

# Summary of 2019 tidal water quality trends and visualization tool

CBP's Integrated Trends Analysis Team (ITAT)

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Rebecca Murphy (UMCES at CBP), Jeni Keisman (USGS),  
Erik Leppo and Jon Harcum (Tetra Tech)



# Approach

*A Generalized Additive Model (GAM) represents a constituent of interest as the sum of multiple smooth functions of explanatory variables*

Our implementation:

'baytrends'  
R package  
to run  
GAMs

Available on CRAN: <https://CRAN.R-project.org/package=baytrends>

**STAC Review:**

Ellis, Du, Friedrichs, Lyubchich. 2016. Scientific and Technical Advisory Committee Review of the Generalized Additive Model (GAM) Approach for Water Quality Trends in Tidal Waters. STAC Publication Number 17-001, Edgewater, MD. 22 pp.

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A Generalized Additive Model approach to evaluating water quality: Chesapeake Bay case study

Rebecca R. Murphy<sup>a,\*</sup>, Elgin Perry<sup>b</sup>, Jon Harcum<sup>c</sup>, Jennifer Keisman<sup>d</sup>

- Fit multiple GAMs to each data set (e.g., Surface TN at CB3.3C).
- Features include nonlinear or linear change, seasonal cycle, and relationship to flow or salinity.
- Post-process to compute mean change over any time/season.

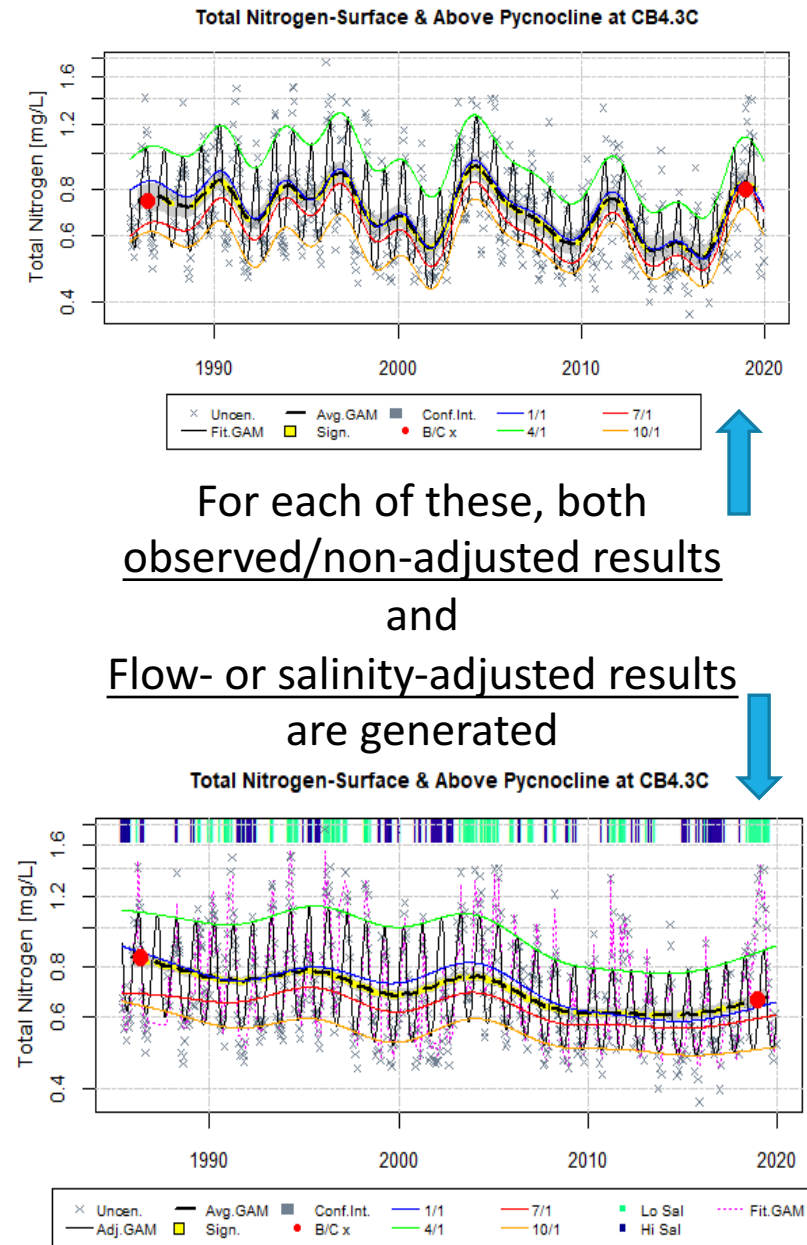
# 2019 results sets

Long-term (1980s-2019) and short-term (2010-2019) change:

- Total nitrogen, total phosphorus (annual; surface & bottom)
- Water temp, salinity (annual; surface & bottom)
- Secchi depth (annual & Apr-Oct)
- Chlorophyll-a (spring & summer; surface & bottom)
- Dissolved oxygen (summer; surface & bottom )

1999-2019 and short-term (2010-2019) change :

- TSS, DIN, PO4 (annual; surface & bottom)





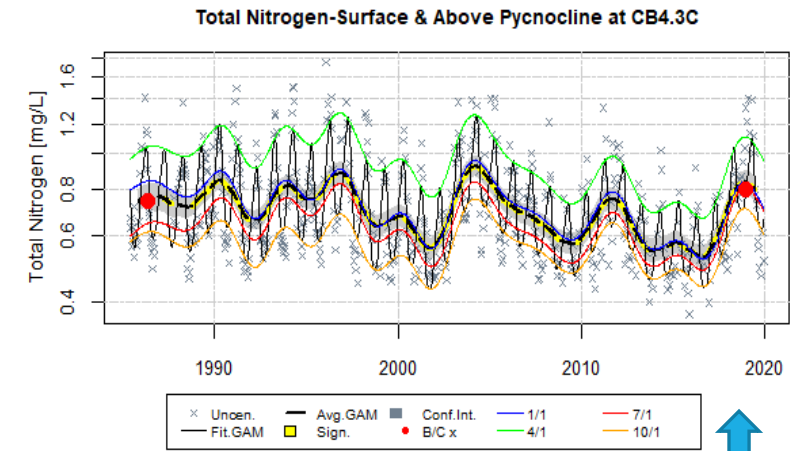
# 2019 results sets

Long-term (1980s-2019) and short-term (2010-2019) change:

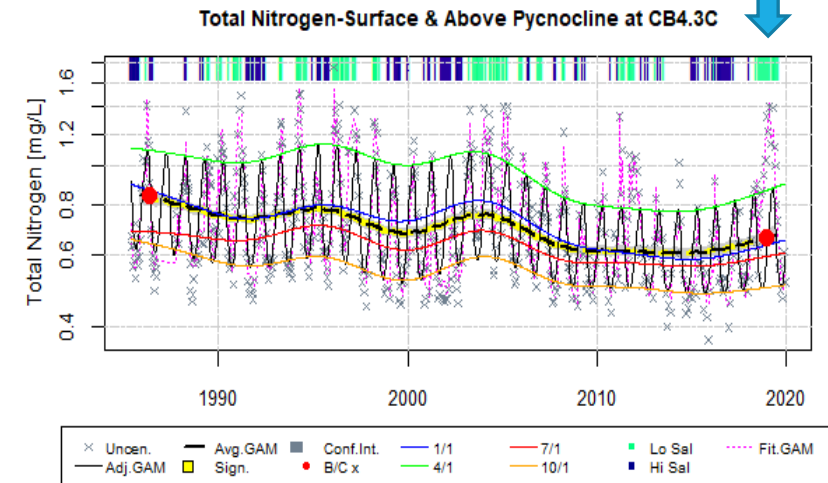
- Total nitrogen, total phosphorus (annual; surface & bottom)
- Water temp, salinity (annual; surface & bottom)
- Secchi depth (annual & SAV season)
- Chlorophyll-a (spring & summer; surface & bottom)
- Dissolved oxygen (summer; bottom & surface)

1999-2019, and short-term (2010-2019) change :

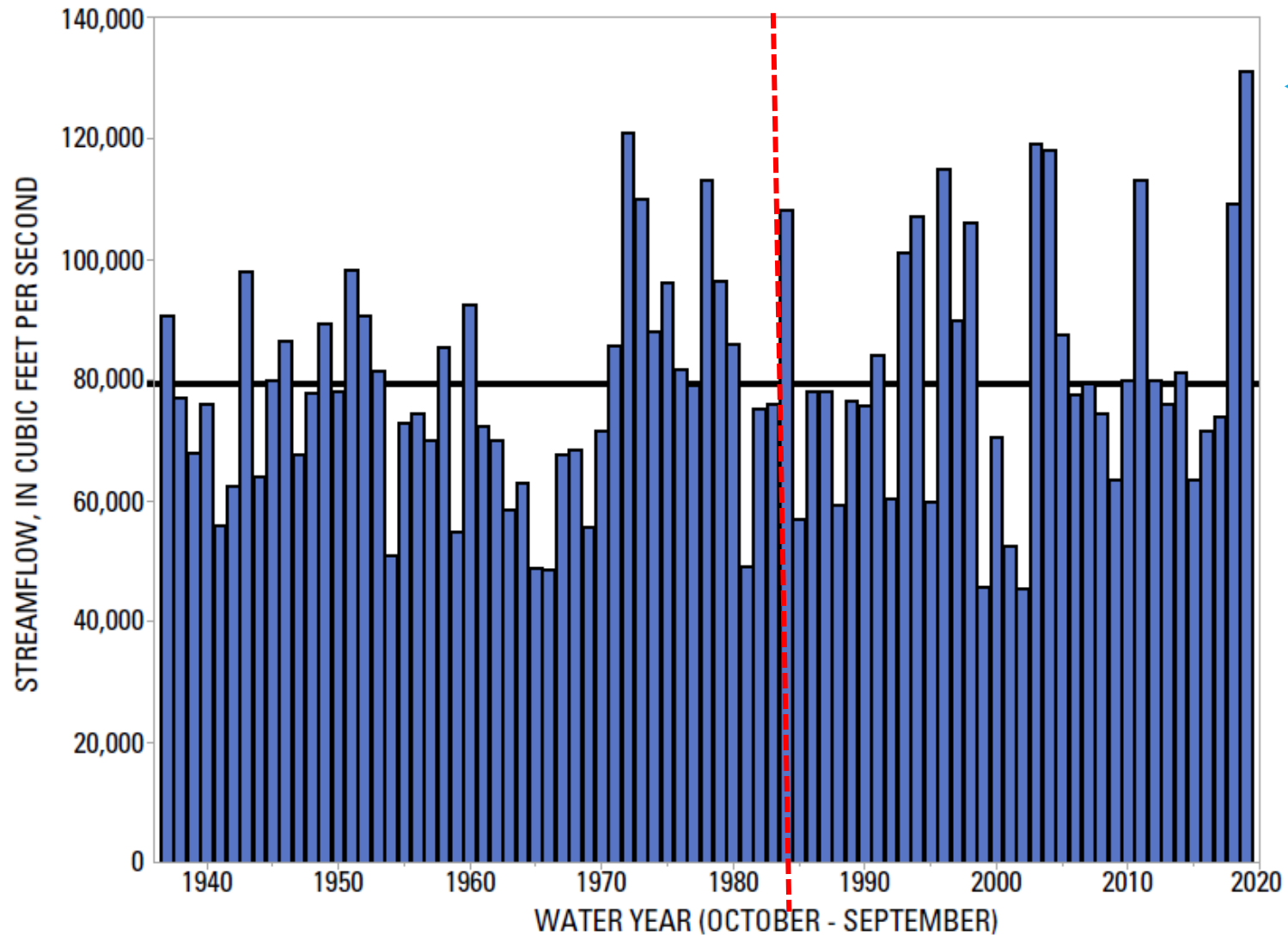
- TSS, DIN, PO4 (annual; surface & bottom)



For each of these, both  
observed/non-adjusted results  
and  
Flow- or salinity-adjusted results  
are generated



# Total monitored flow into tidal waters



Note:  
2019 highest in  
this record. 2018  
very high too.

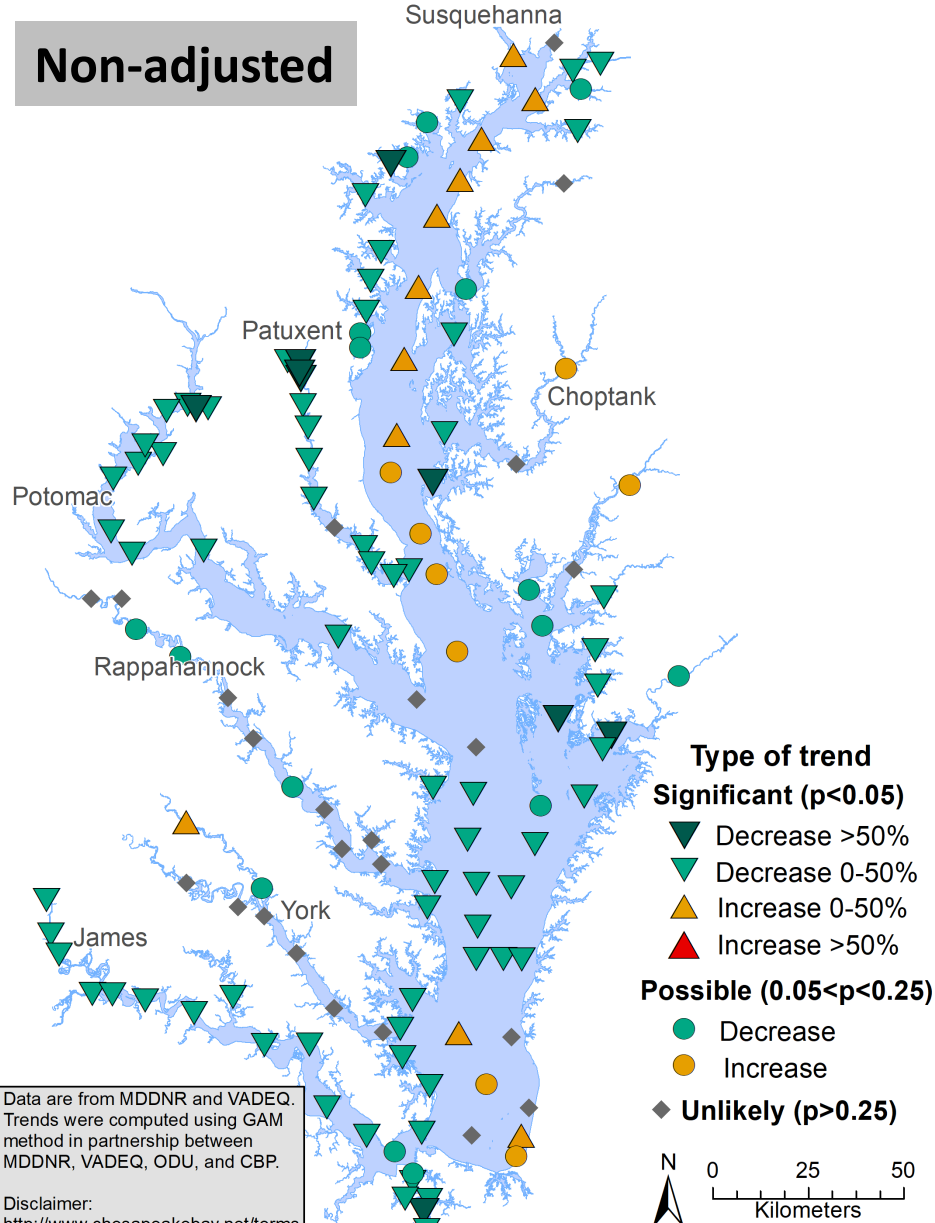
Figure 2. Estimated annual-mean streamflow entering Chesapeake Bay. Black line represents the average annual-mean streamflow of 79,423 cubic feet per second.

