A satellite image of the Mississippi River Delta, showing the river's complex network of channels and distributaries as it empties into the Gulf of Mexico. The land is shown in shades of brown and tan, while the water is a deep blue. The river's path is highly irregular, with many loops and branches.

# Long-term changes in lake nutrient concentrations across the Midwest and Northeast U.S.: How does WI stack up?

**Samantha Oliver, PhD**

Hydrologist, U.S. Geological Survey

Coauthors: SM Collins, EH Stanley, NR Lottig (UW Madison), PA Soranno (Michigan State University), T Wagner (Penn State), JR Jones (University of Missouri), CA Stow (NOAA)

Mississippi River Delta. Photo Credit: Landsat365

# Unexpected stasis in a changing world: Lake nutrient and chlorophyll trends since 1990

Samantha K. Oliver<sup>1</sup>  | Sarah M. Collins<sup>1,2</sup>  | Patricia A. Soranno<sup>2</sup>  | Tyler Wagner<sup>3</sup> |  
Emily H. Stanley<sup>1</sup>  | John R. Jones<sup>4</sup> | Craig A. Stow<sup>5</sup> | Noah R. Lottig<sup>1</sup>

# Outline

## 1. Using lakes as indicators of change

*We need big data to study big problems*

## 2. Data solution – LAGOS

## 3. Who cares what's happening in other lakes?

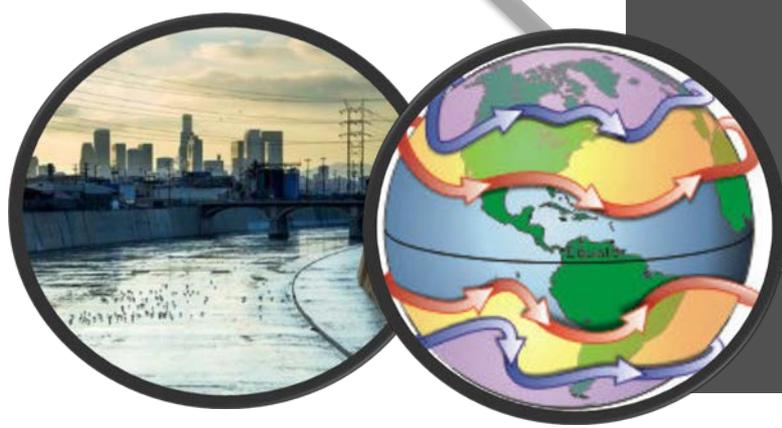
## 4. Are lakes changing?

## 5. How are lakes in WI changing?

**Nutrient  
source**

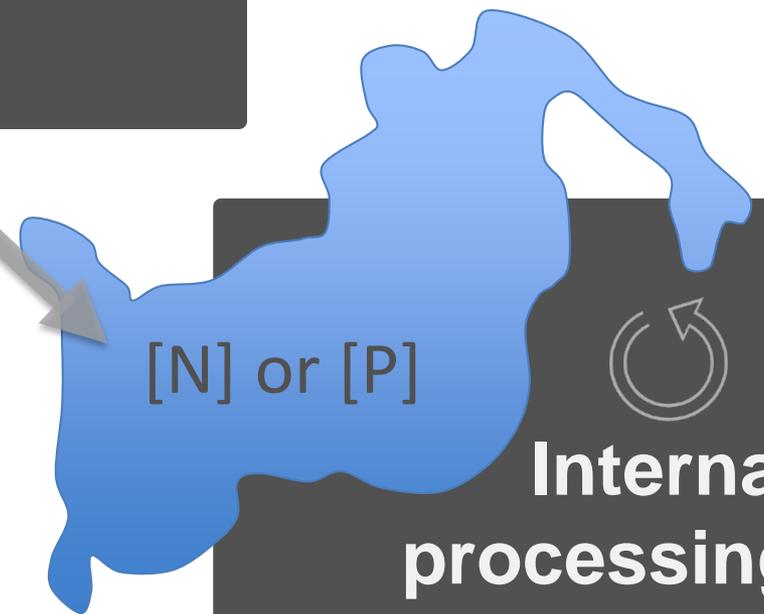


**Nutrient  
delivery**



[N] or [P]

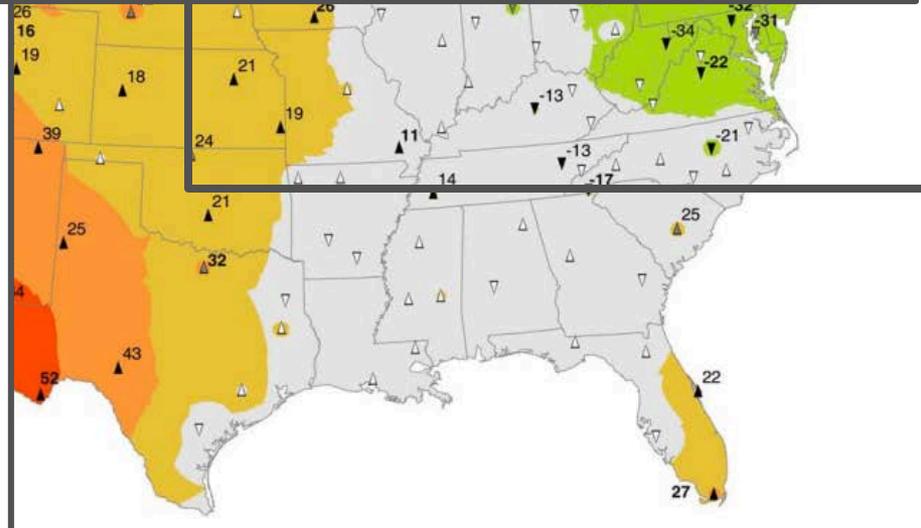
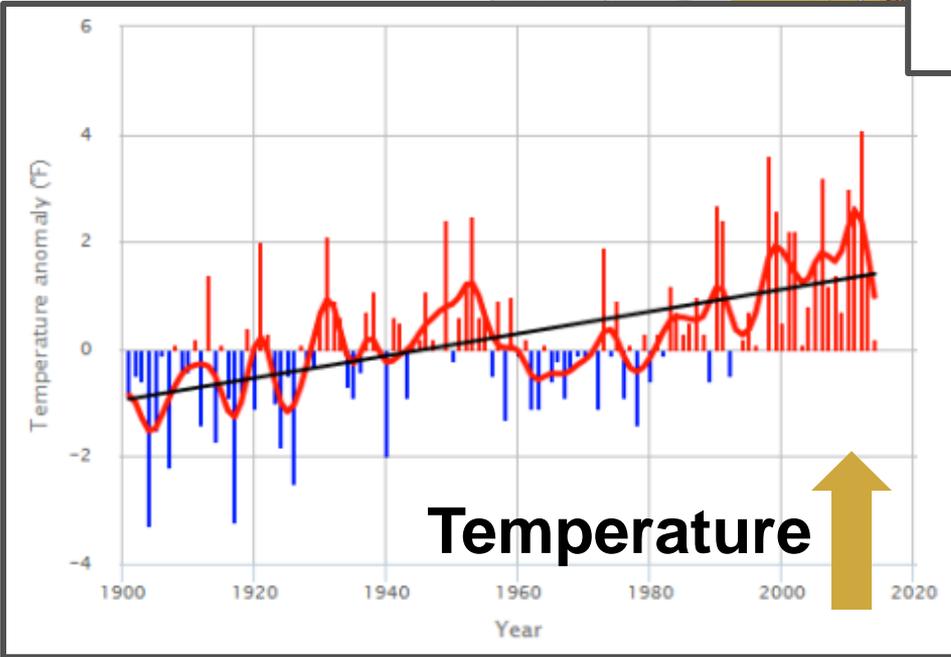
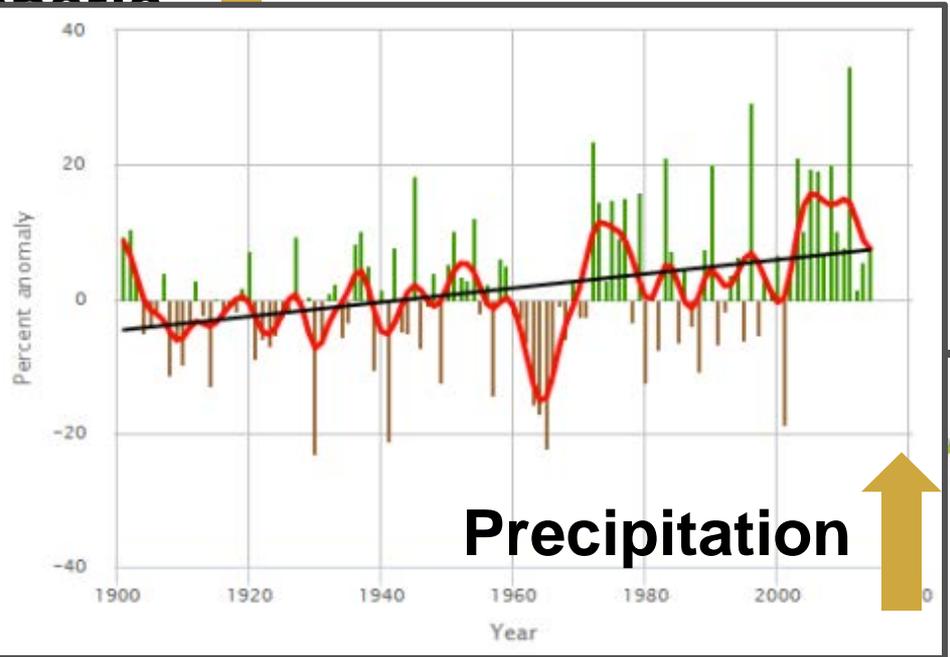
**Internal  
processing**



