



# Monitoring Strategy for the Albemarle-Pamlico Estuarine System- Estuarine Monitoring: Water and Surficial Sediments

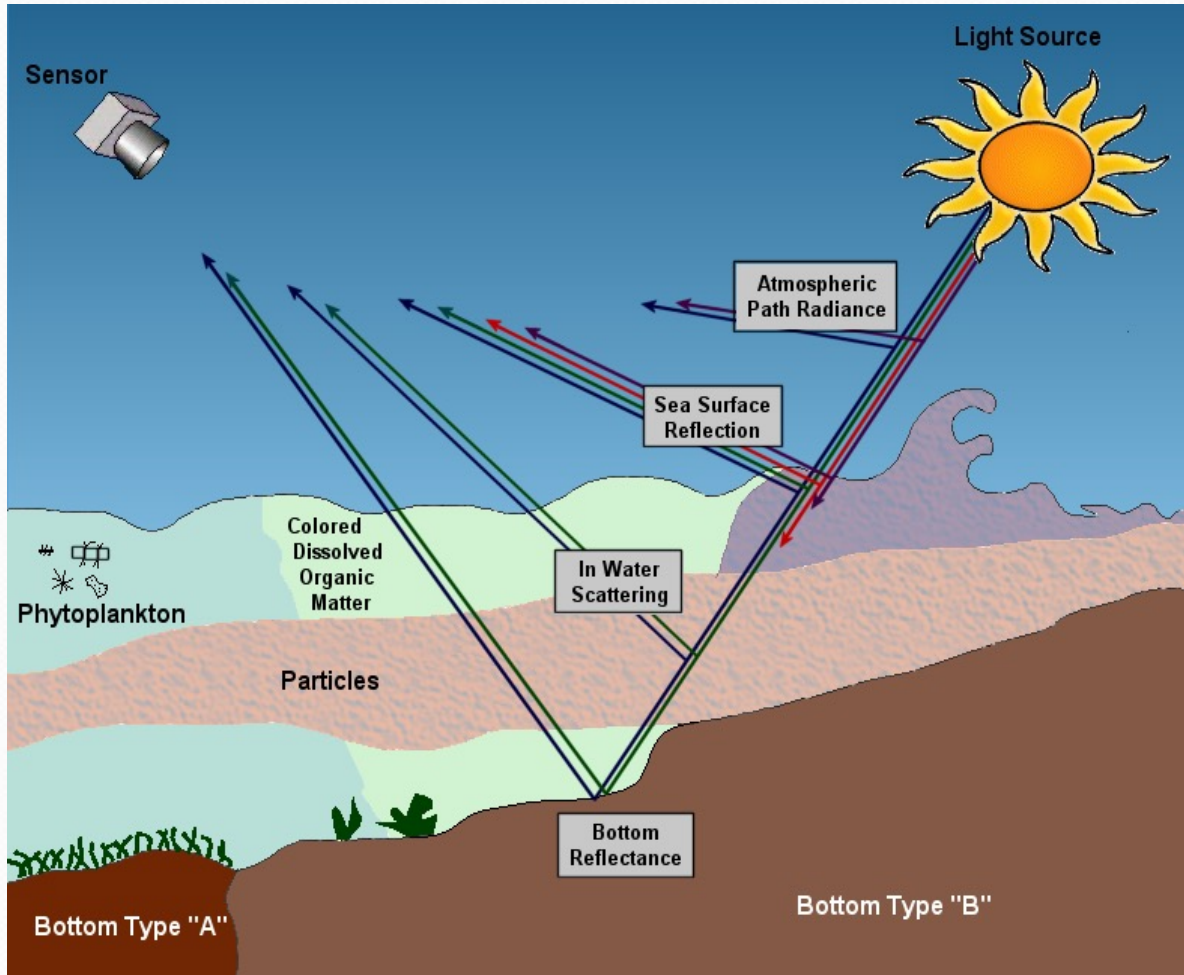
APNEP Water Resources Monitoring & Assessment Team

Remote Sensing Opportunities for APNEP Monitoring

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Research Oceanographer  
USEPA/ORD/CEMM/ACESD  
Narragansett, RI 02882

September 14, 2023

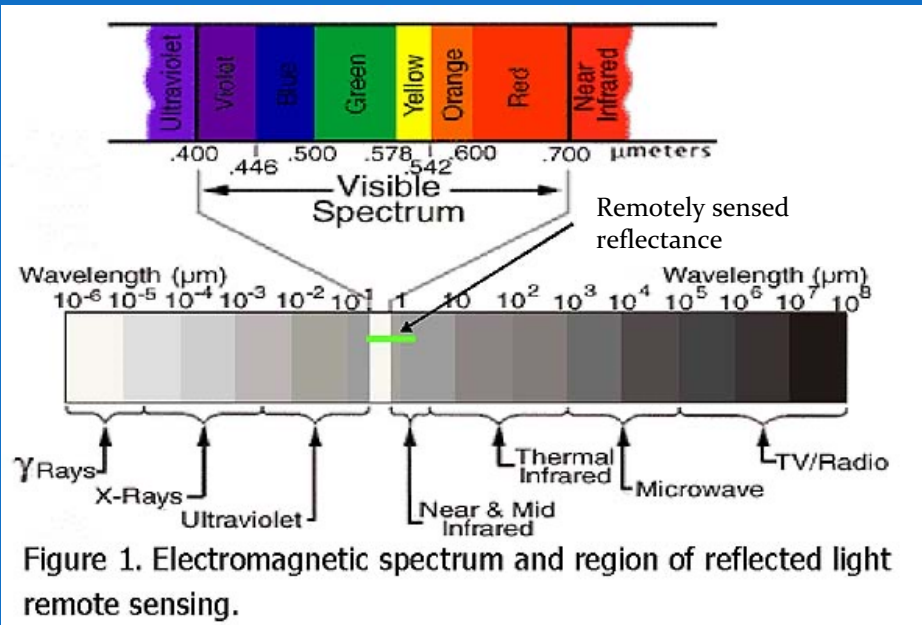
# Optical components and pathways of radiance and reflectance in coastal waters



## Multiple light paths

- **Scattering due to:**
  - atmosphere
  - aerosols
  - water surface
  - suspended particles
  - bottom
- **Absorption due to:**
  - atmosphere
  - aerosols
  - suspended particles
  - dissolved matter

# What is ocean/estuary color?



## Definition of Remotely Sensed Reflectance ( $R_{rs}$ )

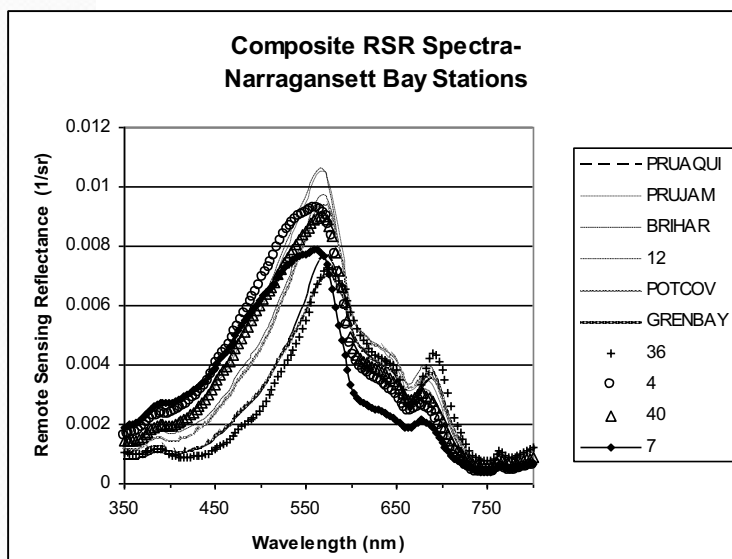
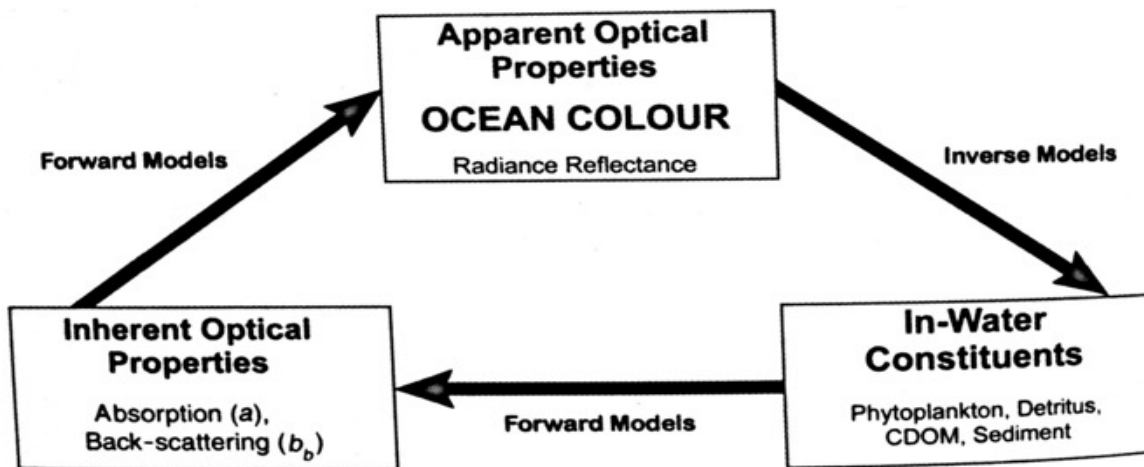
$$R_{rs}(0^+, \lambda) = L_w(0^+, \lambda) / E_s(0^+, \lambda)$$

$R_{rs}$  = remotely sensed reflectance (1/sr)

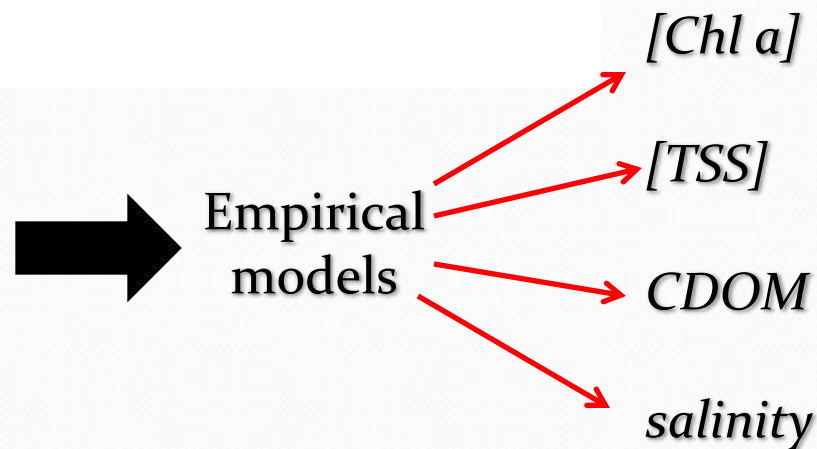
$L_w(\lambda)$  = water leaving radiance measured above the air/water interface ( $W m^{-2} sr^{-1}$ ),

$E_s(\lambda)$  = downwelling irradiance measured above the air/water interface ( $W m^{-2} sr^{-1}$ )

# Interrelationship between optical properties and in-water constituents



For example:



# Space-based Optical Color Sensors

**SENSOR**  
(spatial  
resolution)

**PLATFORM**

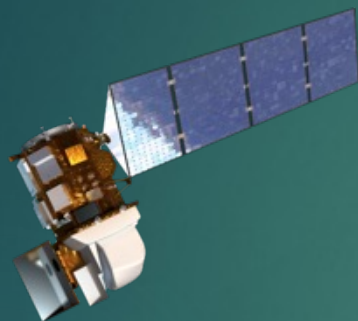
**AGENCY**

**Data  
Distribution  
Policy**

**Data Access**

**Cost to  
User**

**OLI**  
30 m



Landsat 8/9  
(2013–present)

USGS/NASA

Products  
distributed  
online from  
USGS  
EarthExplorer  
website

Registration  
required

No cost

**OLCI**  
10 m



Sentinel A/B  
(2015–present)

