

# Estimating the Basin Extent and Persistence of Legacy Nutrient Sources with Dynamic SPARROW

Noah M. Schmadel<sup>1</sup> and Dale M. Robertson<sup>2</sup>

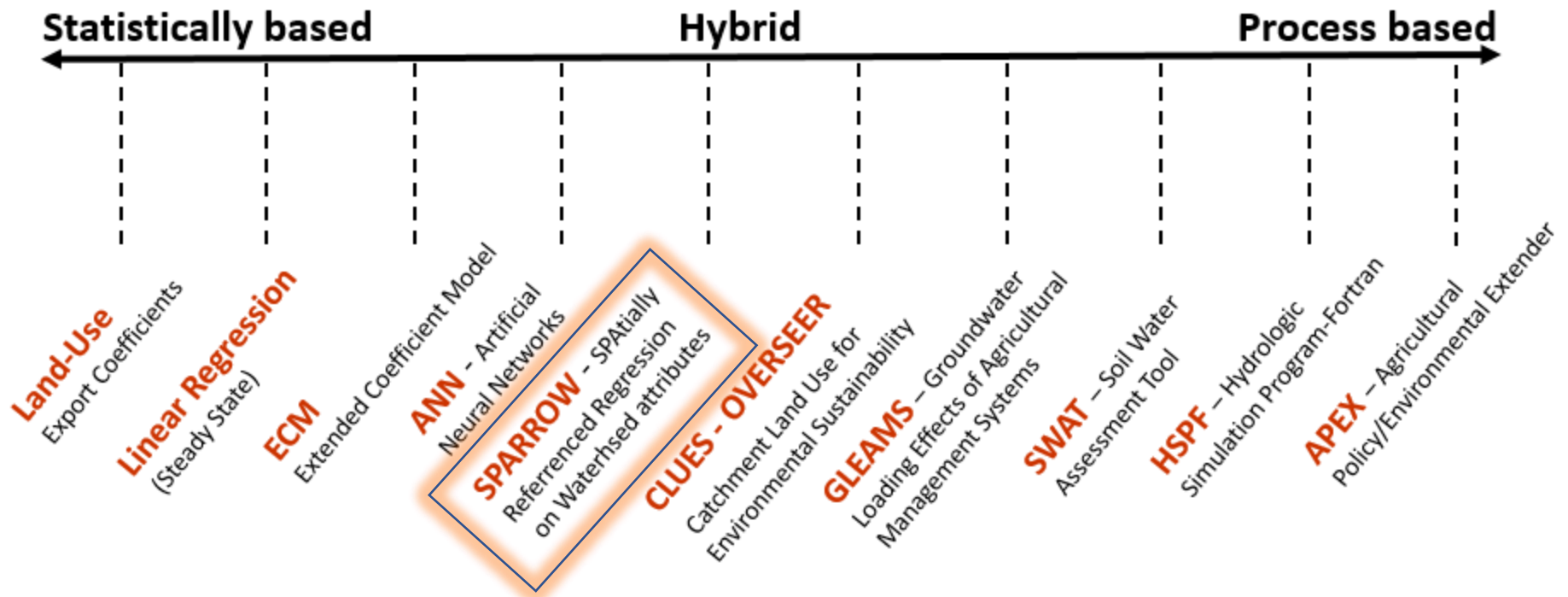
<sup>1</sup> Oregon Water Science Center

<sup>2</sup> Upper Midwest Water Science Center



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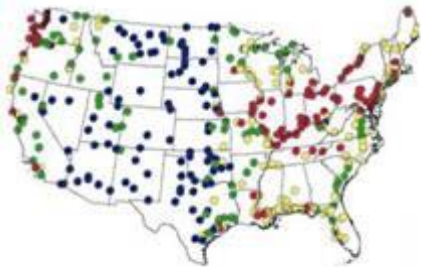
# Watershed Modelling Continuum



