

# Great Lakes Remote Sensing Algorithms

*Status, Comparisons, and Future Directions*

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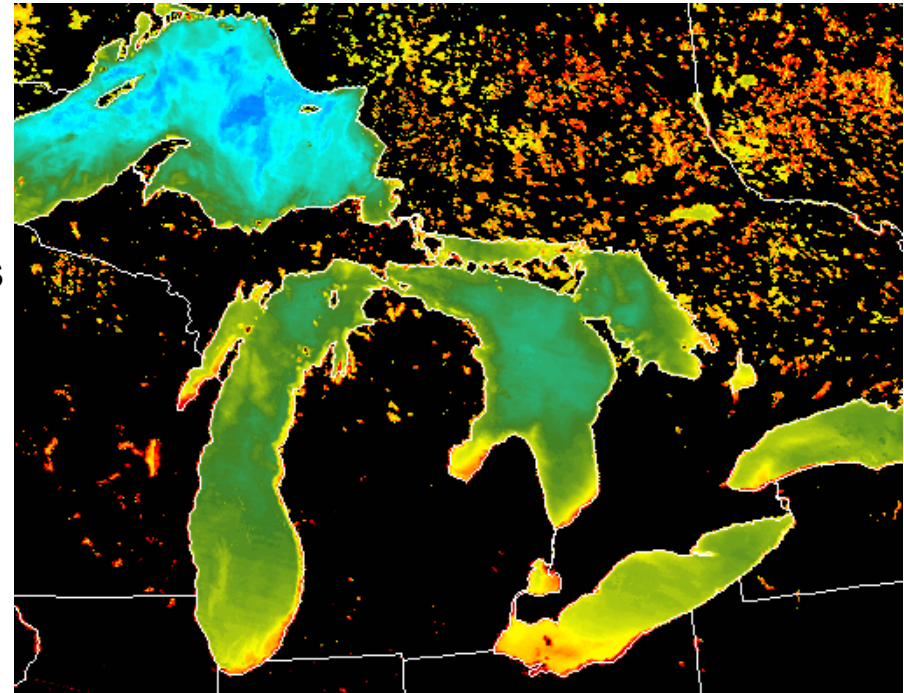
*Caren Binding – Environment Canada*

**NASA GLENN Remote Sensing Workshop**

**Cleveland, Ohio**

**March 12-13, 2014**

- Summarize Remote Sensing Products, Potentially Available for the Great Lakes
  - Example products
- It's all about the Chlorophyll
  - NASA standard band-ratio approach
  - Tuned NASA band ratios (GLF)
  - CPA-A approach
- It's all about the Harmful Algal Blooms (HABs)
  - MTRI approach
  - Stumph approach
  - Environment Canada approach
- Future Directions
  - New algorithm approaches
  - New in situ optical measurements
  - Additional algorithm comparisons

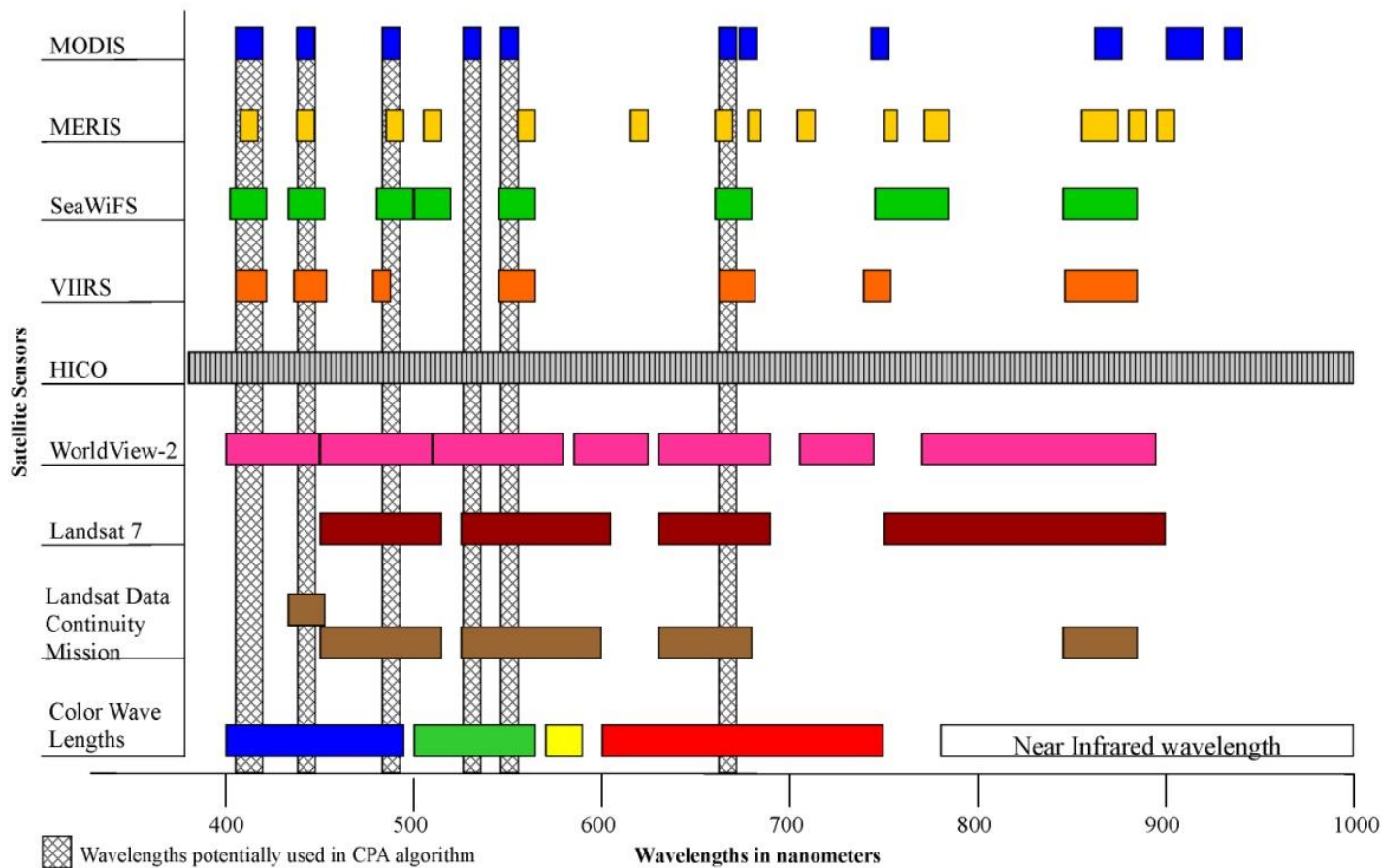


# Summary of Satellite Systems for Great Lakes Water Quality Measurements

Water Quality Measure Product	Sensor	Spatial Resolution	Temporal Coverage	Revisit Time
Lake Surface Temperature (LST)	MODIS	1 km	2002–Present	Daily
Color-Producing Agents (chl,doc,sm)	MODIS	250 m–1 km	2002–Present	Daily
	VIIRS	750 m	2012–Present	Daily
	MERIS	330 m	2002–2012	2–3 Days
	CZCS	1 km	1979–1986	Periodic
	SeaWiFS	1 km	1997–2011	Daily
Optical Depth (Kd, PAR, Photic Depth)	Landsat	30 m	1975–Present	16–17 Days Daily
	MODIS	250 m–1 km	2002–Present	
	VIIRS	750 m	2012–Present	
Harmful Algal Blooms (HABs)	MODIS	250 m–1 km	2002–Present	Daily
	VIIRS	750 m	2012–Present	Daily
	MERIS	330 m	2002–2012	2–3 Days
Submerged Aquatic Vegetation (SAV)	Landsat	30 m	1975–Present	16–17 Days Daily
	MODIS	250 m–1 km	2002–Present	
	VIIRS	330 m	2002–2012	
	MERIS	750 m	2012–Present	
Sediment Plume (TSSIGL)	MODIS	250 m–1 km	2002–Present	Daily
	VIIRS	750 m	2012–Present	Daily
	MERIS	330 m	2002–2012	2–3 Days
	CZCS	1 km	1979–1986	Periodic
	SeaWiFS	1 km	1997–2011	Daily
	Landsat	30 m	1975–Present	16–17 Days
Primary Productivity (PP)	MODIS	250 m–1 km	2002–Present	Daily
	VIIRS	750 m	2012–Present	Daily
	MERIS	330 m	2002–2012	2–3 Days
	CZCS	1 km	1979–1986	Periodic
	SeaWiFS	1 km	1997–2011	Daily

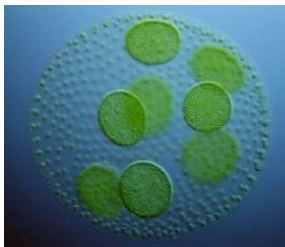
*Additional surface wind speed and direction, remote sensing products, wetland maps, lake ice extent and concentration*

# Ocean Color Satellite Band Comparison

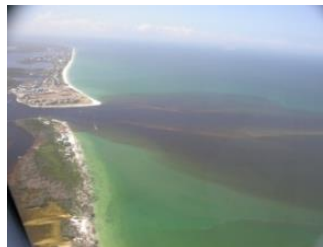




- Water Color in Inland and Coastal Water Results Mainly from Three Different Parameters, Known as Color-Producing Agents (CPAs):
  - **Chlorophyll (CHL):** A green pigment found in plant cells. Algal cells that are suspended in water produce a green-yellow color.
  - **Dissolved Organic Carbon (DOC):** Organic carbons that are produced as part of micro-organism metabolism or are transported from decaying vegetation products via rivers and streams. DOC only absorbs light, it doesn't scatter it. It appears yellow to brown in color (CDOM).
  - **Suspended Minerals (SM):** Inorganic particulate matter. Scatters and absorbs light.