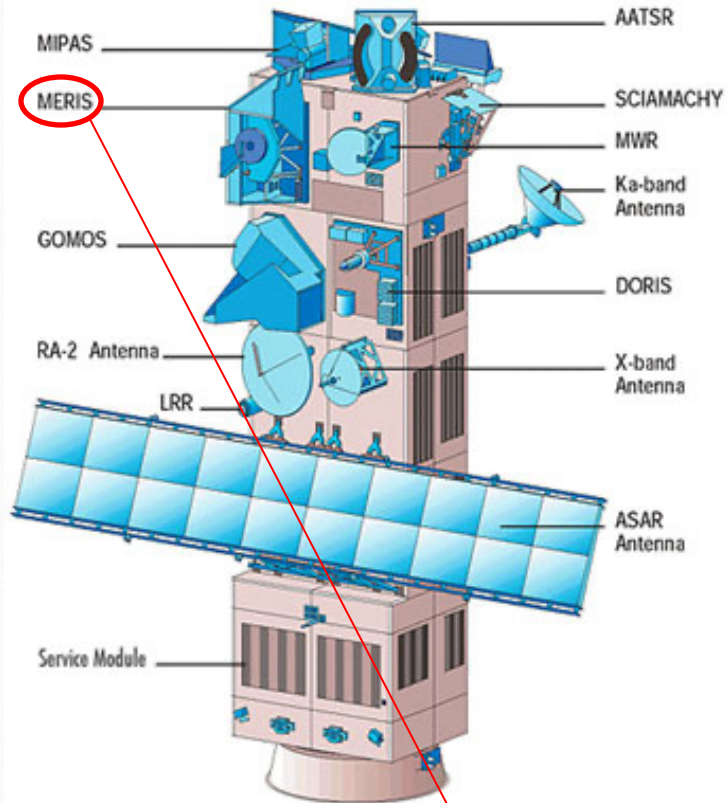
European  
Space  
Agency

Products are  
distributed  
online from the  
Copernicus Data  
Hub

Registration  
required

No cost

# ESA ENVISAT platform



MERIS = Medium Resolution Imaging Spectrometer

### **3. Monitoring Needs and Recommendations**

#### **3.2. Needs and Recommendations: Phytoplankton**

##### **3.2.1. Phytoplankton Metric: Chlorophyll $a$ Concentration**

##### **3.2.2. Phytoplankton Metric: Extent and Frequency of Algal Blooms**

**(See slide presentation)**

# Satellite Remote Sensing of Chlorophyll *a* in Support of Nutrient Management in the Neuse and Tar-Pamlico River estuaries

Darryl J. Keith, Research Oceanographer  
EPA/ORD/CEMM/Atlantic Coastal  
Environmental Sciences Division



# Introduction

- The North Carolina Environmental Management Commission (EMC) has adopted as a water quality standard that chlorophyll *a* concentration should not exceed 40 µg/L in sounds, estuaries and other slow-moving waters.
- Exceedances require the development of a Total Maximum Daily Limit (TMDL) for nutrients in that water body.
- Chlorophyll *a* was chosen as the endpoint to manage total nitrogen concentrations in the Phase I TMDL for the Neuse River
- TMDL compliance would be achieved if Chl *a* exceedances occurred in fewer than 10% of the samples collected in a specified area and time (aka “10/40 criterion” or “Neuse Rules”)

# Questions

- Can TMDL compliance and chlorophyll exceedances in the Neuse and Tar-Pamlico River estuaries be assessed at daily and annual time scales from MERIS imagery?
- Which summary statistic of chlorophyll *a* concentrations (sample mean, median, and 90<sup>th</sup> percentile values) is the most useful for determining TMDL violations and to support environmental compliance monitoring?

# Methods

- Used the MERIS Chl *a* product derived from atmospherically-corrected, full resolution (300 X 300 m pixel size) images (n= 206) of the Neuse and Tar-Pamlico River estuaries to determine the number of pixels exceeding 40 µg/L from January 2006 to December 2009.

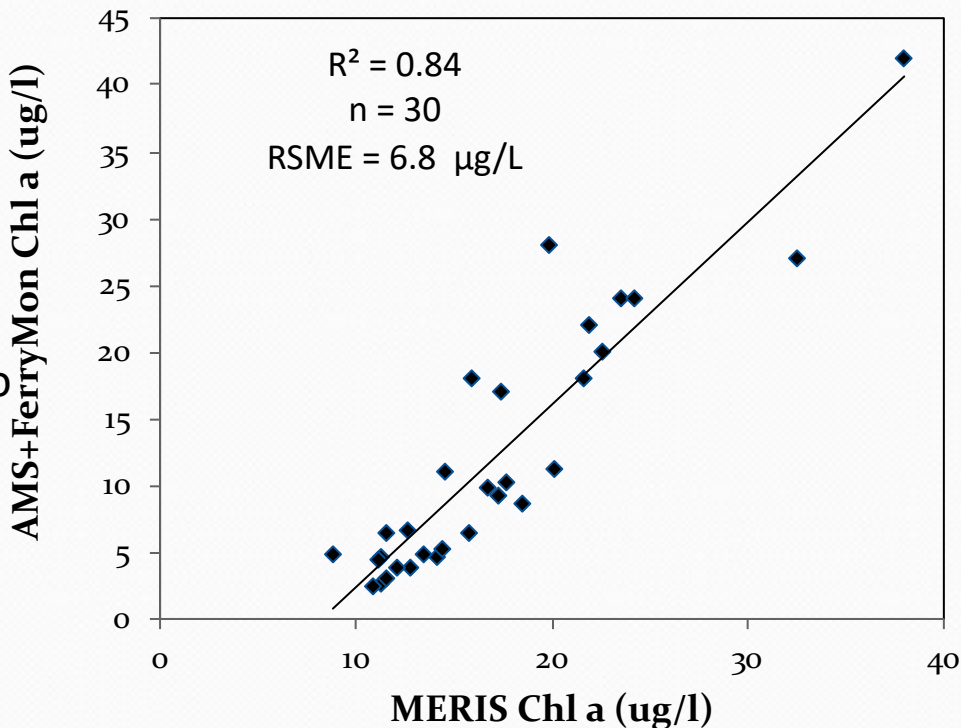
*\* MERIS images were acquired from the European Space Agency (ESA) by Ross Lunetta of the EPA National Exposure Research Laboratory (NERL) Landscape Characterization Branch (LCB) in 2009.*

## Calibrating MERIS derived chlorophyll values to the Neuse River Estuary

- FerryMon monitoring program from crossings (n = 19) during 2006 – 2009 of the Neuse River Bend and Lower Neuse River Estuary segments (Cedar Island/Orcacoke, Cherry Branch/Minnesott ) and in Pamlico Sound (Swan Quarter/Orcacoke)

- NC DWQ Ambient Monitoring System (AMS) Chl  $a$  data collected along the Lower Neuse River Estuary segment (n= 11) from 2008- 2009.

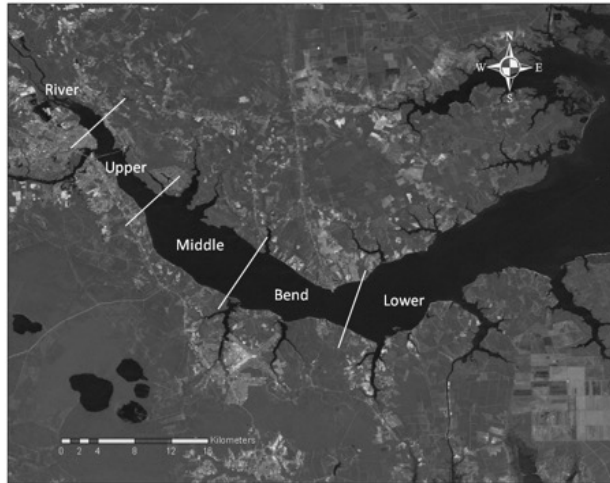
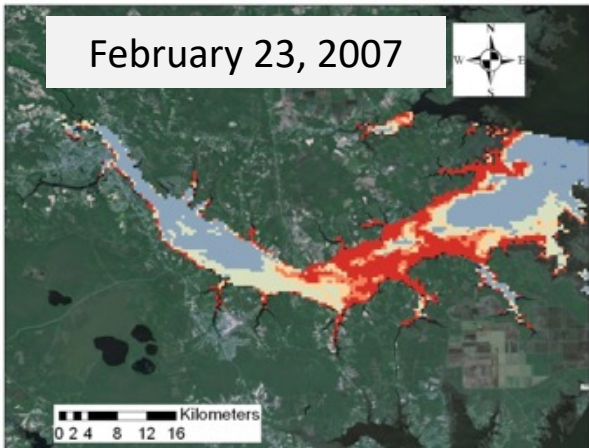
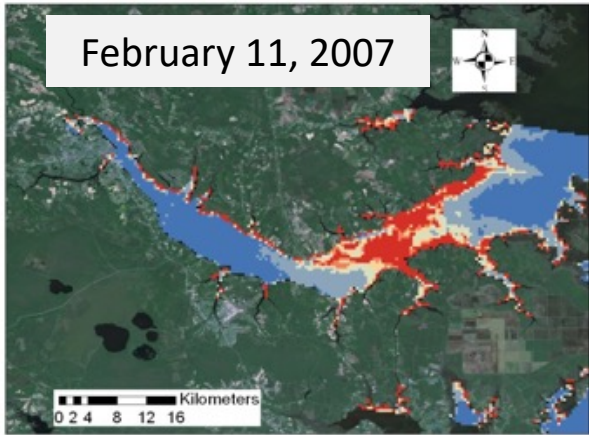
- The *in situ* data were collected at dates and times concurrent with MERIS overflights.



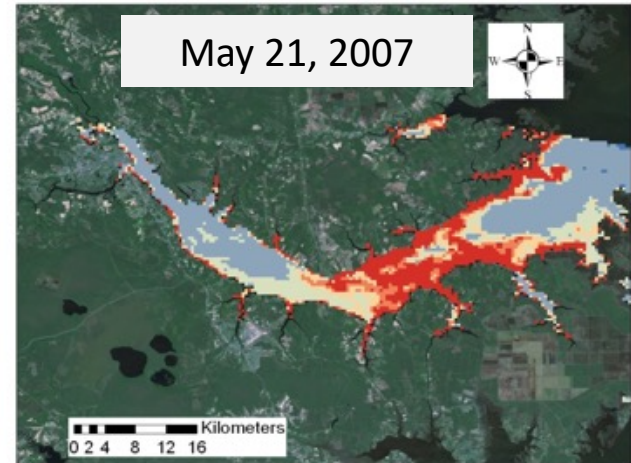
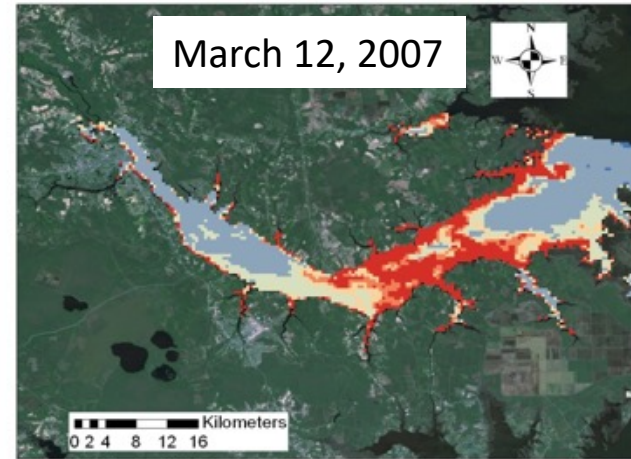
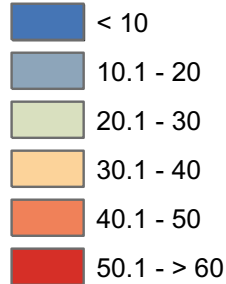
$$\text{Chl } a_{\text{ambient}} = 1.3671 * (\text{MERIS Chl } a - 11.283)$$



