

# Application of Hyperspectral Remote Sensing to Cyanobacterial Blooms in Inland Waters

Raphael Kudela

University of California – Santa Cruz

Liane Guild, Sherry Palacios, Juan Torres

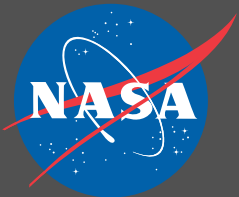
NASA Ames Research Center

David Austerberry

University of Michigan

Emma Accorsi

Emory University





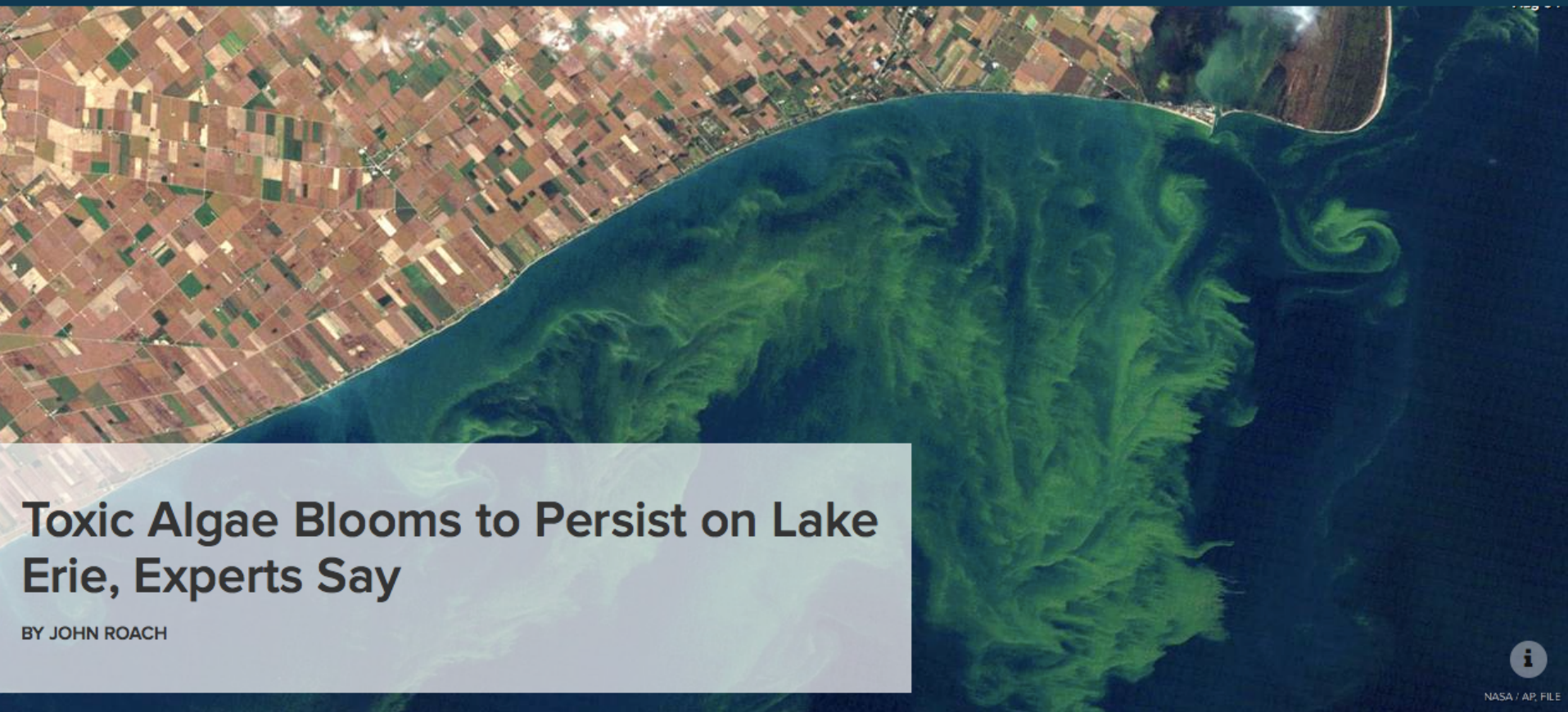
# 2014: Year of the Blue-Green Algae

**NBC NEWS** HOME TOP VIDEOS ONGOING: EBOLA VIRUS OUTBREAK PISTORIUS TRIAL



U.S. WORLD LOCAL POLITICS HEALTH TECH SCIENCE POP CULTURE BUSINESS INVESTIGATIONS SPORTS MORE ▾

NIGHTLY NEWS TODAY MEET THE PRESS DATELINE



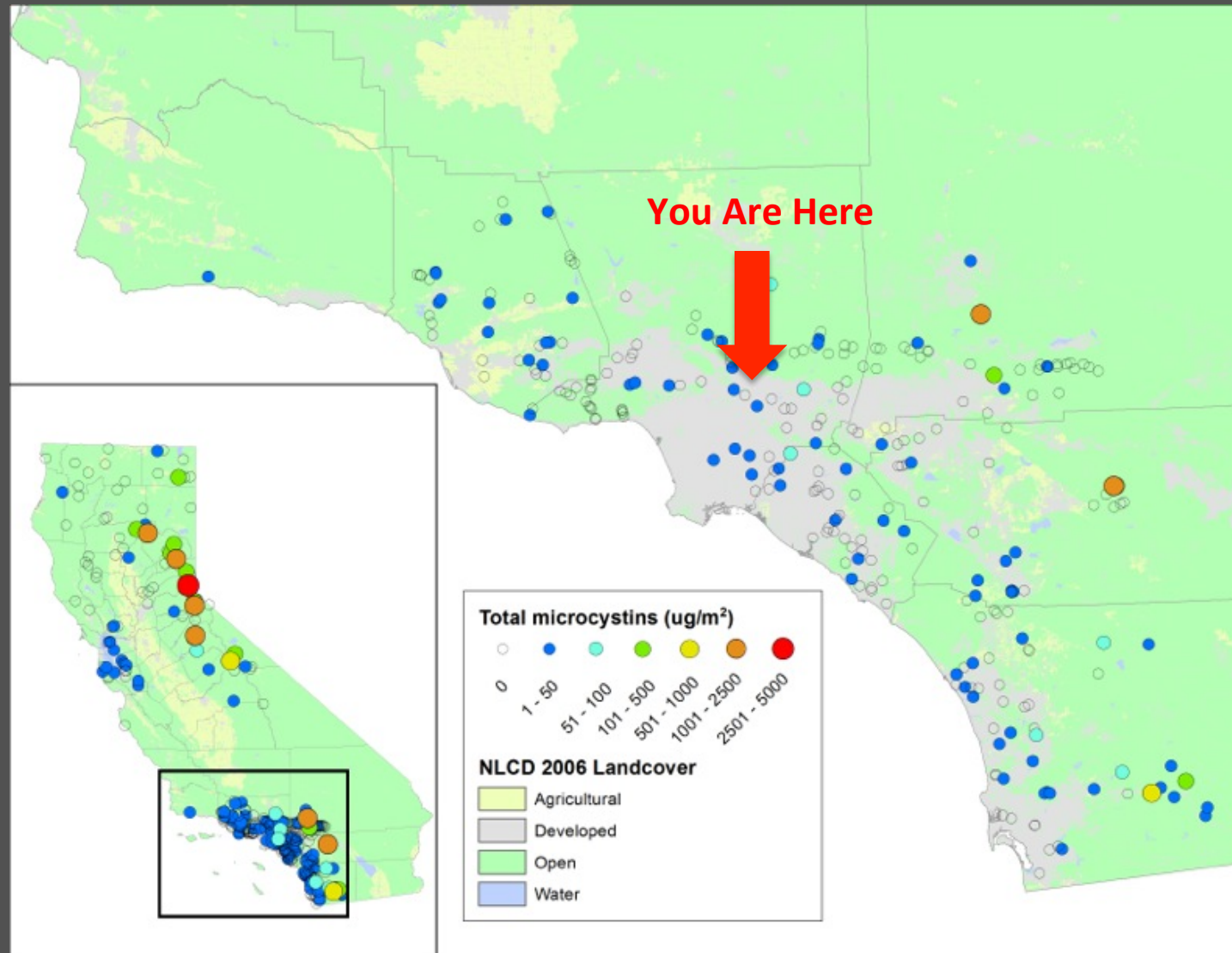
## Toxic Algae Blooms to Persist on Lake Erie, Experts Say