CHL

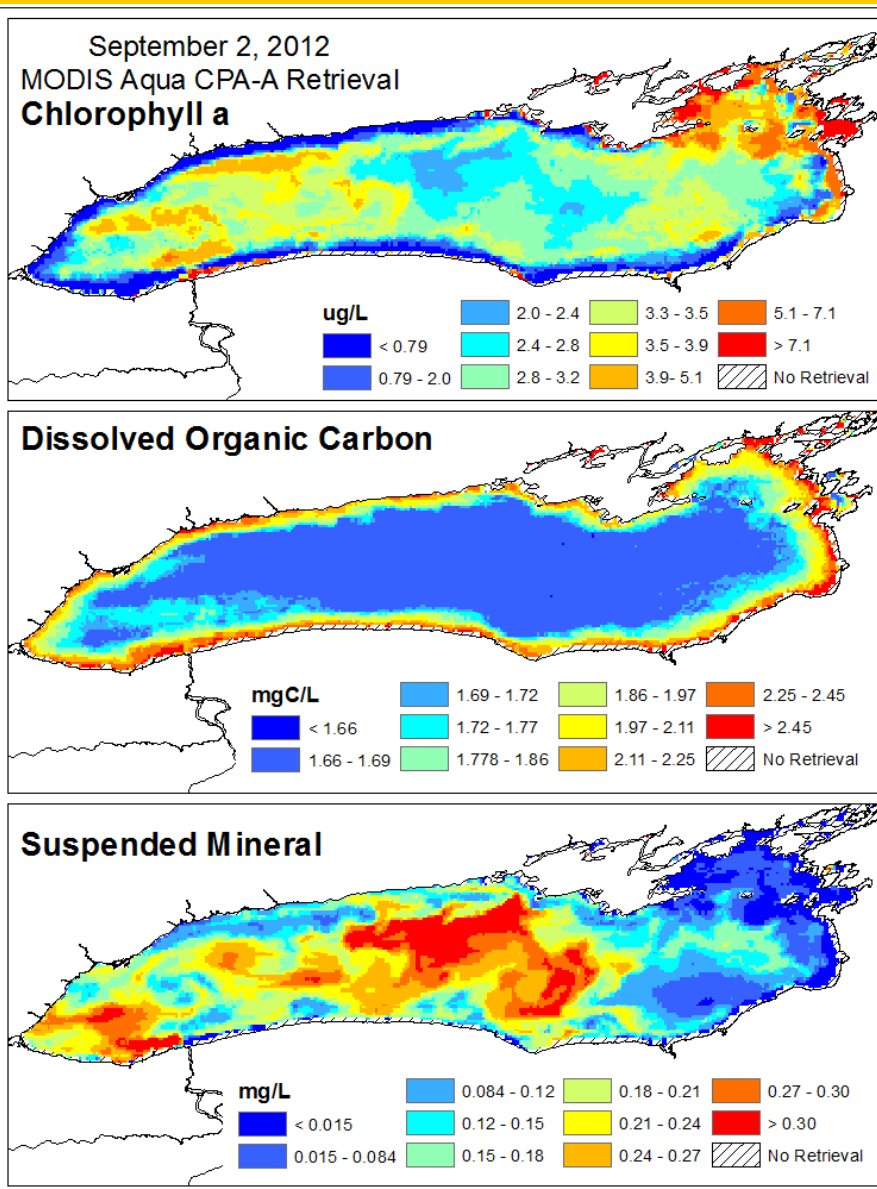


DOC

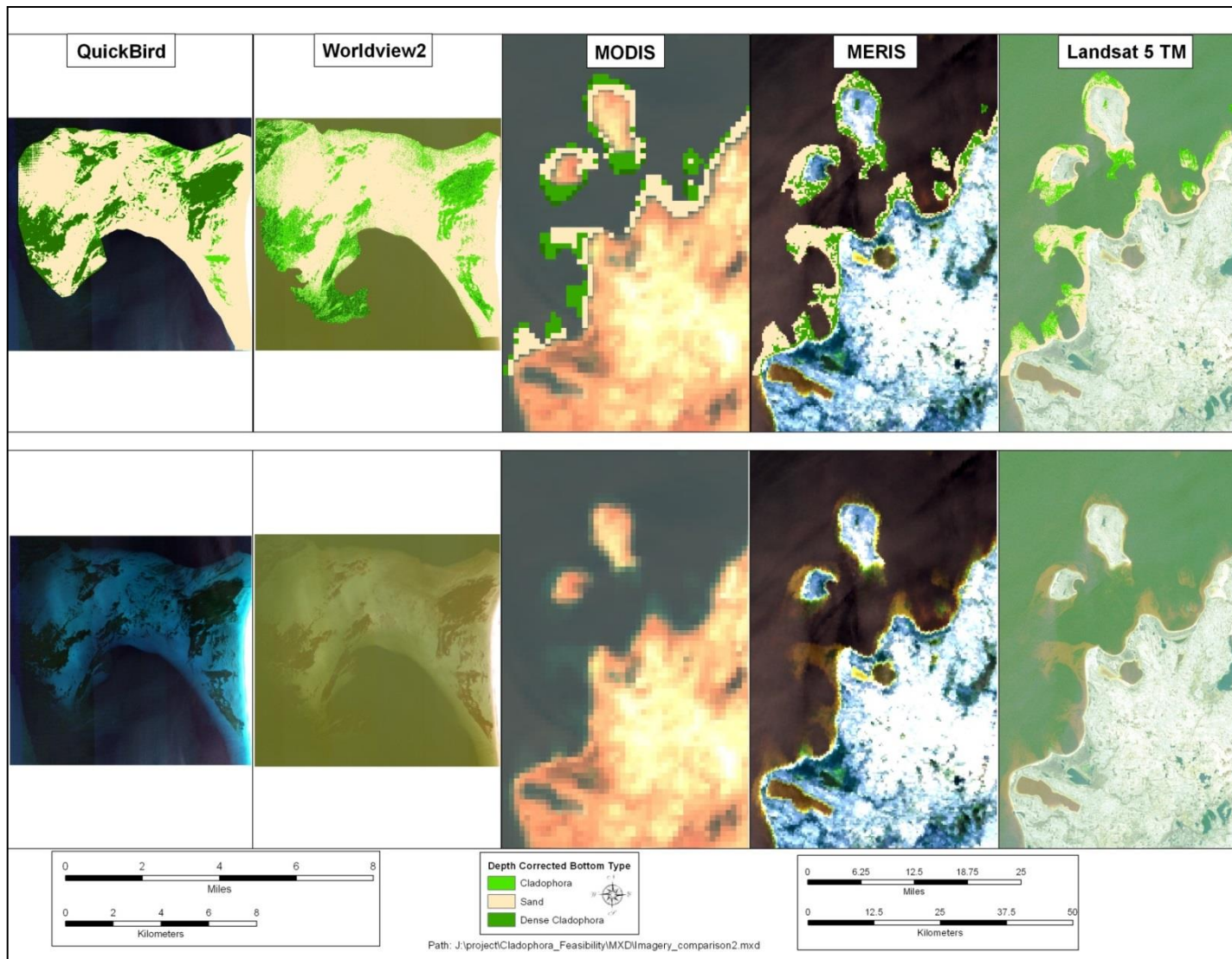


SM

# September 2, 2012 MODIS Aqua CPA-A Retrieval for Lake Ontario

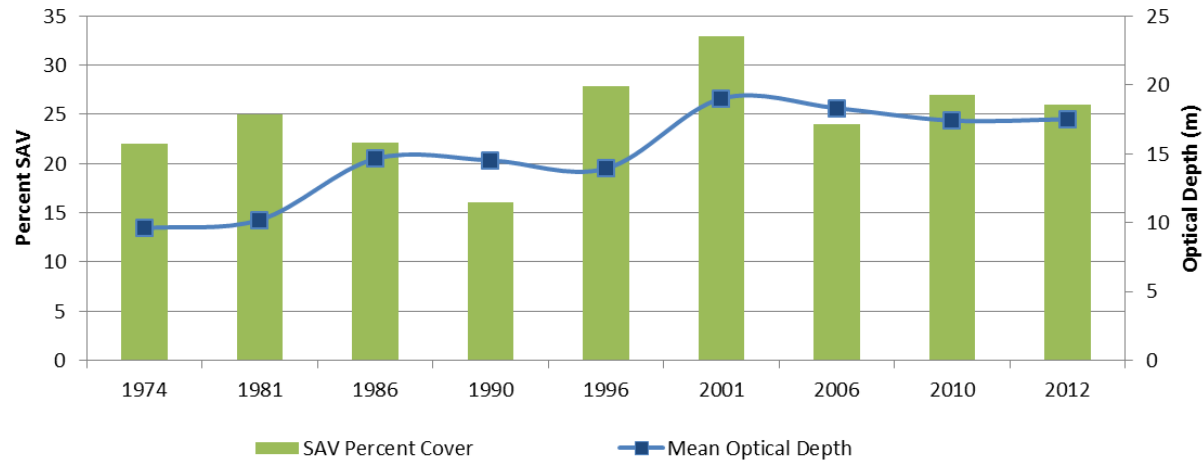


# Multi-scale SAV/Cladophora Mapping Capability

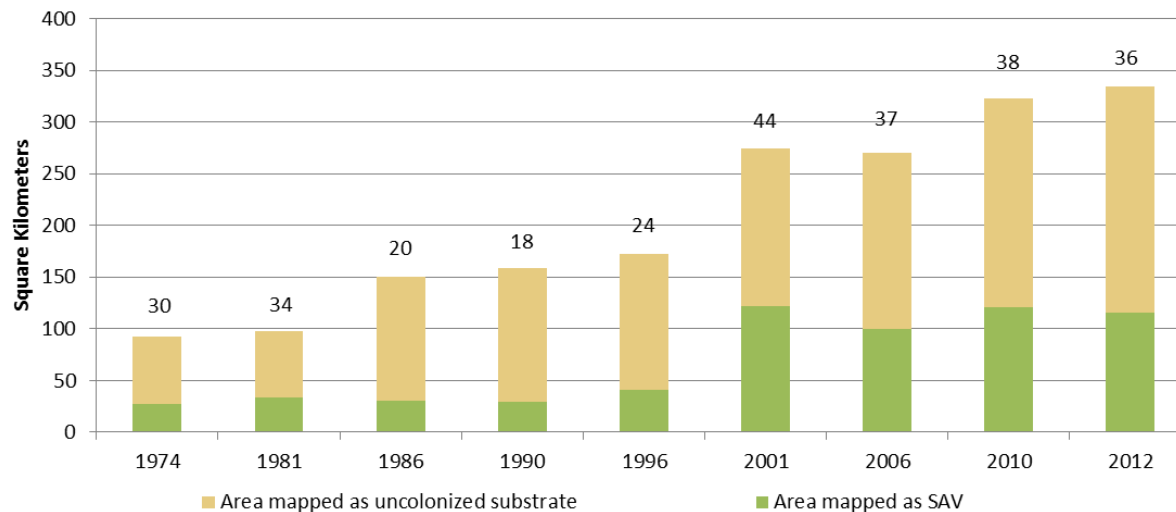