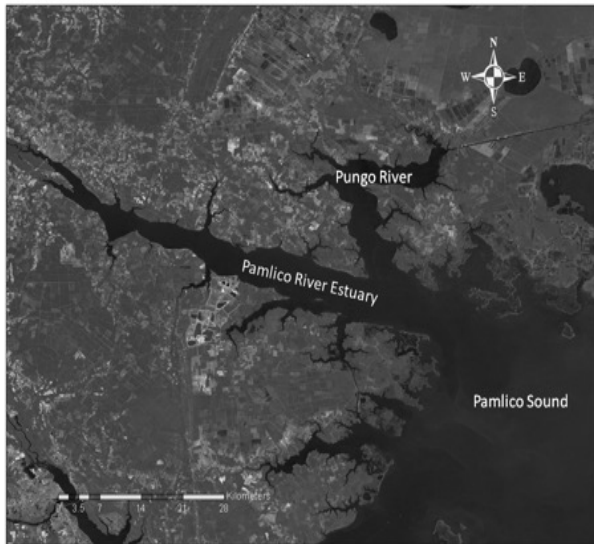
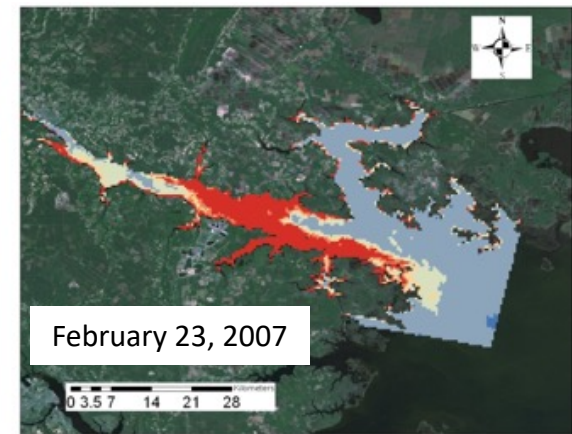
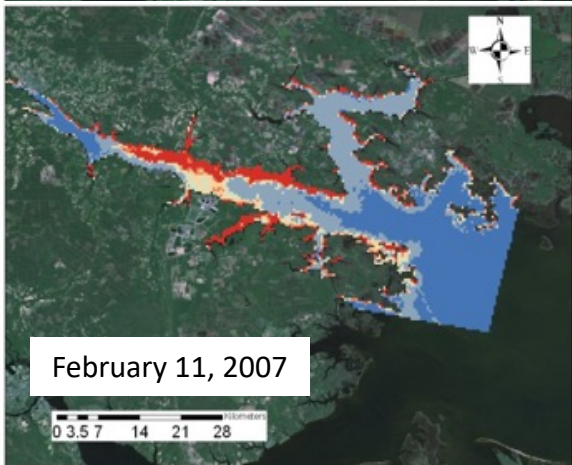
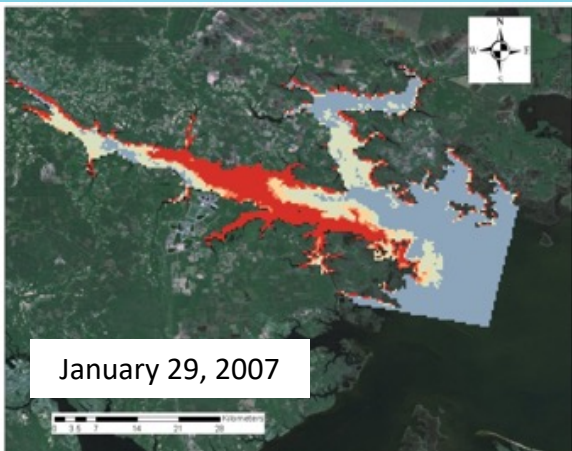
# Time Series of a TMDL Violation - Neuse River Estuary: Winter -Spring 2007



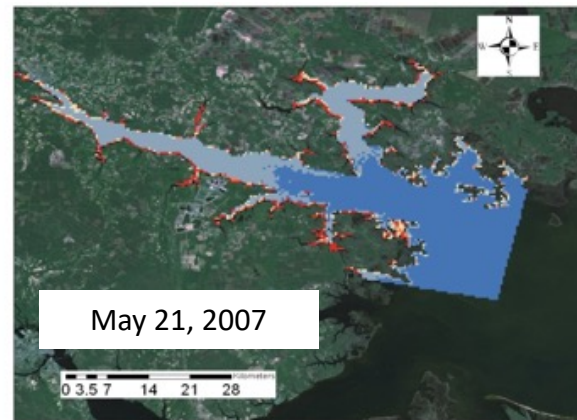
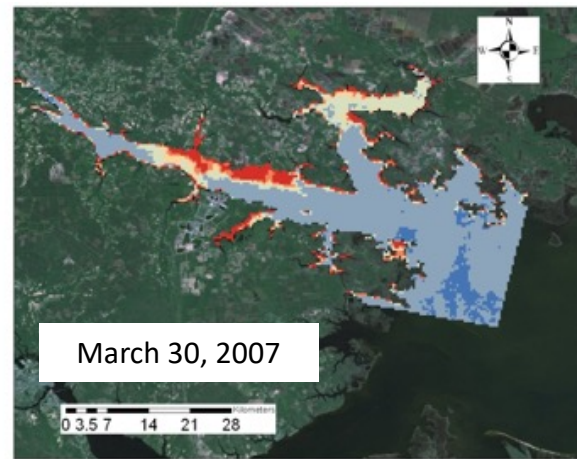
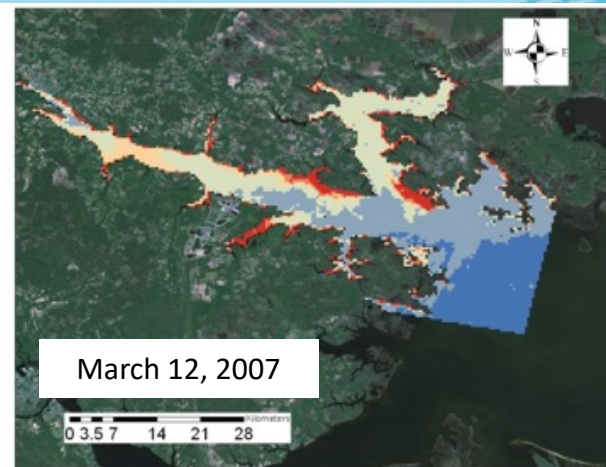
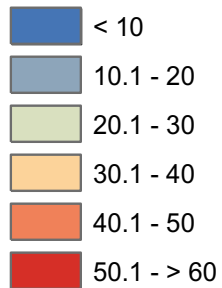
## Chlorophyll a Concentration (ug/L)

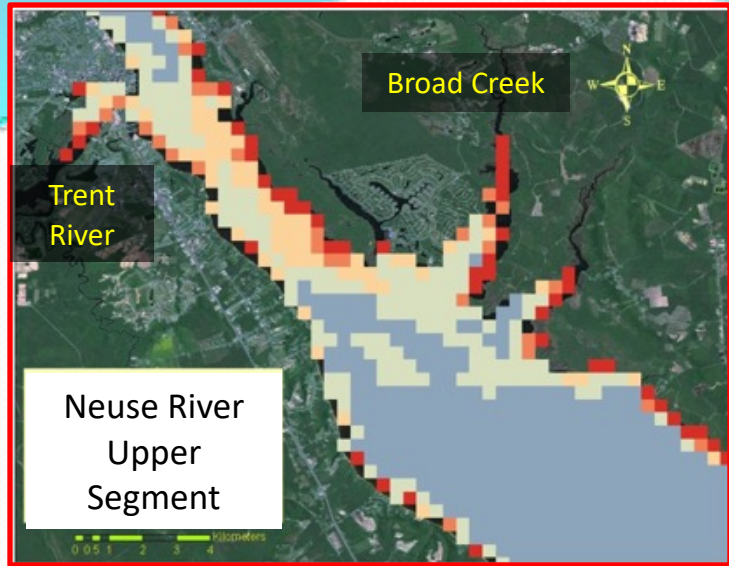


# Time Series of a TMDL Violation Tar-Pamlico River Estuary: Winter – Spring 2007

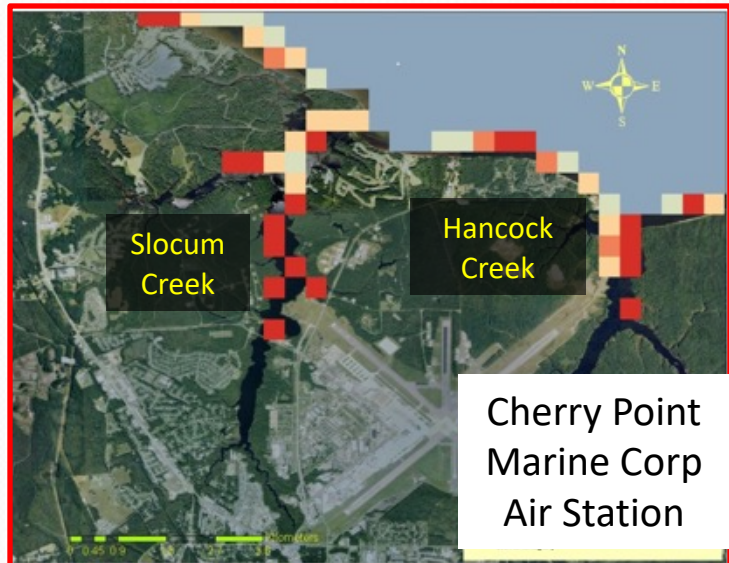
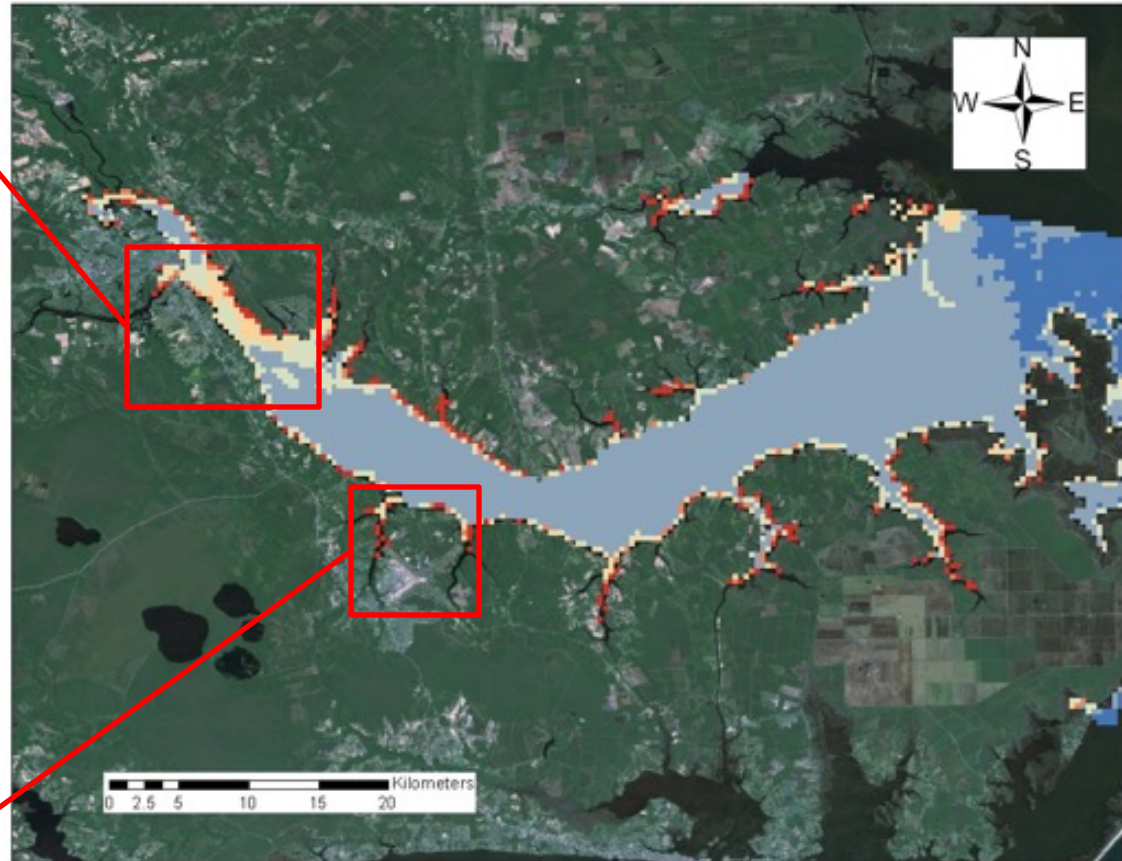