**Nutrient  
source**

**Atmospheric  
deposition**

U.S. EPA Report on the  
Environment 2014



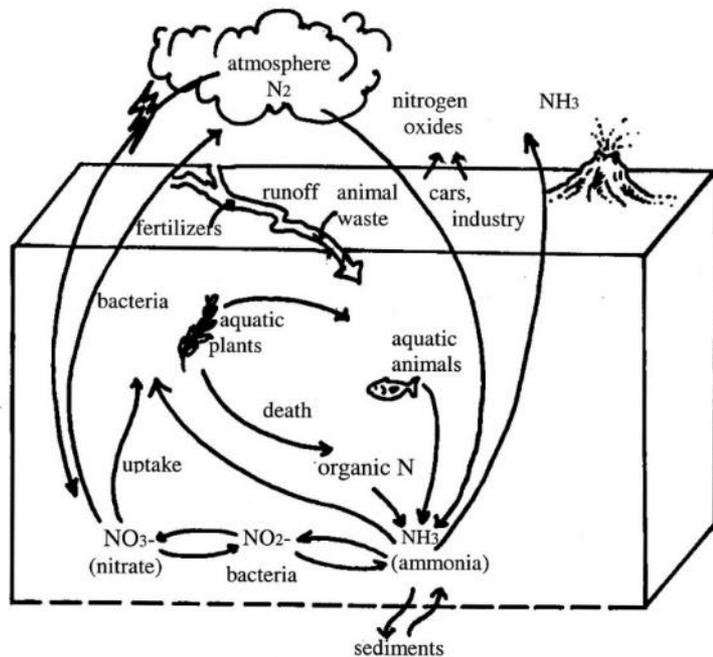
Lehmann et al. 2012

# NITROGEN

Abundant, globally distributed

Dissolved, easily transported by surface and subsurface water

Gas phase – N can be fixed or removed by organisms, atmospheric transport



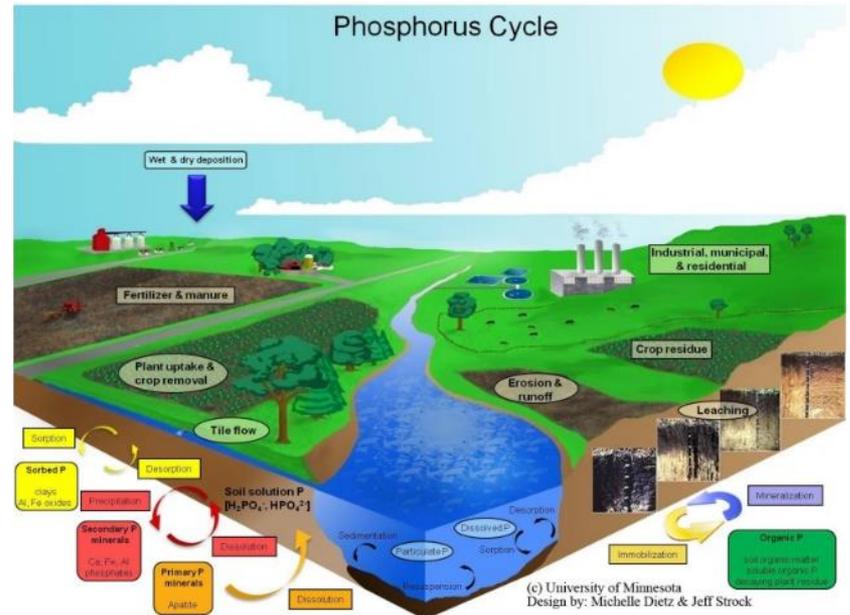
Utah State Extension

# PHOSPHORUS

Scarce, localized geologic sources

“Sticky” and often in particulate form, primarily transported by surface water

No gas phase



(c) University of Minnesota  
Design by: Michelle Dietz & Jeff Stock

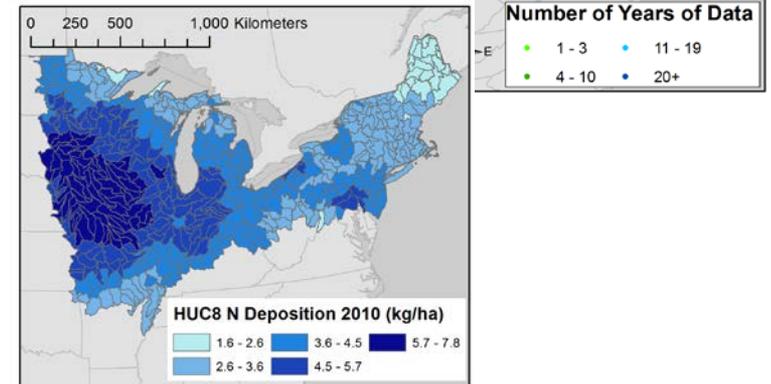
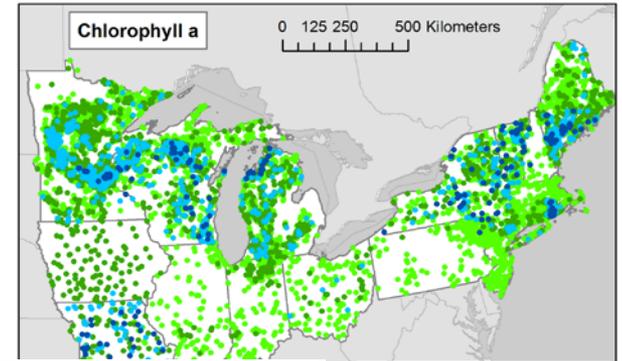
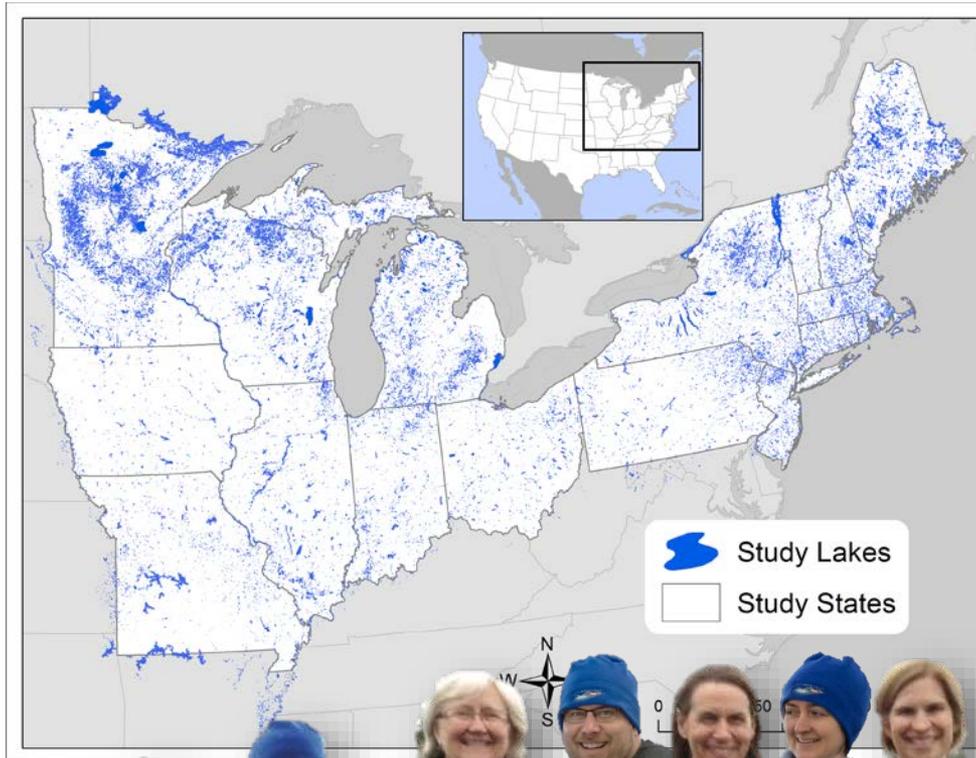
# How do we study these “big problems”?

*In other words, where can find lake data that spans the time, space, and ecological parameters we need?*

# Lake Multi-Scaled Geospatial & Temporal Database (LAGOS)

Database description: Soranno et al. 2015

Data release: Soranno et al., 2017



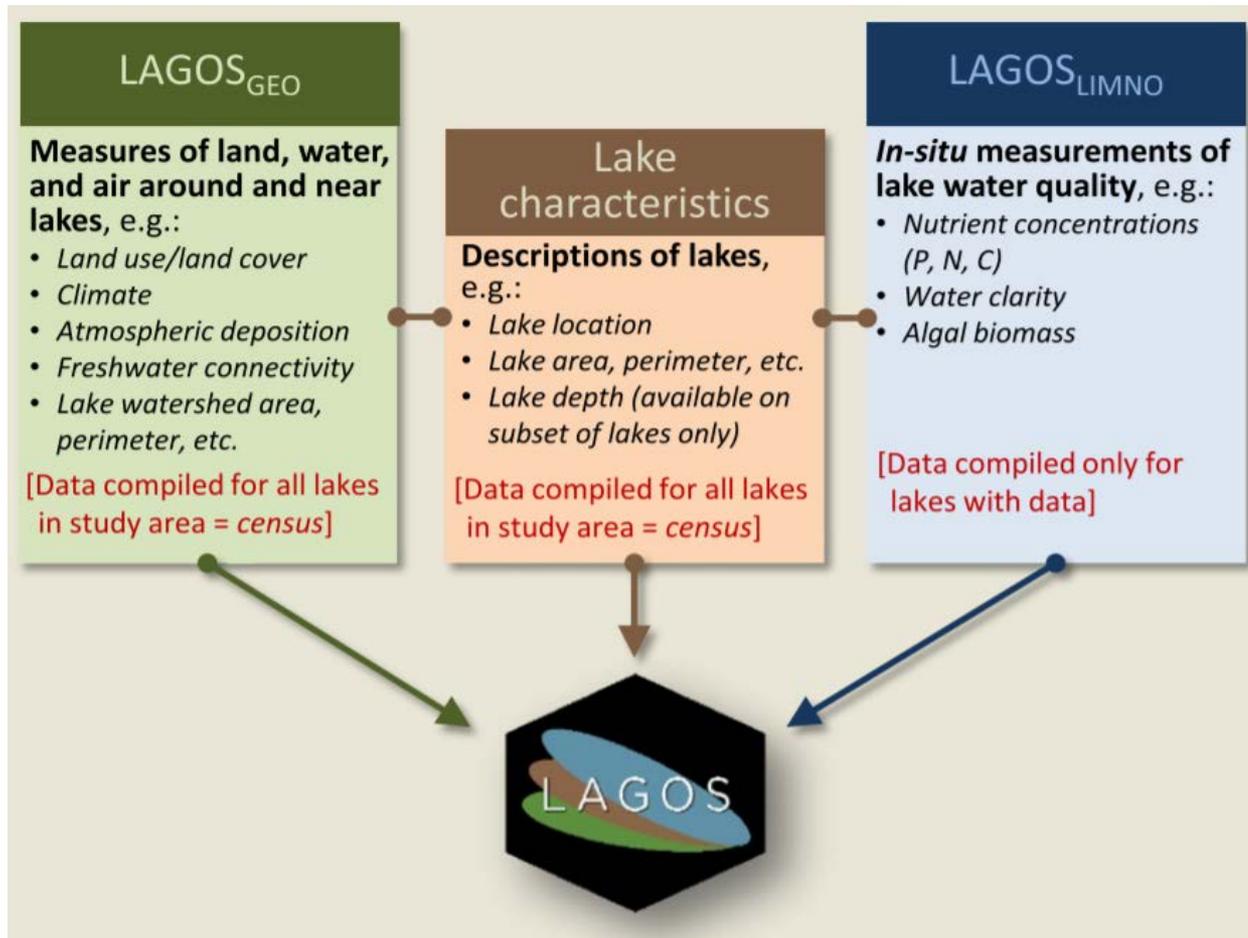
CSILIMNOLOGY



# Lake Multi-Scaled Geospatial & Temporal Database (LAGOS)

Database description: Soranno et al. 2015

Data release: Soranno et al., 2017



12,034 lakes with Secchi (2079 in WI)

9749 lakes with TP (1920 in WI)

All data publicly available + R package 'LAGOS' to access



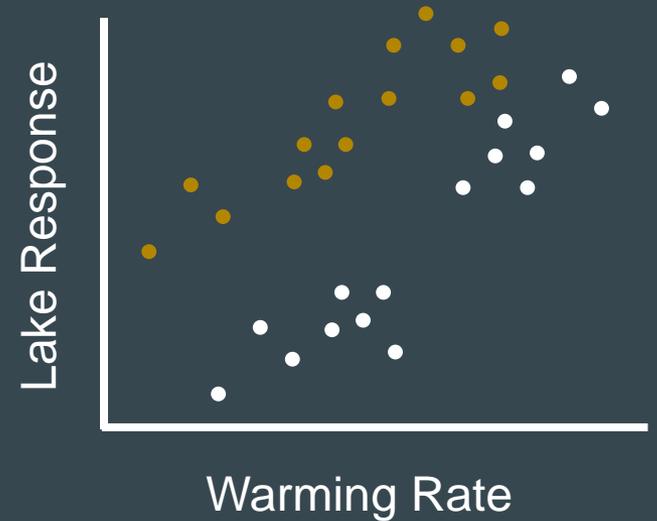
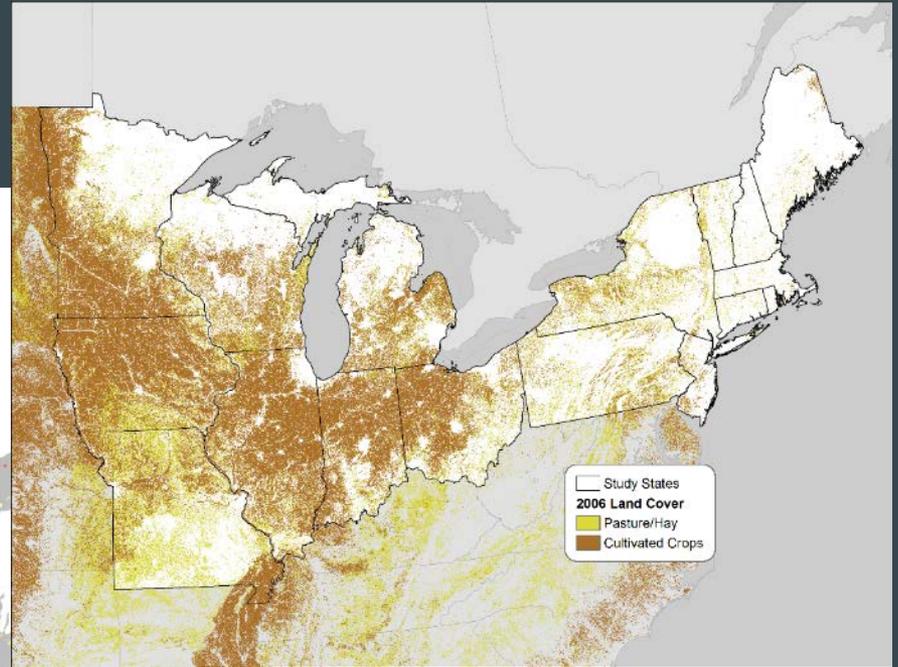
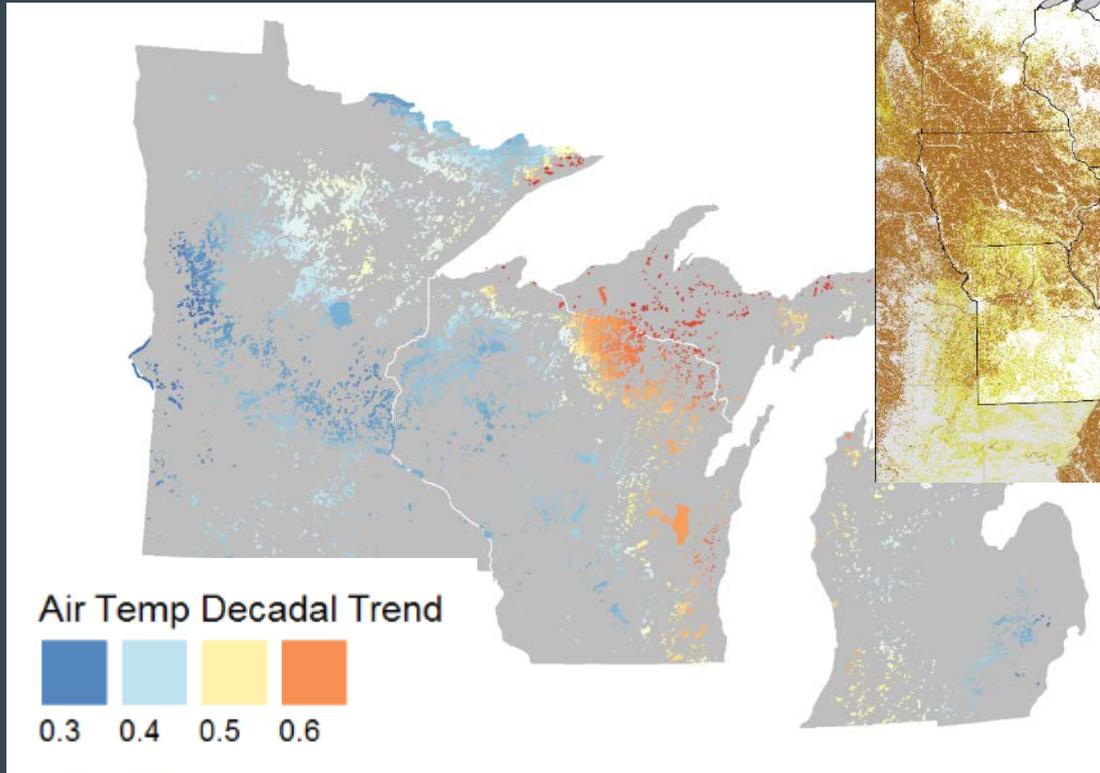
See <https://lagoslakes.org/projects/continental-limnology/> for what's next

Now we have the data.