# Sleeping Bear Dunes National Lakeshore Lake Michigan

**Sleeping Bear SAV Coverage and Water Clarity Over Time**



**Sleeping Bear Dunes: Mappable Area Over Time**





# Green Bay AOC Sediment Plume

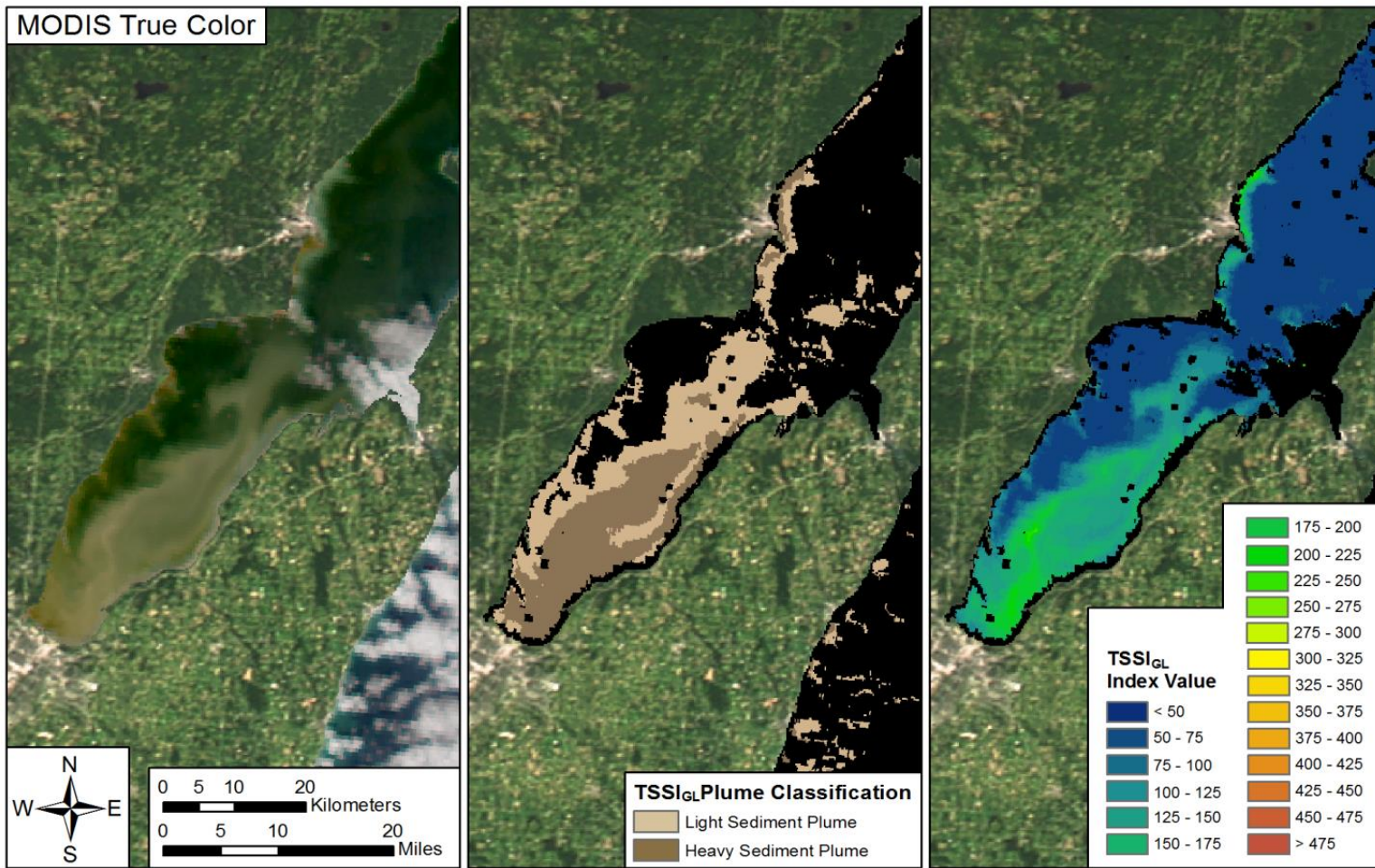
## Example: TSSI – Great Lakes Algorithm

