

# Remote sensing of water clarity in the Chesapeake Bay: Advantages and disadvantages

STAC Workshop, April 22, 2022

*Advancing Monitoring Approaches to Enhance Tidal Chesapeake Bay Habitat Assessment on Monitoring Water Clarity and Chl-a*

Jessie Turner



Postdoctoral Research Associate  
University of Connecticut

Visiting Postdoc  
Virginia Institute of Marine Science

Contact: [jturner@uconn.edu](mailto:jturner@uconn.edu)

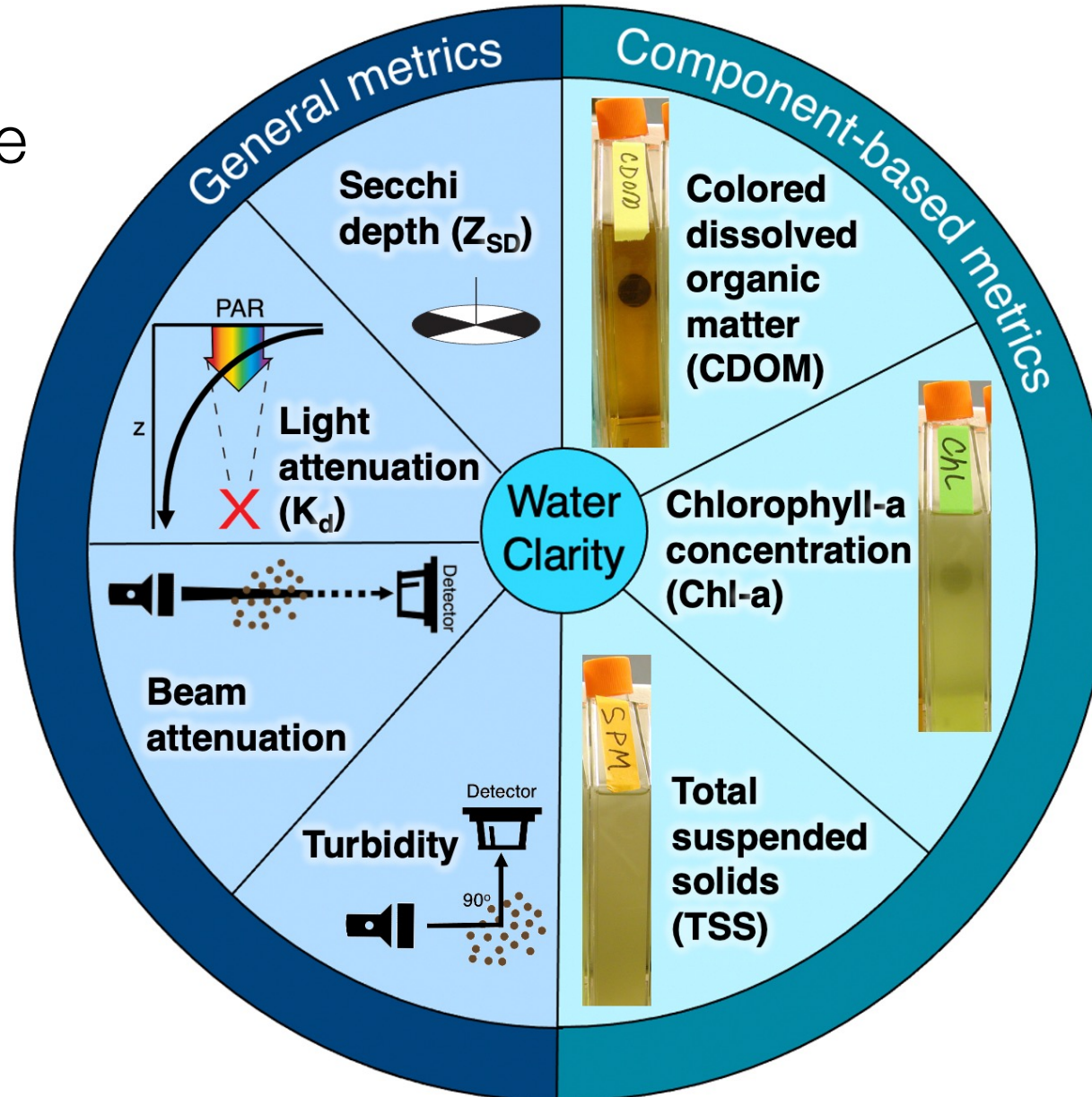


# Water Clarity



# Water Clarity

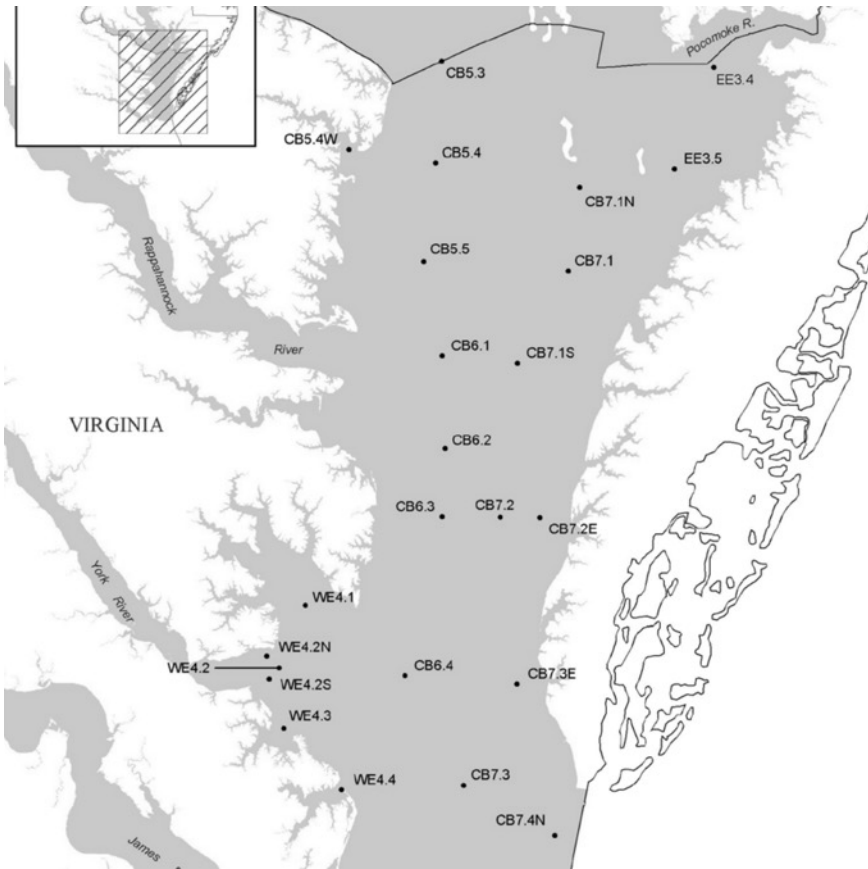
Defined by how we measure clarity in the field...



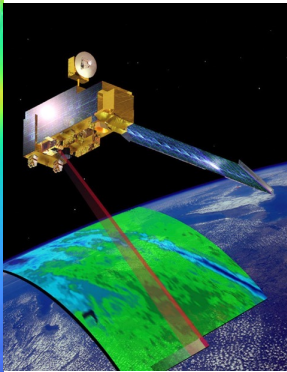
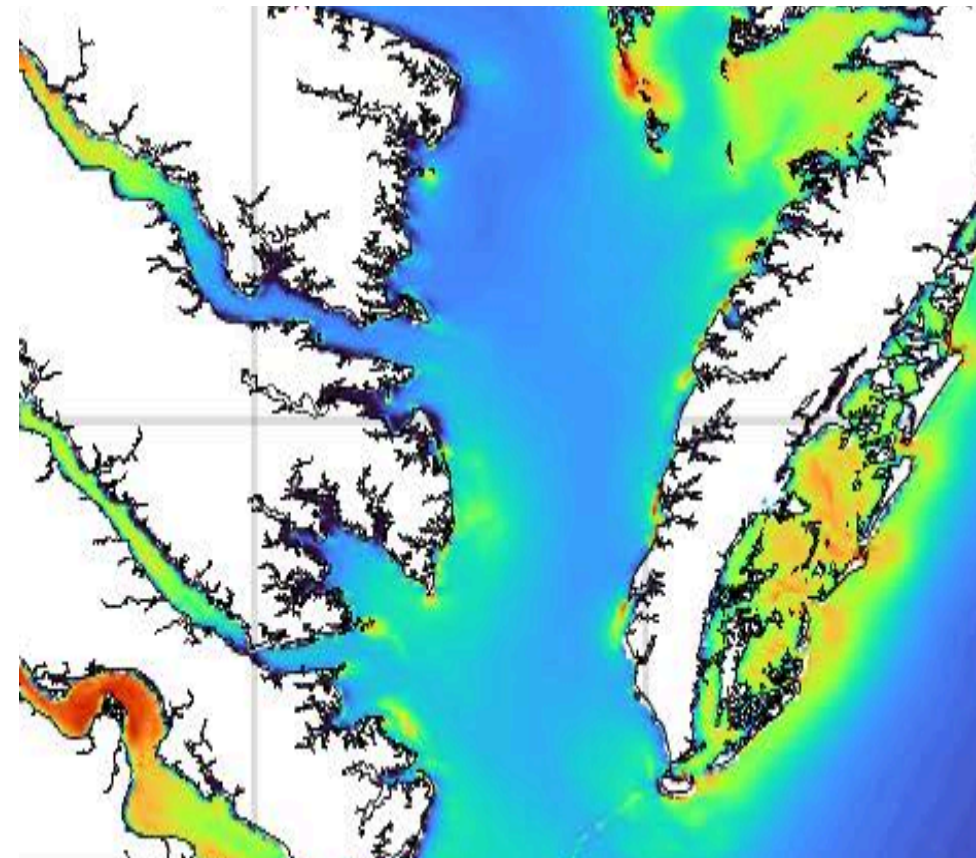
...and by which components block the light.

# Satellite remote sensing adds coverage

## Mainstem cruise stations

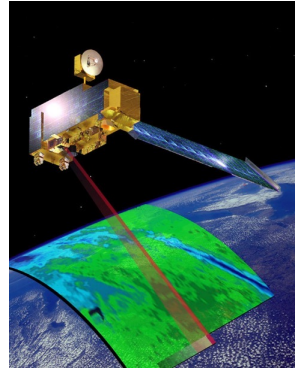


## Satellite red reflectance



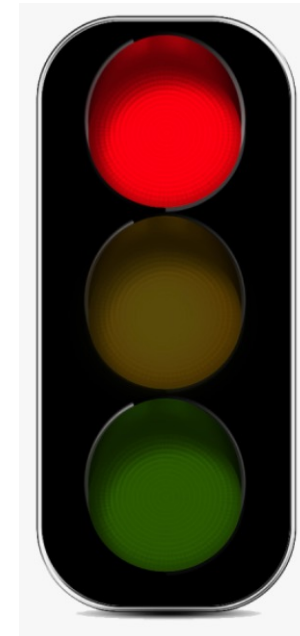
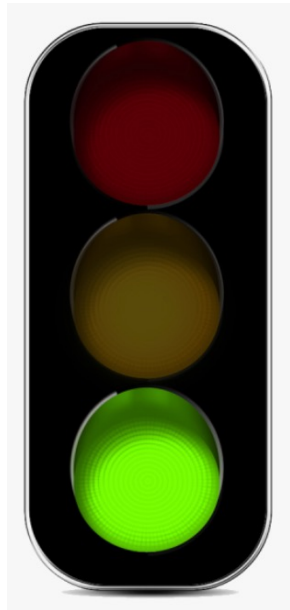
Long-term mean red reflectance at 645 nm ( $\text{sr}^{-1}$ )  
MODIS-Aqua Rrs (645) at 250m spatial resolution

# Conflicting Opinions

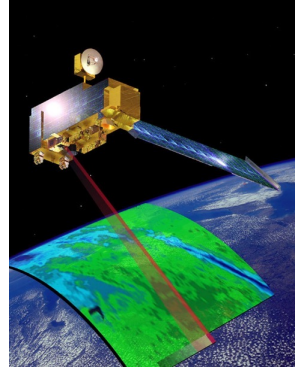


You should use satellite data!  
Great coverage! Long time series!  
Freely available!

You can't use satellite data for  
the Bay, it's optically complex!



# Conflicting Opinions



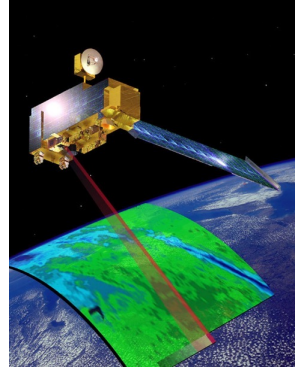
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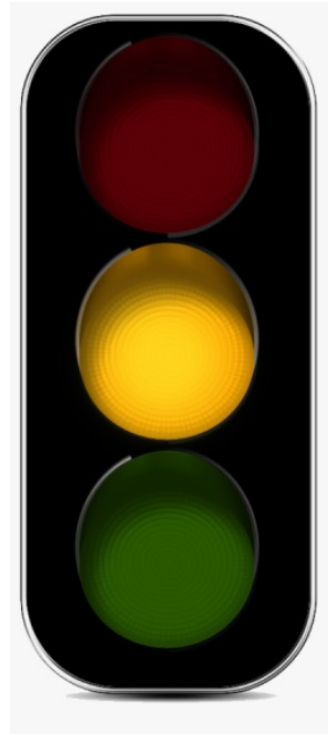
> 1 component blocks out light:  
CDOM, phytoplankton, and sediments all make the water appear greener and/or browner from space



# Conflicting Opinions



Use satellite data, but know the pros and cons of what you're using.





敢比电商

敢比电商

省心价  
1398

省心价  
368 98



HUAWEI

手机 Mobile  
联想四核5英寸

Which products to choose?  
What does it all mean?

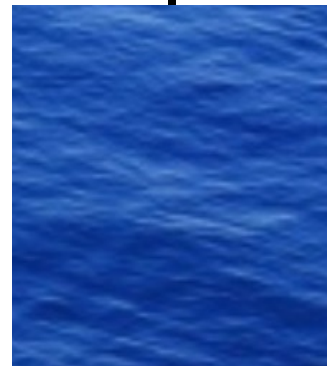




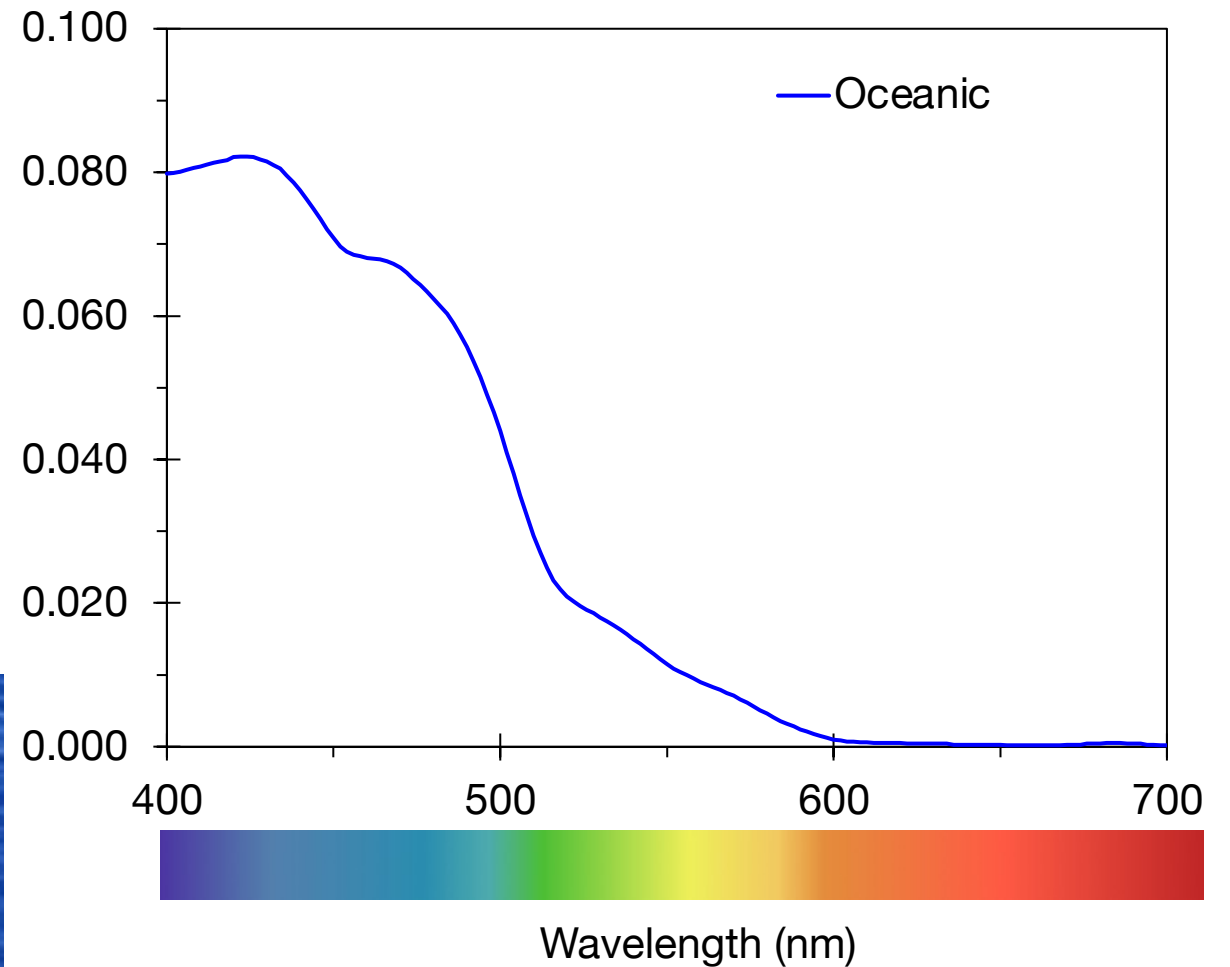
# Remote Sensing Reflectance (Rrs)