# TN long-term

## Chesapeake Bay Surface Total Nitrogen: 2019 long-term change\*



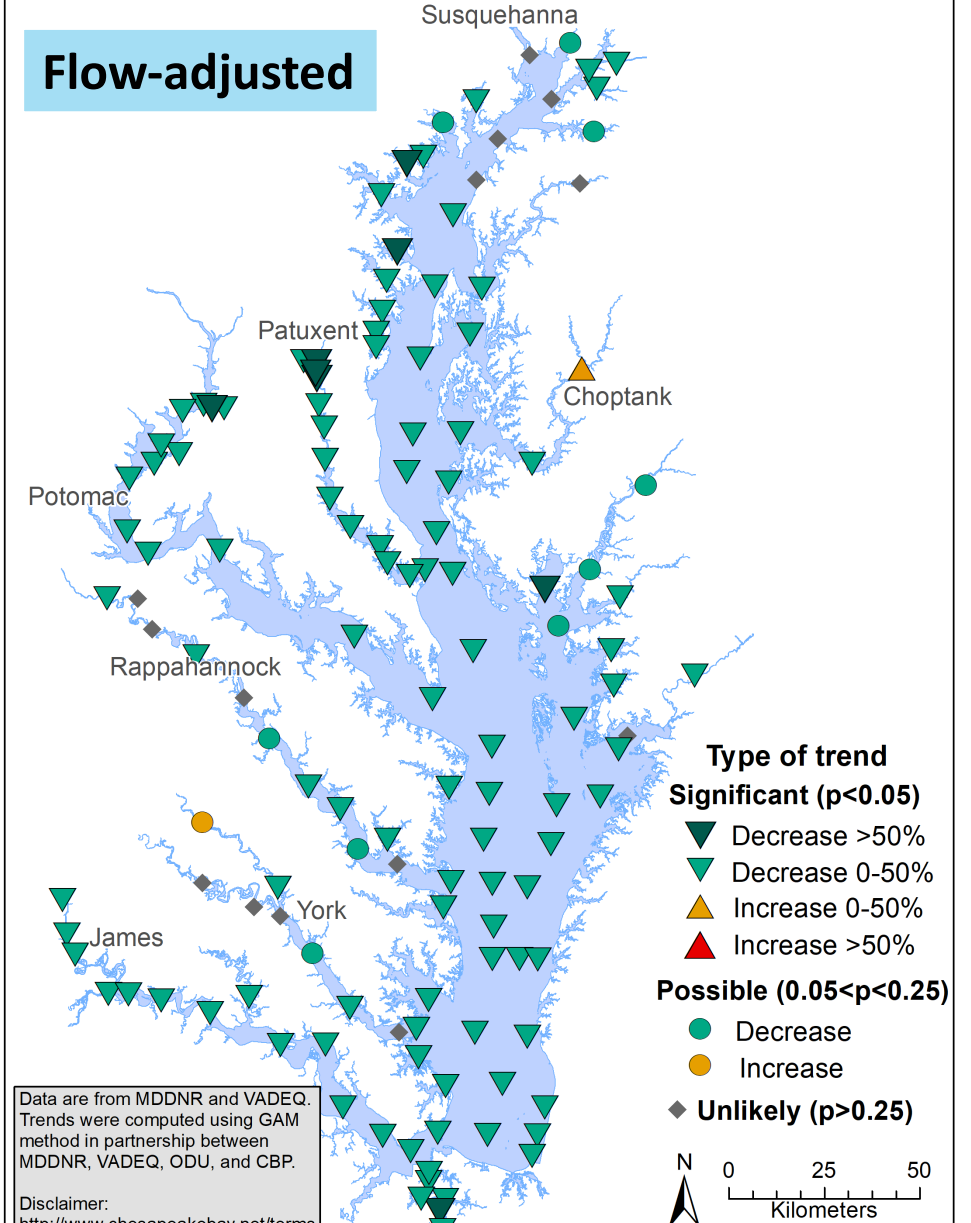
### Non-adjusted



## Chesapeake Bay Surface Total Nitrogen: 2019 long-term flow-adjusted change\*



### Flow-adjusted



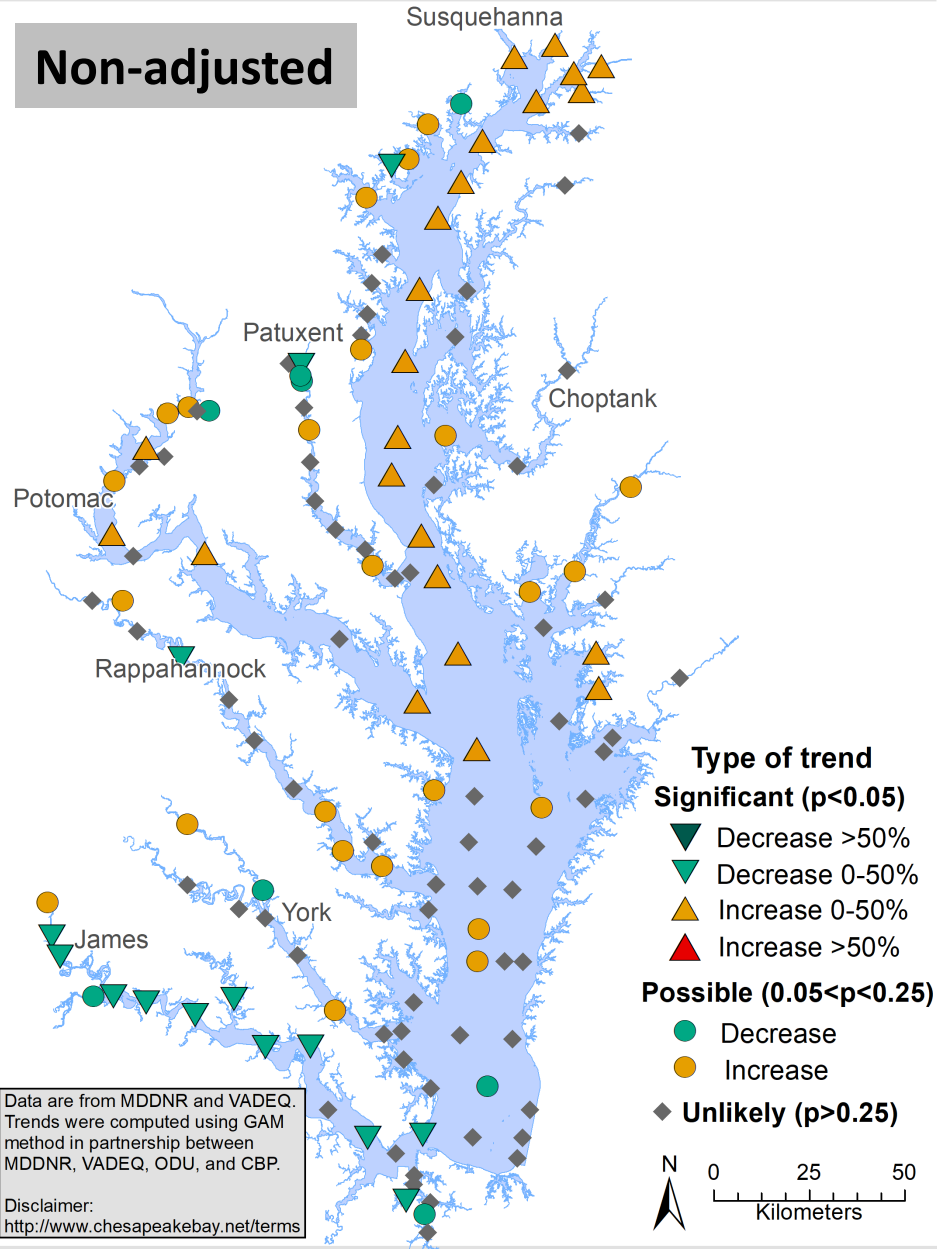
# TN

## short-term

### Chesapeake Bay Surface Total Nitrogen: 2010-2019 change



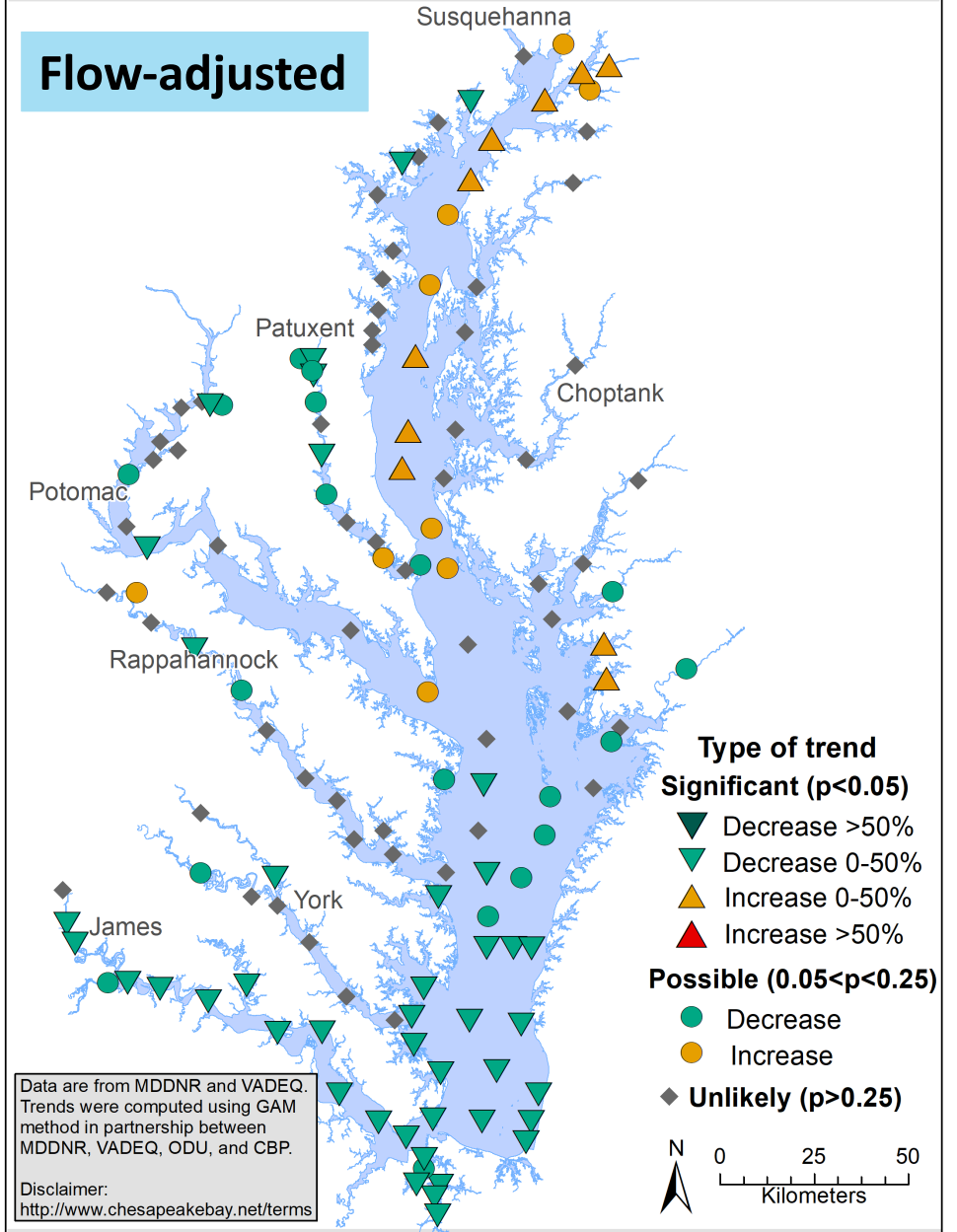
#### Non-adjusted



### Chesapeake Bay Surface Total Nitrogen: 2010-2019 flow-adjusted change



#### Flow-adjusted



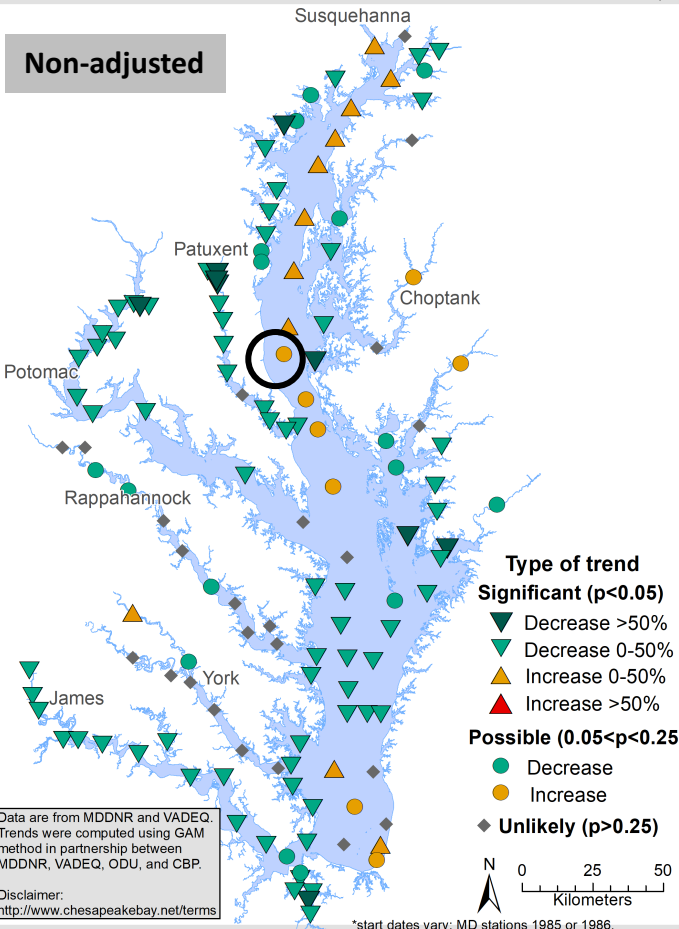
# TN

## long-term

Chesapeake Bay Surface Total Nitrogen: 2019 long-term change\*



Non-adjusted

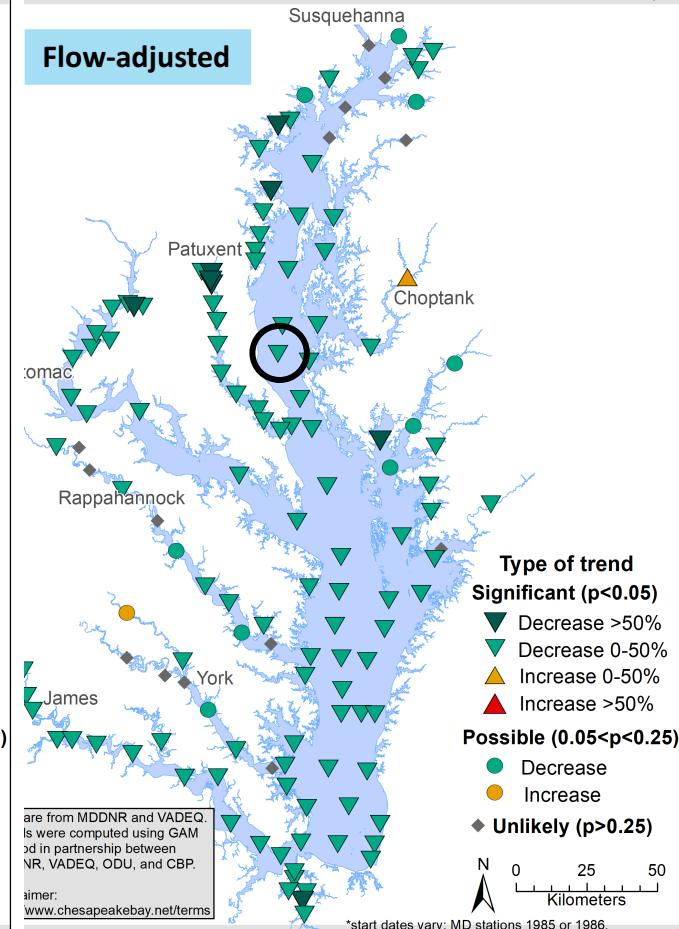


\*start dates vary; MD stations 1985 or 1986, VA main 1988, Elizabeth 1989, and VA tributaries 1994.

