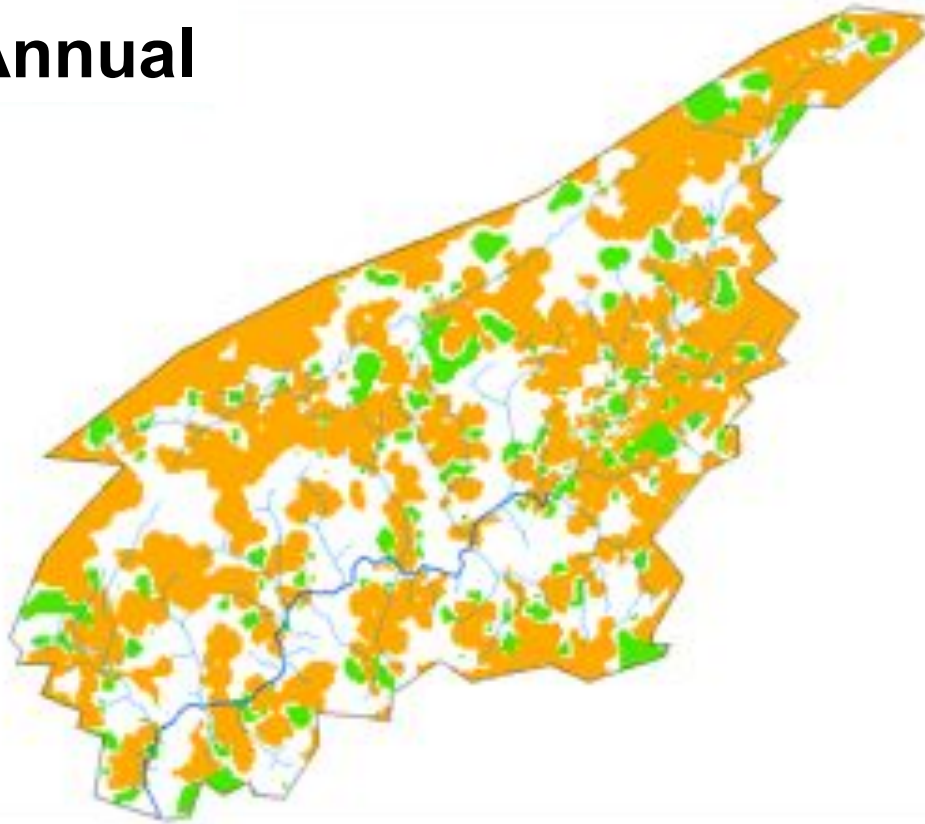


Modeled  
Wetland  
Extent



# Seasonal GW Change Scenario Shavers Creek

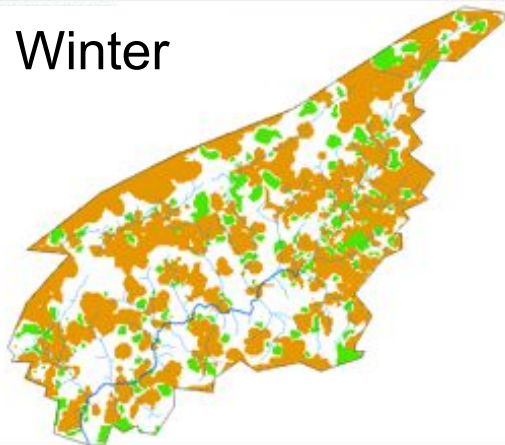
Annual



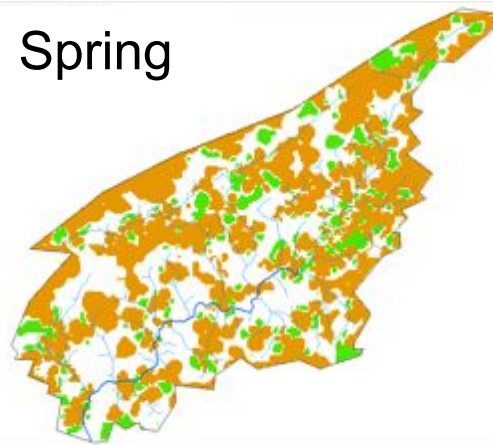
Fall



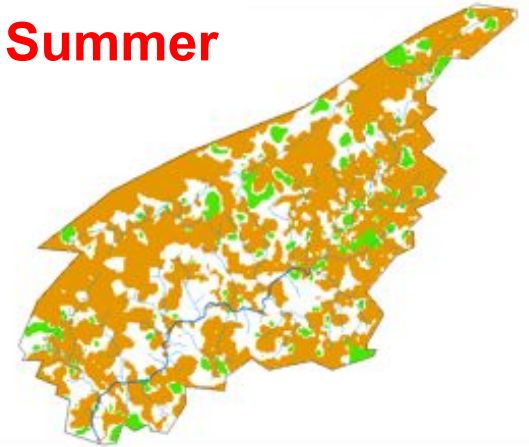
Winter



Spring



Summer



# Shaver's Creek Wetland Results

**Largest Losses:**  
Isolated Depressions