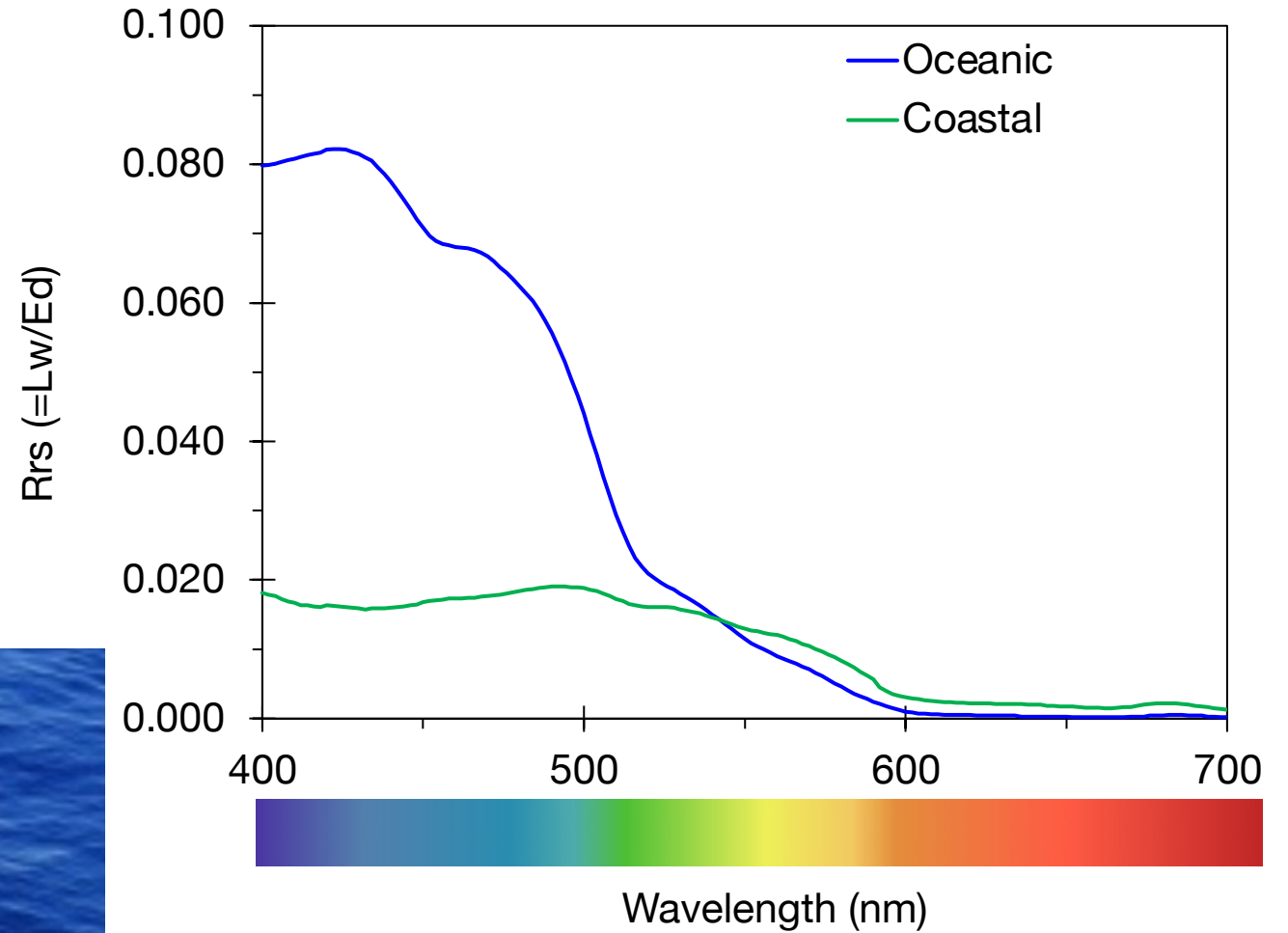
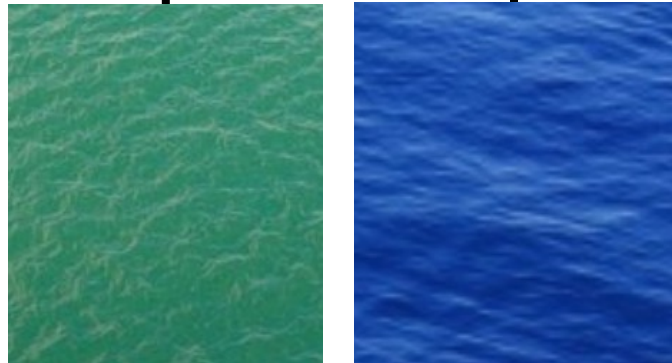
Satellites see  
COLOR, in terms  
of Reflectance at  
different  
wavelengths



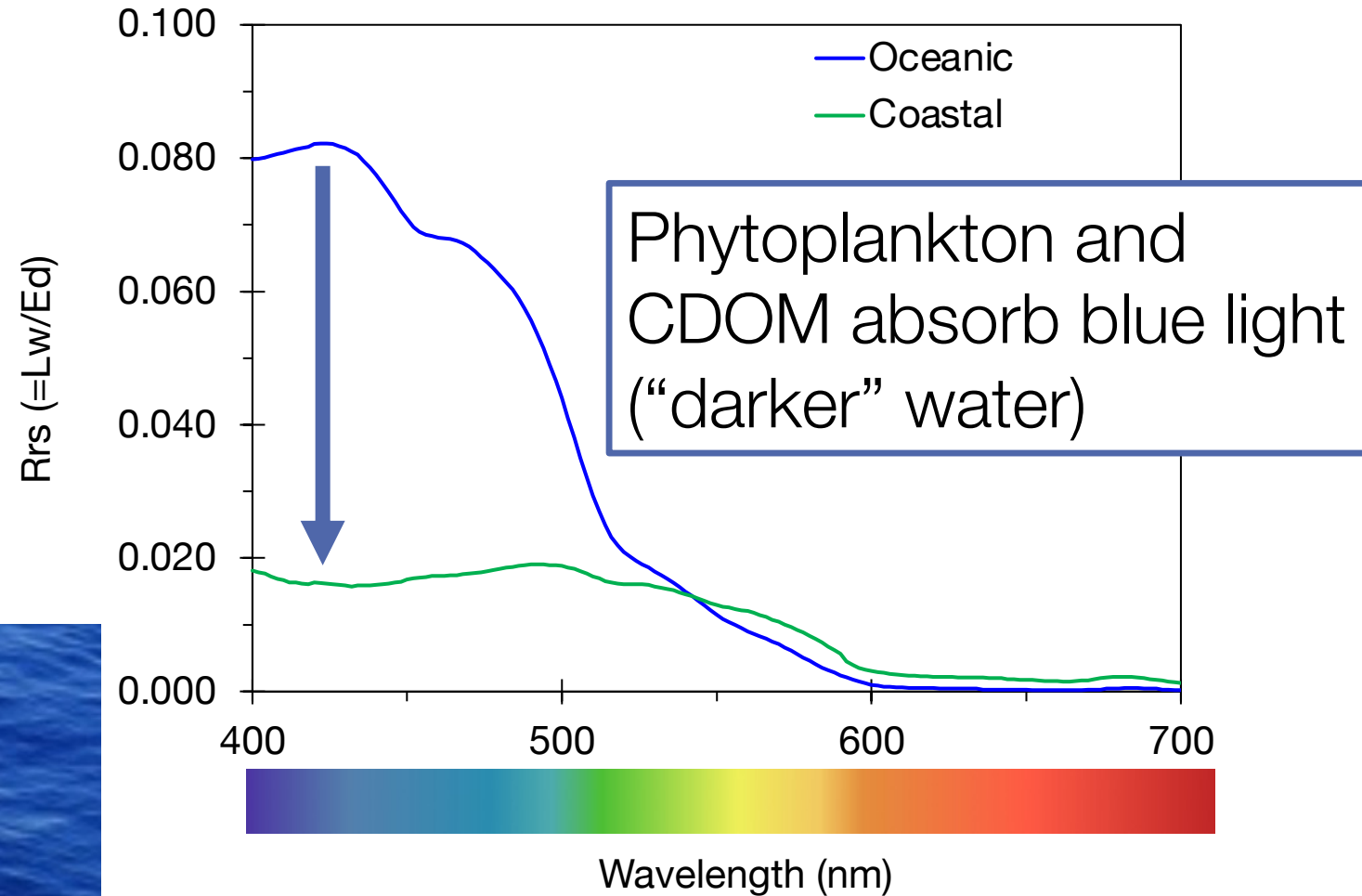
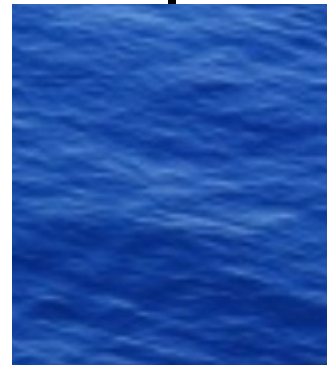
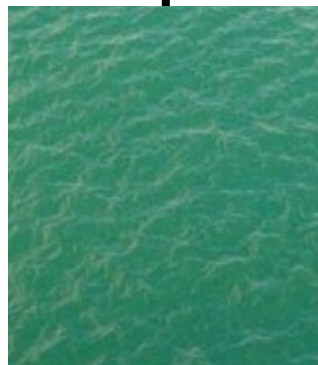
Rrs (=Lw/Ed)



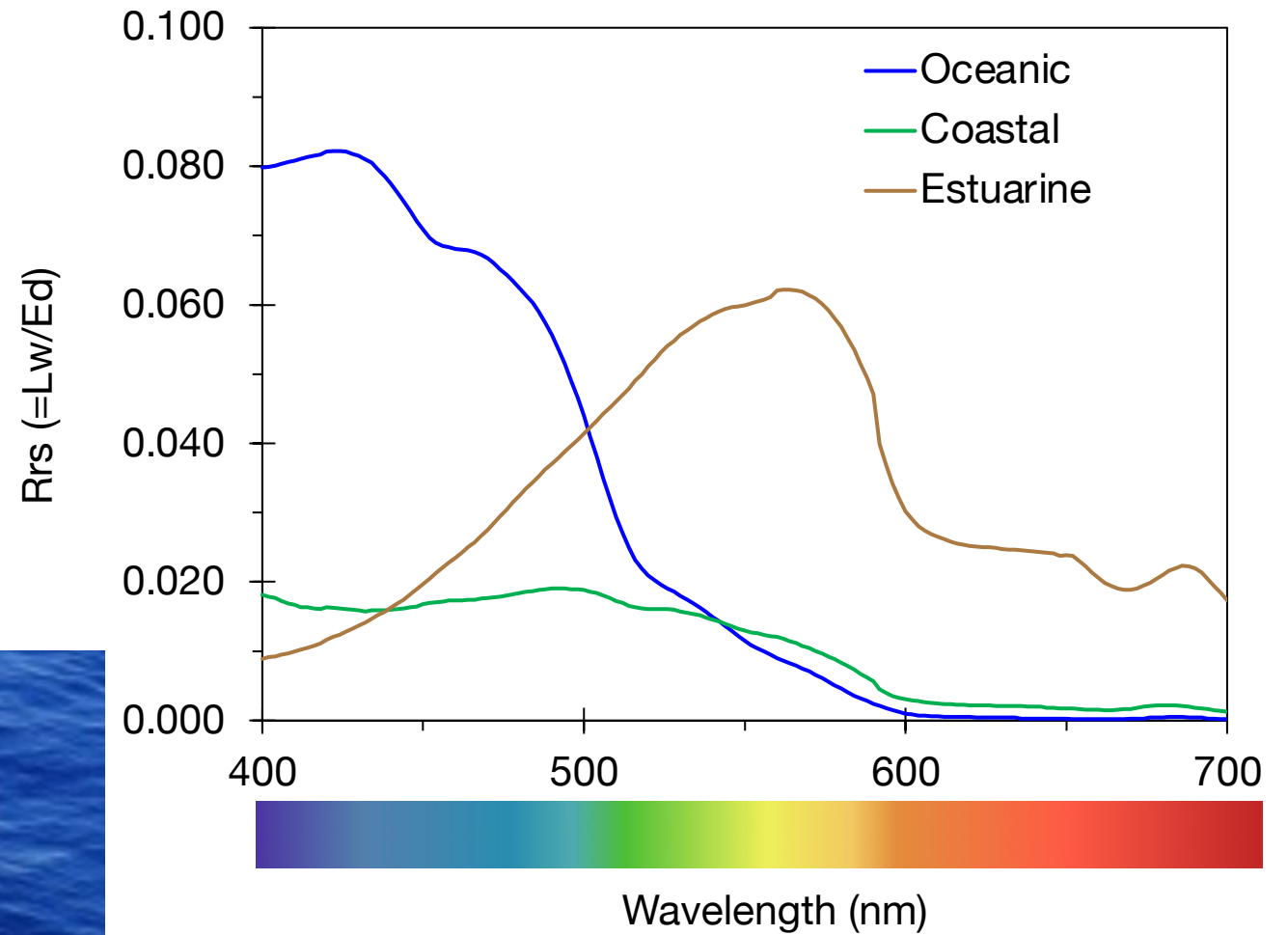
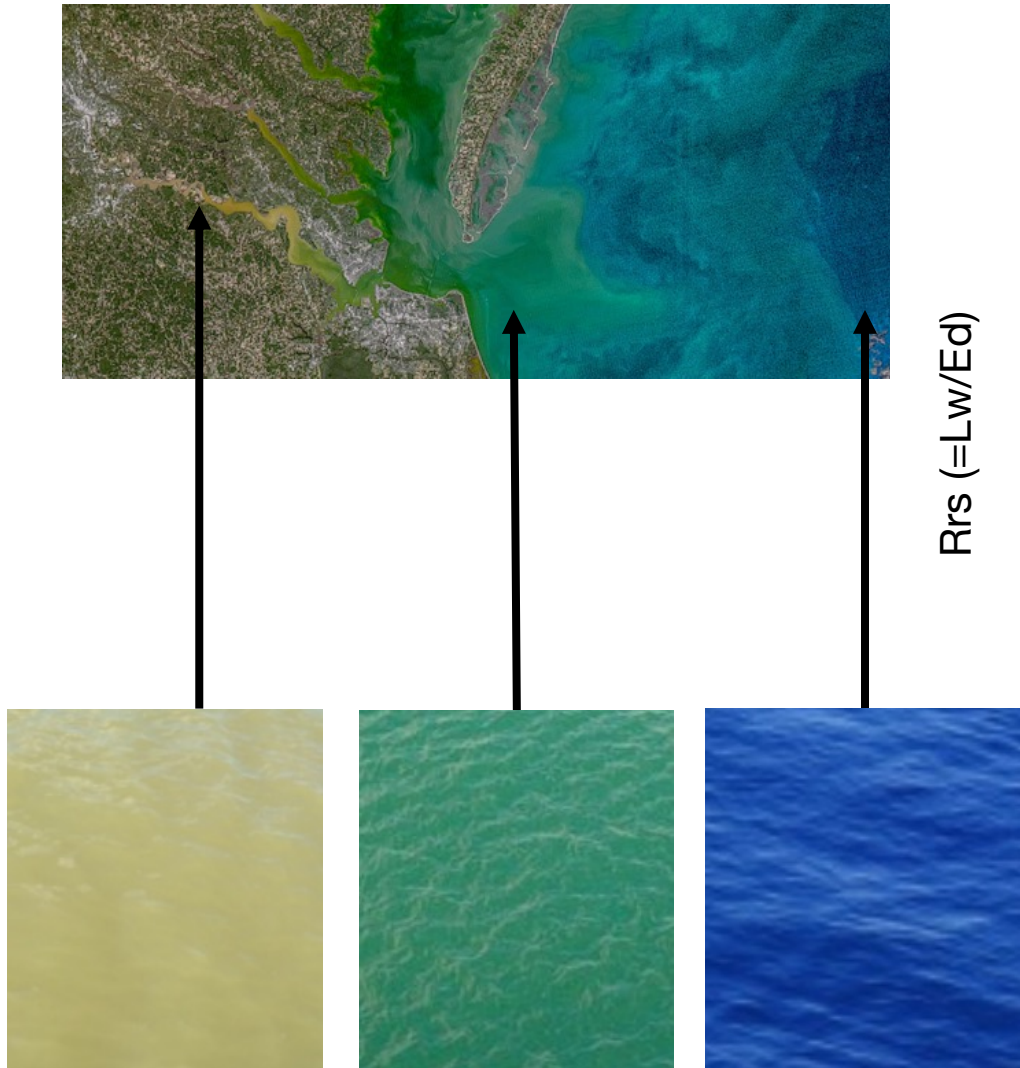
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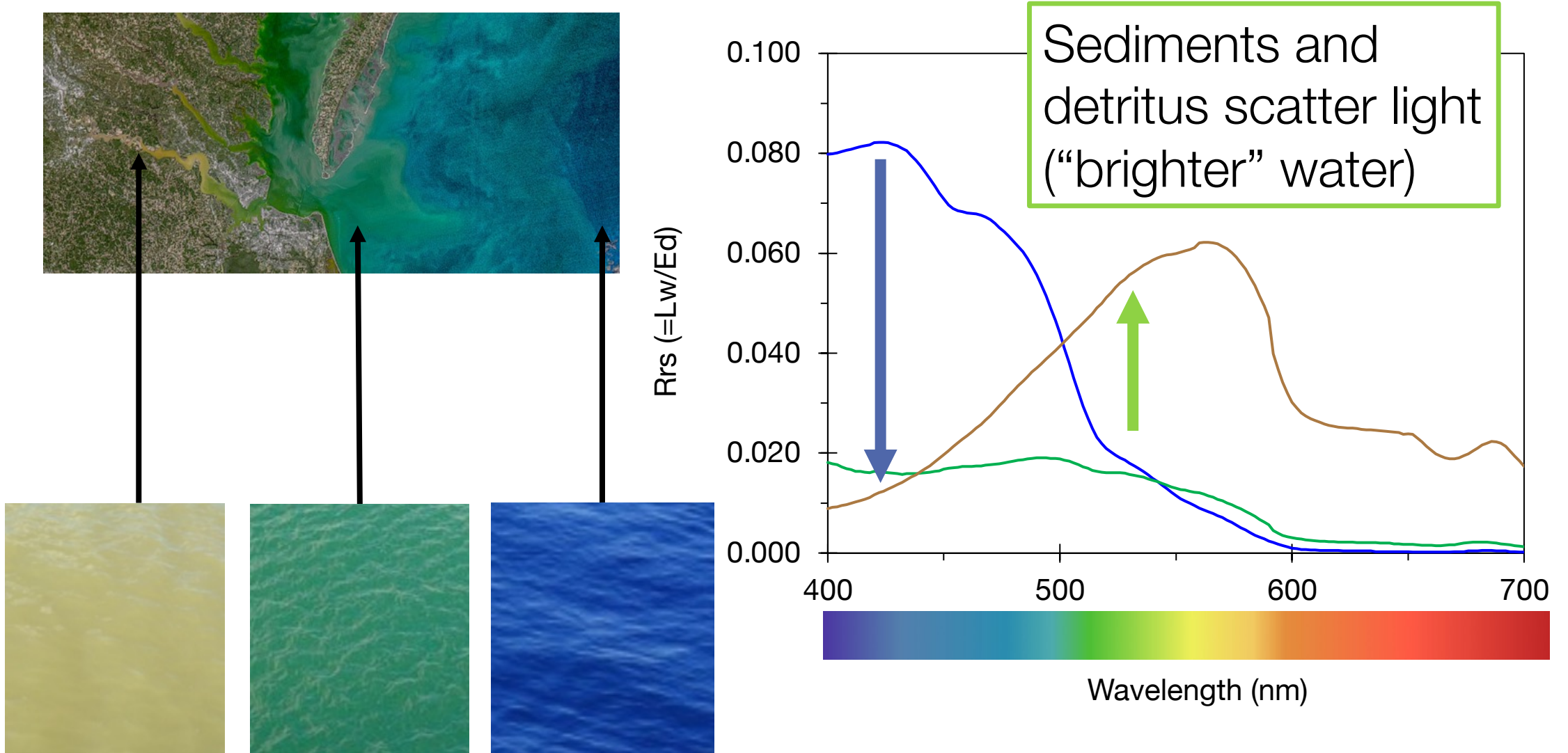
# Remote Sensing Reflectance (Rrs)



