# Hyperspectral Studies of Coasial and Inland Waters of California Data Collected and Lessons Leanned Raphael Kudela (PI), Liane Guild<sup>2</sup> (Co-PI) Sherry Palacios Juan Torres-Pérez<sup>3</sup> Kendra Negrey<sup>1</sup>

1 UC – Santa Cruz, 2 NASA Ames Research Center, 3 Bay Area Environmental Research Institute/NASA Ames

HyspIRI Symposium 2015

# Outline

- Data Collected
  - In situ
  - Imagery
  - Ongoing issues
- Data Management
- Some of our Science
  - Application of hyperspectral remote sensing to cyanobacterial blooms in inland waters
  - Remote sensing of phytoplankton functional types in the coastal ocean from the HyspIRI Preparatory Flight Campaign

# In Situ Monterey Bay Observations

#### Ocean:

HPLC measured pigments (e.g. chl-a) Phytoplankton cell counts **IOPs** -122.2 -122.0-121.837.0 absorption  $(a_p, a_d, a_{CDM})$ Pinto Lake ac-s measured total absorption RTI and attenuation PRM backscattering **AOPs** 36.8 Monterey Bay water-leaving radiance remote sensing reflectance California Water

10 km

36.6

salinity temperature

Pinto Lake: Pigments (chl-a) Backscattering AOPs Aerosol Optical Depth (AOD) в

Santa Barbara

Channel

## In Situ Plumes & Blooms Observations



Pigments (e.g. chl-a) **IOPs** absorption ( $a_p$ ,  $a_d$ ,  $a_{CDM}$ ) backscattering **AOPs** water-leaving radiance remote sensing reflectance Water salinity temperature

# *In situ* Monterey Bay Observation Dates

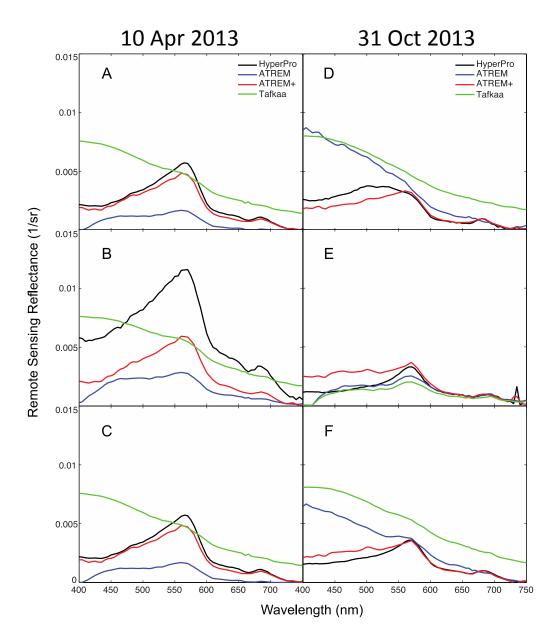
Field Season	Flight Date(s)	Location (box)	ivieasurements		PRM	PRM M0		Pinto	White Plains
Spring 2013	4/10/13	SF Bay	у	х	x	х		x	x
Summer 2013	6/7/13	SF Bay	у	х	x	х		x	x
Autumn 2013	10/30/13	SF Bay	у	х	x	х			
	10/31/13	SF Bay	у	х	x	х		x	
	11/5/13	SF Bay	no imagery	х	x	х			
	11/22/13	SF Bay	n						
	12/5/13	SF Bay	у	х	x	х		x	
Spring 2014	4/23/14	SF Bay	no imagery	х	x	х		x	x
	4/28/14	SF Bay	у	х	x	х		x	x
	5/7/14	SF Bay	у				x		
Summer 2014	5/28/14	SF Bay	Pinto only					x	
Autumn 2014	10/6/14	SF Bay	no imagery					x	
	10/23/14		no imagery	х	x	х			
-	10/27/14	SF Bay	у	х	x	х		x	
	10/30/14	SF Bay	no imagery		x				
	11/24/14	SF Bay	n						
Spring 2015	4/17/15	SF Bay	no imagery	х	x	х		x	
	4/30/15	SF Bay	У				х	х	
	4/30/15	Monterey Bay & Pinto Lake	У					x	
Summer 2015	TBD	SF Bay							