### MODIS Derived Developmental TSSI<sub>GL</sub> Product Map

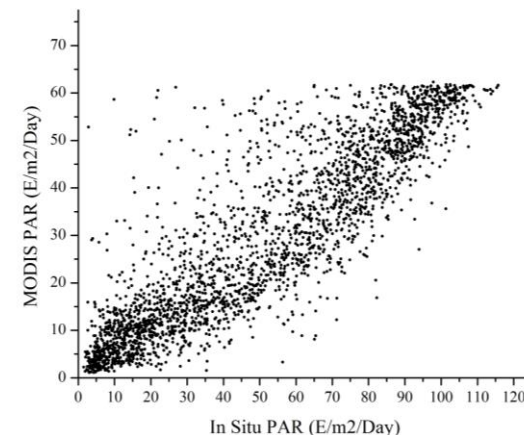
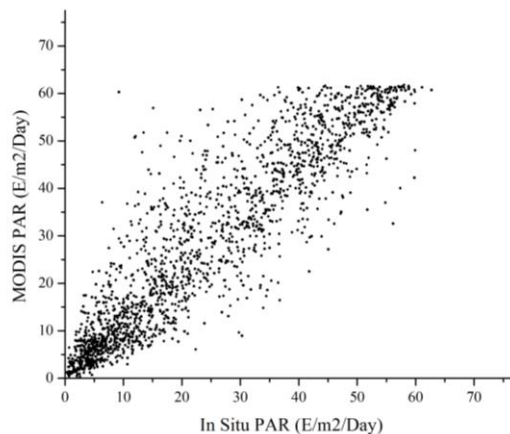
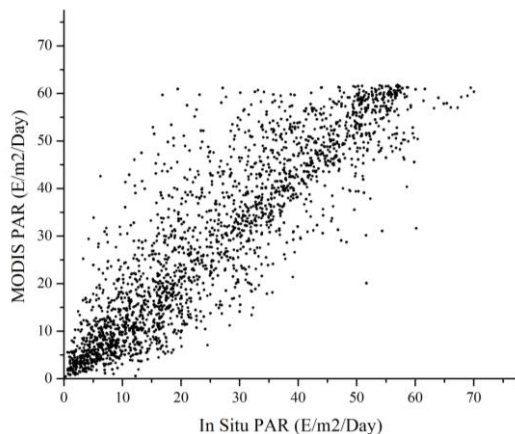
MichiganTech  
Research Institute  
[www.mtri.org](http://www.mtri.org)



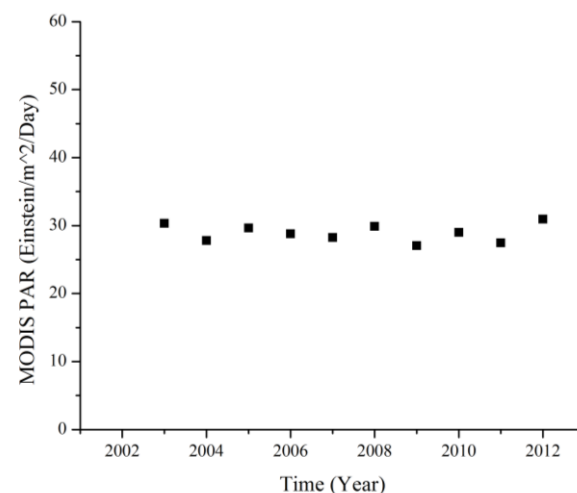
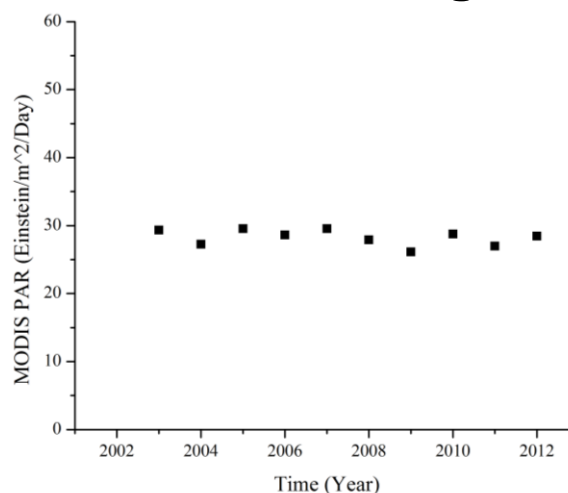
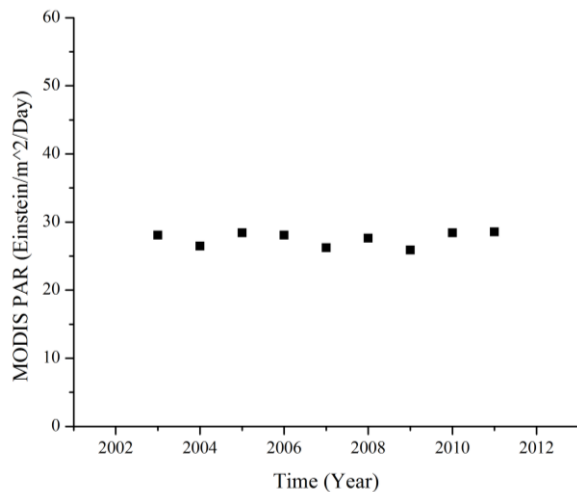
Green Bay  
October 20th, 2011



