

Using A Satellite to Help Us Evaluate the Impacts of Oyster Restoration: A Perspective From Above

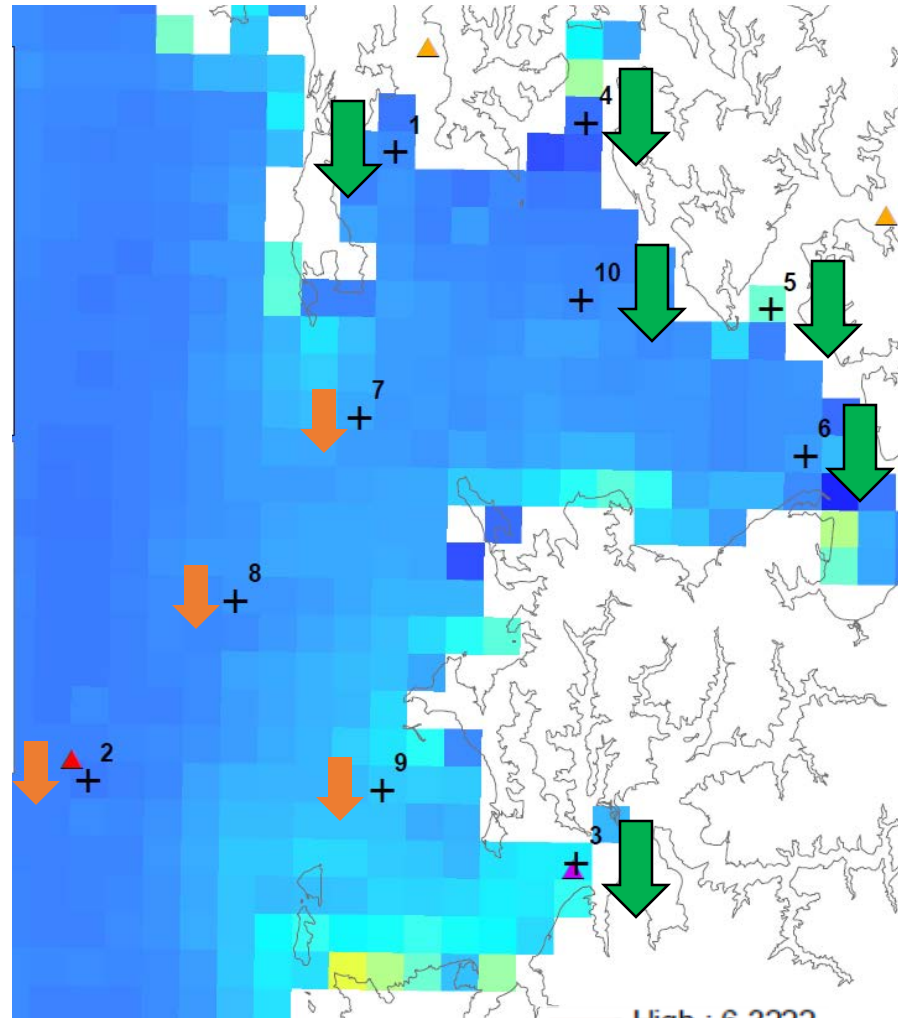
A NESDIS/NMFS Collaboration &
Contribution to the Choptank HFA Water Column Habitat Study

Sept 27, 2018

Jay Lazar, Ron Vogel, David Bruce & Andy McGowan

Satellite Turbidity at Selected Stations over Time

Monthly Turbidity Averages Oct 2010 – Mar 2016



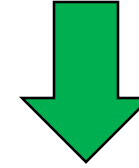
Satellite turbidity (m^{-1})

Jan 2016 monthly avg

Top 1m water

High : 6.3222
Low : 0.0424

Bay_shoreline



Creek influenced

2010 – 2013

Small increase in turbidity

2013 – 2016

Decrease in turbidity (few steep drops)



Main stem influenced

2010 - 2013

Decrease in turbidity

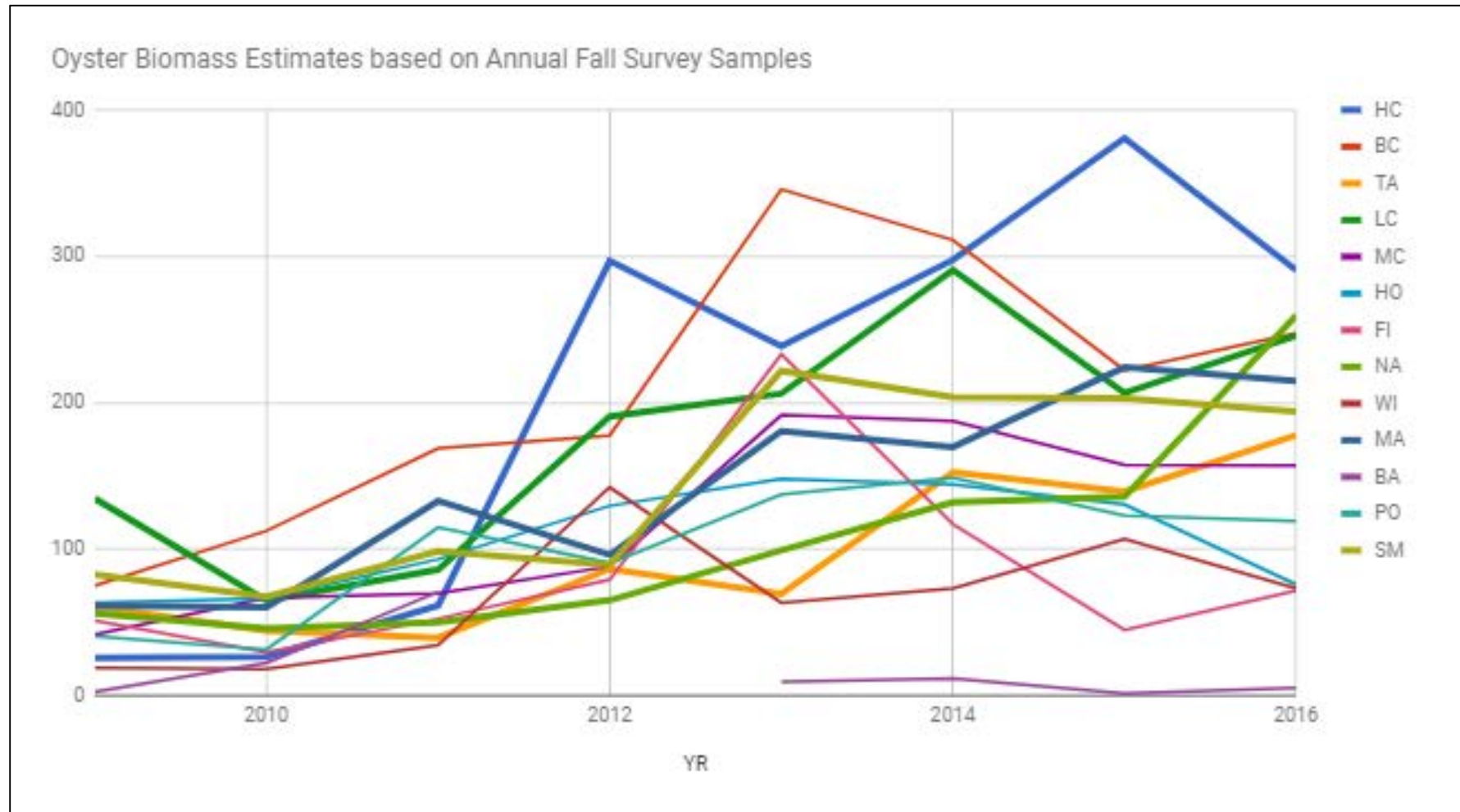
2013 – 2016

Small decrease or no change



Mean Oyster Biomass* by Area from Oyster Annual Fall Survey (AFS) over Time

Biomass Estimates using a *modified formula by NOAA (Fall 2009 – Fall 2016)

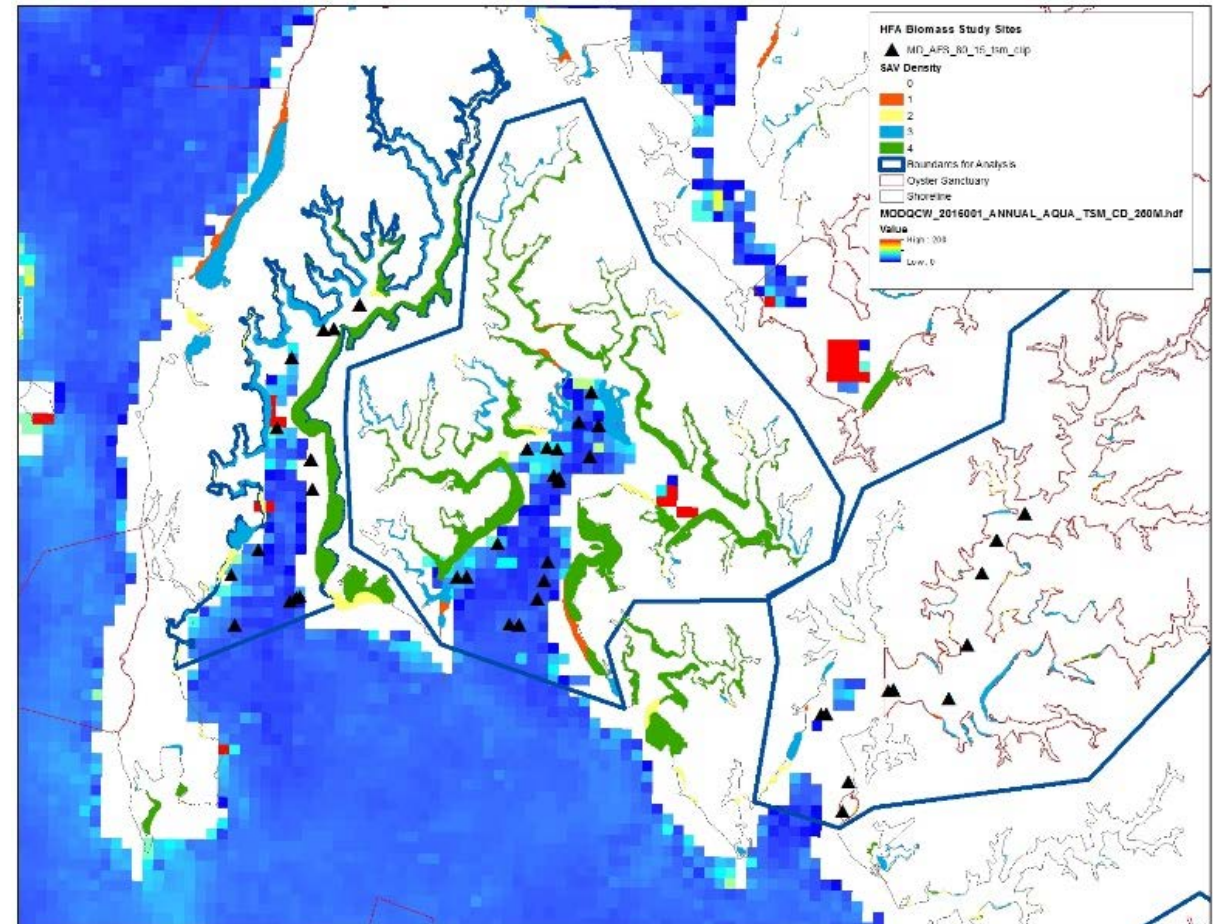


Does oyster restoration improve water clarity?

Public interest in socioeconomic value of oyster restoration

- Use satellite total suspended matter concentration (TSM) as an indicator of water clarity (250m resolution)
- Compare with MD DNR Annual Fall Survey oyster biomass
- Compare with VIMS aerial overflight SAV coverage
 - SAV has increased substantially in the region over this time period
- Comparisons over 8 years: 2009-2016

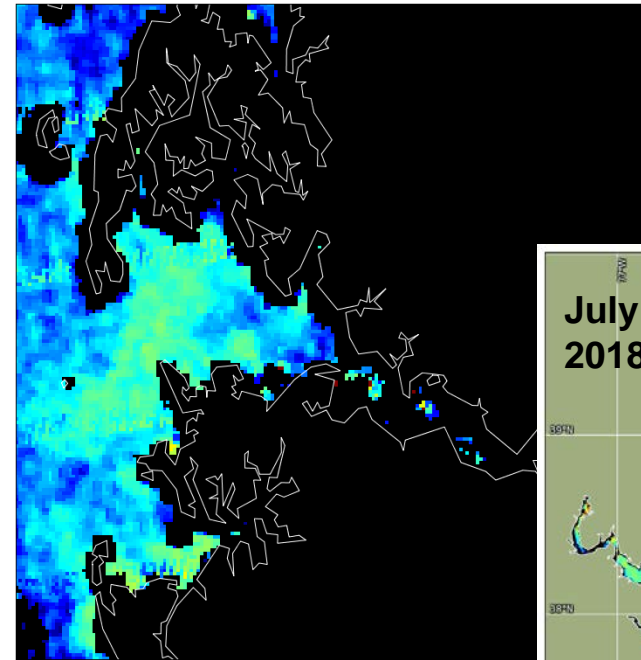
Suspended Matter map, SAV density, Oyster sample locations



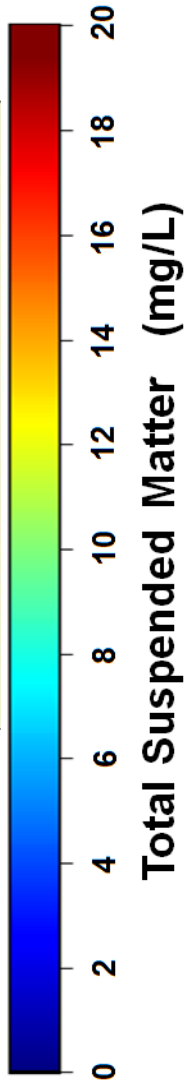
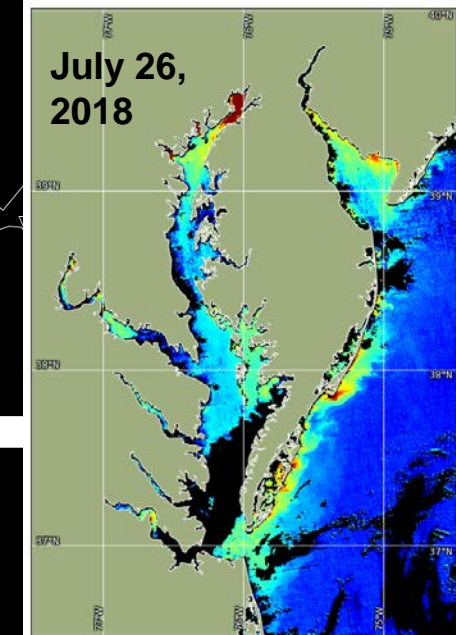
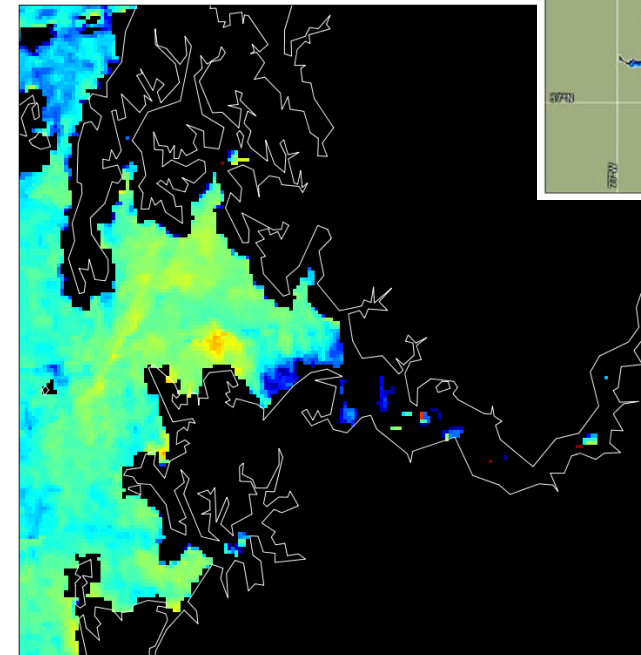
Total Suspended Matter (TSM) from Satellite