# SPARROW Water-Quality Model

## SPATIALLY REFERENCED REGRESSION ON WATERSHED ATTRIBUTES

**Monitored Loads**  
(100s to 1000s of sites)

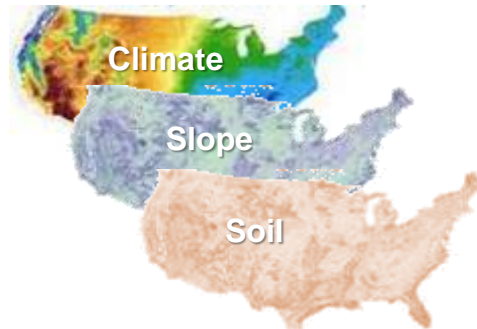


*(Y variable)*

**Spatial Data**  
Sources



**Land-to-Water Delivery**



**Stream & Reservoir Decay**

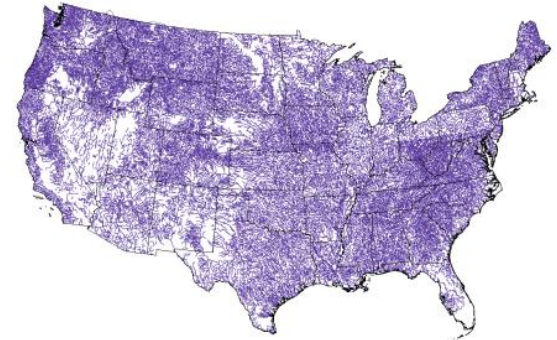


*(X variables)*

*Index to  
network*



**Routed Stream Network**

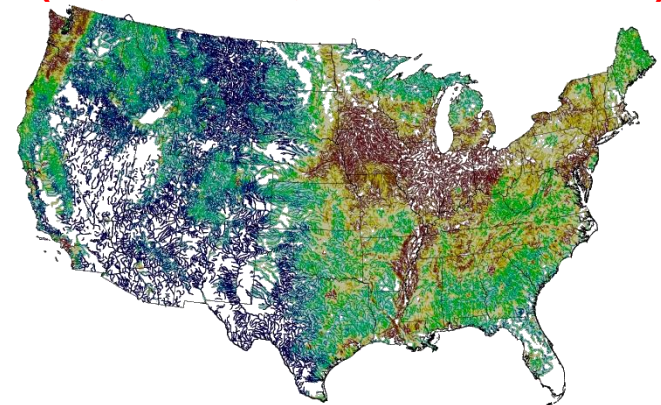


*Build and  
calibrate  
model*



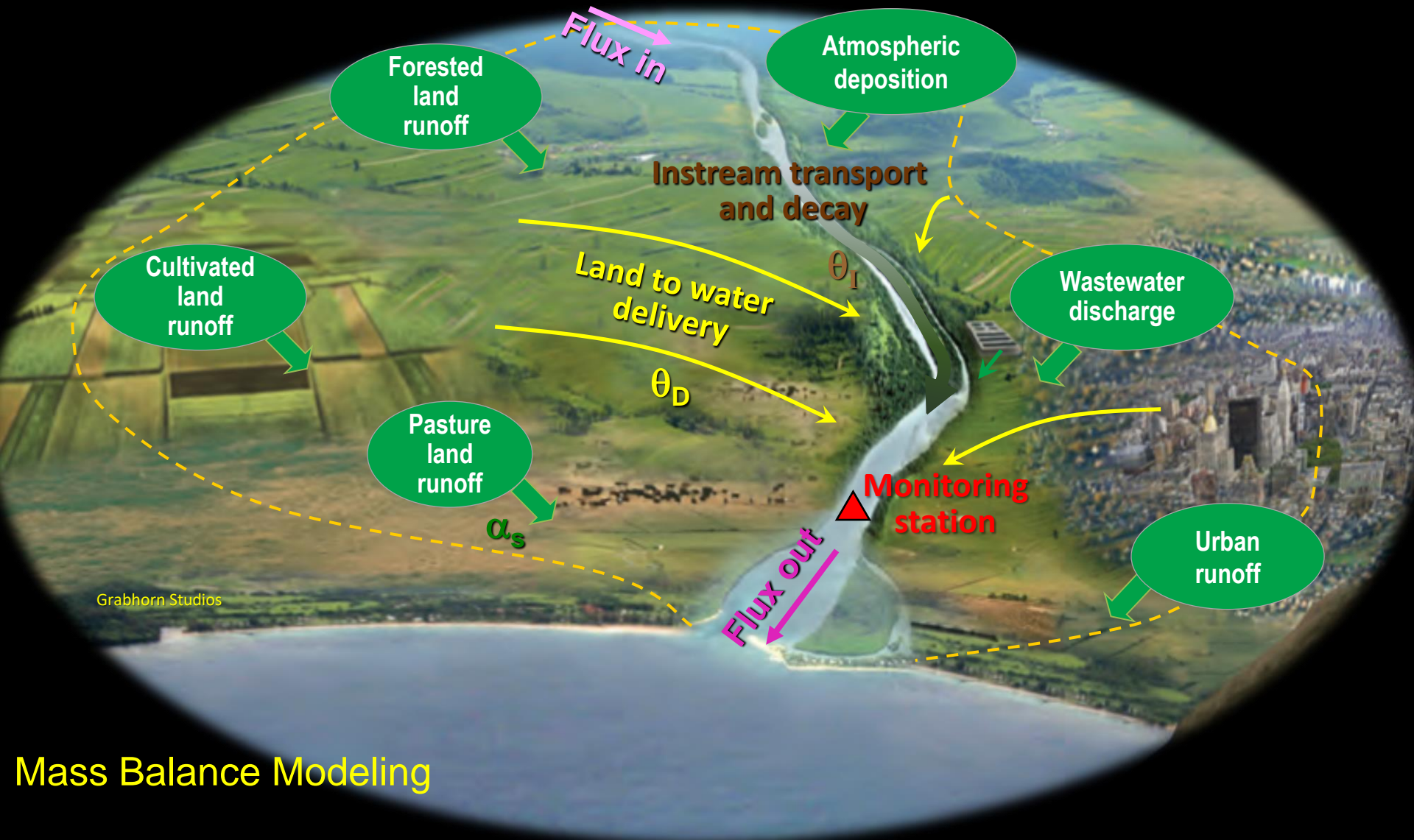
**Model Predictions at all Stream  
Reaches**

(10,000s to 1,000,000s reaches)



