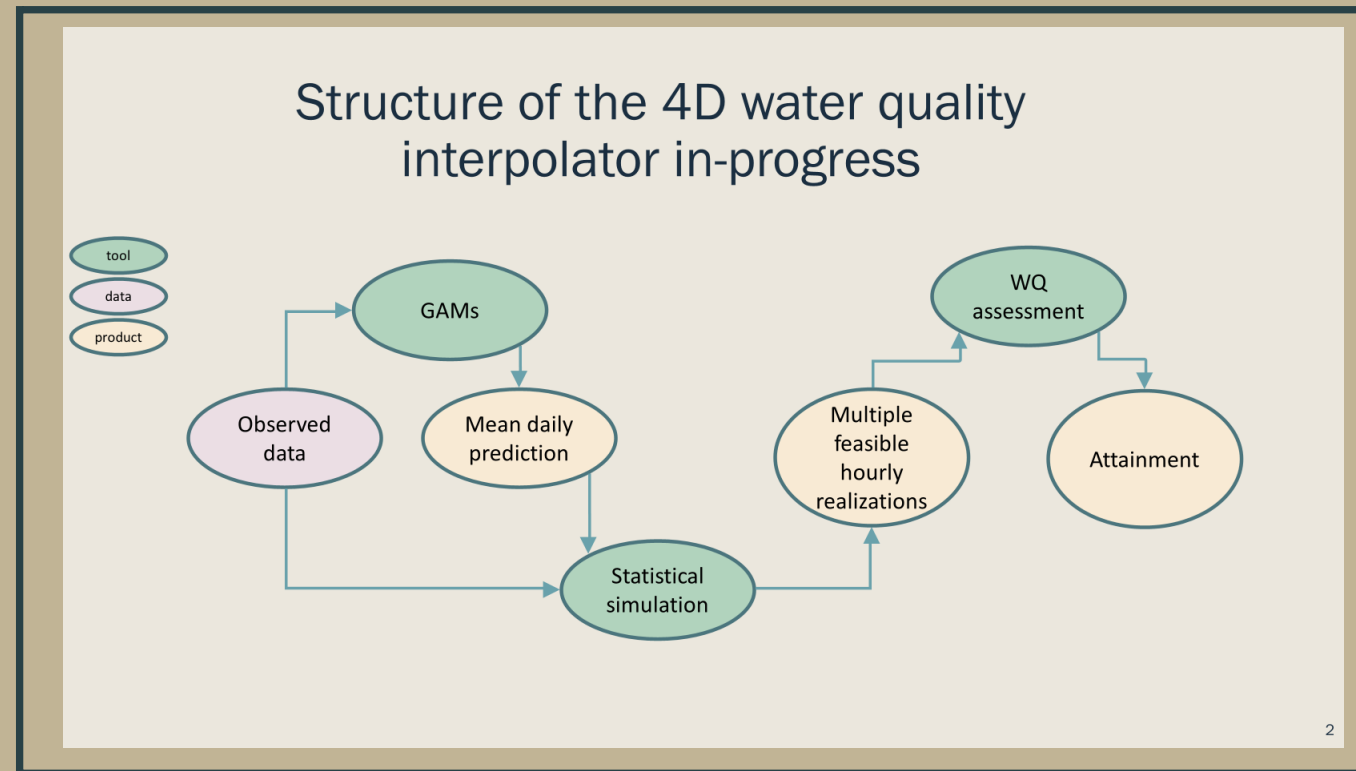


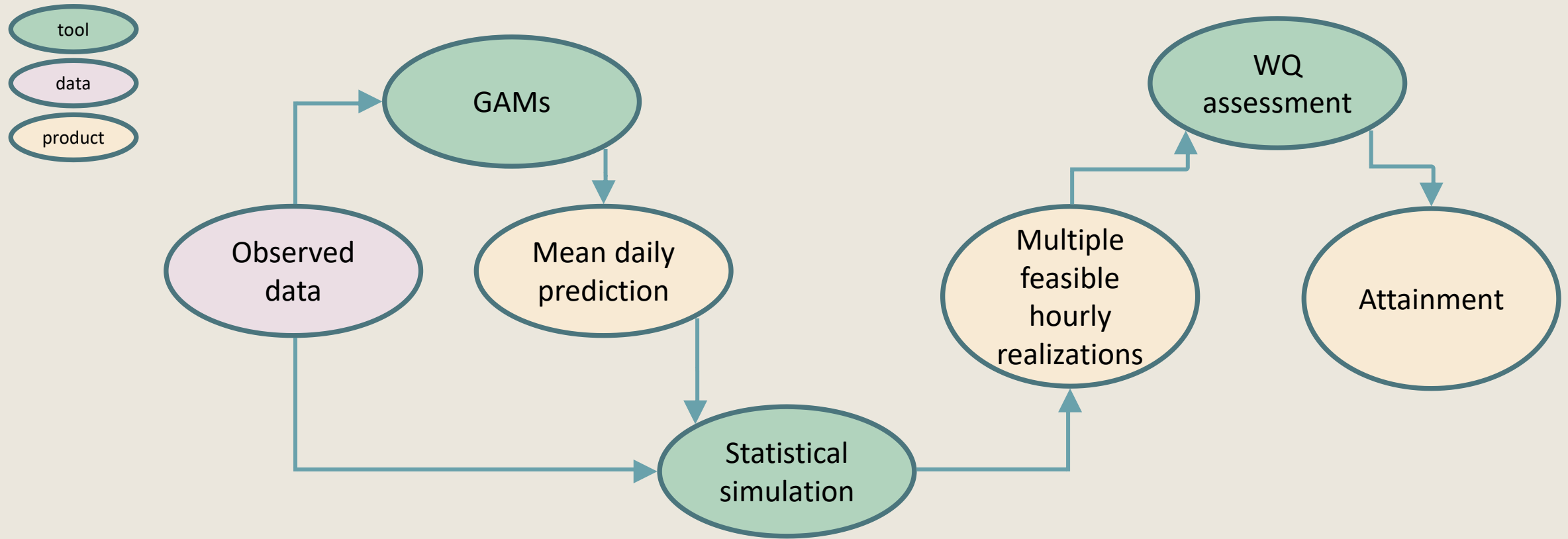
# 4D Interpolator – But wait! There's more!

Follow-up from the Phase 7 update to the WQGIT meeting.



Peter Tango and Rebecca Murphy  
Co-chairs: Bay Oxygen Research Group  
WQGIT 3/25/2024

# Structure of the 4D water quality interpolator in-progress



# Goal