- Sediment concentration (mg/L) in surface water (top 1m)
- TSM algorithm specifically developed by NOAA for Chesapeake Bay (Ondrusek et al., 2012)
- Once daily observation (from a single satellite)
 - Clouds cause missing data
- Provides spatial overview
 - Detect spatial patterns
- Monitor change over time
- 250 m spatial resolution
- Data from NASA's Aqua satellite, MODIS instrument

June 24,
2013



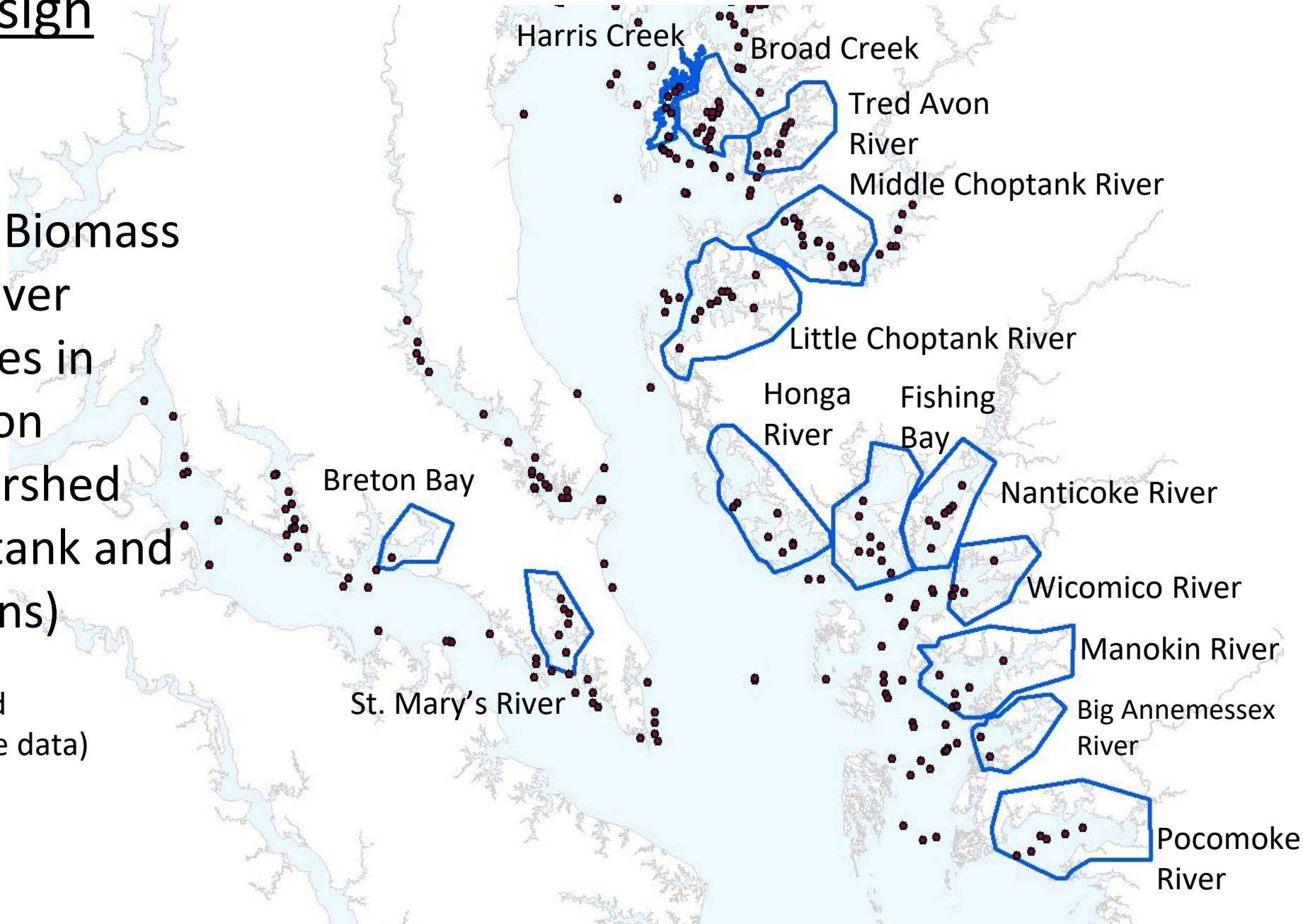
June 26,
2013



“13 Trib” Study Design

- Management Type:
public, sanctuary,
sanctuary with restoration
- High vs Low Oyster Biomass
- High vs Low SAV Cover
- Presumed similarities in
regional precipitation
- Similarities in watershed
sizes (Middle Choptank and
Nanticoke exceptions)

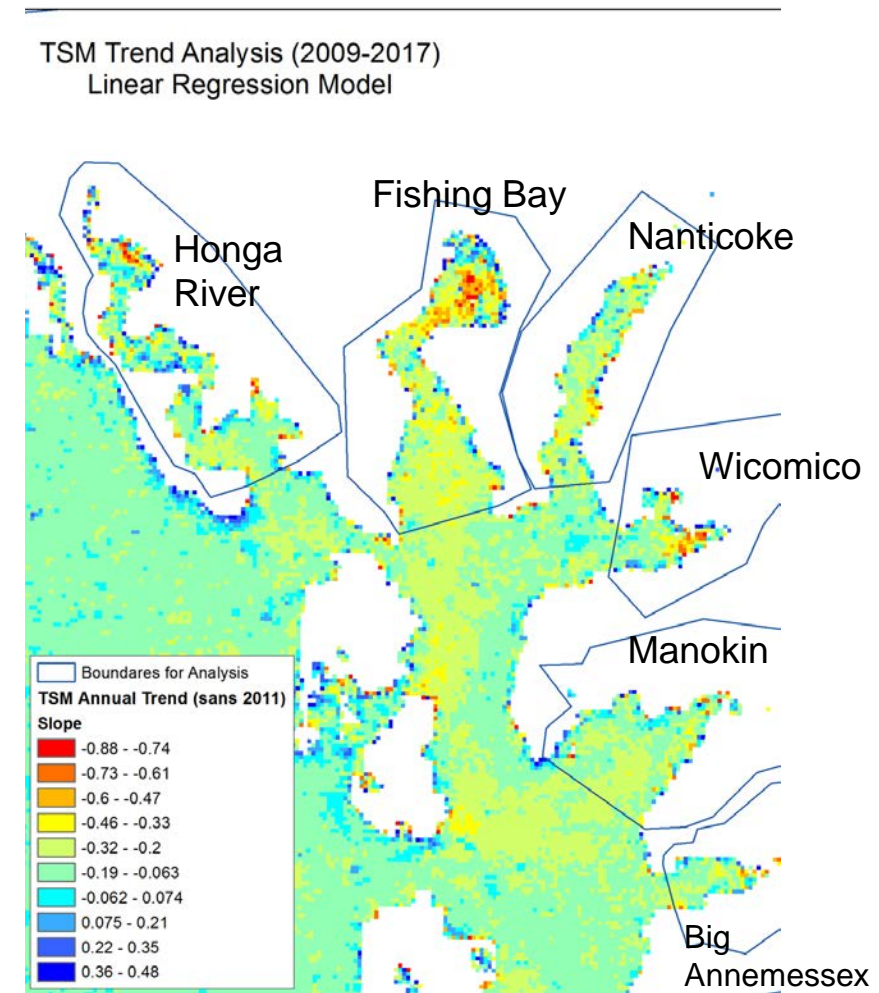
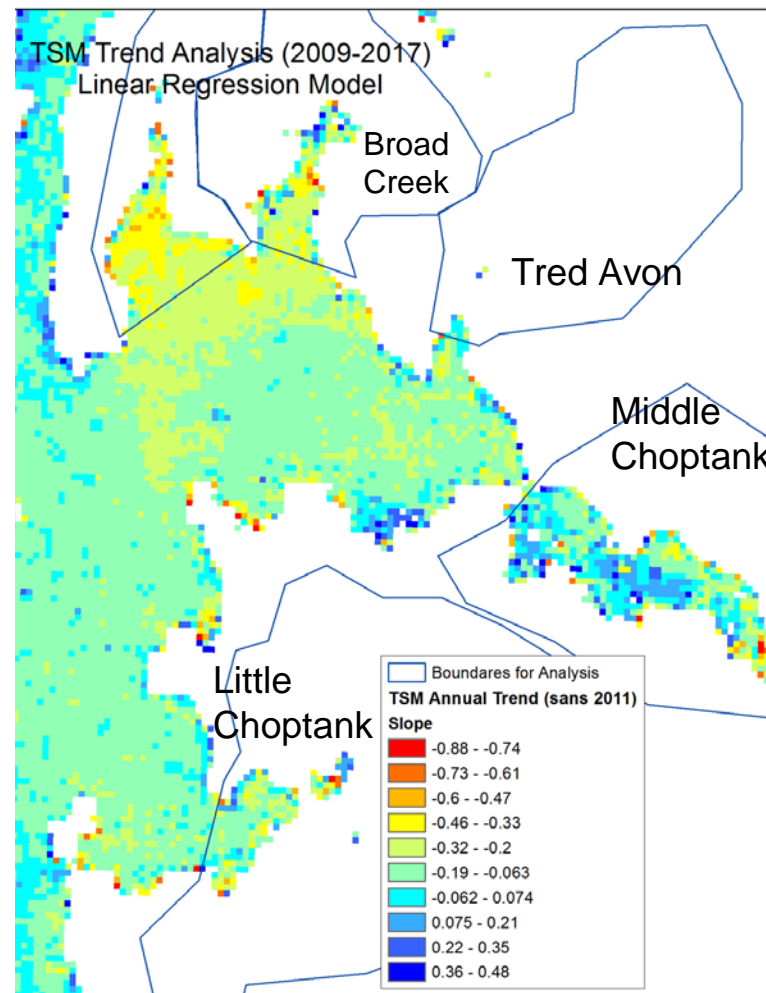
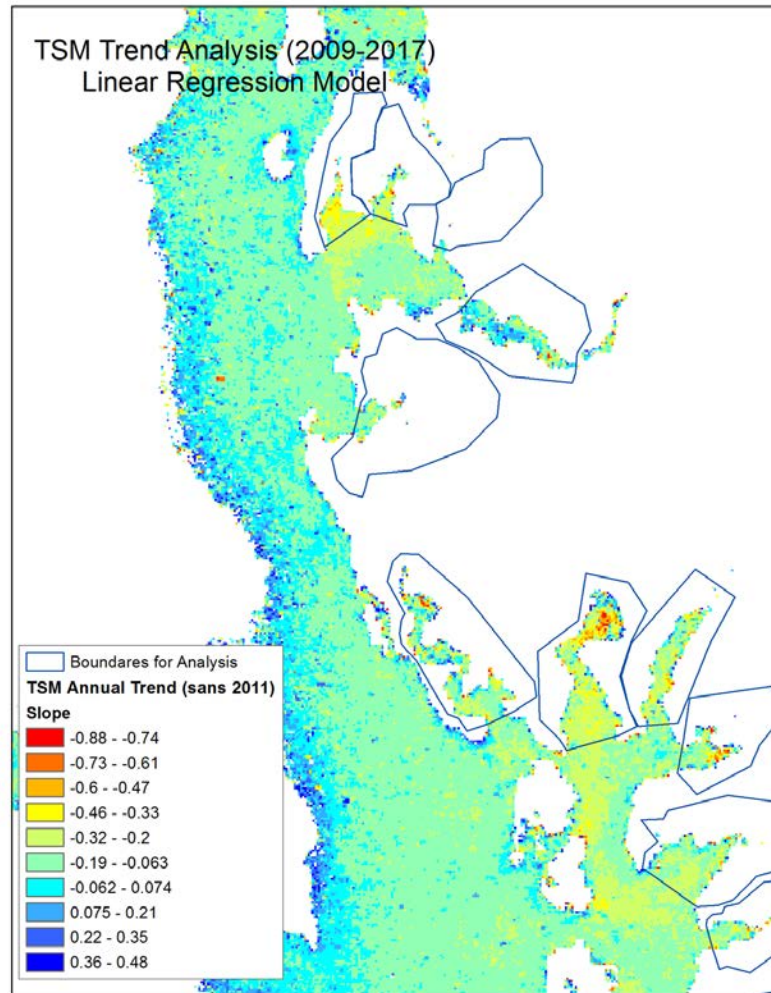
14 Tributaries originally identified
(Breton Bay excluded for too little data)



TSM Over Time:

TSM annual trend for each satellite grid cell, 2009-2017

Slope (mg/L / year)