## Chlorophyll a Concentration (ug/L)

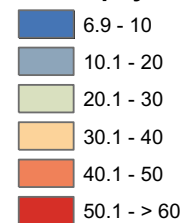




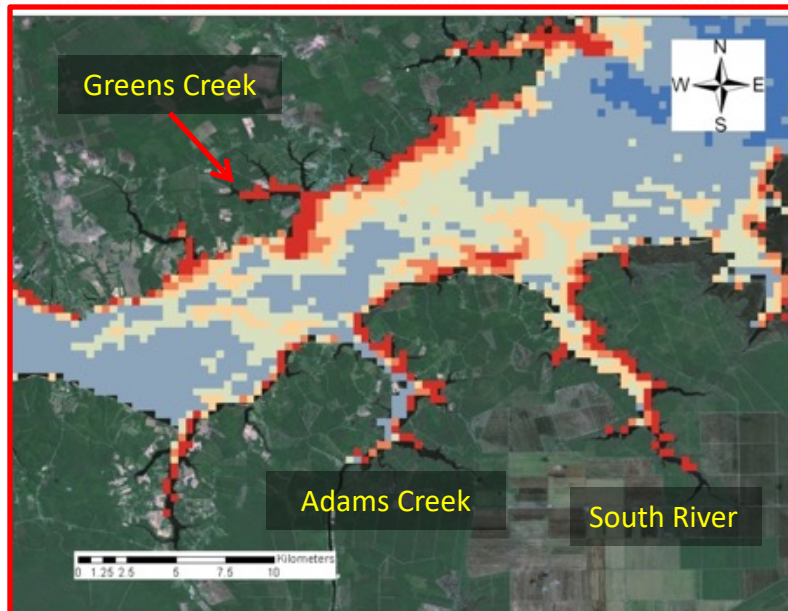
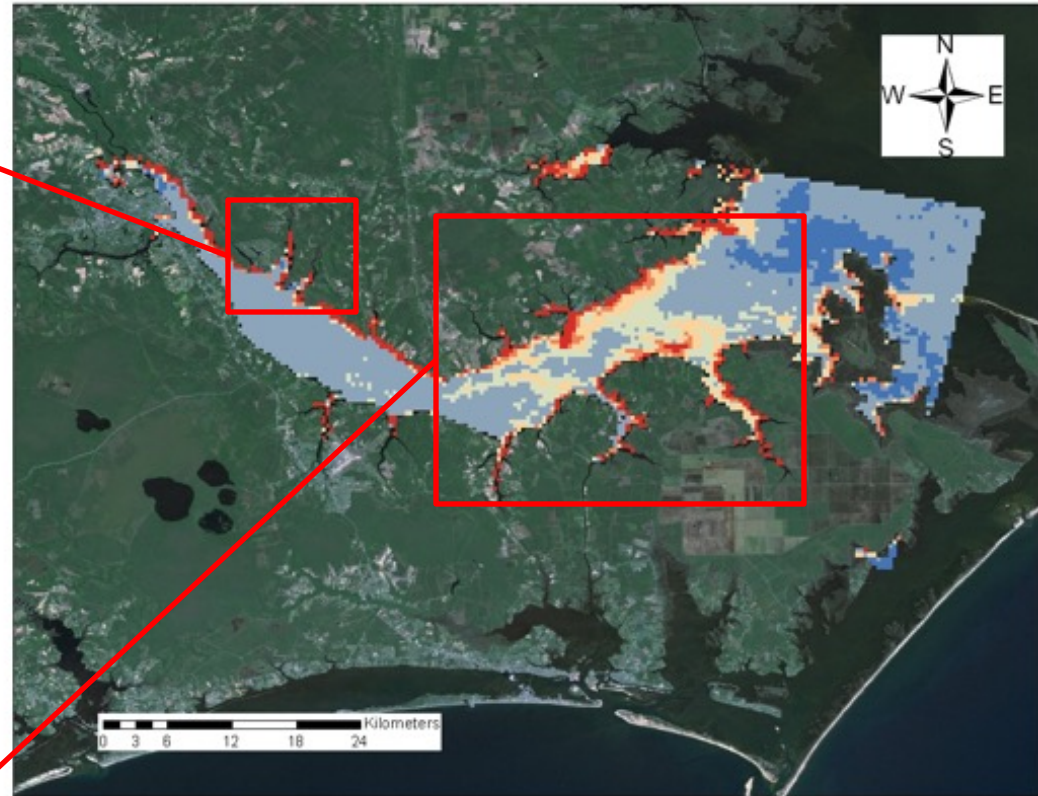
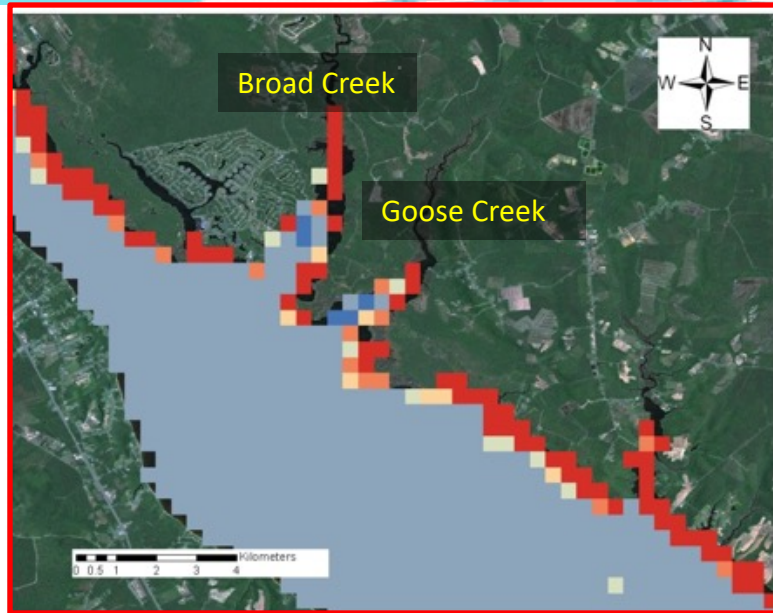
**Neuse River  
2006 Composite Image**



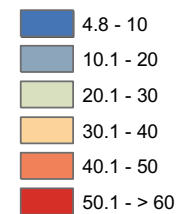
**Chlorophyll a Concentration (ug/L)**



# Neuse River 2007 Chl $\alpha$ composite image

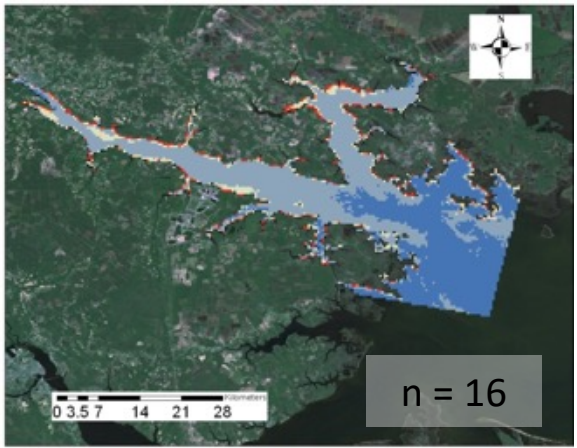


## Chlorophyll a Concentration (ug/L)

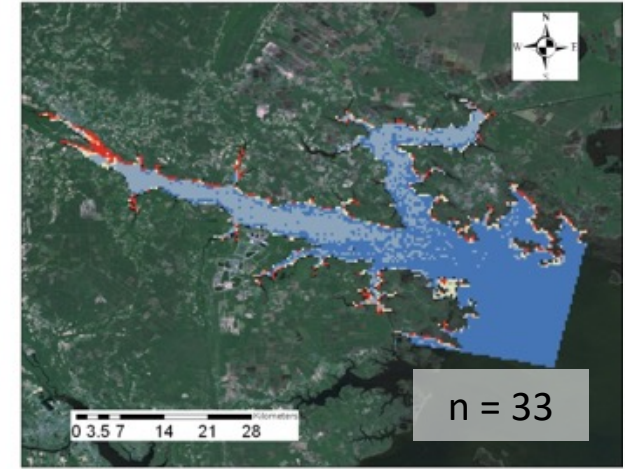
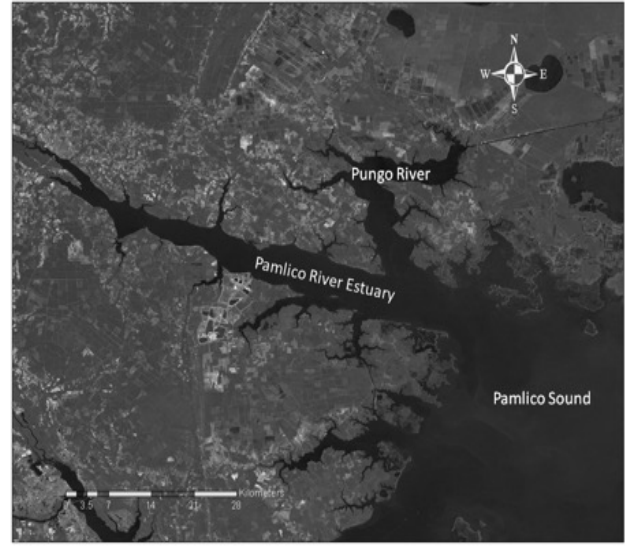




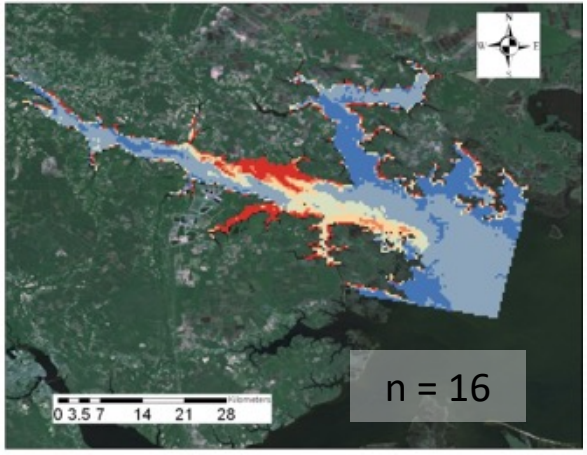
# MERIS Chl a concentrations composited on an annual basis along the Tar-Pamlico River Estuary



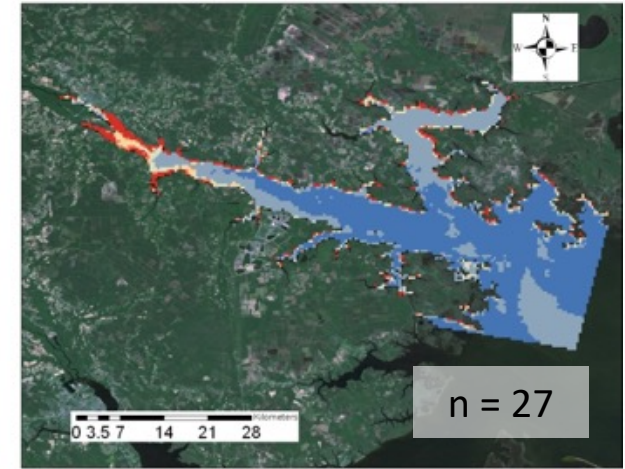
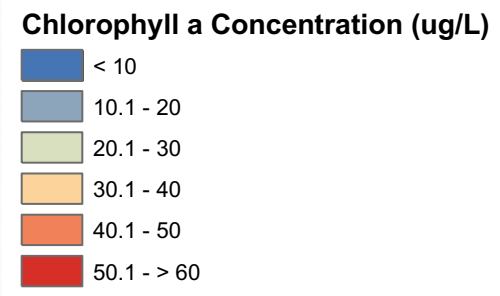
2006