BY JOHN ROACH



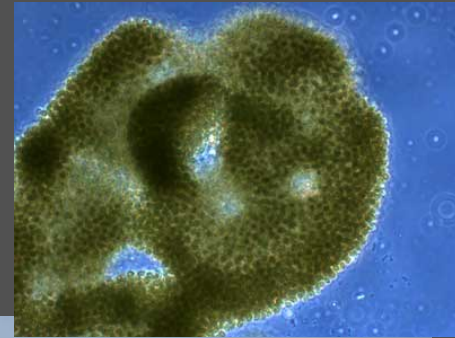
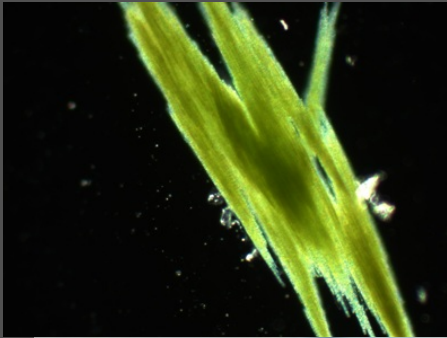
NASA / AP, FILE

# California is NOT Lake Erie





# Challenge: two optically similar species



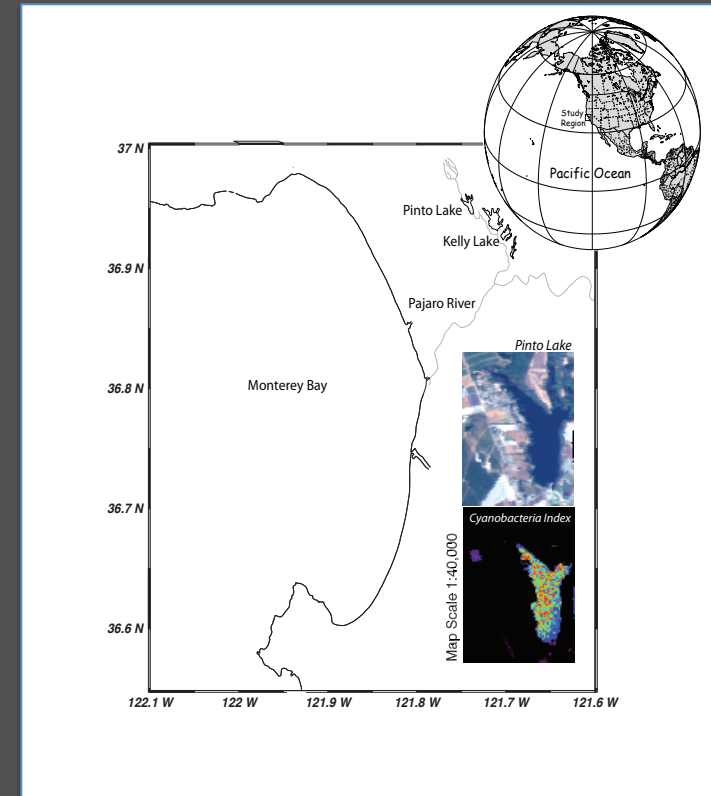
*Aphanizomenon flos-aquae*



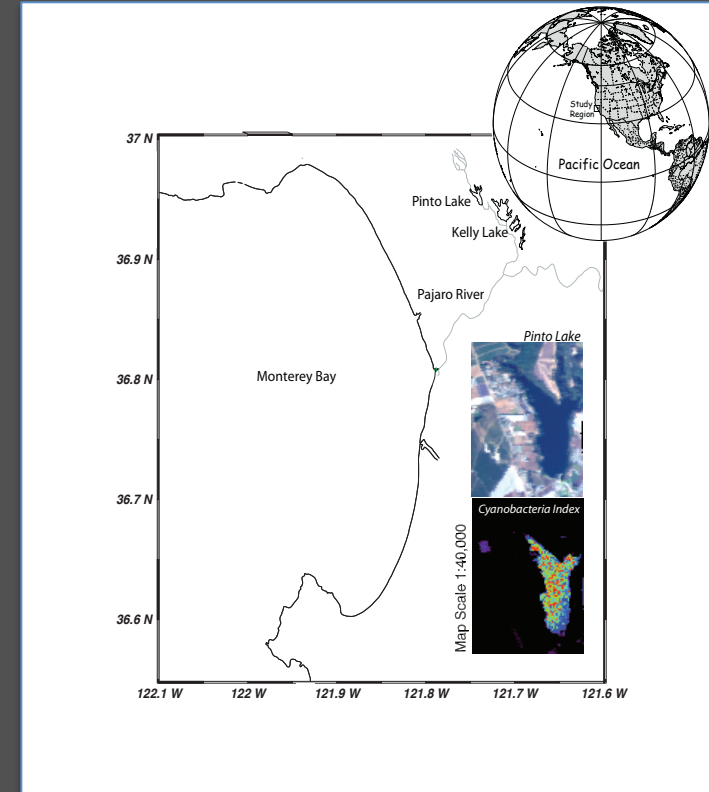
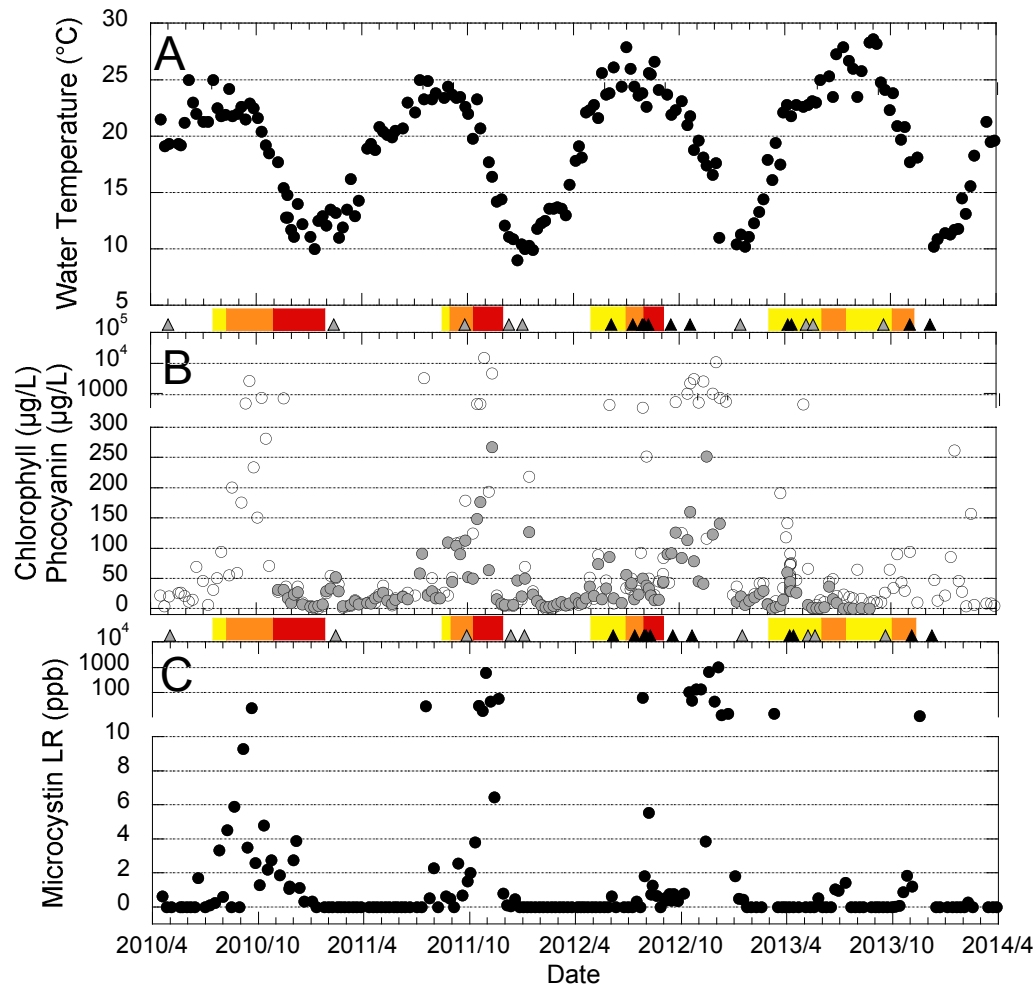
*Microcystis* spp.