statement for new interpolator

To develop a spatial-and-temporal interpolation tool for water quality monitoring data collected in the tidal waters of the Chesapeake Bay, thus enabling the evaluation of both long- and short-duration water quality criteria.

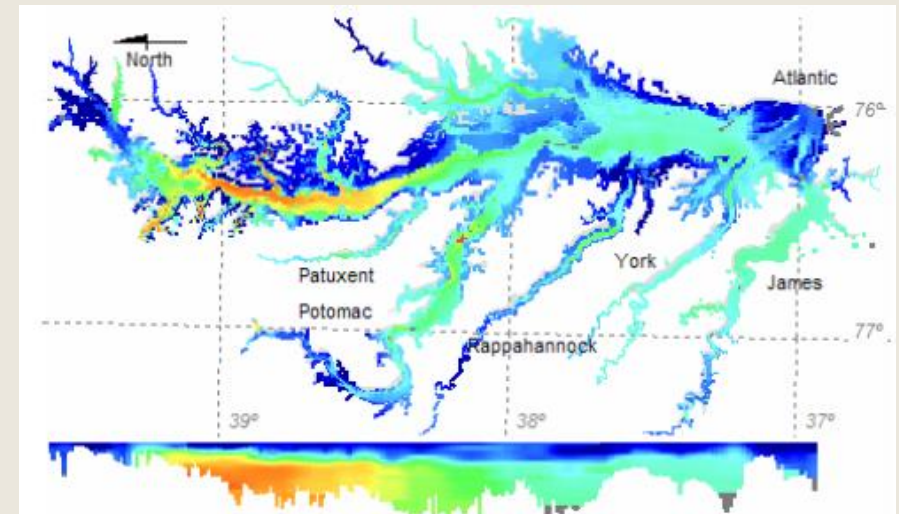
Specifically, the tool should be able to:

- *Interpolate observed dissolved oxygen in space and time (“4D”), \**
- *Provide statistical estimates of uncertainty,*
- *Reproduce daily and hourly variability of the data, and*
- *Allow for post-processing of the interpolation output into designated uses (DU).*

\*Note: Focus on development so far has been on dissolved oxygen, but ultimately chlorophyll a and clarity may be evaluated as well.

# Current 3D interpolation


- Uses **inverse-distance weighting** of observations from long-term fixed stations, plus additional data as possible.
- **Temporal: snapshots**, generally using data collected within a week or two
- **Spatial:**
  - *Horizontal: Grid 1km x 1km in mainstem, finer (50m) in tribs*
  - *Vertically: Interpolation are done horizontally for every 1m in depth, and stacked to get 3d results*
- **Pycnocline:**
  - *An upper and lower pycnocline depth are interpolated horizontally as well*
  - *3D DO is split in DUs based on pycnocline*



VOL3d program output, Bahner 2006

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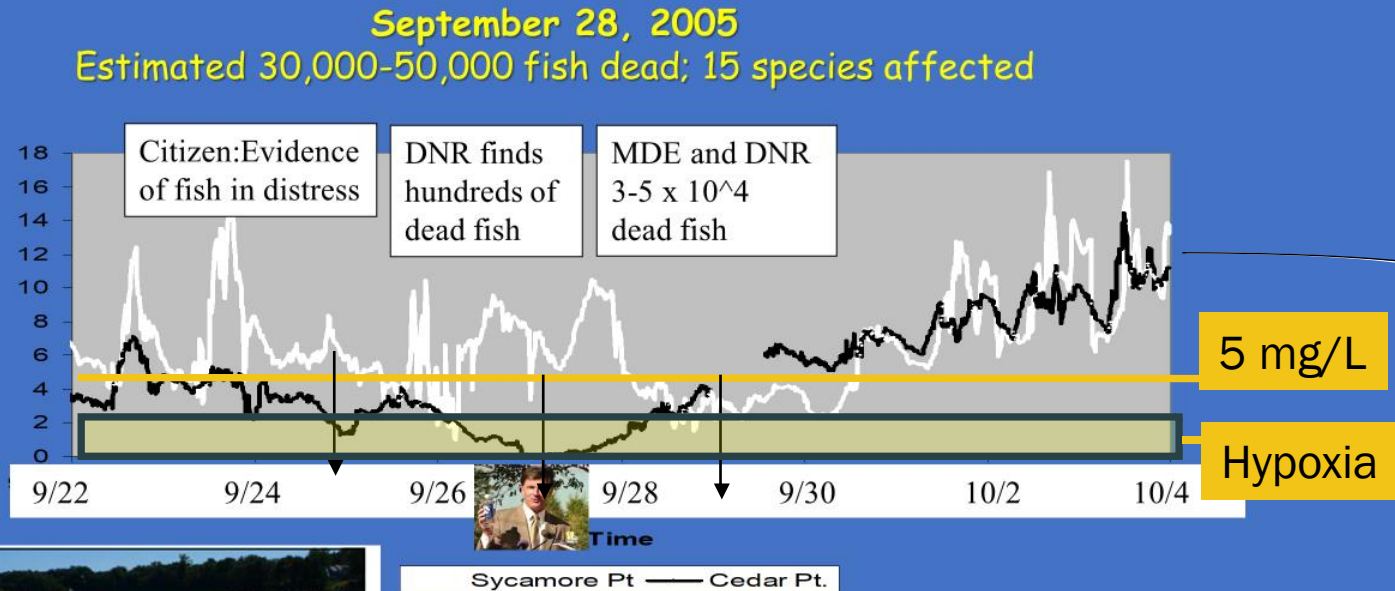
*This is a key limitation.  
We need to interpolate in  
time (1-D) as well as  
space (3-D) to evaluate all  
WQ criteria = “4-D”*

# 1-dimensional assessment of water quality.

One depth, through time. High temporal resolution, 13 days.  
Catching the moment of a Corsica River, MD fish kill (2005).