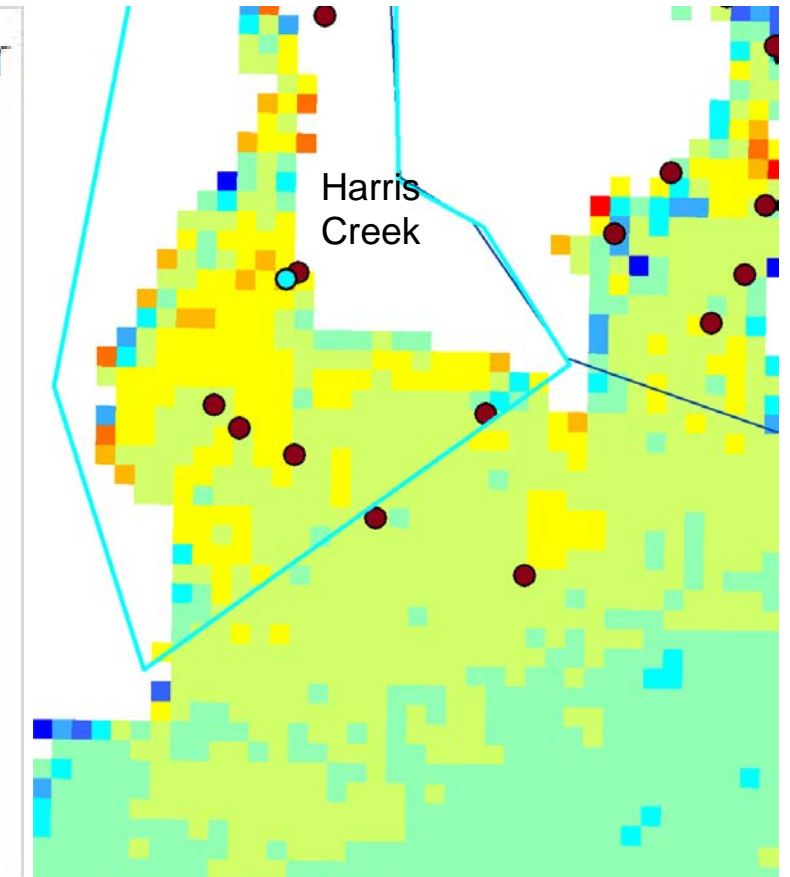
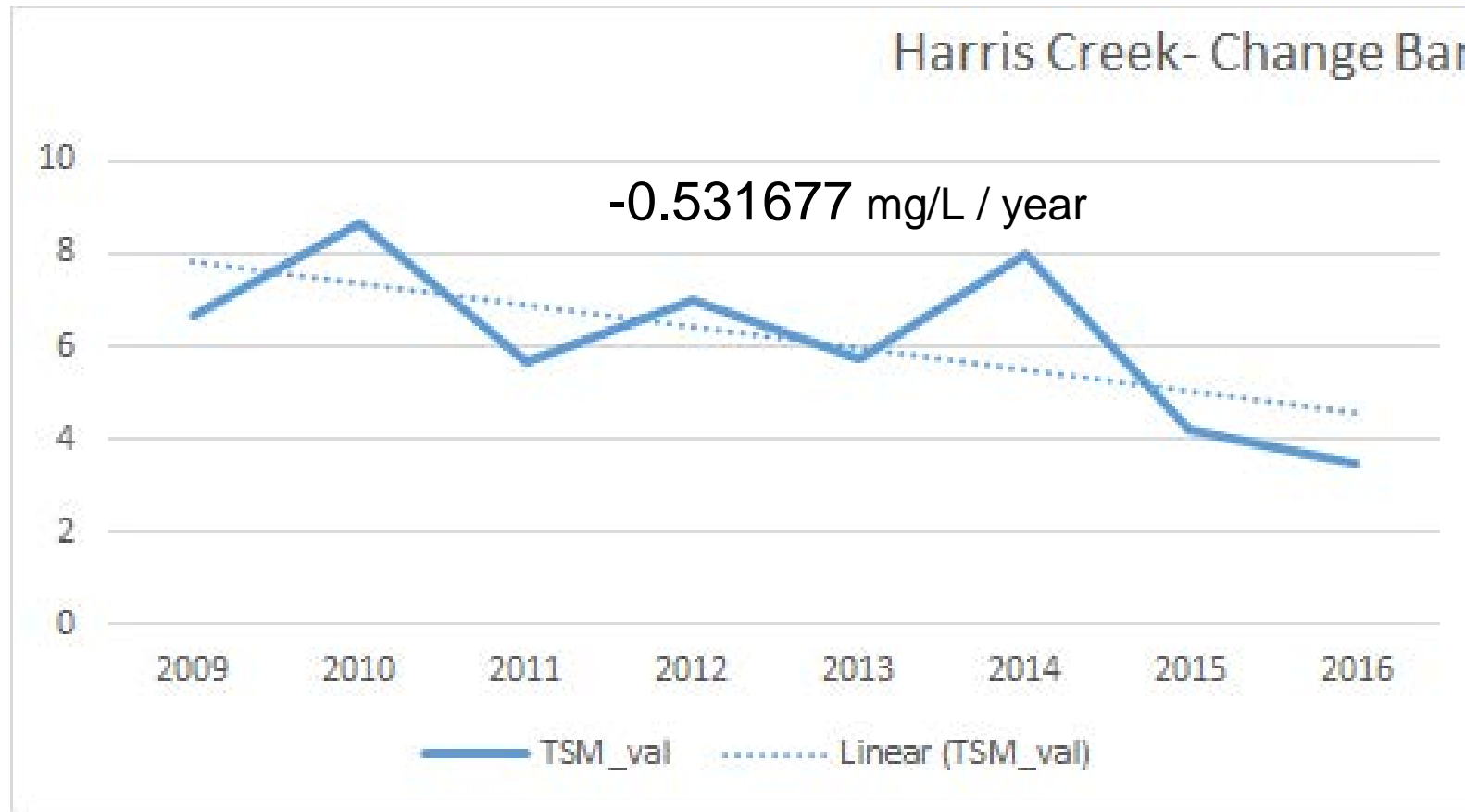


Decreasing TSM slope in Choptank and Tangier Sound



TSM Over Time:

TSM annual trend for each satellite grid cell, 2009-2017
Slope

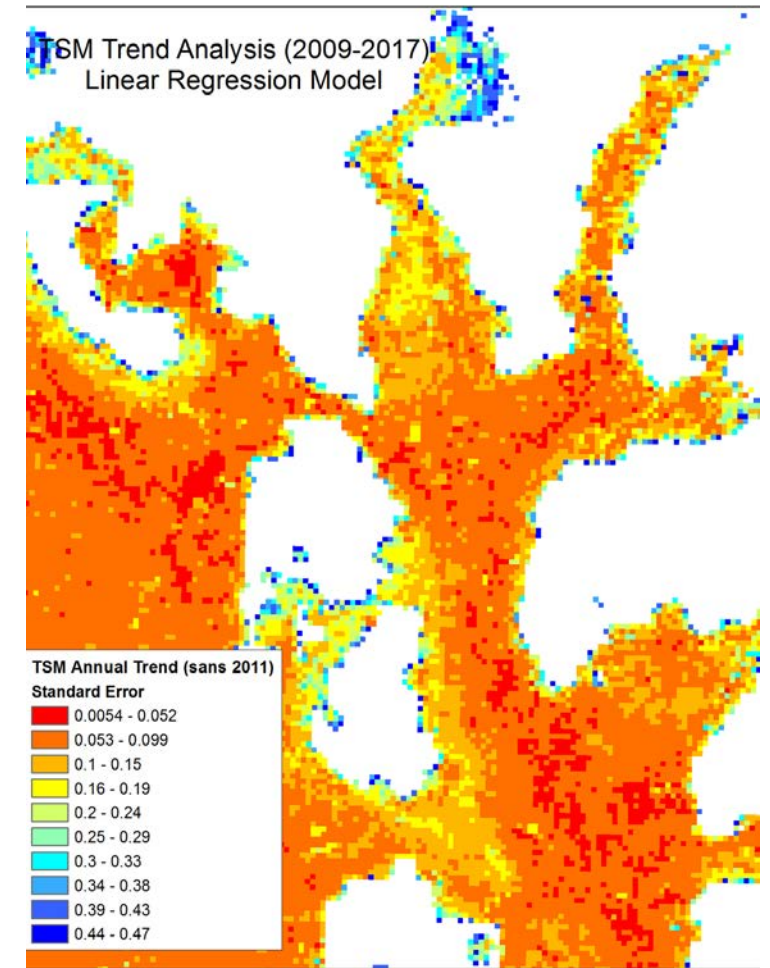
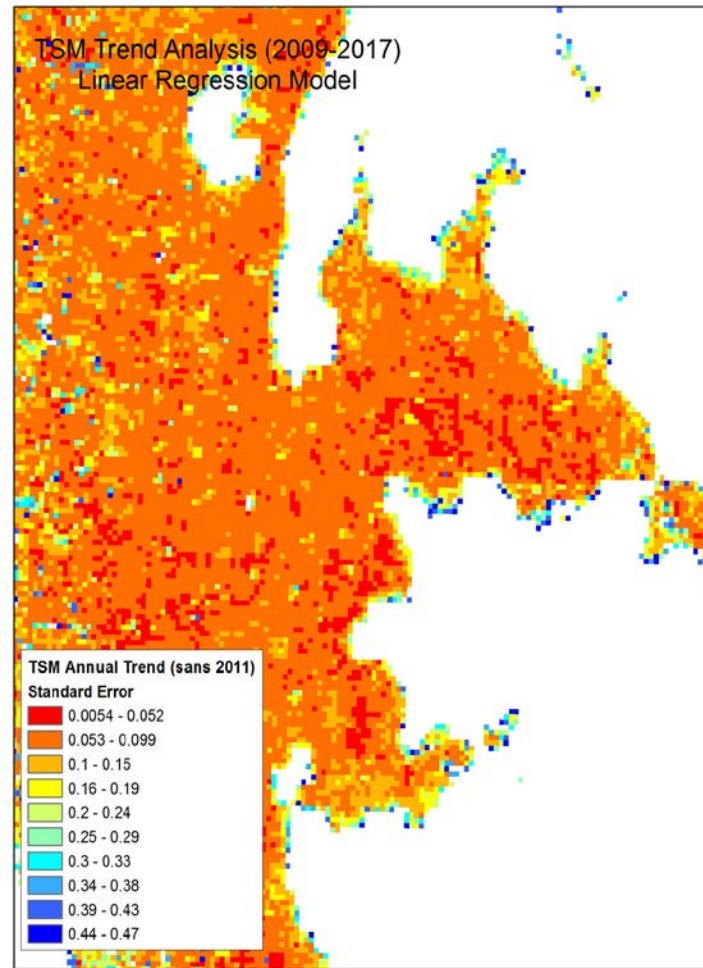
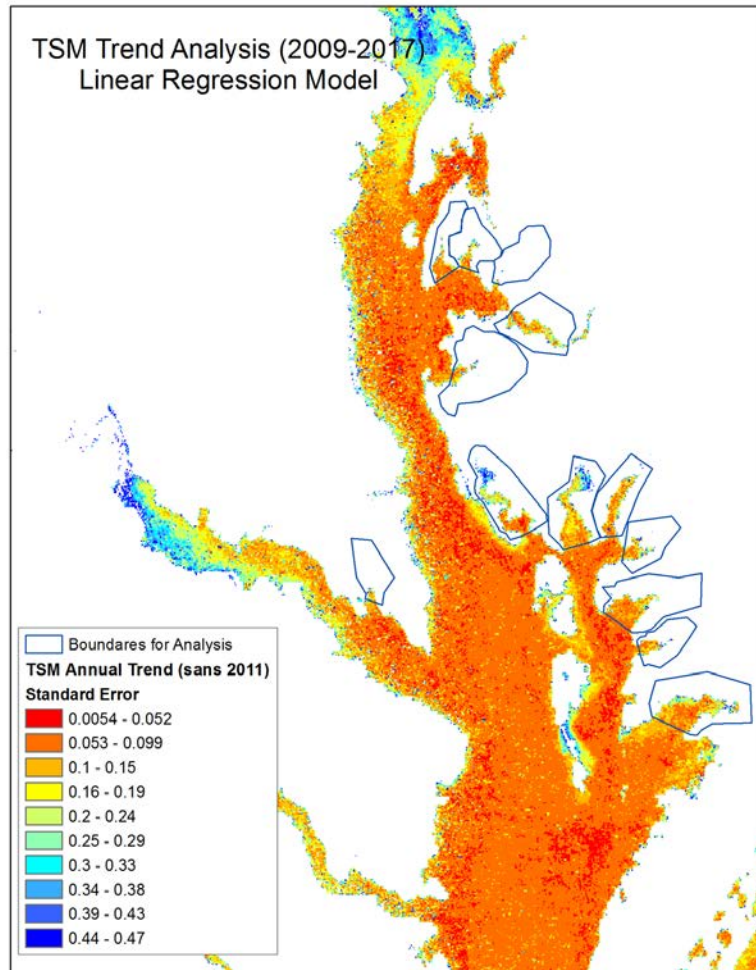


Single grid cell annual trend at AFS sample location (blue circle) on Change Bar oyster restoration site.
Perimeter grid cells have a high amount of variability.
Spatial aggregations of grid cells with consistently high slopes might suggest real TSM decrease.

TSM Over Time:

TSM annual trend for each satellite grid cell, 2009-2017

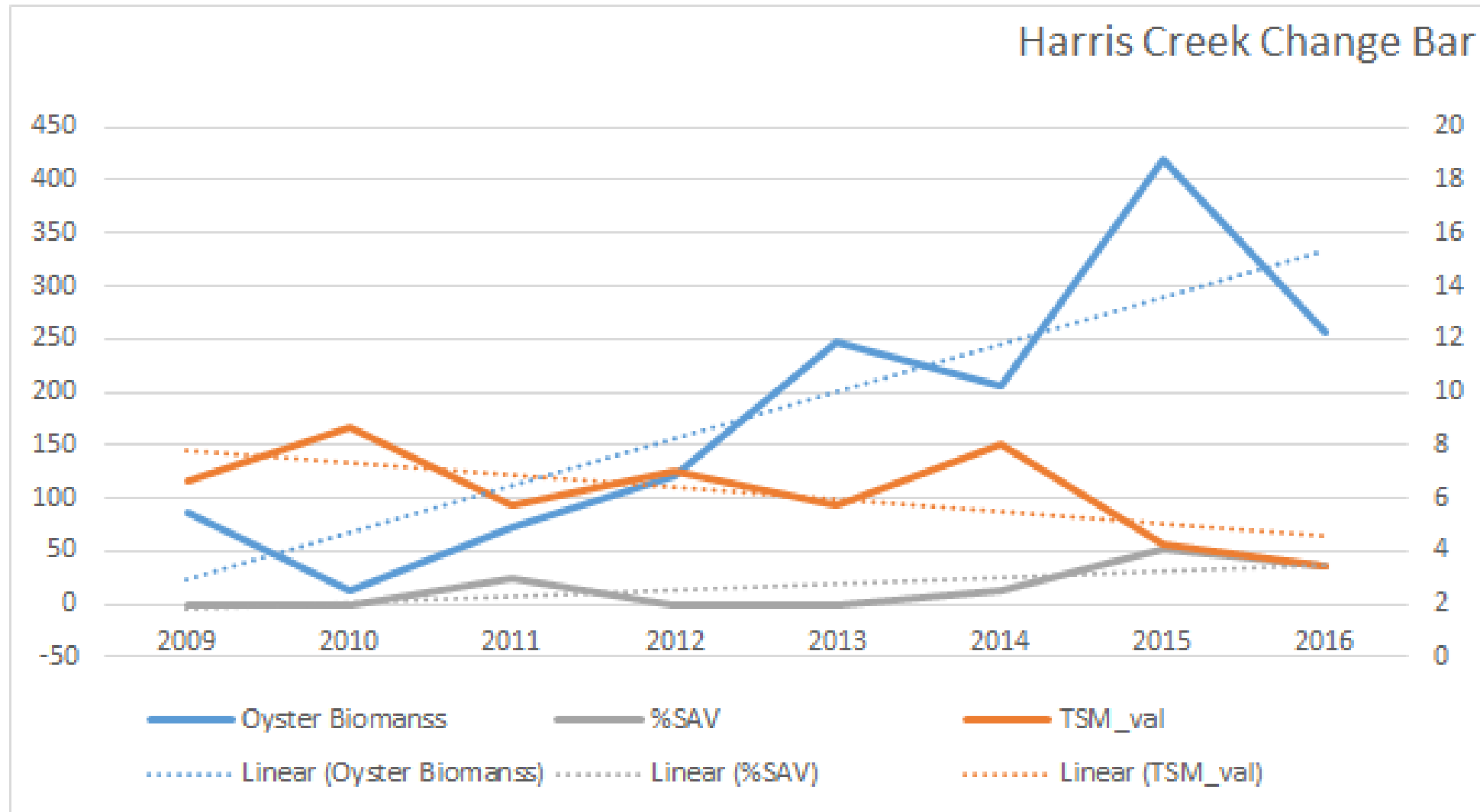
Slope Standard Error (SE) - measure of how well points fit on TSM/yr line



Decreasing TSM slope in Harris and Broad Creeks with small slope SE implies confidence in TSM decrease.
Decreasing TSM slope in Fishing Bay with large slope SE -- TSM decrease not reliable.