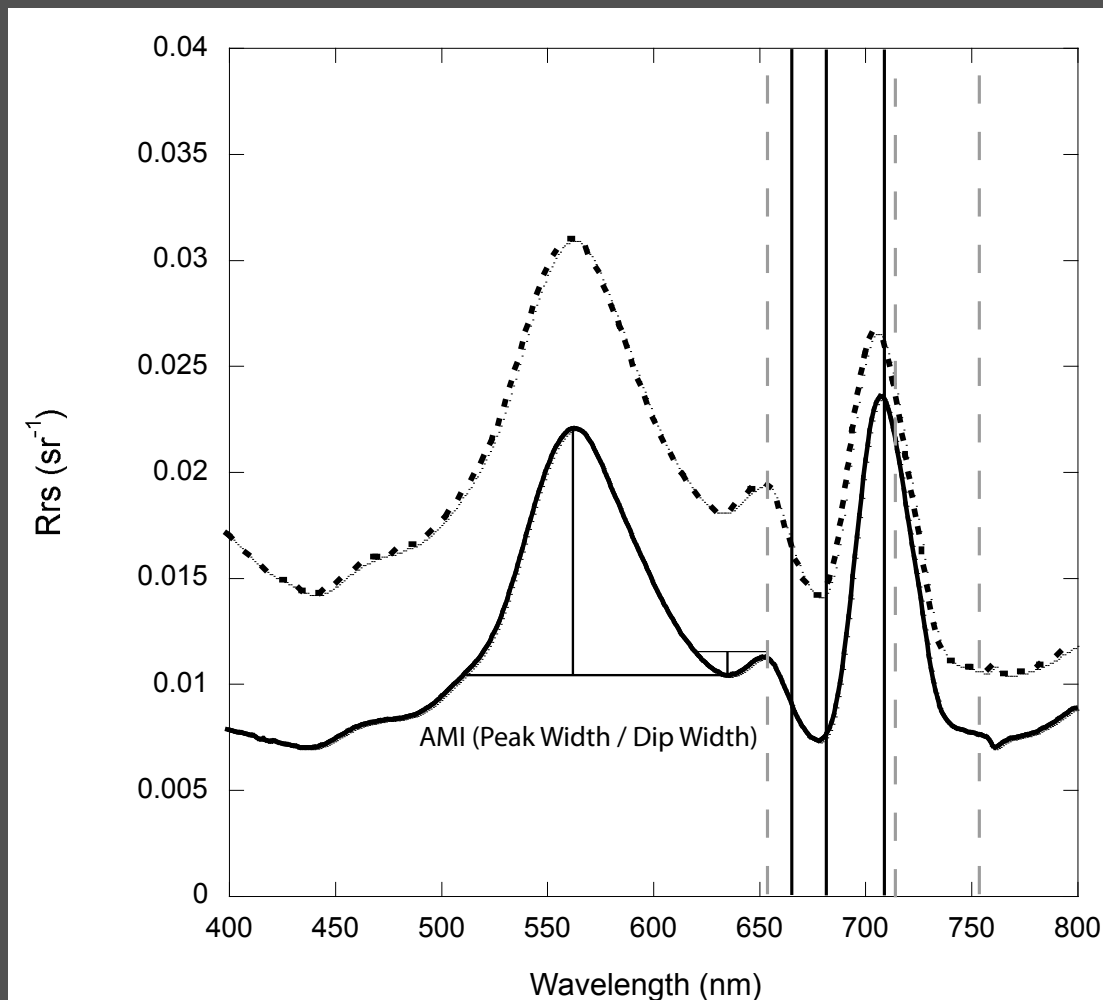
# Pinto Lake, Our Favorite Toxic Cesspool



# Pinto Lake, Our Favorite Toxic Cesspool



# Detecting Blue-Green Algae



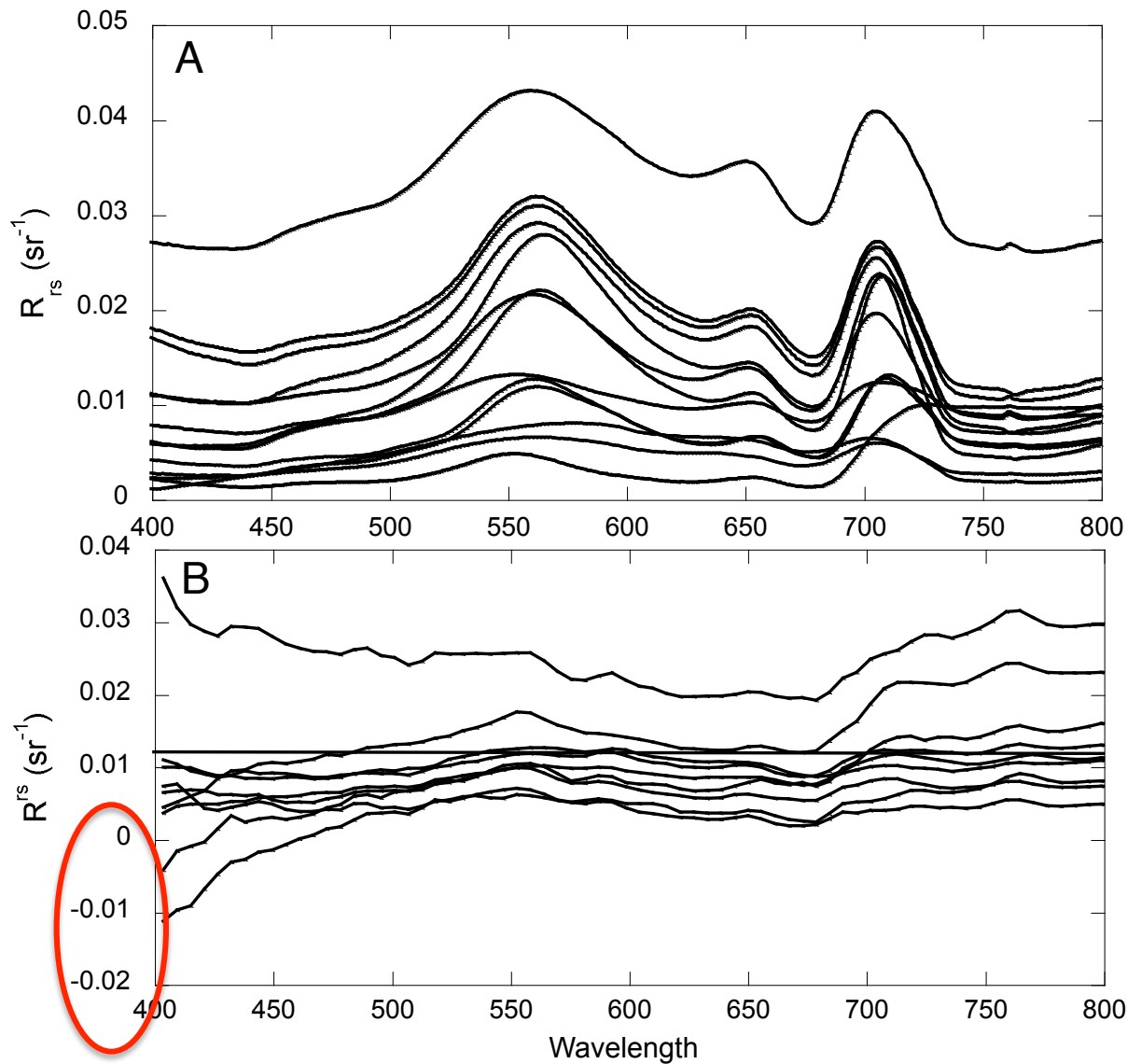
Several algorithms have been developed, including the Cyanobacterial Index (CI) and various phycocyanin absorption methods.