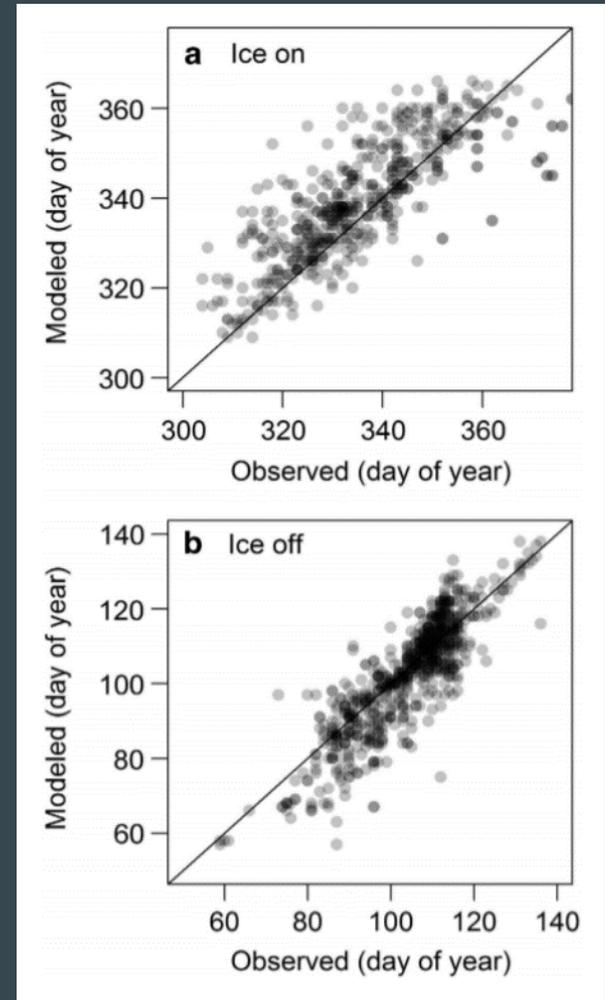
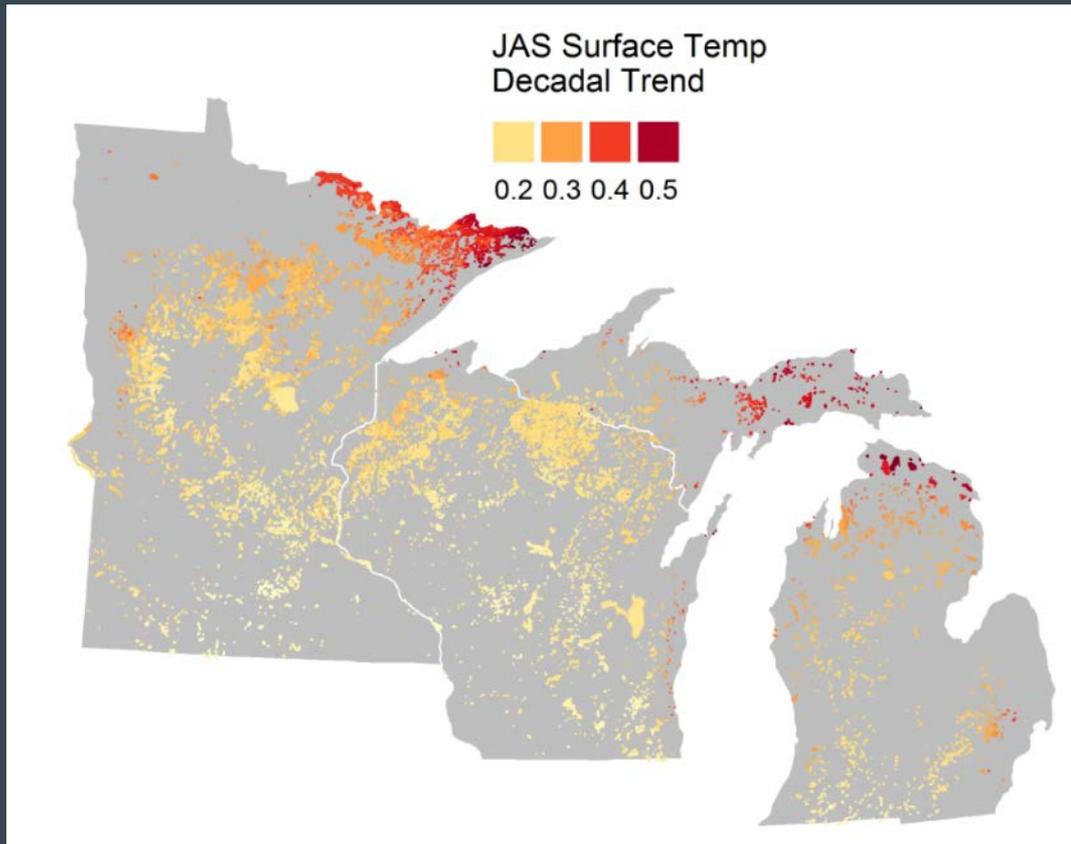
Case study: Why “we”  
depend on “you”.

*Why large scale studies depend on  
lake-specific data.*

# Representation

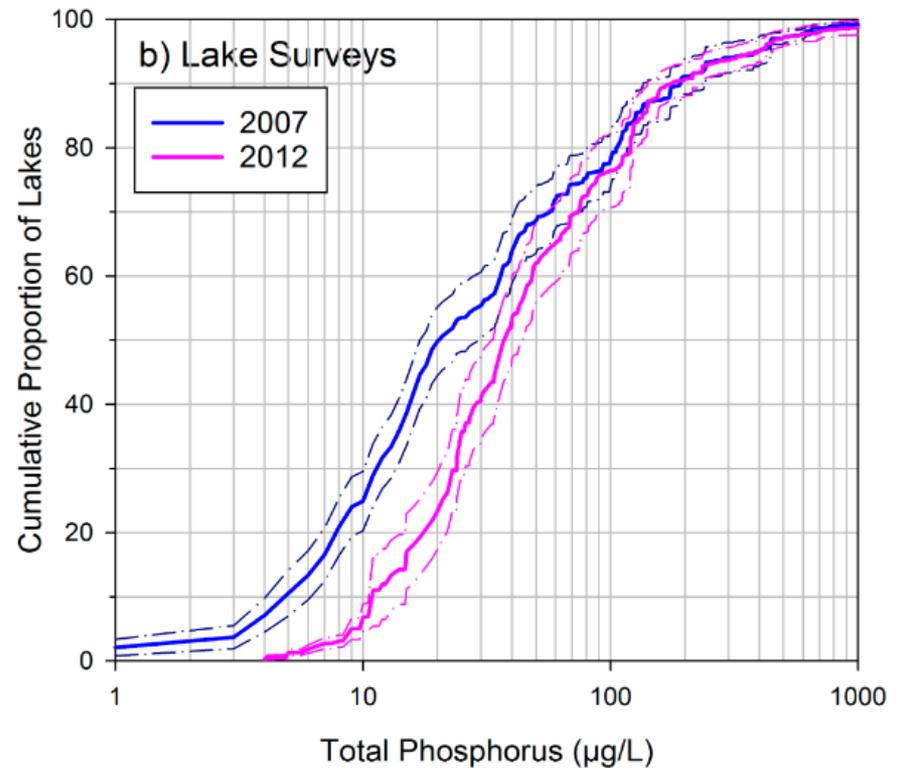
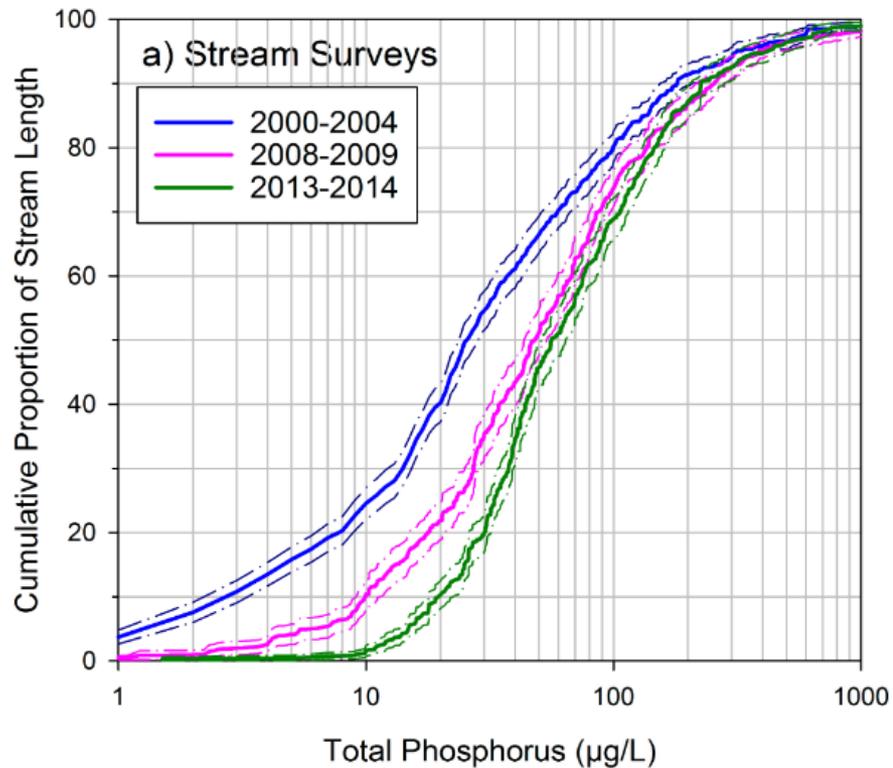


# Prediction & Projection



“Models are never right, but sometimes they’re useful.” – we need real data to make them useful.

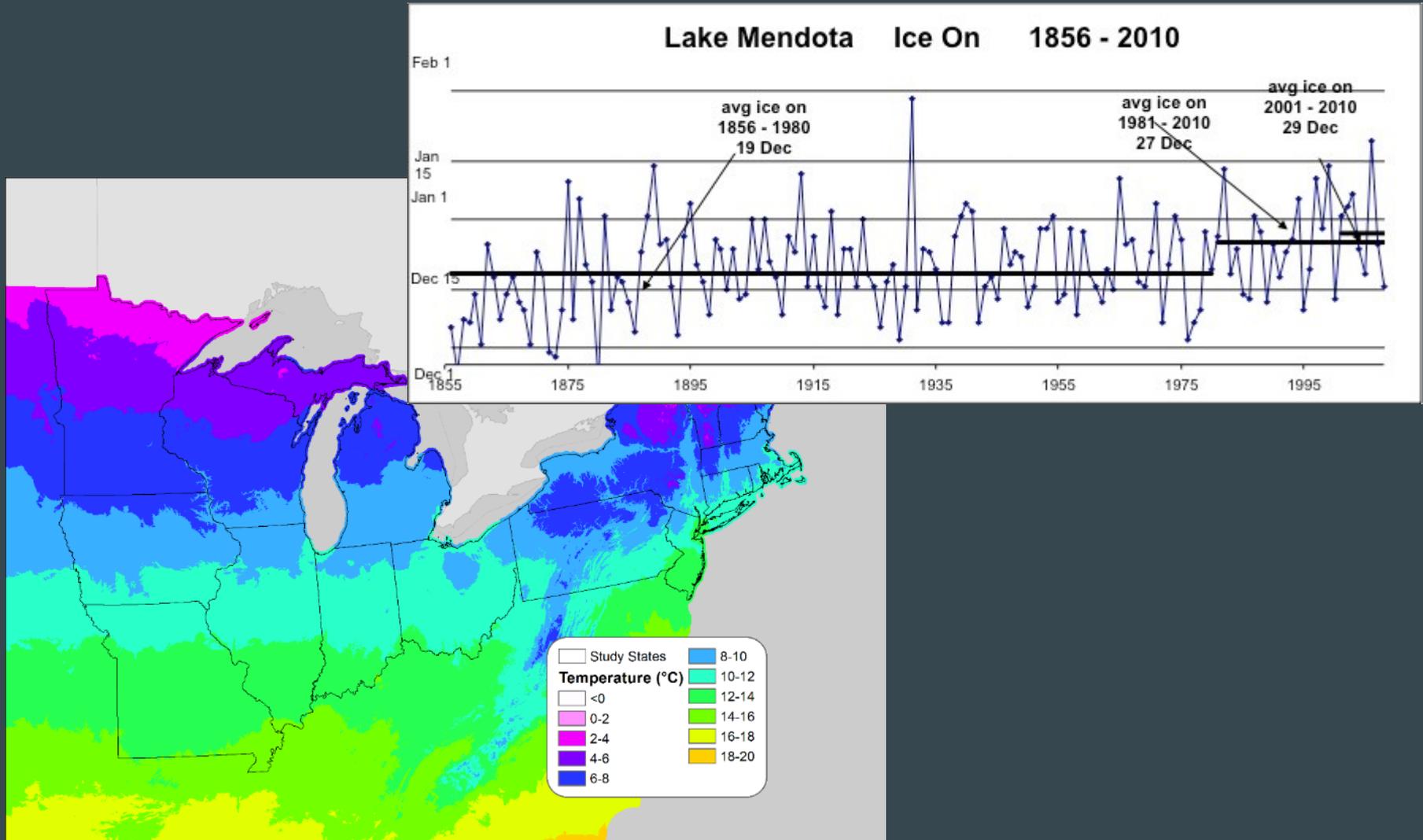
# Scale of Problem & Solutions



# Why should you care about other lakes?

*How individuals who are vested in individual lakes or regions can gain value from broad-scale studies.*