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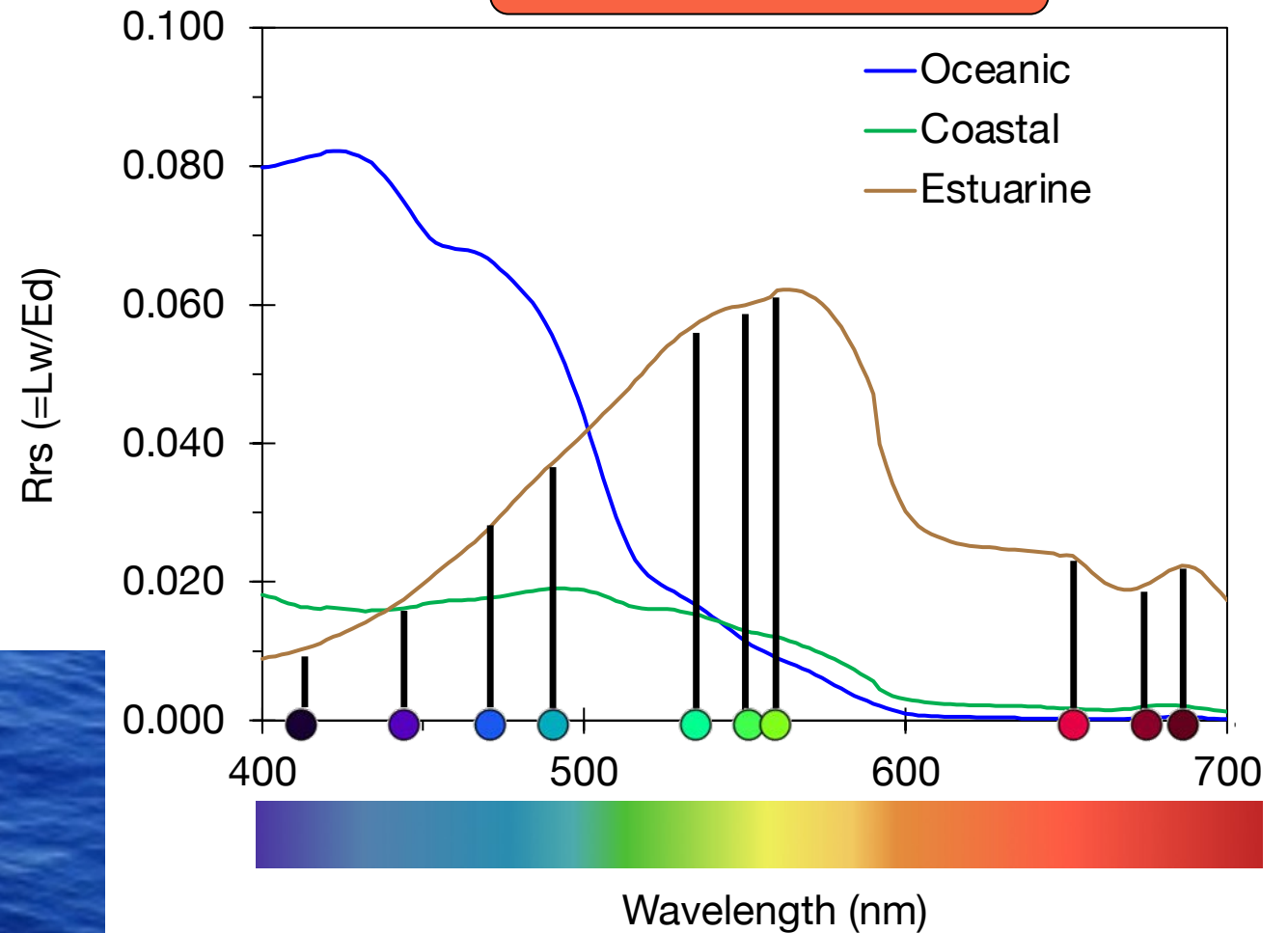
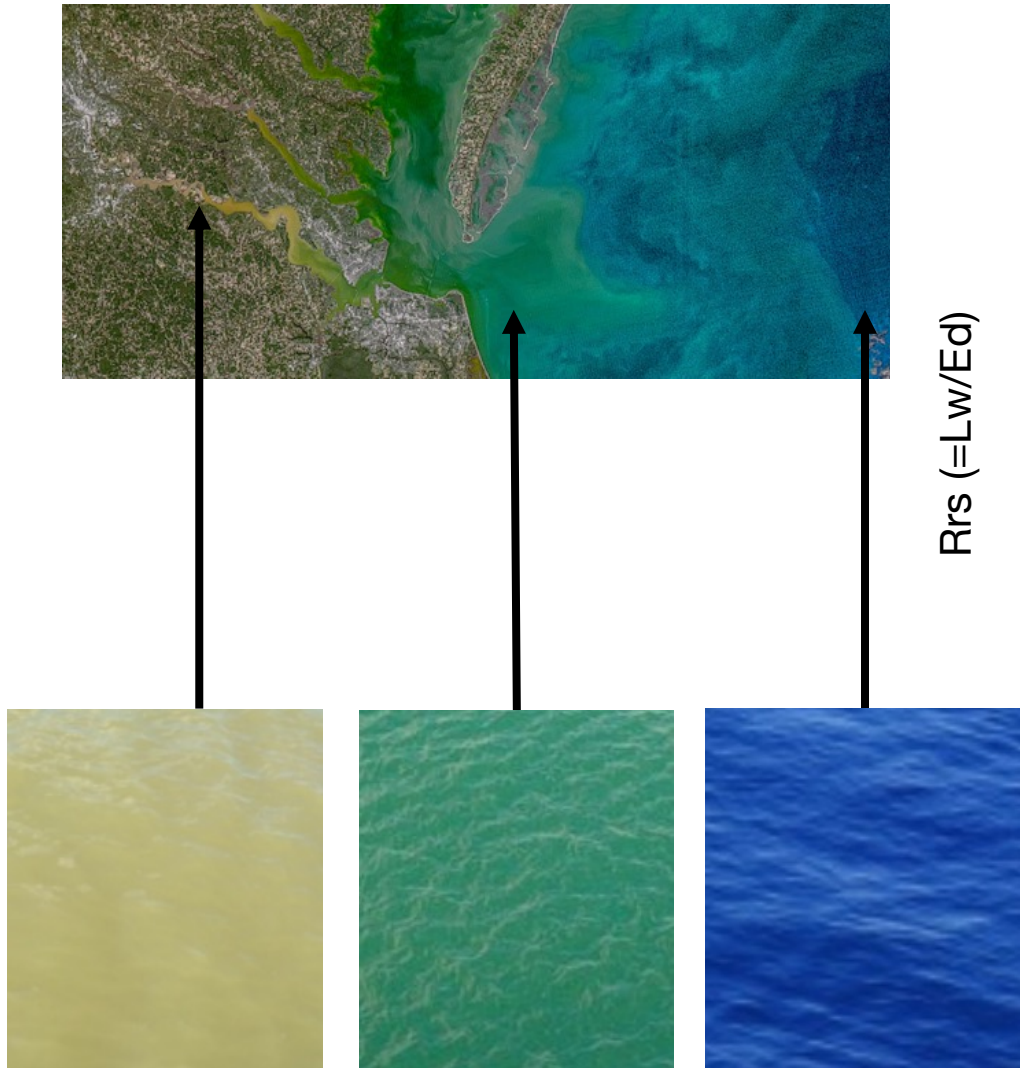


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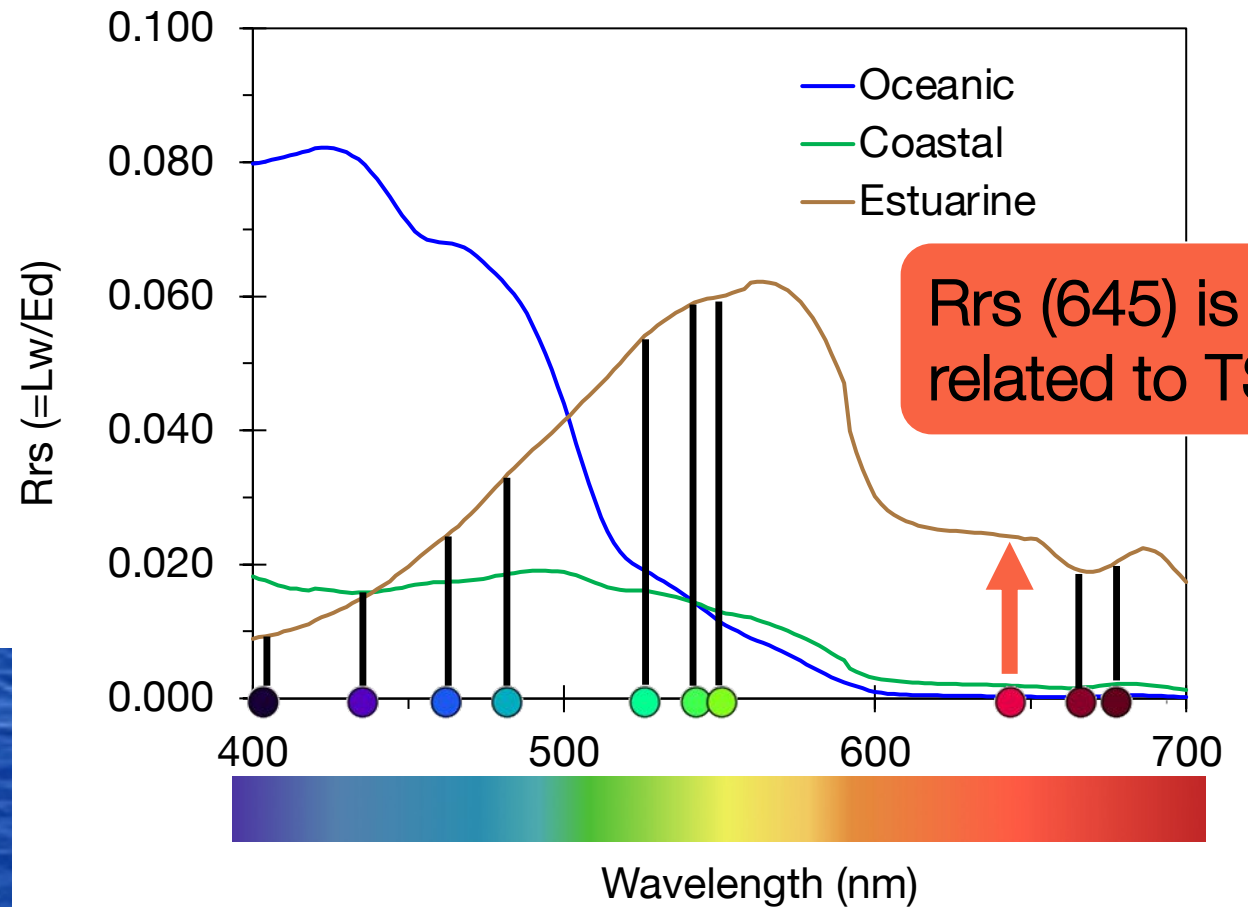
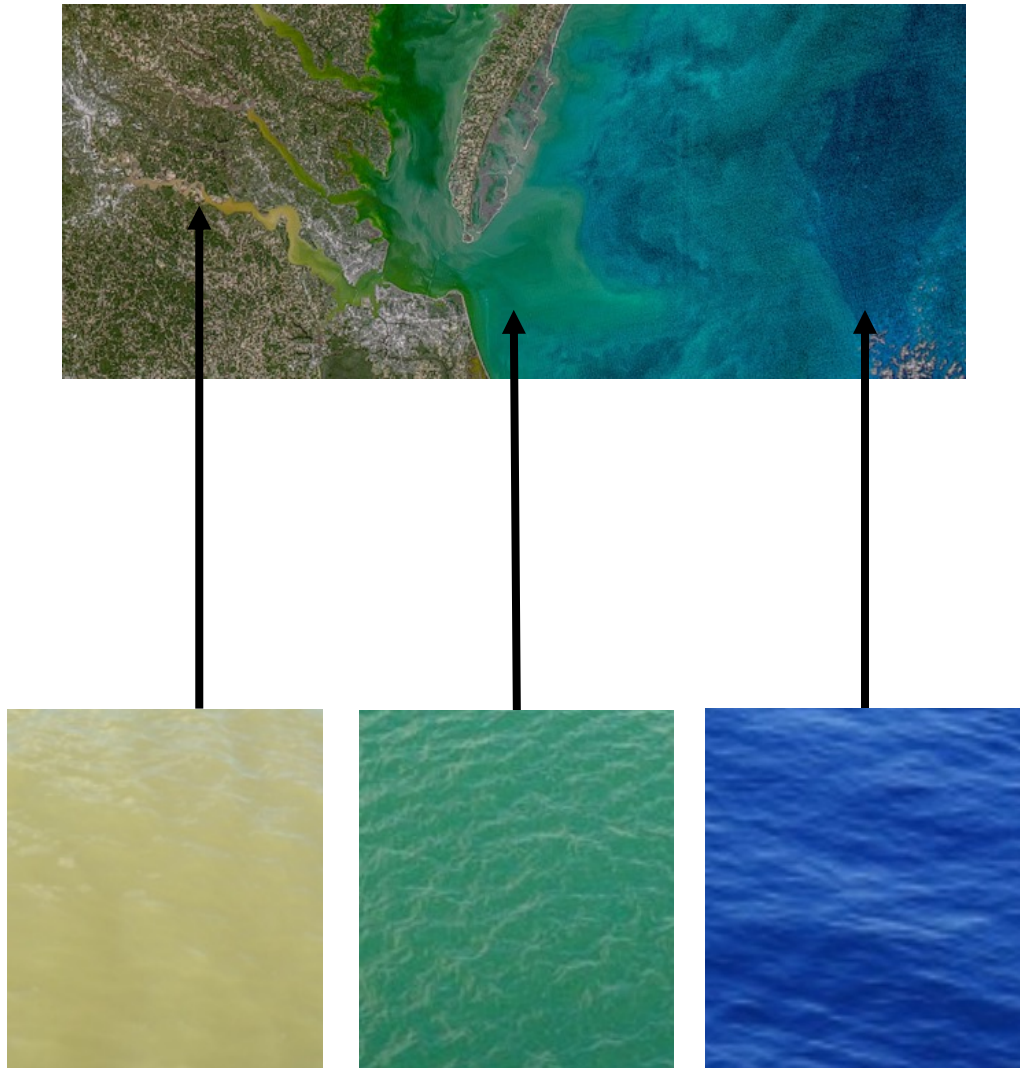