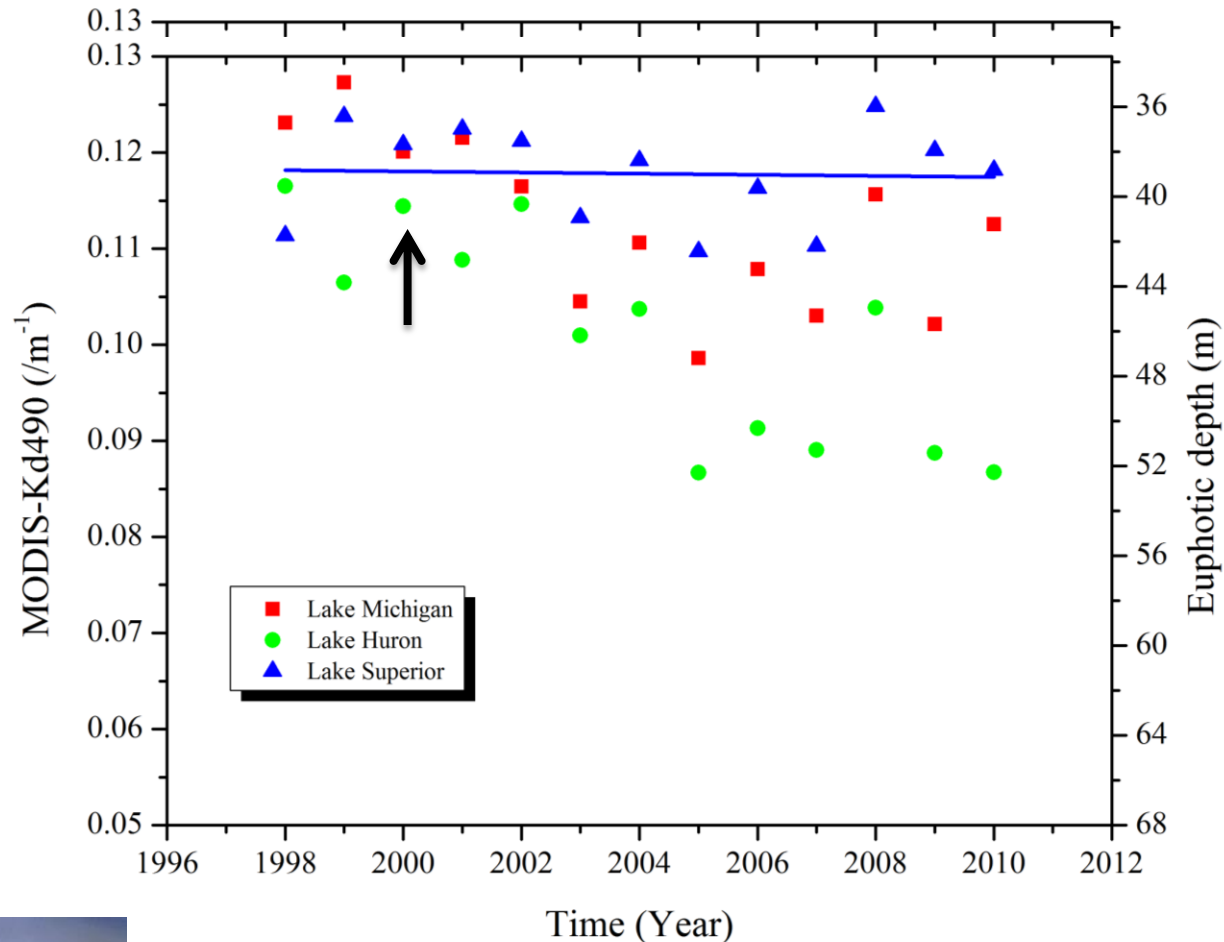
## MODIS vs. *in situ*



## Historical trends-MODIS whole lake Annual Average



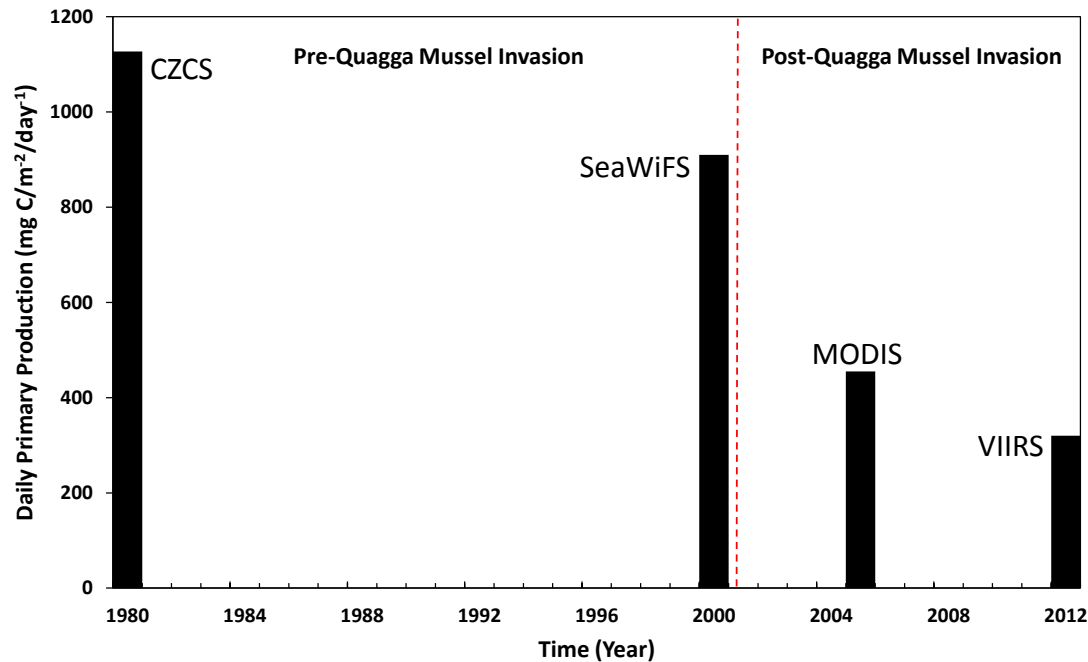
# Remarkable Changes in Water Clarity Due to Quagga Mussels



> 900 Trillion Dreissenid  
Mussels in Lake Michigan

Secchi Disks > 30 m LM & LH after  
2010

## ■ Extended Historical Lake Michigan Analysis



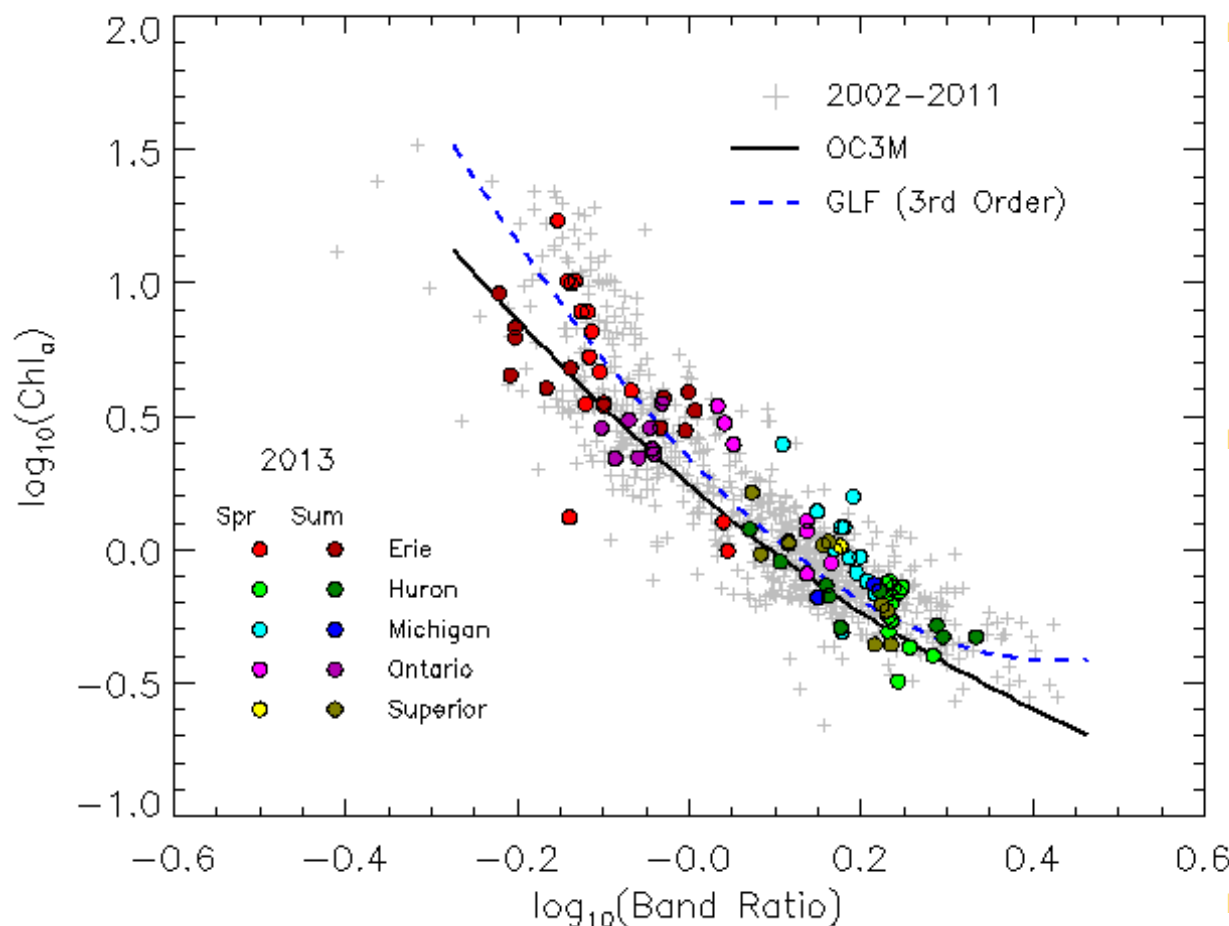
~72% Decrease in PP

- Preliminary Total Carbon Fixation for all the Great Lakes ~31 Tg C/year (2008)



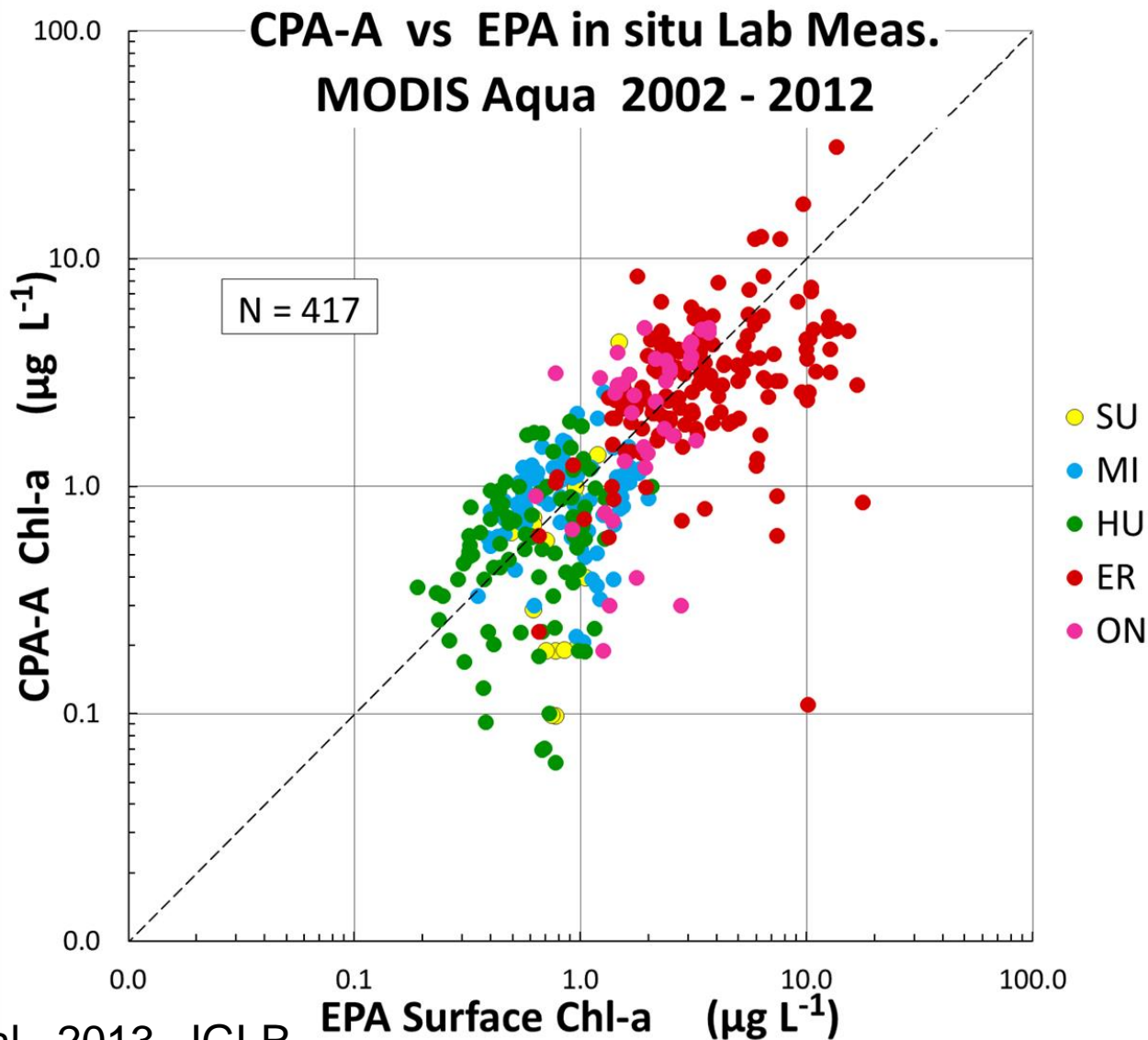
- NASA Standard Band Ratio OC3/OC4 - O'Reilly et al. 1998
- Modified/tuned Band Ratio Great Lakes Fit (GLF) Model – Lesht et al. 2013
- Color Producing Agent Algorithm (CPA-A) – Shuchman et al. 2013
- Binding Red/NIR Method – Binding et al. 2012
- Lake Superior CDOM Correction approach – Mouw et al. 2013