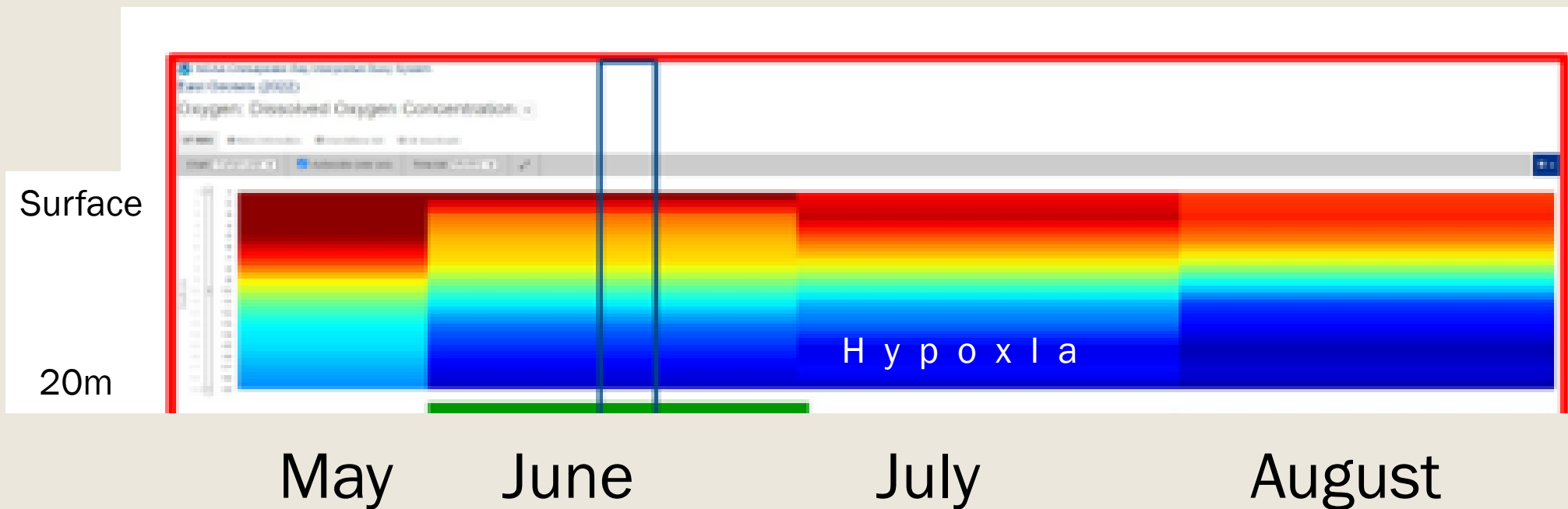
Dissolved Oxygen mg/L



Fish Kill in the Corsica



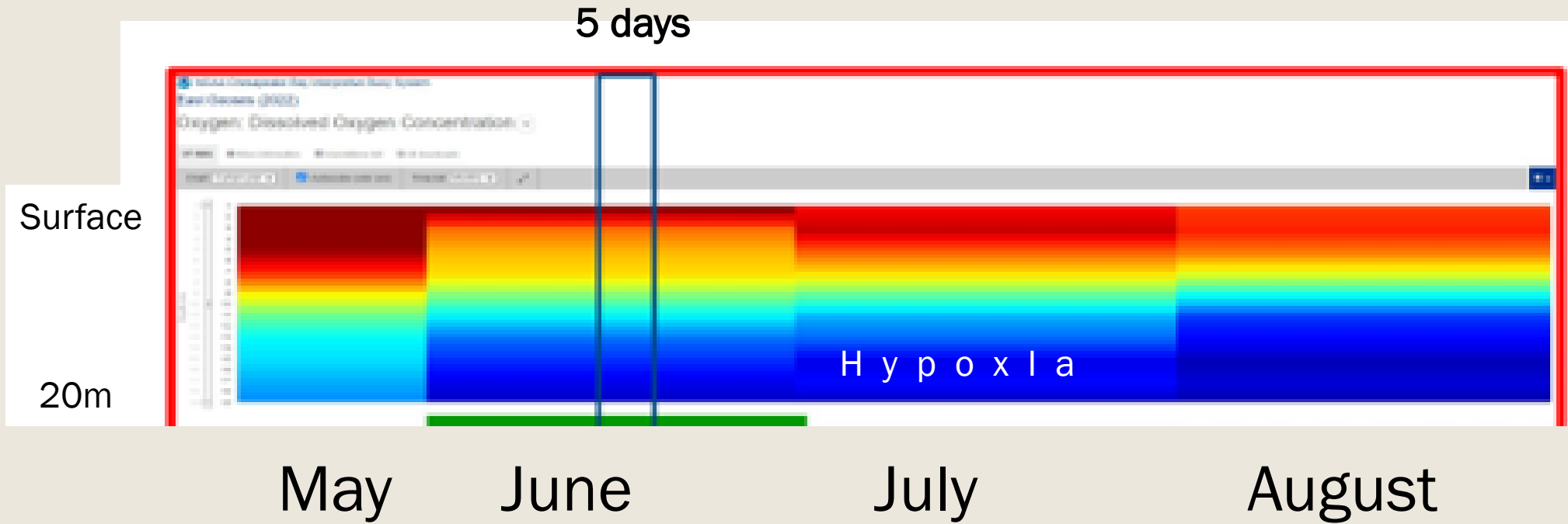
1 sample a month to estimate conditions makes a monitoring site look like this:



Dissolved oxygen: a single monitoring site in the Bay



# 1 sample a month to estimate a 30-day mean condition looks like this



Dissolved oxygen: a single monitoring site in the Bay

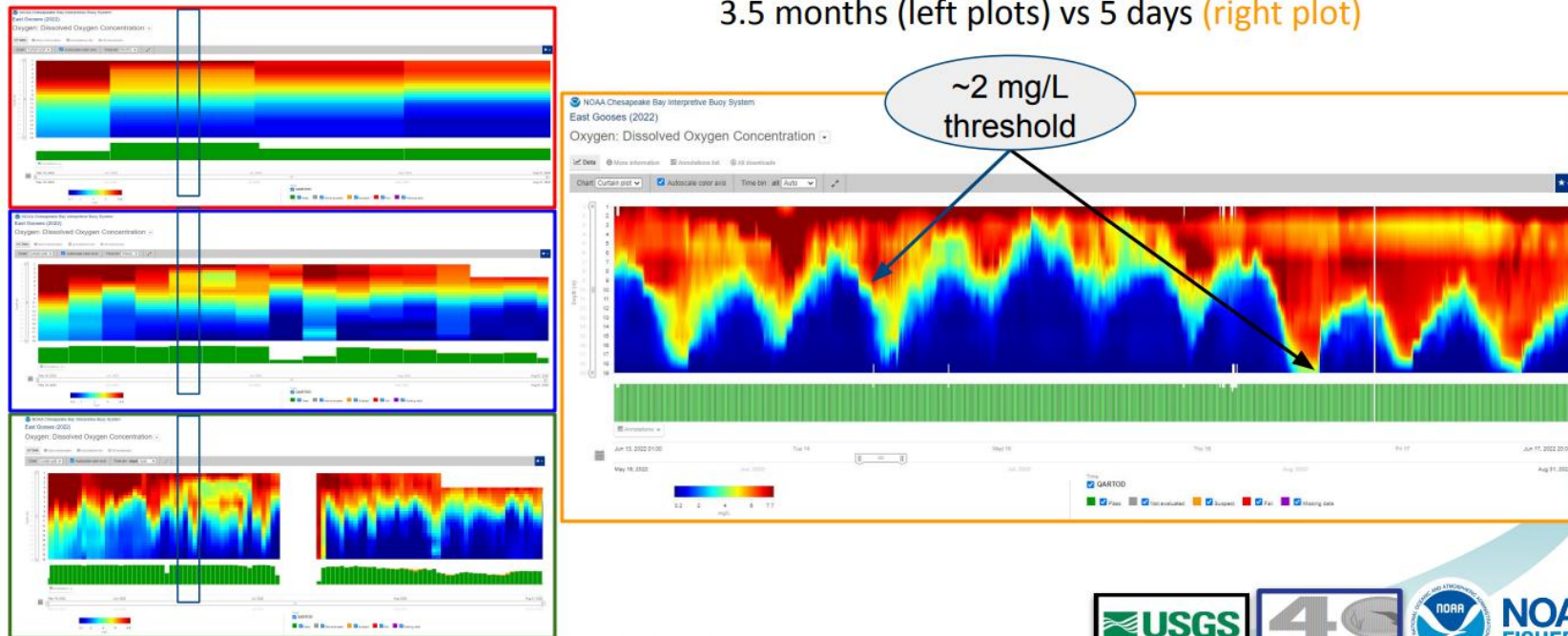


## 2-Dimensional improvement with new depth specific, water column data. More accurate