# SPARROW: SPatially Referenced Regression on Watershed attributes

## Watershed Model

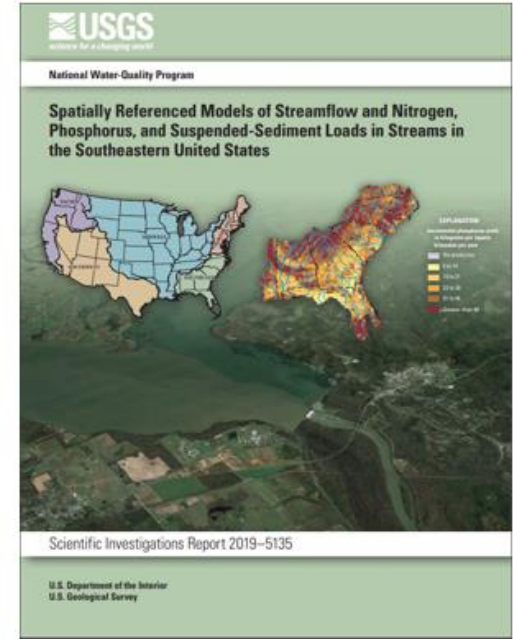
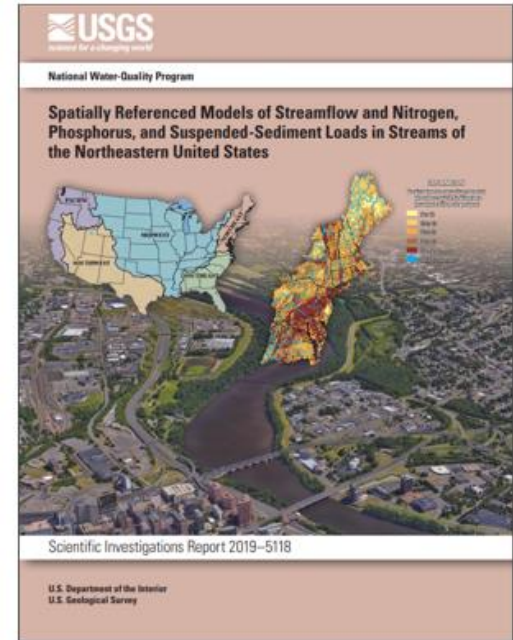
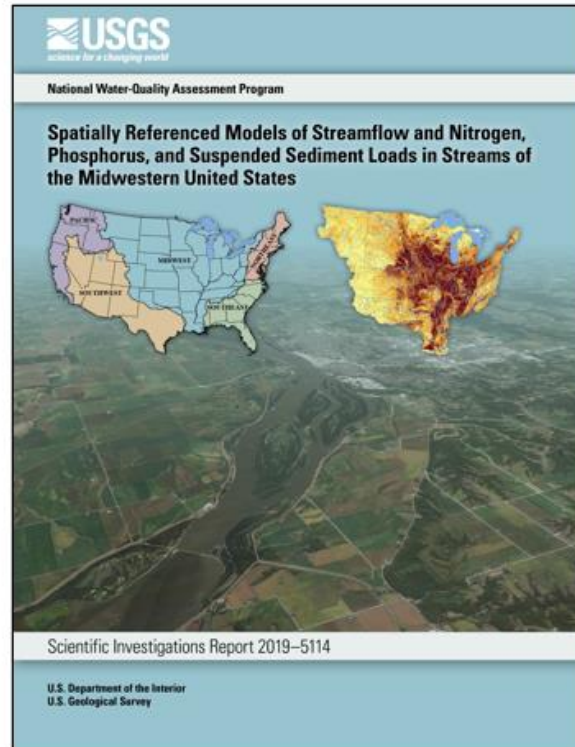
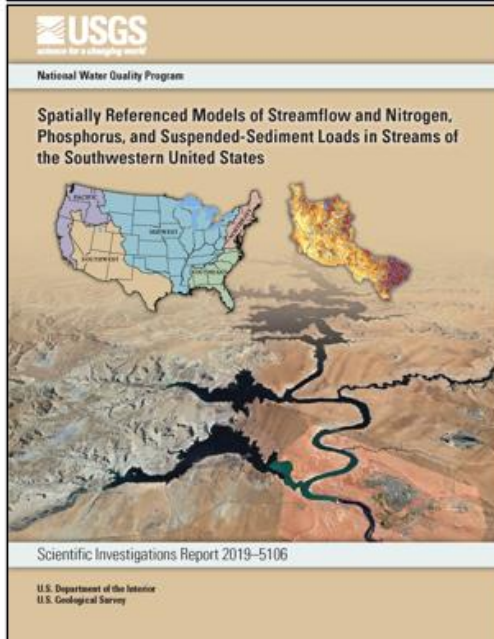
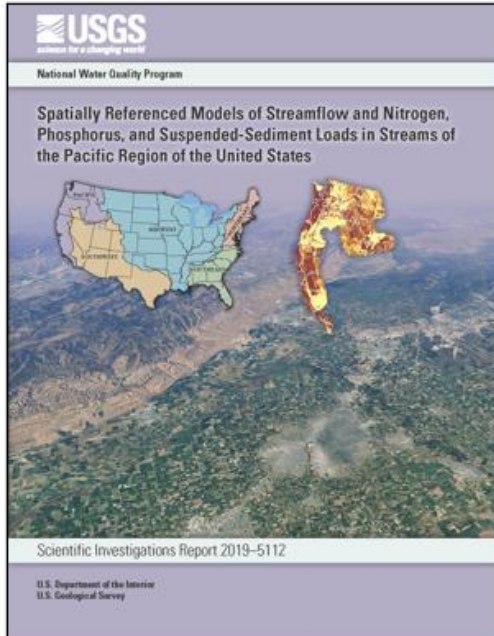