# GLF Comparison with New (2013) Data



Lesht et al., 2013, JGLR

- Chlorophyll in the Great Lakes waters sampled by GLNPO is definitely related to the blue/green band ratio measured by satellite.
- The chlorophyll estimates obtained from a band ratio retrieval algorithm fit to the Great Lakes data are sufficiently accurate for quantitative research.
- New, independent, data confirm the stability and accuracy of the algorithm.

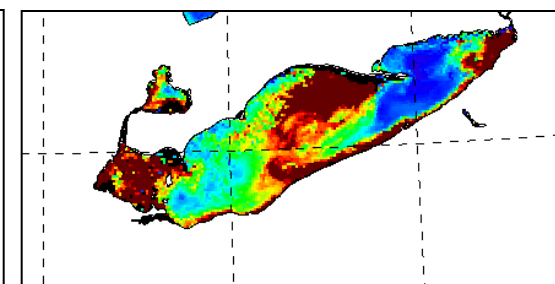
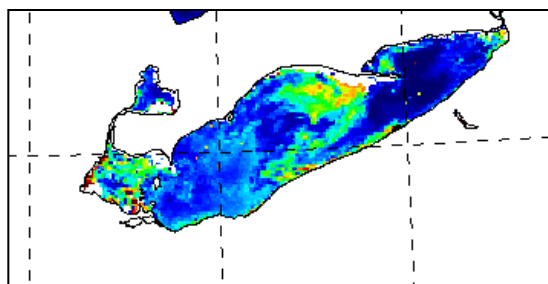
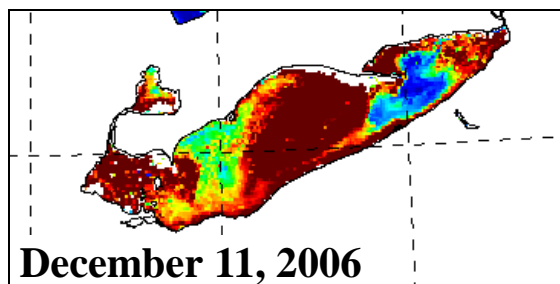
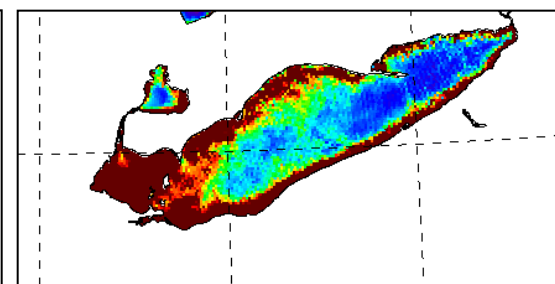
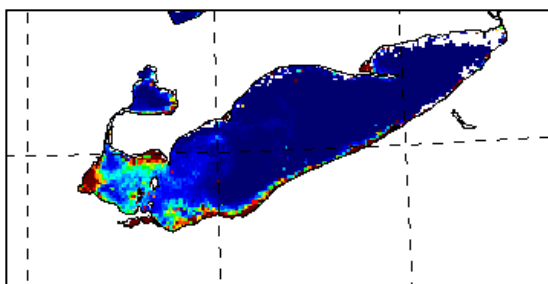
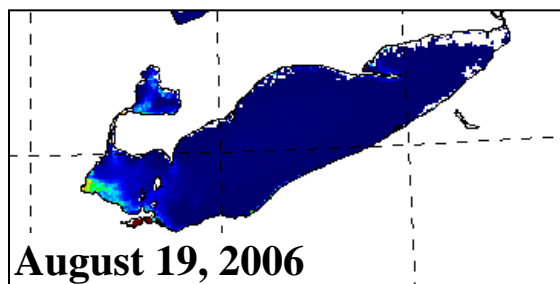


## Modelling in the Red-NIR: Validation

MSPM

CHLA

OC3M CHLA



RMSE =  $0.85 \text{ g m}^{-3}$   
 $R^2 = 0.94$ ,  $N = 82$

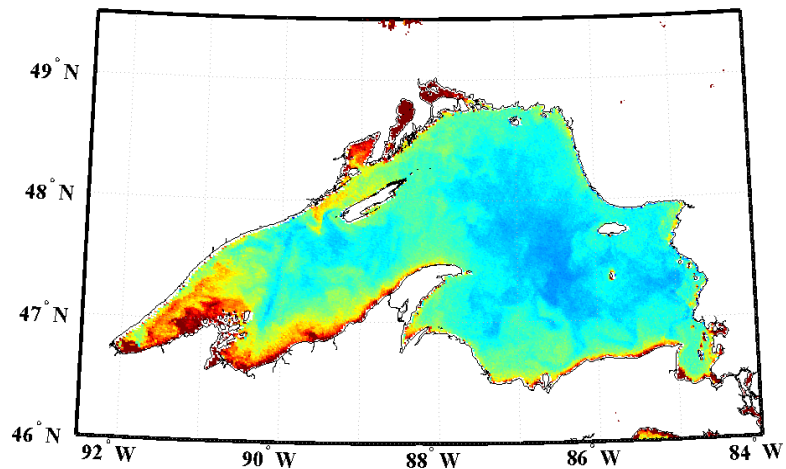
RMSE =  $2.06 \text{ mg m}^{-3}$   
 $R^2 = 0.96$ ,  $N = 82$

RMSE =  $6.08 \text{ mg m}^{-3}$   
 $R^2 = 0.87$ ,  $N = 82$

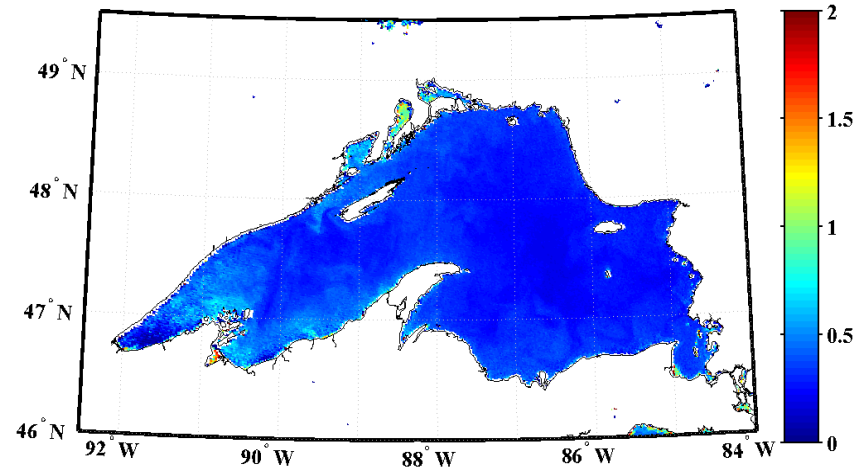


# Lake Superior CDOM Correction for Chlorophyll Retrievals

OC4 [Chl]