# We have yet to invent a time machine



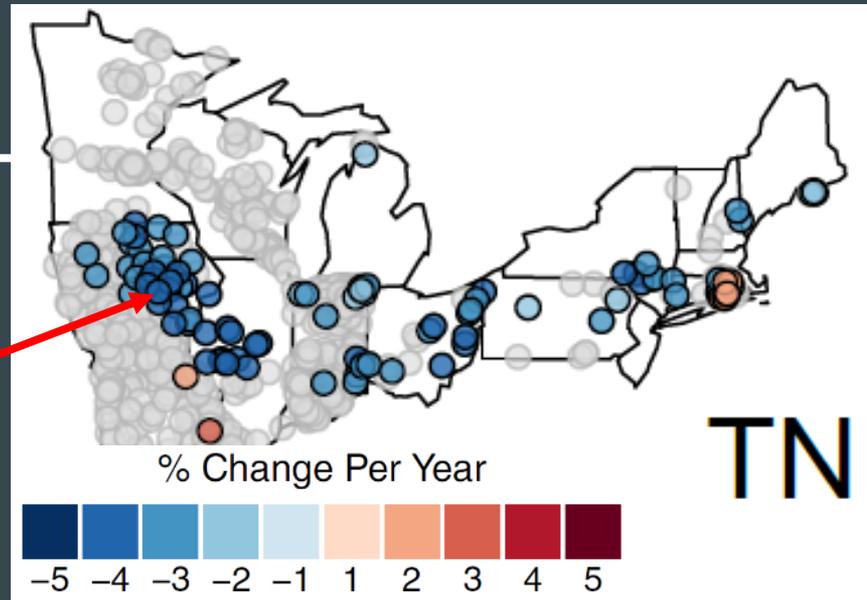
# Scale of (your) problems & solutions

Your Lake

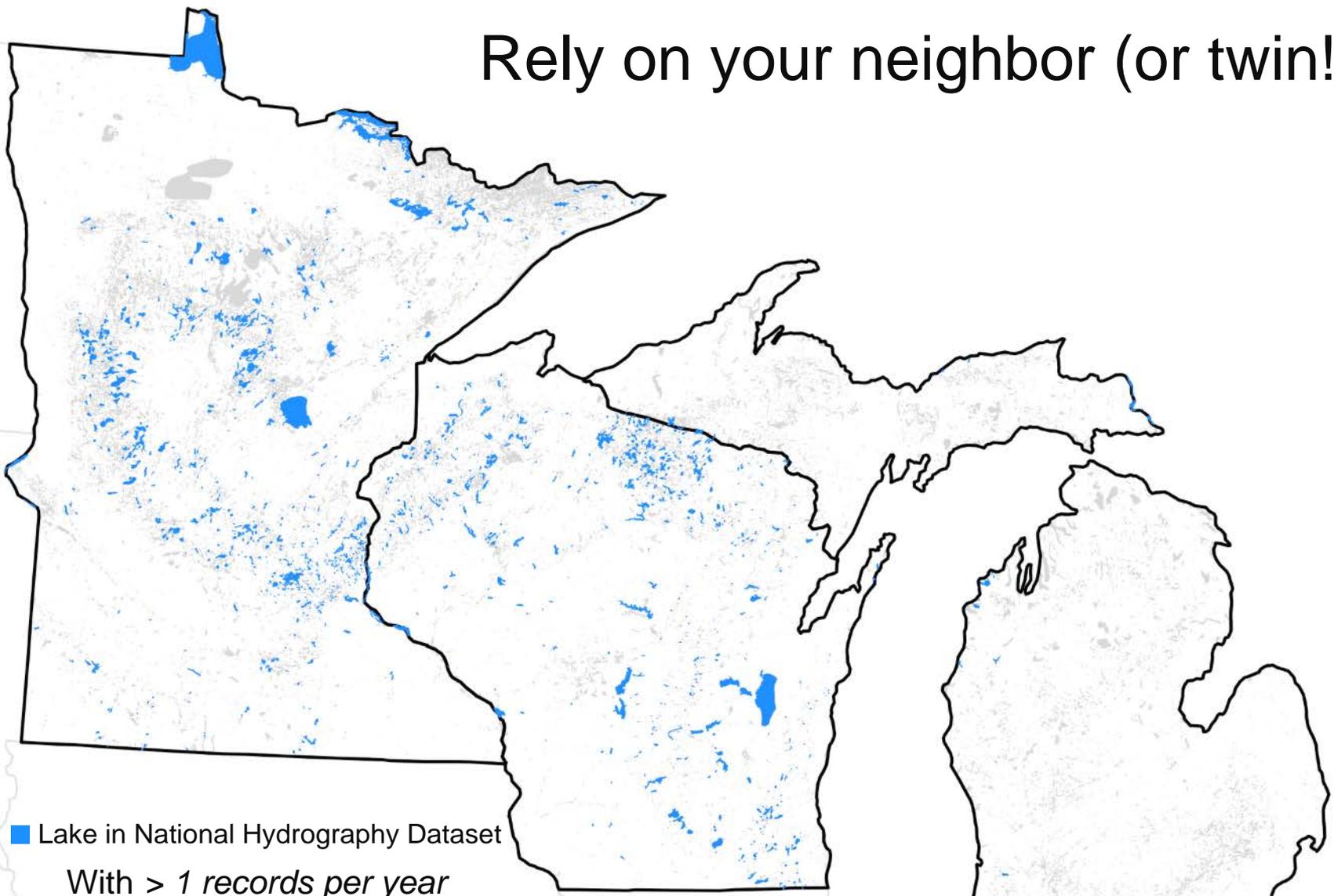


Conclusion: Our local intervention reduced nitrogen!

Conclusion: Some regional changes caused N declines in our lake.



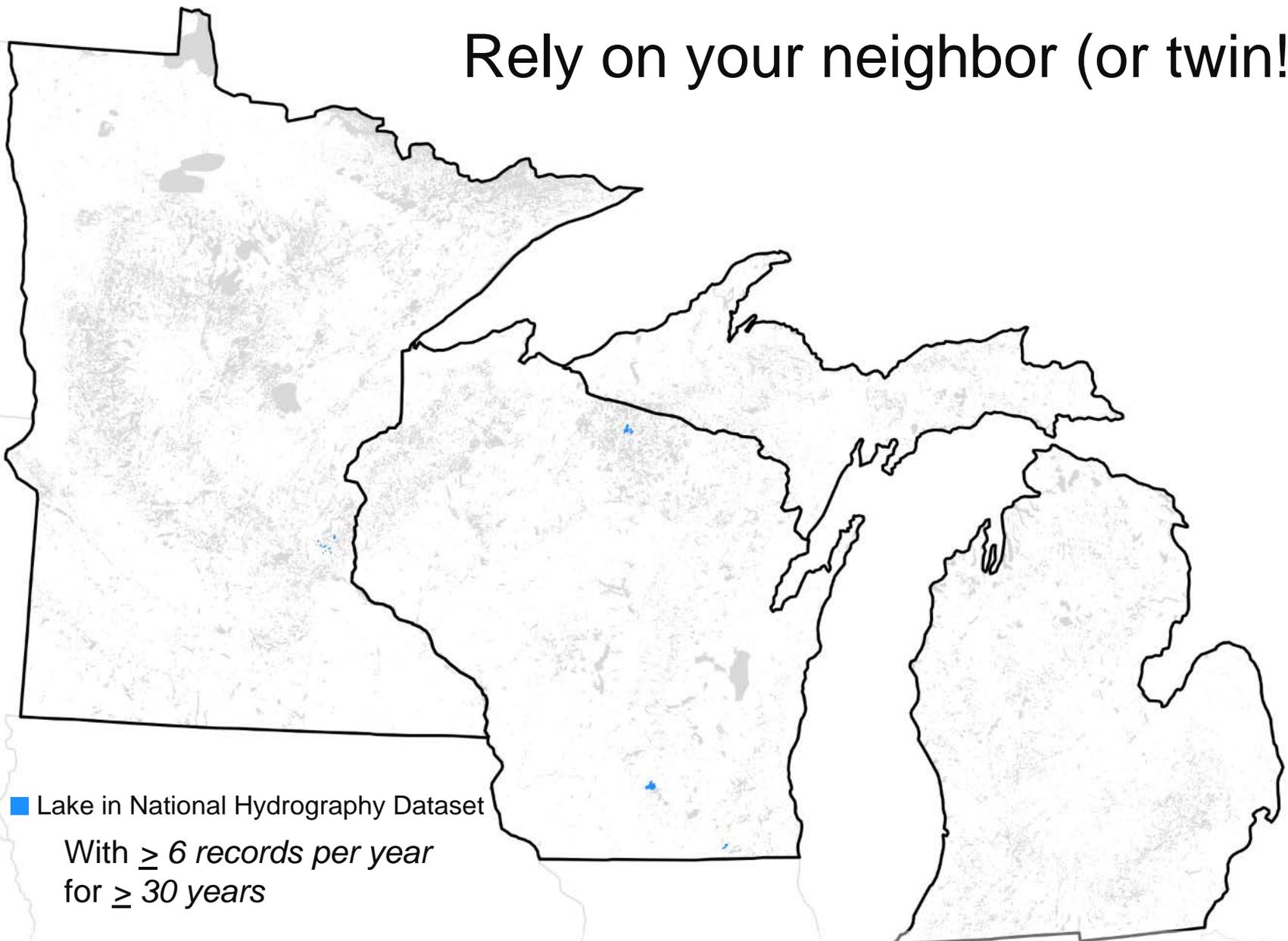
# Rely on your neighbor (or twin!)



■ Lake in National Hydrography Dataset  
With  $\geq 1$  records per year  
for  $\geq 5$  years



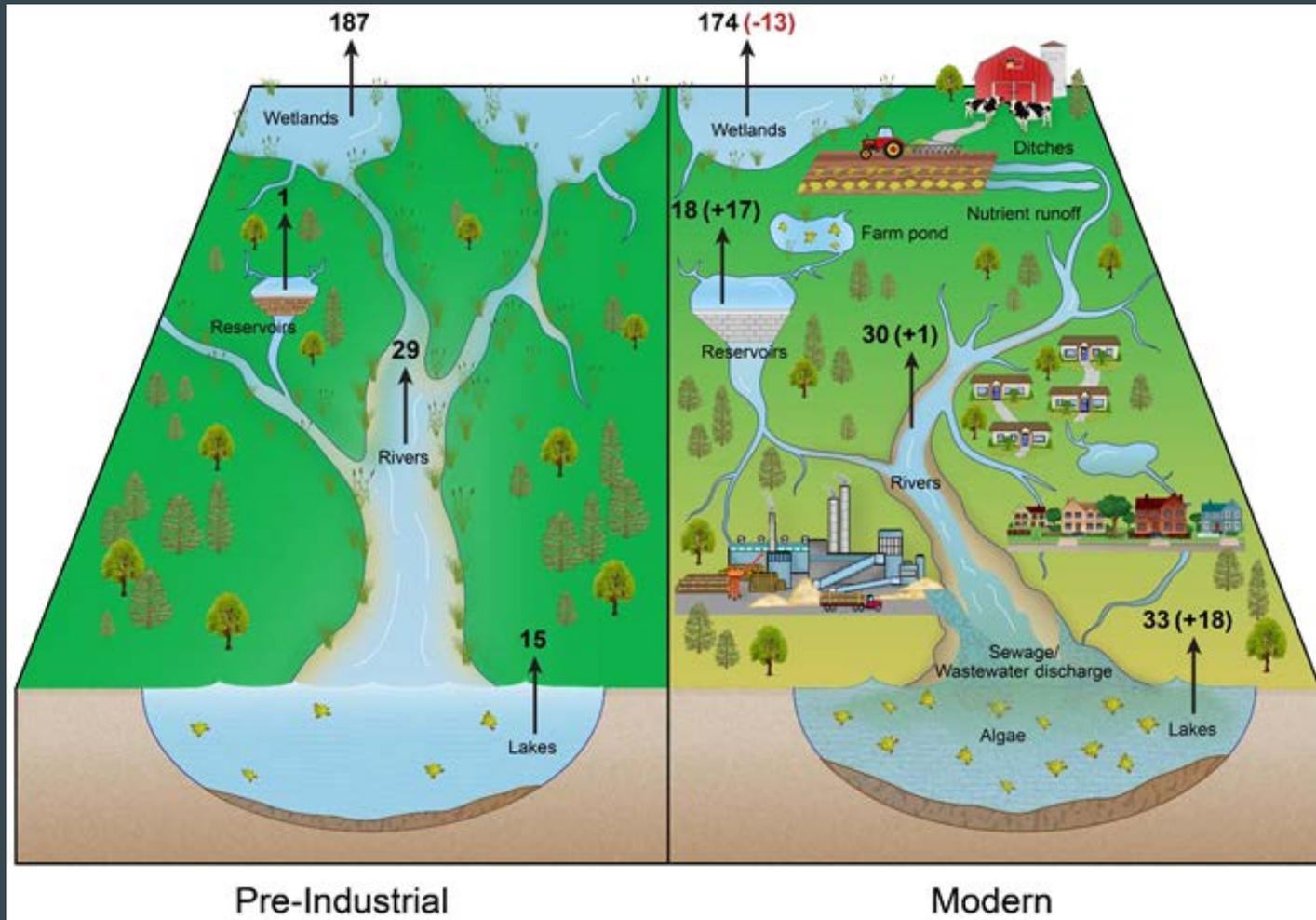
# Rely on your neighbor (or twin!)