We generalized the spectral shape methods to take advantage of hyperspectral data, and also developed a Scattering Line Height (SLH) algorithm which works with almost any sensor, including MASTER



# Data

## Spectral Data



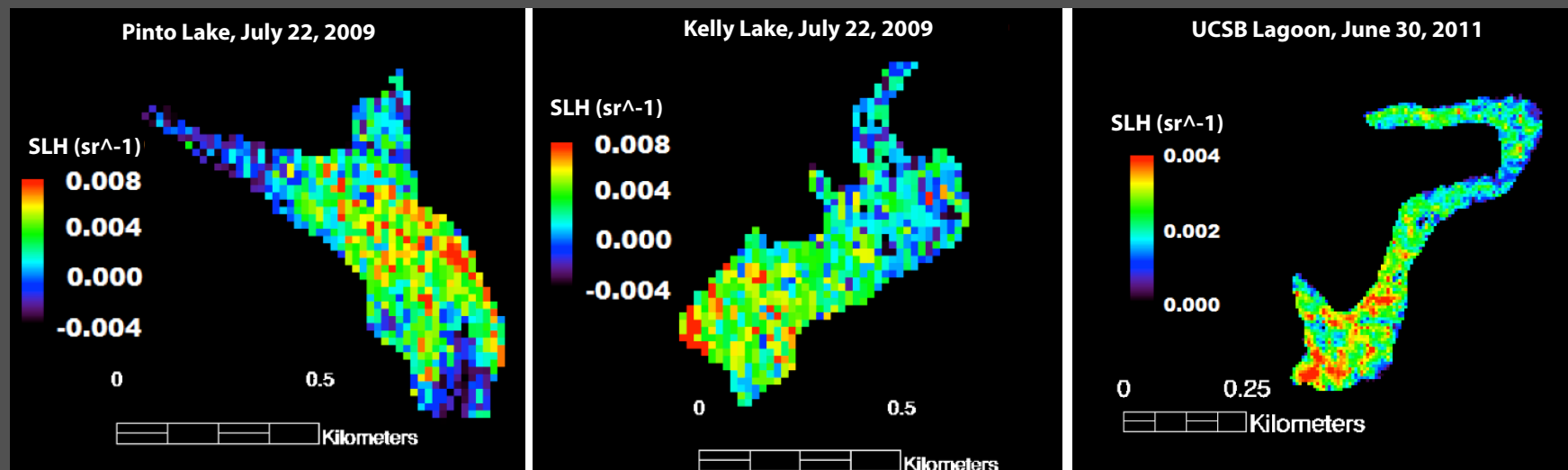
ASD & GER validation data

Hyperspectral Imager for the Coastal Ocean (HICO)

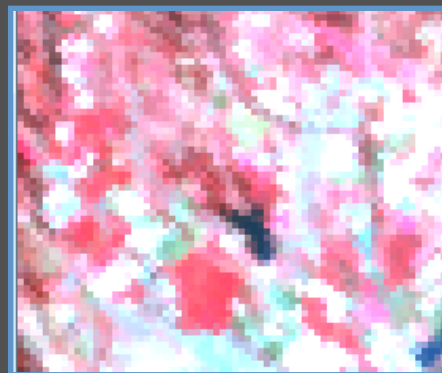
~ 100 m pixels, processed using standard (minimal optimization) Tafkaa atmospheric correction

