

# Using remote sensing to explore spatial and temporal variability of cyanobacteria blooms in Clear Lake

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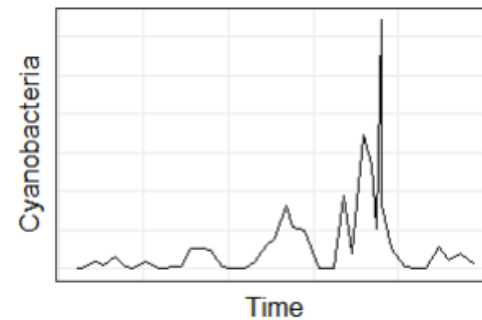
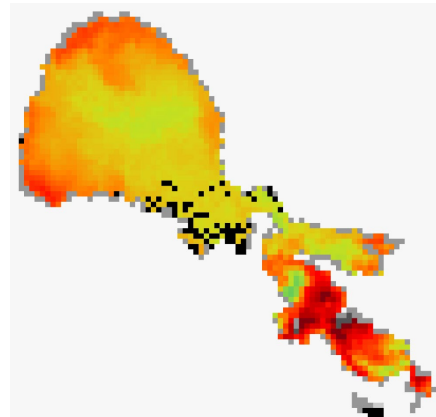
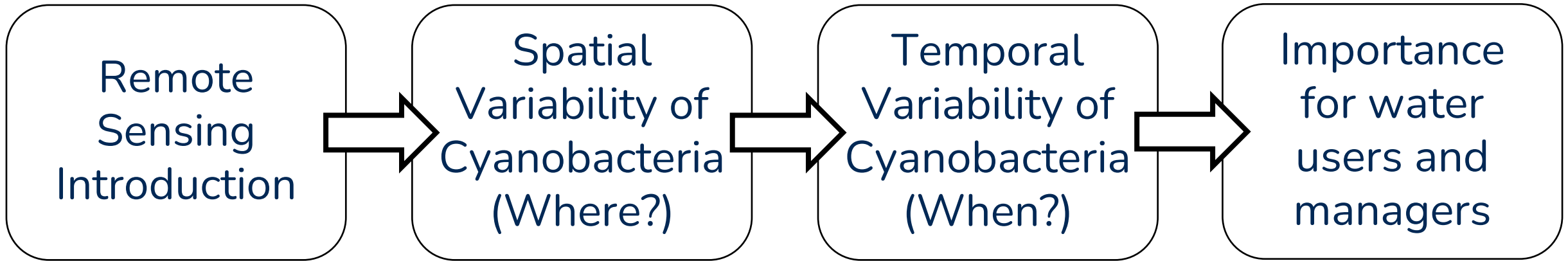
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Clear Lake Integrate Science Symposium – August 15, 2024

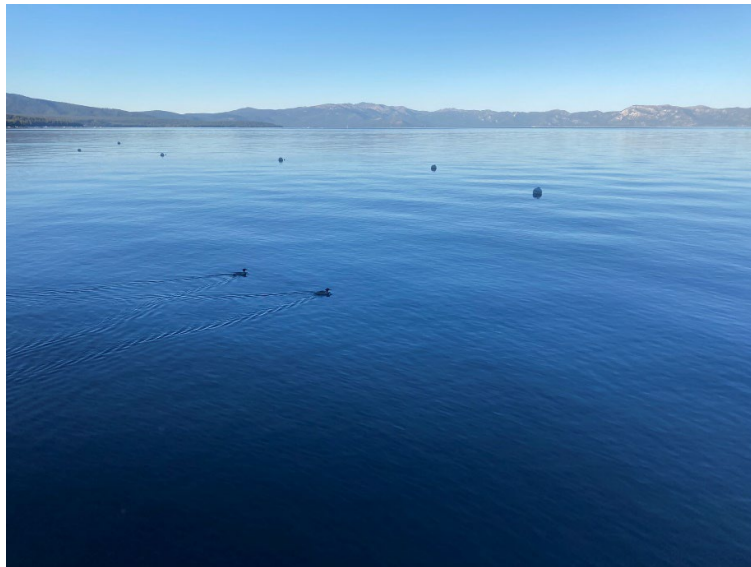
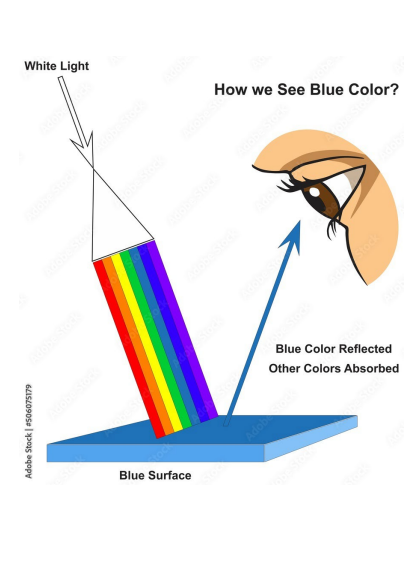
# Outline