# Remote Sensing Reflectance (Rrs)

MODIS Bands

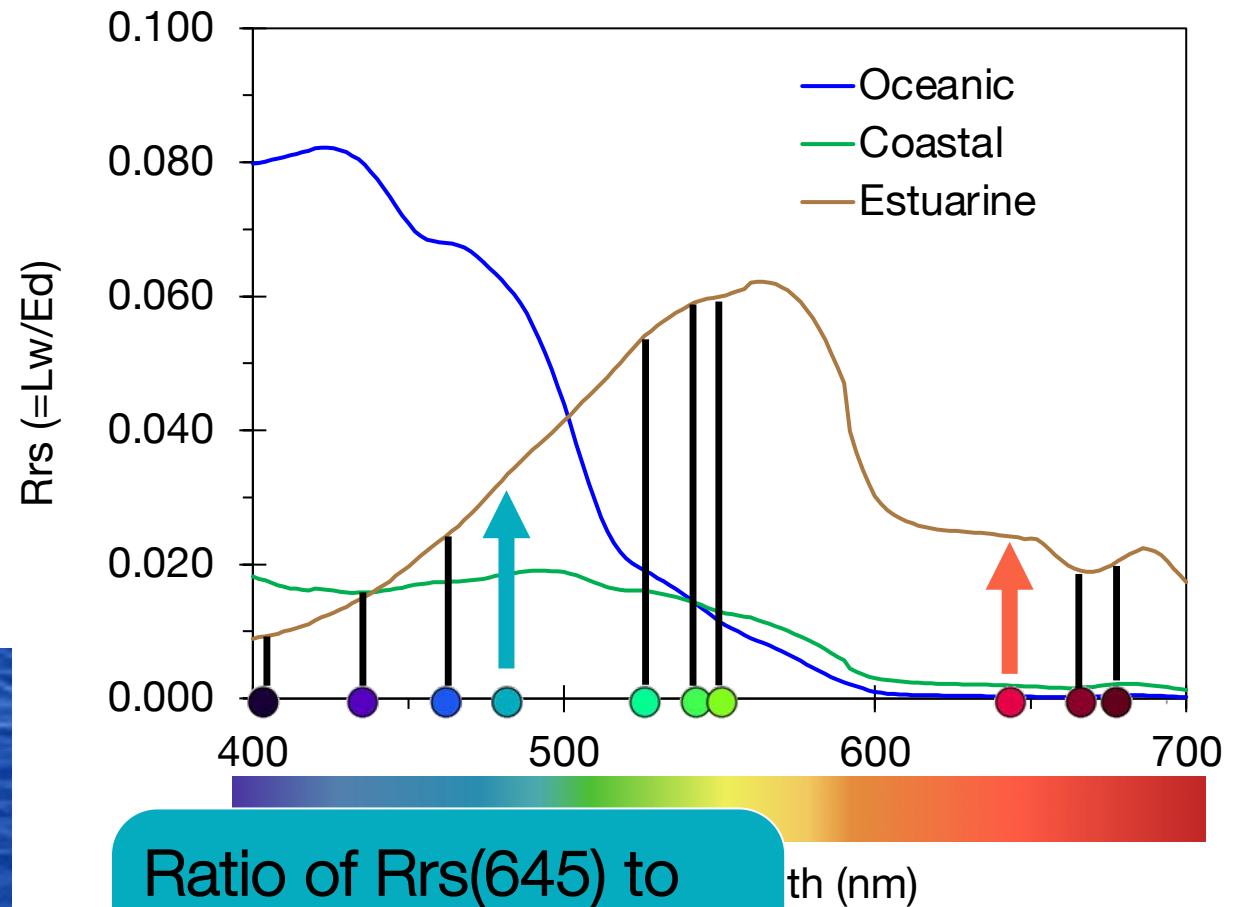
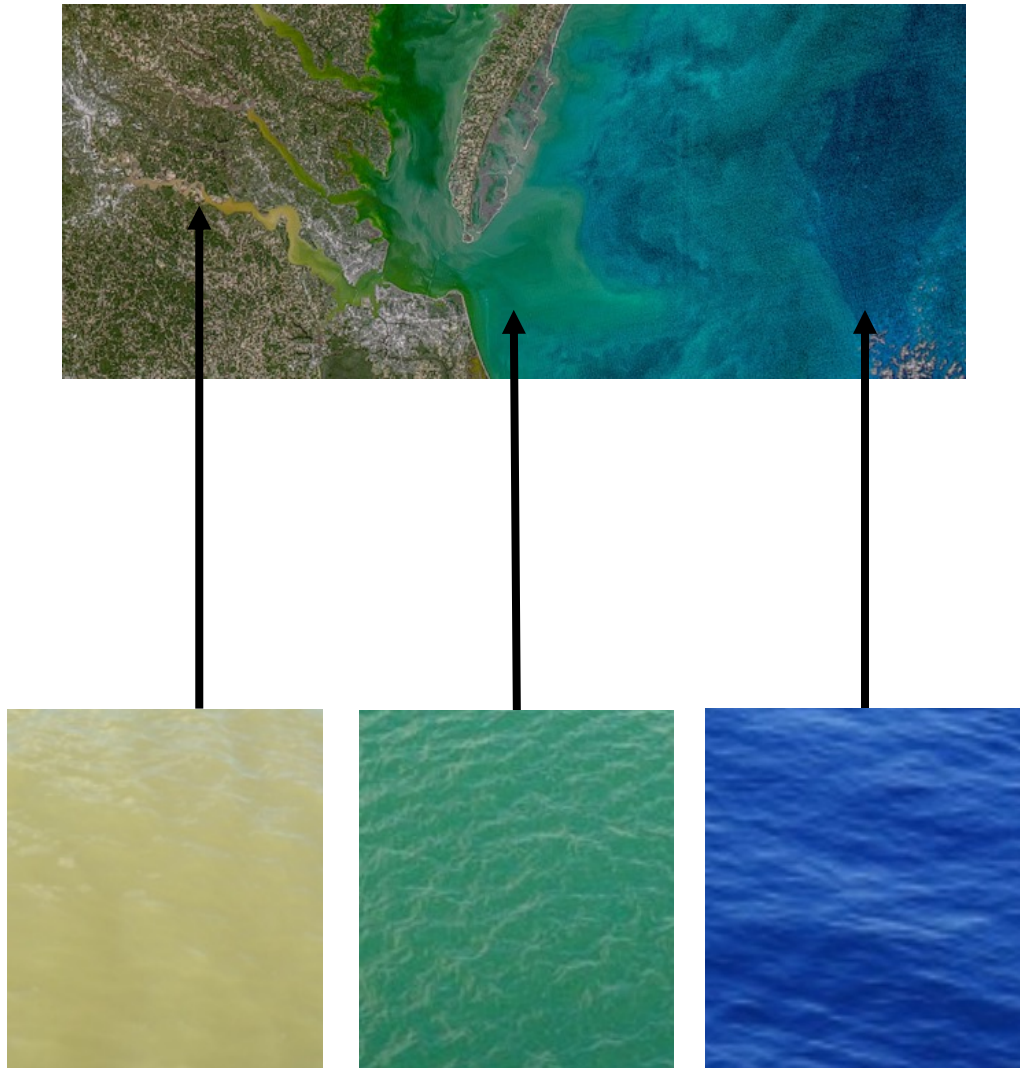


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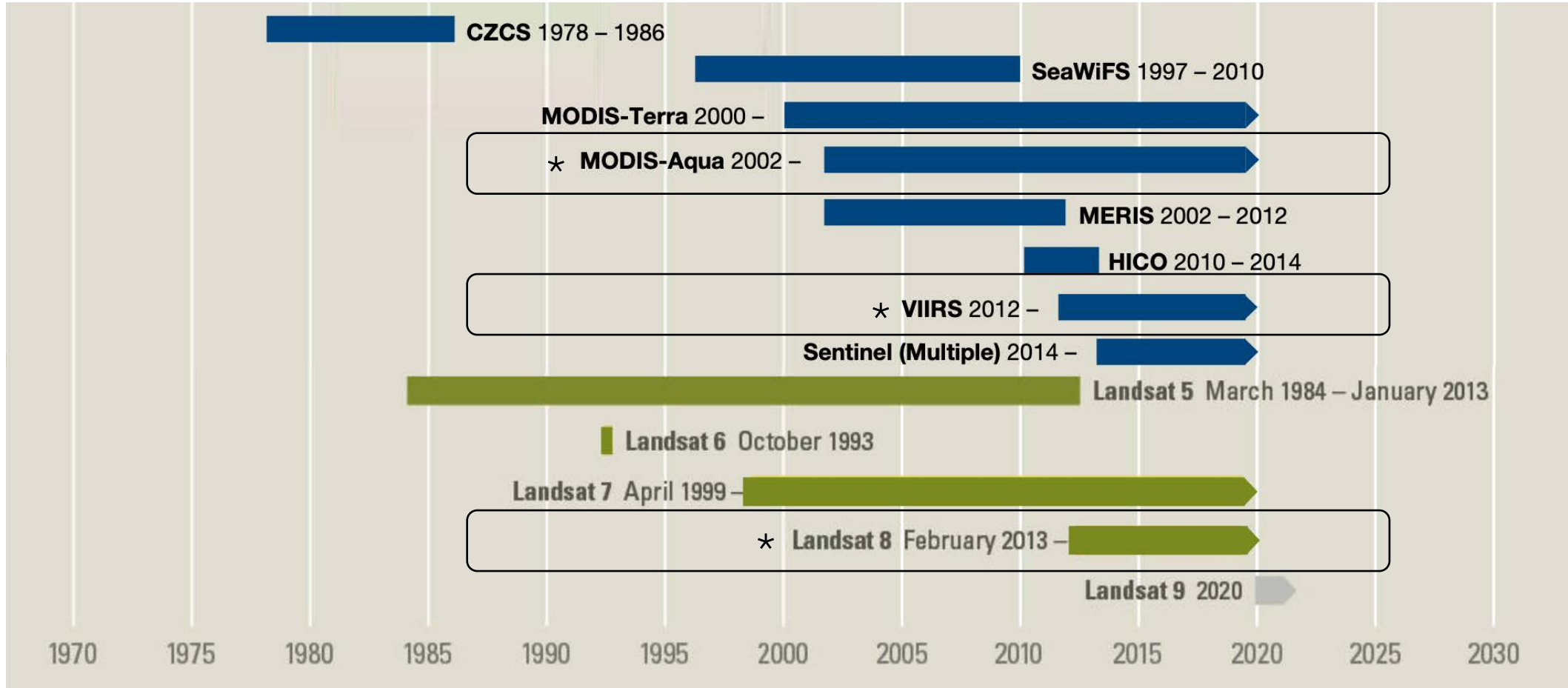






# Remote Sensing Reflectance (Rrs)



# Satellite missions for water clarity



 Ocean color mission by NASA/NOAA/ESA  
 USGS mission primarily for land applications

\* Shown in following slides

# Satellite missions for water clarity: 3 example sensors

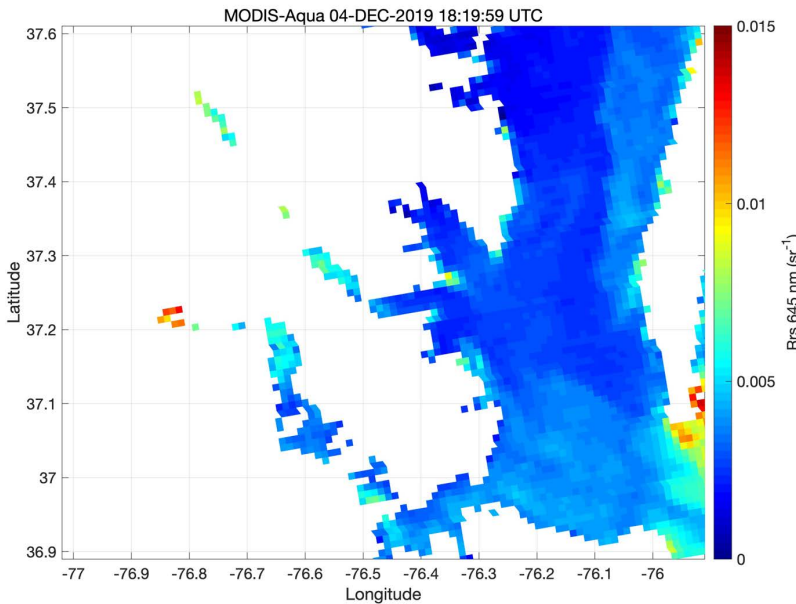
Atmospheric correction: NASA SeaDAS

Level-2 images (ready for science, but not spatially binned to a map projection)

## MODIS

1 km spatial resolution – shown  
(500m and 250 m for some bands,  
not shown)

Daily overpass

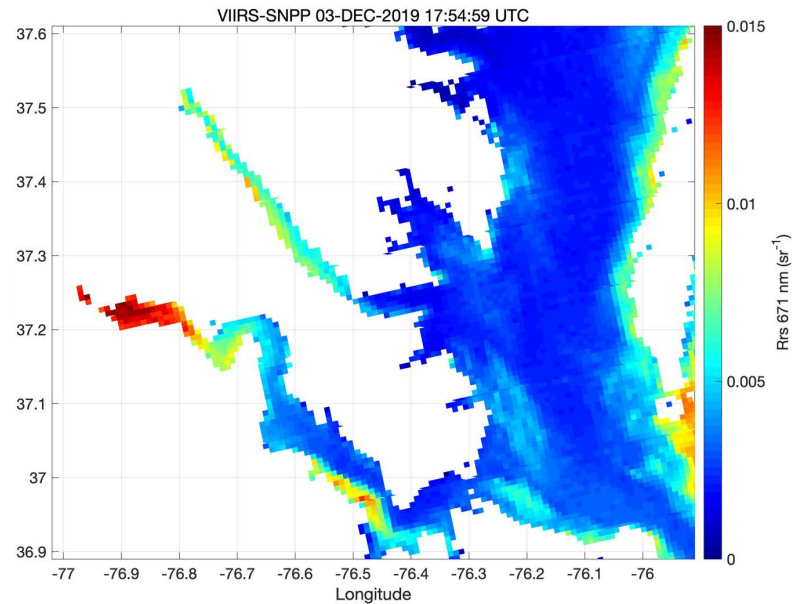


Available 1997-present  
(counting SeaWiFS and MODIS)

## VIIRS

675 m spatial resolution – shown  
(375 m for I-bands, not shown)

Daily overpass

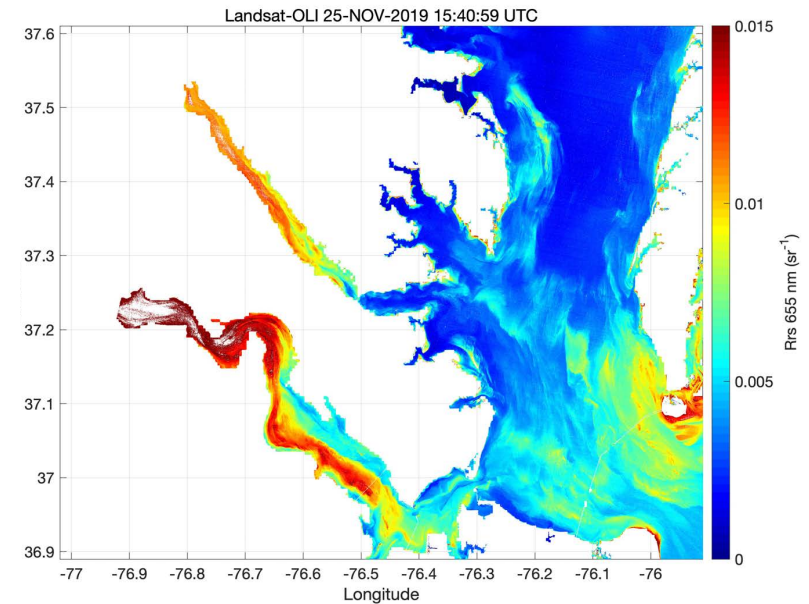


Available 2012-present

## Landsat

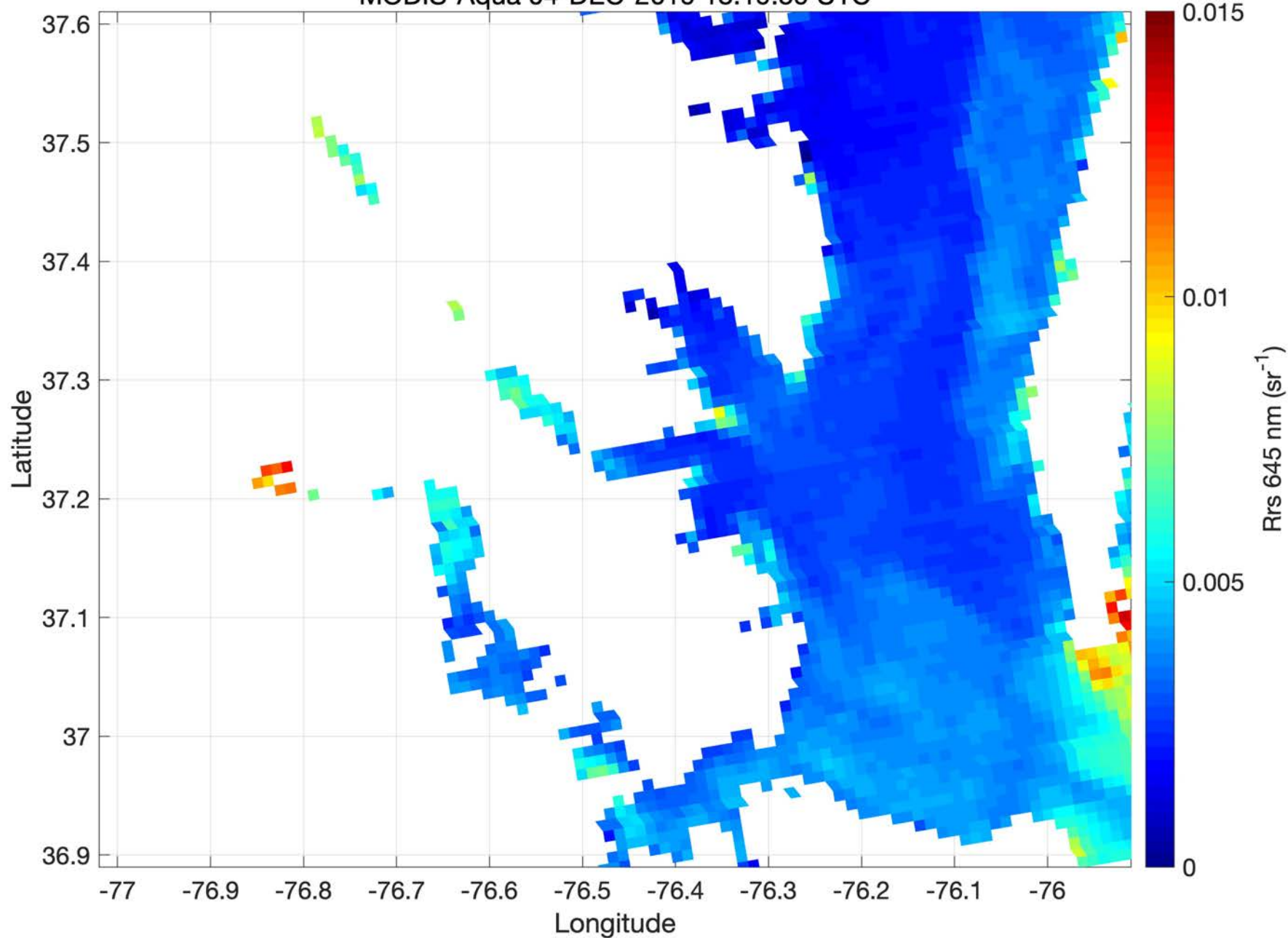
30 m spatial resolution

Overpass every 16 days



Available 1984-present  
(counting Landsat 5, 7, and 8)