Chesapeake Bay Surface Total Nitrogen: 2019 long-term flow-adjusted change\*

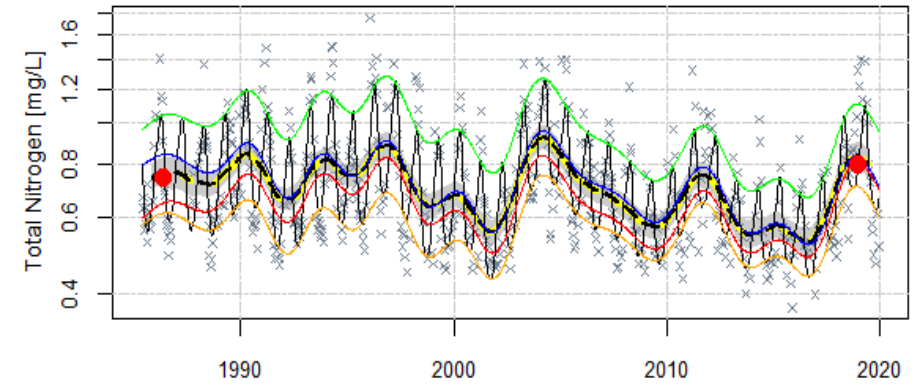


Flow-adjusted

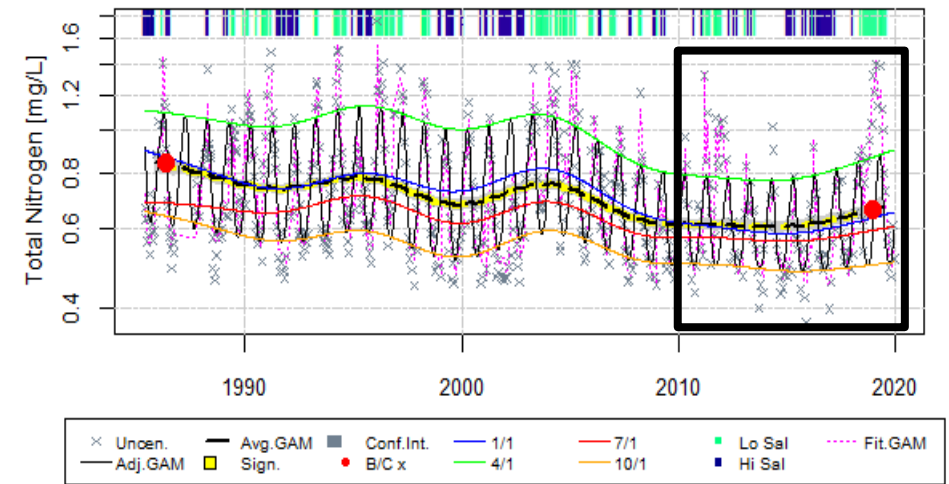


\*start dates vary; MD stations 1985 or 1986, VA main 1988, Elizabeth 1989, and VA tributaries 1994.

Total Nitrogen-Surface & Above Pycnocline at CB4.3C



Total Nitrogen-Surface & Above Pycnocline at CB4.3C

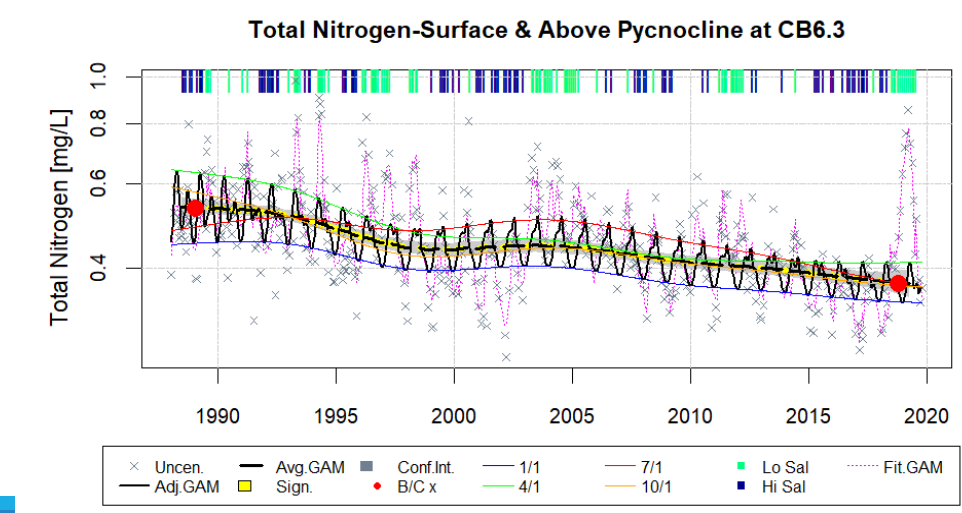
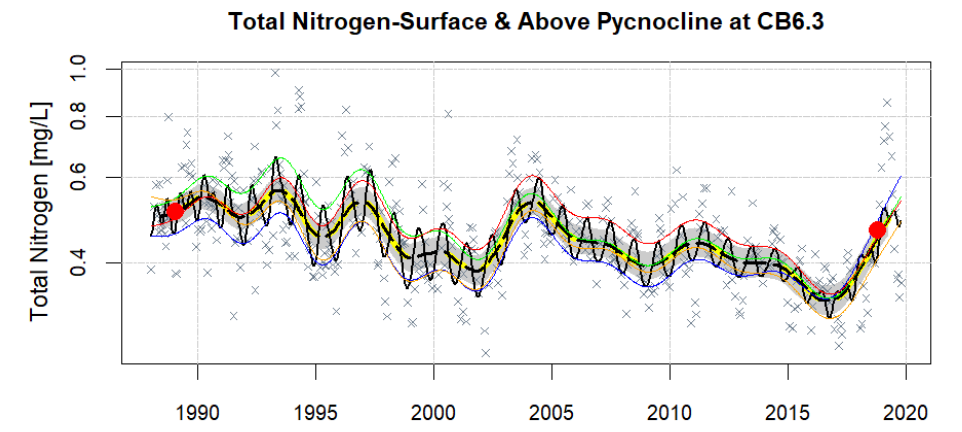
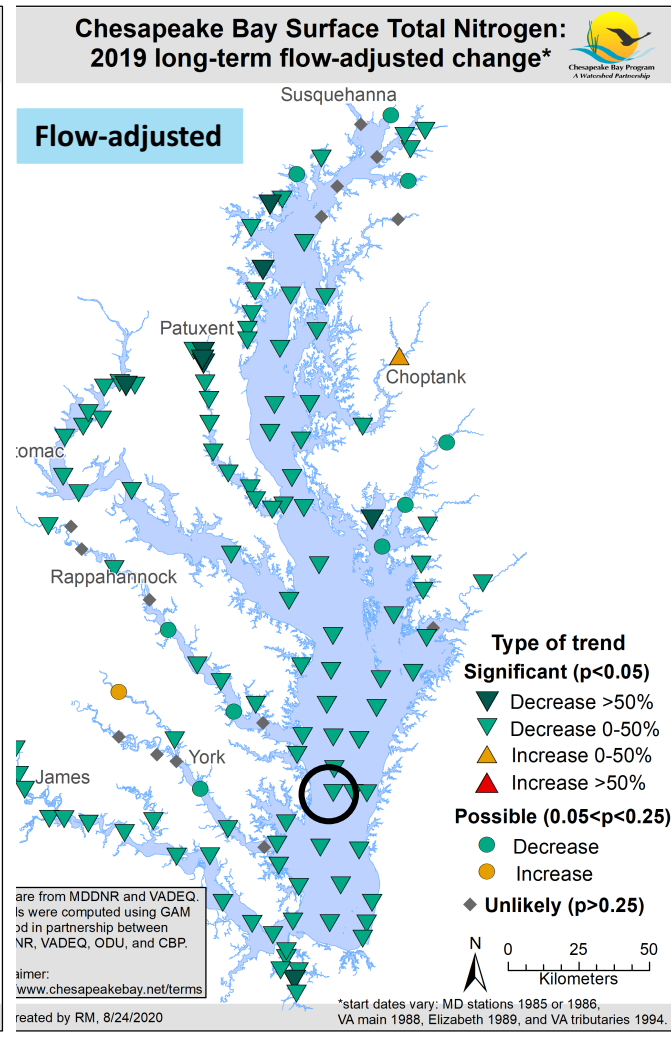
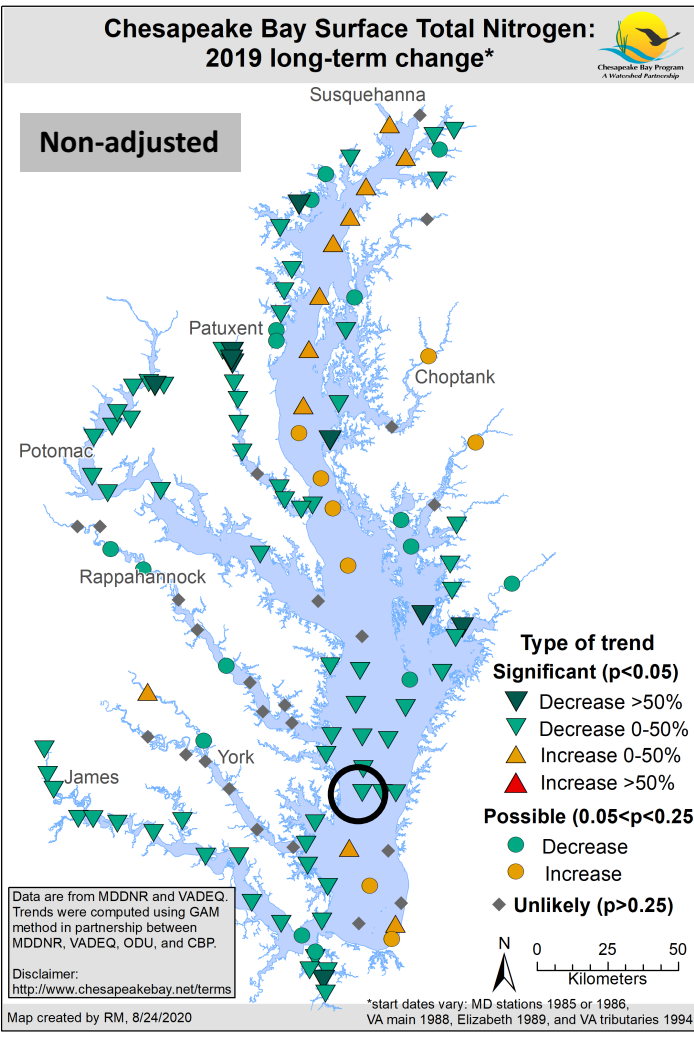


1. Entire upper half of mainstem shows increase before flow-adjustment.

# TN

## long-term

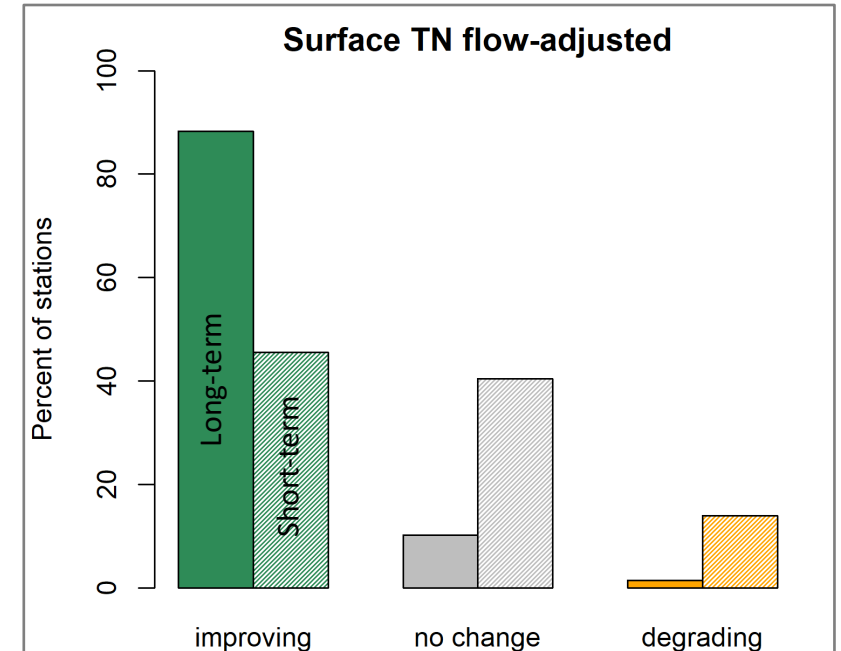
2. Impact of wet years is still seen at the VA mainstem stations, but the TN decrease gets more substantial.





# TN initial reactions

- Long-term decreases at most stations (bottom is similar).
- Short-term changes are mixed, possibly some flow impacts that are not accounted for with adjustment.
- Only long-term increases that are not due to wet year: stations in the Mattaponi and Choptank TF show gradual increases.