# Remote Sensing Data

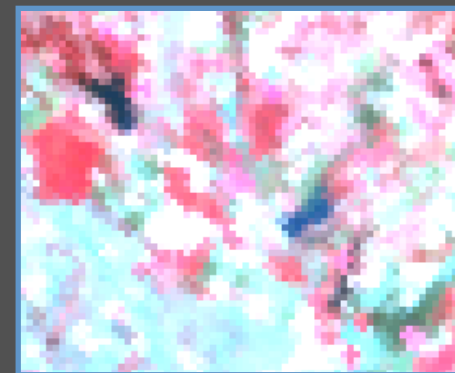
## Application with MASTER



## Application with HICO

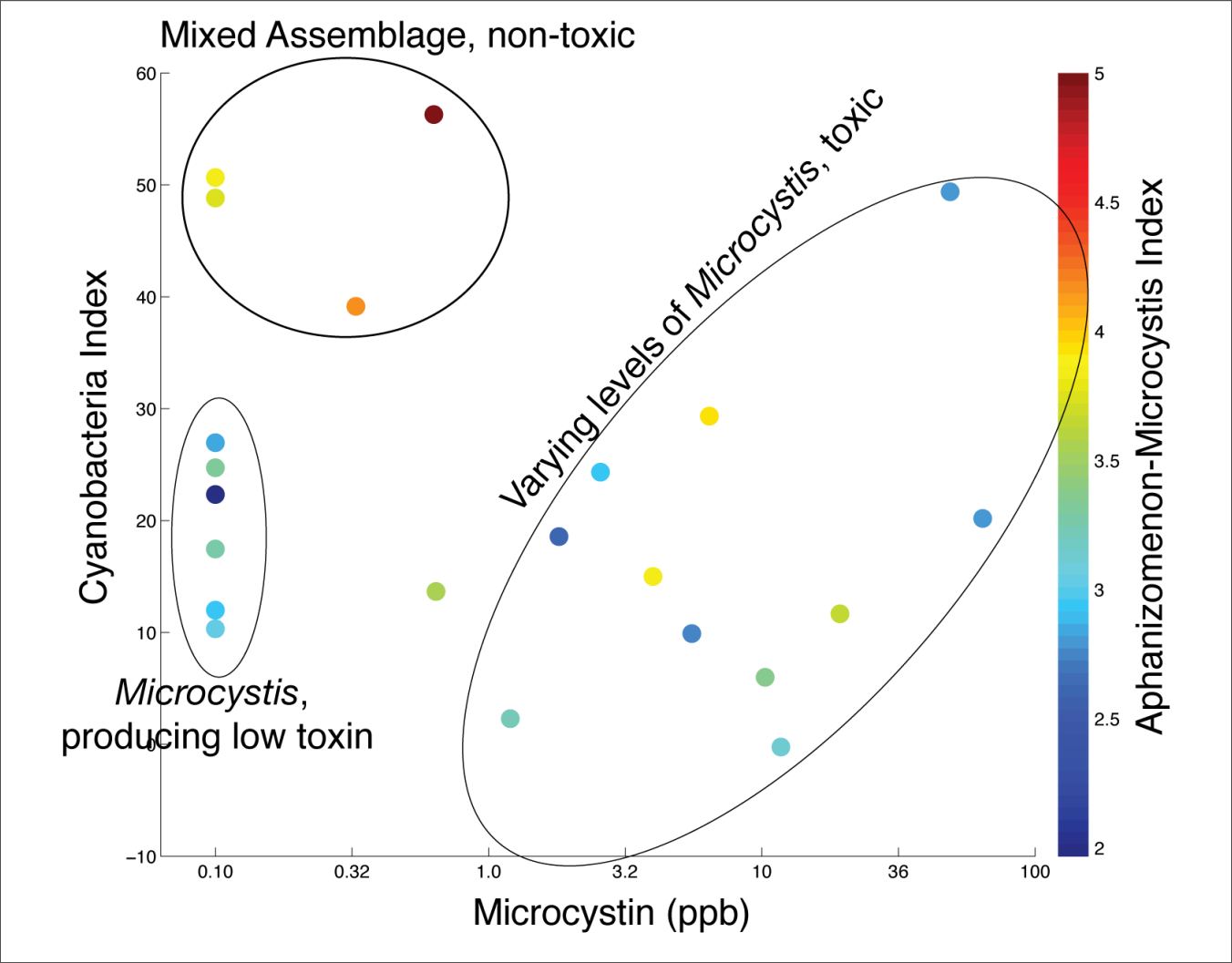


Pinto Lake



Kelly Lake

# Predicting Toxic BLooms





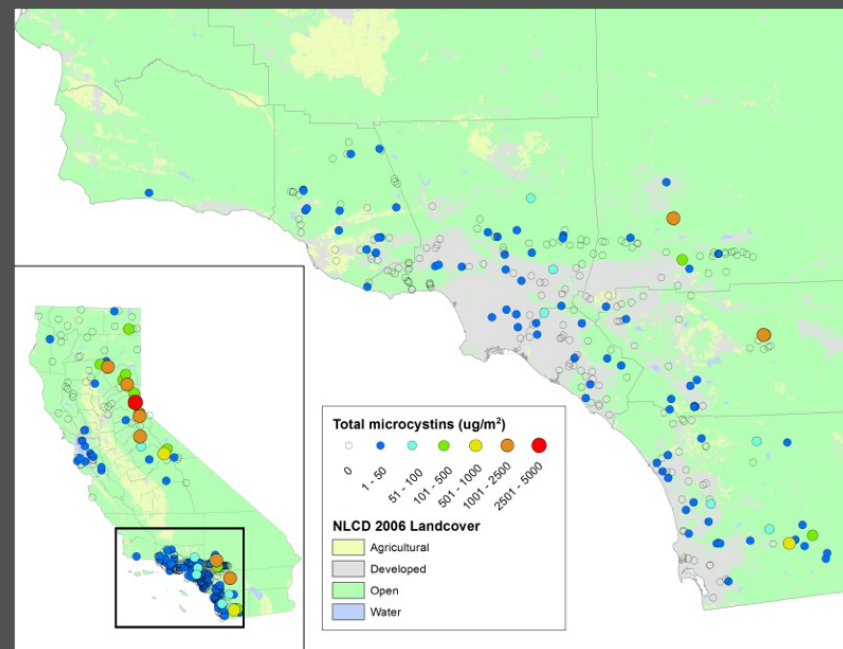
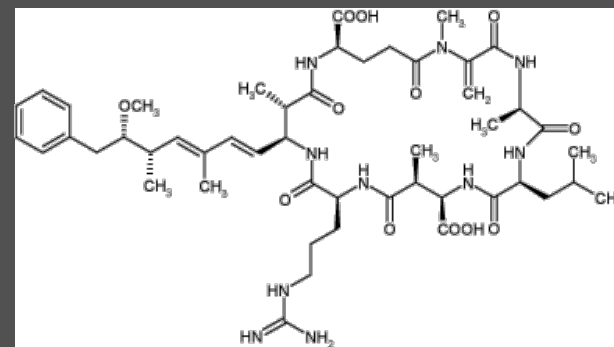
# Real-Time Application

State of California sets Action Level of 0.8 ppb for drinking water or recreational exposure

Mouse studies suggest nasal inhalation is **12x more potent** than direct consumption

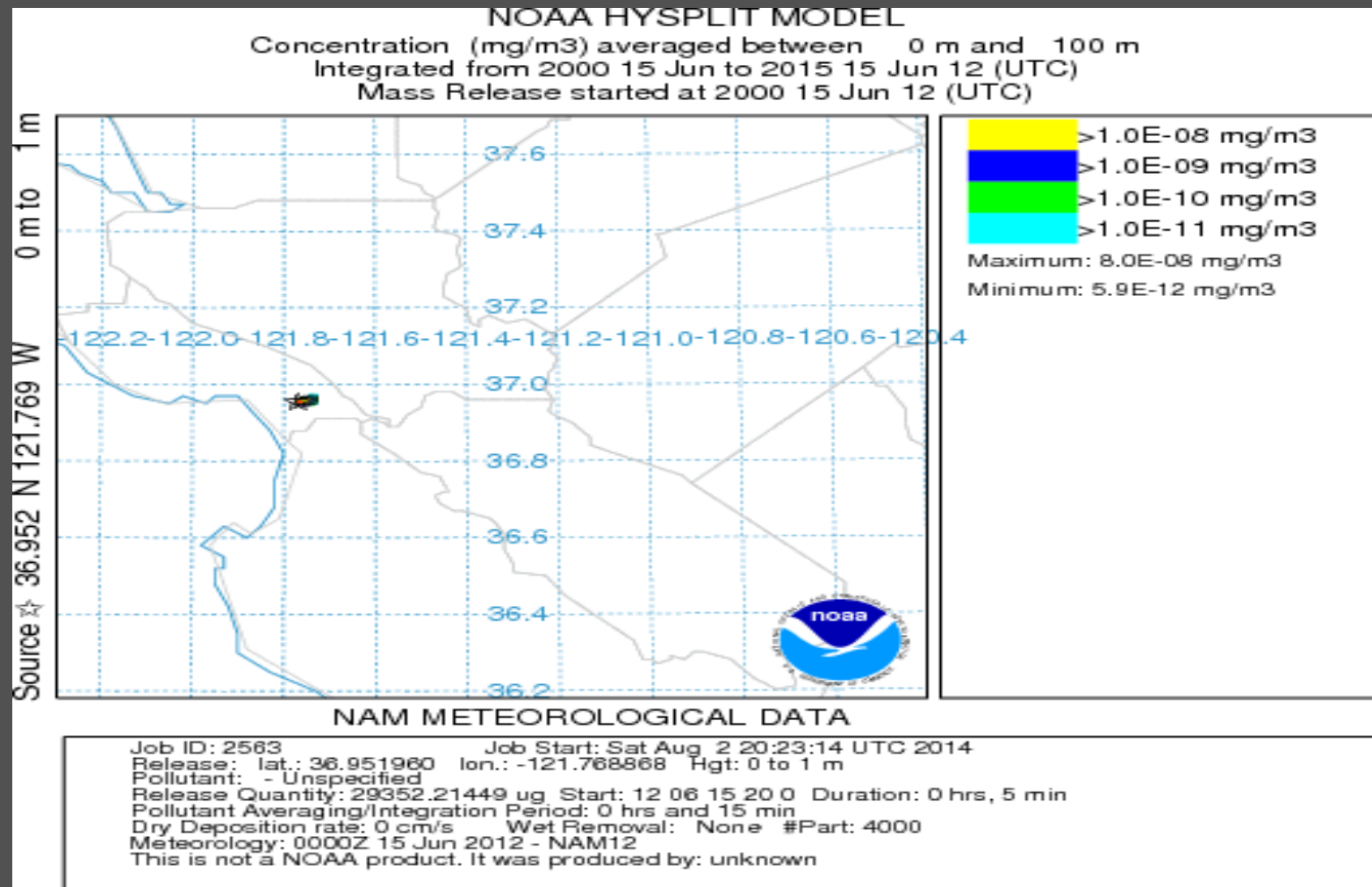
Very little known about aerosolization, but studies suggest it is possible

First Order Question:  
What happens if we  
get a highly toxic  
bloom in an  
urbanized area?