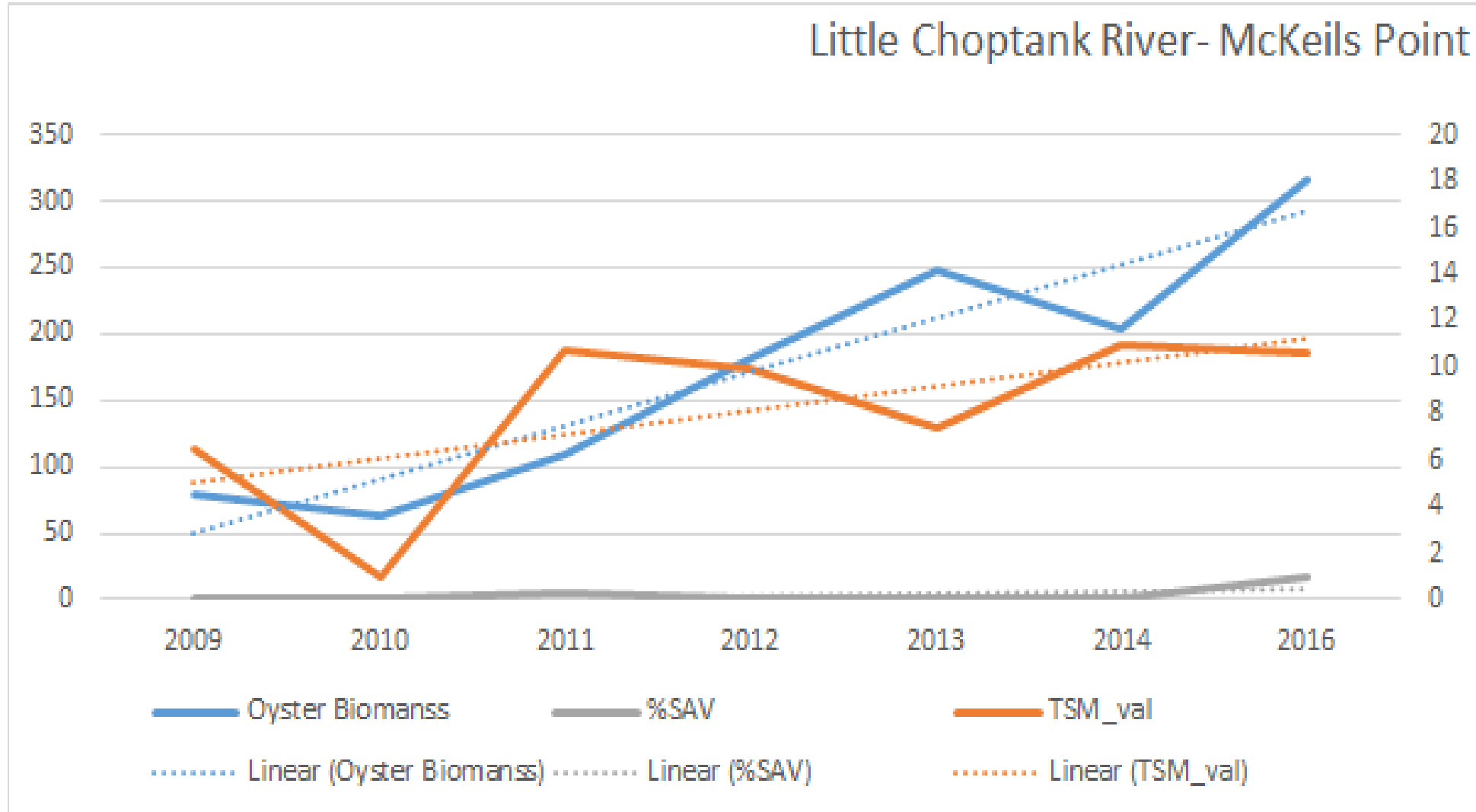
Individual Temporal Trend Plots

(2009-2016, stronger relationships)



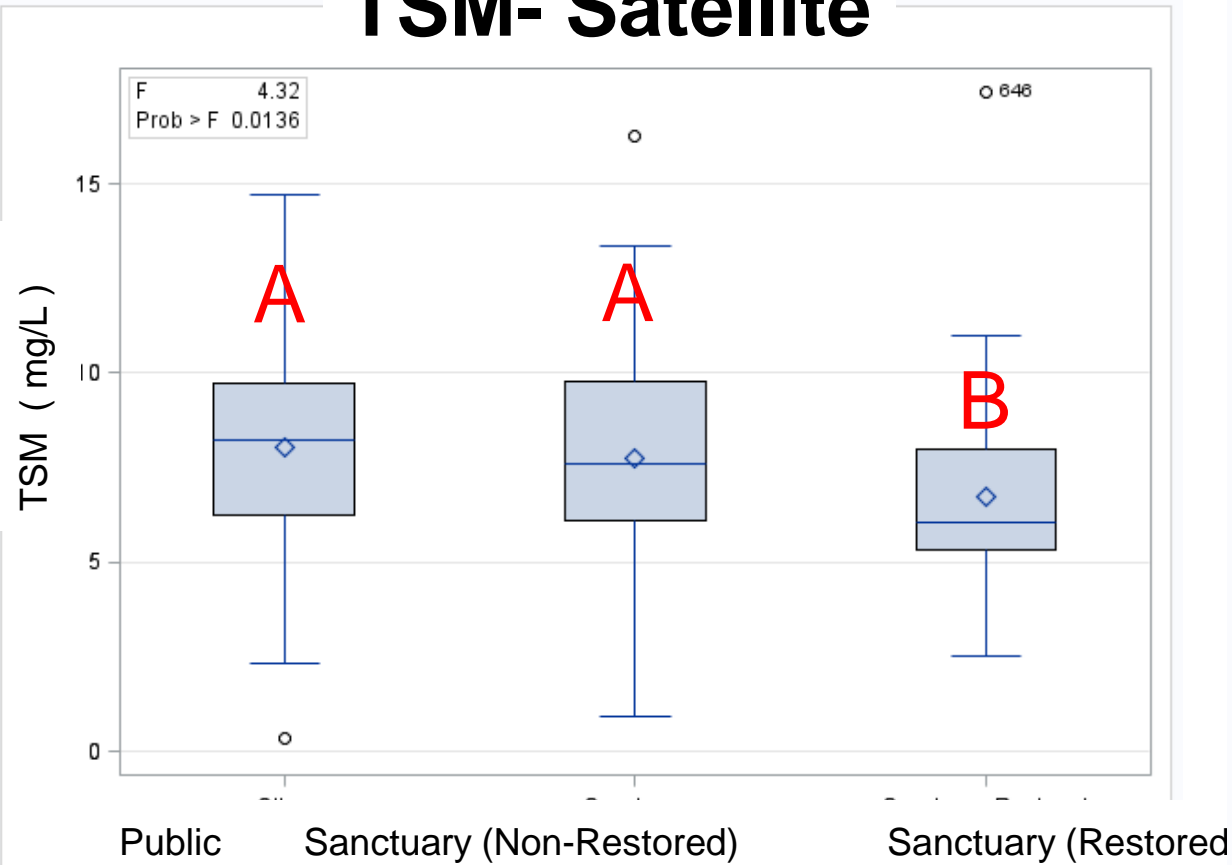
Individual Temporal Trend Plots

(2009-2016, relationships are unclear)