■ Lake in National Hydrography Dataset  
With  $\geq 6$  records per year  
for  $\geq 30$  years



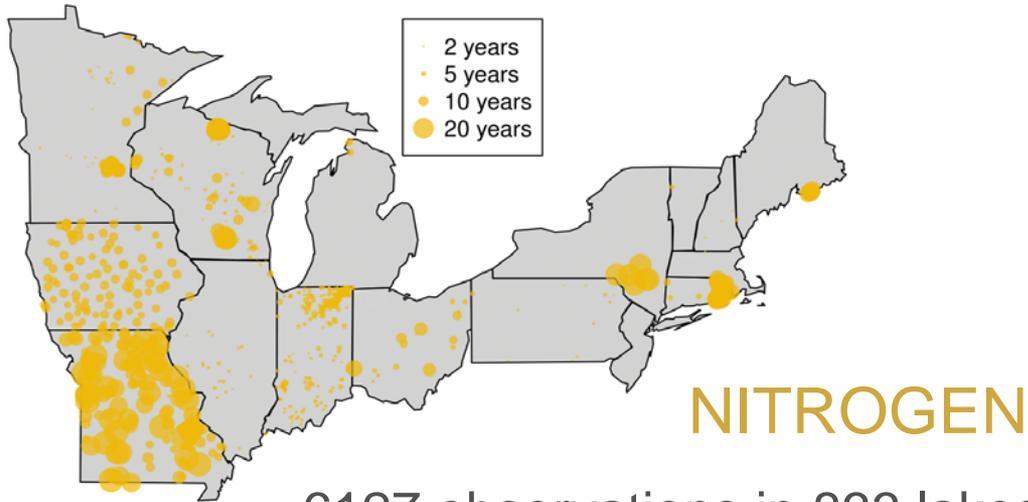
whole >  $\sum$  parts



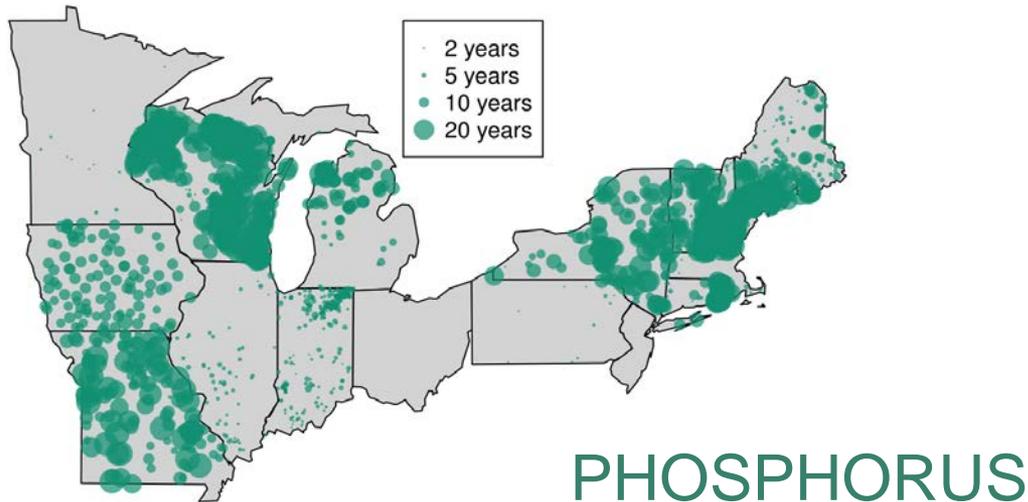
Q1: Have lake nutrients or chlorophyll changed since 1990?

Q2: And if so, what local and regional factors are related to trends?

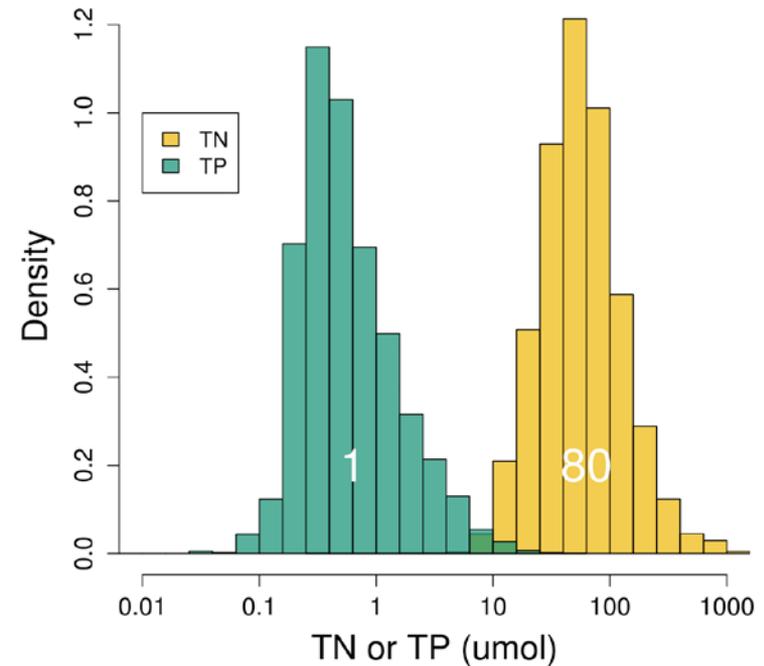
# LAGOS v1.54



6127 observations in 833 lakes  
Mean record length: 7.4 years



20,872 observations in 2096 lakes  
Mean record length: 10.0 years

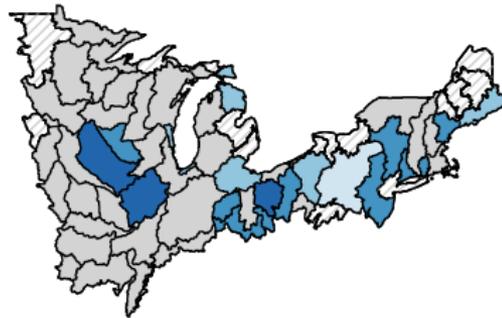
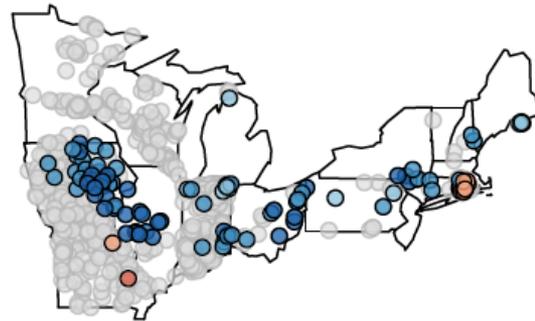
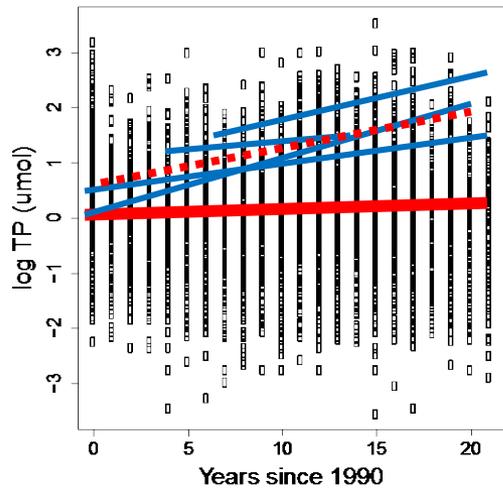


- 1) All observations > 1989
- 2) Obs in each half of timeframe (1990-2000, 2001-2011)
- 3) Data must span 5 years
- 4) Mean summer epilimnetic TN, TP, TN:TP (concurrent), Chl

# Step 1: Hierarchical Linear Models (HLMs)

Starting concentration (intercept) and change through time (slope) allowed to vary by lake and region

# METHODS



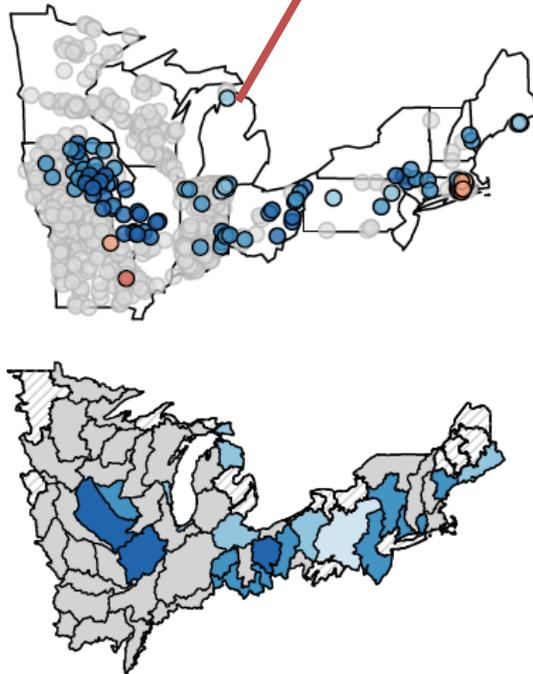
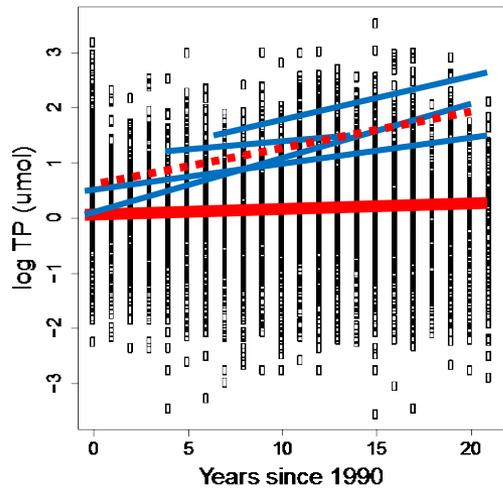
# Step 1: Hierarchical Linear Models (HLMs)

Starting concentration (intercept) and change through time (slope) allowed to vary by lake and region

# METHODS

Categorized as increasing, decreasing, not changing

- RF 1: trends ~ lake predictors
  - WS LULC, lake depth, area
- RF2: trends ~ regional predictors
  - HUC 4 LULC, climate, atm. Dep
- RF3: trends ~ regional + lake
  - Model selection to find most important predictors

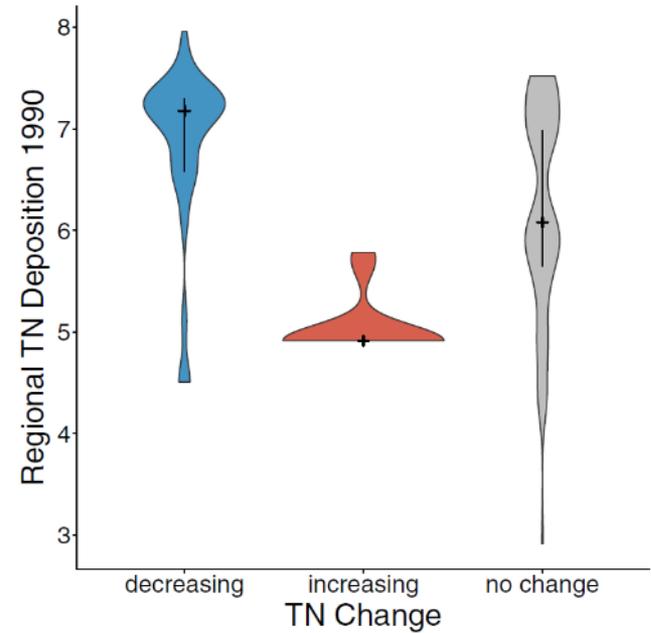
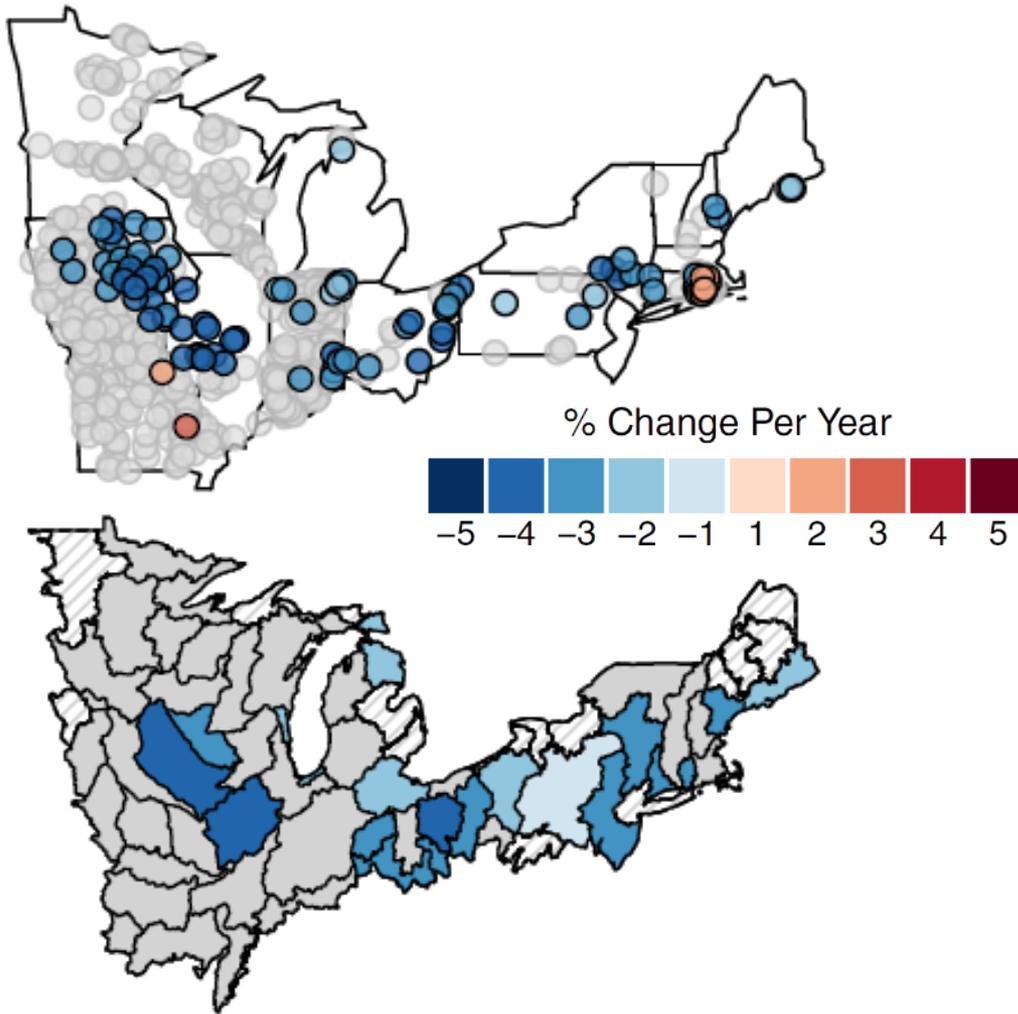