### **Coastal Imagery Dates**

Field Season	Flight Date(s)	Location (box)	AVIRIS	MASTER	In-water Measurements	
Spring 2013	4/10/13	SF Bay	У	У	У	
	4/11/13	SB Channel	У	У	n	
Summer 2013	6/7/13	SF Bay	У	У	У	
	6/6/13	SB Channel	У	У	n	
Autumn 2013	10/30/13	SF Bay	У	У	У	😕 roset
	10/31/13	SF Bay	У	n	У	
	11/22/13	SF Bay	У	У	n	
	11/25/13	SB Channel	У	У	n	
	12/5/13	SF Bay	У	У	У	
Spring 2014	4/16/14	SB Channel	У	У	У	
	4/28/14	SF Bay	n	У	У	
	5/7/14	SF Bay	У	У	У	
Summer 2014	5/28/14	SF Bay	У	У	n	
	6/4/14	SB Channel	У	У	n	
	6/6/14	SB Channel	У	У	n	
Autumn 2014	8/29/14	SB Channel	У	У	n	
	10/6/14	Monterey Bay & Pinto Lake	AVIRIS-NG	n	У	
	10/21/14	SB Channel	У	У	У	
	10/27/14	SF Bay	У	У	У	
	11/24/14	SF Bay	У	У	n	
Spring 2015	4/16/15	SB Channel	У	У	У	
	4/17/15	SF Bay	n	У	У	
	4/30/15	SF Bay	У	У	у	
	4/30/15	Monterey Bay & Pinto Lake	AVIRIS-NG	n	У	
Summer 2015	6/2/15	SB Channel	у	У	n	
	TBD	SF Bay				

tte

## **Ongoing Issues with Imagery**



# 2015: We live in interesting times

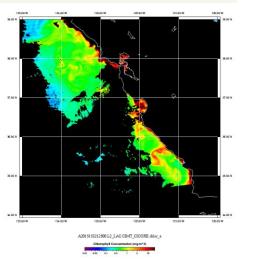
## Large bloom of toxic algae under way in Monterey Bay and beyond

Monitoring program led by UC Santa Cruz has detected high levels of the toxin domoic acid in Monterey Bay; more blooms reported elsewhere along the west coast

June 02, 2015 By Tim Stephens

> Researchers have detected large blooms of toxin-producing algae in Monterey Bay, raising concerns about potential effects on marine mammals and seabirds. The bloom involves microscopic algae called *Pseudo-nitzschia* (a type of diatom), which produce a potent neurotoxin called domoic acid. The toxin was first detected in early May, and by the end of the month researchers had detected some of the highest concentrations of domoic acid ever observed in Monterey Bay.

"It's a pretty massive bloom. The domoic acid levels are extremely high right now in Monterey Bay, and the event is occurring as far north as Washington state. So it appears this will be one of the most toxic and spatially

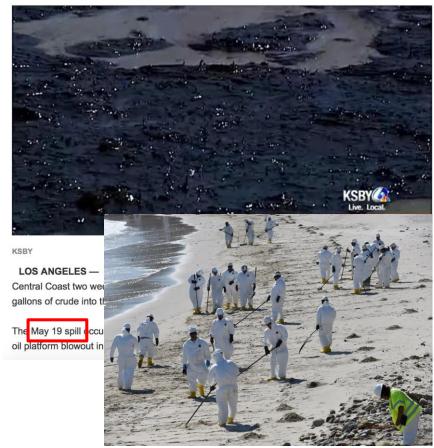


http://news.ucsc.edu/2015/05/algal-bloom.html

#### New domoic acid optical signature being developed

## Updates: Things to know about the Santa Barbara oil spill

UPDATED 2:10 PM PDT Jun 01, 2015



## Data Management

• Where will the *in situ* Monterey Bay data be available?