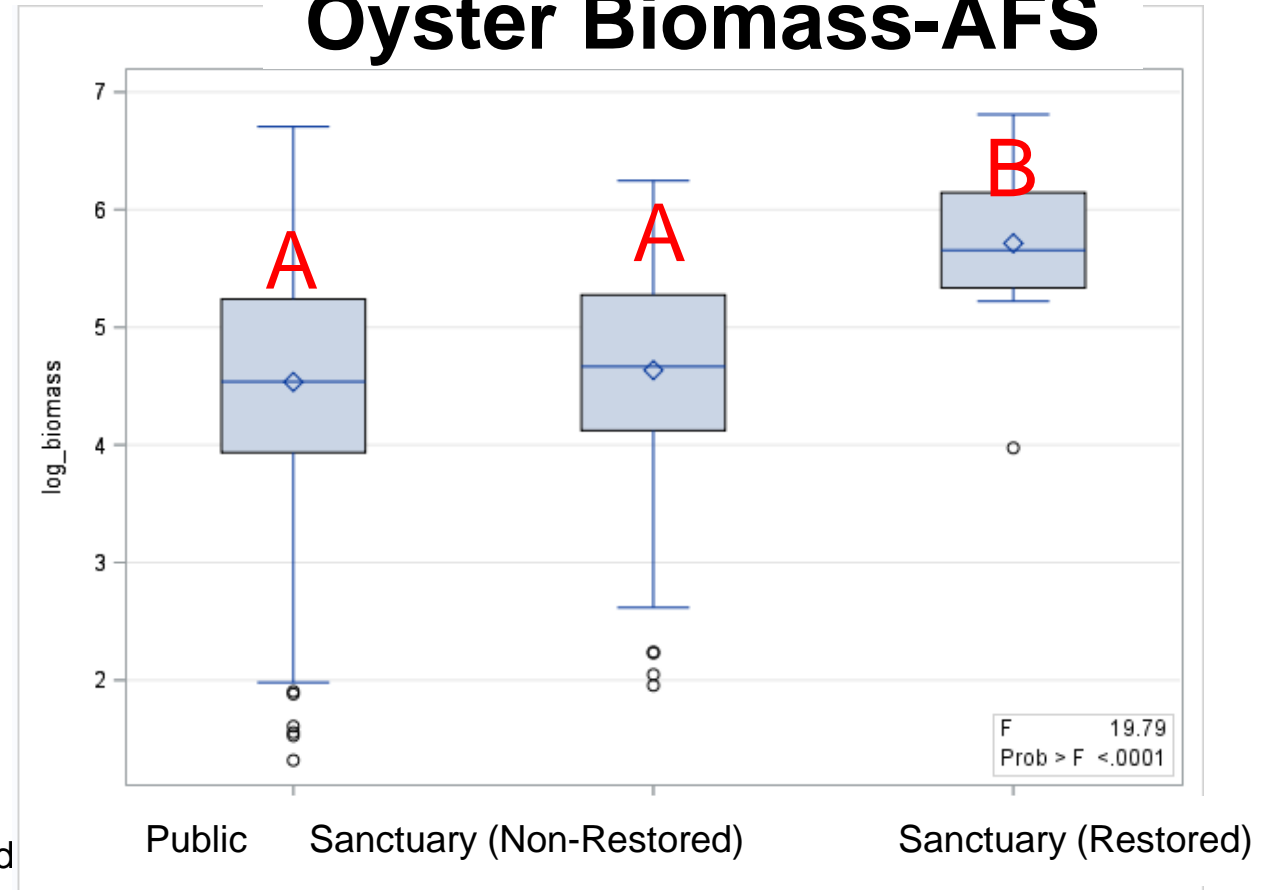


TSM and Oyster Biomass Relative to Oyster Fishery Management Regime

TSM- Satellite

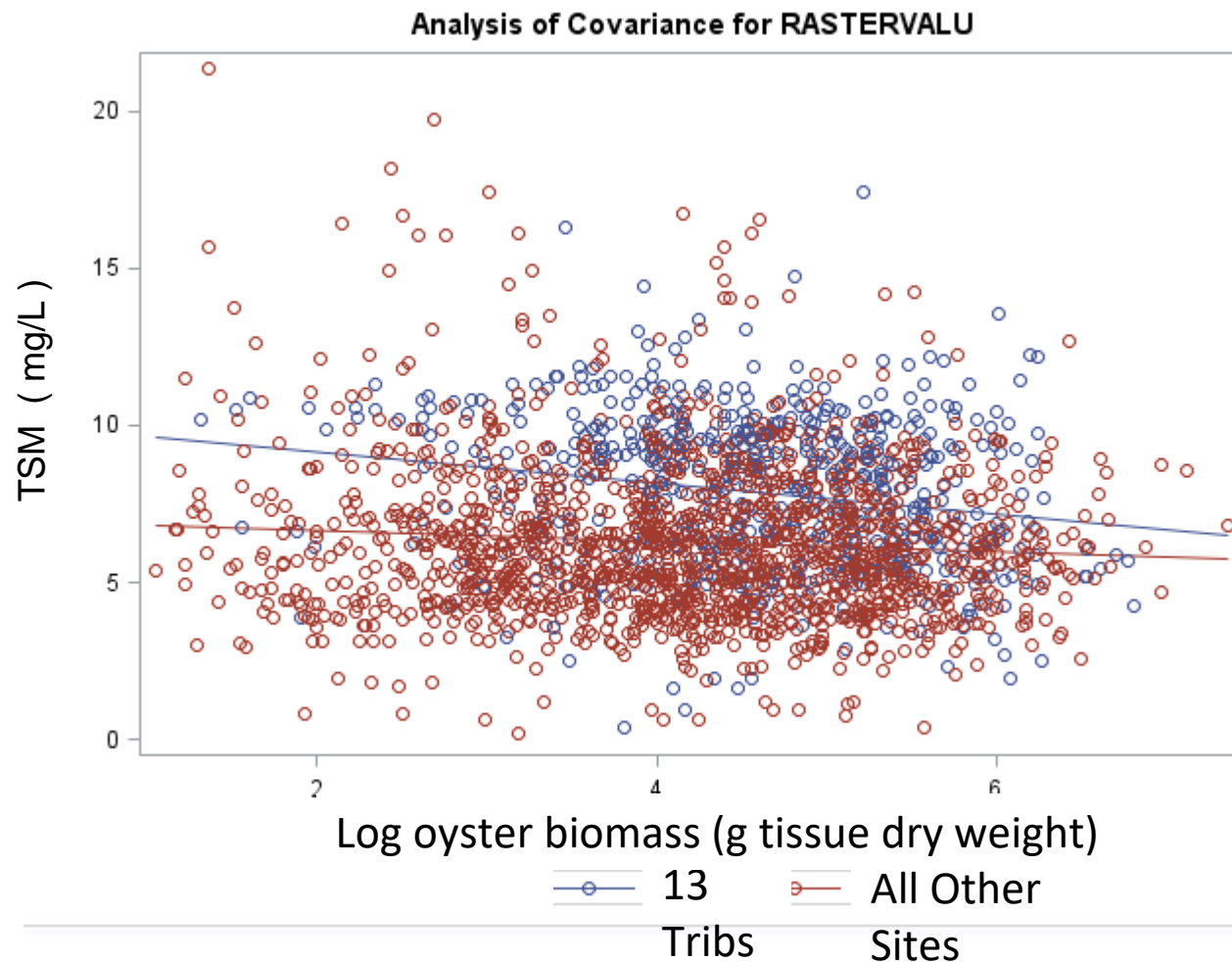


Oyster Biomass-AFS



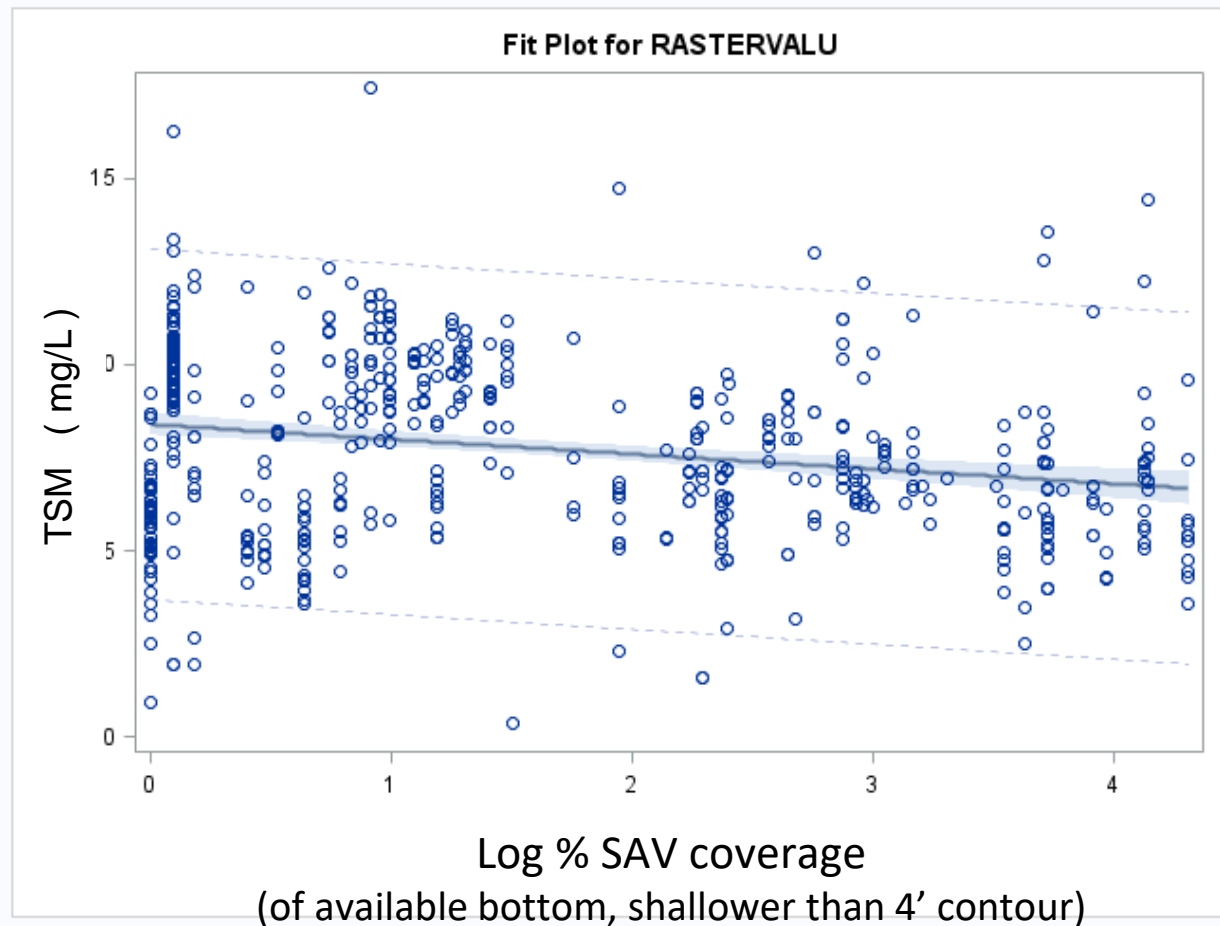
Pairwise comparison (Tukey): different letters have different mean values (alpha = 0.05)

Is there a relationship between TSM and Oyster Biomass?



- Simple regression: $TSM = \log_biomass$
 - 13 Trib sites (blue)
 - Slope = -0.49, $p < 0.0001$
 - $n=601$
 - $r^2 = 0.04$ (4% of TSM variation is explained by oyster biomass)
 - Non-trib sites (red)
 - Slope = -0.17, $p < 0.0024$
 - $n=1468$
 - $r^2 = 0.0006$ (0.06% of TSM variation explained by oyster biomass)
- ANCOVA: the two slope parameters are significantly different ($p=0.0052$)

Is there a relationship between TSM and SAV coverage?



- 13 Trib sites (blue)
- Simple regression: $TSM = \log \% \text{ SAV coverage}$
 - Slope = -0.39, $p < 0.0001$
 - $n=570$
 - $r^2 = 0.05$ (5% of TSM variation is explained by SAV coverage)

What Other Factors contribute to TSM variability?

Q: Does TSM vary relative oyster biomass, SAV percent, year, and location?

Model: $\text{Rastervalu} = \text{LOG_Sav_val_pct} + \text{log_biomass} + \text{year} + \text{location}$

Zone_13 Only

Remove oyster biomass < 1 values

Analyses since 03/07/2018 Meeting

The GLM Procedure

| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
|-----------------|-----|----------------|-------------|---------|--------|
| Model | 13 | 1744.765004 | 134.212693 | 44.45 | <.0001 |
| Error | 556 | 1678.791999 | 3.019410 | | |
| Corrected Total | 569 | 3423.557003 | | | |

| R-Square | Coeff Var | Root MSE | RASTERVALU Mean |
|----------|-----------|----------|-----------------|
| 0.509635 | 22.37617 | 1.737645 | 7.765607 |

| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|-----------------|----|-------------|-------------|---------|--------|
| LOG_Sav_val_pct | 1 | 168.055724 | 168.055724 | 55.66 | <.0001 |
| log_biomass | 1 | 49.893136 | 49.893136 | 16.52 | <.0001 |
| Zones_13 | 10 | 1510.664876 | 151.066488 | 50.03 | <.0001 |
| Year | 1 | 16.151268 | 16.151268 | 5.35 | 0.0211 |

| Source | DF | Type III SS | Mean Square | F Value | Pr > F |
|-----------------|----|-------------|-------------|---------|--------|
| LOG_Sav_val_pct | 1 | 0.876608 | 0.876608 | 0.29 | 0.5902 |
| log_biomass | 1 | 1.767920 | 1.767920 | 0.59 | 0.4445 |
| Zones_13 | 10 | 1514.976069 | 151.497607 | 50.17 | <.0001 |
| Year | 1 | 16.151268 | 16.151268 | 5.35 | 0.0211 |

General Linear Model (GLM) analysis:
Evaluate TSM against Time, Location, Oyster Biomass, SAV

Sum of Squares statistics(SS)

Type III SS: Considers all independent variables together

- When all variables are in the model TSM varies significantly only with Location (Zones_13) and Year (p values < 0.05)

What Other Factors contribute to TSM variability: Location

Q: Does TSM vary relative to location?

Model: Rastervalu = location

Zone_13 Only

Remove oyster biomass < 1 values

Analyses since 03/07/2018 Meeting

The GLM Procedure

| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
|-----------------|-----|----------------|-------------|---------|--------|
| Model | 11 | 1802.444453 | 163.858587 | 56.27 | <.0001 |
| Error | 589 | 1715.253592 | 2.912145 | | |
| Corrected Total | 600 | 3517.698045 | | | |

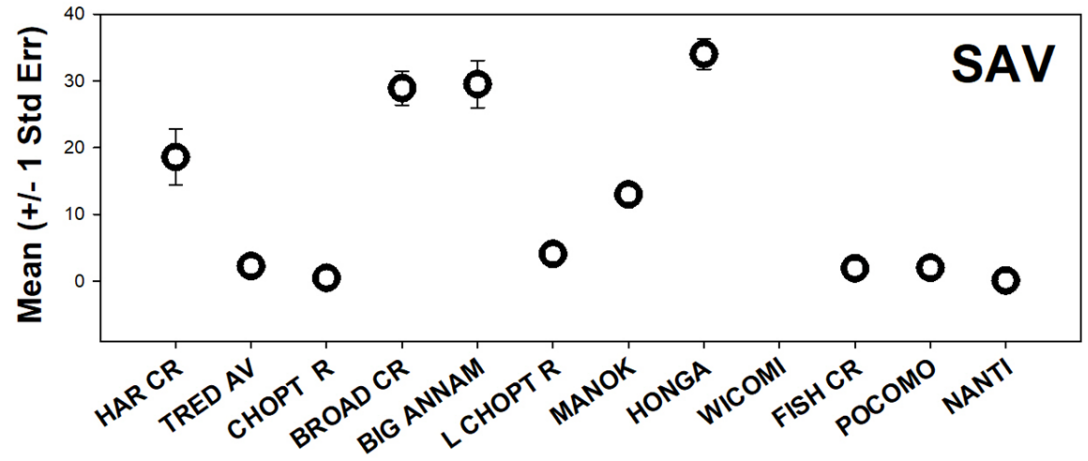
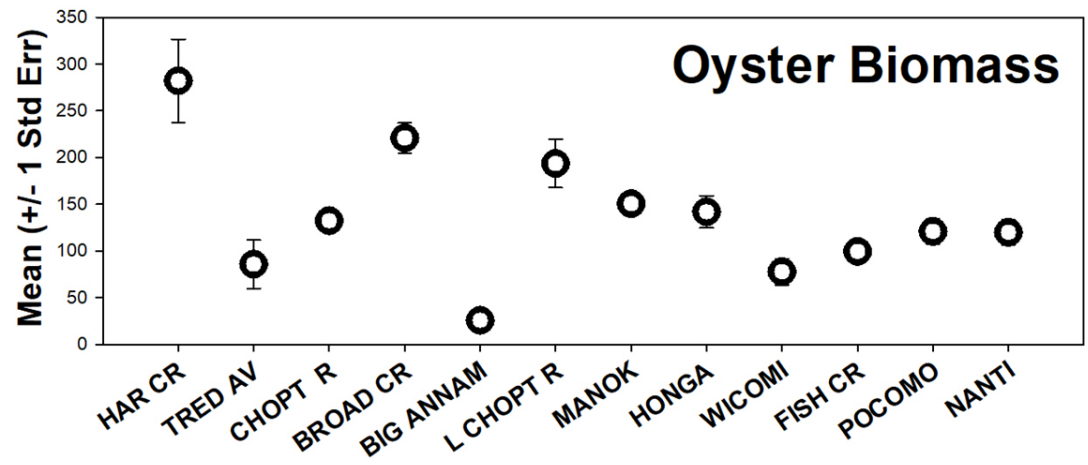
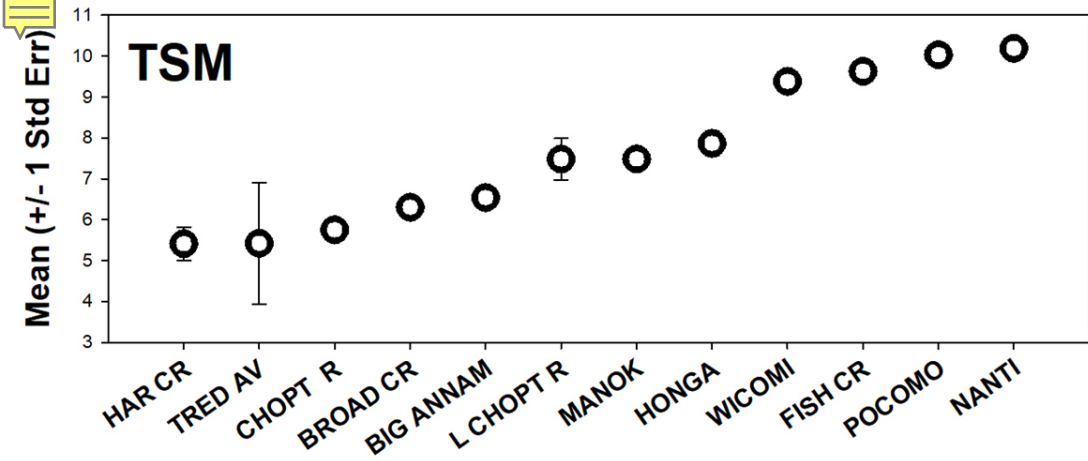
| R-Square | Coeff Var | Root MSE | RASTERVALU Mean |
|----------|-----------|----------|-----------------|
| 0.512393 | 21.74199 | 1.706501 | 7.848871 |

| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|----------|----|-------------|-------------|---------|--------|
| Zones_13 | 11 | 1802.444453 | 163.858587 | 56.27 | <.0001 |

| Source | DF | Type III SS | Mean Square | F Value | Pr > F |
|----------|----|-------------|-------------|---------|--------|
| Zones_13 | 11 | 1802.444453 | 163.858587 | 56.27 | <.0001 |

Single Term GLM: Location Only

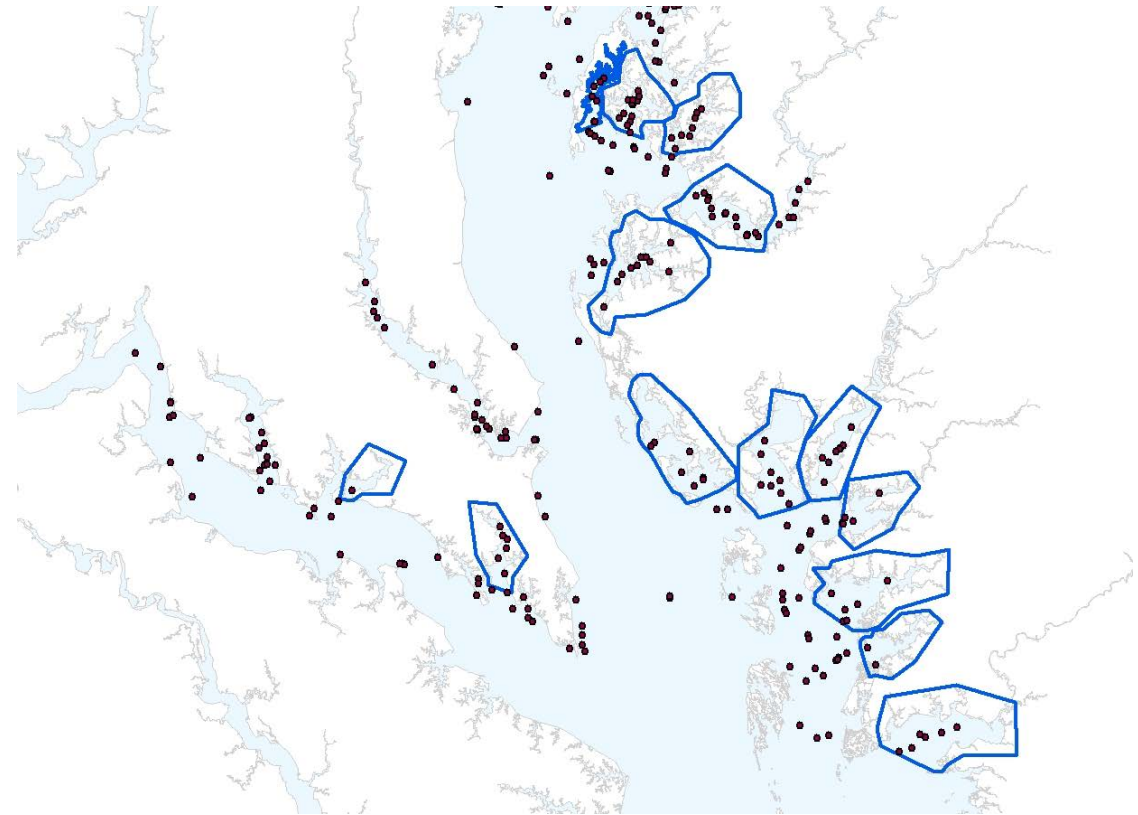
R² – Location (Zones_13) explains **51%** of the variation in TSM



Data Summary by location “13 Tribs”

Lowest TSM values:

Harris Creek, Tred Avon River, Choptank River, Broad Creek, & Big Anamessex River



Summary

- Satellites are a good method of observing large-scale spatial and temporal patterns in water clarity
- Recent Oyster Biomass and SAV trends are improving over time (AFS & VIMS survey)
- Temporal TSM trend suggests a water quality improvement in Harris and Broad Creeks, and some parts of Tangier Sound, but no cause is implied
- TSM values are significantly higher on Public areas than Restored Sanctuary Management Areas. Inverse relationship for oyster biomass
- TSM decreases significantly with increased Oyster Biomass and increased SAV
- Oyster Biomass explains 4% of TSM variability; SAV explains 5% of TSM variability; unknown Location effects explain 51% of TSM variability

Next Steps?