## Step 2: Random Forests

Lake and region-level predictors used to predict lake-specific trends

# NITROGEN

833 lakes

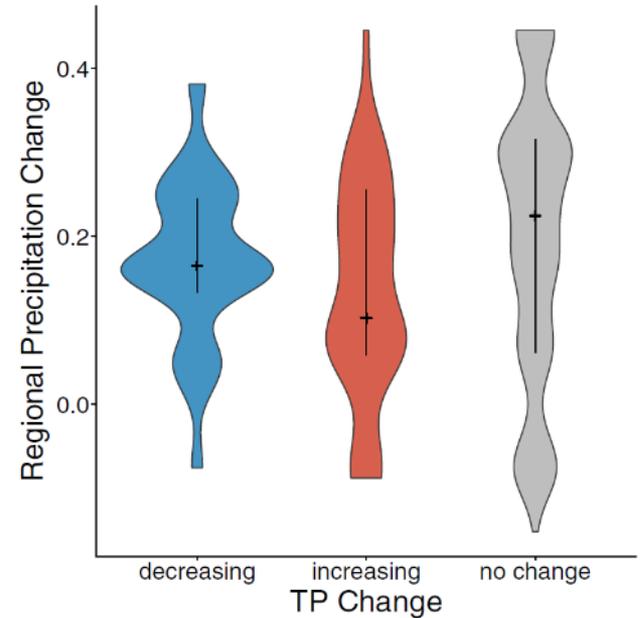
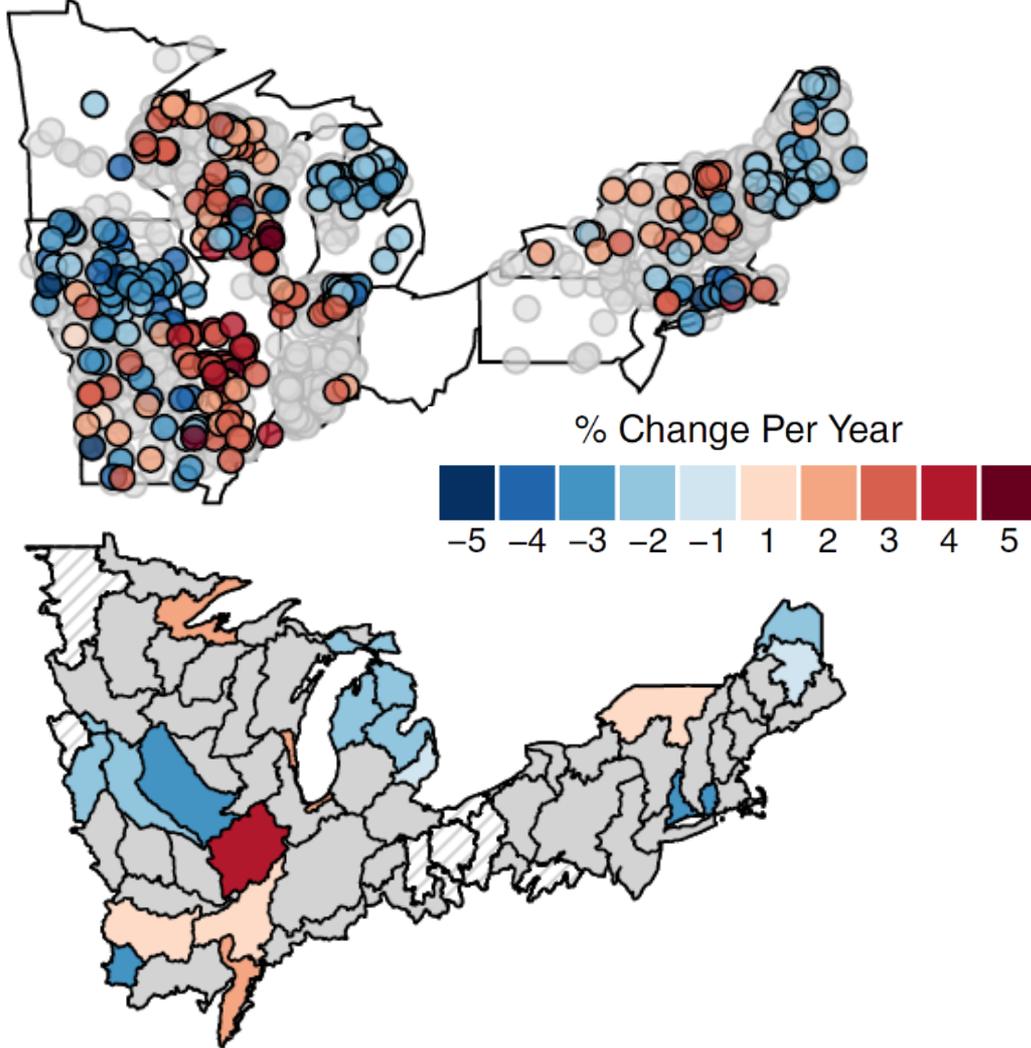


Regional predictors alone could correctly classified 82% of lakes

Across all lakes, TN declined at a rate of  $-1.1\%$  ( $-1.5$  to  $-0.70$ ) per year. Only 13% of lakes and 32% of regions had significant trends in TN.

# PHOSPHORUS

## 2096 lakes

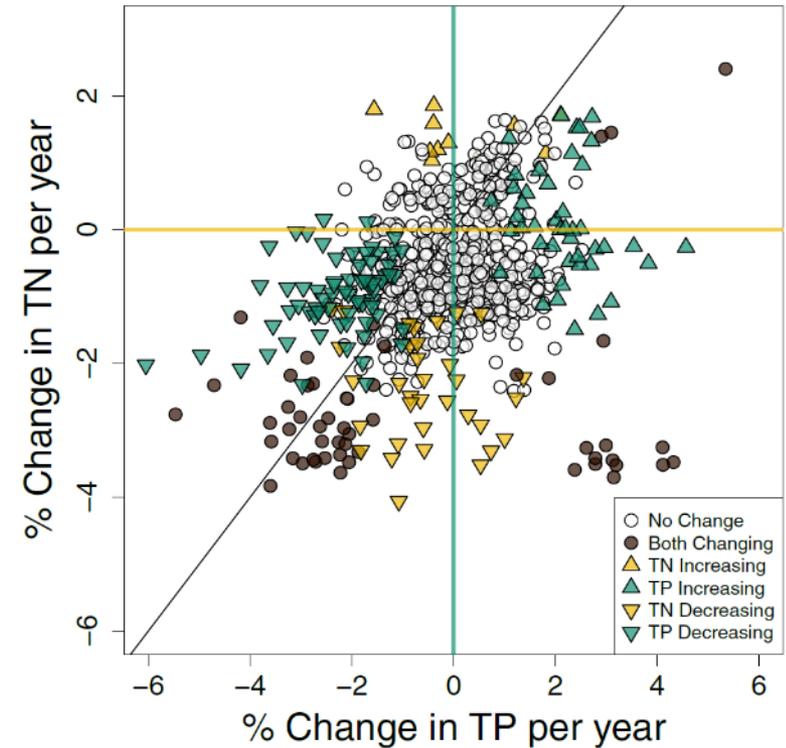
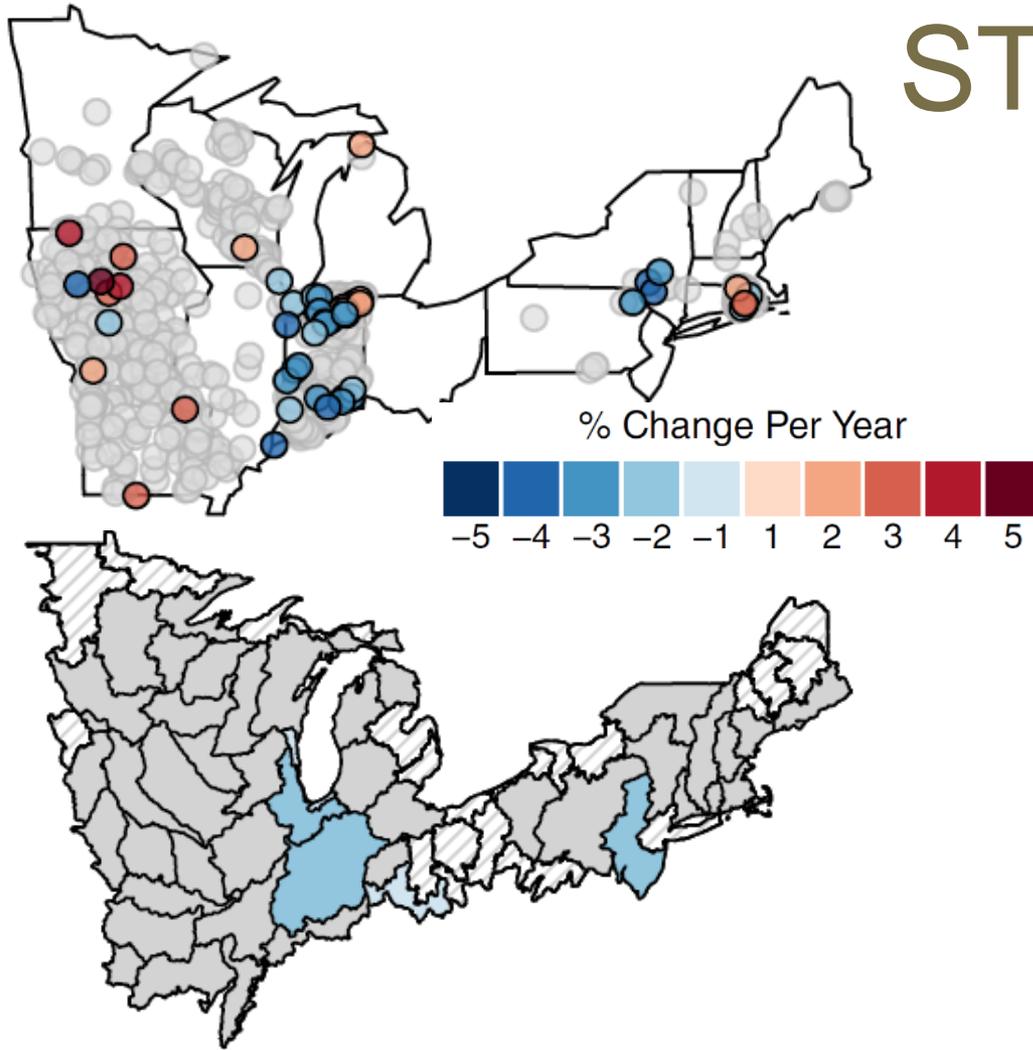


Lake and region-level predictors performed similarly at predicting TP change, RF models could accurately classify 68% of lakes.

Across all lakes, TP declined at a rate of **-0.2% (-0.5 to 0.1) per year**. 16% of lakes and 31% of regions had significant trends in TP.

# STOICHIOMETRY

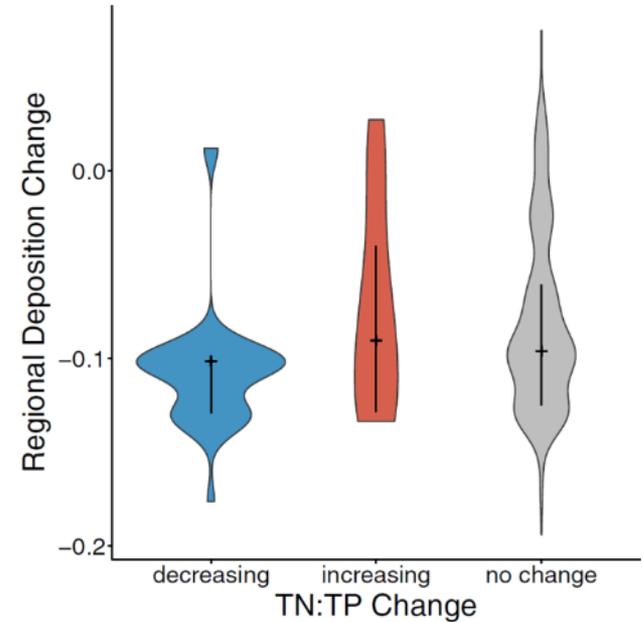
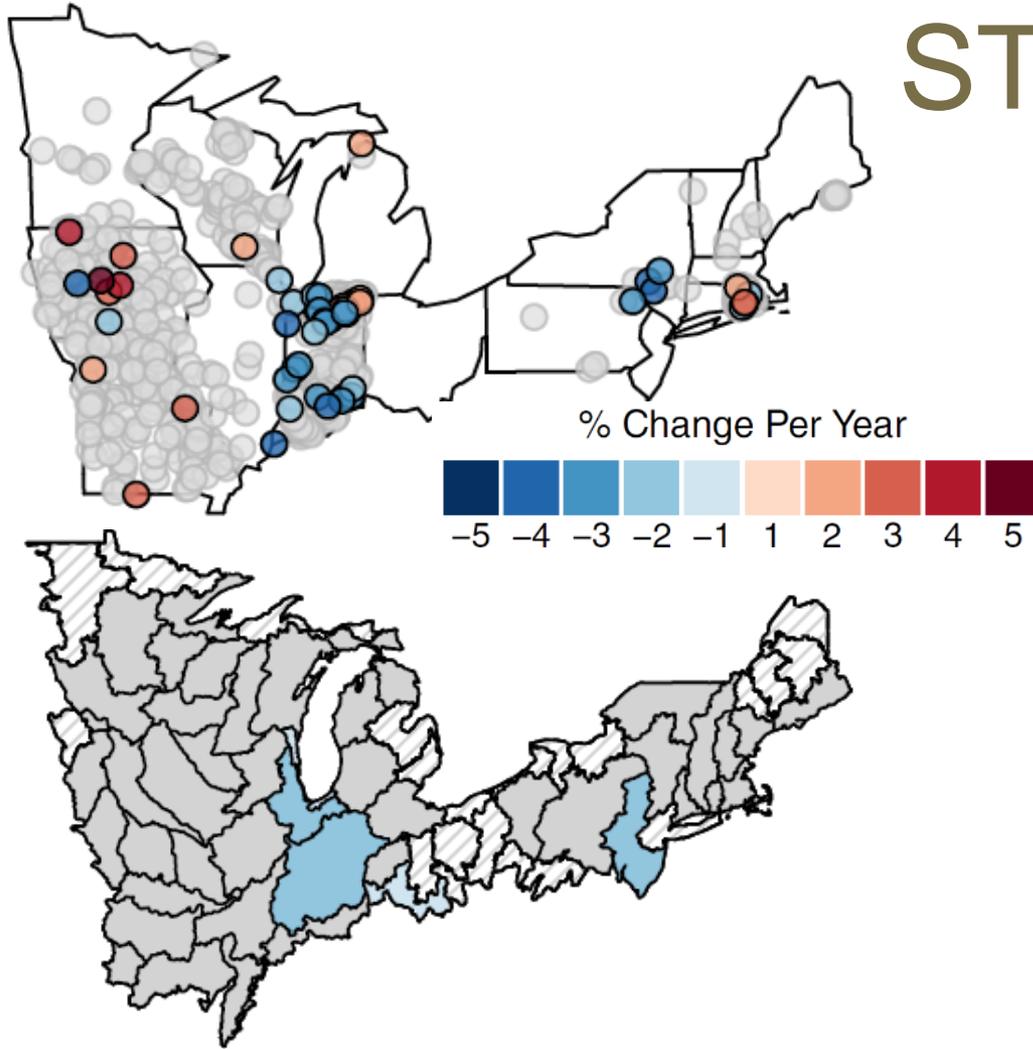
742 lakes



Across all lakes, TN:TP declined at a rate of **-0.2% (-0.6 to 0.1) per year**. 7% of lakes and 11% of regions had significant trends in TN:TP.