# Introduction to Remote Sensing

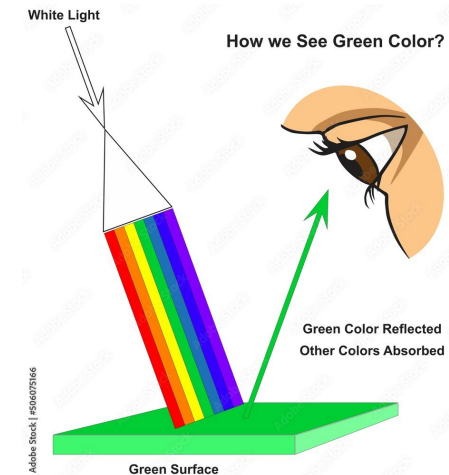
- When a camera takes a photo, it measures **reflectance** of red, green, and blue light
- You can visually discern water (blue) from plants or phytoplankton (green)



Clear blue water in Lake Tahoe



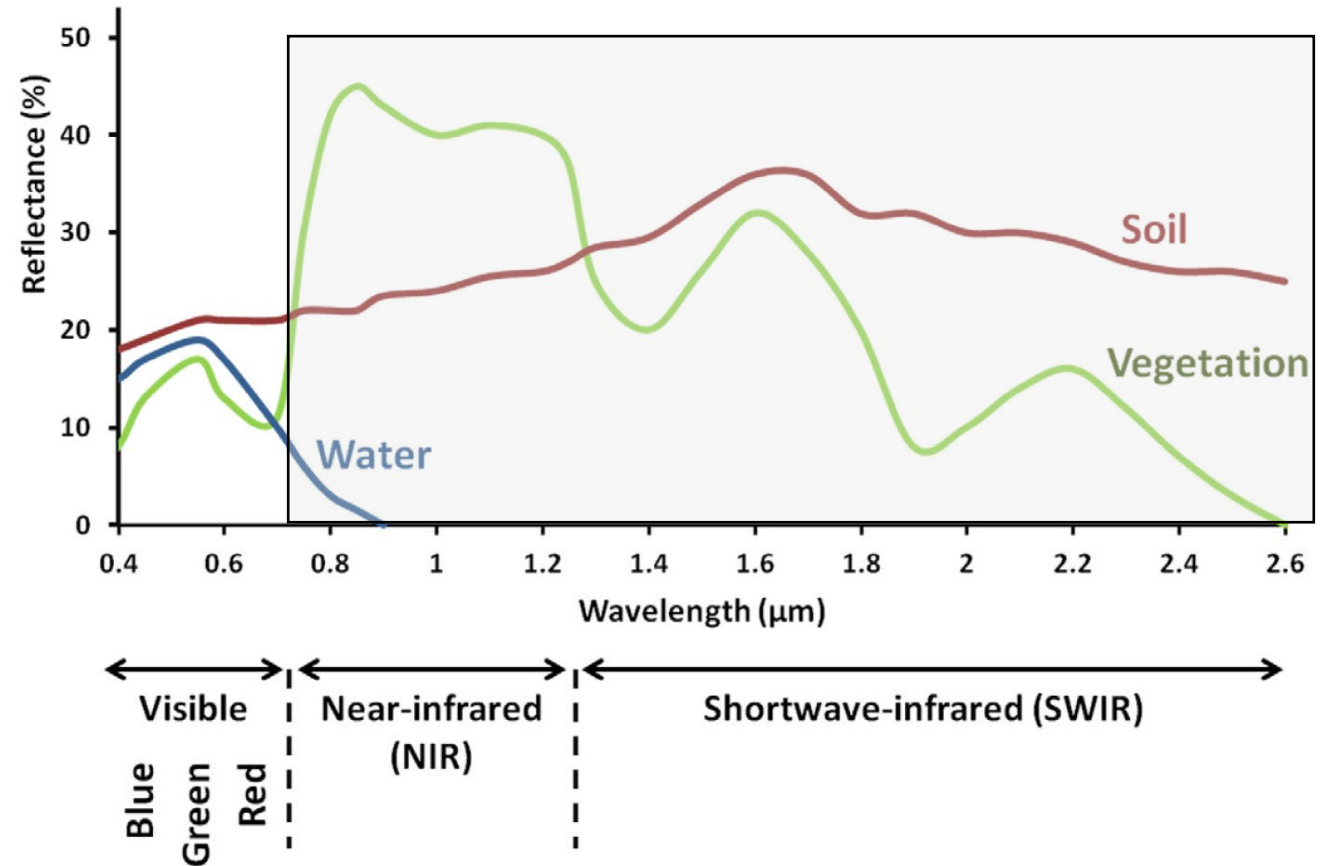
Highly productive water in Clear Lake



# Introduction to Remote Sensing

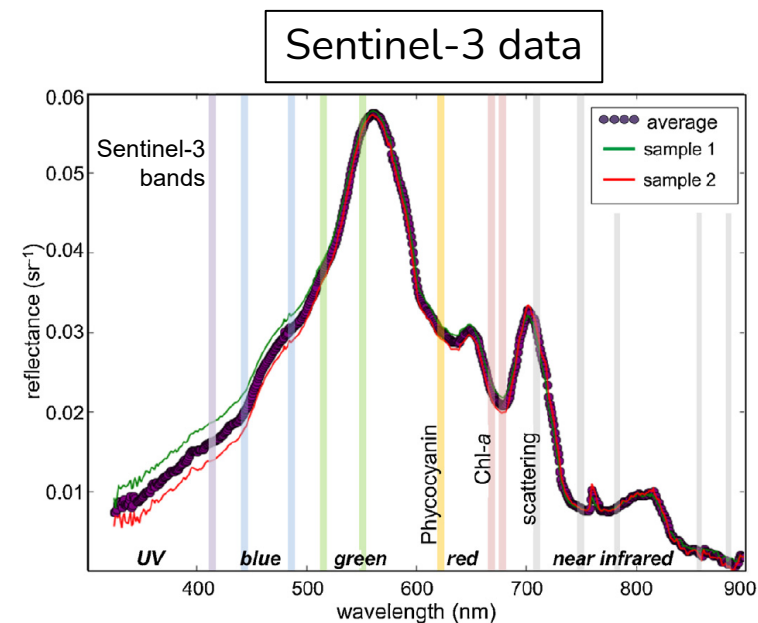
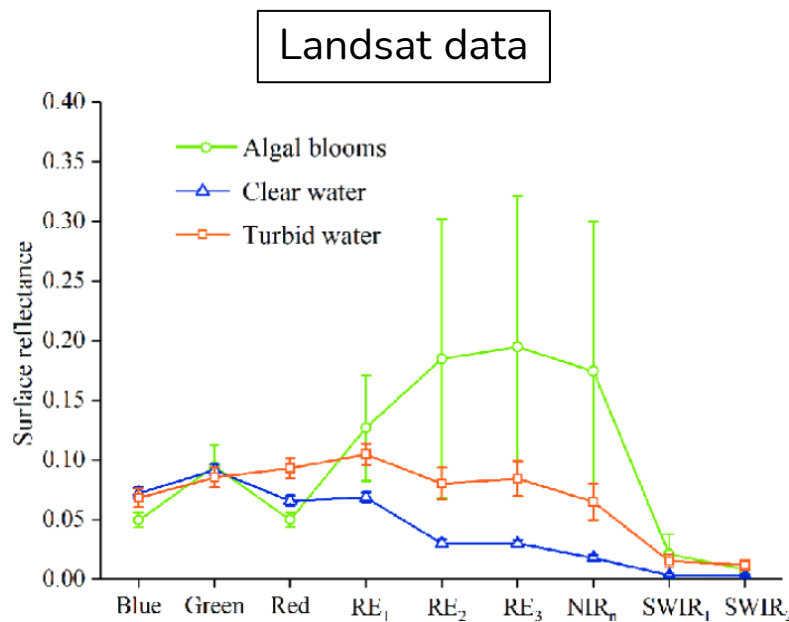
Satellite sensors measure reflectance across **additional wavelengths of light**, used to:

- Distinguish different land surface **features** (e.g. forest from water)
- Measure **optical properties** (e.g. chlorophyll-a concentration)

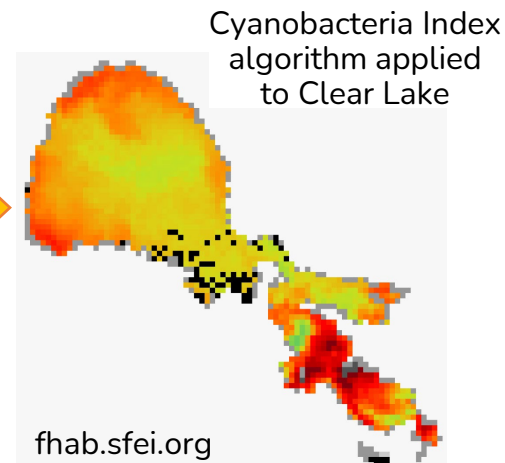
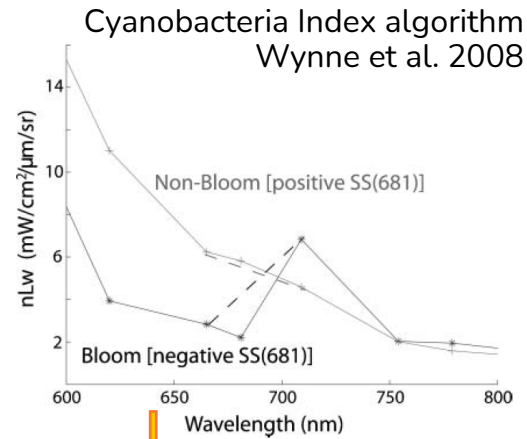


# Introduction to Remote Sensing

- Early satellite missions (Landsat) measured **few wavelengths of light** in the visible spectrum – measure chlorophyll-a (measure of **algal biomass**) → Good for the ecosystem
- More recent satellite missions (Sentinel-3) measure **more wavelengths of light** – measure phycocyanin (measure of **cyanobacteria biomass**) → Potential production of toxins that may compromise water uses



# Introduction to Remote Sensing



## Advantages

- **Global** observations
- Large-scale sampling of **entire waterbodies**
- **Accessible** sampling of remote and potentially hazardous sites
- Fill **historical** data records
- **Frequent** repeat samples
- **Cost effective**



# Spatial Variability of Cyanobacteria (patchiness)

Importance:

- Designing adequate **sampling plans**
- **Identifying areas at risk vs. risk-free for community and wildlife use**
- Informing **spatial resolution** requirements for future satellite missions
- Justifying spatial **averaging** of data