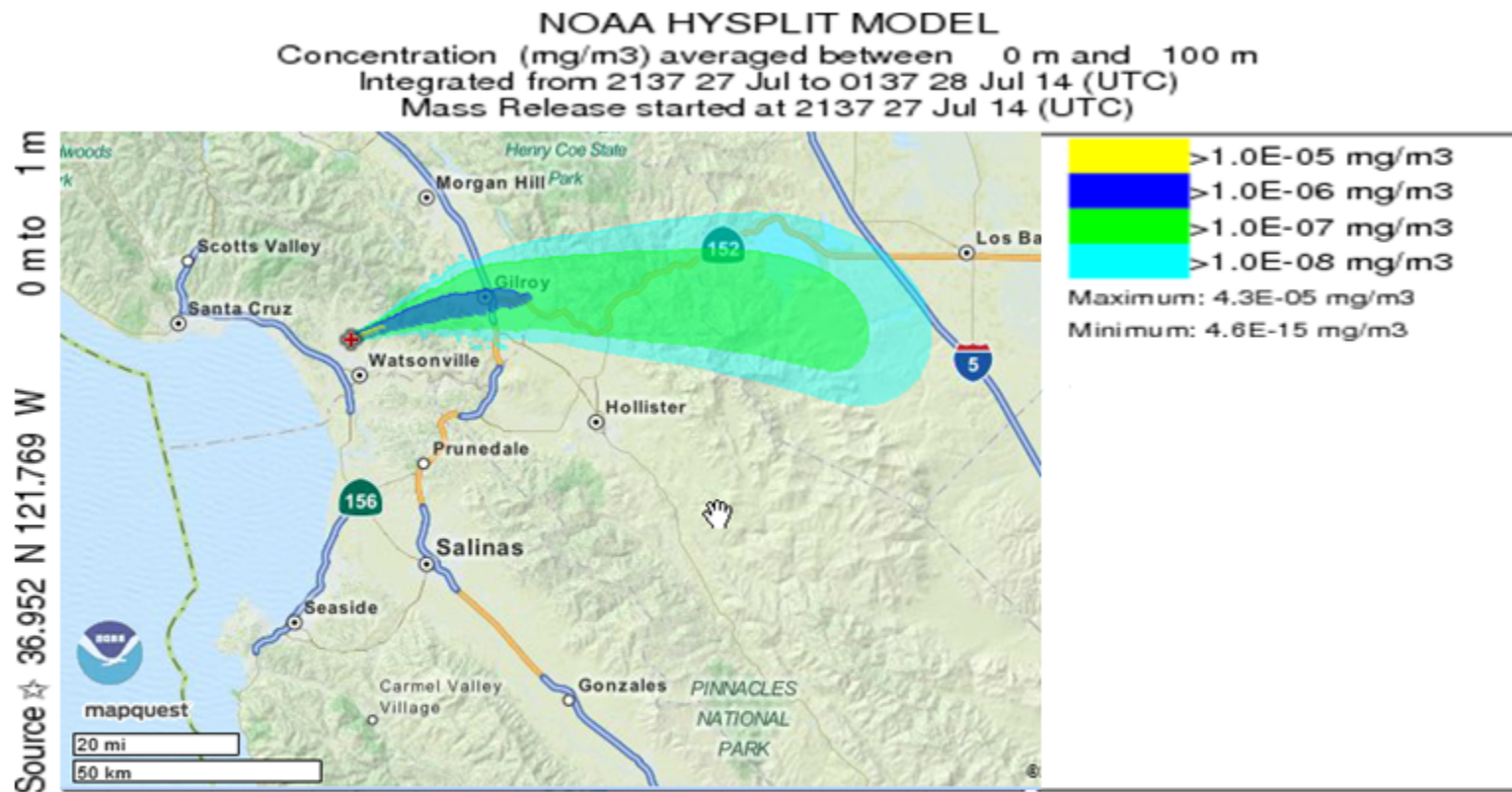


# Predicting Impacts Downwind

## *Pinto Lake Highly Toxic Bloom*



# Predicting Impacts Downwind



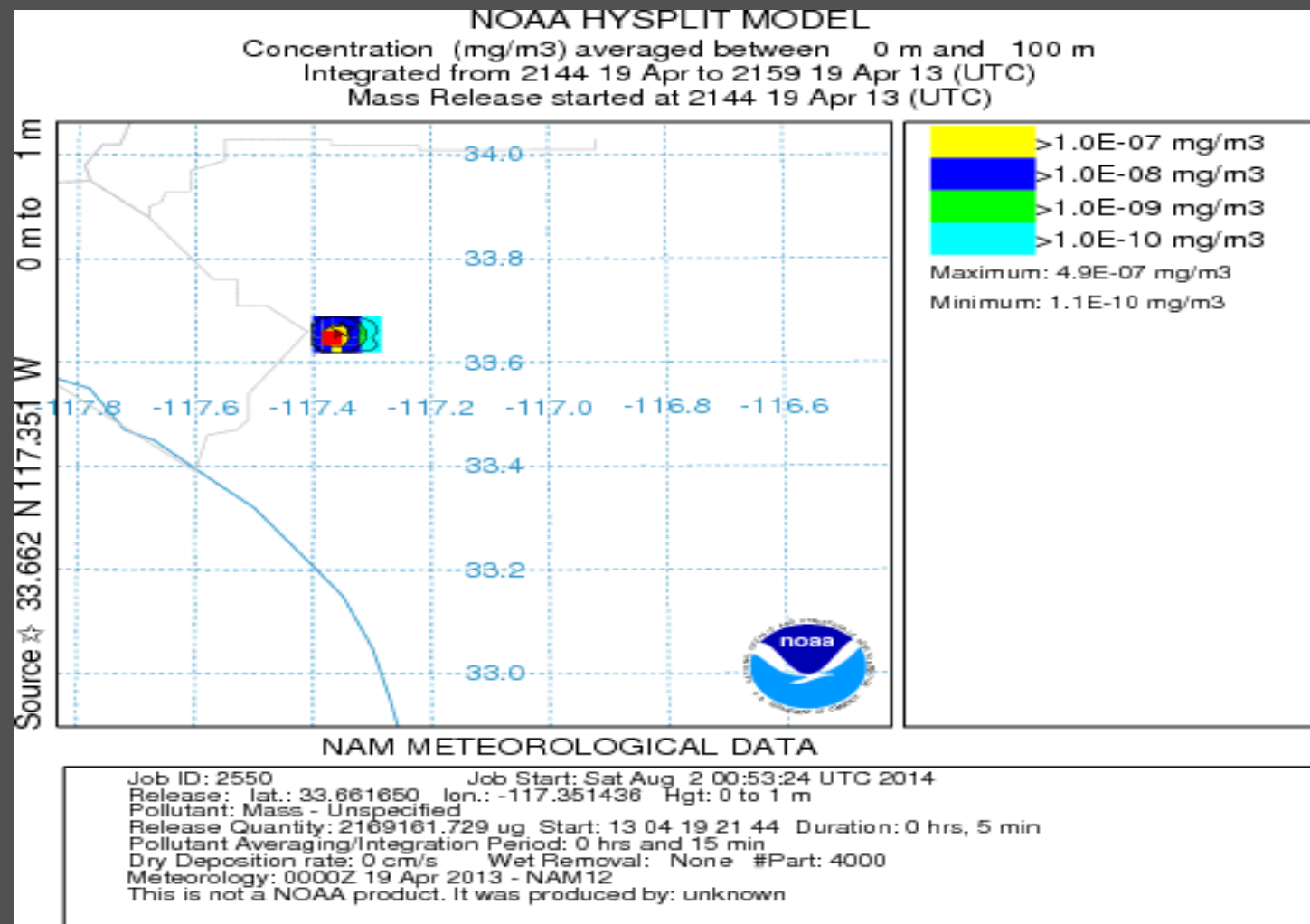
## NAM METEOROLOGICAL DATA

Job ID: 2529 Job Start: Fri Aug 1 20:31:53 UTC 2014  
 Release: lat.: 36.951960 lon.: -121.768868 Hgt: 0 to 1 m  
 Pollutant: - Unspecified  
 Release Quantity: 104636922.3 ug Start: 14 07 27 21 37 Duration: 0 hrs, 5 min  
 Pollutant Averaging/Integration Period: 4 hrs and 0 min  
 Dry Deposition rate: 0 cm/s Wet Removal: None #Part: 4000  
 Meteorology: 0000Z 27 Jul 2014 - NAM12  
 This is not a NOAA product. It was produced by: unknown