## Mass Balance Modeling

$$\text{Target} = \text{Flux out} = \text{Flux in} + (\alpha_s \text{ Sources} \times \theta_D \text{ Delivery}) - \theta_I \text{ Instream Decay}$$

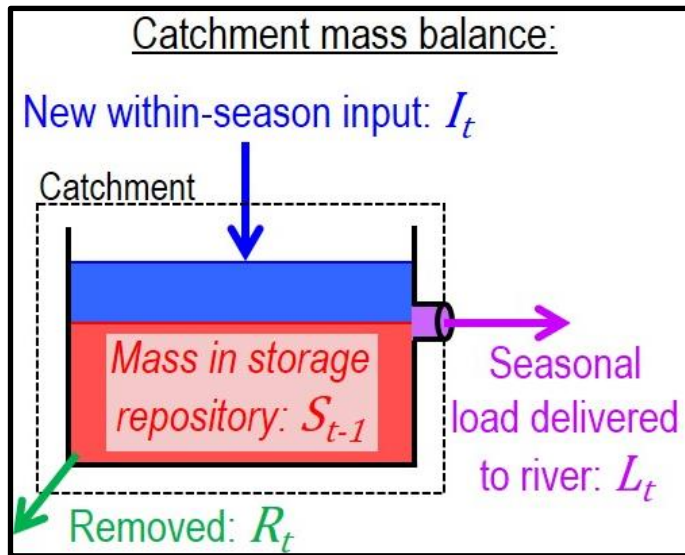


# USGS Regional SPARROW Models



# Making SPARROW dynamic unlocks predictive capabilities

Assume some mass is already in storage (**old**) before **new** inputs



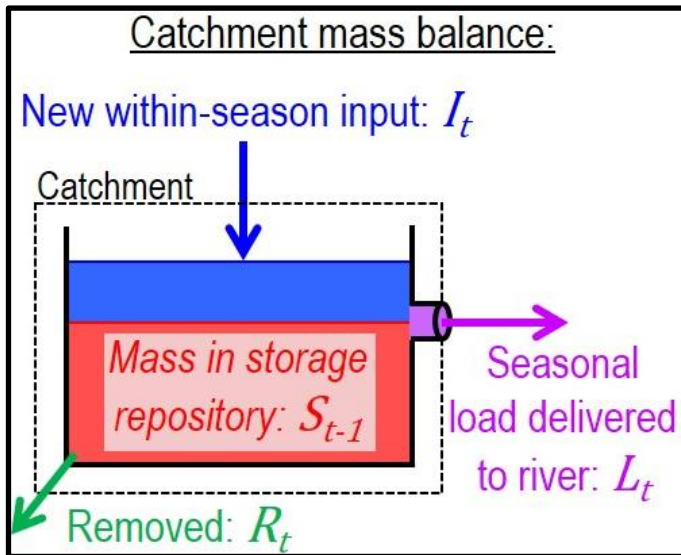
Smith 2012; Schmadel et al. (2021) [ERL](#)

## But we want to keep SPARROW usages

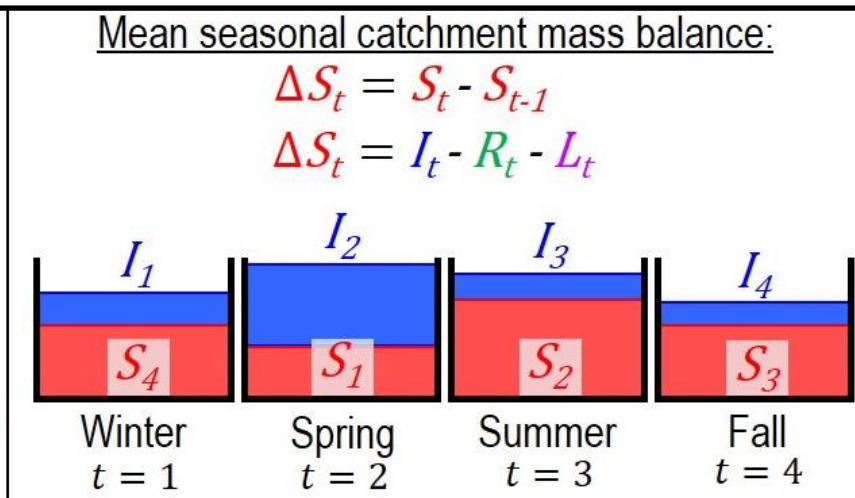
- Simple physics-guided statistical model
- Draws on nationally consistent datasets
- Multiscale: Spatially referenced
- Delivery from headwaters to estuaries

# Making SPARROW dynamic unlocks predictive capabilities

Assume some mass is already in storage (**old**) before **new** inputs



Smith 2012; Schmadel et al. (2021) [ERL](#)