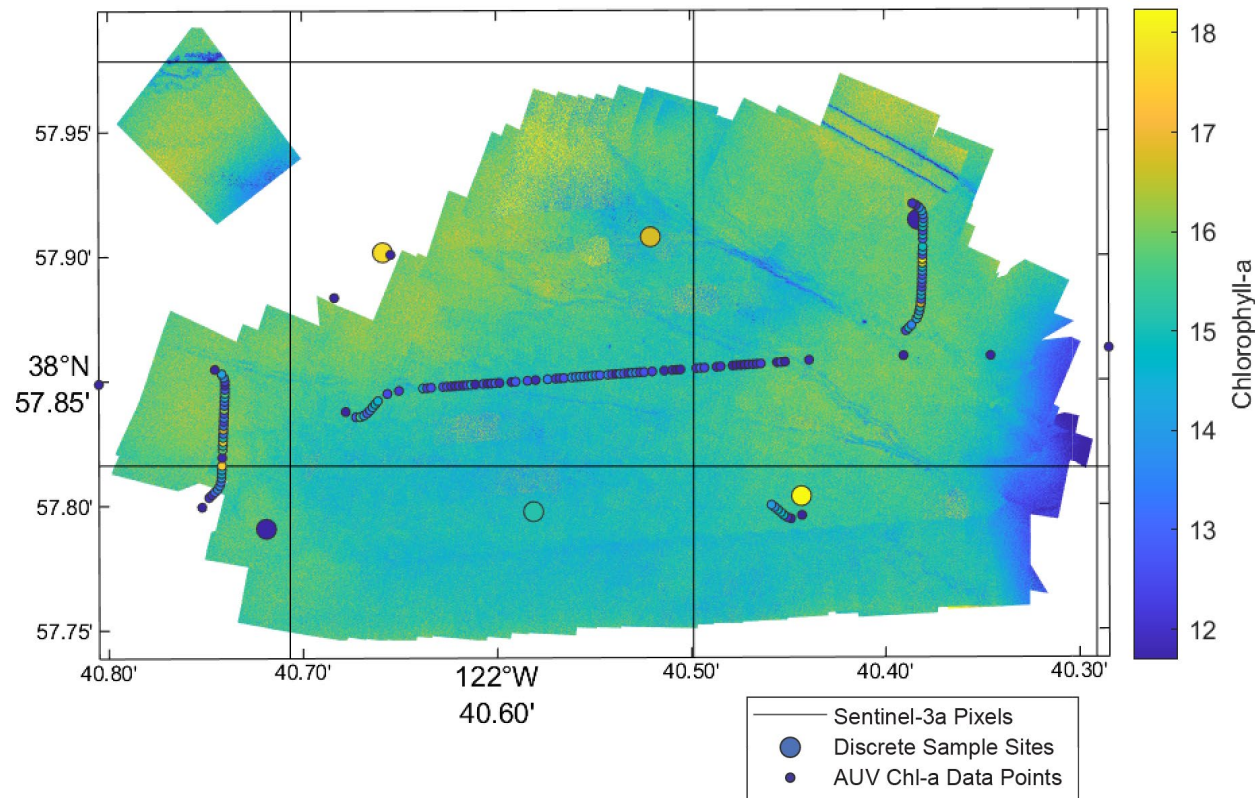


# Spatial Variability of Cyanobacteria

Multiplatform robotics remote sensing sampling of Clear Lake in 2019



Link to download full paper



Drone “sUAS”-based multispectral remote sensing measurements

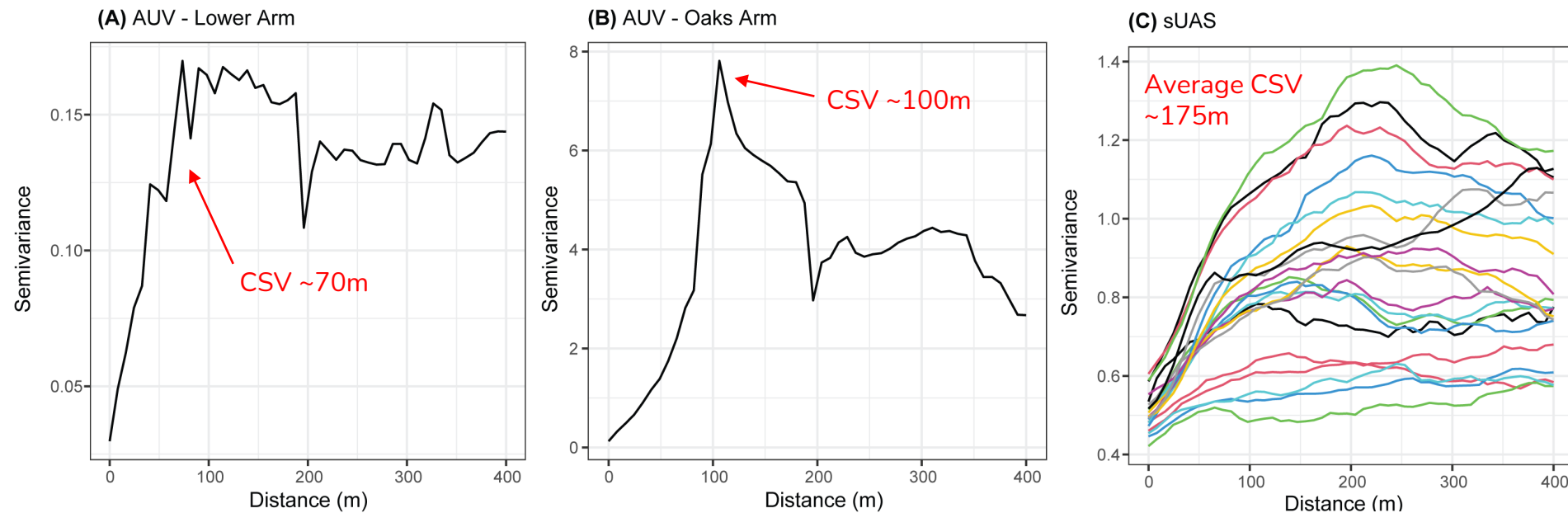