information to inform criteria assessment, characterize habitat

### The Difference is Temporal Resolution

Monthly (top left), Weekly (middle left), Daily (bottom left), 10 min (middle right)

3.5 months (left plots) vs 5 days (right plot)

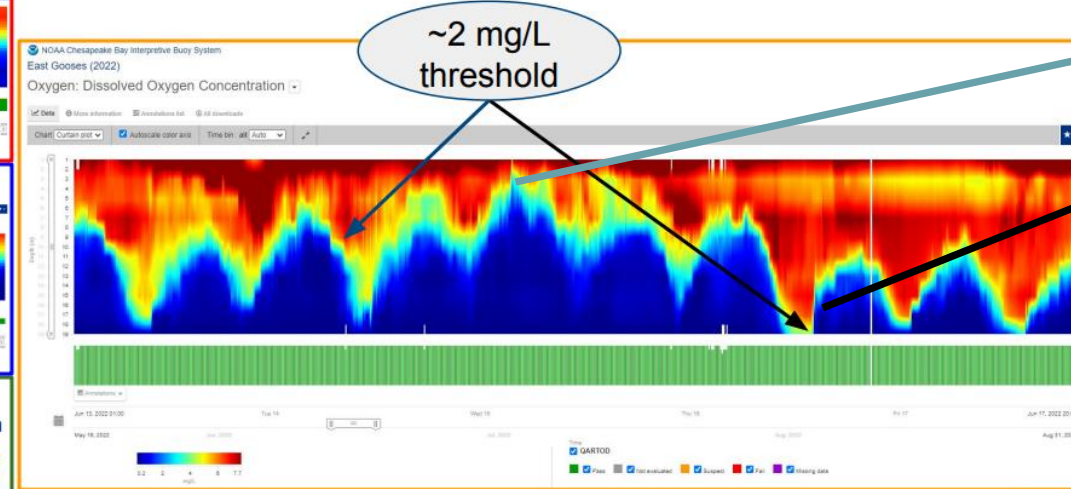
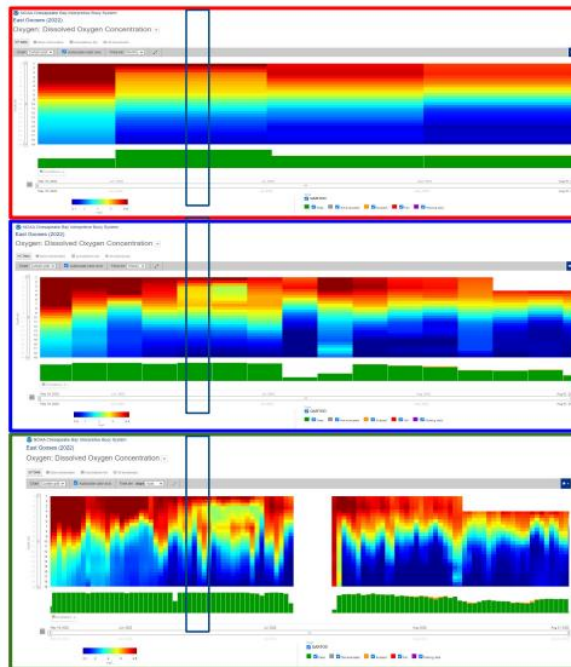