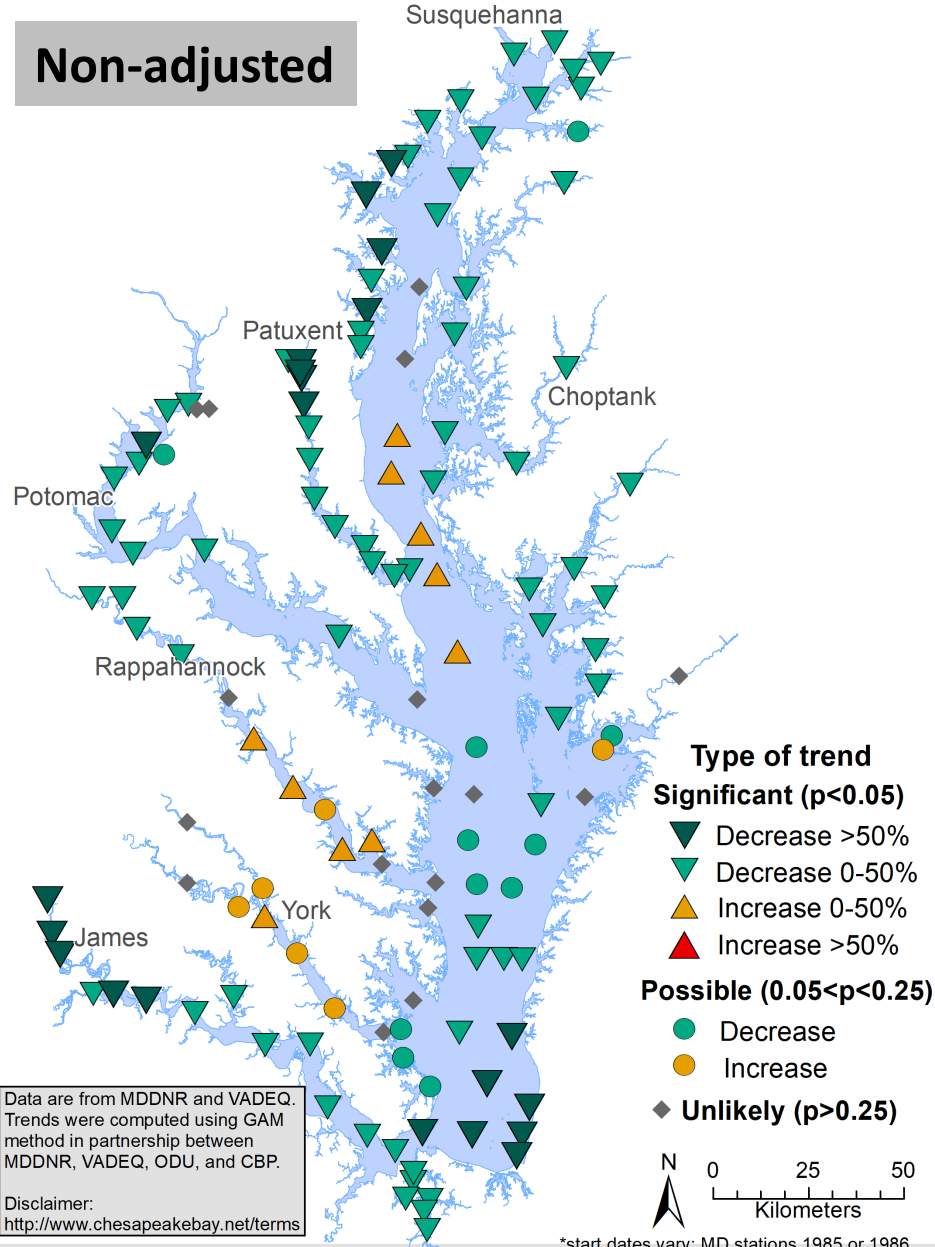


# TP long-term

## Chesapeake Bay Surface Total Phosphorus: 2019 long-term change\*



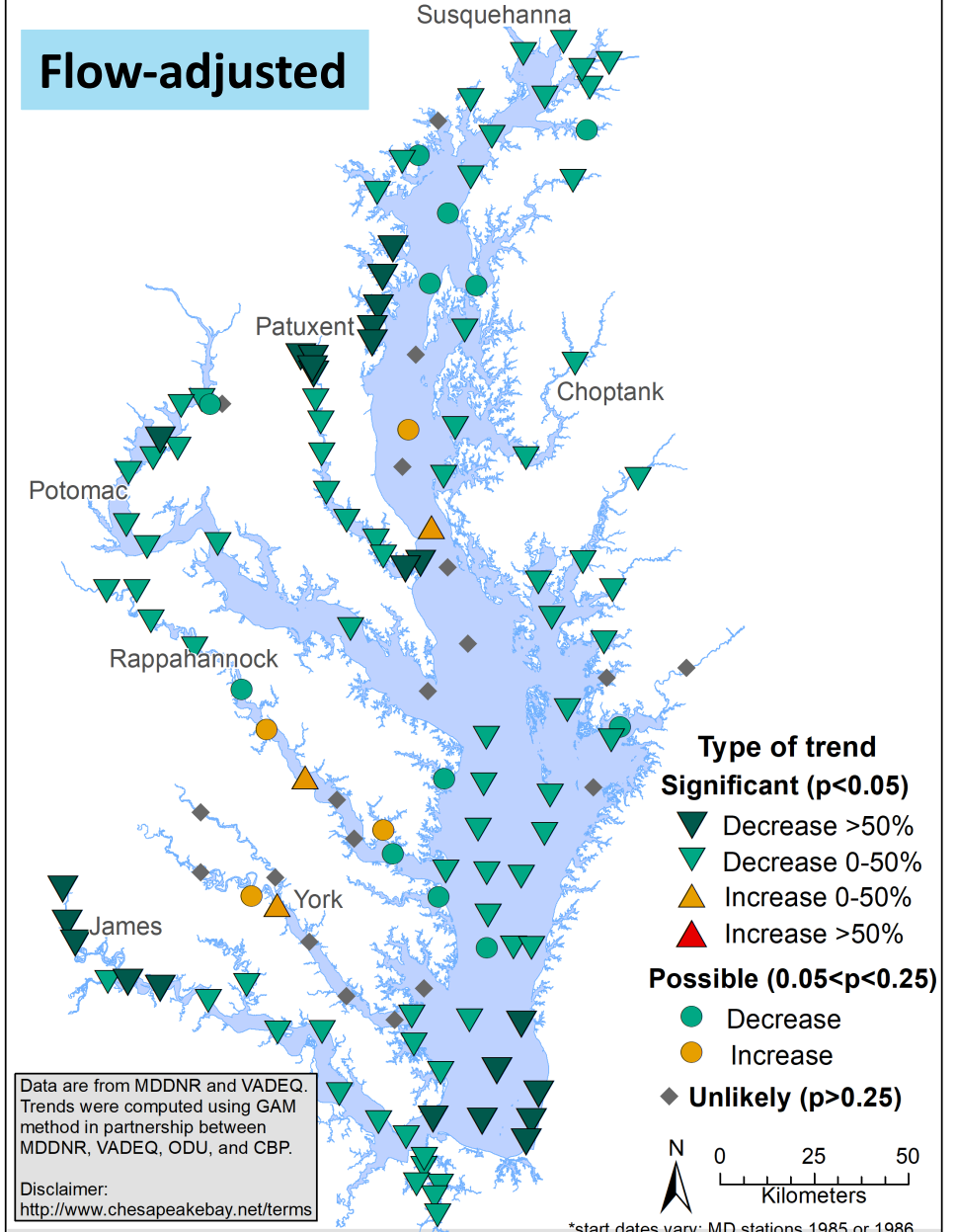
### Non-adjusted



## Chesapeake Bay Surface Total Phosphorus: 2019 flow-adjusted long-term change\*



### Flow-adjusted



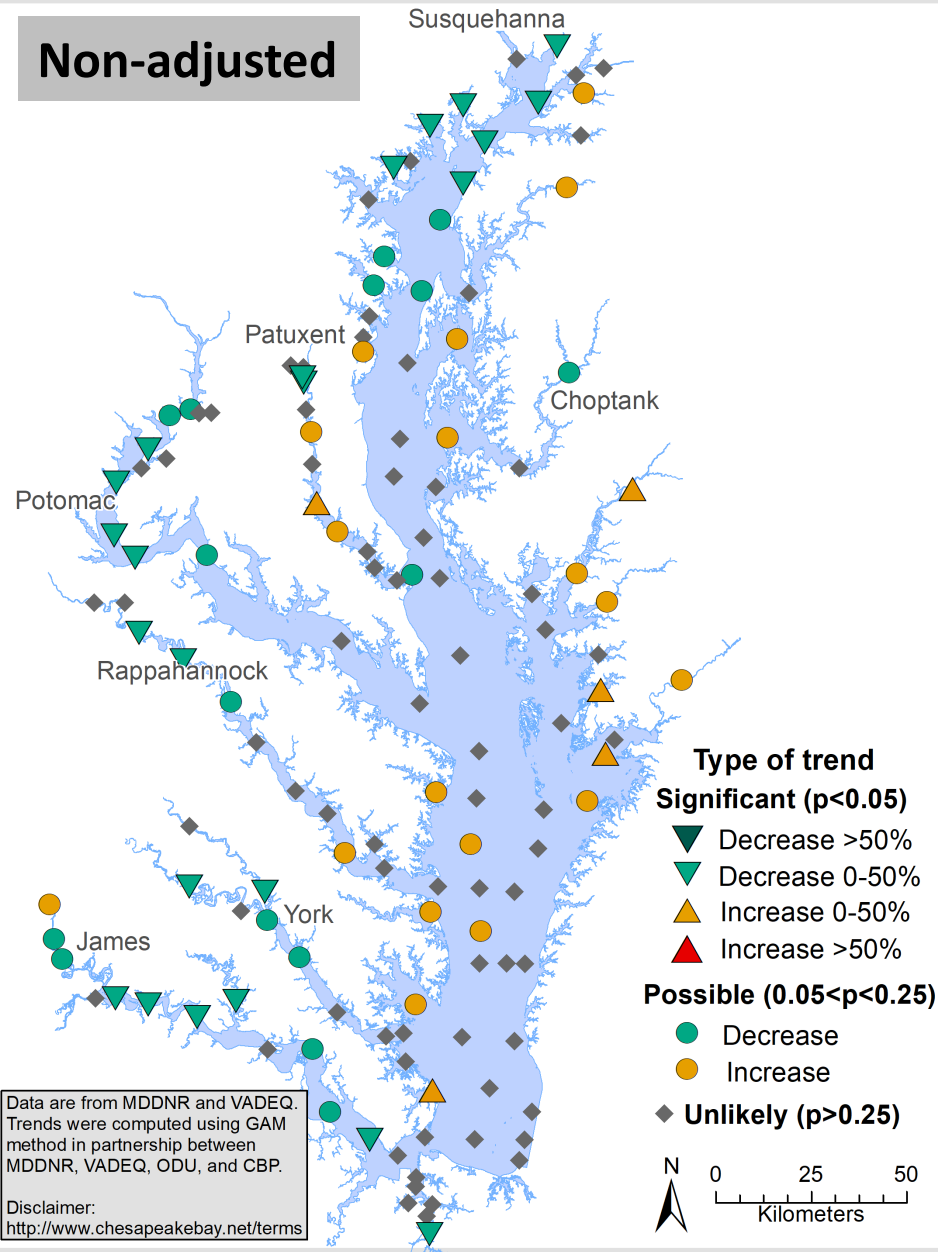
# TP

## short-term

### Chesapeake Bay Surface Total Phosphorus: 2010-2019 change



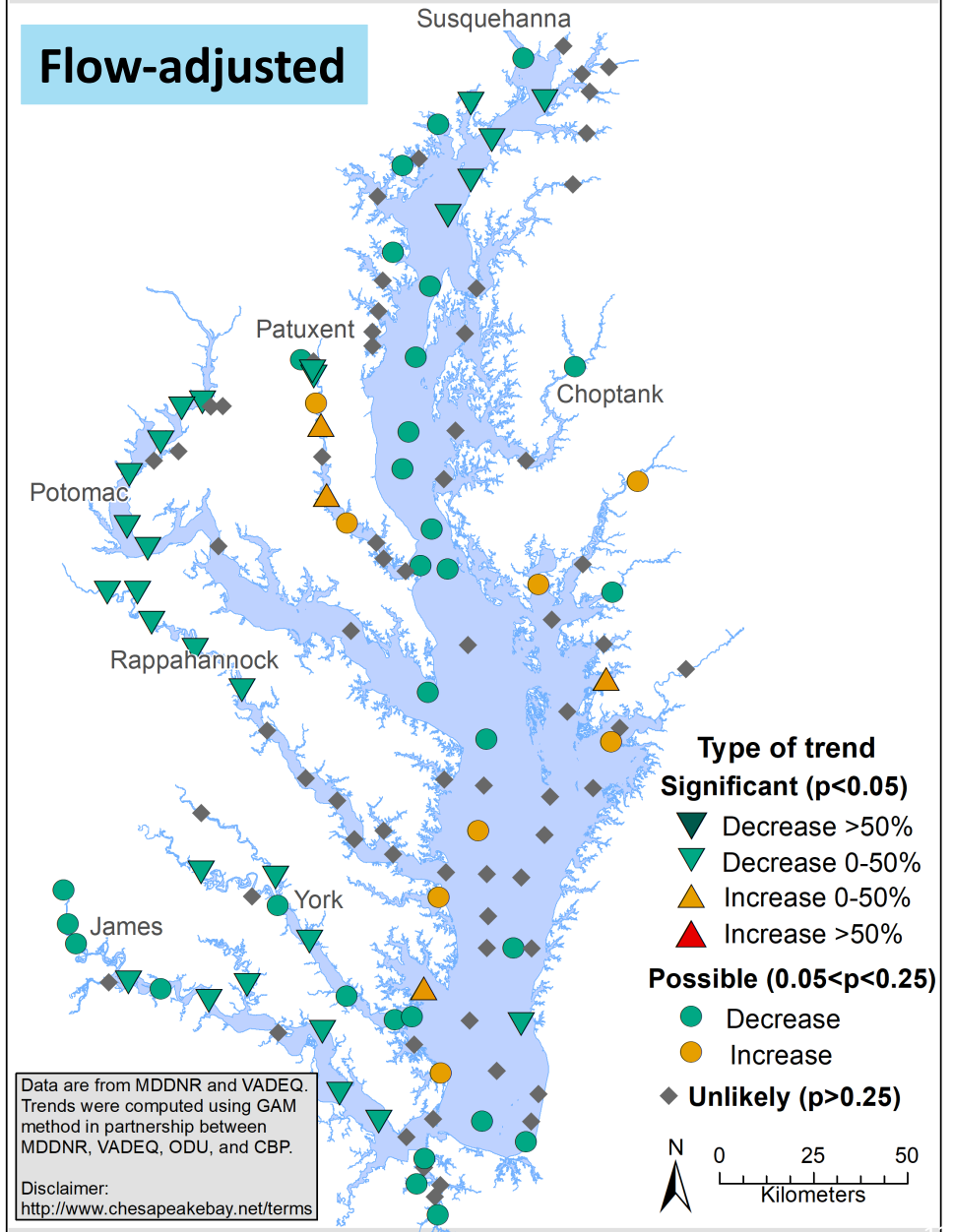
#### Non-adjusted



### Chesapeake Bay Surface Total Phosphorus: 2010-2019 flow-adjusted change



#### Flow-adjusted



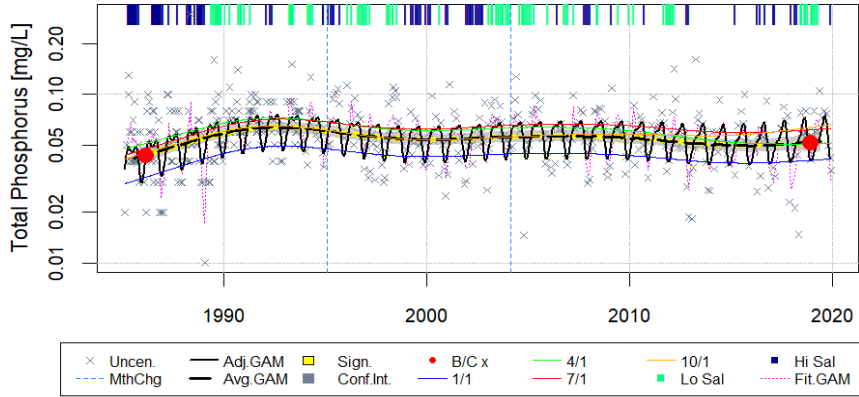
# TP

## Chesapeake Bay Surface Total Phosphorus: 2019 flow-adjusted long-term change\*



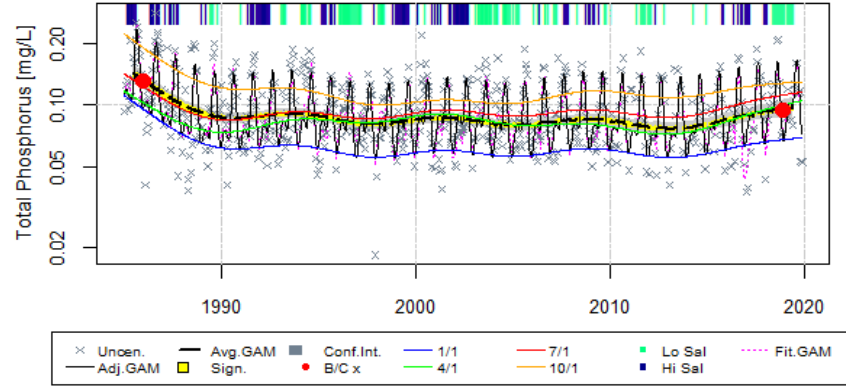
2. Patuxent Long term ↓  
OH&MH: Short term ↑ →