Autonomous Underwater Vehicle “AUV”-based optical measurements



# Quantifying Spatial Variability

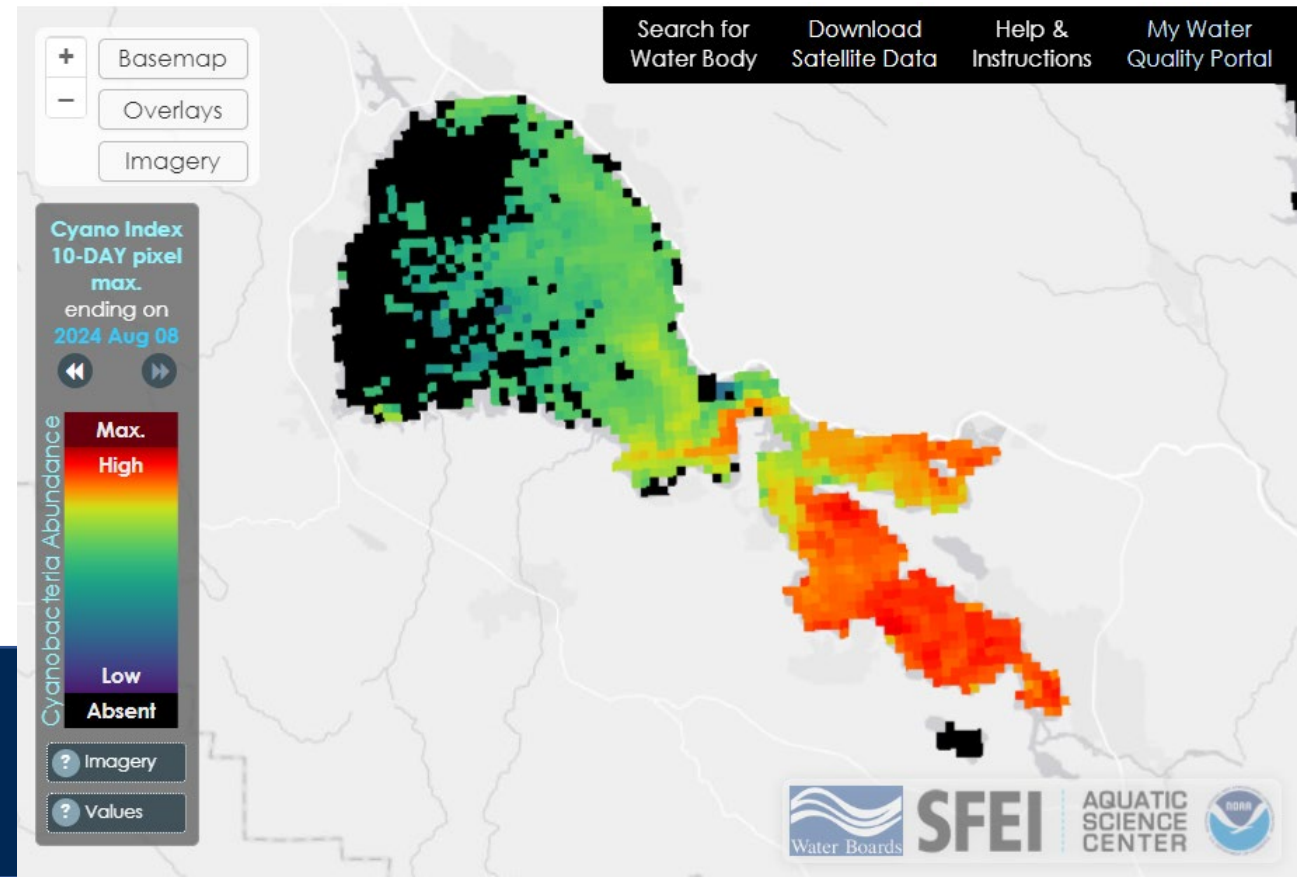
- Quantified the **Critical Scale of Variability “CSV”** – length-scale necessary to resolve a bloom
- CSV for a cyanobacteria bloom in Clear Lake ~**70-175m**