#### SeaBASS

#### SeaWiFS Bio-optical Archive and Storage System

Welcome to SeaBASS, the publicly shared archive of in situ oceanographic and atmospheric data maintained by the NASA Ocean Biology Processing Group (OBPG). For information on how to search for data, please refer to the "Data Users" menu options. For information about preparing files for submission to SeaBASS, refer to "Data Contributors."         Processing Version Labels       Apr 22 2015         The validation search results and stats download now include the actual processing version used to produce the extracts.       Nov 19 2014         We've finally replaced the gaudy, Google Maps pins with a slightly less gaudy circle! The 'Download 'All' button in the bio-optical search results has also been moved above the results table       Nov 19 2014	Welcome to SeaBASS, the publicly shared archive of in situ oceanographic and atmospheric data maintained by the NASA Ocean Biology Processing Group (OBPG). For information on how to search for data, please refer to the "Data Users" menu options. For information about preparing files for submission to SeaBASS, refer to "Data Contributors."         Processing Version Labels       Apr 22 2015         The validation search results and stats download now include the actual processing version used to produce the extracts.       Nov 19 2014         We've finally replaced the gaudy, Google Maps pins with a slightly less gaudy circle! The 'Download 'All' button in the bio-optical search results has also been moved above the results table       Nov 19 2014									
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2015 The validation search results and stats download now include the actual processing version used to produce the extracts. Minor UI Changes We've finally replaced the gaudy, Google Maps pins with a slightly less gaudy circle! The 'Download 'All' button in the bio-optical search results has also been moved above the results table	2015 The validation search results and stats download now include the actual processing version used to produce the extracts.          Minor UI Changes       Nov 19         2014       2014	(OBPG). For information	n on how to search for dat	•		•		•		
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	(plotting/mapping buttons are still located at the bottom). http://seabass.gsfc.n	'Download 'All' button in	n the bio-optical search res	esults has also been r			table			

2014

## Our Contribution to Coastal and Inland Science using the HyspIRI Airborne Campaign Dataset

# Application of hyperspectral remote sensing to cyanobacterial blooms in inland waters

RM Kudela, SL Palacios, DC Austerberry, EK Accorsi, LS Guild, J Torres-Perez *RSE Special Issue* 

### Remote sensing of phytoplankton functional types in the coastal ocean from the HyspIRI Preparatory Flight Campaign

SL Palacios, RM Kudela, LS Guild, KH Negrey, J Torres-Perez, J Broughton *RSE Special Issue* 

# "Application of hyperspectral remote sensing to cyanobacterial blooms in inland waters"

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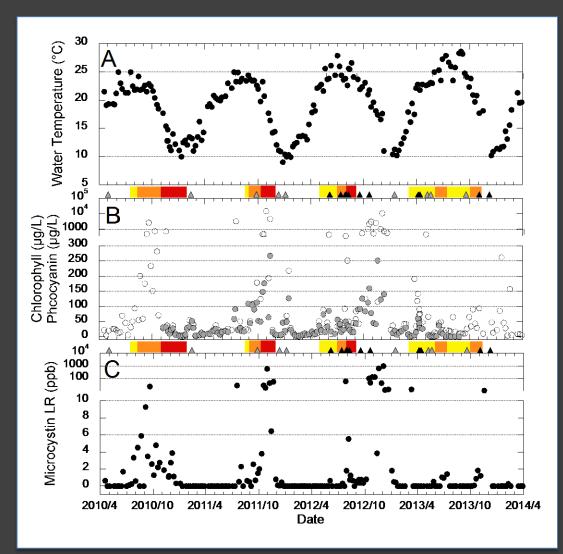
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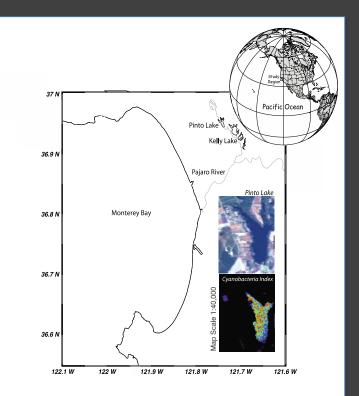
Toxic Algae Blooms to Persist on Lake Erie, Experts Say