MODIS-Aqua 04-DEC-2019 18:19:59 UTC



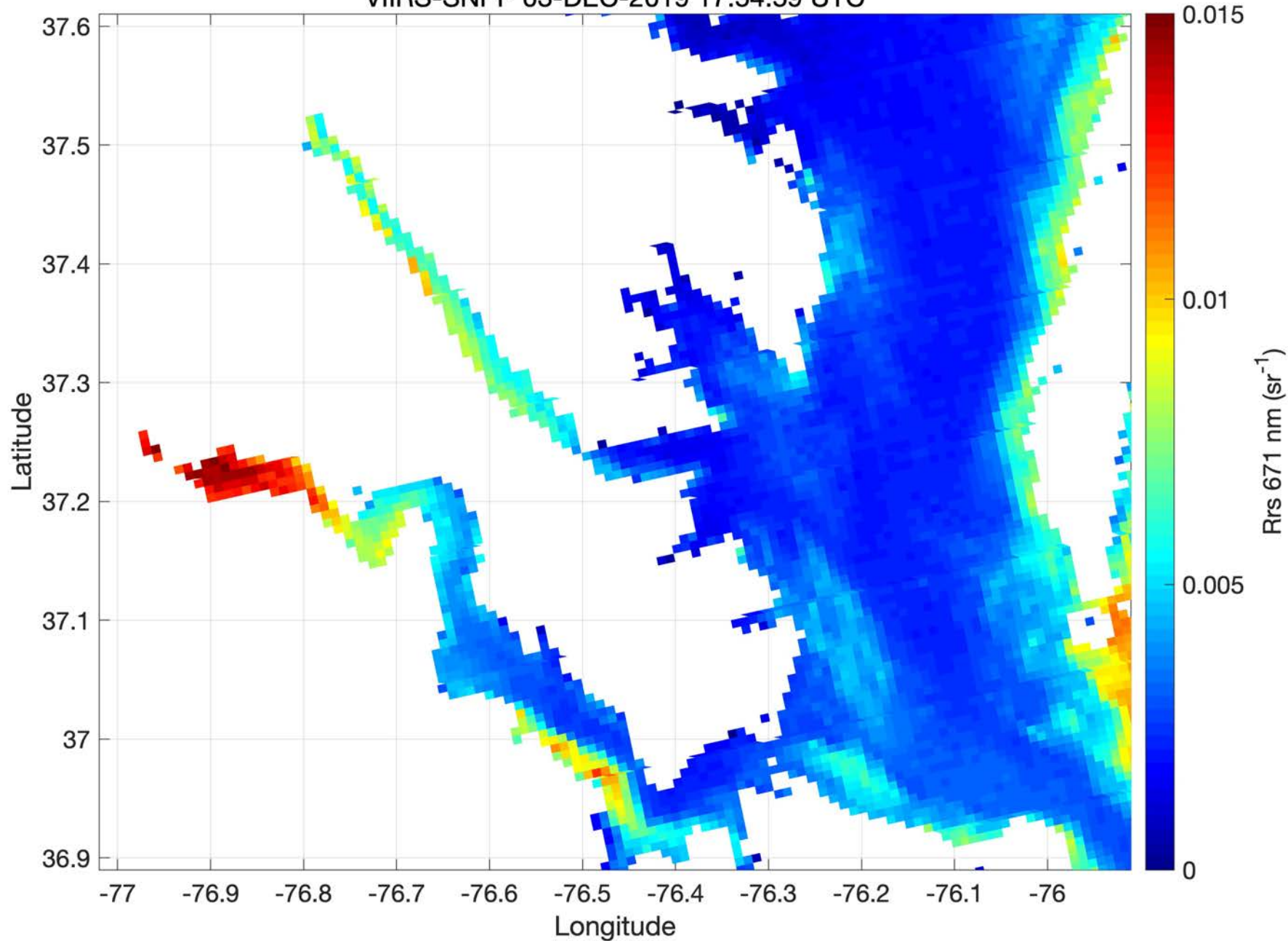
Pros:

- Daily overpass
- With SeaWiFS combined, can go back to 1997

Cons:

- Has been studied “to death” for Chesapeake Bay in the past
- Low spatial resolution, could not analyze tributaries or small creeks

VIIRS-SNPP 03-DEC-2019 17:54:59 UTC



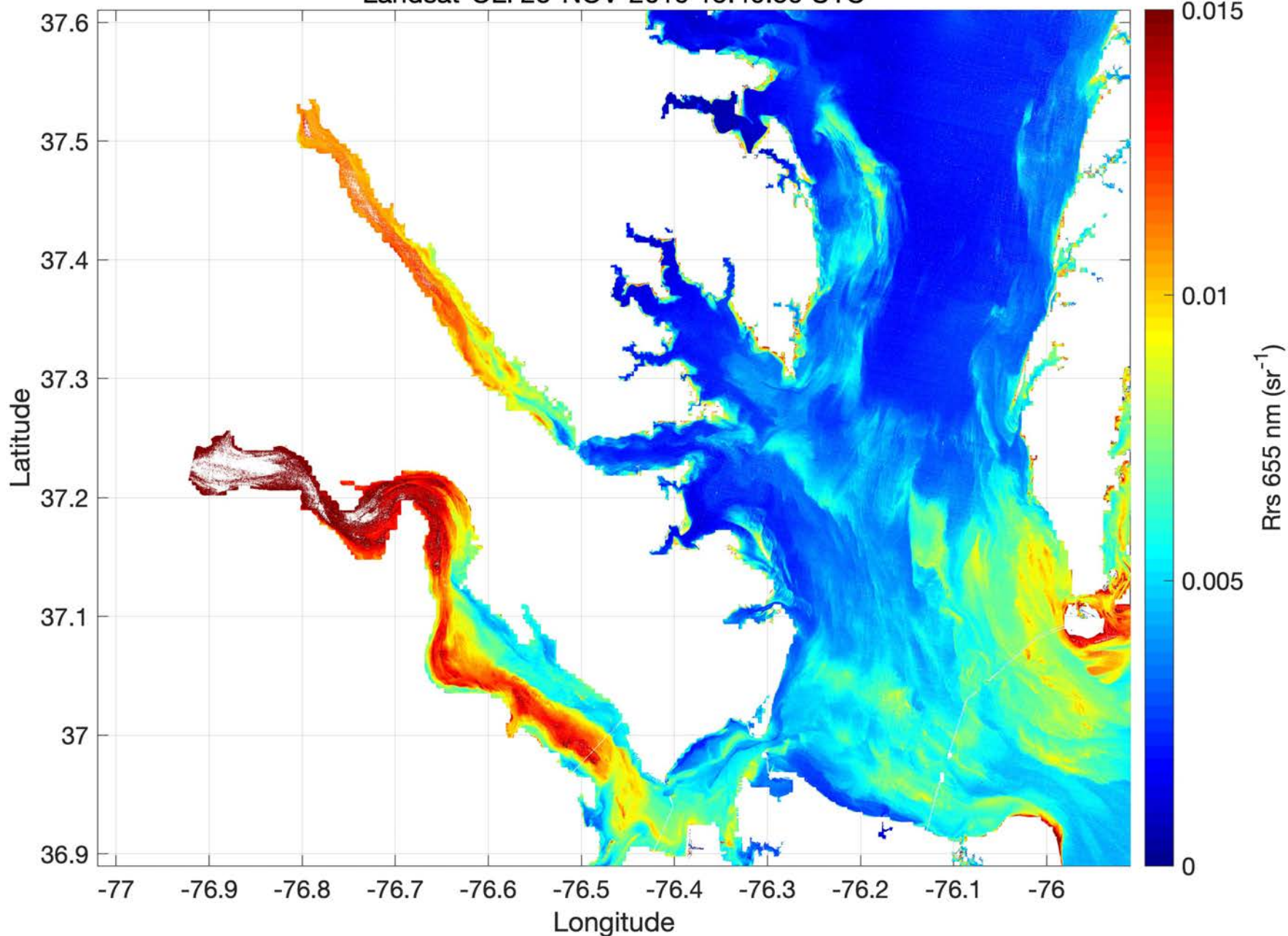
Pros:

- Daily overpass
- Moderately-good spatial resolution
- I-bands (near infrared) even better spatial res, could be used for TSS or Turbidity only

Cons

- Only goes back to 2012, so cannot really show any long-term change
- Issues with glint, angle, etc... Bruce Monger calls this the “troubled teenager” if SeaWiFS was the “perfect child”

Landsat-OLI 25-NOV-2019 15:40:59 UTC



Pros:

- Excellent spatial resolution, can resolve tributaries, small tidal creeks
- Landsat 5, 7 and 8 provide a continuous record back to 1984
- Untapped resource!

Cons:

- Need to add a bathymetry mask for optically-shallow water (sandbars)
- Landsat 5 and 8 are different sensors, different spectrally
- Requires more data processing because from USGS, not NASA

# Satellite missions for water clarity: 3 example sensors

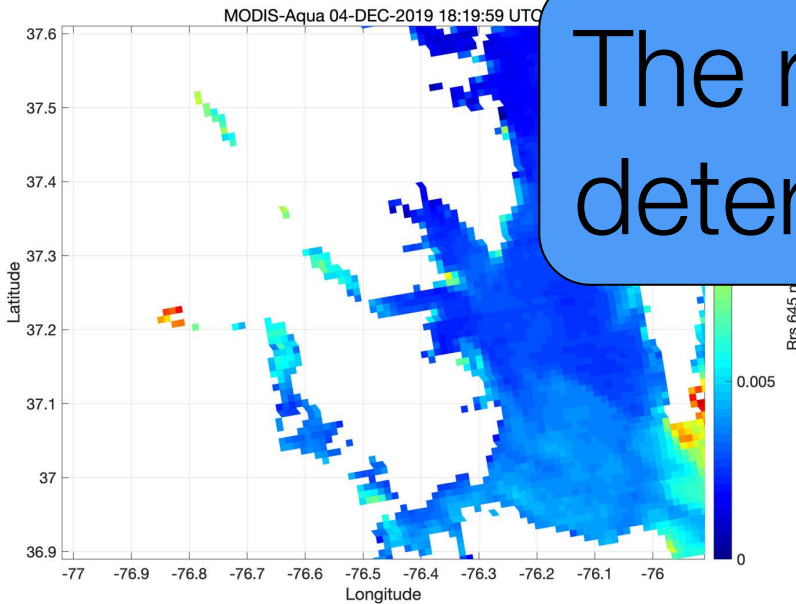
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Level-2 images (ready for science, but not spatially binned to a map projection)

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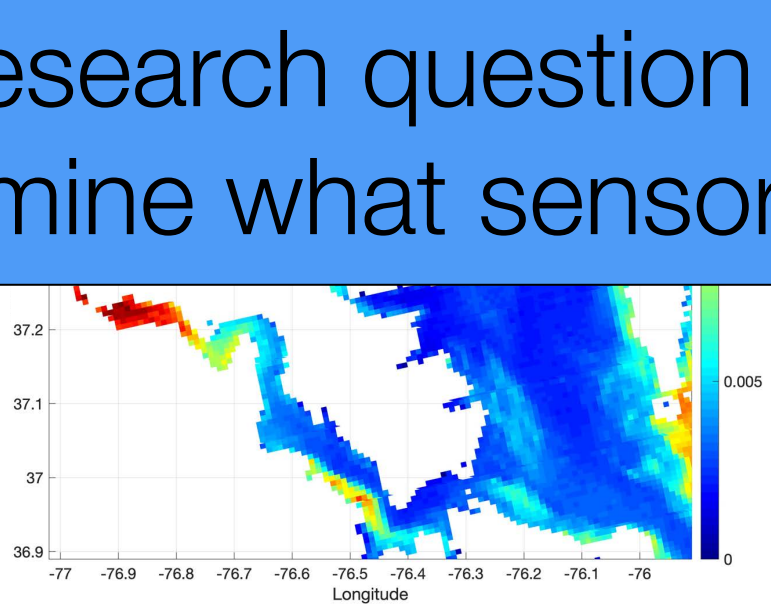


Available 1997-present  
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675 m spatial resolution – shown  
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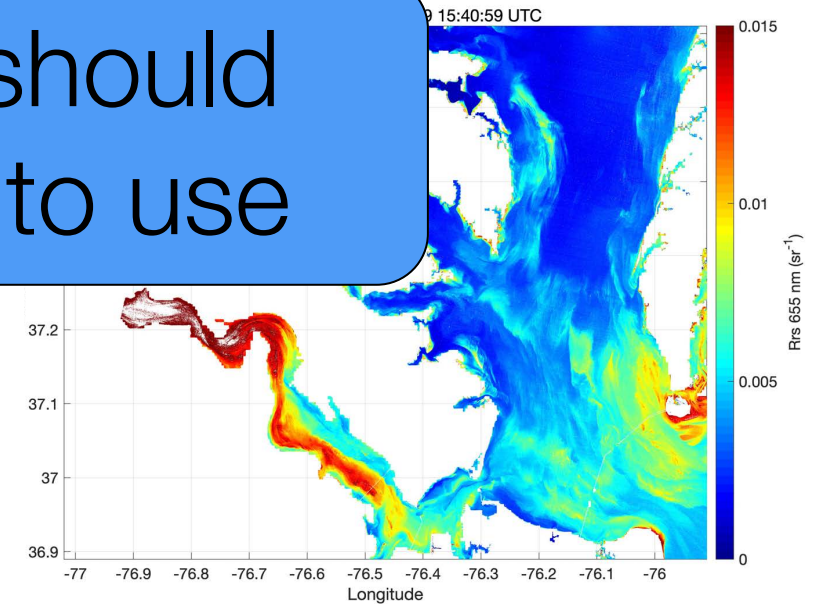
Daily overpass



Available 2012-present

## Landsat

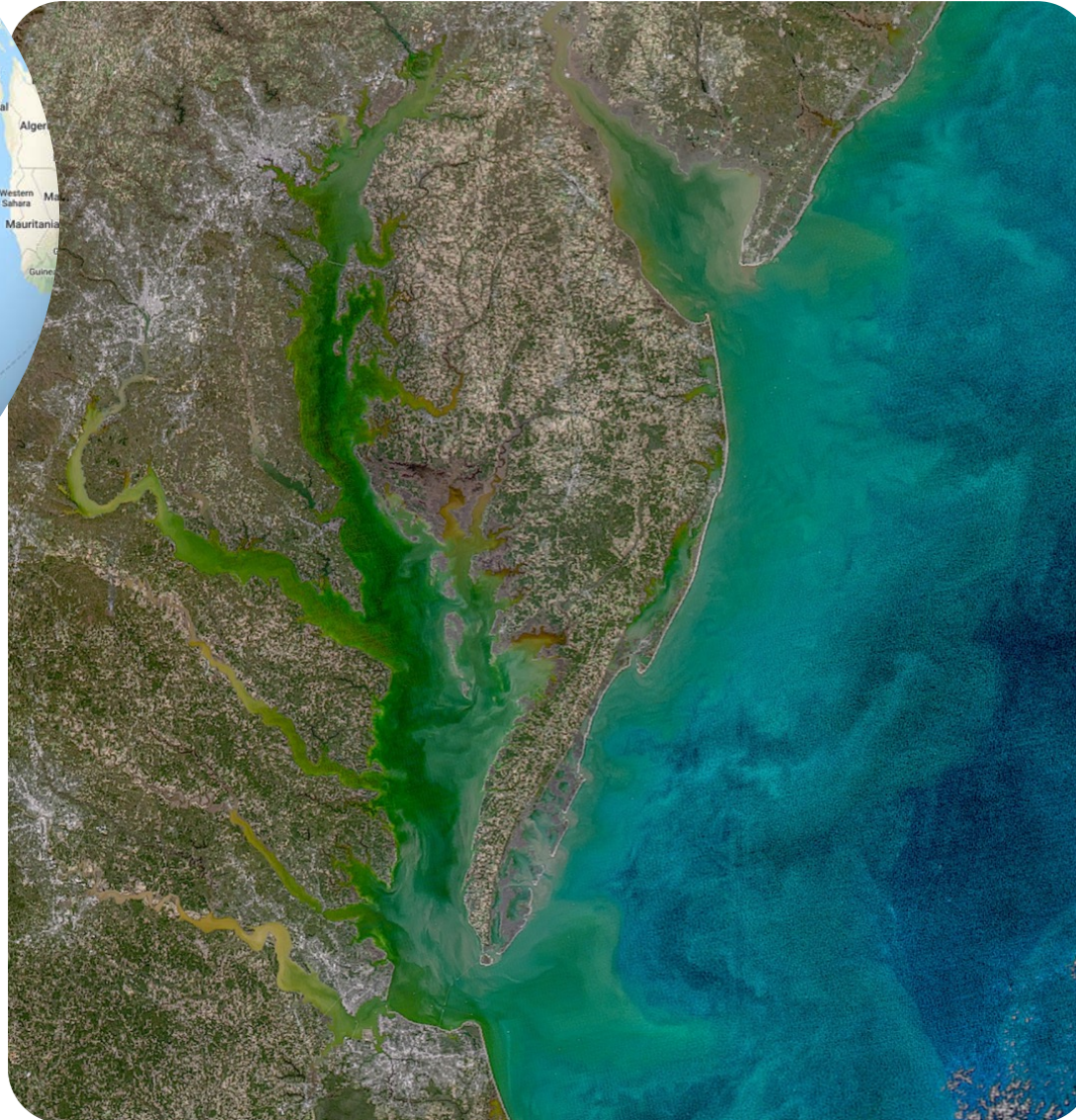
30 m spatial resolution  
Overpass every 16 days



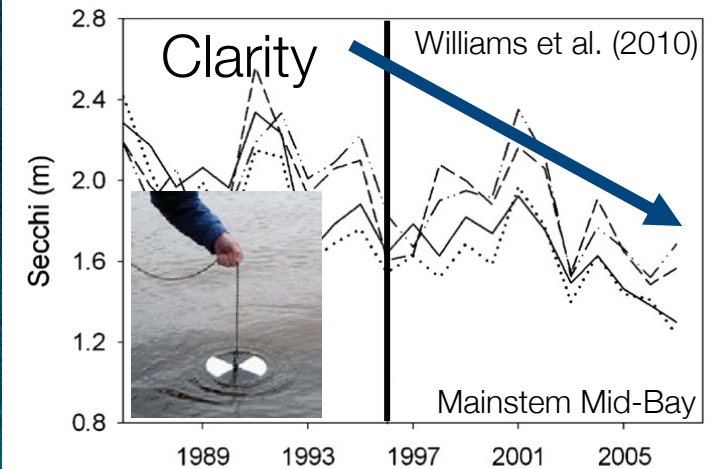
Available 1984-present  
(counting Landsat 5, 7, and 8)