2008

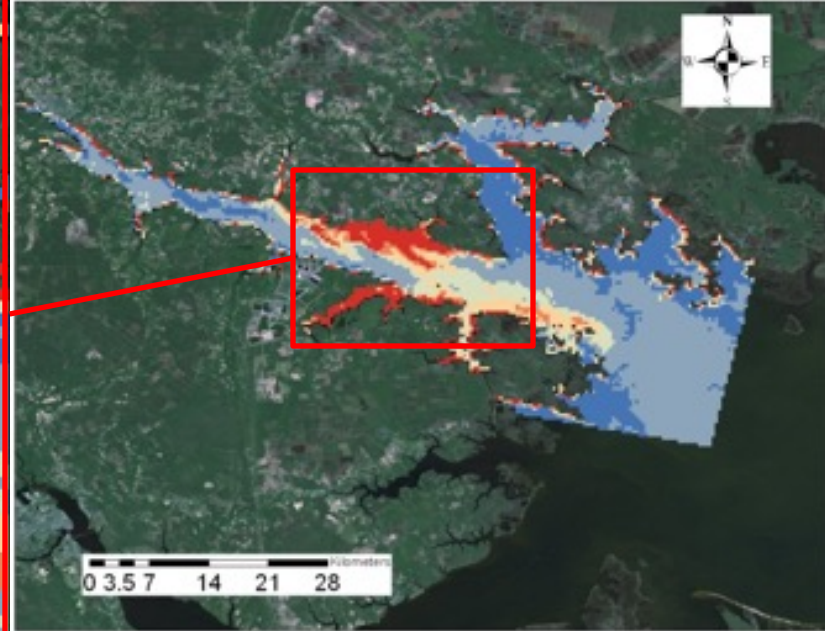
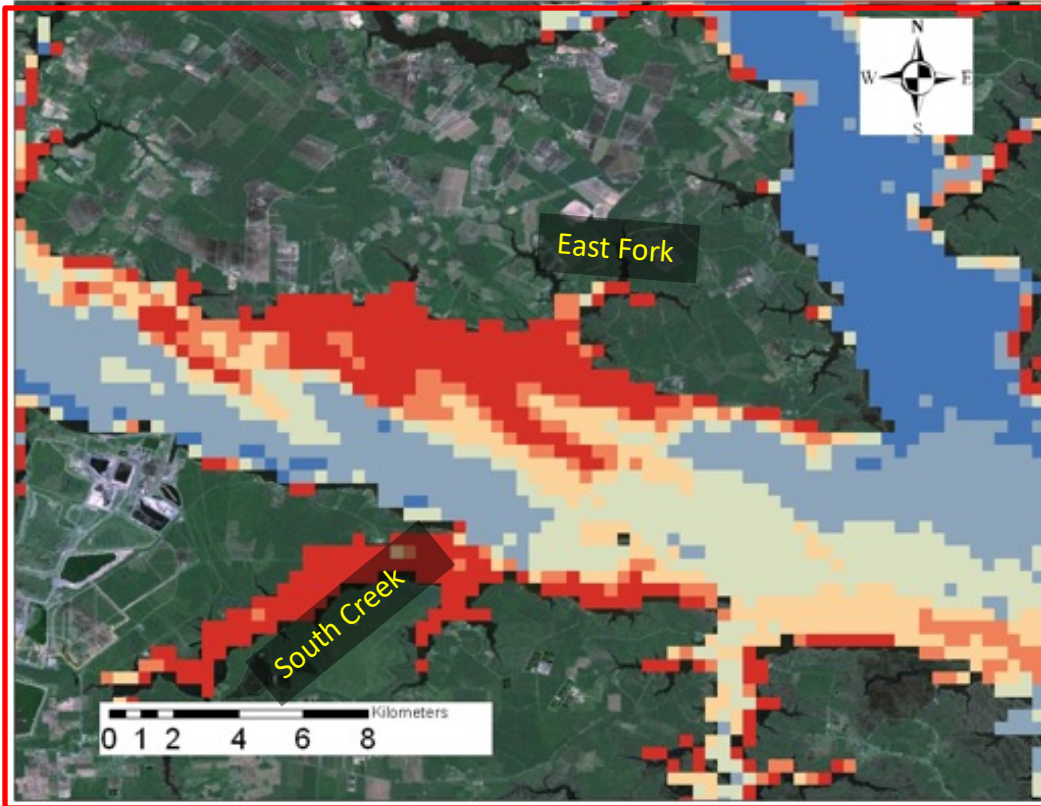


2007

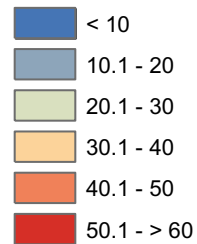


2009

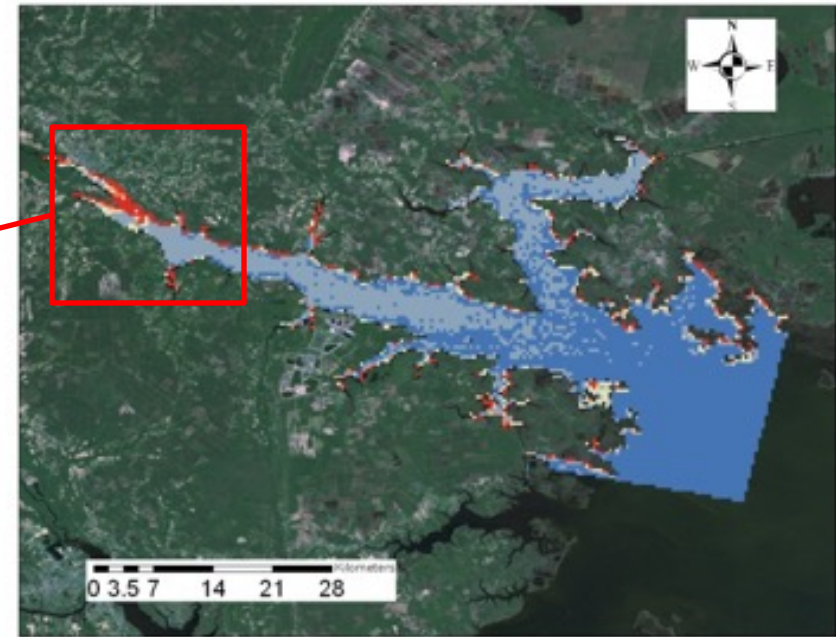
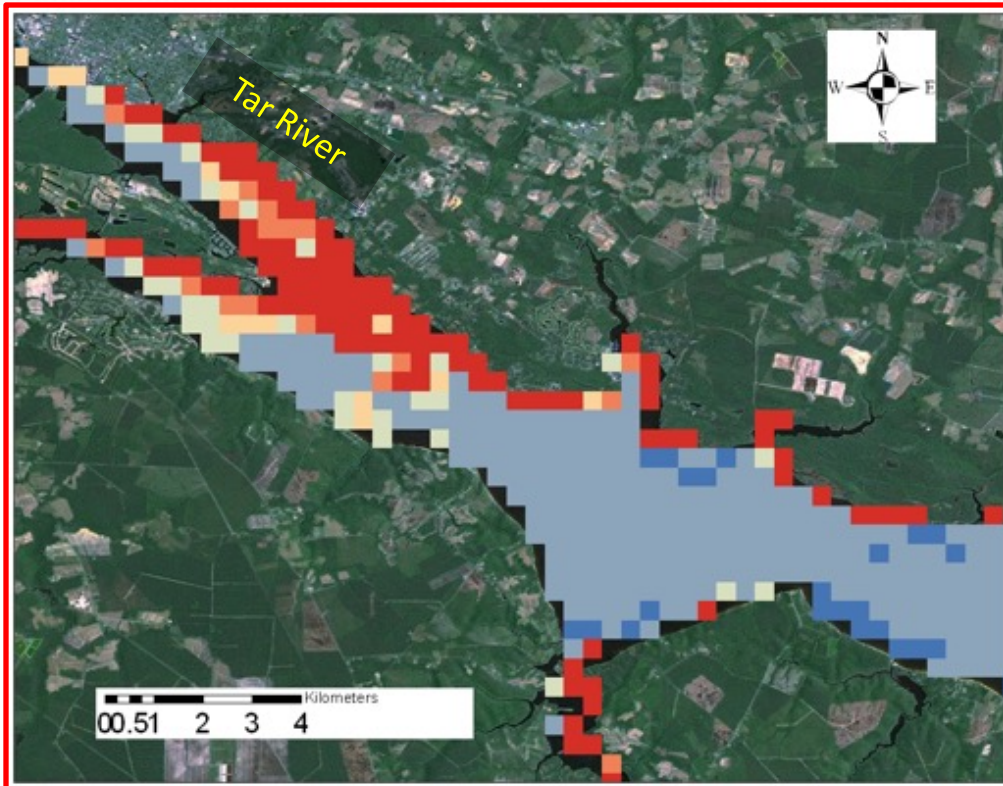
## Tar-Pamlico River 2007 Chl $\alpha$ composite image



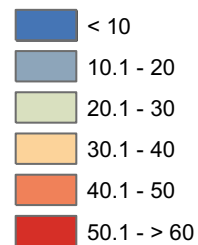
### Chlorophyll a Concentration (ug/L)

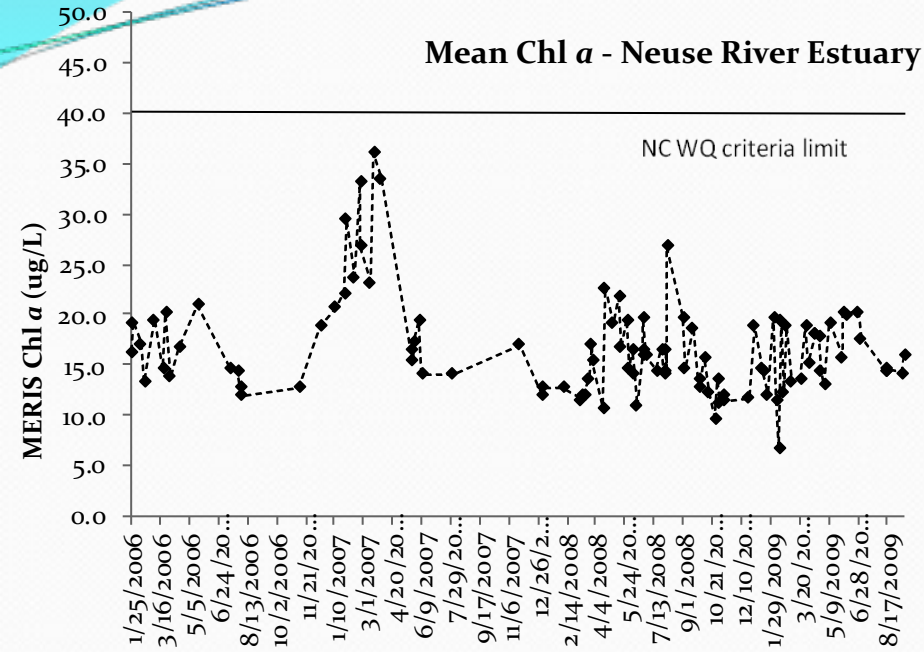


## Tar-Pamlico 2008 Chl $a$ composite image

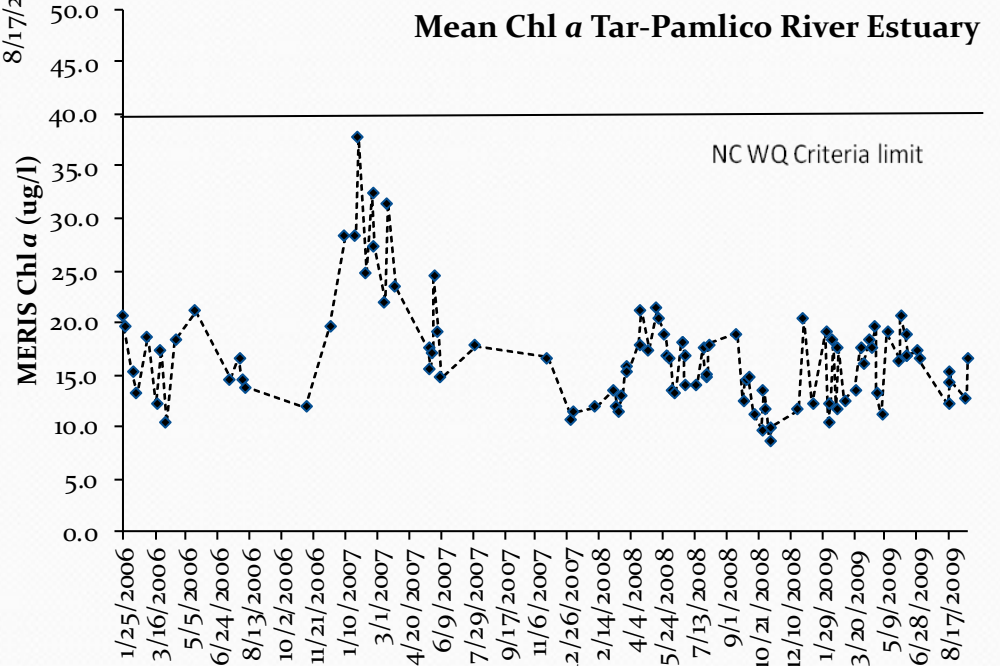


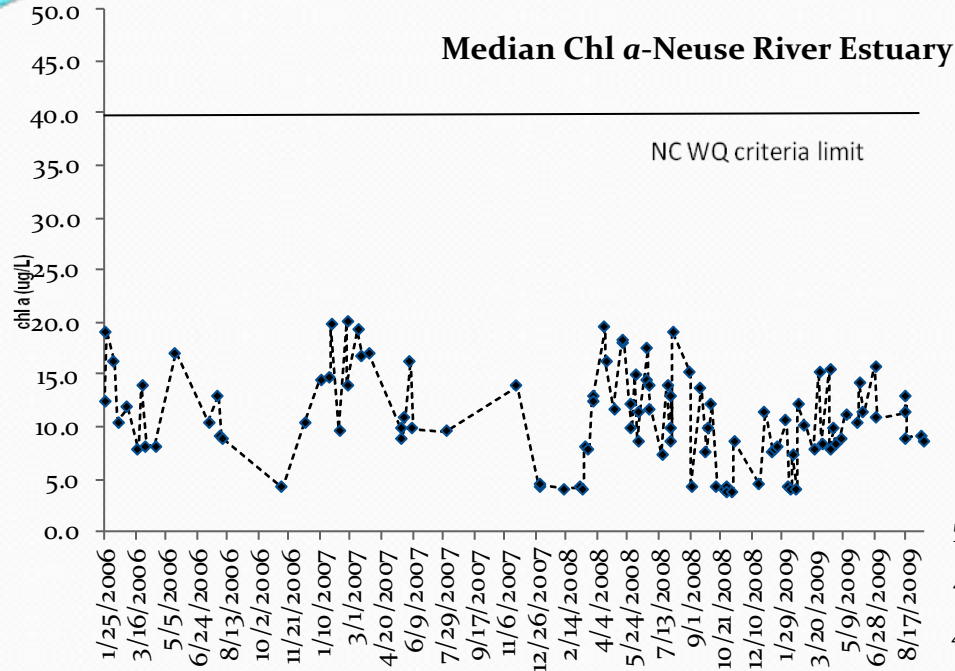
### Chlorophyll a Concentration ( $\mu\text{g/L}$ )