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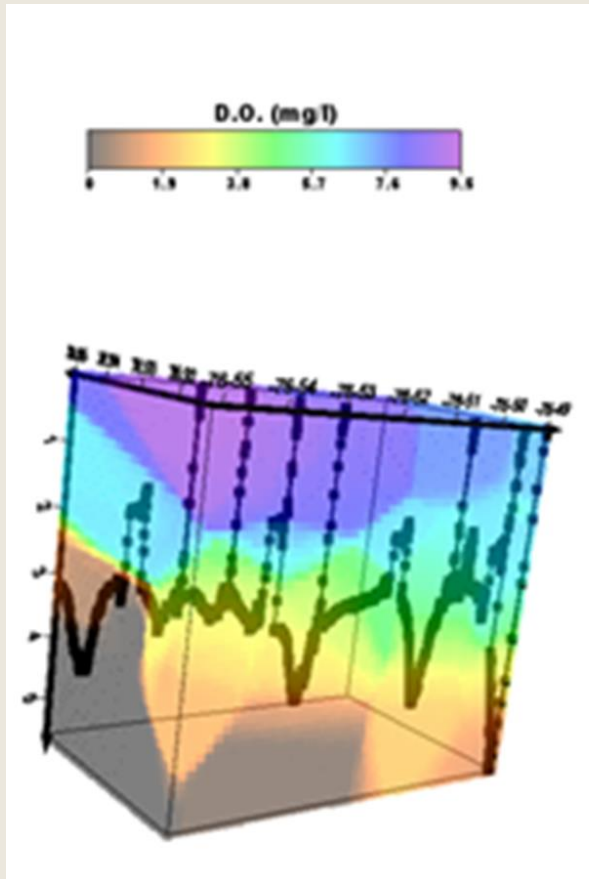
Monthly (top left), Weekly (middle left), Daily (bottom left), 10 min (middle right)

3.5 months (left plots) vs 5 days (right plot)



Anoxic water column  
Fully oxygenated Water column

1 sampling cruise in the bay allows us to compute a **3-D picture** estimating habitat conditions as a snapshot volume in time