Total Phosphorus-Surface & Above Pycnocline at RET3.2



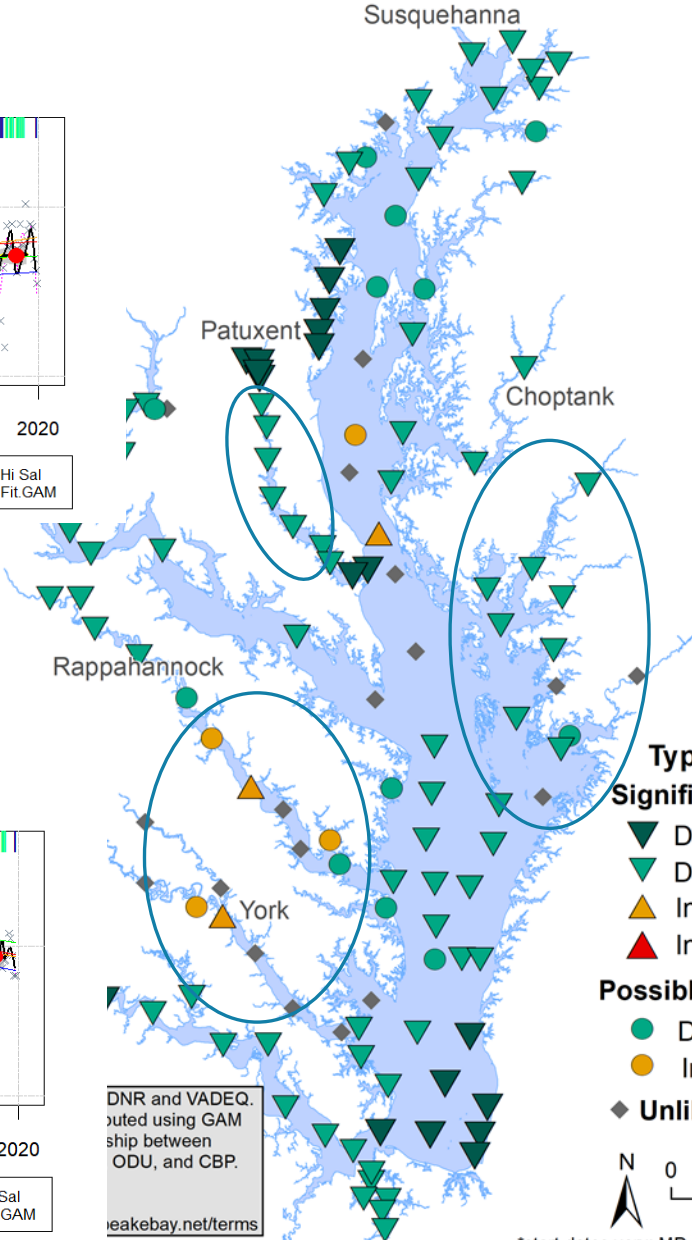
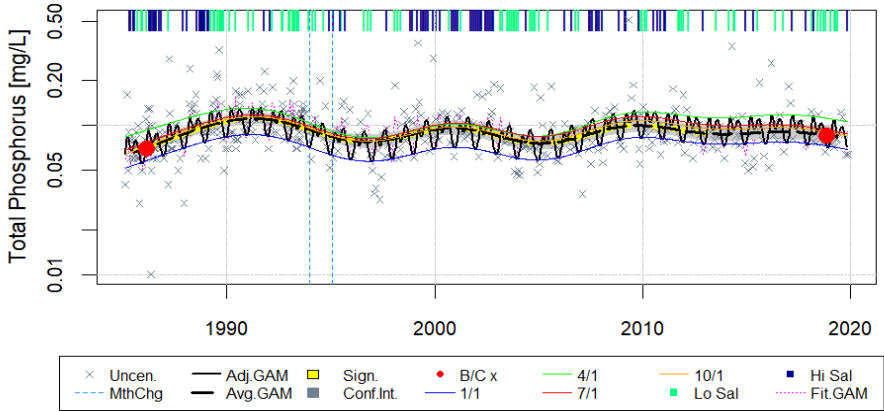
1. Rapp & York MH: Long term ↑  
Short term ↑ ↓ →

Total Phosphorus-Surface & Above Pycnocline at RET1.1



3. Lower Eastern shore: Long term ↓  
Short term ↑ →

Total Phosphorus-Surface & Above Pycnocline at RET4.3

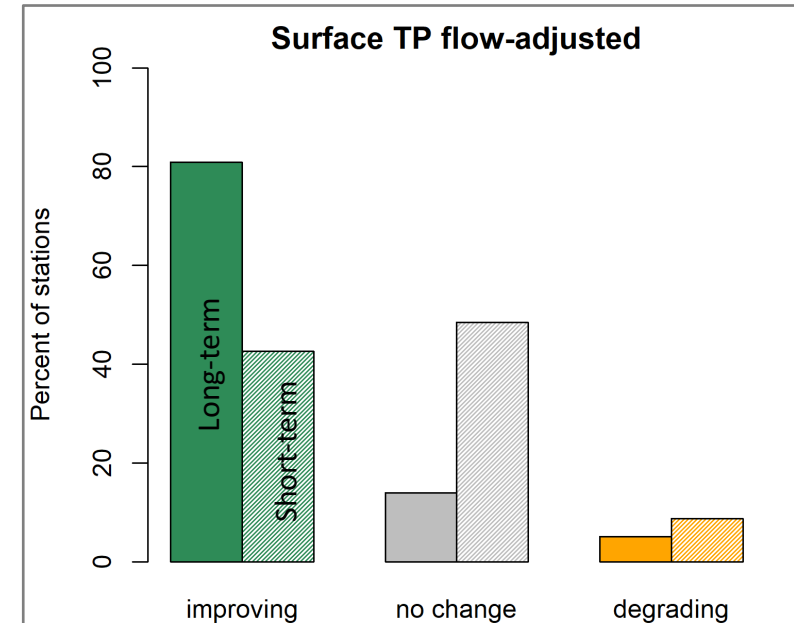


DNR and VADEQ. Data plotted using GAM software. Comparison of ship between ODU, and CBP. [chesapeakebay.net/terms](http://chesapeakebay.net/terms)

\*start dates vary: MD stations 1985, VA mostly 1985 except Elizabeth River 1989.

# TP initial reactions

- Long-term TP is decreasing at most of the stations, but short-term changes are more mixed.
- Long-term, the 1980s decrease in TP drives the downward changes in many places.