# STOICHIOMETRY

742 lakes

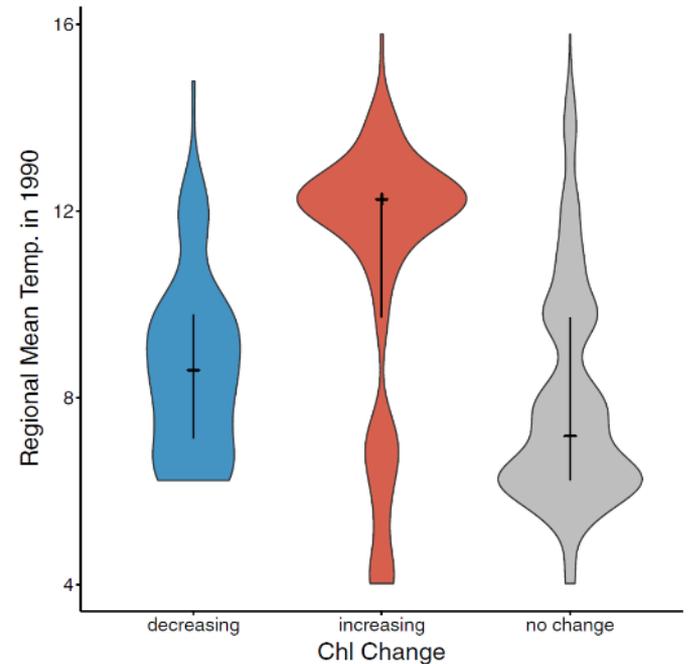
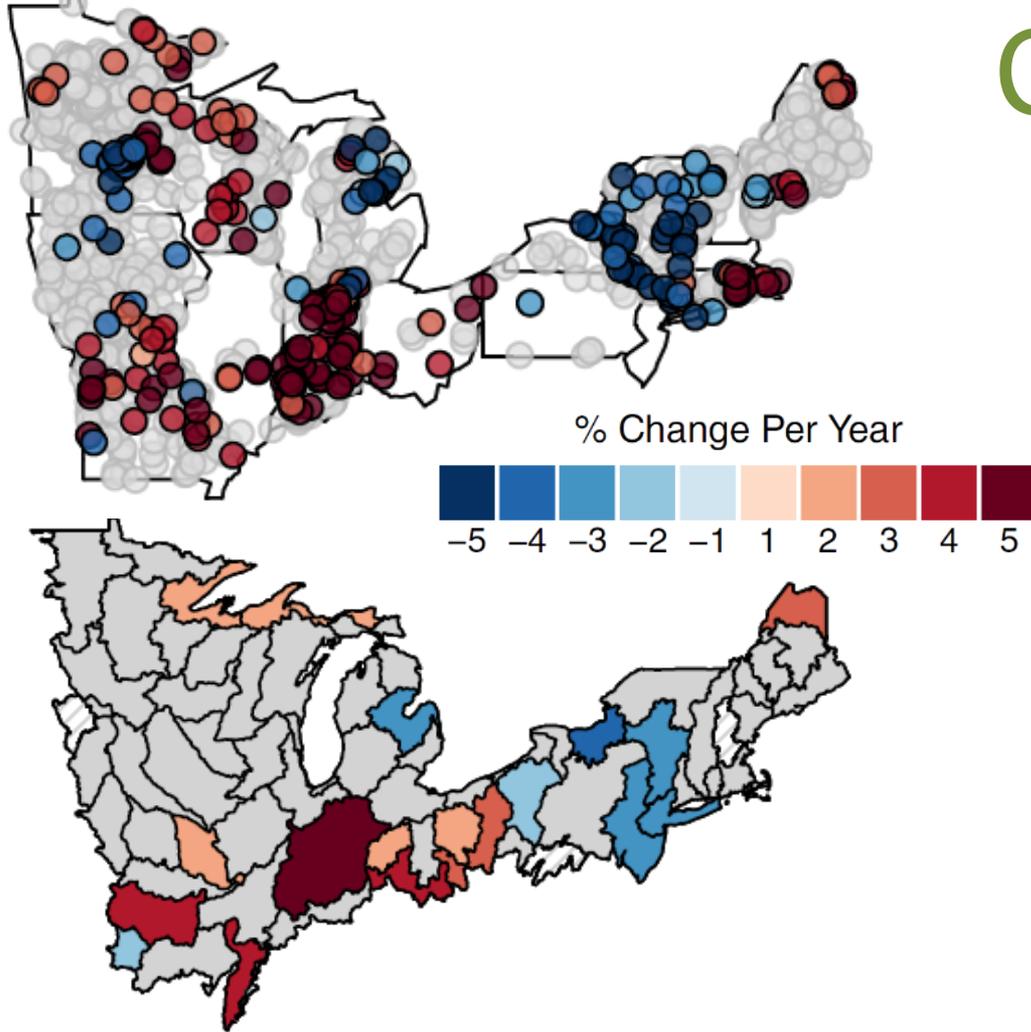


Region-level predictors performed worse than random, lake-level predictors accurately classified 59% of lakes.

Across all lakes, TN:TP declined at a rate of **-0.2% (-0.6 to 0.1) per year**. 7% of lakes and 11% of regions had significant trends in TN:TP.

# CHLOROPHYLL

2239 lakes

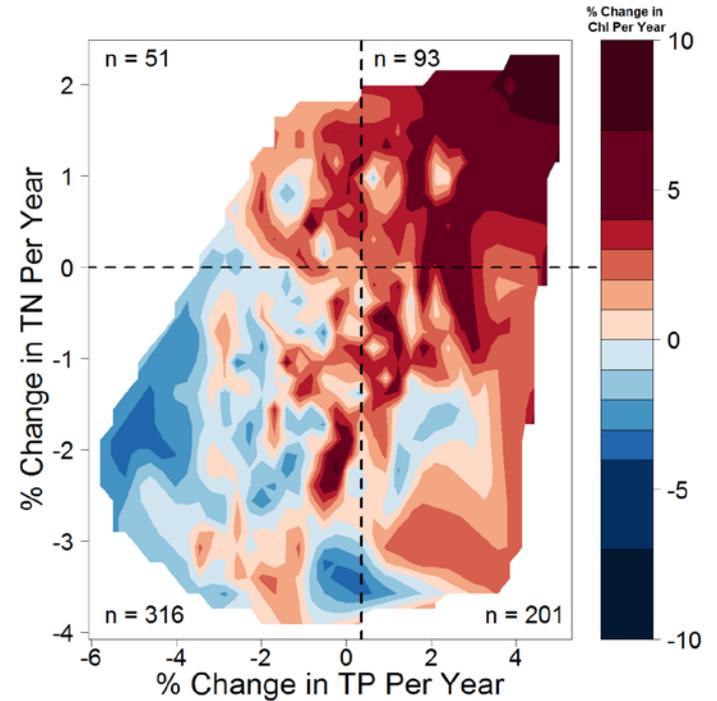
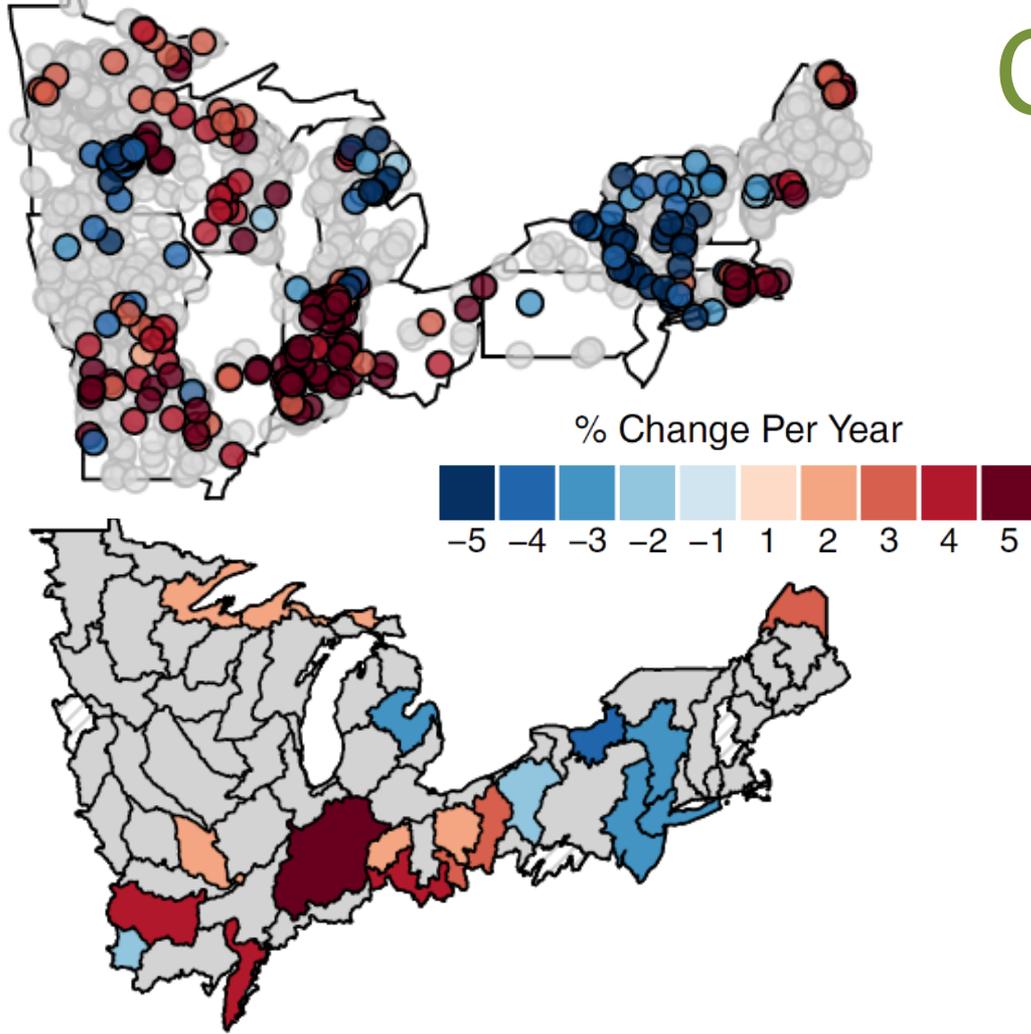


Lake and region-level predictors performed similarly at predicting Chl changes. RF models could accurately classify 72% of lakes.

Across all lakes, Chl increased at a rate of 0.3% (-0.2 to 0.8) per year. 15% of lakes and 29% of regions had significant trends in Chl.

# CHLOROPHYLL

2239 lakes



Across all lakes, Chl increased at a rate of **0.3% (-0.2 to 0.8)** per year. 15% of lakes and 29% of regions had significant trends in Chl.

# Q1: Have lake nutrients or chlorophyll changed since 1990?

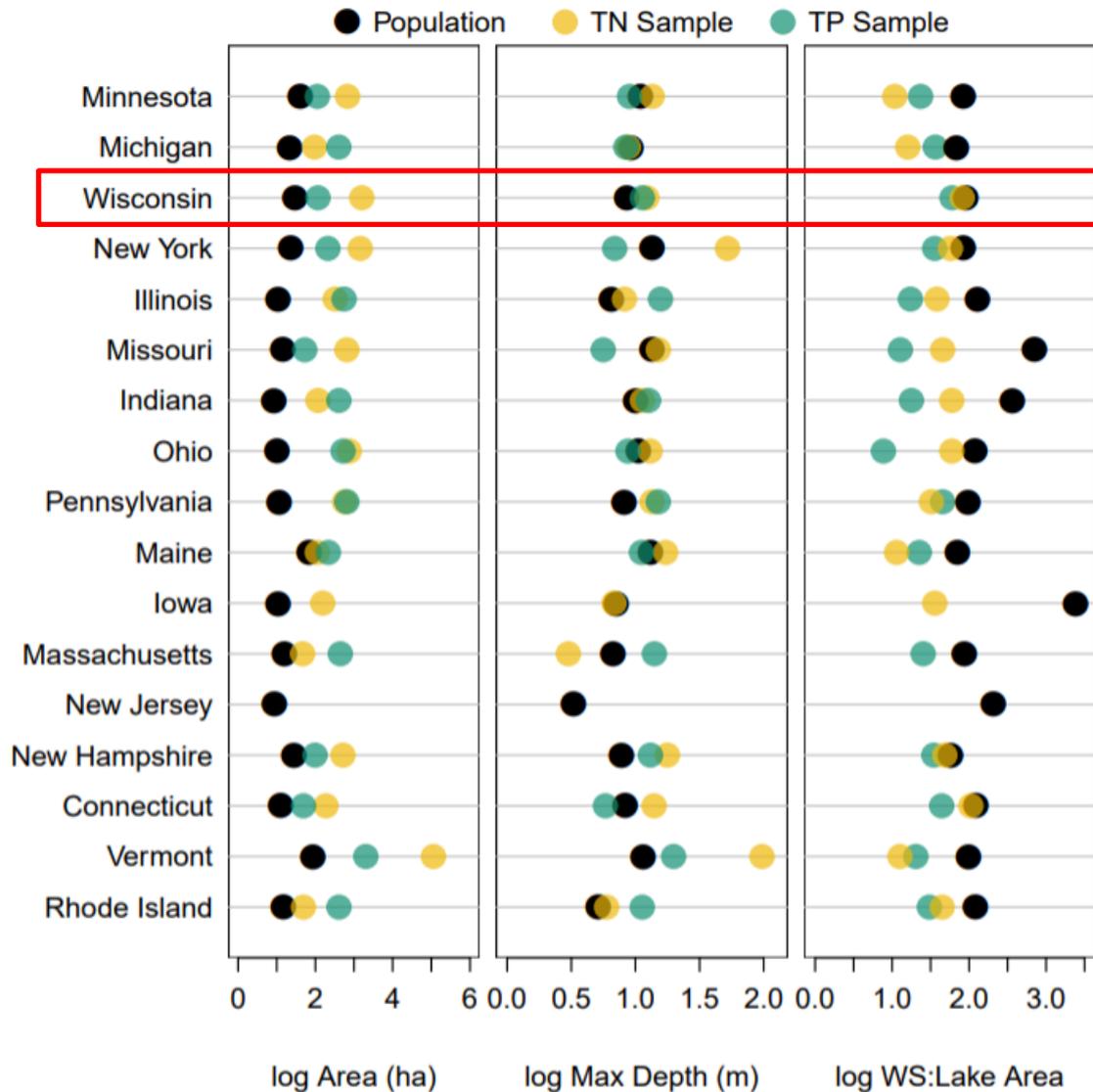
At the population scale, nitrogen is declining. However, most individual lakes have not changed in N, P, N:P or chlorophyll since 1990.