**Largest Gains:**  
Riverine Floodplains

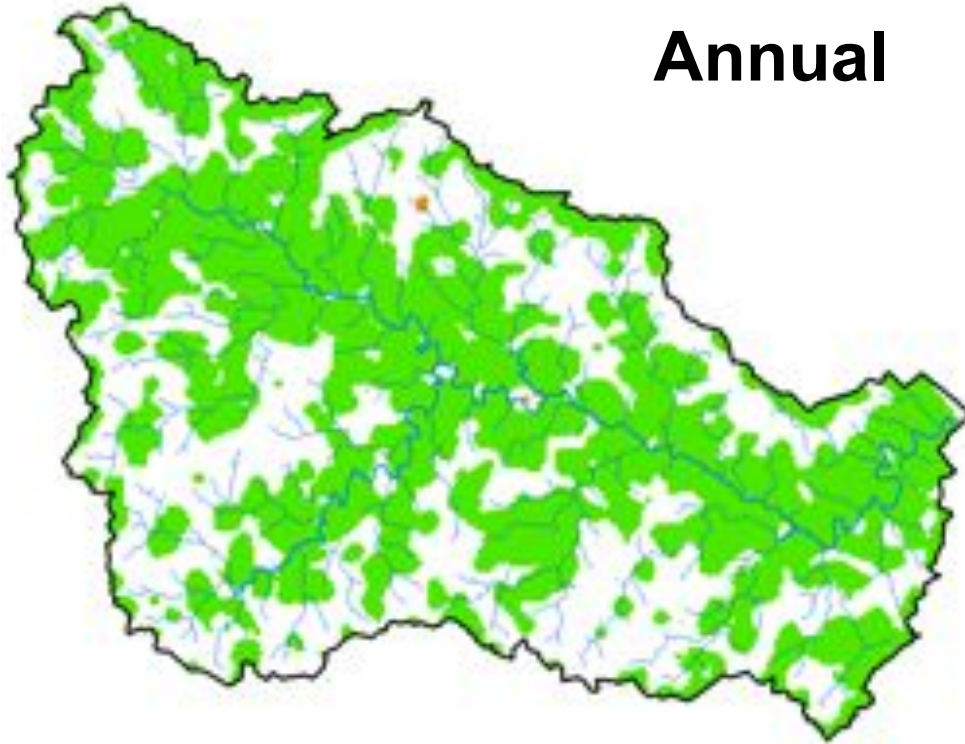
<b>Watershed Overview</b>	<b>Drier</b>	<b>Wetter</b>
Entire Watershed	33%	67%
NWI Wetlands	20%	80%
PIHM Wetlands	25%	75%

<b>PIHM Wetlands (HGM)</b>	<b>Drier</b>	<b>Wetter</b>
PIHM-Depression	27%	73%
PIHM-Slope	25%	75%
PIHM-Riverine	19%	81%