- Examine additional location effects: land use, precipitation, basin morphology, wind vs. water depth, bay circulation patterns
- Explore using oyster abundance datasets other than AFS that are increasingly becoming available from Sanctuary and Restoration monitoring efforts
 - AFS may not do a great job of quantifying oyster biomass (length converted to biomass may introduce error)
- Revisit the TSM/oyster relationship in a few years when restored reefs are mature and restoration is complete

Backup Slides

Question: What is the relationship between Oyster Biomass and TSM for Study Sites?

Q: Does TSM vary relative oyster biomass?

Model: Rastervalu = log_biomass

Zone_13 Only

Remove oyster biomass < 1 values

Analyses since 03/07/2018 Meeting

The GLM Procedure

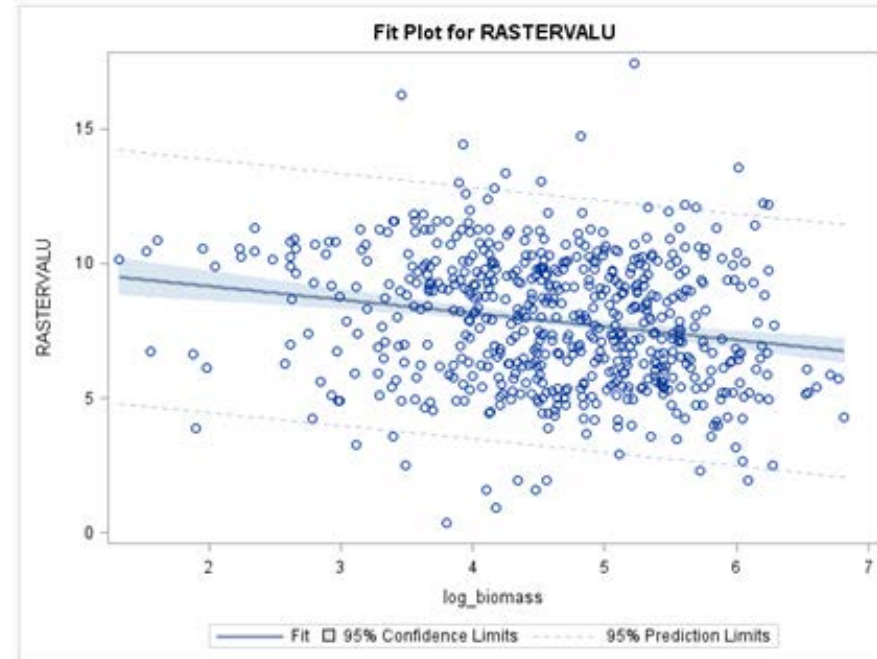
| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
|-----------------|-----|----------------|-------------|---------|--------|
| Model | 1 | 136.335268 | 136.335268 | 24.15 | <.0001 |
| Error | 599 | 3381.362777 | 5.645013 | | |
| Corrected Total | 600 | 3517.698045 | | | |

| R-Square | Coeff Var | Root MSE | RASTERVALU Mean |
|----------|-----------|----------|-----------------|
| 0.038757 | 30.27090 | 2.375924 | 7.848871 |

| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|-------------|----|-------------|-------------|---------|--------|
| log_biomass | 1 | 136.3352676 | 136.3352676 | 24.15 | <.0001 |

| Source | DF | Type III SS | Mean Square | F Value | Pr > F |
|-------------|----|-------------|-------------|---------|--------|
| log_biomass | 1 | 136.3352676 | 136.3352676 | 24.15 | <.0001 |

| Parameter | Estimate | Standard Error | t Value | Pr > t |
|-------------|-------------|----------------|---------|---------|
| Intercept | 10.15550521 | 0.47926256 | 21.19 | <.0001 |
| log_biomass | -0.49946549 | 0.10163279 | -4.91 | <.0001 |



- Removed oyster biomass values that = 0
- TSM declines significantly with Biomass (oyster)
- Slope = -0.499
- Biomass explains ~4% of the variability in TSM (r^2)
- Slope parameters (-0.413, -0.499) and r^2 (0.054, 0.039) are similar for the SAV and Biomass models respectively

Question: Is there a relationship between Oyster and SAV?

Q: Does SAV vary relative oyster biomass?

Model: LOG_Sav_val_pct = log_biomass

Zone_13 Only

Remove oyster biomass < 1 values

Analyses since 03/07/2018 Meeting

The GLM Procedure

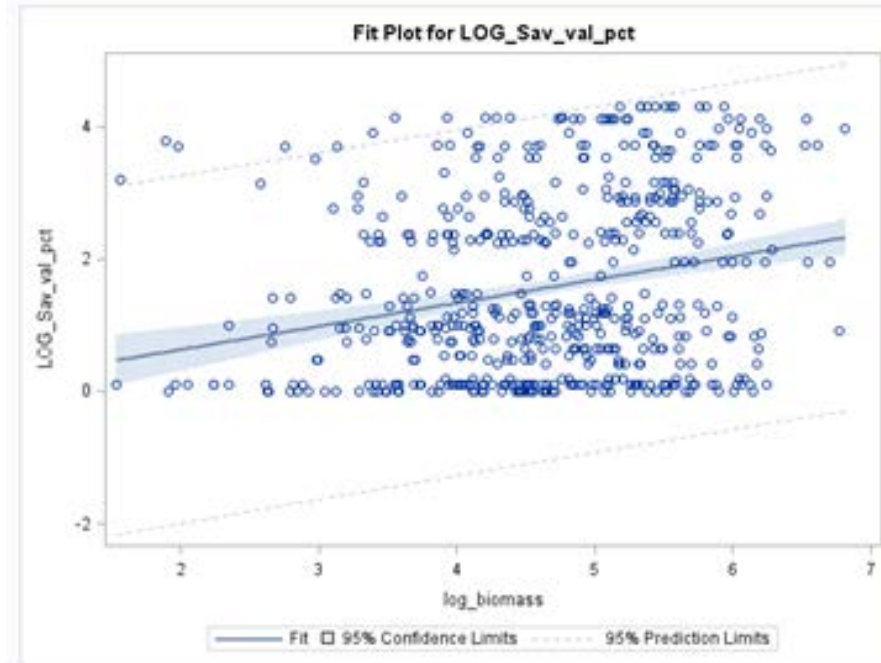
| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
|-----------------|-----|----------------|-------------|---------|--------|
| Model | 1 | 61.614405 | 61.614405 | 34.86 | <.0001 |
| Error | 568 | 1004.059720 | 1.767711 | | |
| Corrected Total | 569 | 1065.674125 | | | |

| R-Square | Coeff Var | Root MSE | LOG_Sav_val_pct Mean |
|----------|-----------|----------|----------------------|
| 0.057817 | 84.61724 | 1.329553 | 1.571255 |

| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|-------------|----|-------------|-------------|---------|--------|
| log_biomass | 1 | 61.61440477 | 61.61440477 | 34.86 | <.0001 |

| Source | DF | Type III SS | Mean Square | F Value | Pr > F |
|-------------|----|-------------|-------------|---------|--------|
| log_biomass | 1 | 61.61440477 | 61.61440477 | 34.86 | <.0001 |

| Parameter | Estimate | Standard Error | t Value | Pr > t |
|-------------|--------------|----------------|---------|---------|
| Intercept | -.0676279431 | 0.28312635 | -0.24 | 0.8113 |
| log_biomass | 0.3519739105 | 0.05961766 | 5.90 | <.0001 |



- Removed oyster biomass values that = 0
- SAV increases significantly with Biomass (oyster)
- Slope = +0.35
- Biomass explains 6% of the variability in SAV

Question: If Management type is significant, and we're managing for oysters, does relationship between TSM and oyster biomass vary by management type?

ANCOVA Q: Does the relationship between TSM and oyster vary relative to Management levels(Other/Sanctuary/Sanctuary_Resto
Model: Rastervalu = Log_Biomass + management + Log_Biomass*Management
Management is the Co-variate
Remove oyster biomass < 1 values
Remove TSM = 1
03/07/2018 Analyses

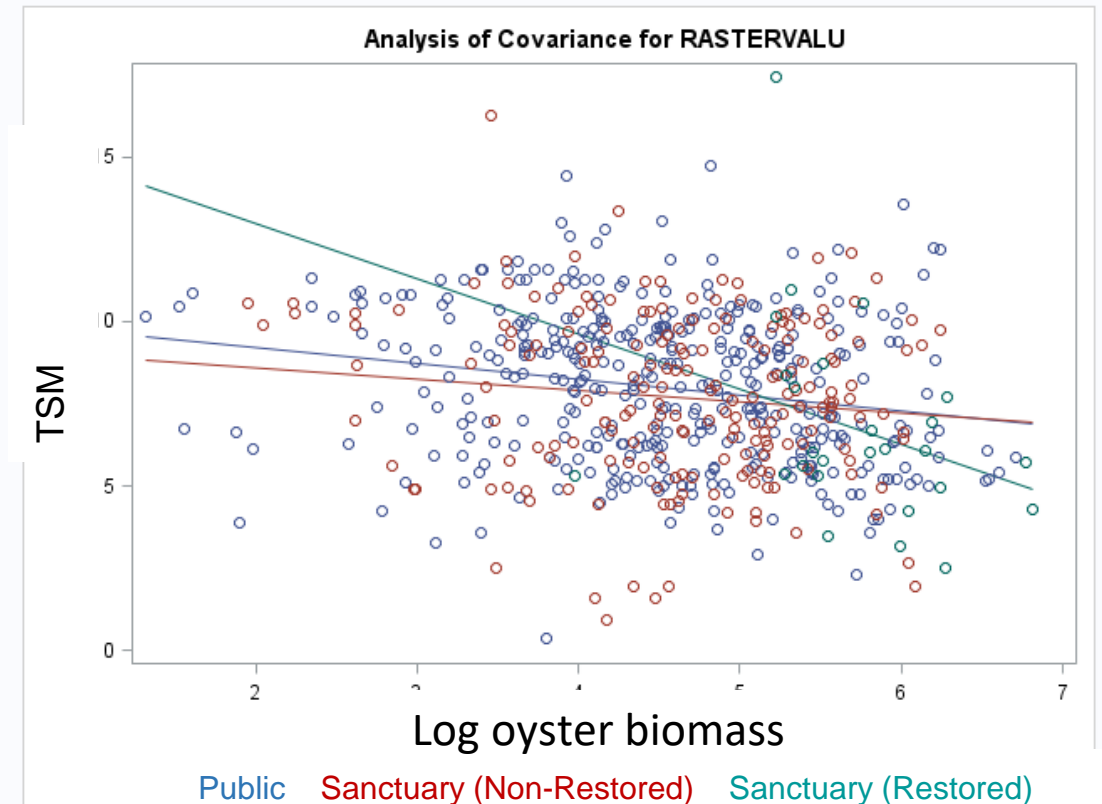
The GLM Procedure

| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
|-----------------|-----|----------------|-------------|---------|--------|
| Model | 5 | 168.132802 | 33.626560 | 5.97 | <.0001 |
| Error | 595 | 3349.565243 | 5.629521 | | |
| Corrected Total | 600 | 3517.698045 | | | |

| R-Square | Coeff Var | Root MSE | RASTERVALU Mean |
|----------|-----------|----------|-----------------|
| 0.047796 | 30.22933 | 2.372661 | 7.848871 |

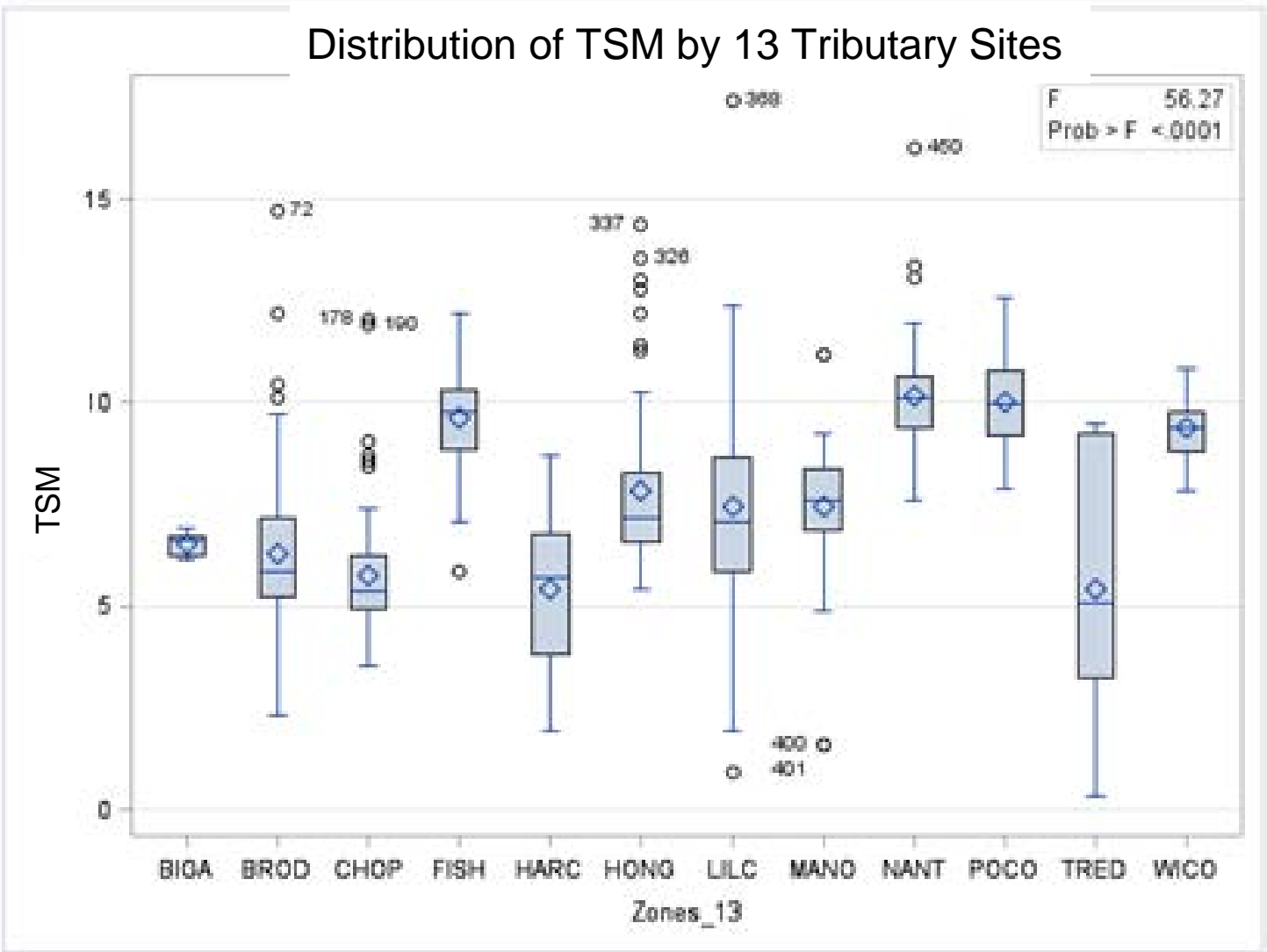
| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|------------------------|----|-------------|-------------|---------|--------|
| log_biomass | 1 | 136.3352676 | 136.3352676 | 24.22 | <.0001 |
| Management | 2 | 17.3004118 | 8.6502059 | 1.54 | 0.2160 |
| log_biomass*Management | 2 | 14.4971224 | 7.2485612 | 1.29 | 0.2767 |

| Source | DF | Type III SS | Mean Square | F Value | Pr > F |
|------------------------|----|-------------|-------------|---------|--------|
| log_biomass | 1 | 48.34692796 | 48.34692796 | 8.59 | 0.0035 |
| Management | 2 | 14.03701166 | 7.01850583 | 1.25 | 0.2882 |
| log_biomass*Management | 2 | 14.49712245 | 7.24856122 | 1.29 | 0.2767 |