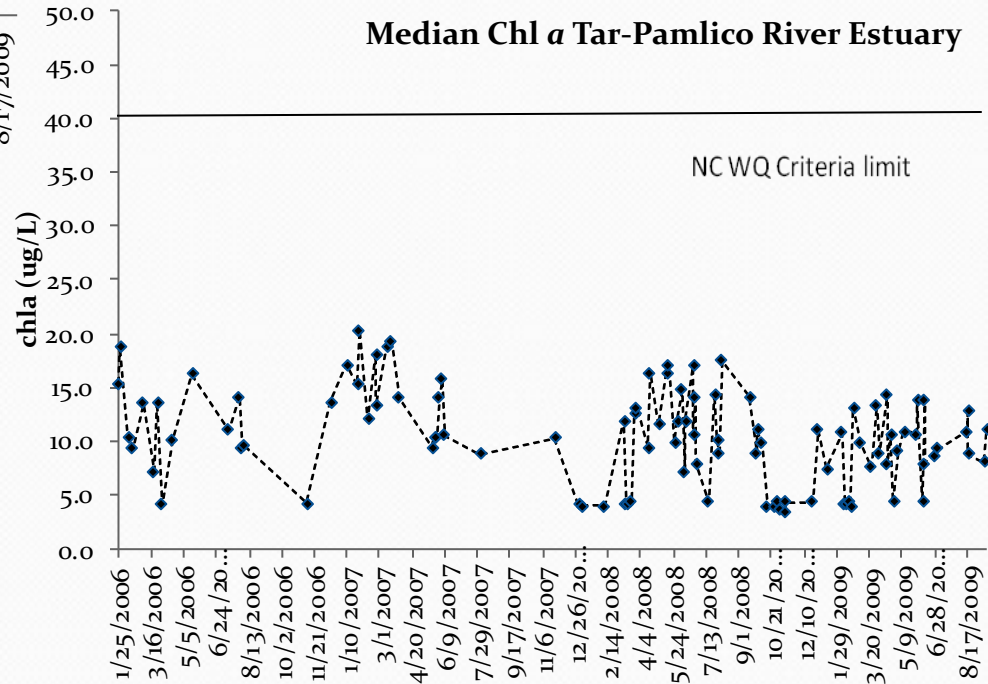


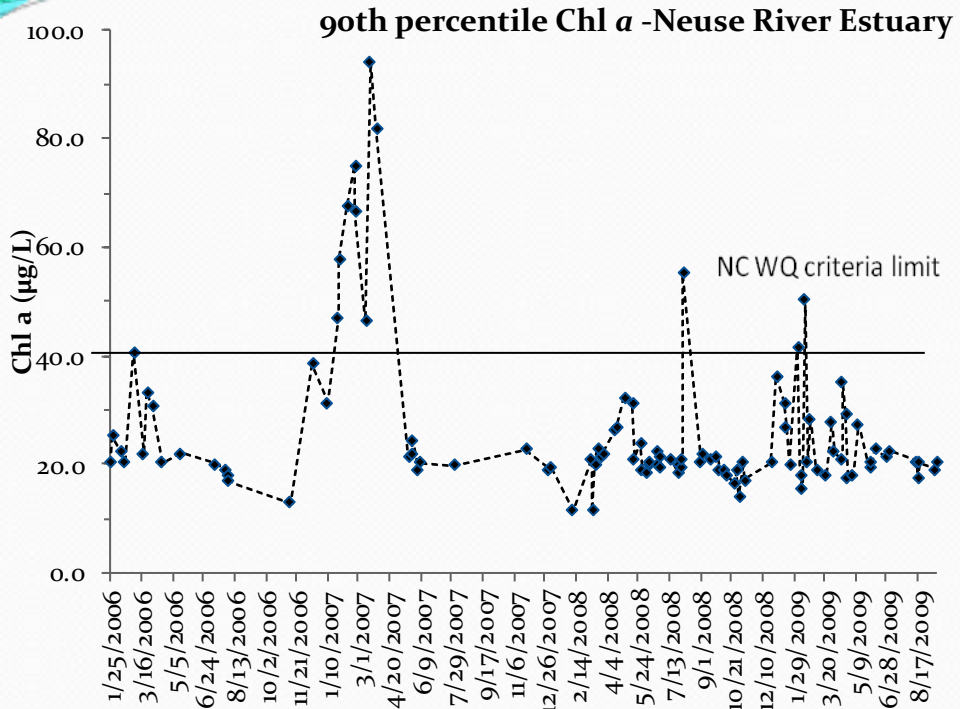
Mean chlorophyll *a* estimates:  
2006 – 2009



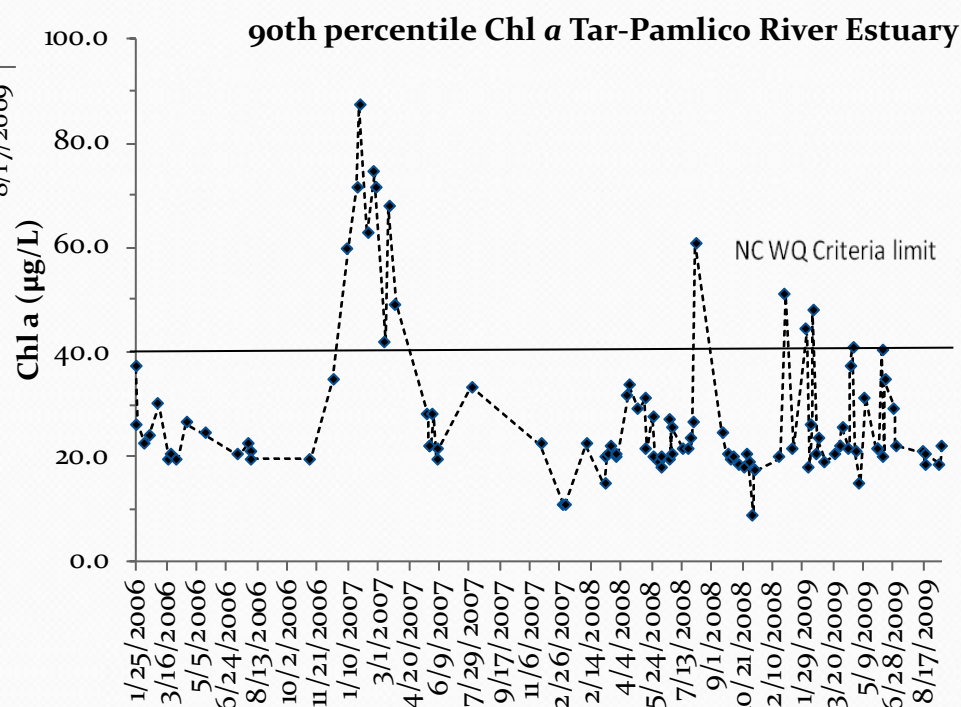


## Median chlorophyll *a* estimates: 2006 – 2009





90<sup>th</sup> percentile chlorophyll *a* estimates:  
2006 – 2009





### **3. Monitoring Needs and Recommendations**

#### **3.2. Needs and Recommendations: Phytoplankton**

##### **3.2.3. Phytoplankton Metric: Cyanobacteria Density**

See Slide presentation

# Satellite Assessment for Cyanobacteria: development of an early warning detection system

\* *Project goals* are to:

- (1) develop a standard and uniform approach for early identification of algal blooms that is useful and accessible to stakeholders of freshwater systems using the new set of satellites: Ocean Land Colour Instrument (OLCI) on Sentinel-3, Landsat-8 and applicable to future NASA missions;
- (2) develop an information dissemination system for expedient public health advisory postings; and
- (3) better understand the connections between health, economic, and environmental conditions to cyanobacteria and phytoplankton blooms.

• *Project Outcomes* are:

- (1) assess and validate the performance of algorithms for MERIS, Sentinel-2, and Landsat-8 satellites using existing *in situ* data.
- (2) formulate the framework for merging economic, ecological and human health research in developing threshold indicators that could be used to develop an aquatic and human health early warning system.





## CyAN App

- Cyanobacteria estimates derived from European Sentinel-3 satellite
- Populate database that can be accessed by Android app.

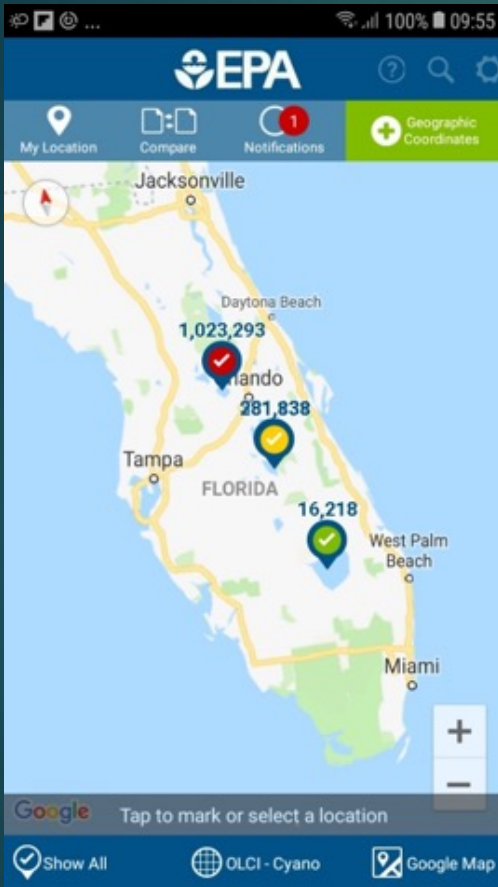
(1) View available data

(2) Zoom to targeted lake or reservoir (see stats on bloom)

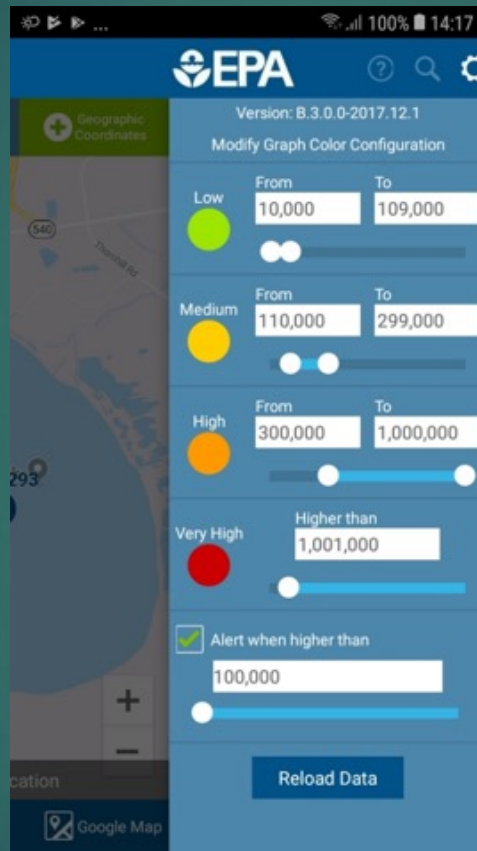
(3) View image of harmful algae bloom



# Comparisons with the App



User threshold settings



More info: selected locations to compare



Time series: shows individual location cyano response through time



Clark et al. 2015.  
*Ecological Indicators.*

[doi.org/10.1016/j.eacolind.2017.04.046](https://doi.org/10.1016/j.eacolind.2017.04.046)