# Seasonal GW Change Scenario: Muddy Creek

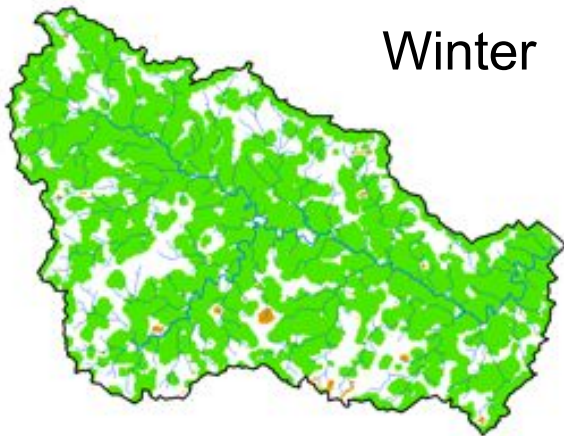
Annual



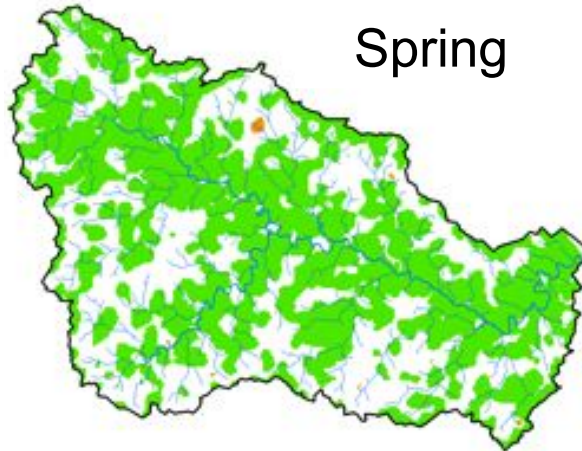
Fall



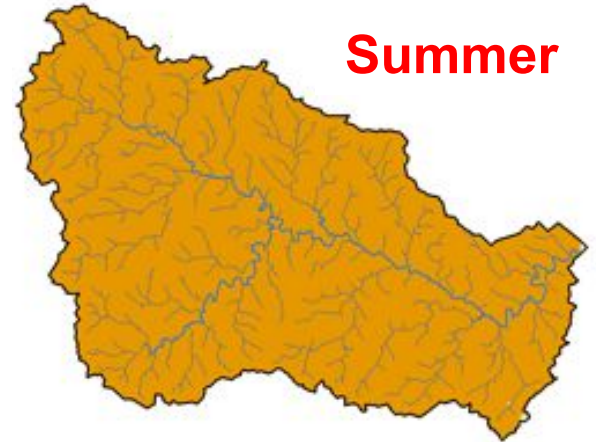
Winter



Spring



Summer



# 7 Catchment Results

	<u>NWI Wetlands</u>		<u>PIHM Depression</u>		<u>Ecoregion</u>
	Drier	Wetter	Drier	Wetter	
<b>Lackawanna River</b>	<b>74%</b>	<b>26%</b>	<b>71%</b>	<b>29%</b>	<b>Glaciated Plateau</b>
<b>Young Womans Creek</b>	62%	38%	63%	37%	Unglaciated Plateau
<b>Kettle Creek</b>	47%	53%	62%	38%	Unglaciated Plateau
<b>East Mahantango Creek</b>	40%	60%	50%	50%	Ridge and Valley
<b>Shaver's Creek</b>	<b>20%</b>	<b>80%</b>	<b>27%</b>	<b>73%</b>	<b>Ridge and Valley</b>
<b>Little Juniata River</b>	71%	29%	64%	36%	Ridge and Valley
<b>Muddy Creek</b>	35%	65%	35%	65%	Piedmont

# Workshop Outline

1. Overview of catchment modeling process
2. Accessing geospatial data from national data products
3. The model-data workflow
4. Research Opportunities in lake-catchment modeling
  - Strategies for a fully coupled lake-catchment model
  - Defining an experimental “Isoscape” for water and carbon
  - The age of water and carbon in lake-catchment systems
6. Discussion