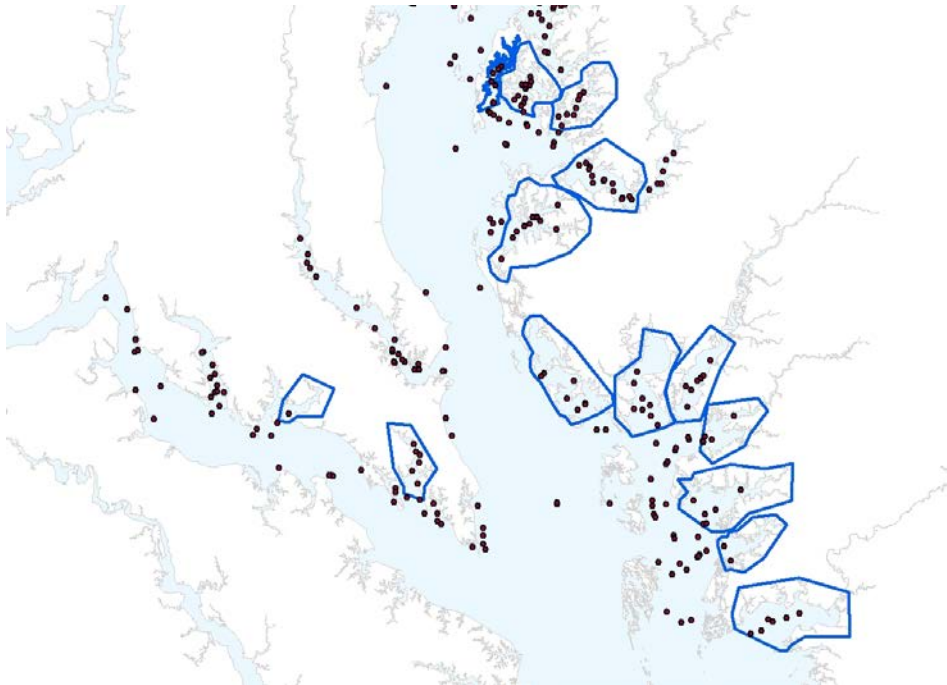


- ANCOVA Results: A significant relationship exists between TSM and biomass but it is not affected by management regimen.

Data Distribution by Area- “13 Tribs”

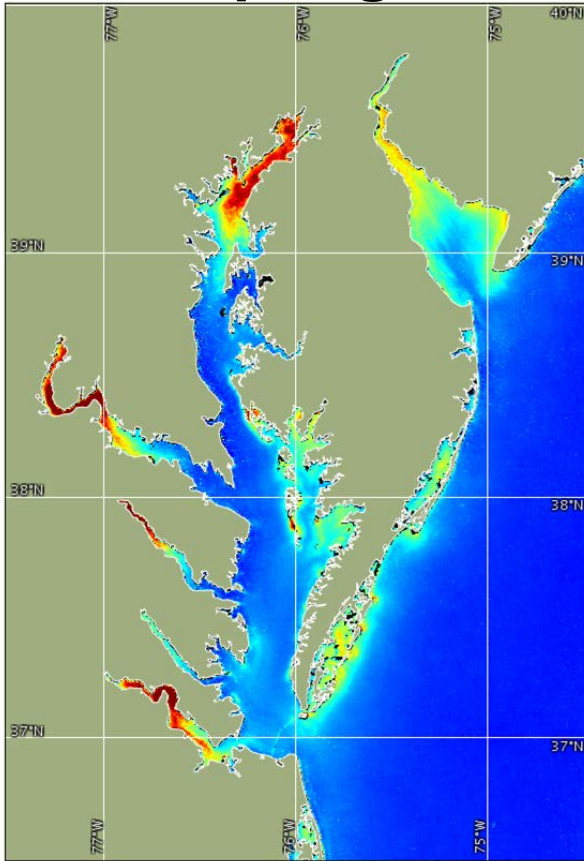


Lowest TSM values:
Big Anamessex, Broad Creek,
Choptank River, Harris Creek,
and Tred Avon River

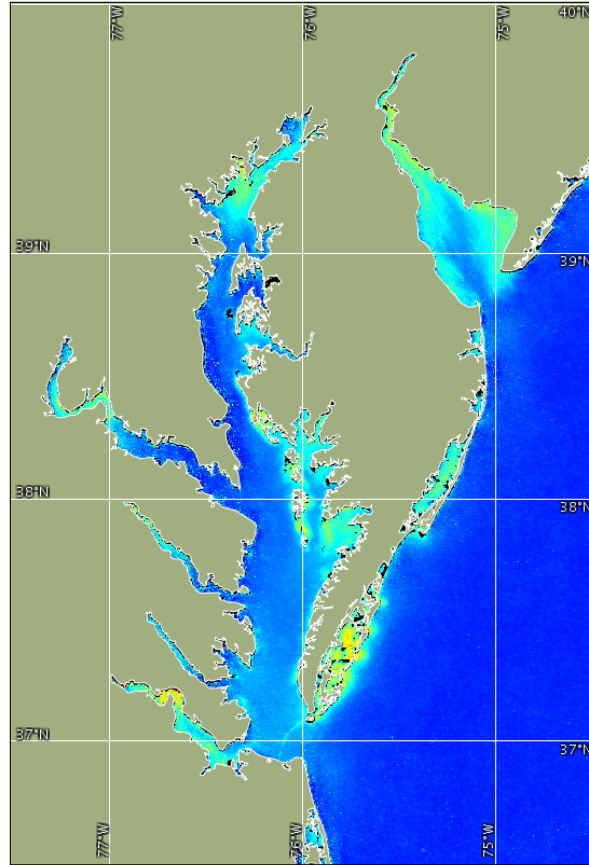


Satellite TSM Seasonal Averages, 2009-2015

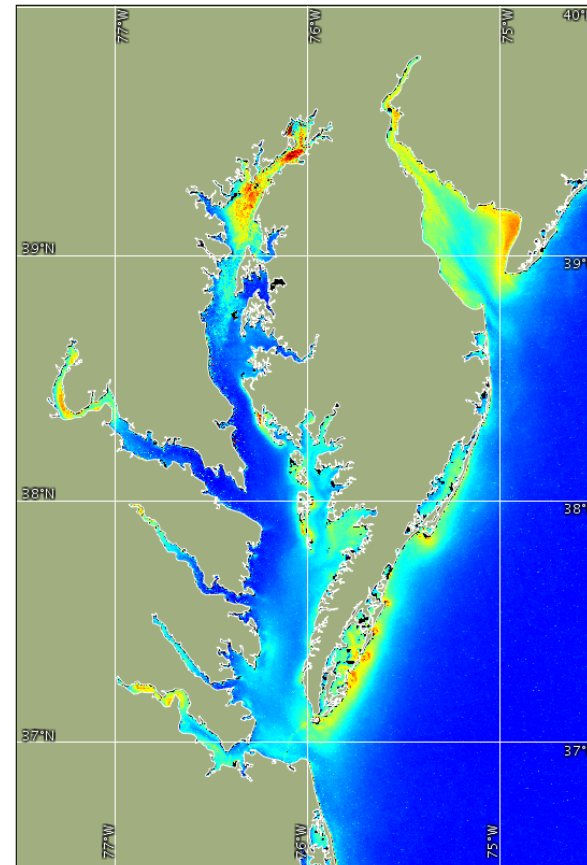
Spring



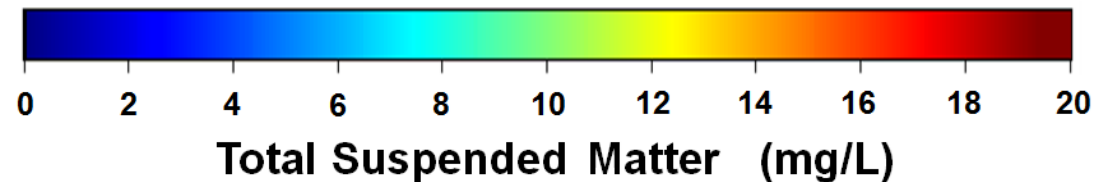
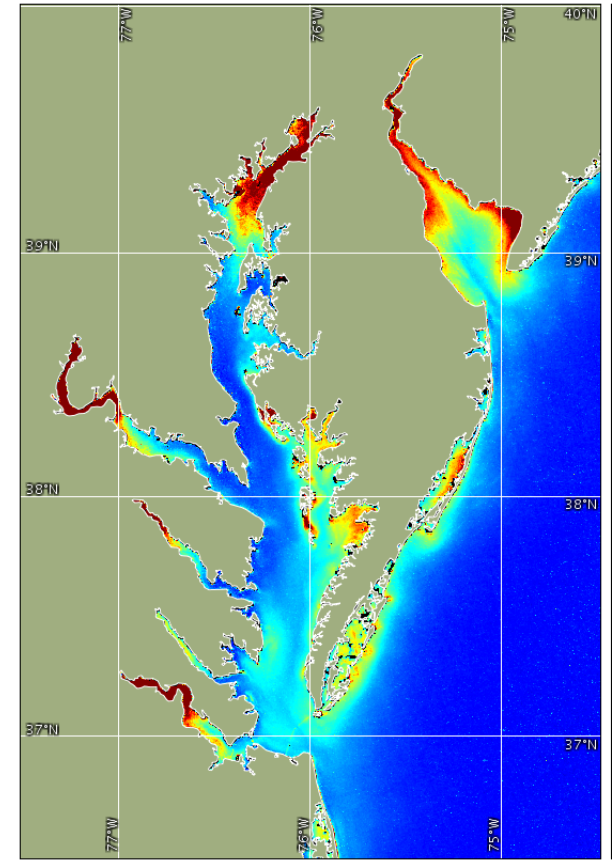
Summer



Fall



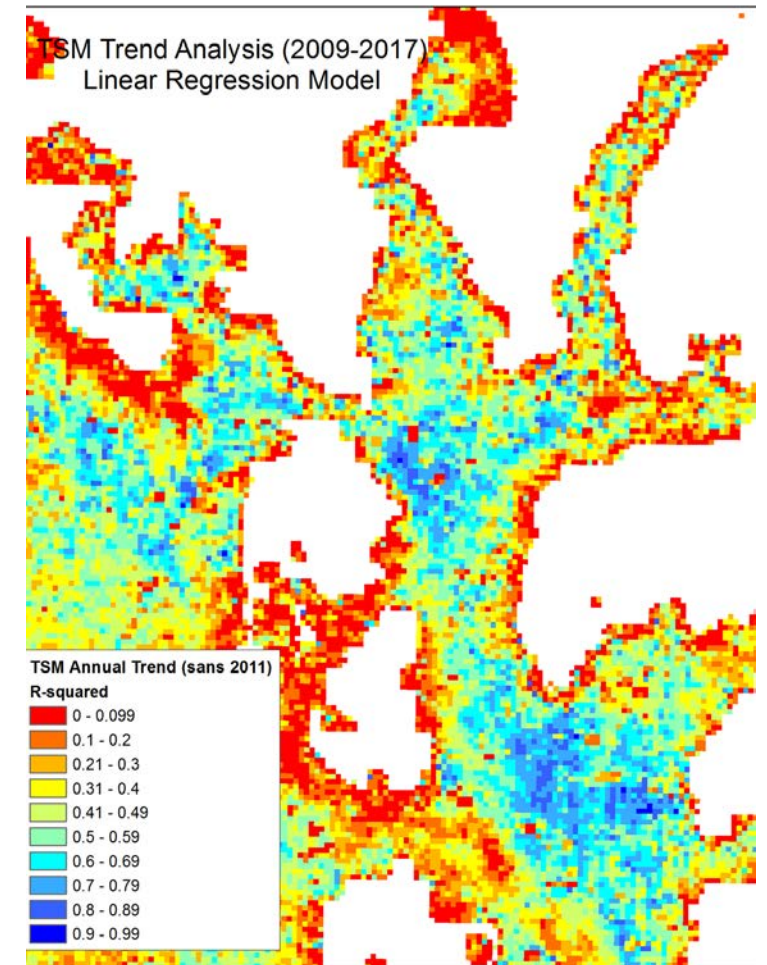
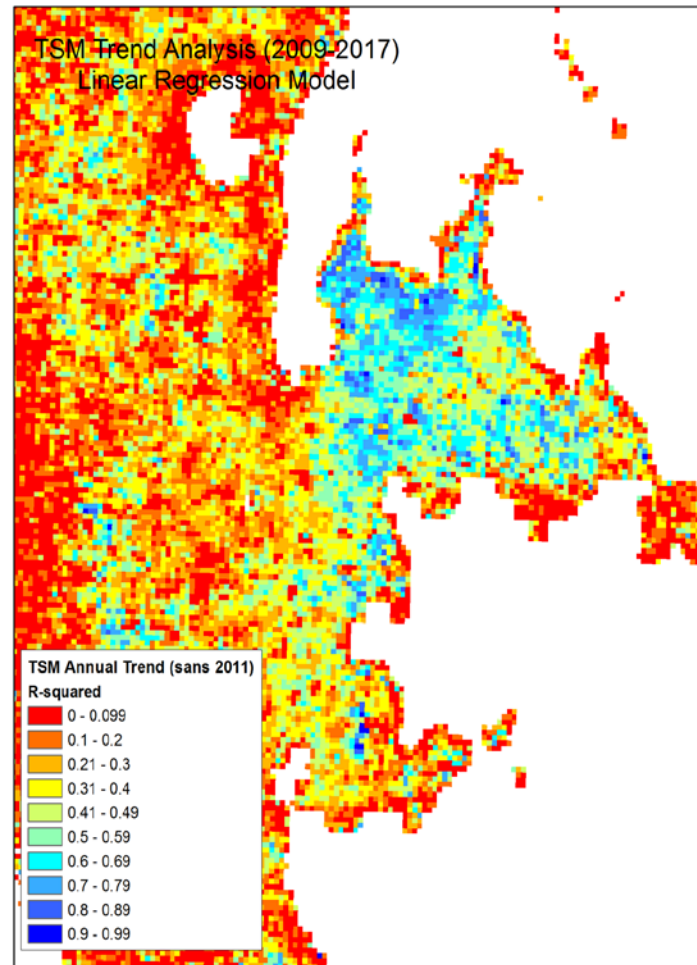
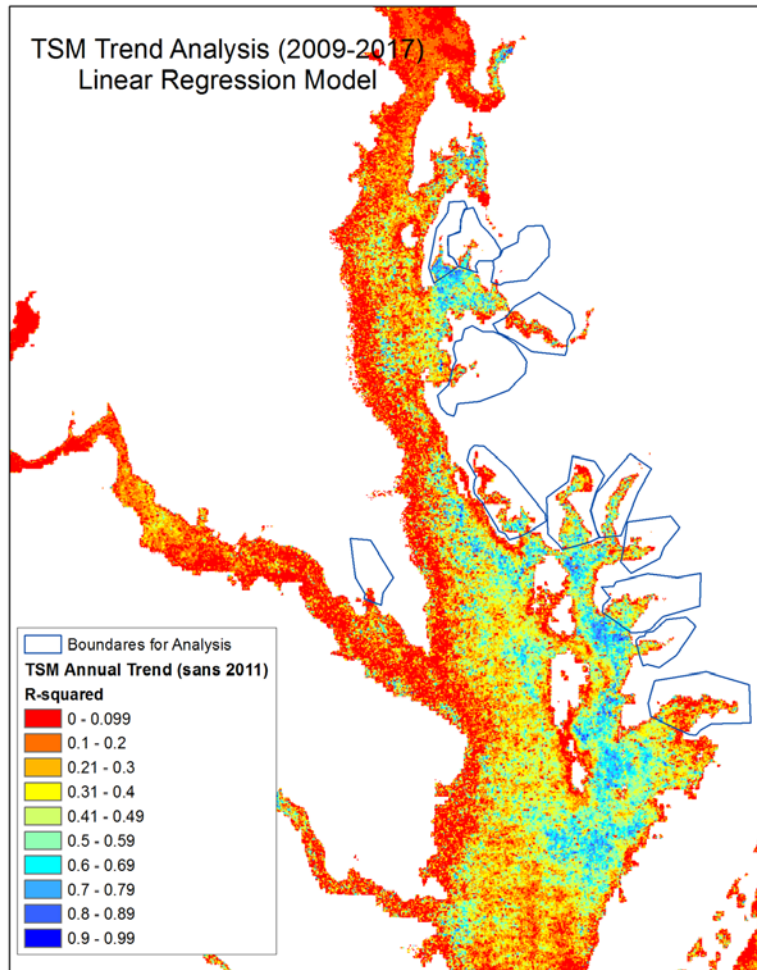
Winter