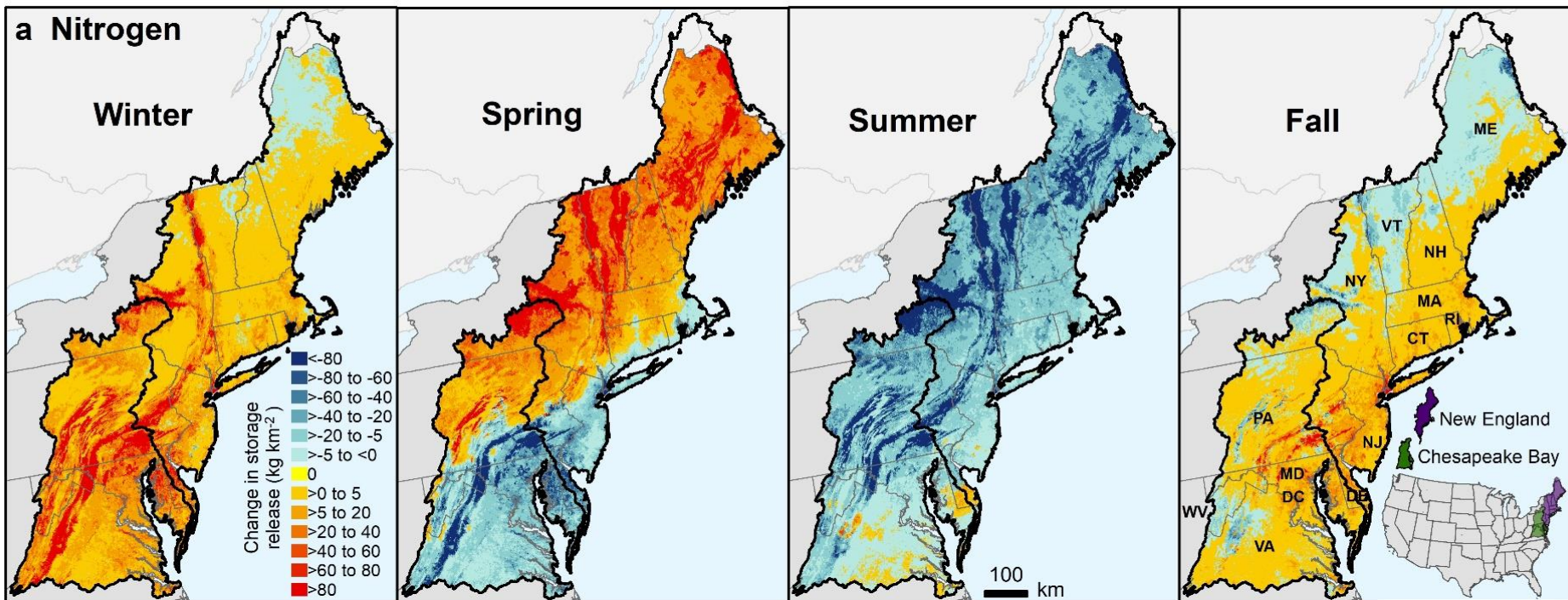
Dynamic allows for quantification of **new** versus **old**:

$$L_t = \sum_{n=1}^N \alpha_n I_{t,n} f_{I,t,n} + \alpha_s L_{t-1} f_{S,t}$$

One-period lag (first-order storage process) rate of release:  $\alpha_s f_{S,t}$