CDOM corrected [Chl]



- Cyanobacteria Index (CI) - Wynne et al. 2008, Stumpf et al. 2011
- Maximum Chlorophyll Index (MCI) – Gower et al. 2004, evaluated in Lake Erie by Binding et al. 2013
- MODIS Least Squares – Becker et al. 2009
- MODIS MTRI Multi-faceted Approach – EPA Report
- Phycocyanin Detection with Landsat – Vincent et al. 2004

# Cyanobacterial Index (CI)

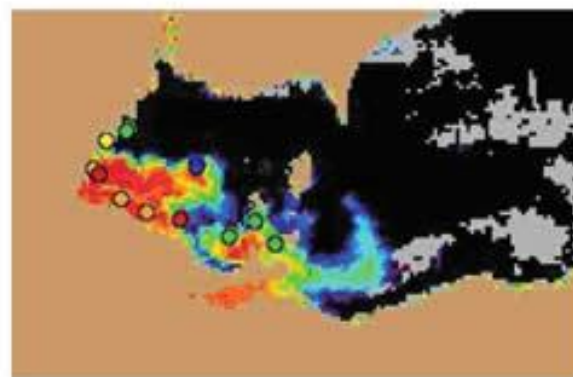


**EXPERIMENTAL**  
**Lake Erie Harmful Algal**  
**Bloom Bulletin**  
4 September 2008  
National Ocean Service  
Great Lakes Environmental Research Laboratory  
Last bulletin:

**Conditions:** A *Microcystis aeruginosa* bloom has been identified in western Lake Erie from the Maumee River mouth eastward, along the south shore.

**Analysis:** A *Microcystis aeruginosa* bloom was identified on August 26, 2008 through the use of MERIS imagery. The bloom was confirmed through sampling on August 28, 2008 and extends from the Maumee Bay eastward and along the southern shore of western Lake Erie. Concentrations range from very high to low, with the greatest concentration at the Maumee Bay in the far SW corner of the basin (41.7919N, -83.3925W) along the southern shoreline almost to the Bass Islands (41.6602N, -83.0780W). Satellite chlorophyll levels have exceeded 40 ug/L. A cyanobacteria bloom is also present in Sandusky Bay, however the majority of the bloom was primarily comprised of *Planktothrix* spp. and some *Anabaena* spp. *M. aeruginosa*, *Anabaena* spp. and *Planktothrix* spp. are known to produce toxins. Strong winds and thunderstorms are expected through Friday, which may cause the bloom to disperse, become mixed within the water column or possibly concentrate along the southern shore of Lake Erie. Further sampling is recommended.

-Tomlinson, Wynne



Imagery shows the spectral shape at 681 nm from September 2, 2008, where colored pixels indicate the likelihood of *Microcystis* (with red being most likely). *Microcystis* concentration sampling data from August 28, 2008 are shown as red circles (very high), orange circles (high), yellow circles (medium), green circles (low) and blue circles (very low) and purple circles (not present).

Wind conditions from South Bass Island, OH



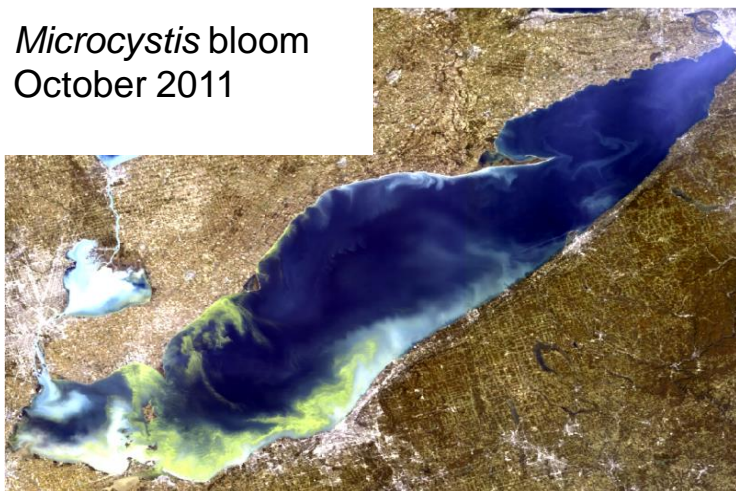
Lake Erie: Strong northeasterly winds (10-20 knots) are expected through tonight, and are expected to shift southwesterly on Friday. Northwesterly winds of 5-15 knots are expected Saturday and Sunday, with a decrease in storm activity.

Please note:

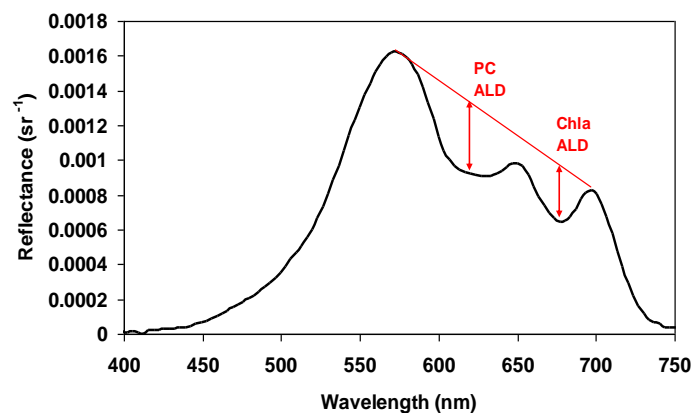
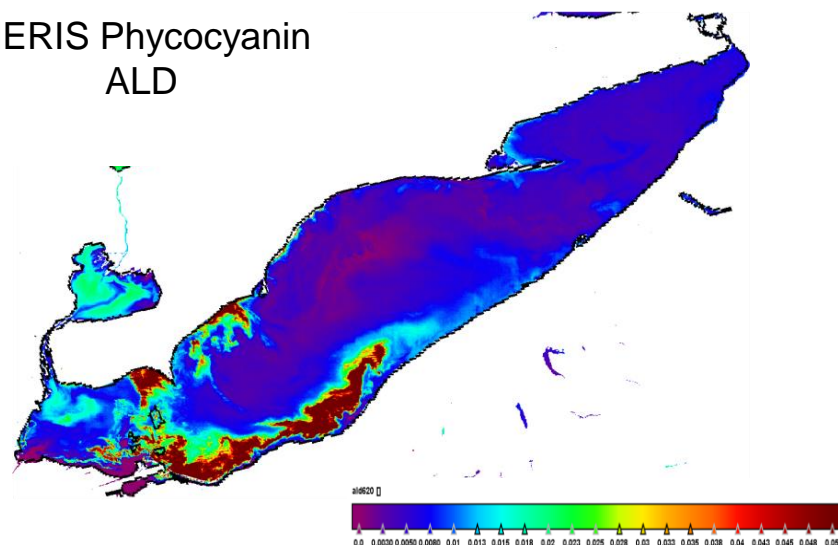
1. MERIS Imagery was distributed by the NOAA Coastwatch Program and provided by the European Space Agency
2. Cell counts were collected by the Great Lakes Environmental Research Laboratory
3. The wind data is available through the National Data Buoy Center