TSM Over Time:

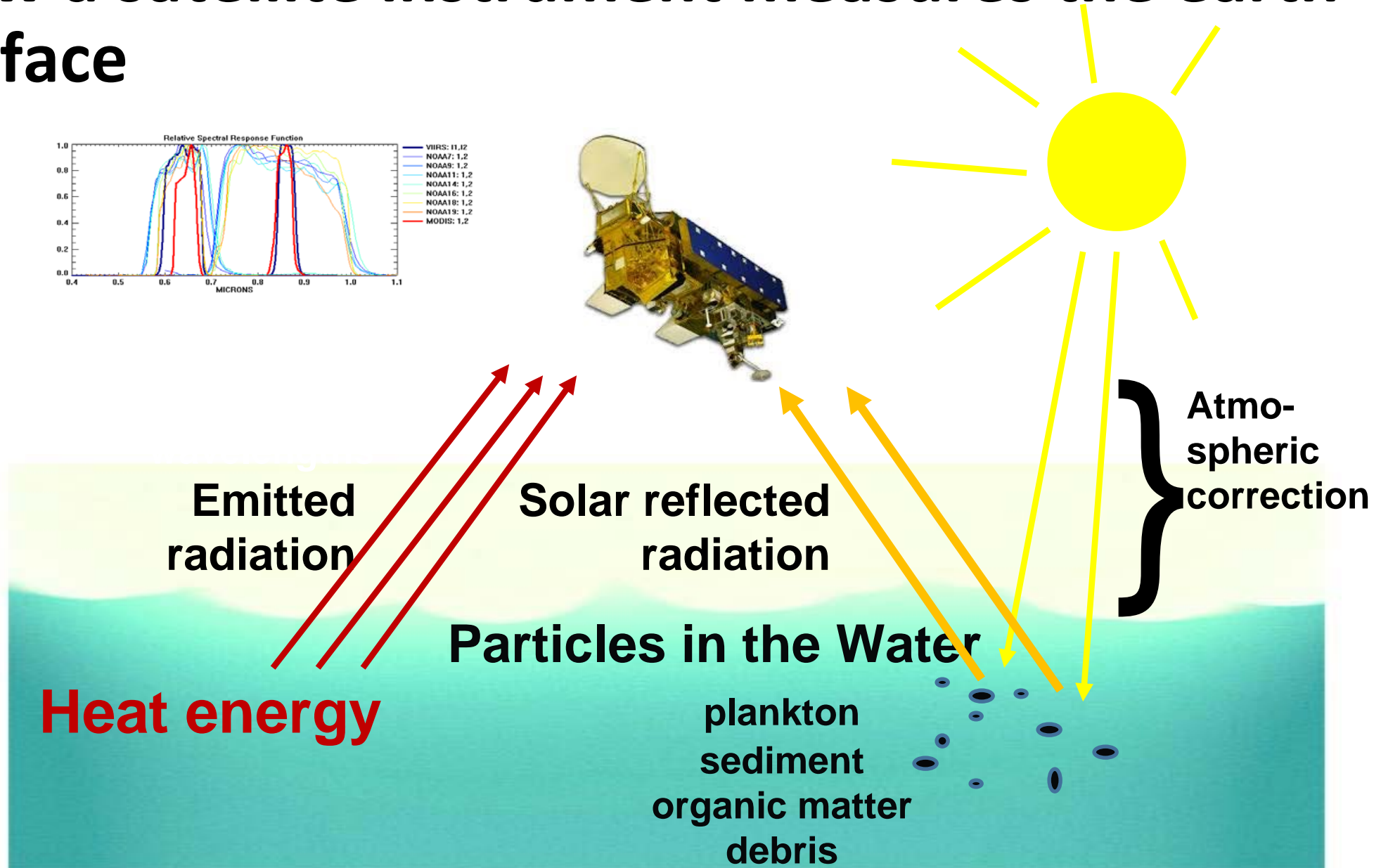
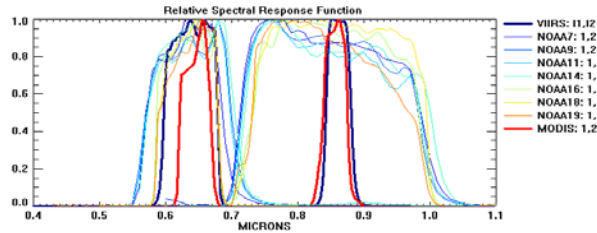
TSM annual trend for each satellite grid cell, 2009-2017

R-Squared



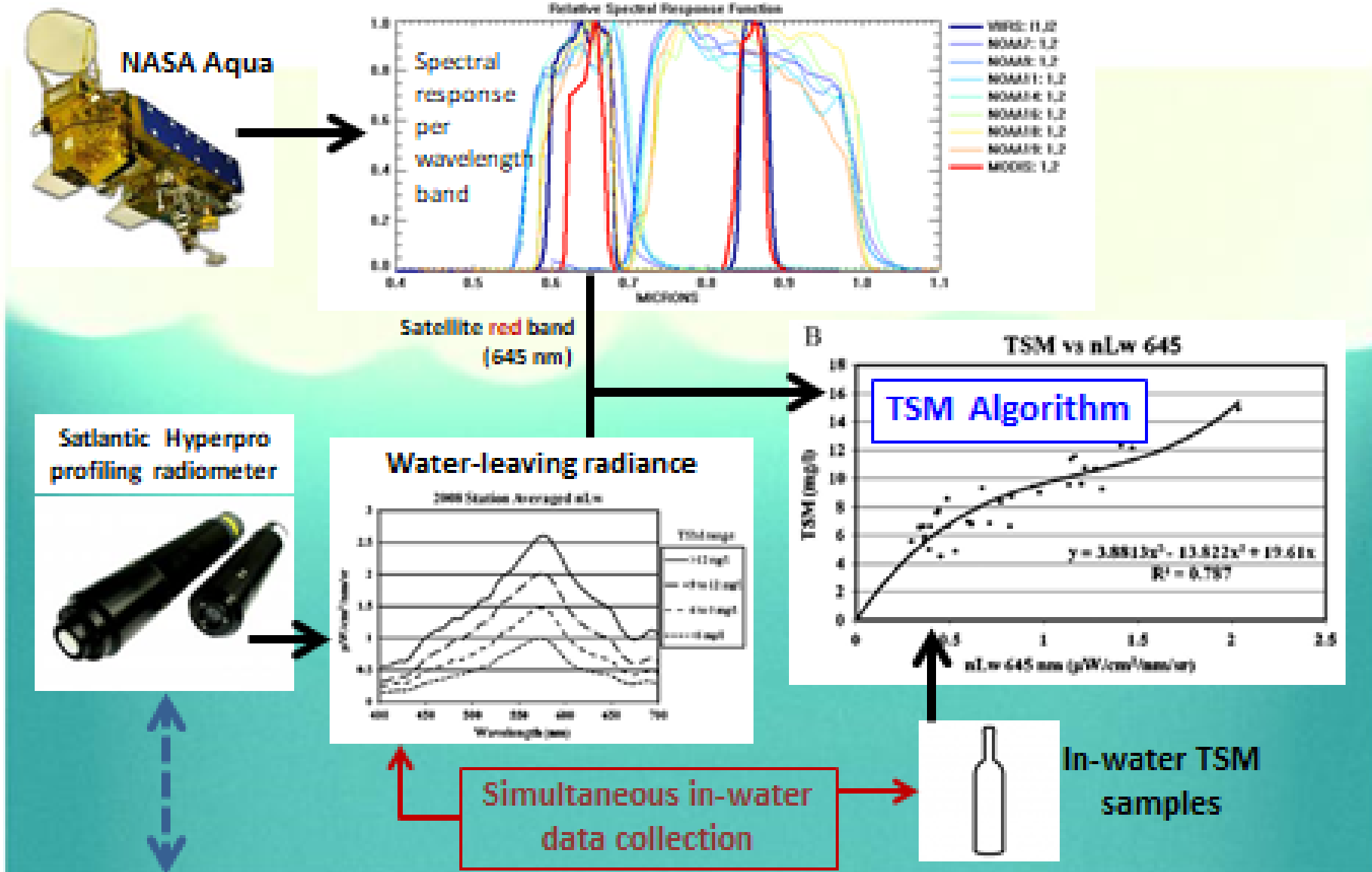
Decreasing TSM slope in Harris and Broad Creek with small slope SE and high R^2 suggests a water quality improvement but with no cause implied. Some areas of Tangier Sound also show this (but not Fishing Bay).

How a satellite instrument measures the earth surface



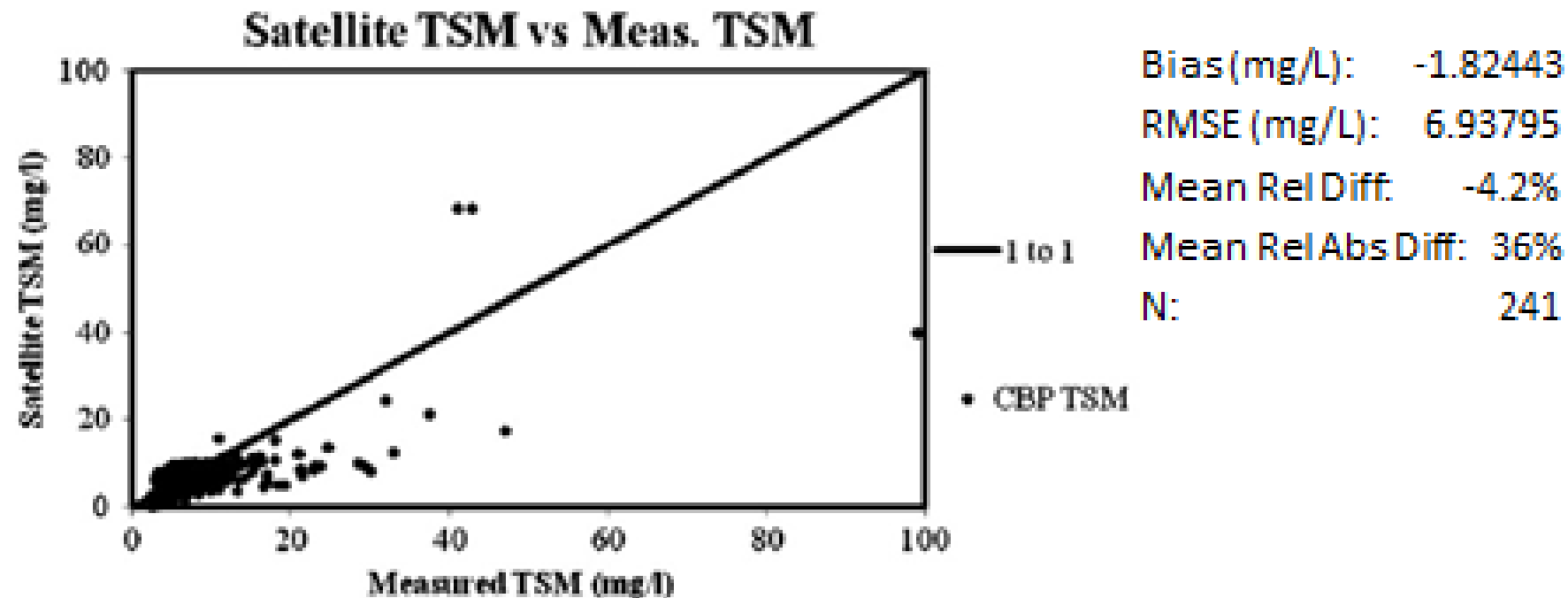
Algorithm Description

Ondrusek et al., 2012, Remote Sensing of Environment



Satellite TSM Accuracy

Chesapeake Bay Program in-water TSM samples were spatially & temporally matched to satellite TSM values at single pixels, Bay-wide for one year: 2009
(Ondrusek et al., 2012, Remote Sensing of Environment)



TSM values <20 mg/L are more accurate than values >20 mg/L