# Temporal (over time) Variability of Cyanobacteria

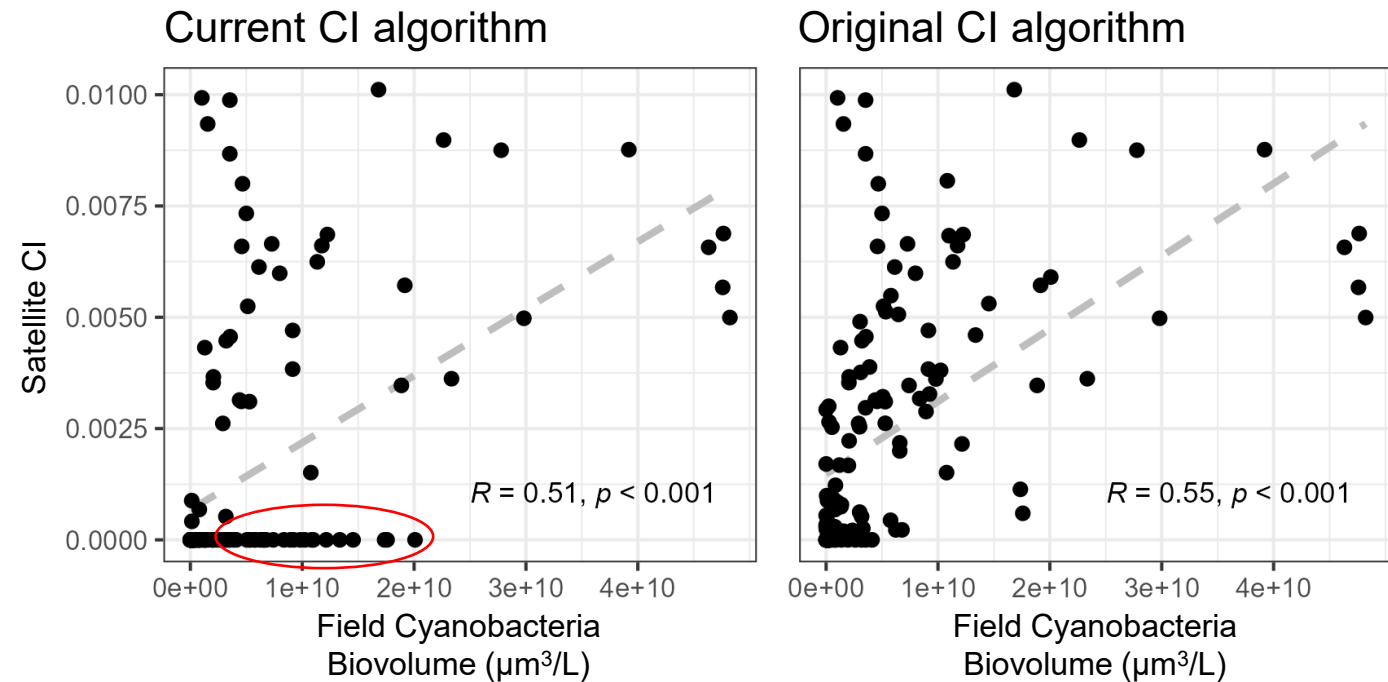
- Goals
  - Identifying **environmental drivers** of blooms
  - Identifying **areas at risk vs. risk-free** for community and wildlife use
- Why satellite **remote sensing** tools? **Frequent** measurements of cyanobacteria blooms across the **entire water body**.
- Evaluate the **Cyanobacteria Index (CI)** algorithm for Clear Lake, CA
  - CI calculated from reflectance measurements made by the Sentinel-3 satellite
  - Critical to inform community water uses and management decisions
  - Requires ground truthing with field measurements

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# Cyanobacteria Index (CI) algorithm ground truthing for Clear Lake, CA