# Q2: And if so, what lake and regional factors are related to trends?

Direction of N changes similar within and across regions, and related to region-level drivers, compared to variable P trends, which were related to both lake and region drivers. Greatest Chl increases related to nutrient trends and climate.

So how does Wisconsin stack up?

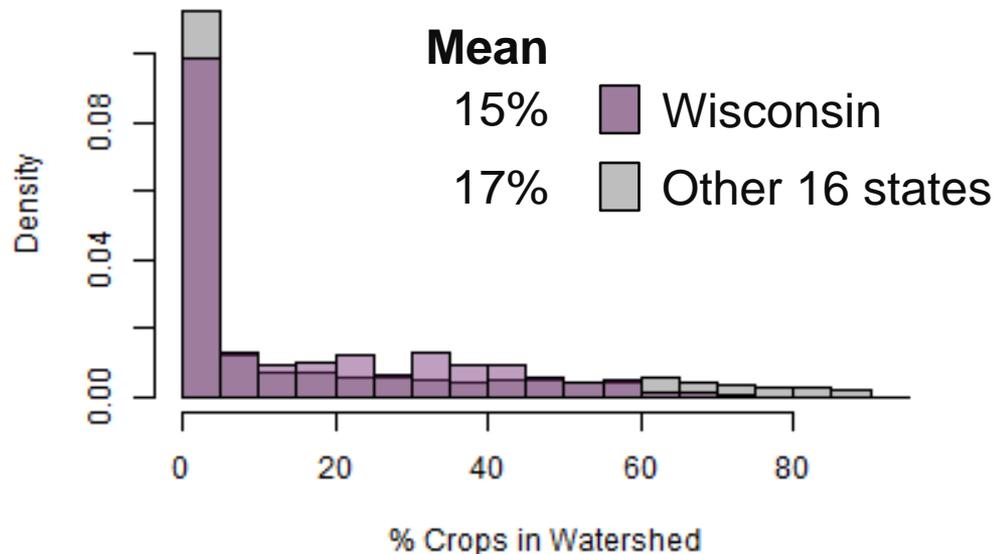
# First, are we comparing apples to apples?



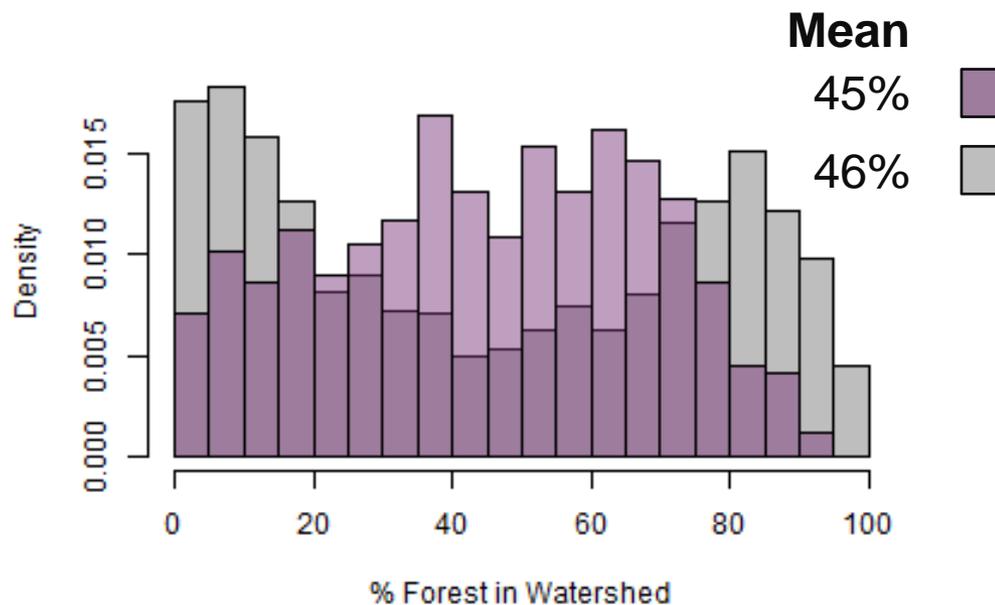
For example, we know we have data for a subset of lakes that are *larger, deeper, and have longer residence time* than the population of lakes on the landscape.

But Wisconsin is just as biased (or less!) than other states.

# First, are we comparing apples to apples?



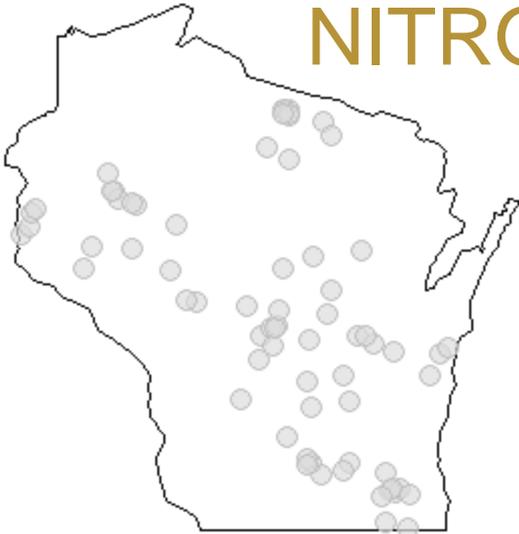
Overall, the types of lakes we sample in WI appear to be representative of the lakes we sample elsewhere.



# Water quality trends in Wisconsin

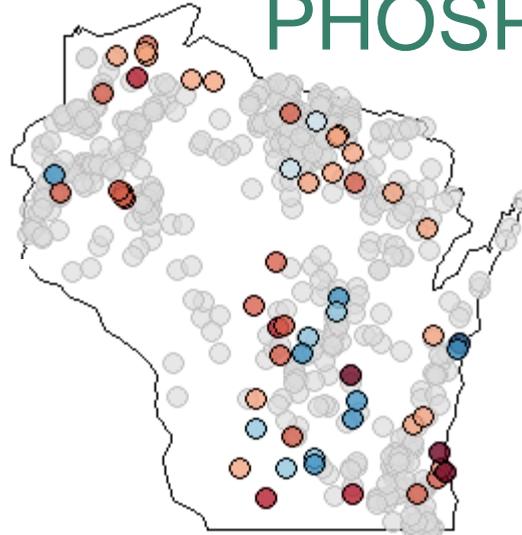
## NITROGEN (69 lakes)

No change



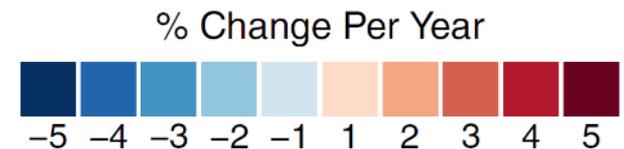
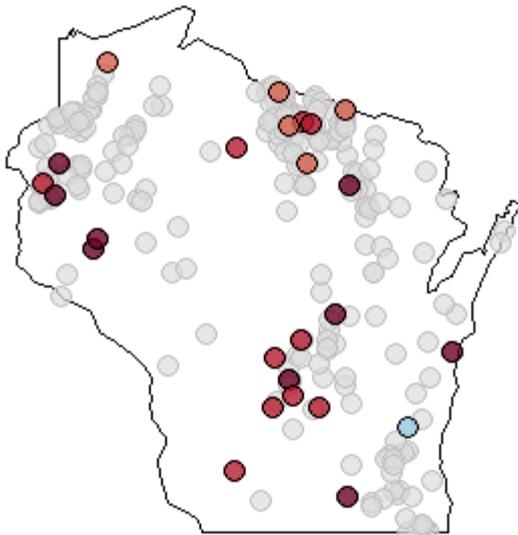
## PHOSPHORUS (536 lakes)

Fewer lakes changing, but increasing > decreasing  
42 lakes increasing (8%)  
15 lakes decreasing (3%)

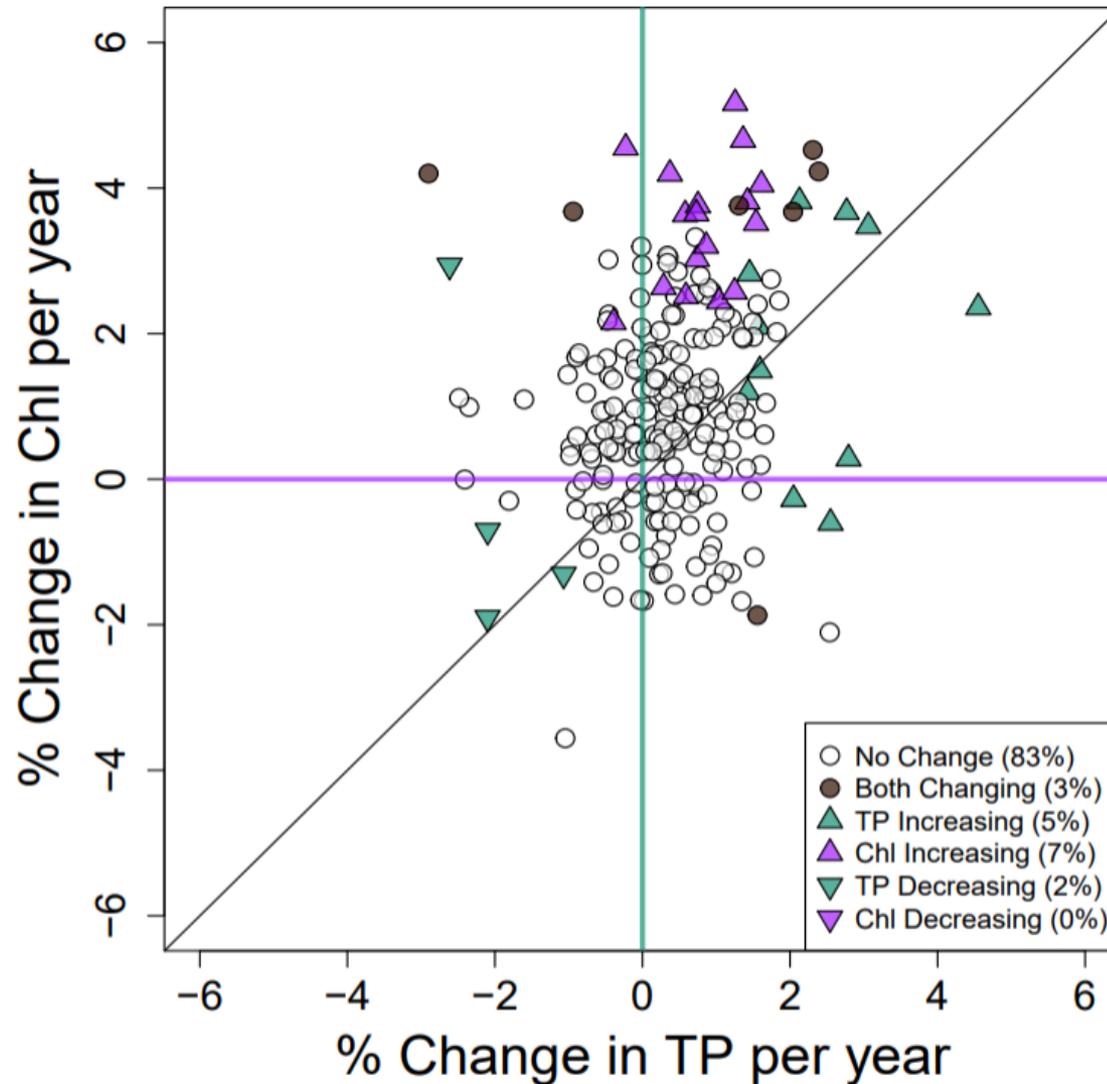


## CHLOROPHYLL (233 lakes)

10% of lakes increasing  
At mean rate of 4% per year



# Water quality trends in Wisconsin



Changes in nutrients not necessarily a good predictor of changes in chlorophyll.

# In summary

Hopefully I've convinced you...

- Water quality in the Midwest and Northeast US has neither degraded nor improved since 1990.
- WI largely follows this pattern – but maybe slightly worse off?
- Your data are important to these efforts – keep it up!
- Large-scale analyses/research are relevant to your lake.

# Questions?

## Funding