BY JOHN ROACH

Study Site

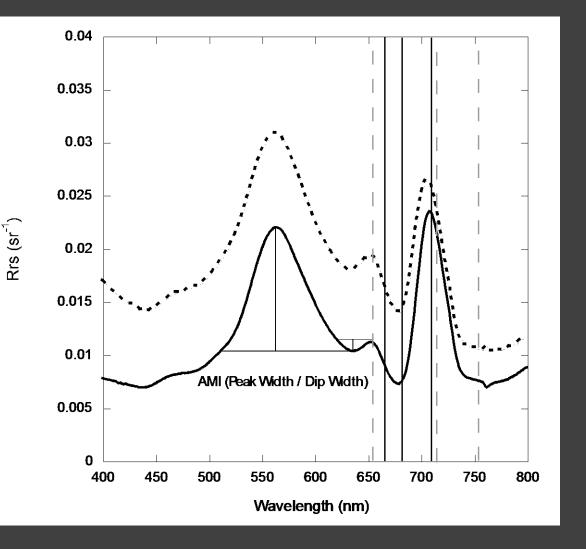
## Pinto Lake, Our Favorite Toxic Cesspool





#### Algorithms

# **Detecting Blue-Green Algae**

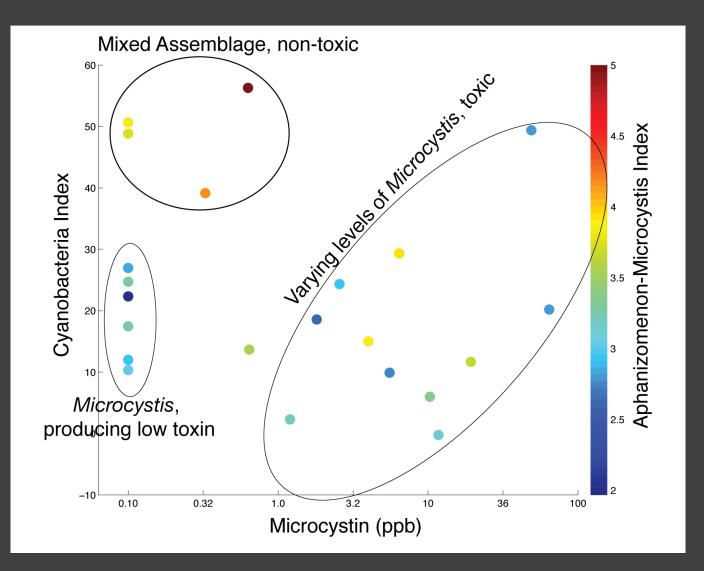


Several algorithms have been developed, including the Cyanobacterial Index (CI) and various phycocyanin absorption methods.

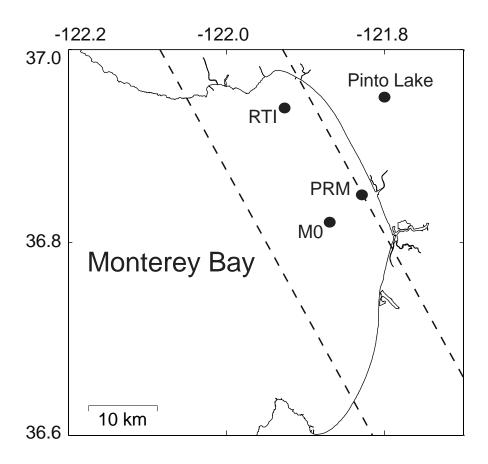
We generalized the spectral shape methods to take advantage of hyperspectral data, and also developed a Scattering Line Height (SLH) algorithm which works with almost any sensor, including MASTER