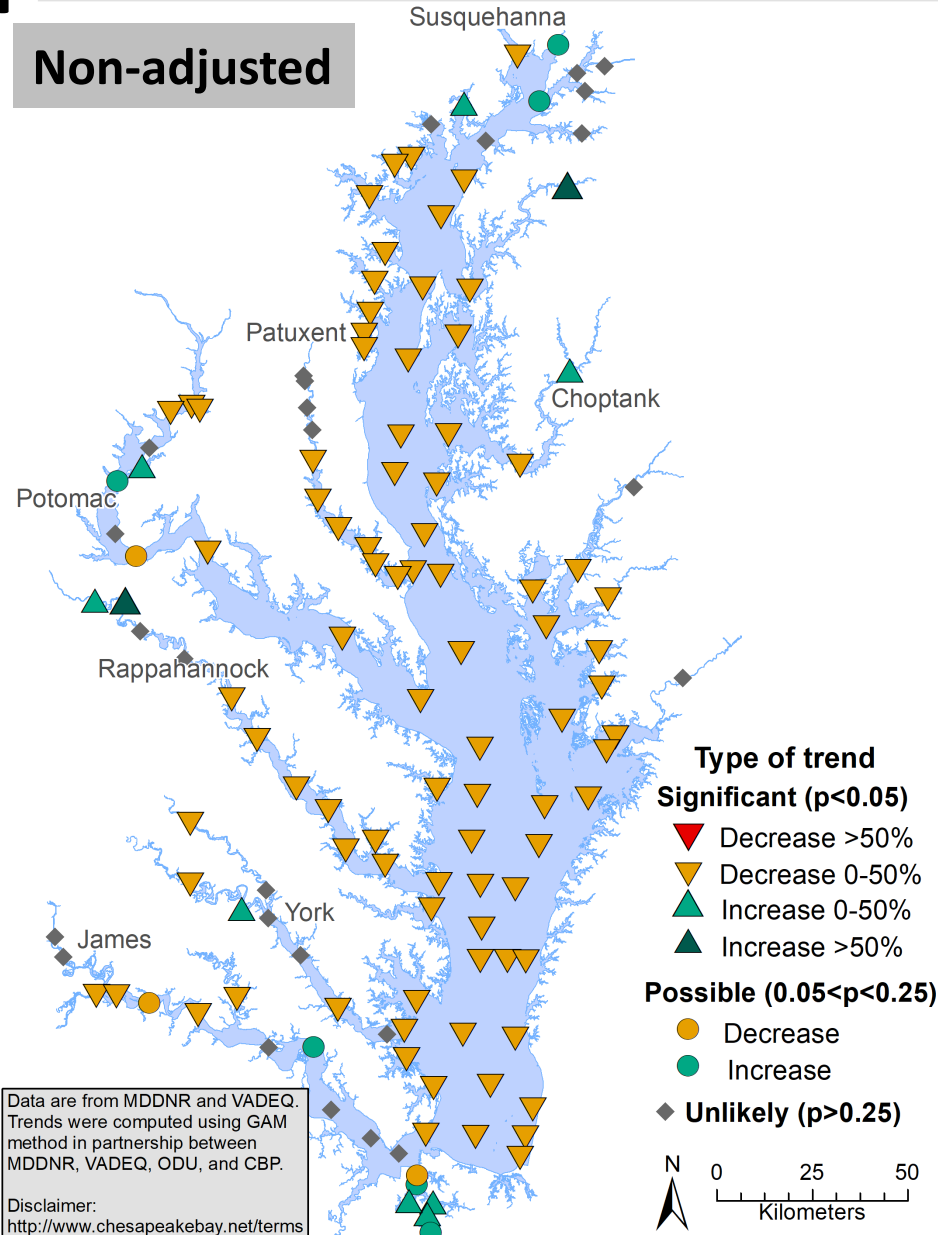
# Secchi

long-term

Chesapeake Bay Secchi depth:  
2019 long-term change\*



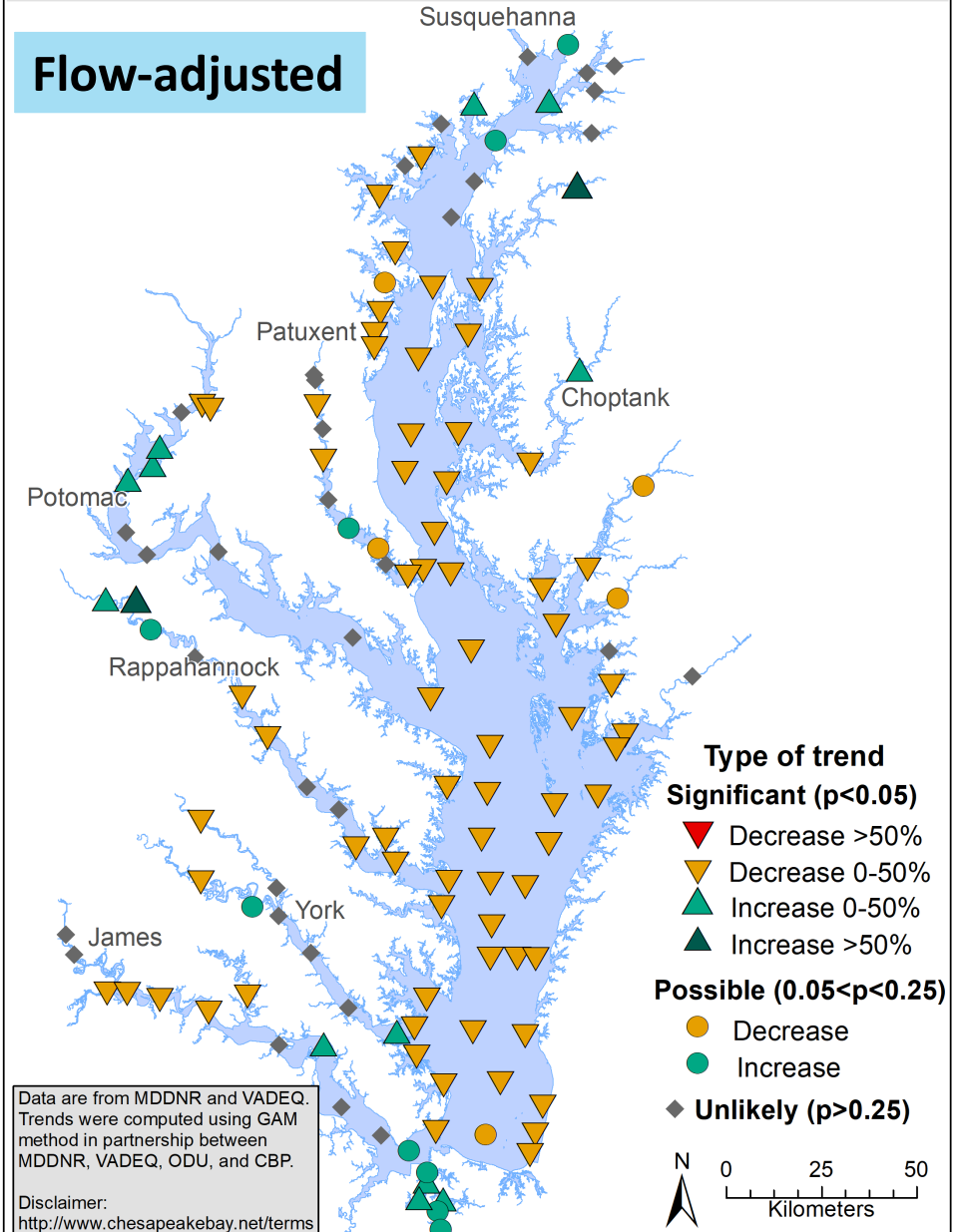
Non-adjusted



Chesapeake Bay Secchi depth:  
2019 long-term flow-adjusted change\*



Flow-adjusted





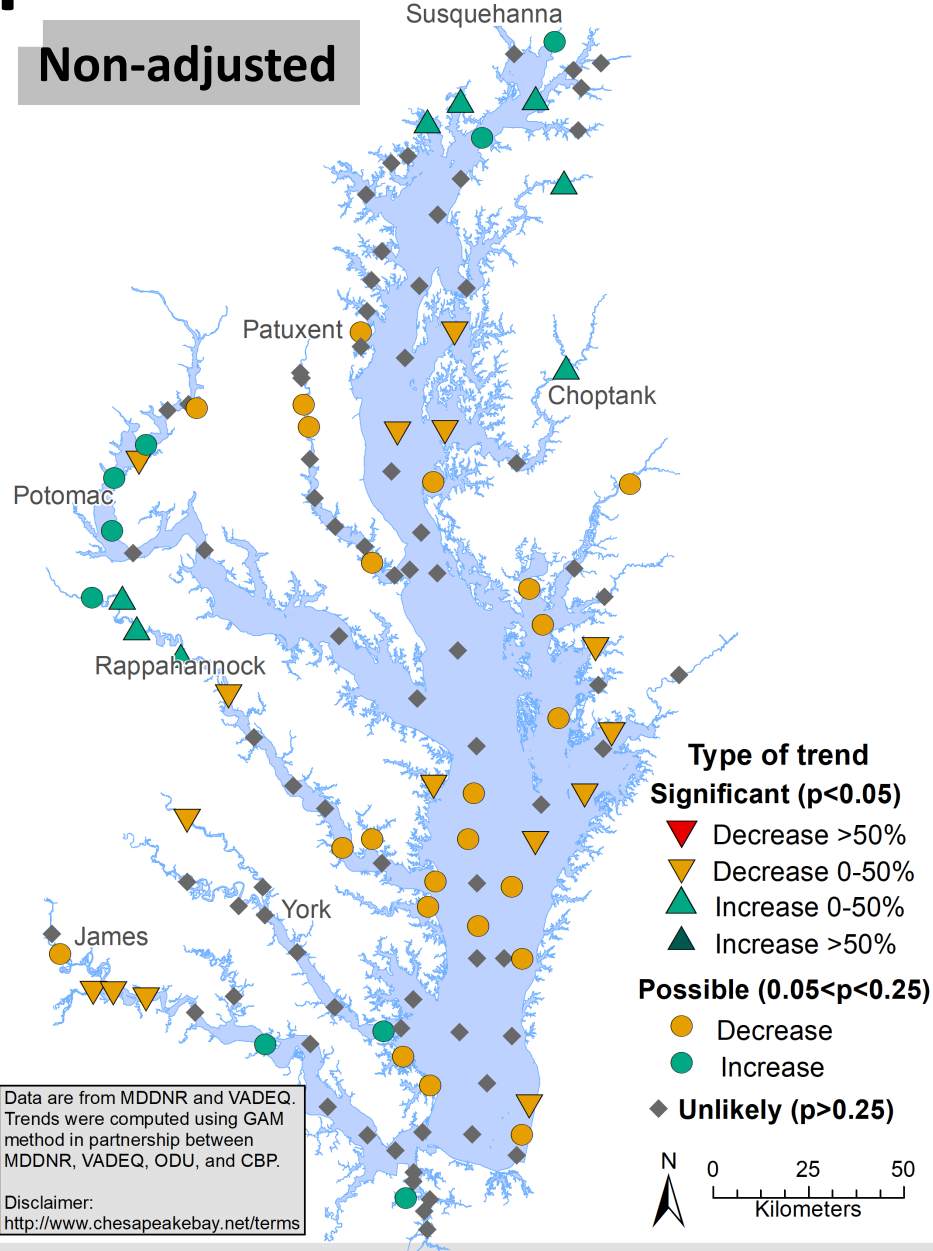
# Secchi

short-term

Chesapeake Bay Secchi depth:  
2010-2019 change



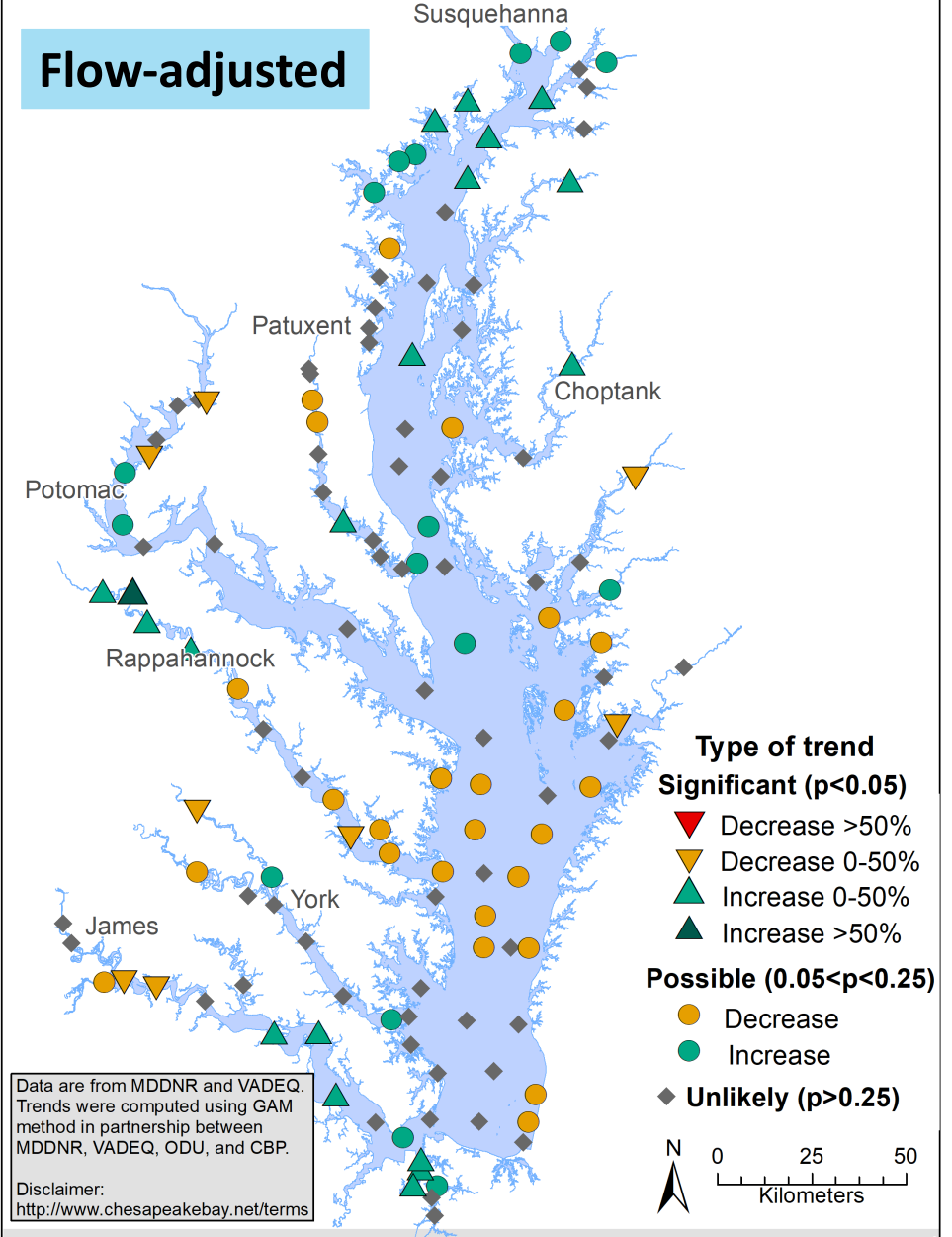
Non-adjusted




Chesapeake Bay Secchi depth:  
2010-2019 flow-adjusted change



Flow-adjusted

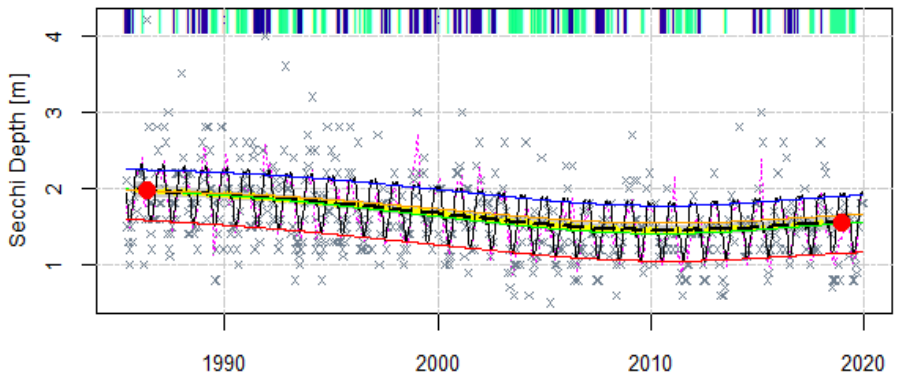


# Secchi: Mainstem mix

Chesapeake Bay Secchi depth: 2019 long-term flow-adjusted change\* 

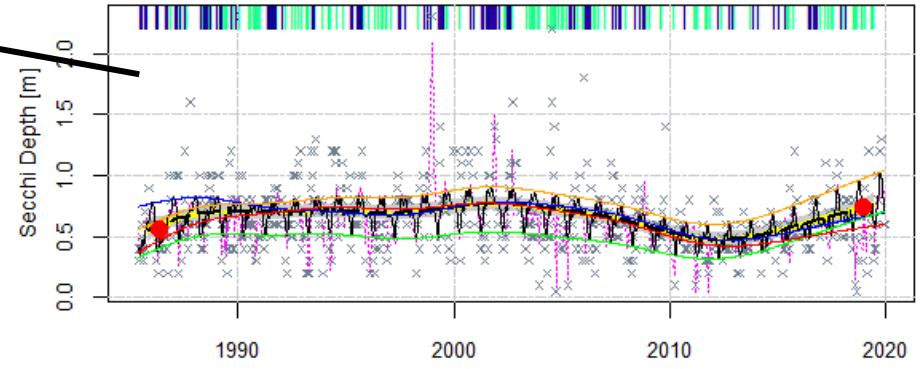
Flow-adjusted

Secchi Depth-Surface at CB4.4



x Uncen.   Avg.GAM   Conf.Int.   1/1   7/1   Hi Flw   Fit.GAM  
 — Adj.GAM   Sign.   B/C x   4/1   10/1   Lo Flw

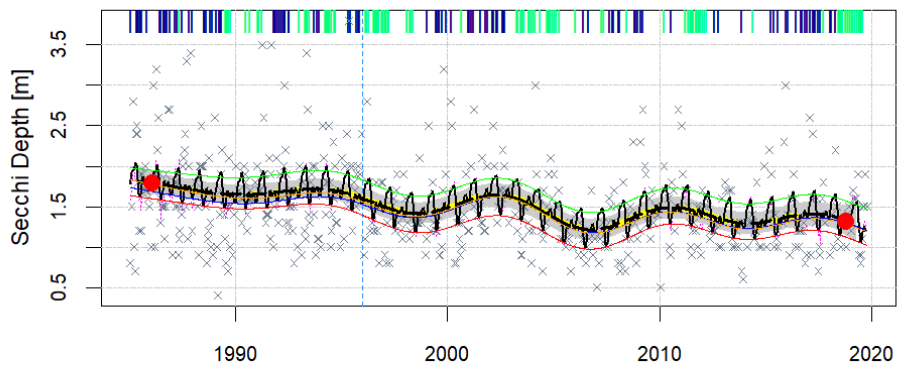
Secchi Depth-Surface at CB2.1



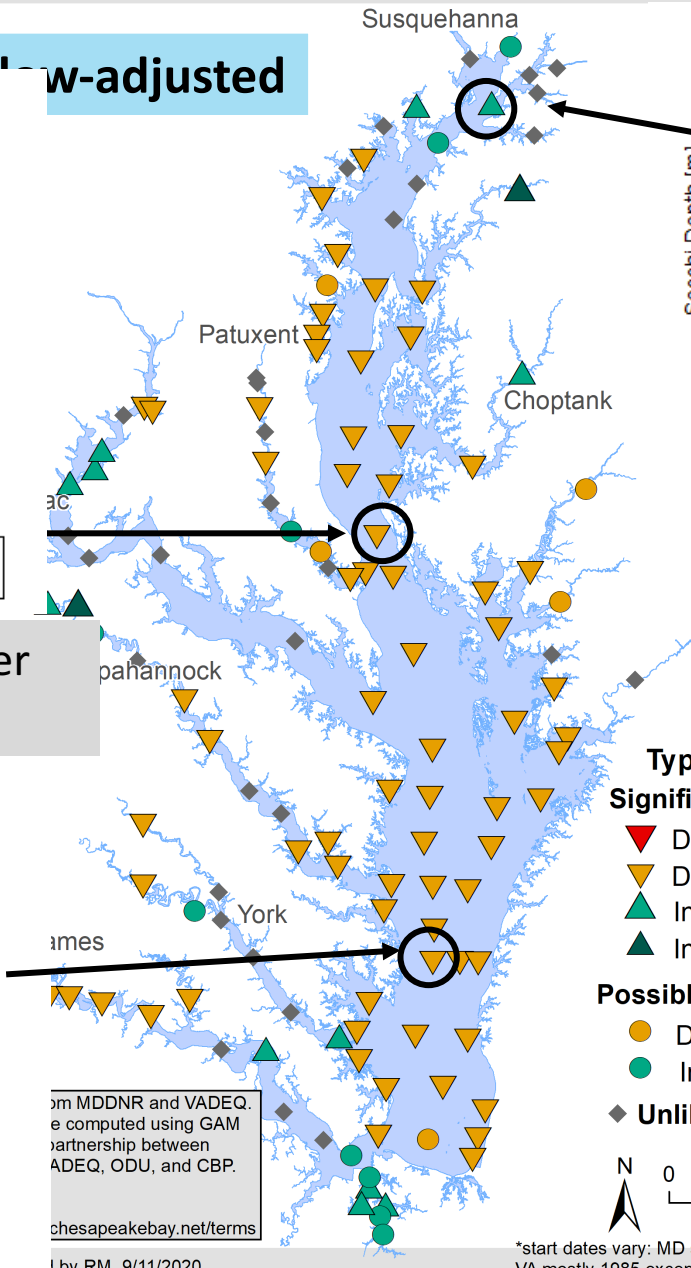
x Uncen.   Avg.GAM   Conf.Int.   1/1   7/1   Hi Flw   Fit.GAM  
 — Adj.GAM   Sign.   B/C x   4/1   10/1   Lo Flw

2. Mid- and lower-mainstem all decrease over long-term, but are fairly flat over short-term

Secchi Depth-Surface at CB6.3

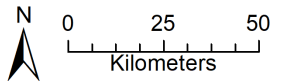


x Uncen.   Adj.GAM   Sign.   B/C x   4/1   10/1   Hi Sal  
 — MthChg   Avg.GAM   Conf.Int.   1/1   7/1   Lo Sal   Fit.GAM



1. Upper bay fairly flat over long-term, and slight increase recently

- Type of trend**
- Significant ( $p < 0.05$ )**
    - Red inverted triangle: Decrease >50%
    - Orange inverted triangle: Decrease 0-50%
    - Green inverted triangle: Increase 0-50%
    - Dark green inverted triangle: Increase >50%
  - Possible ( $0.05 < p < 0.25$ )**
    - Yellow circle: Decrease
    - Light green circle: Increase
  - Unlikely ( $p > 0.25$ )**
    - Grey diamond: Unlikely



from MDDNR and VADEQ. e computed using GAM partnership between ADEQ, ODU, and CBP.

chesapeakebay.net/terms

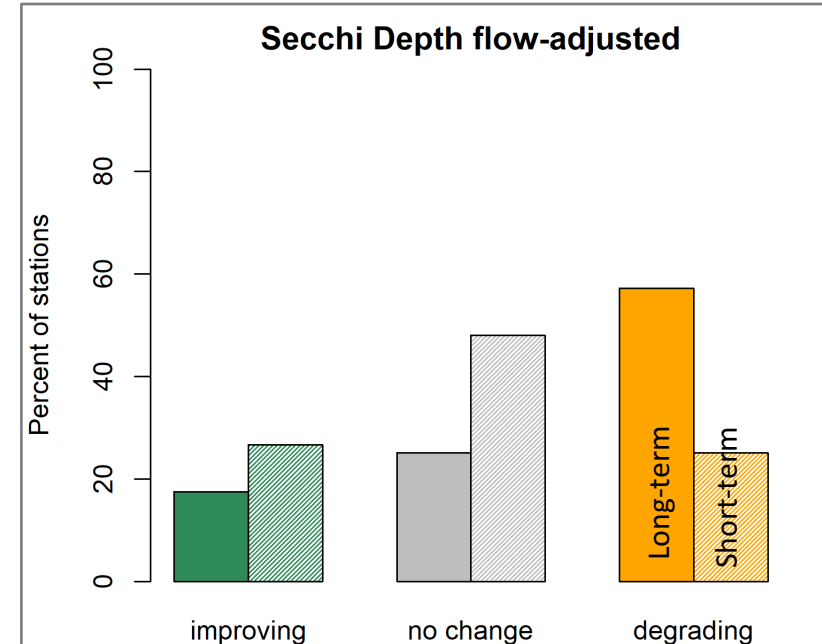
by RM, 9/11/2020

\*start dates vary: MD stations 1985 or 1986, VA mostly 1985 except Elizabeth River 1989.