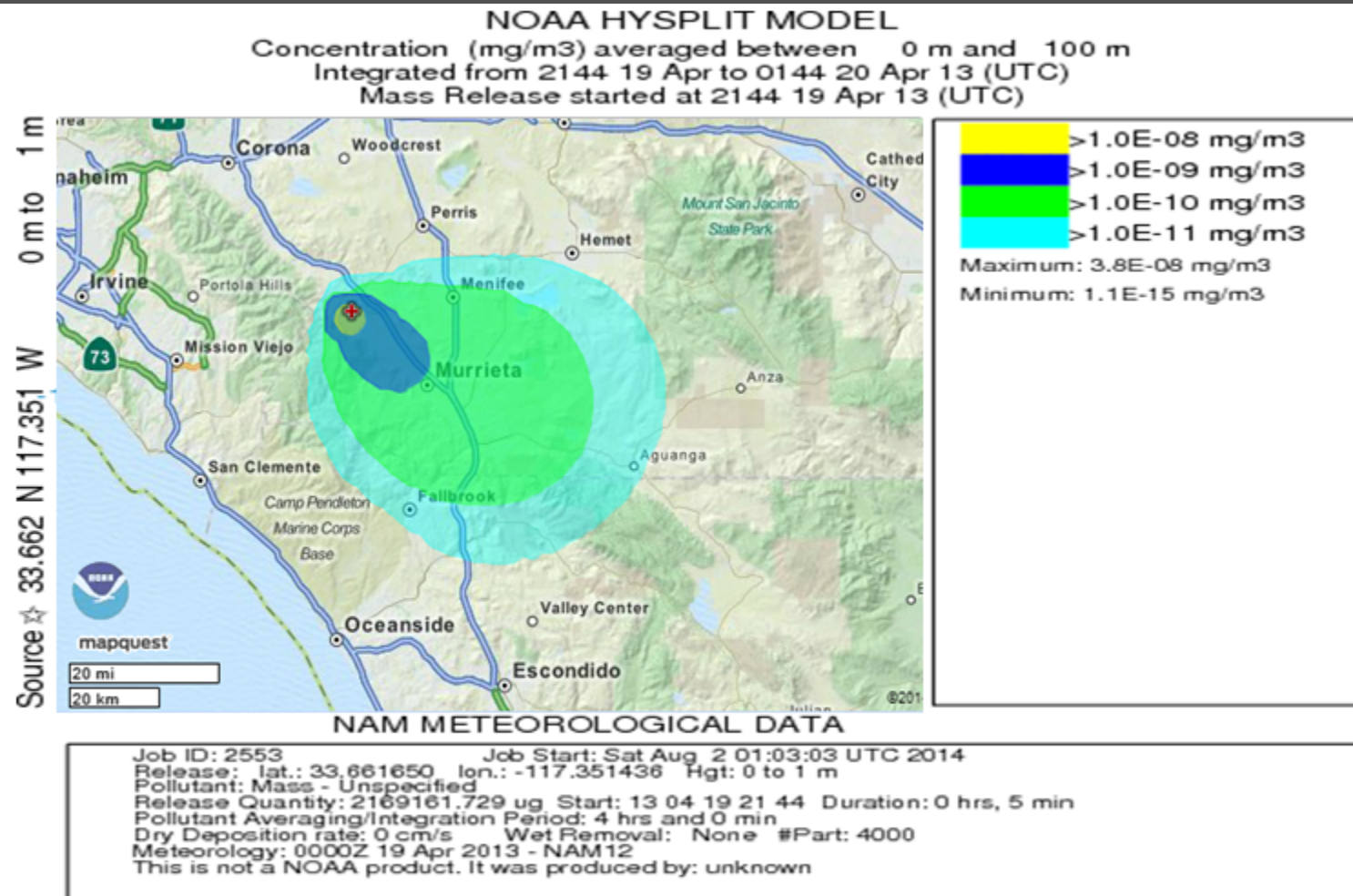


# Predicting Impacts Downwind

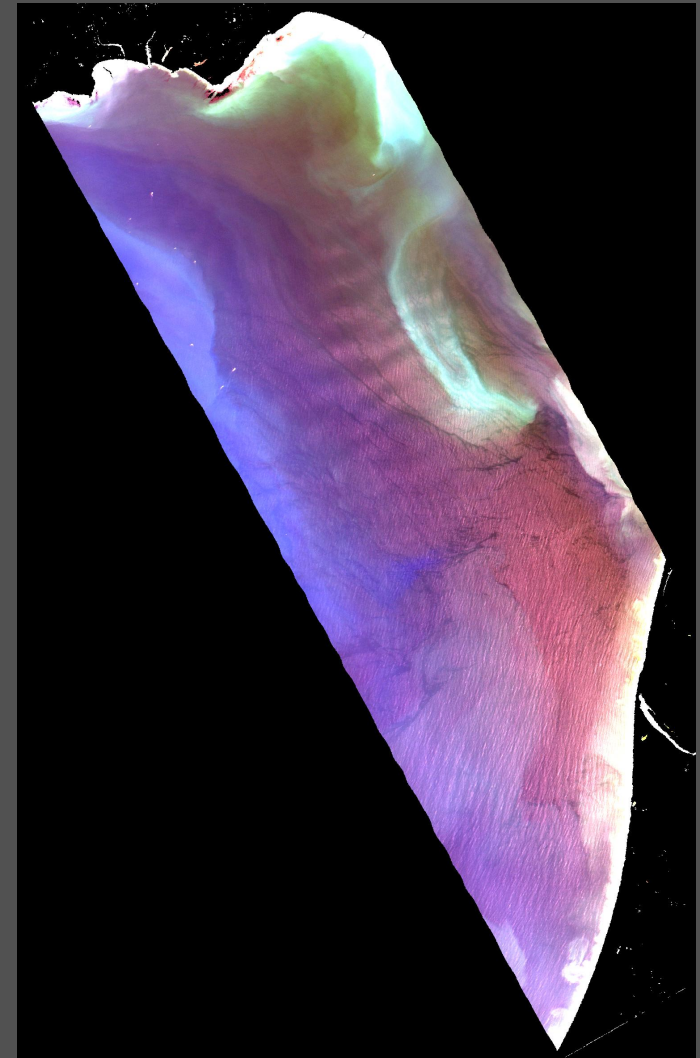
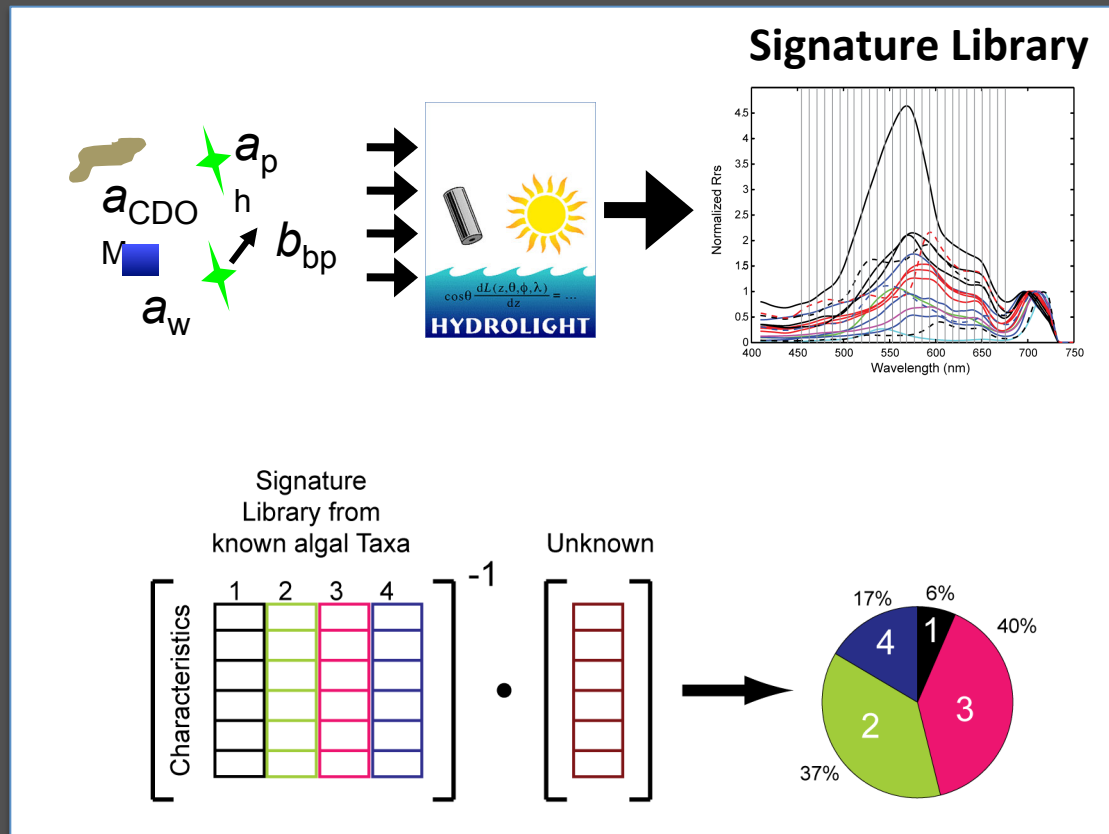
*Lake Elsinore, Identified from HyspIRI Imagery*