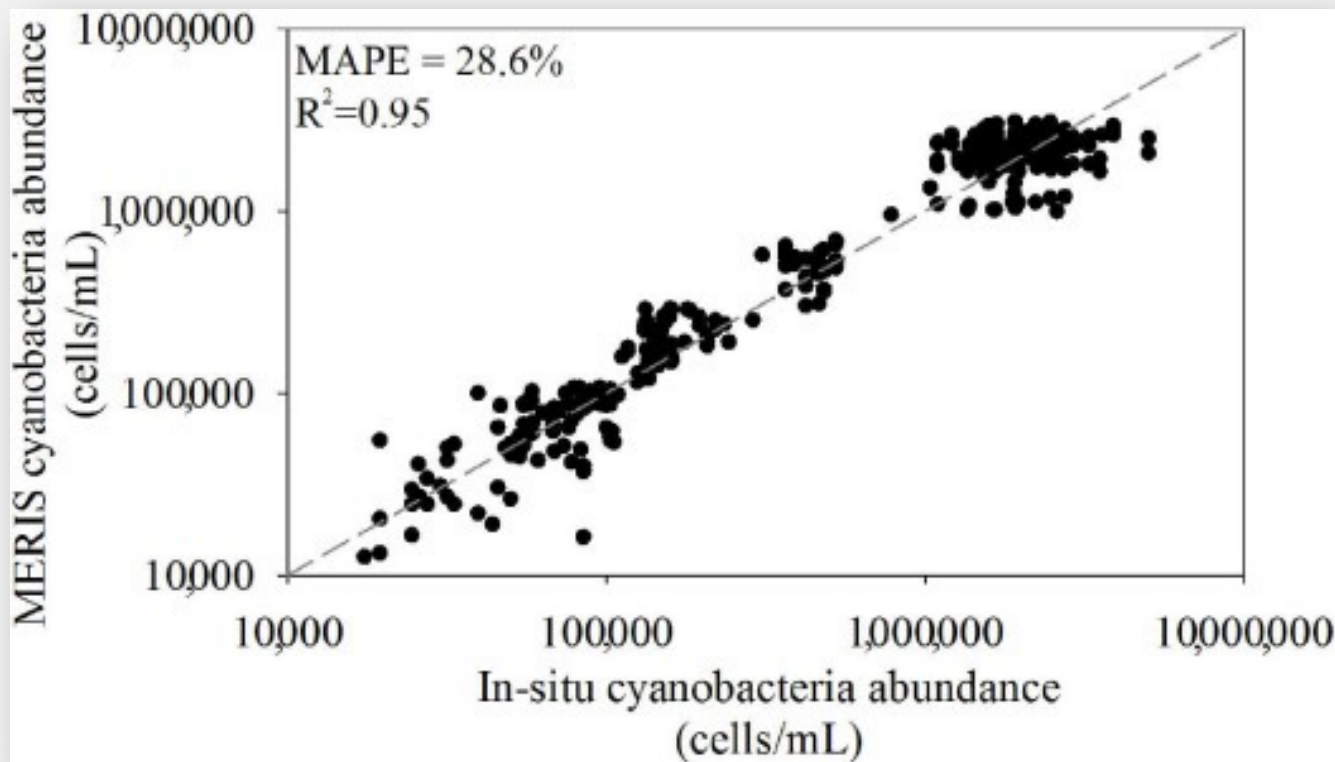


Lunetta et al. 2015.  
*Remote Sensing of Environment.*

[doi.org/10.1016/j.rse.2014.06.008](https://doi.org/10.1016/j.rse.2014.06.008)

# Initial Cyanobacteria Validation

Satellite Value



Bottle Samples

*Satellite results represent what is seen in the field.*

### 3. Monitoring Needs and Recommendations

#### 3.4.2. Water-Clarity Metric: Secchi Depth

$$K_d(\lambda) = (1 + 0.005\theta_0)a_t(\lambda) + 4.18[1 - 0.52\exp(-10.8a_t)]b_b(\lambda)$$

(Kenworthy et al., 2014)

$K_d(\lambda)$  = spectral diffuse attenuation coefficient (m<sup>-1</sup>),  
 $\theta_0$  = above-water solar angle of incidence (degrees),  
 $a_t(\lambda)$  = total absorption coefficient (m<sup>-1</sup>)  
 $b_b(\lambda)$  = backscattering coefficient (m<sup>-1</sup>)

Secchi Depth ( $Z_{SD}$ ) can be derived from light attenuation ( $K_d$ ) using the following relationship:

$$K_d(490) = 1.45/Z_{SD} \text{ (Lee et al., 2018)}$$

#### 3.4.3. Water-Clarity Metric: Turbidity (TSS)

$$\text{TSS (gm}^{-3}\text{)} = A\rho * \pi * R_{rs}(\lambda) / (1 - \pi * R_{rs} / C\rho)$$

$R_{rs}(665)$  = Remote sensing reflectance at 665 nm

$$C\rho = 17.28 * 10^{-2}$$

$$A\rho = 355.85$$

(Nechad et al., 2010)

### **3. Monitoring Needs and Recommendations**

#### **3.5.1. Physical-Chemical Metric: Water Temperature**

Surface water temperatures can be derived as a product from atmospherically corrected Landsat 8/9 satellite imagery. During this process, the ACOLITE atmospheric correction program calculates the at-sensor brightness temperature from the Landsat 8/9 Operational Land Imager (OLI)/Thermal Infrared Sensor (TIRS) instruments. The spatial resolution of these data will be 30 m

#### **3.5.2. Physical-Chemical Metric: Estuarine Salinity**

**See Slide presentation**

# **Temporal and Spatial Variation in Fish Nursery Areas of the Albemarle-Pamlico Sound, NC Estuarine System Derived from MERIS**

**Darryl Keith**

**USEPA National Health and Environmental Effects Research Laboratory  
Atlantic Ecology Division  
Narragansett, RI**

**Ross Lunetta**

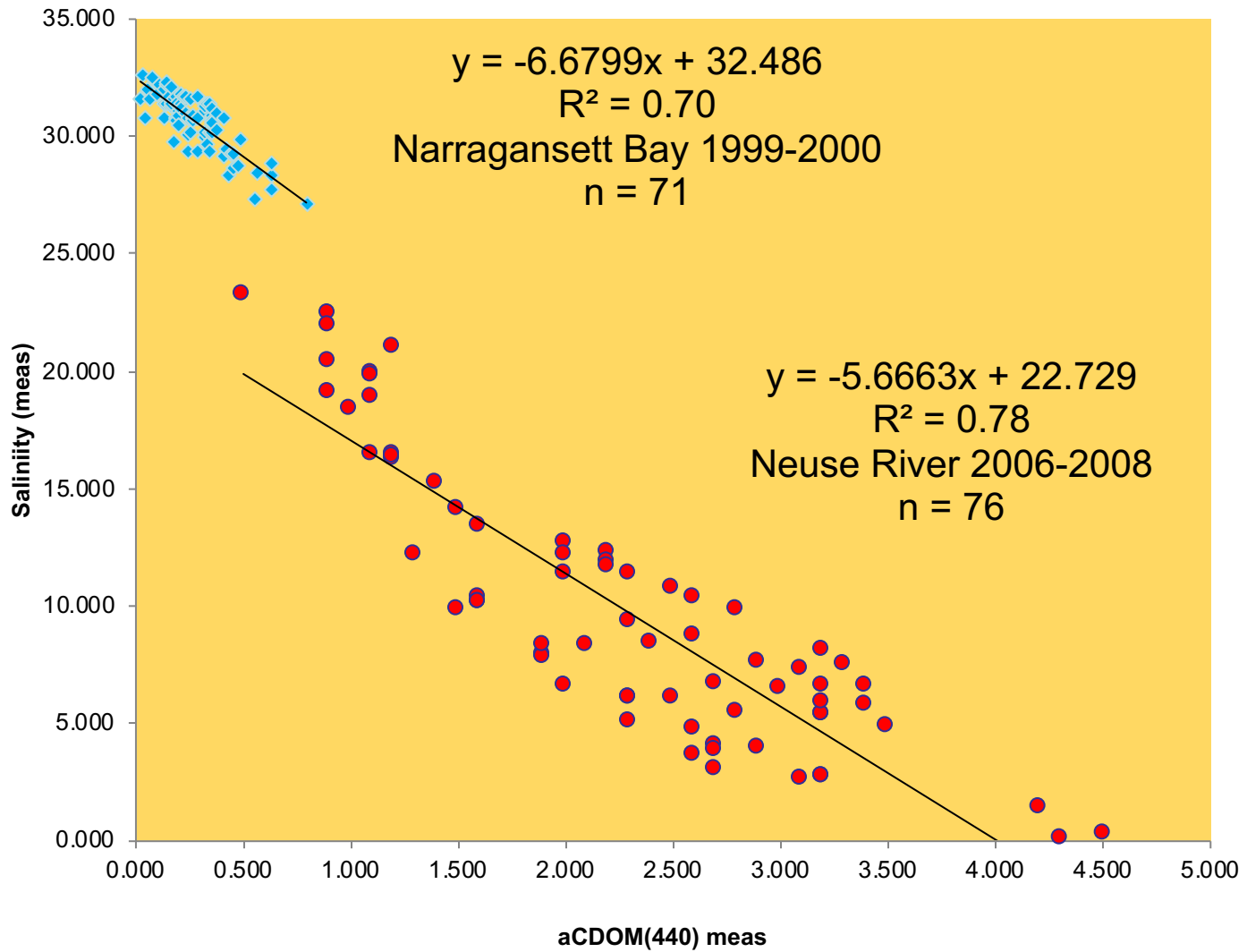
**USEPA National Exposure Research Laboratory  
Environmental Science Division  
Research Triangle Park, NC**

**Anne Kuhn and Jeff Hollister**

**USEPA National Health and Environmental Effects Research Laboratory  
Atlantic Ecology Division  
Narragansett, RI**

## Research Objectives

- Create a salinity algorithm for estuarine and coastal waters from the inverse relationship between measured CDOM absorption at 440 nm and salinity.
- Map the temporal and spatial distribution of salinity in Albemarle-Pamlico Sound system as derived from the ESA MERIS full resolution (300 m) CDOM (443 nm) data product.
- Using NC Marine Fisheries Commission (NCMFC) categories, map the spatial distribution of nursery areas from a MERIS August 2006 image.