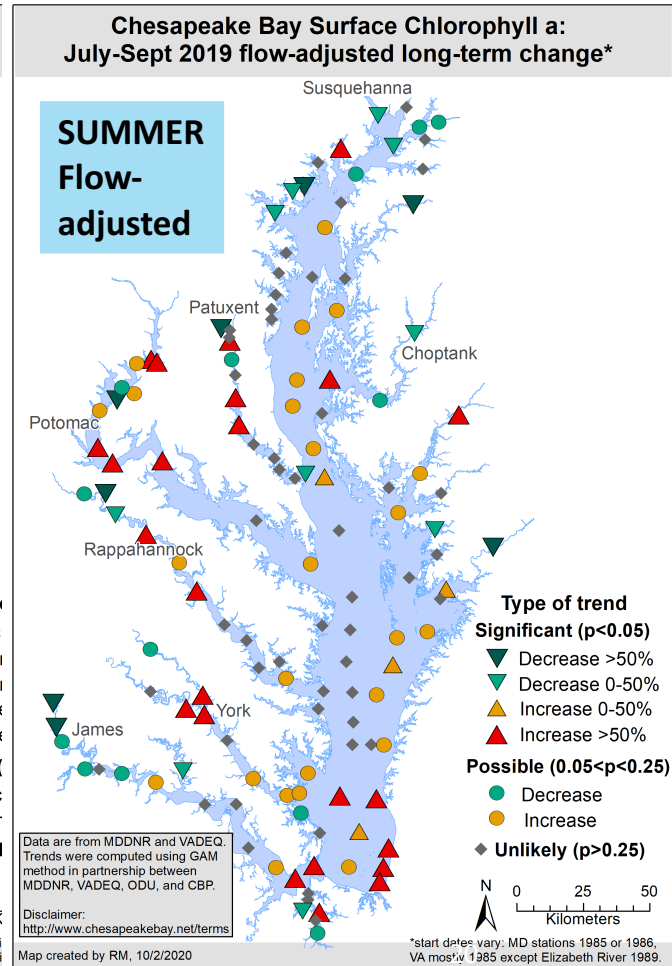
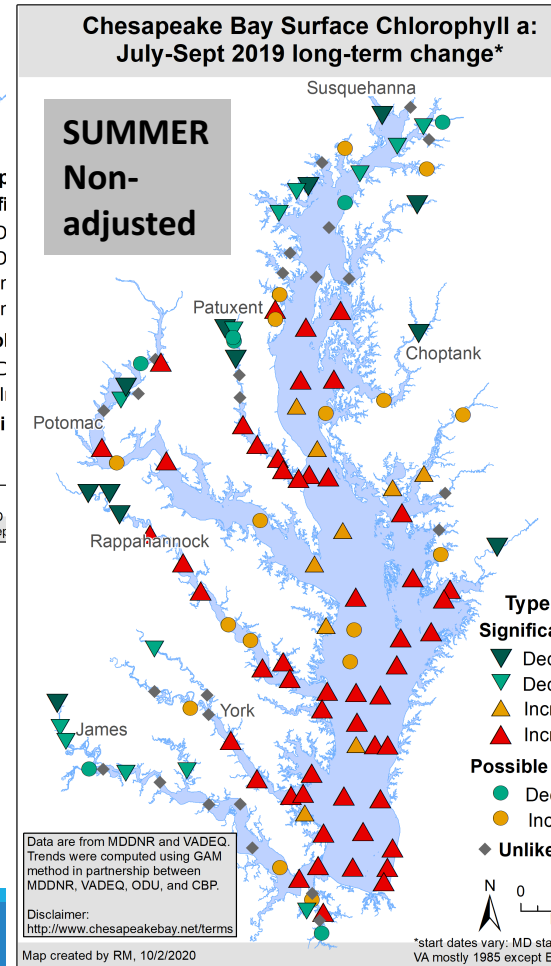
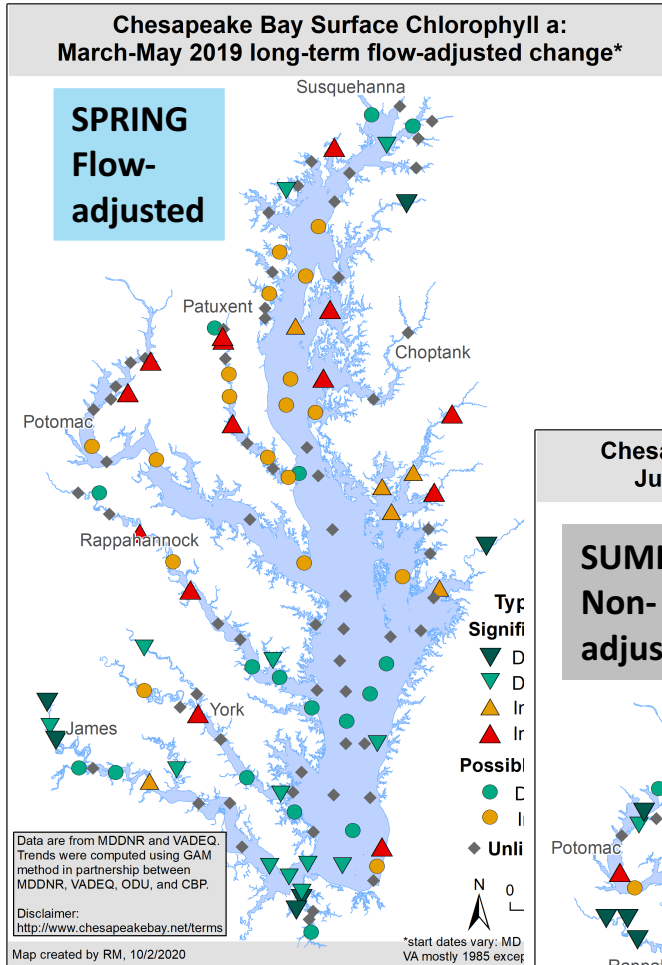
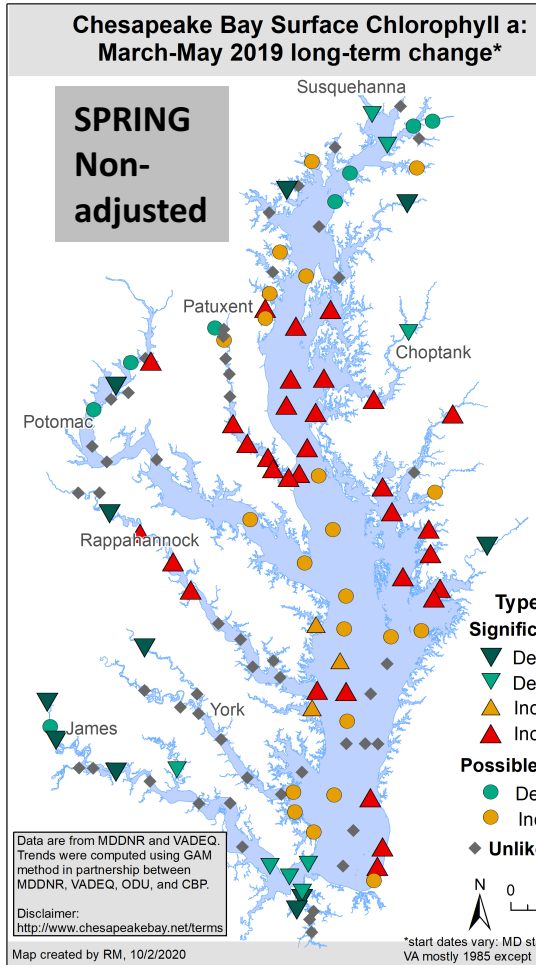
# Secchi initial reactions

- Long-term degradation of Secchi at many stations is most obvious take-away.
- Shorter-term, the number of degradations is much lower, and there are even slightly more improvements than degradations (flow-adjusted).
- The diverse set of GAM fits over time suggests to me many different factors at play depending on location.



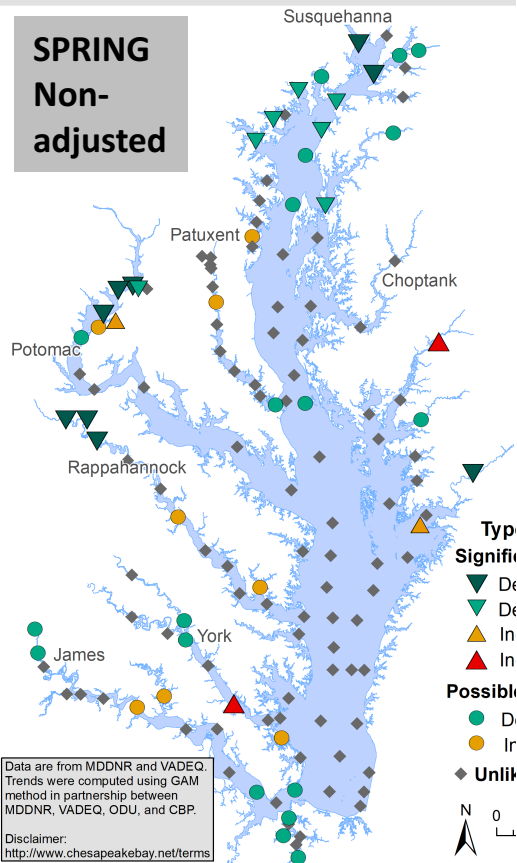
# Chlorophyll-a

long-term



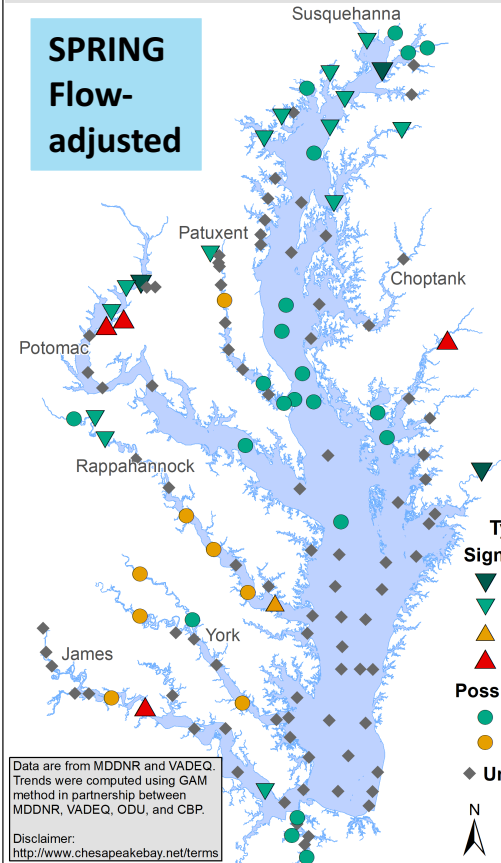
**Chesapeake Bay Surface Chlorophyll  
March-May 2010-2019 change**

**SPRING  
Non-  
adjusted**



**Chesapeake Bay Surface Chlorophyll a:  
March-May 2010-2019 flow-adjusted change\***

**SPRING  
Flow-  
adjusted**

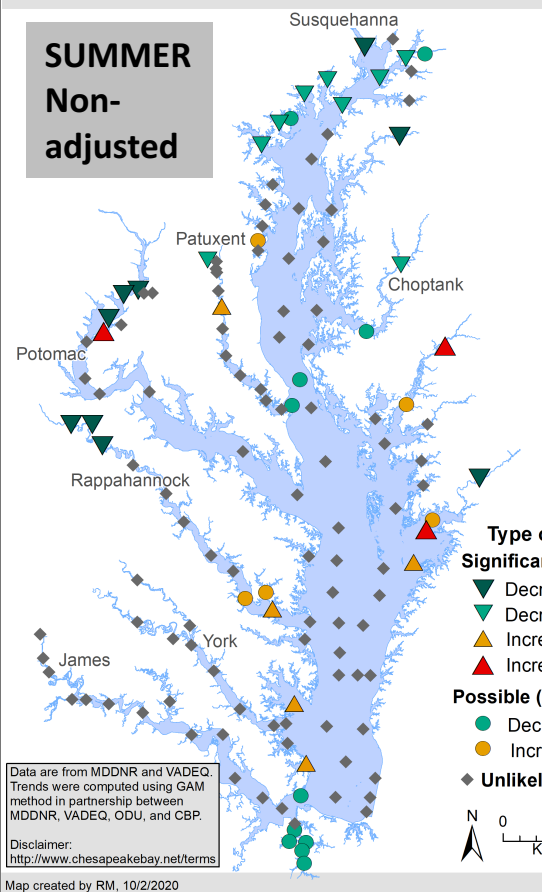


# Chlorophyll-a

short-term

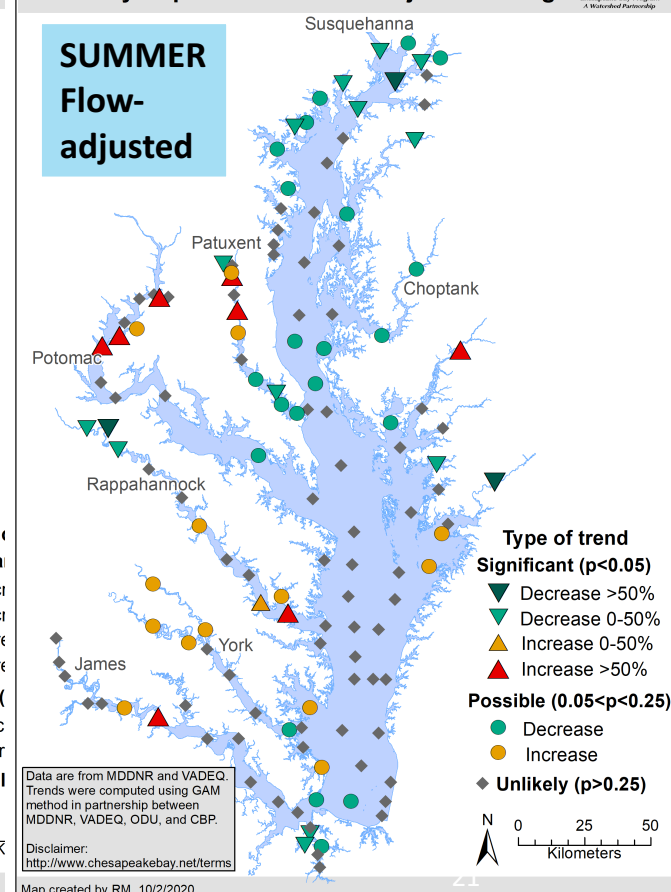
**Chesapeake Bay Surface Chlorophyll a:  
July-Sept 2010-2019 change**