# Predicting Impacts Downwind



# Brief Update on PHYDOTax

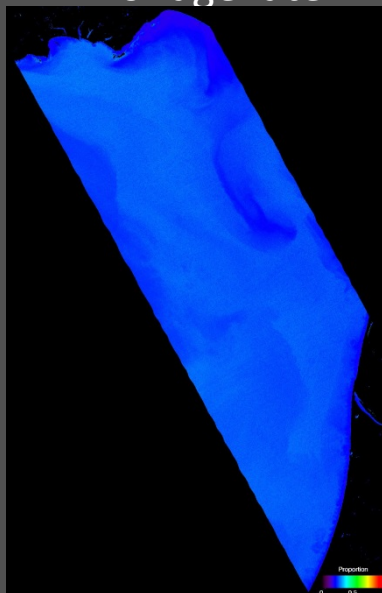


Monterey Bay: 10 Apr 2013  
 Flightline: f130410t01p00r10  
 Atmospheric Correction: Empirical Line from 9/29/2014

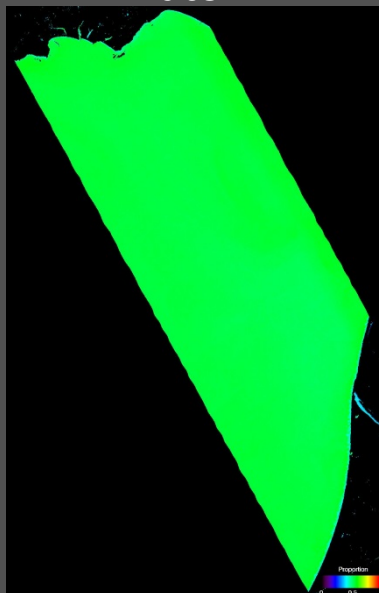


# Proportions AVIRIS 10 Apr 13

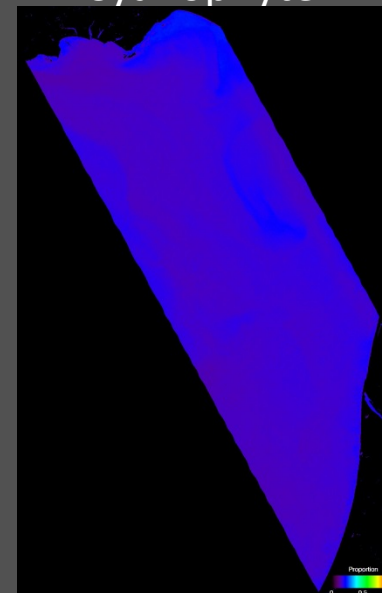
Dinoflagellate



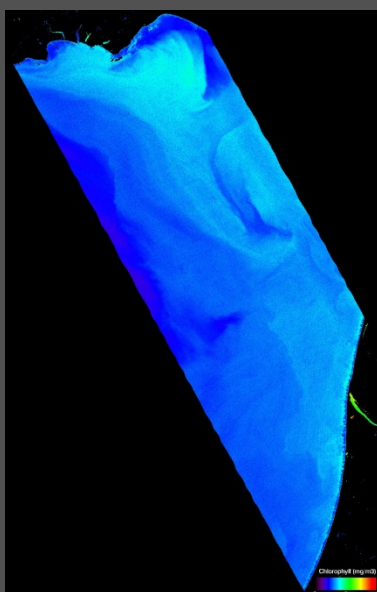
Diatom



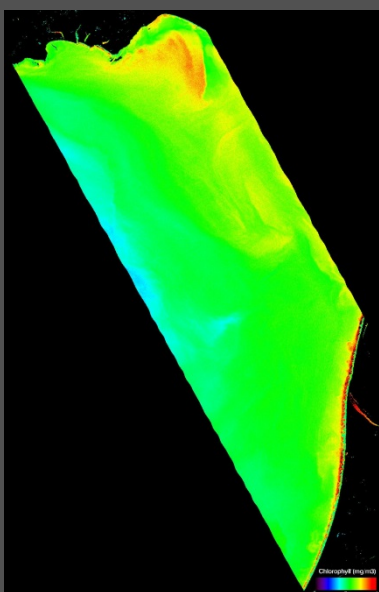
Cyanophyte



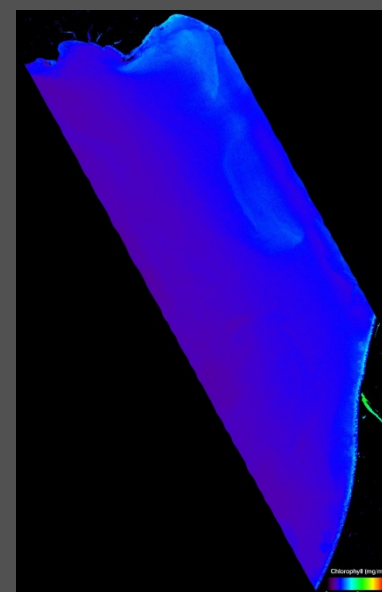
Taxon-specific Biomass  
Dinoflagellate



Diatom



Cyanophyte





# Summary

## *Challenges*

- In many regions, potentially toxic cyanobacterial blooms are ephemeral and associated with small waterbodies
- We cannot spend weeks/months optimizing data quality

## *Progress*

- We have successfully extended spectral shape algorithms to multiple sensors
- We can separate non-toxic and toxic species, providing predictive capability
- HyspIRI-like simulations (HICO, MASTER, AVIRIS) demonstrate applicability

## *Opportunities*

- Given more time, we can successfully apply more sophisticated PFT algorithms, such as PHYDOTax, to these data
- PRISM and AVIRISng data provide a framework for refining PHYDOTax specifically for inland waters
- State of California is initiating a Remote Sensing program for inland waters

# Thank You!

## *Collaborators:*

- David Thompson, JPL
- Michelle Gierach, JPL
- Ian McCubbin, JPL
- Stan Hooker, GSFC
- John Morrow, Biospherical Instruments
- The HypsIRI, MASTER, and AVIRIS teams



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- NASA Student Airborne Research Program (Rick Shetter)