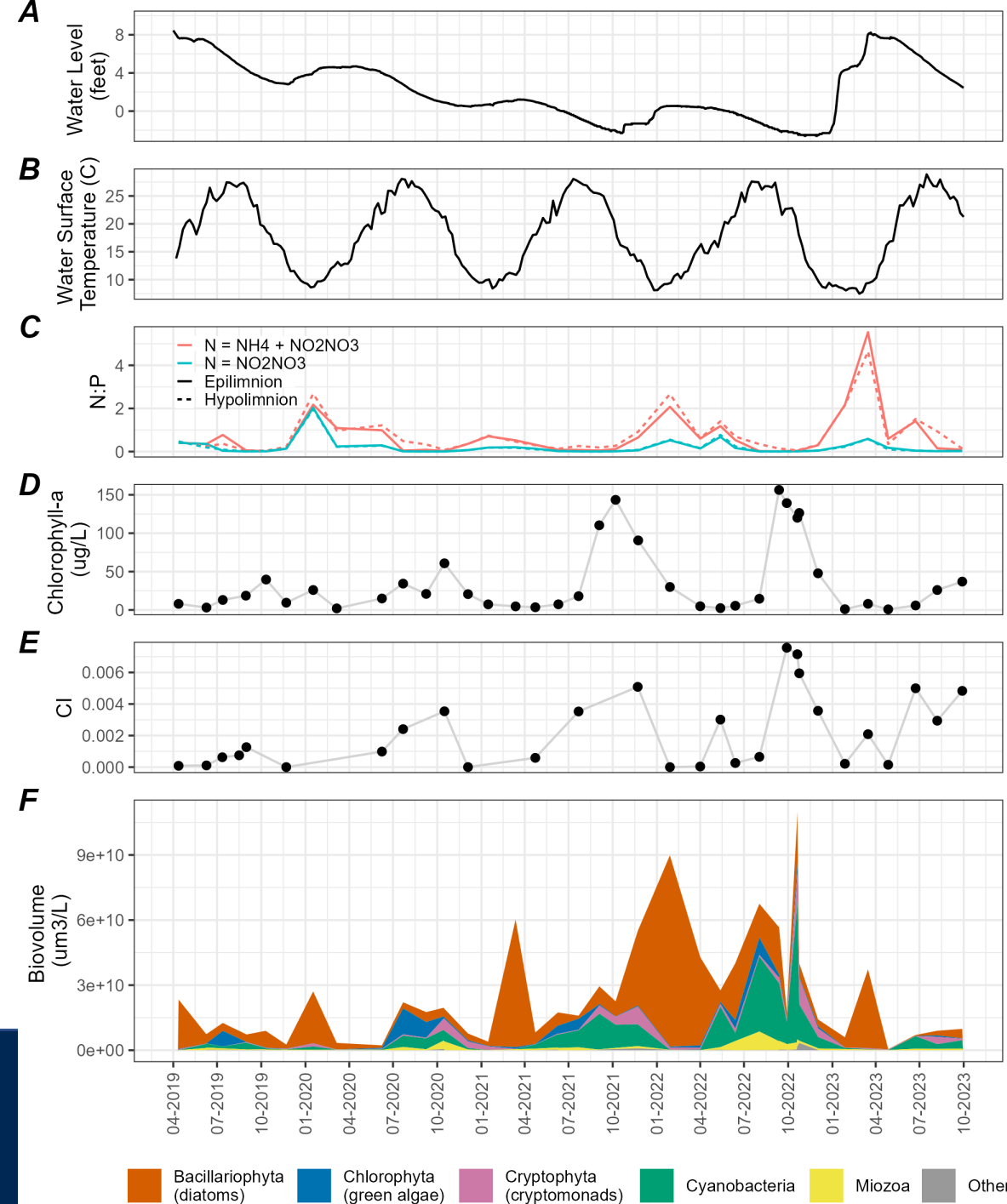
- Current CI algorithm includes a secondary step to reduce false warnings of blooms
- However, we found the current CI values do not always capture blooms occurring in Clear Lake
- We found better results for CI when using the original algorithm





# Bloom Trends in Clear Lake (2019-2023)

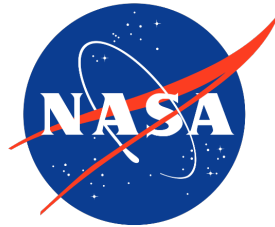
- Seasonal patterns: diatoms in winter, followed by green algae, Cyanobacteria, and Miozoa in summer, and cryptomonads in fall
- **Cyanobacteria did not dominate in high concentrations except in the summer 2021 and 2022**
- Cyanobacteria is correlated with high temperature and low N:P nutrient ratio



# Conclusions

- Cyanobacteria have high spatial and temporal variability – important for designing sampling plans to inform community water uses and management decisions
- Remote sensing is useful because of large-scale, frequent sampling
- Ground truthing of remote sensing tools is important
- Future satellite missions may provide more useful data for measuring cyanobacteria blooms

# Acknowledgments



Questions?