The research question should determine what sensor to use

# Example: Long-term trends

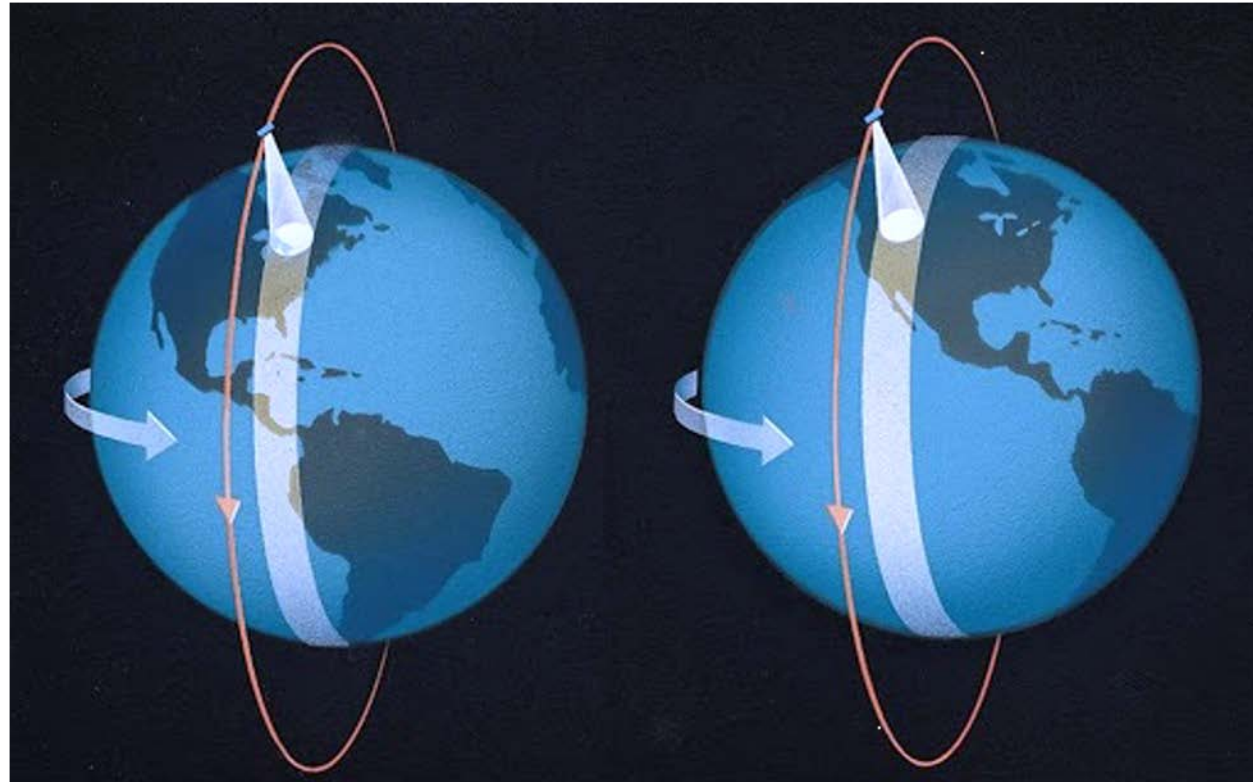


*Figure 1. MODIS-Aqua true color composite image of the Chesapeake Bay and Mid-Atlantic Bight collected November 11, 2020.*

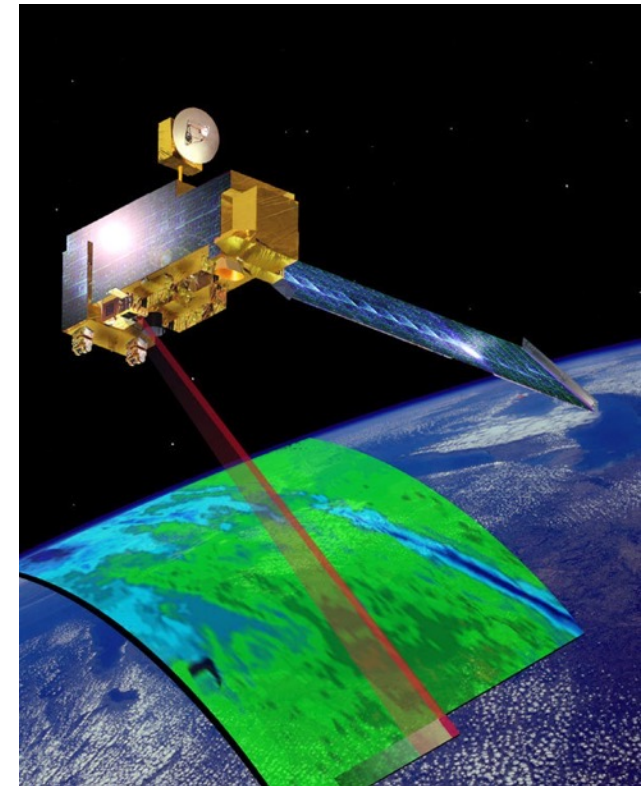




# Example: Long-term trends



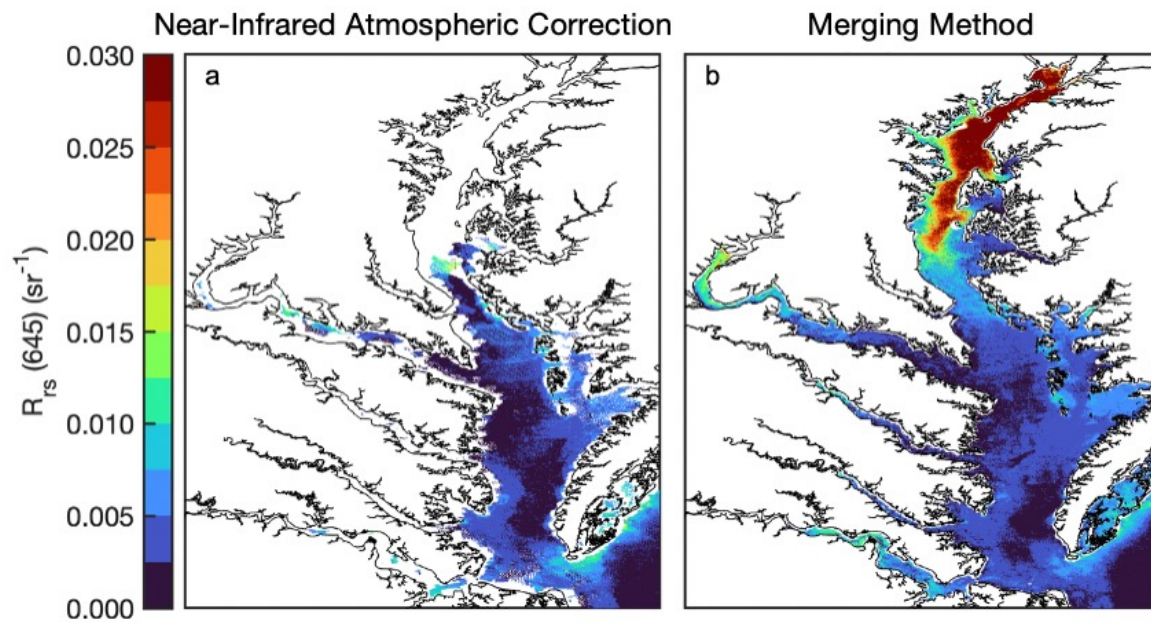
- MODIS-Aqua 2003-2020
- Daily overpass
- 250-m spatial resolution pixels in the red band
- 500-m and 1-km resolution in other bands



# Example: Long-term trends

- Merged atmospheric correction method used to retain data during high-turbidity conditions

Example: September 2011 (Lots of storms)



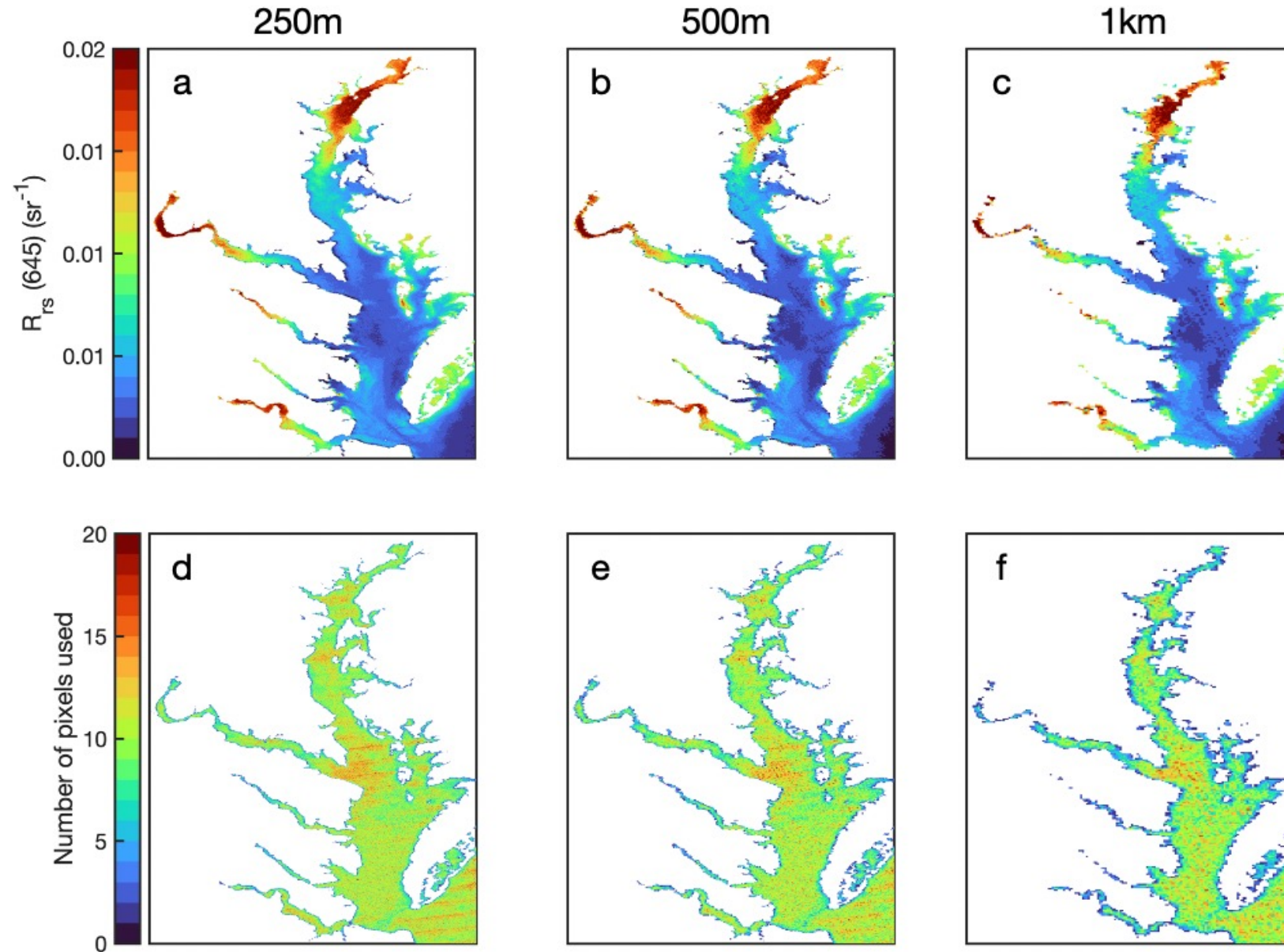
Following Aurin et al. (2013)



Up to 2x more scenes used in monthly composite

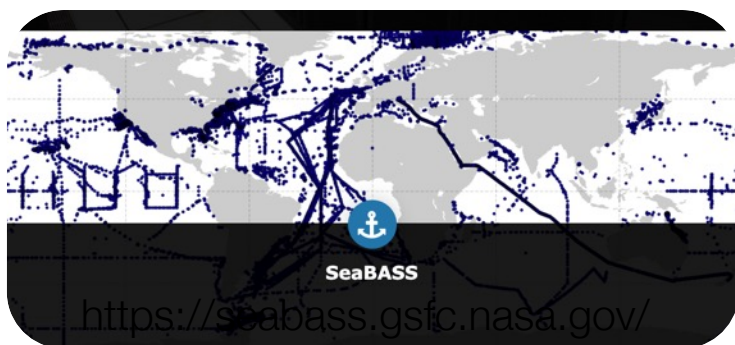
# MODIS-Aqua spatial resolutions

One month:  
March 2011



# Validation

- NASA SeaBASS repository
- 8 field campaigns
- 2005 to 2014
- Different seasons
- Many salinities, water types