# Seasonal shifts in drivers cause storage accumulation and release

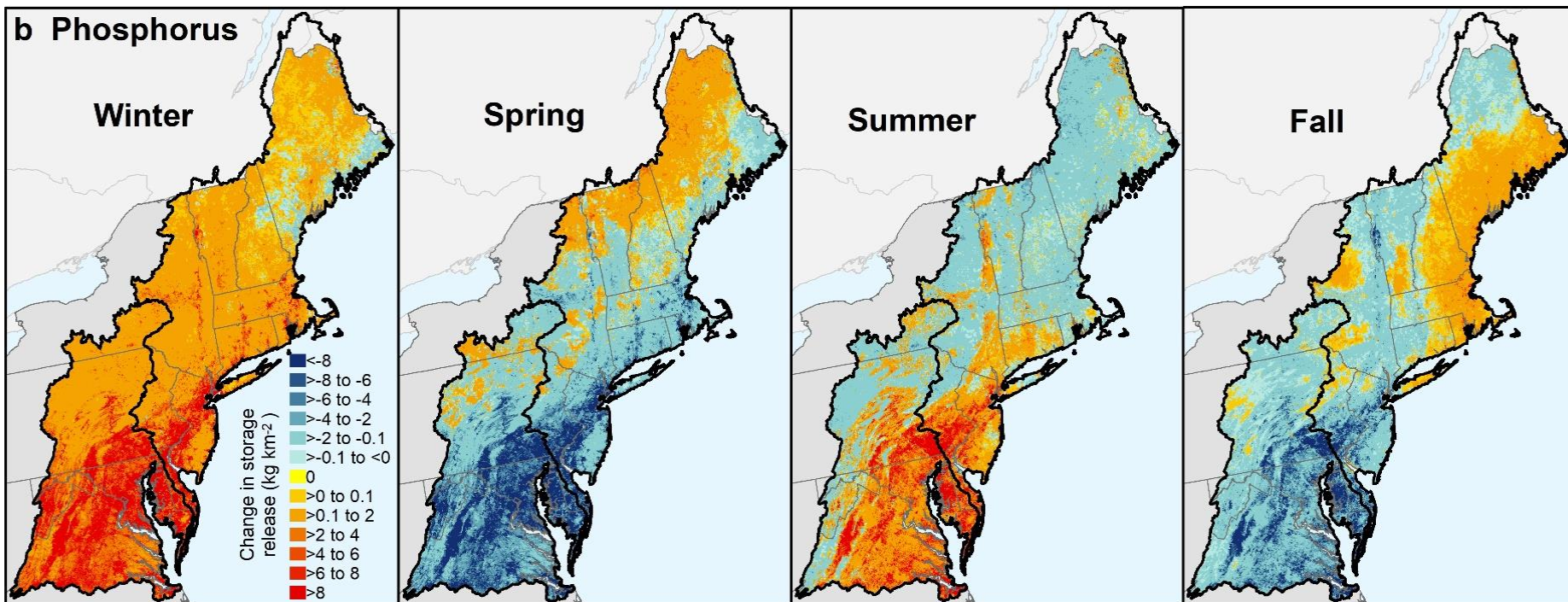


Schmadel et al. (2021) [ERL](#)





# Seasonal shifts in drivers cause storage accumulation and release



Schmadel et al. (2021) [ERL](#)



# Dynamic calibration helps identify key data and drivers

## Nitrogen

## Phosphorus

$$L_t = \sum_{n=1}^N \alpha_n I_{t,n} f_{I,t,n} + \alpha_S L_{t-1} f_{S,t}$$

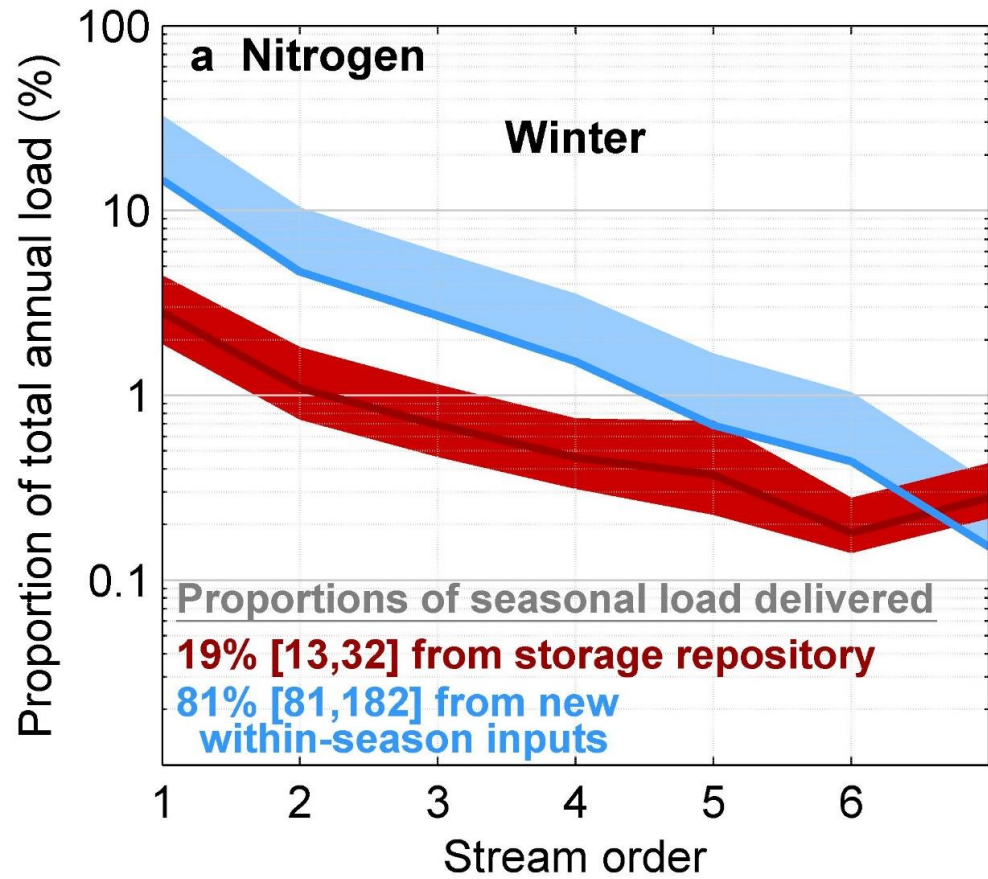
New mass

Old mass

Explanatory variables
<b>Sources</b> Wastewater point sources Fertilizer applications Fixation from soybean, alfalfa Manure applications Atmospheric wet deposition Urban land cover Catchment storage
<b>Input land-to-water delivery</b> Quickflow runoff NDVI Ratio nitrate to total inorganic N Small ponds Average overland flow distance
<b>Storage land-to-water delivery</b> Change in runoff + Change in NDVI - NDVI, previous period Carbonate geology
<b>River corridor</b> Lakes, reservoirs, impoundments Rivers, mean Temperature, mean centered

Explanatory variables
<b>Sources</b> Wastewater point sources Small streams Small ponds Fertilizer applications Manure applications Geology (siliciclastic, crystalline) Urban land cover Catchment storage
<b>Land-to-water delivery</b> Quickflow runoff NDVI Small upland ponds Average overland flow distance
<b>Storage land-to-water delivery</b> NDVI, previous period Change in precipitation + Change in NDVI - Soil erodibility (K factor)
<b>Aquatic decay</b> Lakes, reservoirs, impoundments Rivers, mean Temperature, mean centered