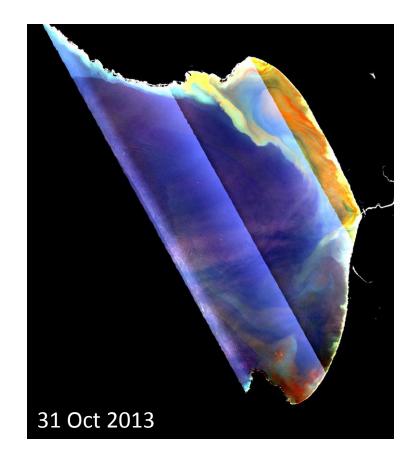
#### **Summary Results**

# **Predicting Toxic Blooms**



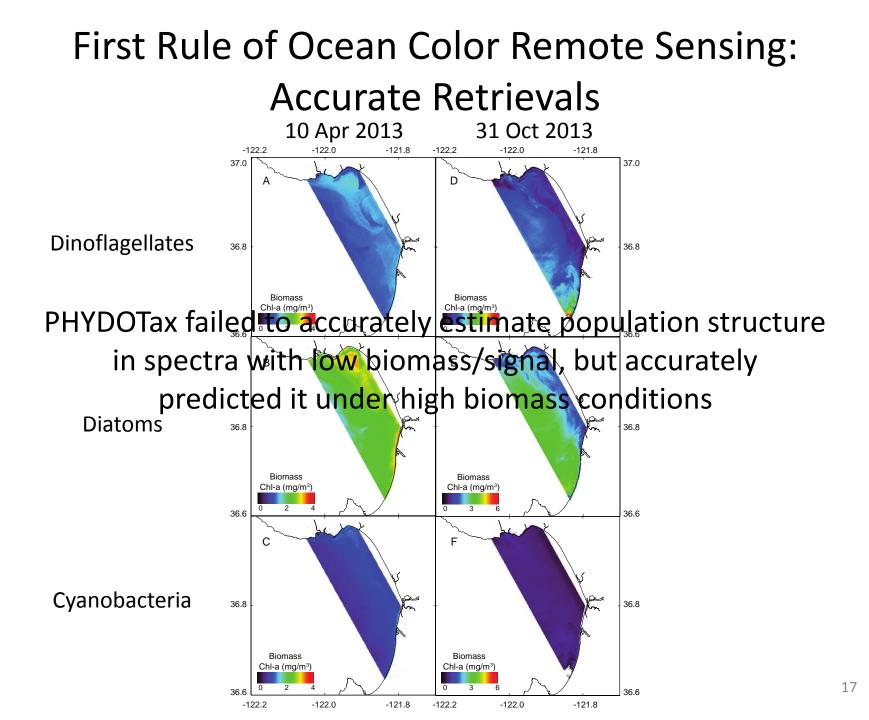
"Remote sensing of phytoplankton functional types in the coastal ocean from the HyspIRI Preparatory Flight Campaign"





#### First Rule of Ocean Color Remote Sensing: **Accurate Retrievals** 10 Apr 2013 31 Oct 2013 0.015 HyperPro **HyperPro** D Α ATREM ATREM ATREM+ ATREM+ - Tafkaa - Tafkaa 0.01 31 Oct 2013 10 Apr 2013 -122.0 -121.8 -122.0 -121.8 -12 37.0 37.0 0.005 В Remote Sensing Reflectance (1/sr) 0.01 Е В 36.8 0.0 ophyll (mg/m<sup>3</sup>) Chlorophyll (mg/m<sup>3</sup>) 0.005 36.6 -122.0 -121.8 22.2 -121.8 -122 0.015 Results suggest that chlorophyll can be estimated from ATREM+ retrievals, but only weakly 0.01 0.005 450 500 550 600 650 700 400 450 500 550 600 700 750 400 650

Wavelength (nm)



## Lessons Learned

Hyperspectral remote sensing of coastal and inland waters has special needs with respect to

# instrument calibration signal-to-noise atmospheric correction

# Summary

- Data Collected
  - A robust *in situ* data set collected in Monterey Bay and Pinto Lake for all years and seasons: 2013, 2014, 2015
  - Matchups for Santa Barbara Channel Plumes & Blooms cruises on 4/16/14 & 10/21/14
  - Currently, two dates of experimentally processed "scientific quality" AVIRIS images for Monterey Bay only (4/10/2013 & 10/31/2013)
- Data Management
  - Preparing *in situ* data to target upload to SeaBASS in winter 2016
  - AVIRIS over water targets, needs further discussion with JPL
- Lessons Learned
  - Hyperpsectral imagery has special needs with respect to instrument calibration, signal-to-noise, and atmospheric correction
  - It is possible to forecast blooms of the toxic cyanobacterium, *Microcystis*, using hyperspectral data

# The Un-Sung Heroes

- Kendra Negrey
- The Kudela Lab, mobilizing again, and again, and again, and again (etc...) at very early hours
- The UC-Santa Barbara Plumes & Blooms Team
- Ian McCubbin
- David Thompson