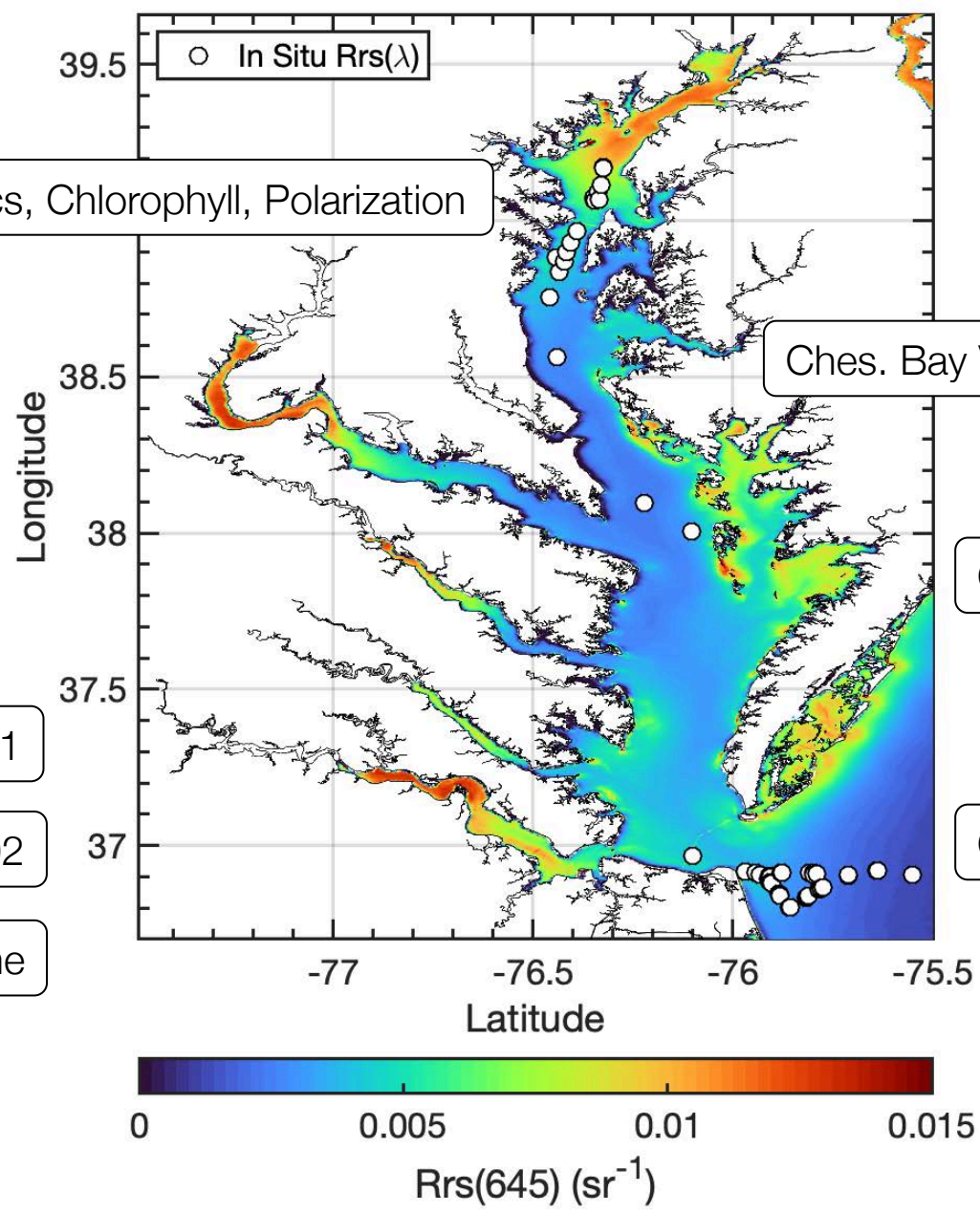


Ches. Bay Plume 01

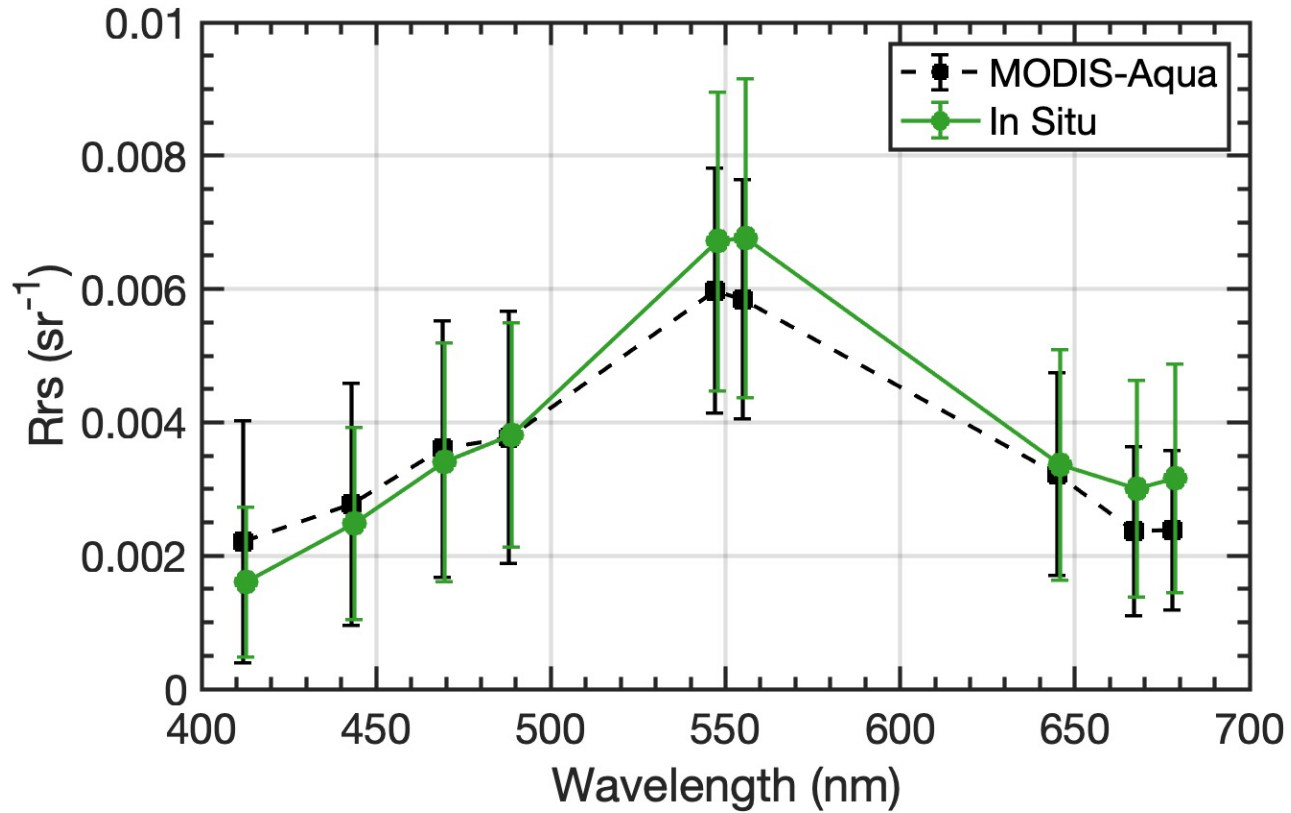
Ches. Bay Plume 02

Biome

Bio-optics, Chlorophyll, Polarization



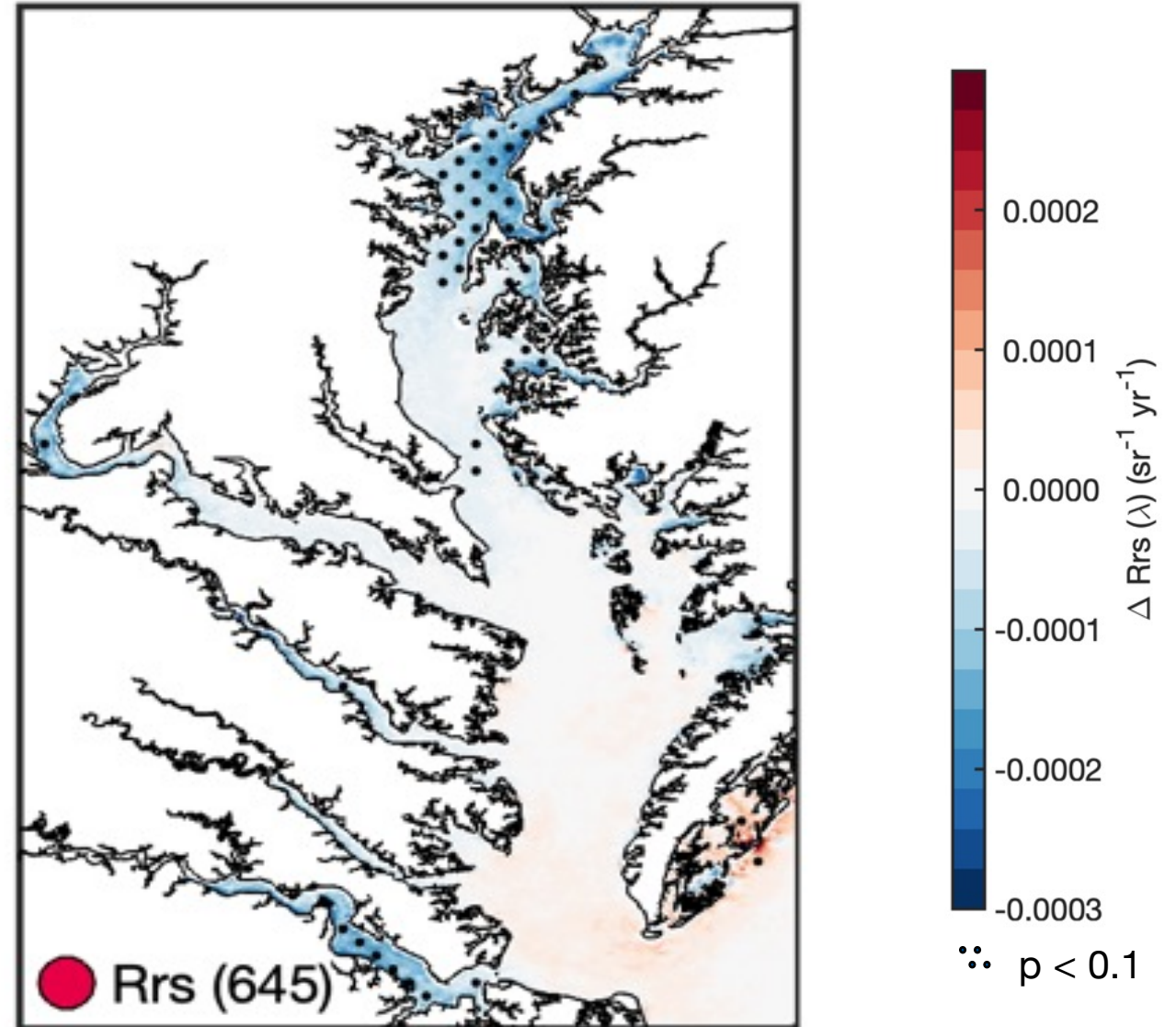
# Validation



- Satellite overestimates blue  $R_{rs}$
- Satellite underestimates green  $R_{rs}$
- Variability satellite  $\sim$  variability in situ

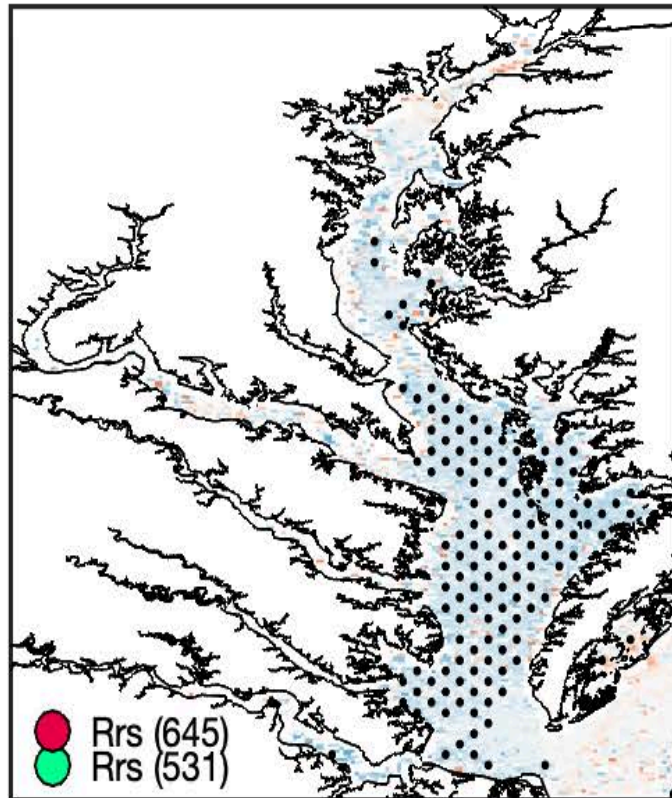
# Single Bands Trend Results

Red Rrs:  
Decreasing in upper Bay  
No Trend in lower Bay

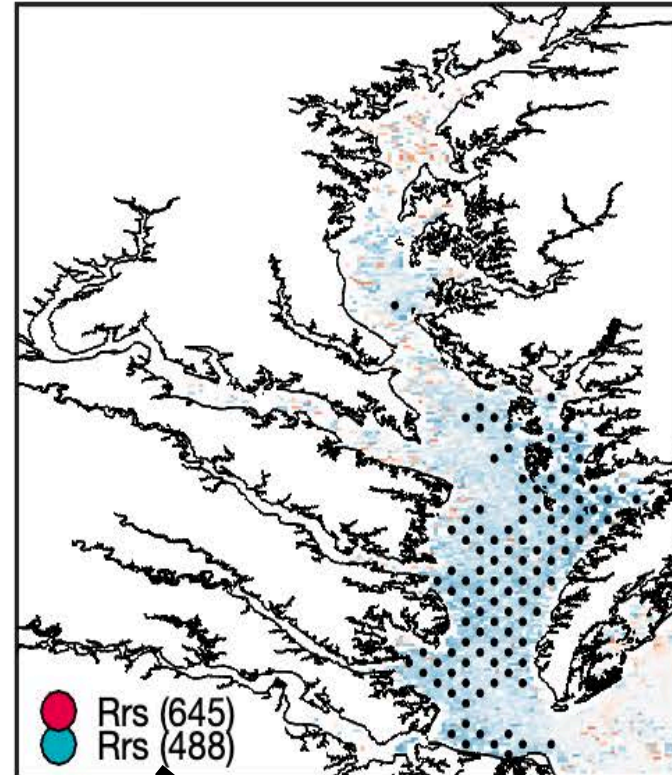


# Band Ratio Trend Results

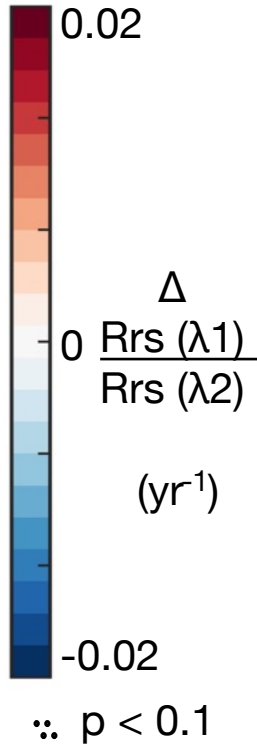
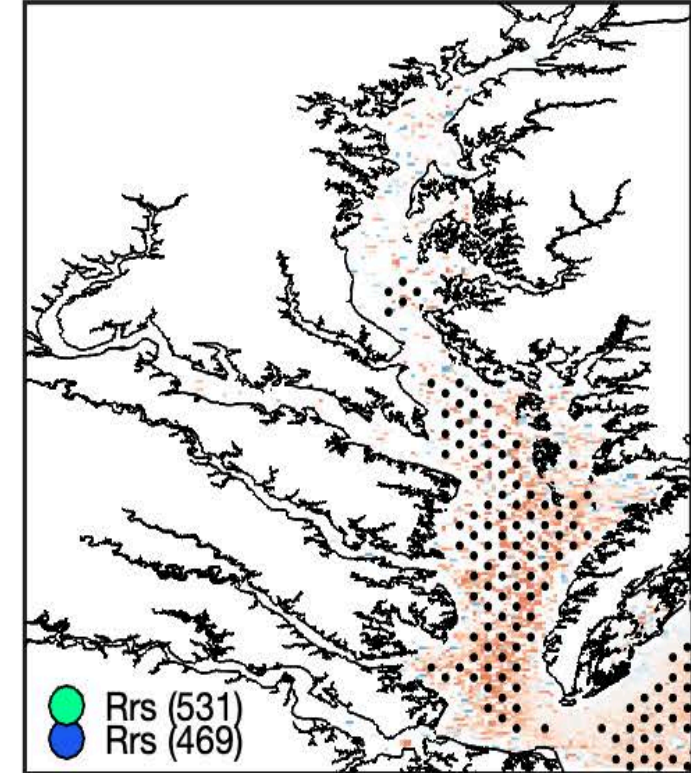
Red-to-green ratios



Red-to-blue ratios


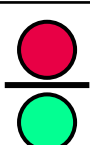

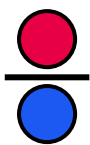

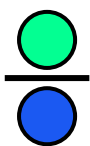
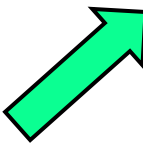


Green-to-blue ratios



Related to light attenuation, turbidity, and suspended solids

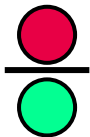

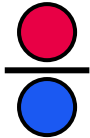

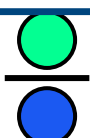
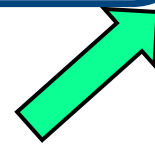
# What do these trends suggest?

Variable		Related in situ measurements	Trends
Red-band Rrs		Suspended solids, Turbidity	Decreasing in upper Bay, no trend in lower Bay
Red-to-green ratios		Suspended solids, Turbidity	Decreasing in mainstem Bay 
Red-to-blue ratios		Light attenuation, Suspended solids, Turbidity	Decreasing in mainstem Bay 
Green-to-blue ratios		Chlorophyll, CDOM	Increasing in mainstem Bay 







# What do these trends suggest?

Suggest **improving water clarity**  
in mainstem and lower Bay

Variable			Trend in
Red-to-green ratios		Suspended solids, Turbidity	Decreasing in mainstem Bay 
Red-to-blue ratios		Light attenuation, Suspended solids, Turbidity	Decreasing in mainstem Bay 
Green-to-blue ratios		Chlorophyll, CDOM	Increasing in mainstem Bay 

# What do these trends suggest?

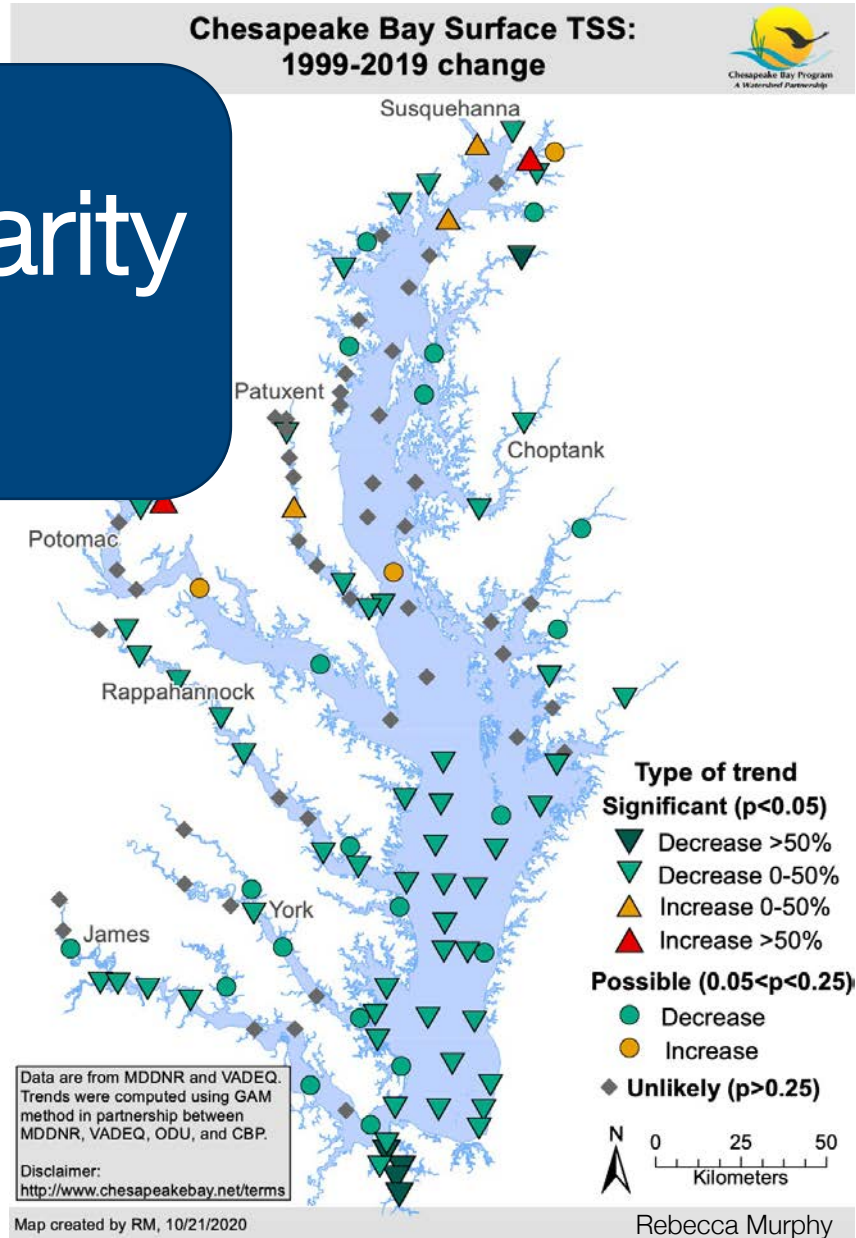
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Red-to-green ratio		
Red-to-blue ratio		
Green-to-blue ratios  	Chlorophyll, CDOM	Increasing in mainstem Bay 

Suggest **increasing contribution of phytoplankton** to reflectance

# Interpretations of long-term change

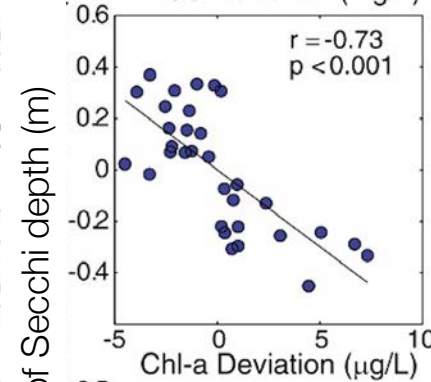
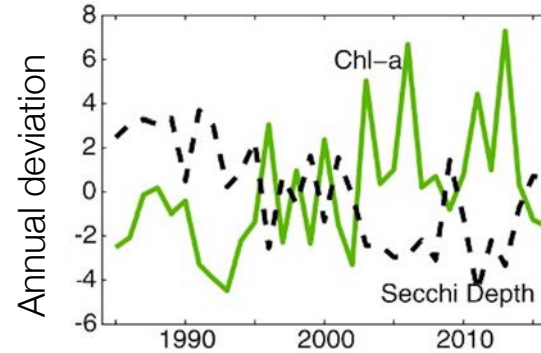
Suggest **improving water clarity**  
in mainstem and lower Bay

- In situ data 1999-2019 shows water becoming clearer in terms of  $K_d$ , TSS

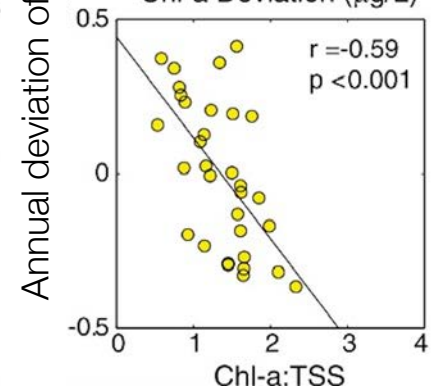
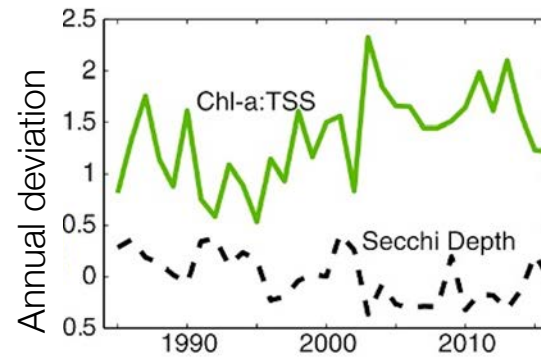


# What do these trends suggest?

Mid-Bay



Lower Bay



Testa et al. 2019

Suggest **increasing contribution of phytoplankton** to reflectance

# Example: Florida “Virtual Buoy System”

<https://optics.marine.usf.edu/projects/vbs.html>

Optical Engineering 53(5), 051402 (May 2014)

## Satellite-based virtual buoy system to monitor coastal water quality

**Chuanmin Hu**

**Brian B. Barnes**

**Brock Murch**

University of South Florida  
College of Marine Science  
140 Seventh Avenue, South  
St. Petersburg, Florida 33701  
E-mail: [huc@usf.edu](mailto:huc@usf.edu)