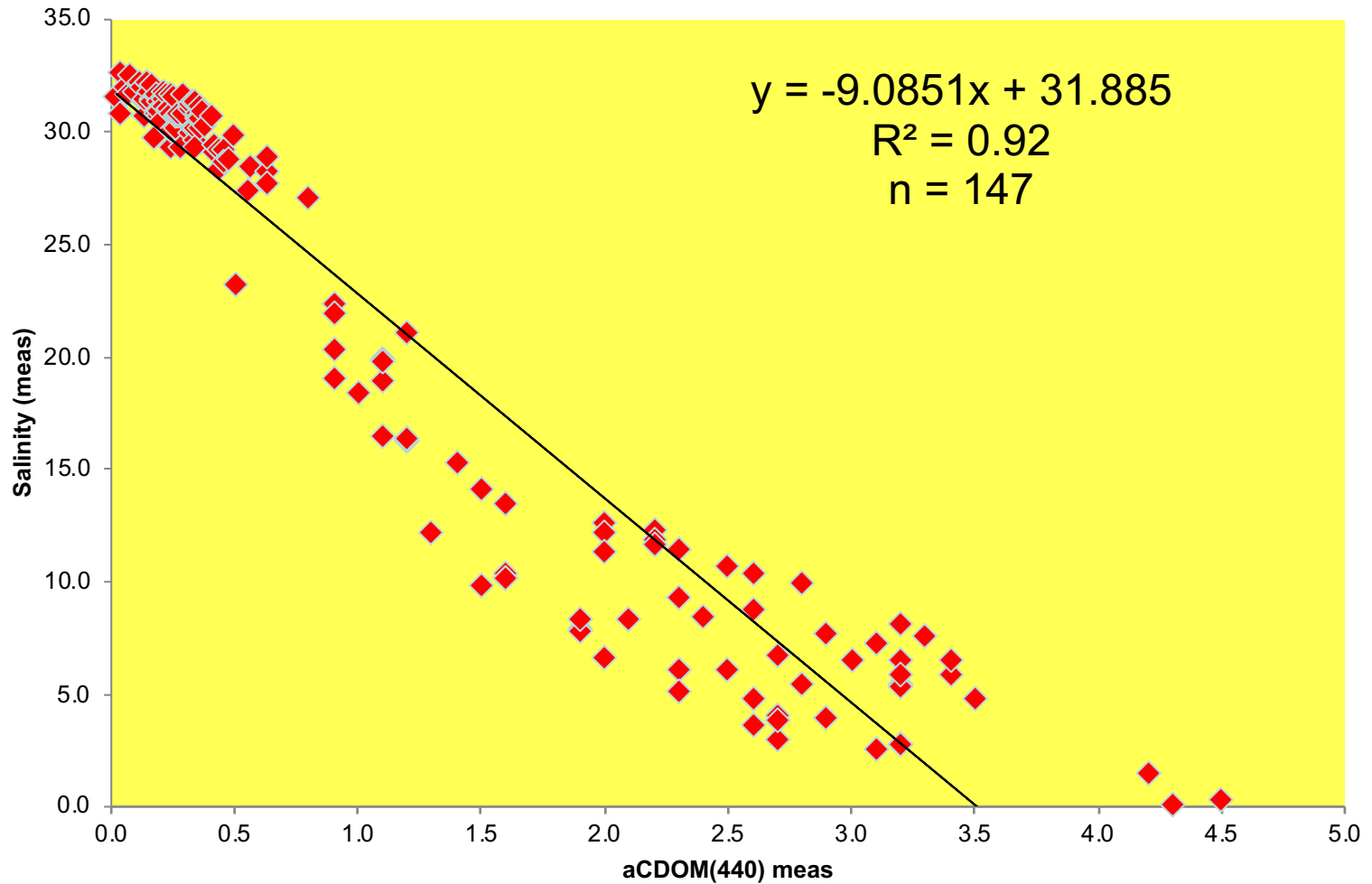


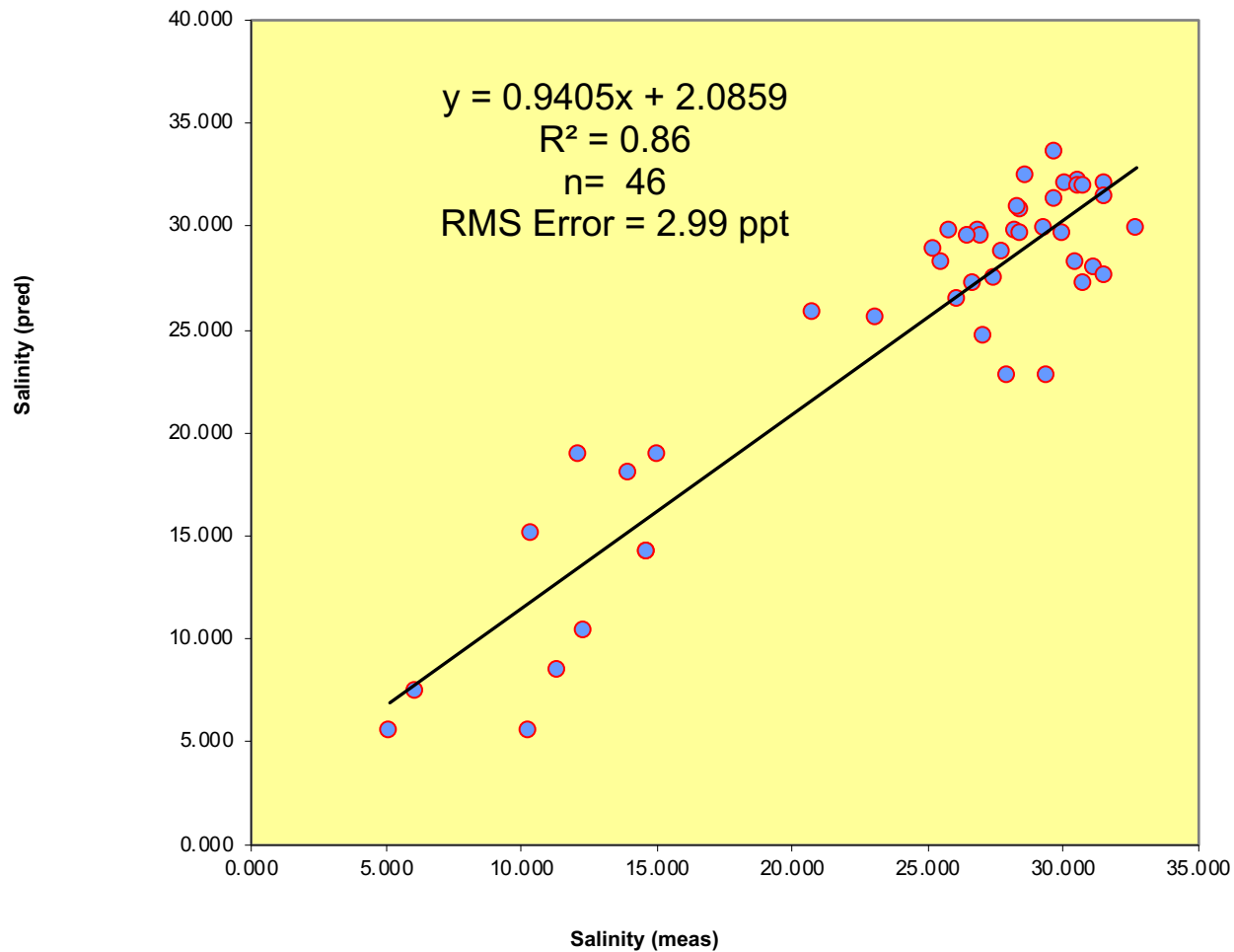
◆ Narragansett Bay Estuary

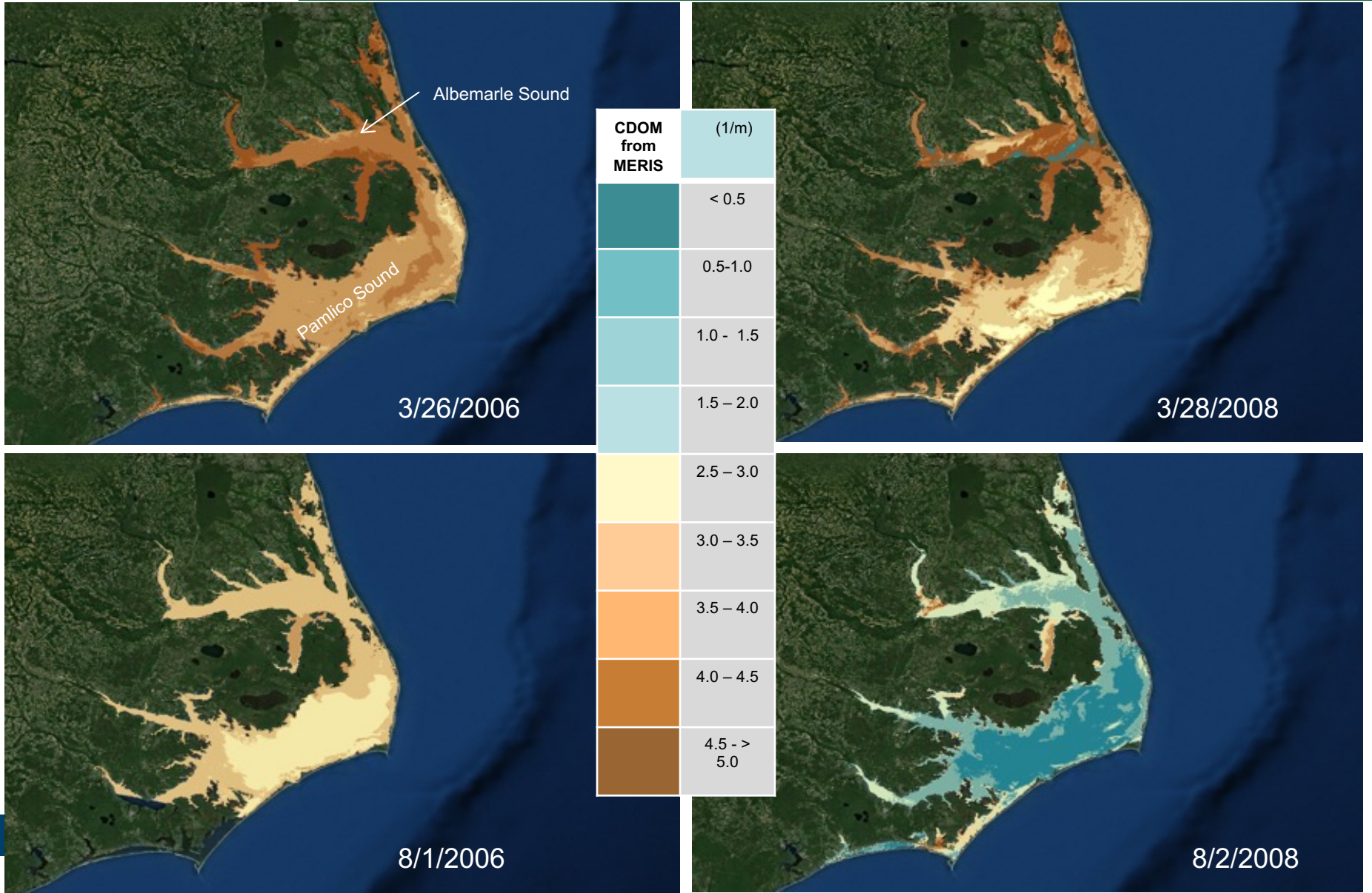
● Neuse River/Pamlico Sound Estuary

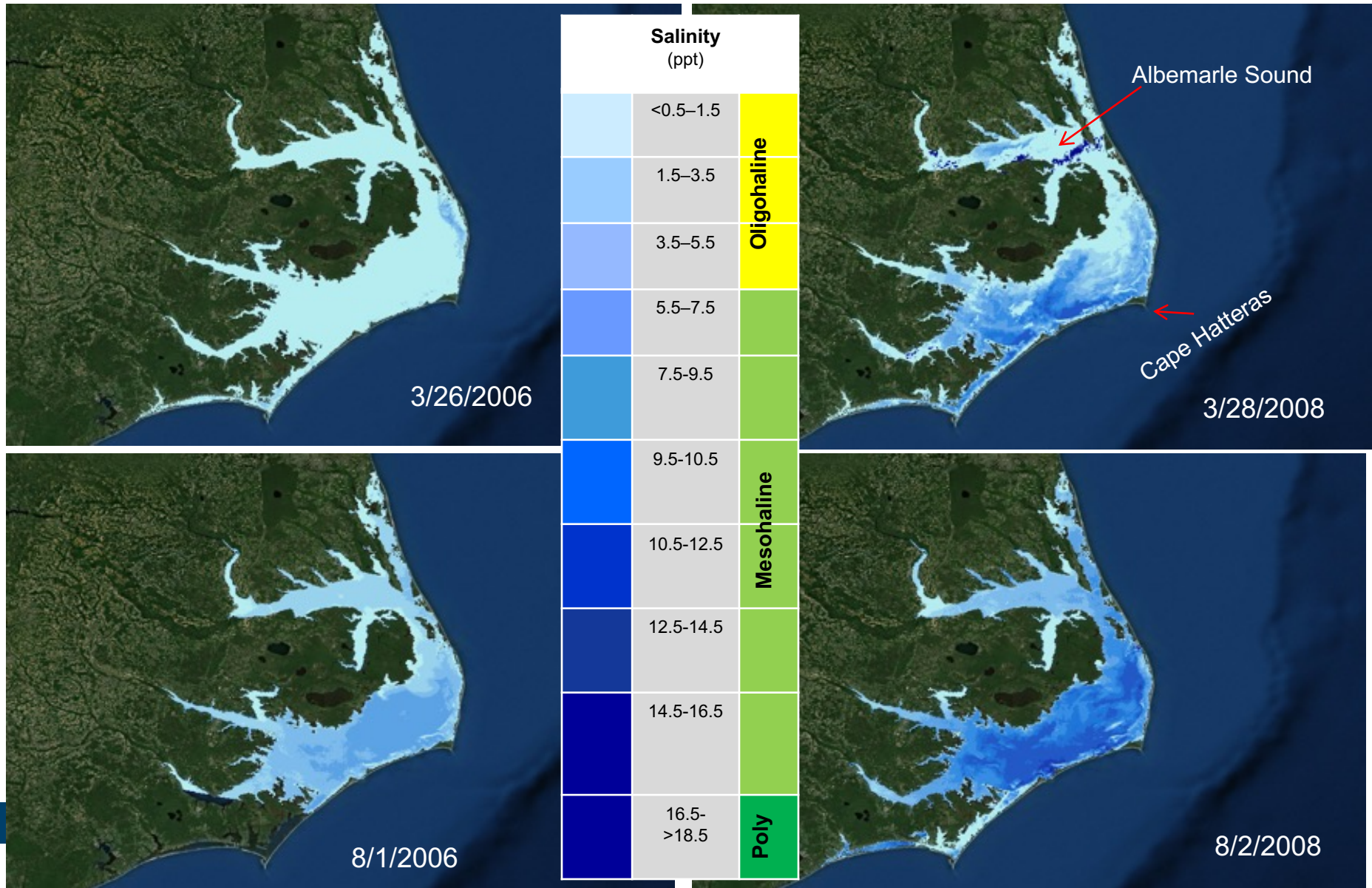


## General Salinity Model









# Contact

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Atlantic Coastal Environmental Sciences Division

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Download the CyAN app today:

[epa.gov/water-research/CyANapp](https://epa.gov/water-research/CyANapp)

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