# The contribution of storage to downstream nutrient load is significant



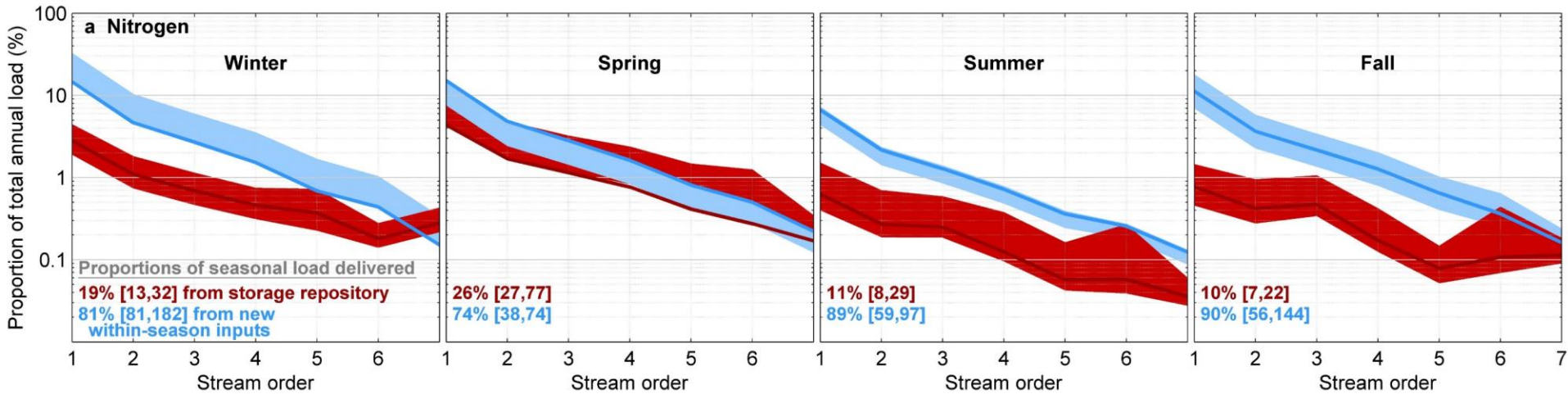
New mass

Old mass

Uncertainty shown =  
Timing of fertilizer and  
manure applications

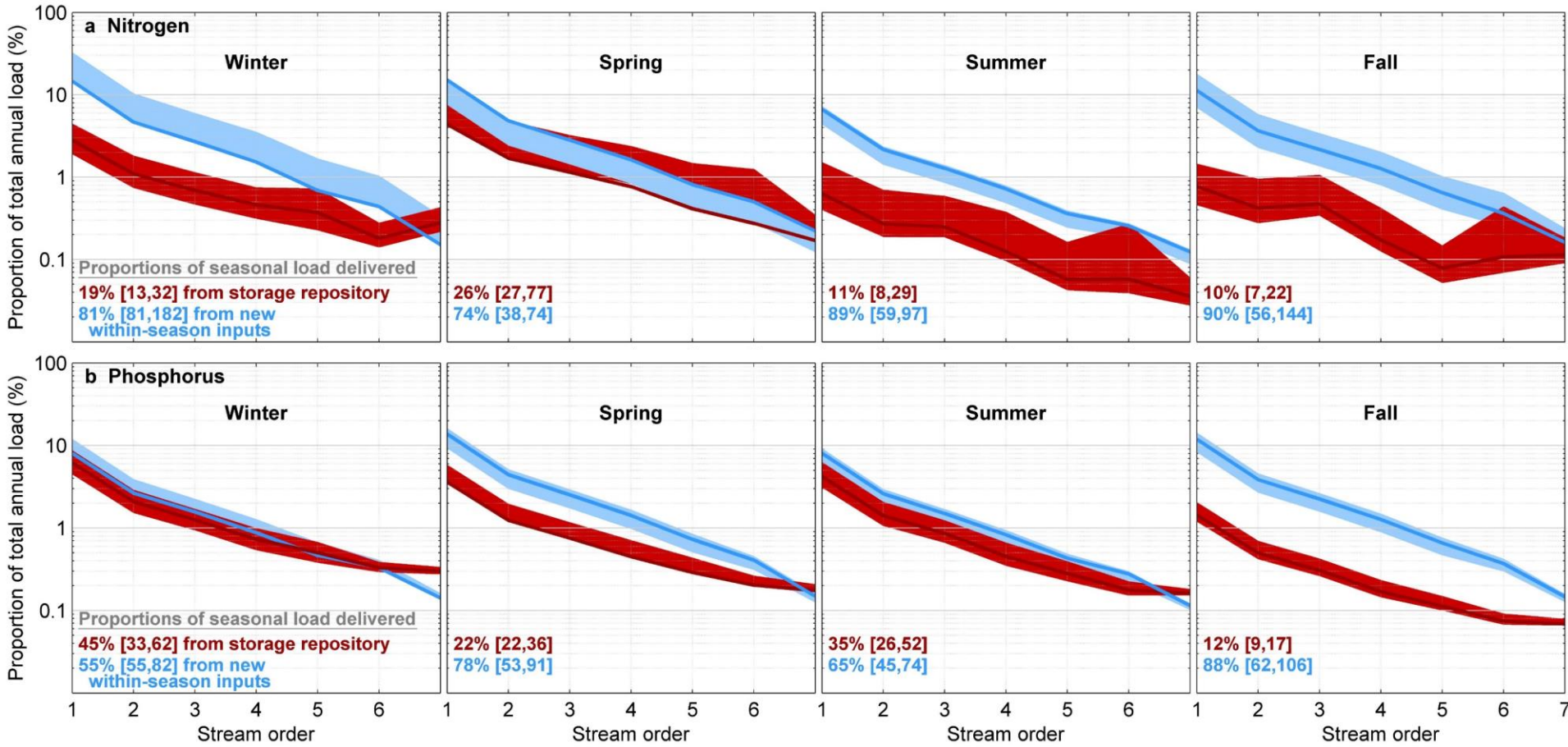


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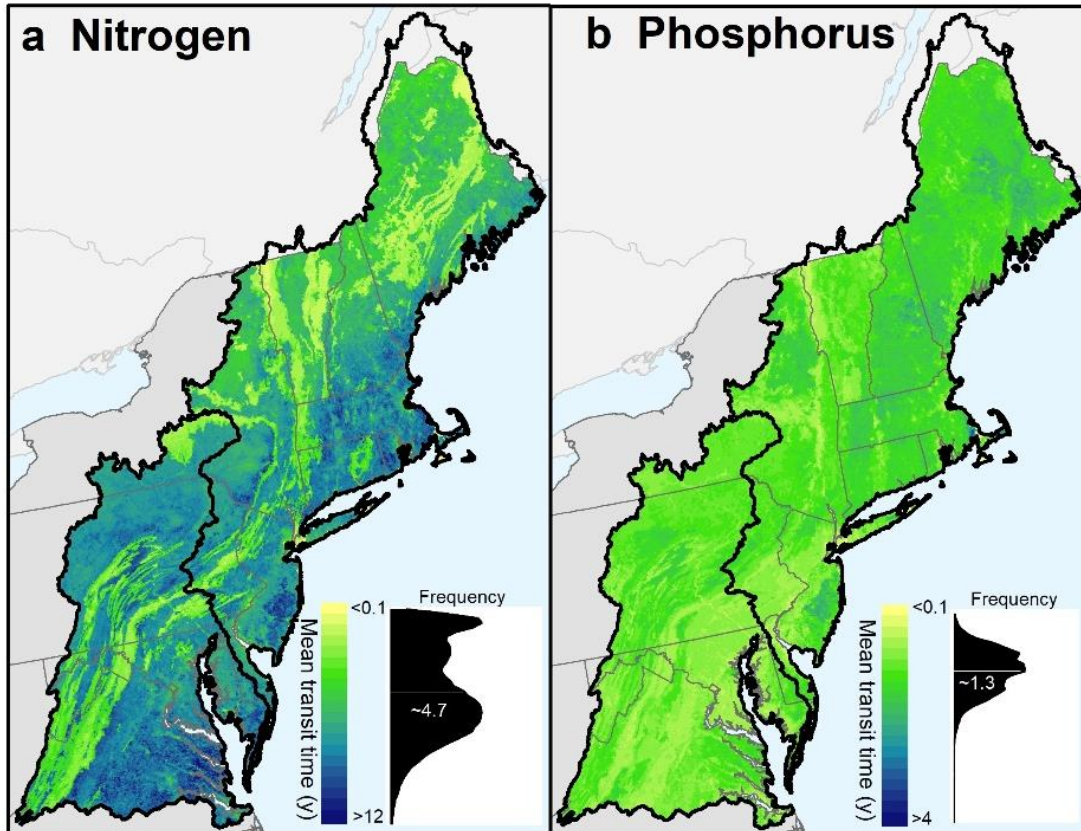
Schmadel et al. (2021) [ERL](#)

# The contribution of storage to downstream nutrient load is significant



Schmadel et al. (2021) [ERL](#)

# Catchment mean transit times indicate different N and P storage processes



Schmadel et al. (2021) [ERL](#)

- Nitrogen: Regional mean of 4.7 years, highest density around 2 years
- Phosphorus: Regional mean around 1.3 years
- Delay in the downstream response to management practices should be expected.

Dynamic allows for quantification of **new** versus **old**:

$$L_t = \sum_{n=1}^N \alpha_n I_{t,n} f_{I,t,n} + \alpha_s L_{t-1} f_{S,t}$$

$$\text{Mean transit time} \approx 1 / \alpha_s \sum f_{S,t}$$



# Improved dynamic accounting unlocks predictive capabilities

(1) What is the role of nutrient legacies from headwaters to estuaries and from **season-to-season** and **year-to-year**?

- Developing longer period models of priority basins (Illinois River Basin, Puget Sound, Upper Colorado) but the vision is CONUS
- Stakeholders: USGS Water Mission Area Integrated Water Availability National Project & Washington State Department of Ecology

(2) The eventual goal is next-season forecasts of nutrient loads.

- Improved parsing of N and P storage processes, but which processes?
- New ways of accounting for dynamic river corridor processes

**Thank you!**