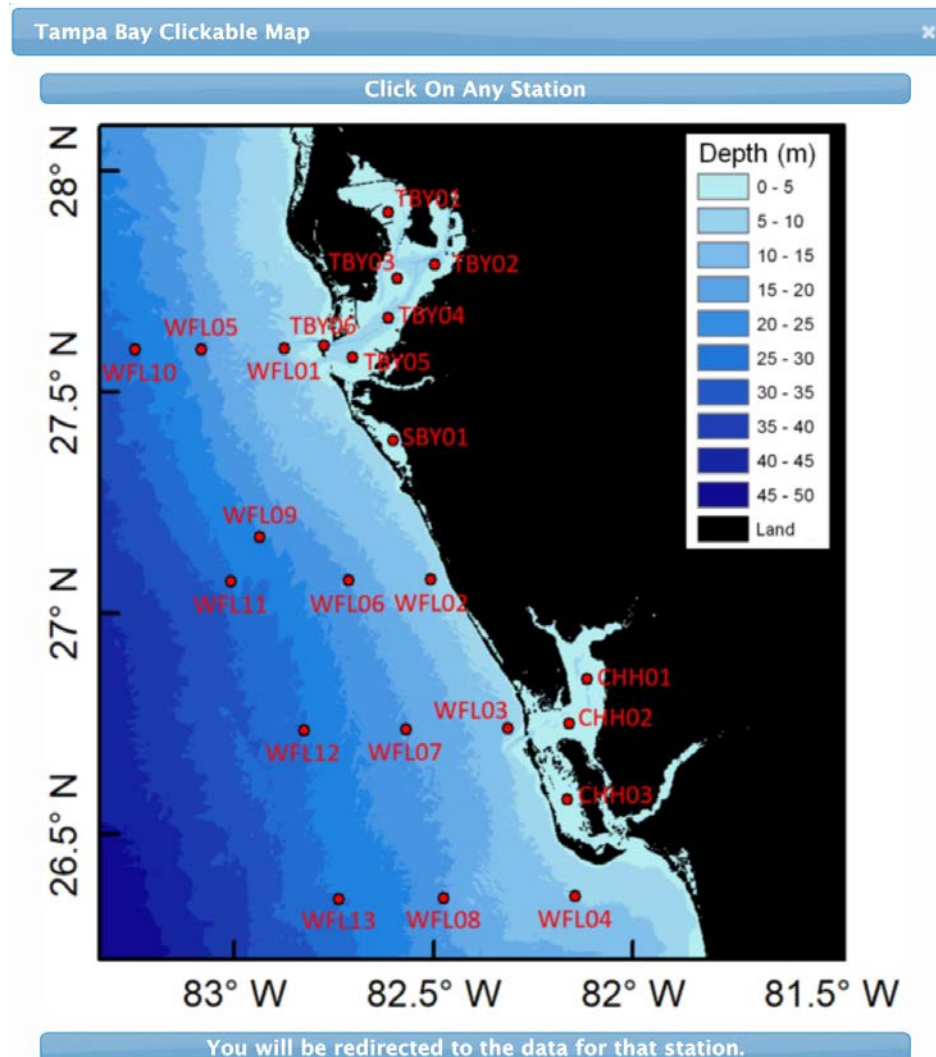
**Paul Carlson**

Florida Fish and Wildlife Conservation  
Commission  
100 Eighth Avenue, SE  
St. Petersburg, Florida 33701

**Abstract.** There is a pressing need to assess coastal and estuarine water quality state and anomaly events to facilitate coastal management, but such a need is hindered by lack of resources to conduct frequent ship-based or buoy-based measurements. Here, we established a virtual buoy system (VBS) to facilitate satellite data visualization and interpretation of water quality assessment. The VBS is based on a virtual antenna system (VAS) that obtains low-level satellite data and generates higher-level data products using both National Aeronautics and Space Administration standard algorithms and regionally customized algorithms in near real time. The VB stations are predefined and carefully chosen to cover water quality gradients in estuaries and coastal waters, where multiyear time series at monthly and weekly intervals are extracted for the following parameters: sea surface temperature ( $^{\circ}\text{C}$ ), chlorophyll-a concentration ( $\text{mg m}^{-3}$ ), turbidity (NTU), diffuse light attenuation at 490 nm [ $K_d(490)$ ,  $\text{m}^{-1}$ ] or secchi disk depth (m), absorption coefficient of colored dissolved organic matter ( $\text{m}^{-1}$ ), and bottom available light (%). The time-

# Example: Florida “Virtual Buoy System”

<https://optics.marine.usf.edu/projects/vbs.html>



Click on a point

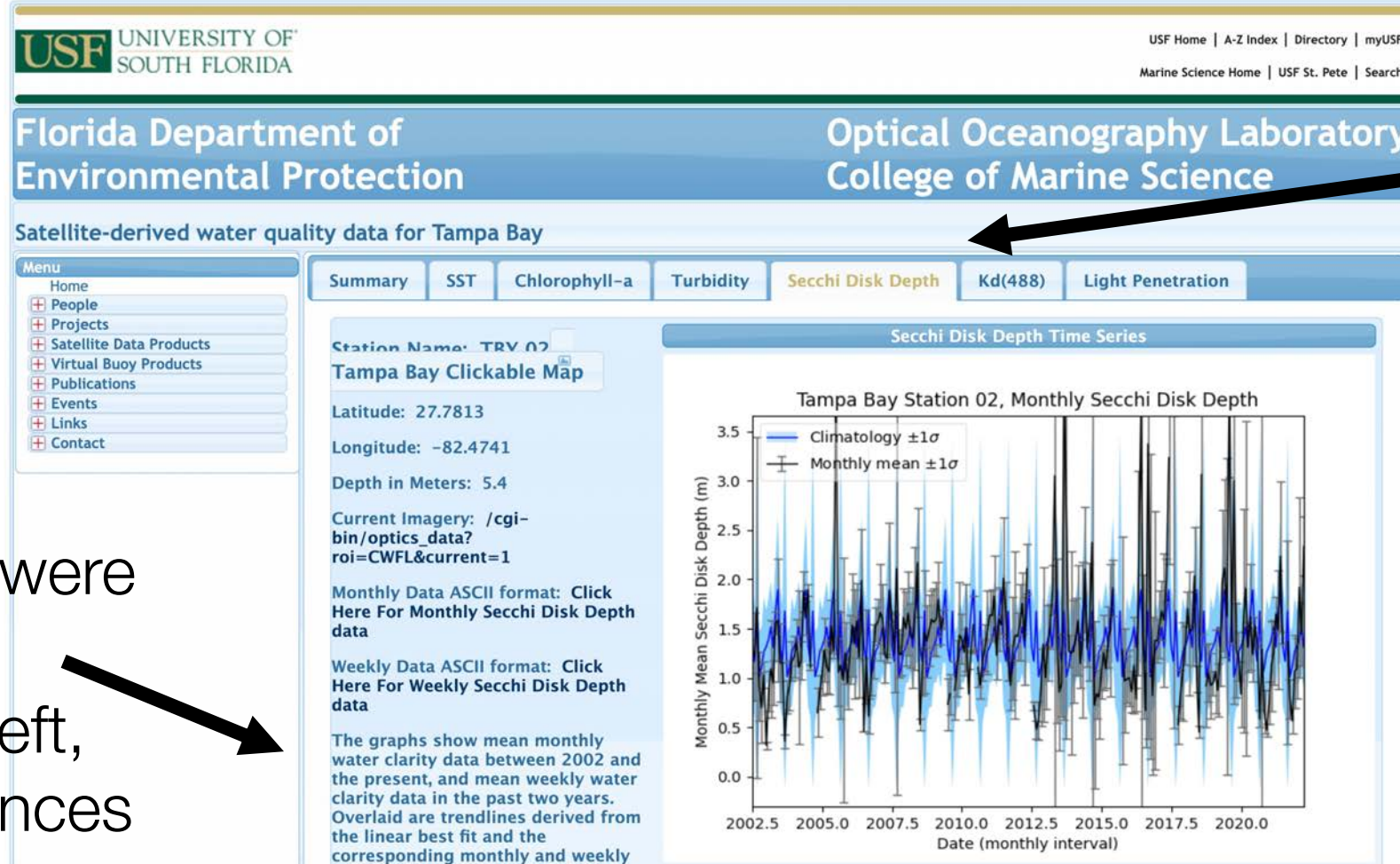
Software loads a time series of satellite data from that location

# Example: Florida “Virtual Buoy System”

<https://optics.marine.usf.edu/projects/vbs.html>

Mostly from  
MODIS-Aqua

Products



How data were  
calculated  
written at left,  
with references

# Florida methods may not work for the Bay

## Florida coastal waters

- Fewer rivers
- Karst geology
- Groundwater inputs
- Carbonate sands
- Everglades/cypress
- Generally clearer waters

Average Flow in cubic feet per second (cfs):

1,000 2,500 10,000 50,000 250,000 650,000



## Chesapeake Bay

- More rivers and more diverse river inputs
- More sediment inputs
- Large watershed with mountains and wetlands
- “Incubator”
- Sink, not source, of sediments to/from ocean



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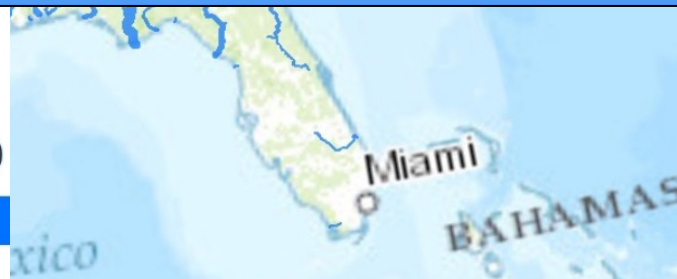
## Chesapeake Bay

- More rivers and more diverse river inputs
- More sediment inputs
- Large watershed with mountains and wetlands
- “Incubator”
- Sink, not source, of sediments to/from ocean

Different components blocking light, affecting ocean color

Average Flow in cubic feet per second (cfs):

1,000 2,500 10,000 50,000 250,000 650,000



# The “4-H” Resolution Compromise

## Satellite Comparison for bloom applications

Example: Goal here is Chl-a fluorescence (red and near-infrared) to monitor phytoplankton blooms.

Applies somewhat to water clarity as well.

Satellite	Spatial	Temporal	Key Spectral
MERIS 2002-12 OLCI Sentinel-3a 2016-	300 m <i>OK</i>	2 day <i>good</i>	10 (5 on red edge) <i>good</i>
MODIS high res Terra 1999; Aqua 2002	250/500 m <i>OK</i>	1-2 day <i>good</i>	4 (1 red, 1 NIR) <i>marginal</i>
MODIS low res	1 km <i>poor</i>	1-2 day <i>good</i>	7-8 (2 in red edge) <i>OK</i>
Landsat	30 m <i>good</i>	8 or 16 day <i>poor</i>	4 (1 red, 1 NIR) <i>marginal</i>
Sentinel-2 (2015)	20 m <i>good</i>	10 day (5 day with 2 <sup>nd</sup> satellite, launch in 2017) <i>Potential with 2</i>	5 (1 red; 2 NIR, 1 in red edge) <i>potential</i>



Clouds take out 1/2 to 2/3 of imagery

Some sunglint is not a problem for our algorithms

Minimum resolution, 3 pixels across (2 mixed land/water)

Powerpoint Slide by Richard Stumpf, 2017

# Future satellite missions for water clarity



1km spatial res.  
~Daily overpass  
Hyperspectral  
Polarization  
“SeaWiFS-like”



~100m spatial res.  
~Daily overpass  
Hyperspectral  
“Landsat-like”

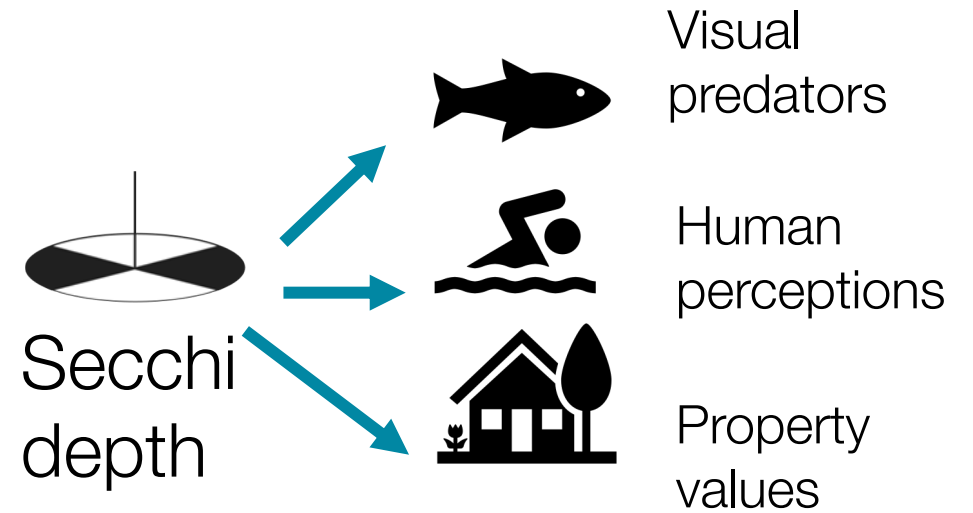
I am involved in: PACE Science and Applications Team  
PACE Early Adopters

# A note on “Water Clarity”

→ Use the best measurement for the specific research or management needs/goals.

Applying this to satellite data...

→ VALIDATE with the measurement that is ultimately most needed.



# Summary

## Advantages

- Synoptic coverage
- Already in orbit, low cost, freely available
- High temporal, spatial resolution
- Estimates possible

## Disadvantages

- Clarity in the Bay is complicated *in situ*, things like  $K_d$ , Secchi are decoupled
- Optically complex, Chl-a looks like CDOM
- Lower accuracy

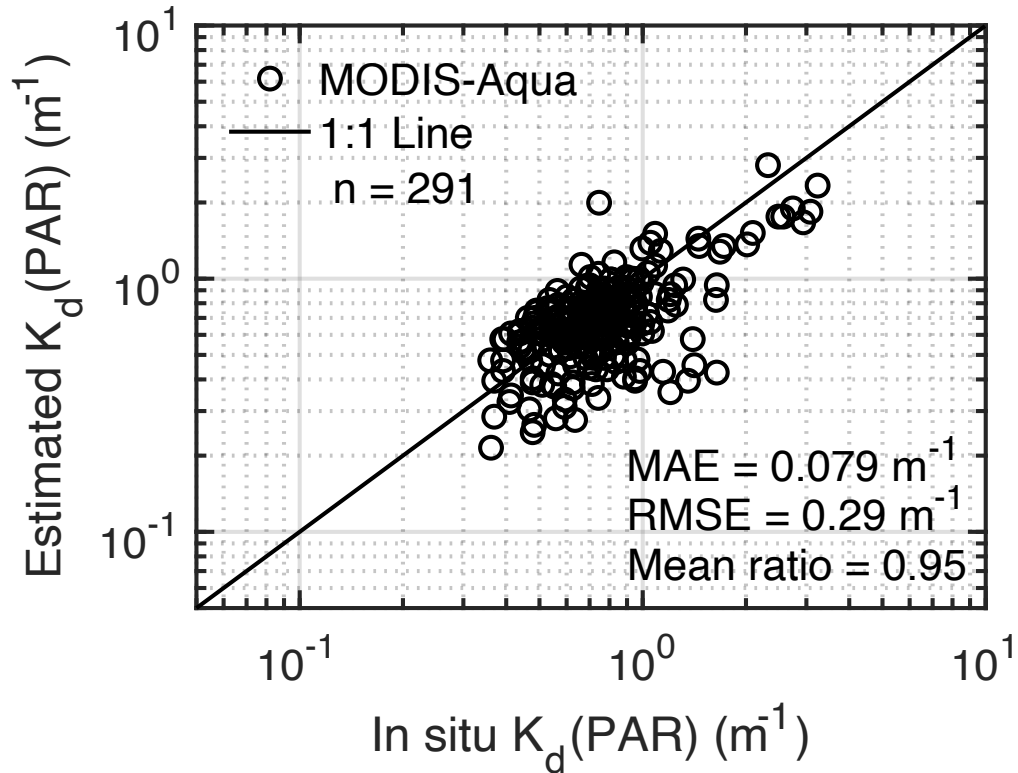
Ask me about: Bibliography of water clarity algorithms for Chesapeake Bay

Thank you.  
Questions?

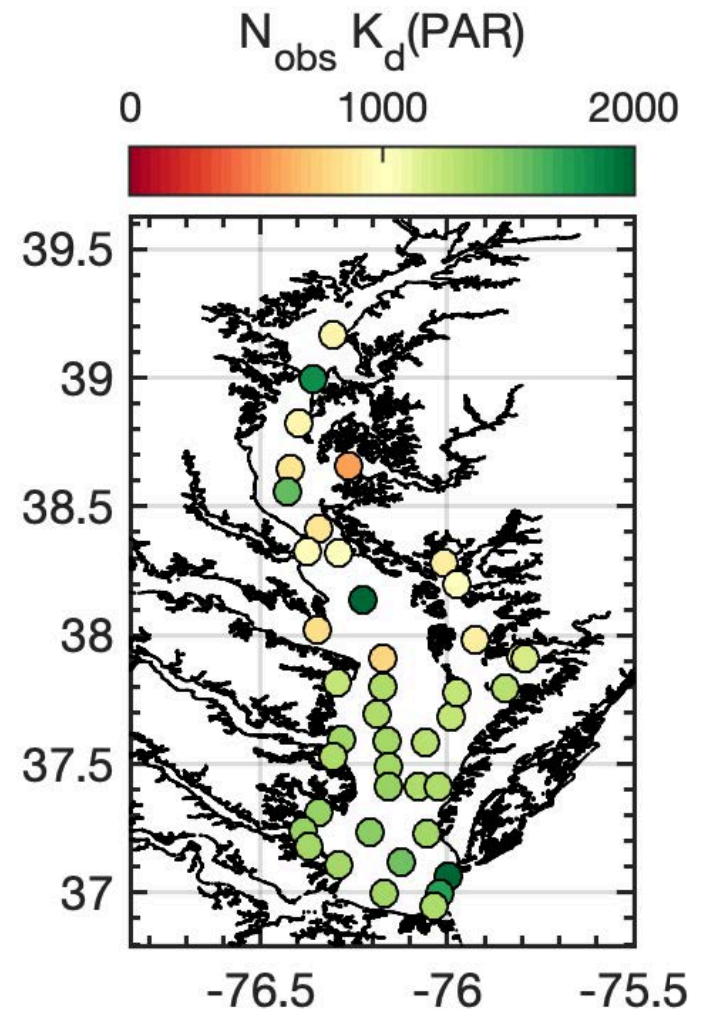
Contact: [jturner@uconn.edu](mailto:jturner@uconn.edu)

Extra slides

# Validation



Chesapeake Bay  $K_d(\text{PAR})$  skill of MODIS-Aqua retrievals 2002-2007 compared to in situ CBP measurements. Adapted from Wang et al. (2009).



Number of in situ  $K_d(\text{PAR})$  CBP observations 1984-2019 at 42 stations.  $N = 12,022$  observations between 1984 and 2019.



# Even in situ data has its issues with defining what is “clarity”

- Make sure to validate over multiple tides, seasons, dry/wet years to be sure the algorithm works for the answer you want.