# Maximum Chlorophyll Index (MCI)

*Microcystis* bloom  
October 2011

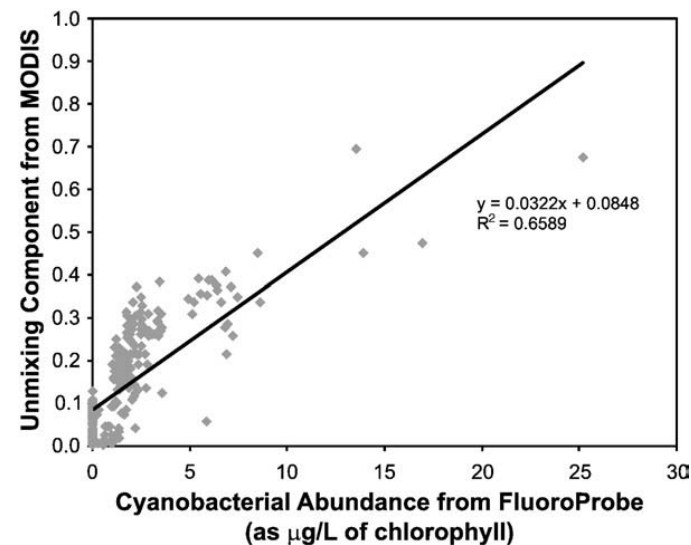
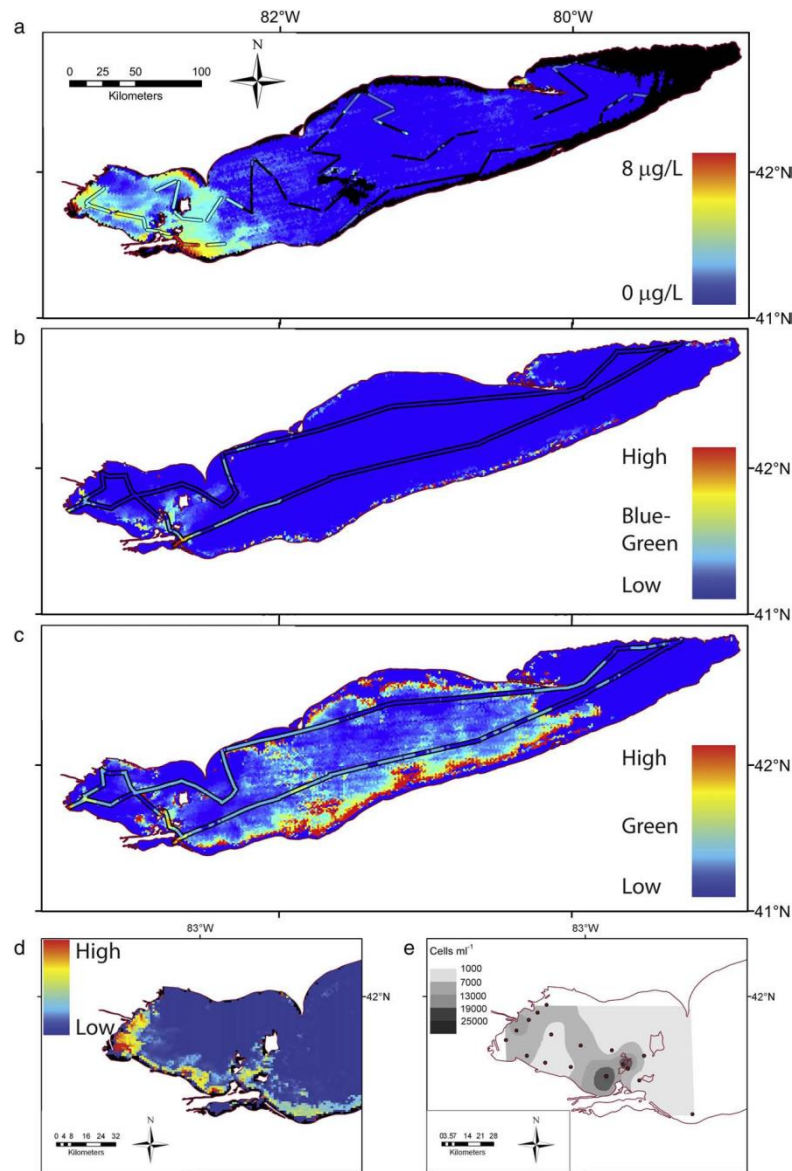


MERIS Phycocyanin  
ALD



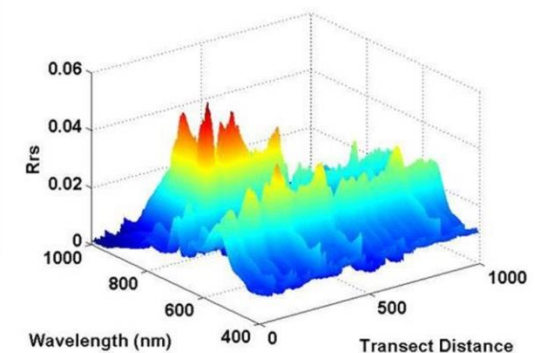
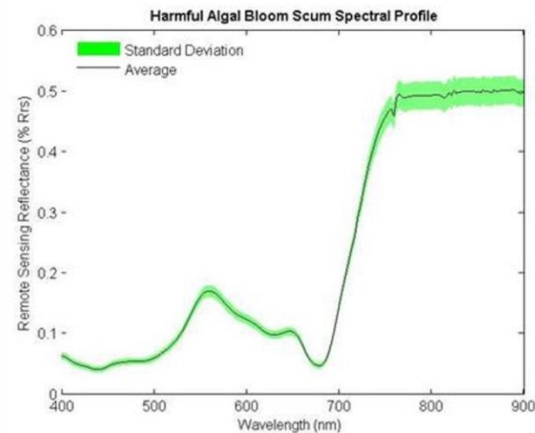
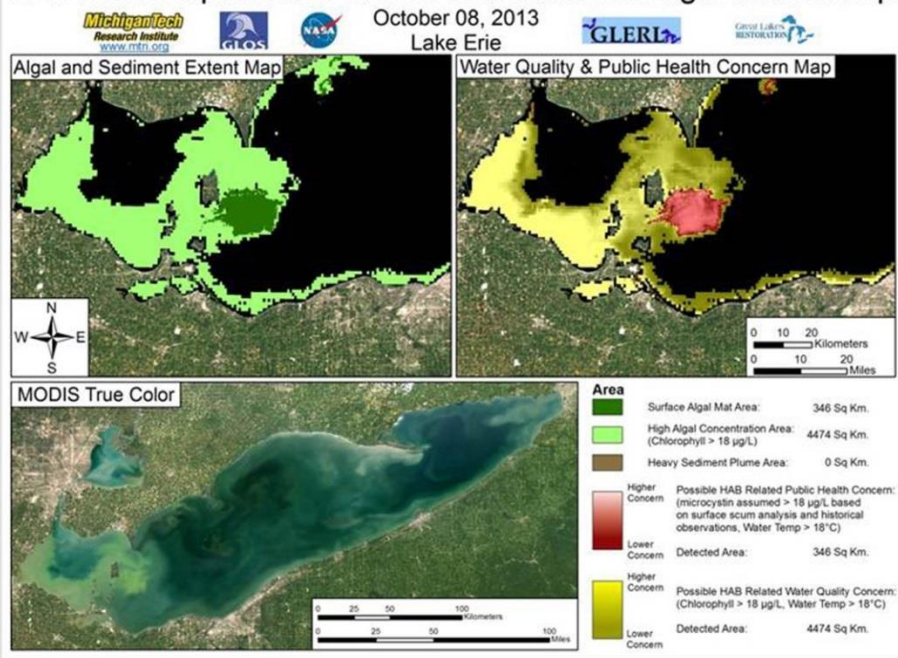


# MODIS Least Squares





## MTRI Developmental Harmful and Nuisance Algal Bloom Map



Satellite Derived Data	In Situ Data			
	HAB Present	No HAB Present	Totals	User's Accuracy
HAB Present	44	6	50	88%
No HAB Present	3	15	18	83%
<b>Totals</b>	47	21	68	
Produce's Accuracy	94%	71%		
<b>Overall Accuracy = 87%</b>				

Weekly HAB product has been validated at 87% accuracy

# Future Directions Existing Suite of Algorithms

- Additional Algorithm Verification
- Comparisons of Derived Products
- Generation of Comparison Matrix Indicating Applicability (“Sweet Spot”) of Each Algorithm

- Improved Chl, HABs, cdom, sm, Retrieval Algorithm
- Surface Scum Index for HABs
- Sediment Plume Extent and Constituent Type and Concentration
- Algal Species Determination
- Shallow Water Depth Correction
- Shallow Water Bathymetry
- Lake Bottom Mapping
- Others



# Future Directions Combined Remote Sensing Models



- Combine Remote Sensing Observations with Geophysical Models
- HABs Model is Good Example

# Summary Remarks on Great Lakes Algorithms

- Many Chlorophyll Retrieval Algorithms Exist for Great Lakes
  - Most have “sweet spot”
  - Band ratio techniques work well in open lakes
  - Nearshore, embayments, Lake Erie/Ontario require more sophisticated approaches
  - Primary productivity calculations require robust chl as input
- HABs Algorithms have been Developed and Successfully Evaluated
  - U.S. satellites (MODIS/VIIRS) lack optimum band for blue/green algae detection
  - NOAA approach utilizes a CI
  - MTRI utilizes Chl → HABs empirical relationship and identification of surface scum
  - New approach under development will utilize hydro-optical properties of HABs to achieve retrieval success

# Summary Remarks on Great Lakes Algorithms (cont)

- Significant Amount of Ongoing Investigations by U.S. and Canadian Agencies, Academia, Industry, and NGOs on Better Algorithms for chl, doc, sm, Kd, PP, Sediment Plumes, and HABs
  - New algorithm for lake-wide evaporation