**SUMMER  
Non-  
adjusted**



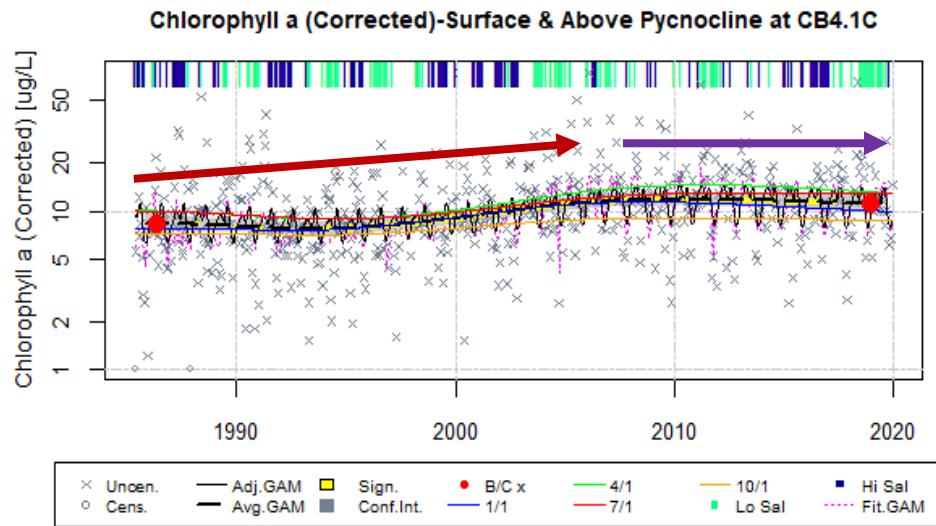
**Chesapeake Bay Surface Chlorophyll a:  
July-Sept 2010-2019 flow-adjusted change**

**SUMMER  
Flow-  
adjusted**

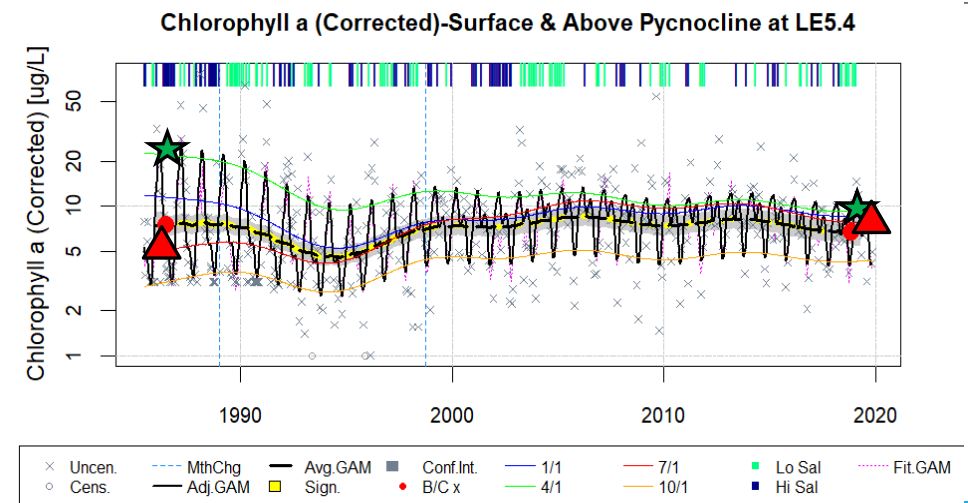
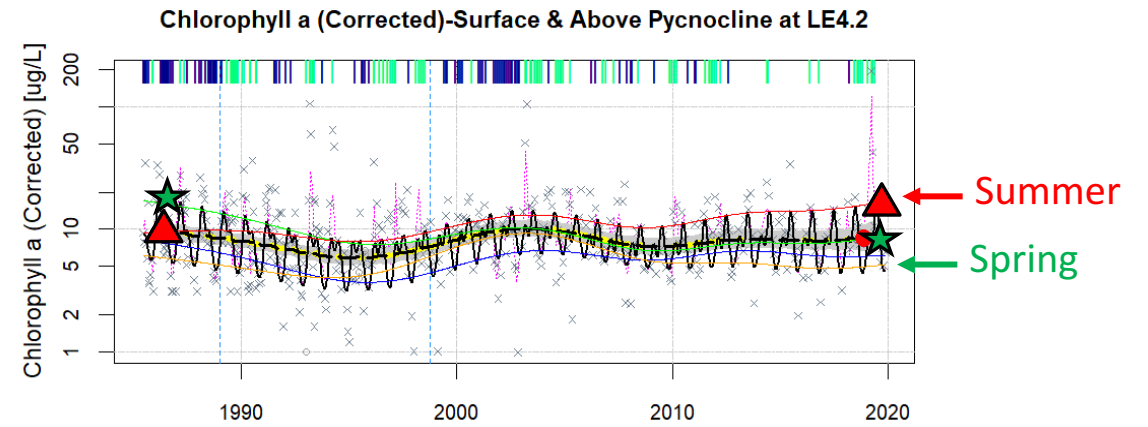


# Chlorophyll-a

1. Long-term maps show many degrading locations. But over the last 10-years, many of these turn to “no change.”

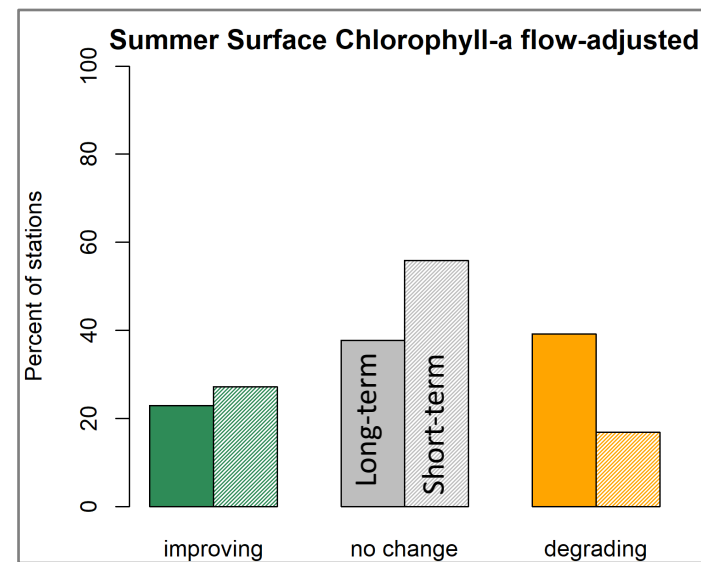
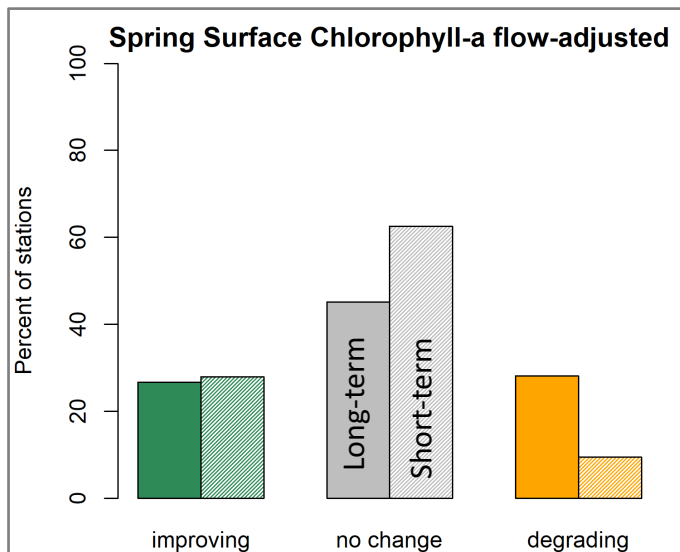


2. The polyhaline segments are the ones where we see the largest consistent difference in long-term change between the spring and summer.



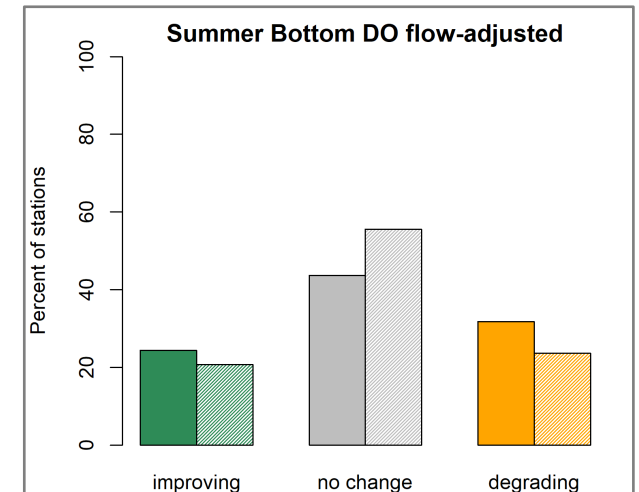
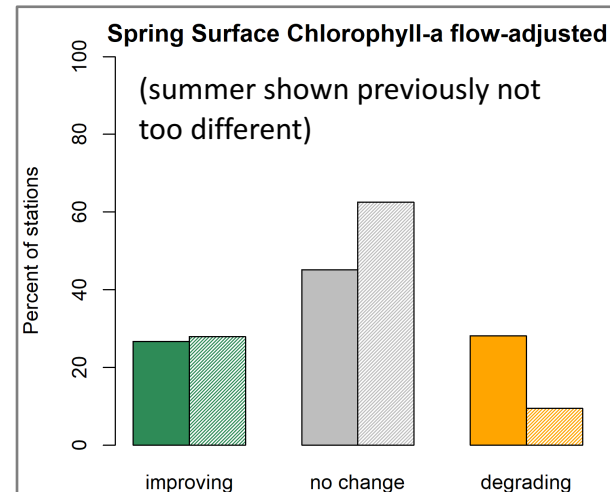
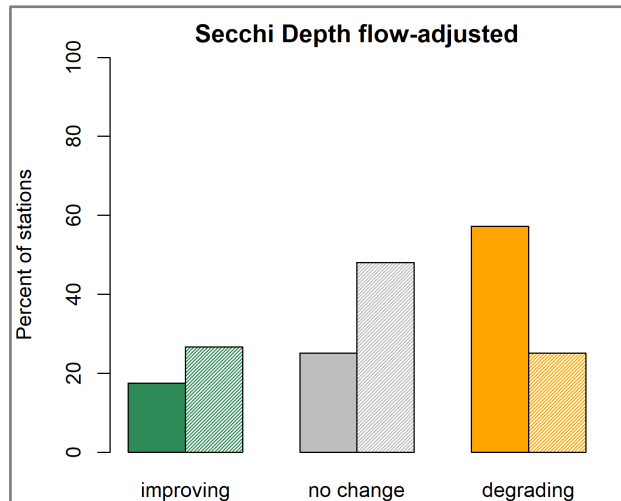
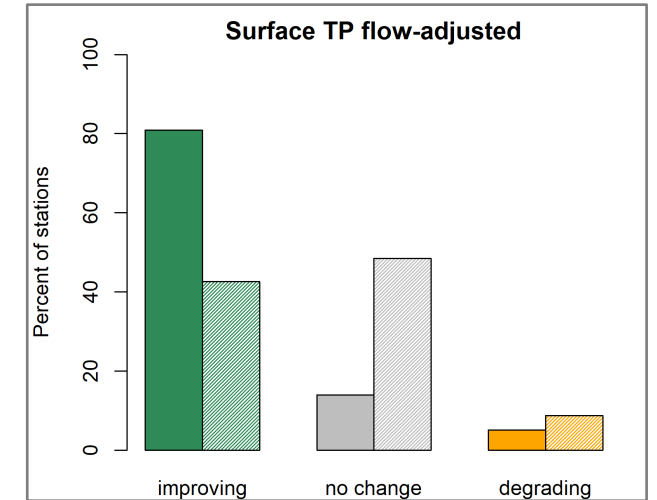
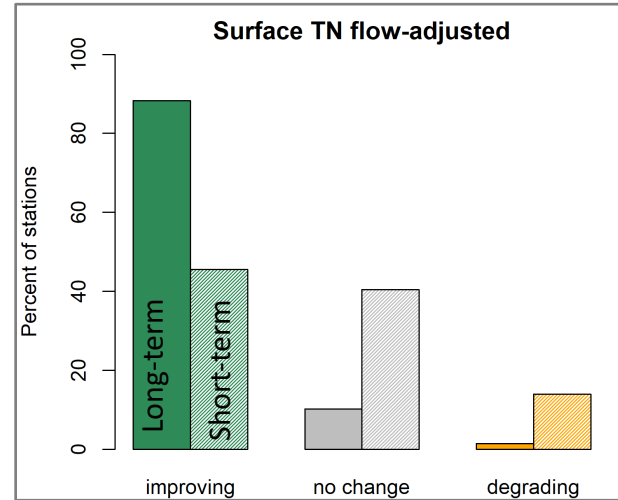
# Chlorophyll-a initial reactions

- Short-term chlorophyll-a has leveled out at many stations, turning degrading long-term changes into no change in the short-term.
- Like Secchi, patterns differ greatly by region.



# 2019 Summary

- Two very wet years influenced observed changes, but can be mostly accounted for with flow-adjustment.
- Nutrient concentrations improved mostly over the long-term, although slower rate of improvement lately.
- Some promise in reduced number of degrading stations over the short-term for Secchi, chlorophyll-a and DO.





# Deeper investigations

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- Currently:
  - Linking TN and TP tidal patterns to watershed nutrient loads and BFL point source loads (Murphy et al. in prep manuscript)
  - Our team is exploring how the GAM results group spatially (Elgin Perry leading)
  - Our team has used these results in combination with SEM to explore chlorophyll-a patterns in the Patuxent (Jon Harcum and Diane Allen lead, Tetra Tech)
  - Tributary reports will summarize these results by location in combination with watershed and other information (Potomac release soon, Jeni Keisman lead)
- Published studies investigating/comparing changes observed with these results:
  - Changes in nutrient limitation patterns were compared to dissolve nutrient GAMs: Zhang et al. 2021. Water Research 188.
  - Examined Secchi changes compared to  $k_d$  for water clarity: Keisman et al. 2019 STAC Publication 19-004
  - Explored changing seasonality of chl-a and N: Testa et al. 2018. Frontiers in Marine Science 5:114.