## DO 3D

Severn River

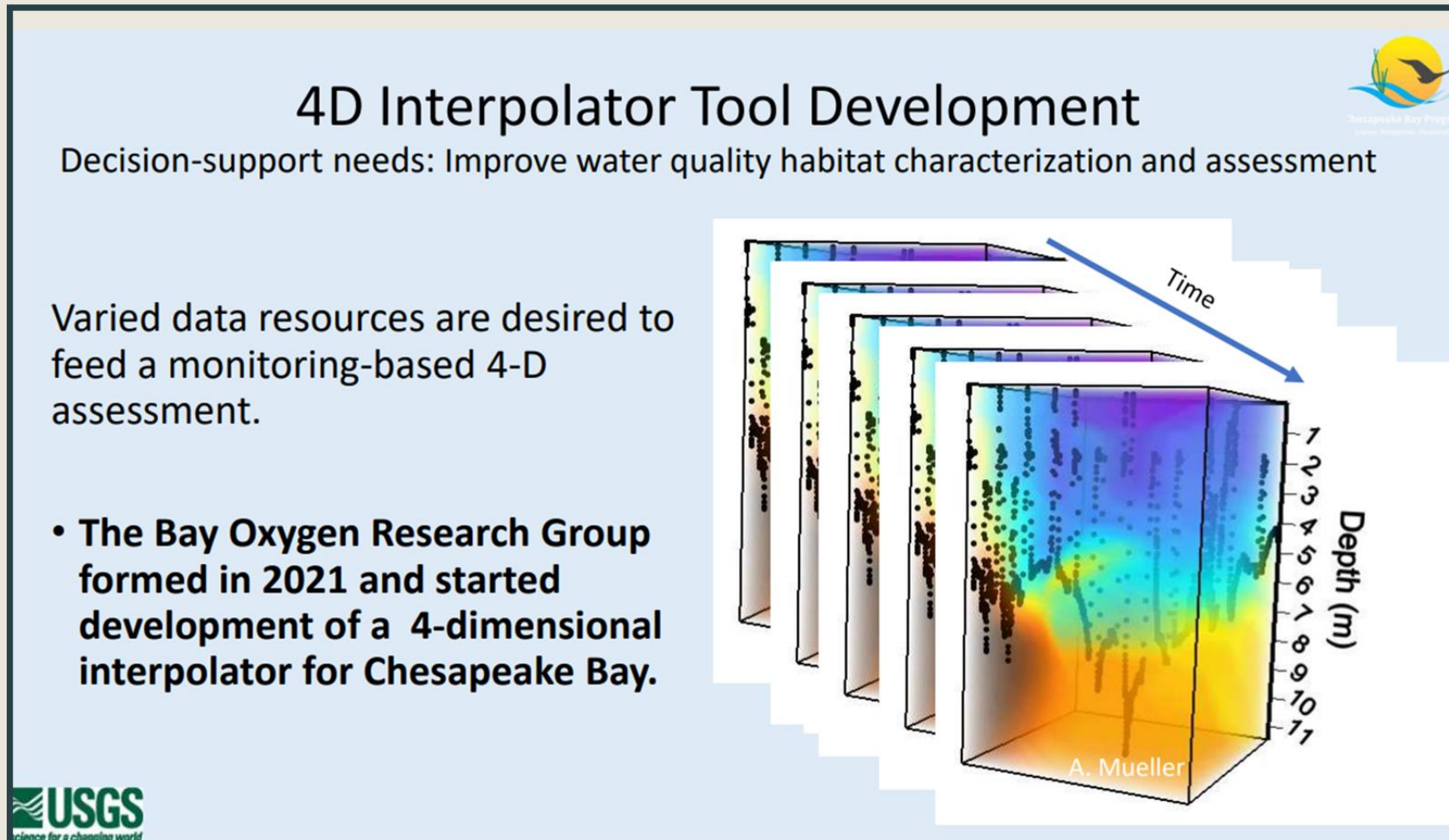
From Andrew and Diana Mueller

The data were from an UAV that would dive and surface, dive and surface. That allows for 3-D interpolation as if we had multiple profiles of WQ and some at depth horizontal measurements. Single day monitoring event.



# Interpolating 3D volume through time = 4D.

We fill in the time voids to get at short duration d.o. criteria assessment, high temporal and spatial habitat assessment.



# Purpose: Build a tool for more complete criteria assessment

*DO criteria that currently can be evaluated with existing approaches and data*

**Table 1.** Chesapeake Bay dissolved oxygen criteria.

| Designated Use                             | Criteria Concentration/Duration   | Protection Provided  | Temporal Application  |
|--|---|--|-----------------------|
| Migratory fish spawning and nursery use *  | 7-day mean $\geq 6$ mg liter <sup>-1</sup><br>(tidal habitats with 0-0.5 ppt salinity)    | Survival/growth of larval/juvenile tidal-fresh resident fish; protective of threatened/endangered species. | February 1 - May 31   |
|  | Instantaneous minimum $\geq 5$ mg liter <sup>-1</sup>                                     | Survival and growth of larval/juvenile migratory fish; protective of threatened/endangered species.        |                       |
|  | Open-water fish and shellfish designated use criteria apply                               |  | June 1 - January 31   |
| Shallow-water bay grass use                | Open-water fish and shellfish designated use criteria apply                               |  | Year-round            |
| Open-water fish and shellfish use          | 30-day mean $\geq 5.5$ mg liter <sup>-1</sup><br>(tidal habitats with 0-0.5 ppt salinity) | Growth of tidal-fresh juvenile and adult fish; protective of threatened/endangered species.                | Year-round            |
|  | 30-day mean $\geq 5$ mg liter <sup>-1</sup><br>(tidal habitats with >0.5 ppt salinity)    | Growth of larval, juvenile and adult fish and shellfish; protective of threatened/endangered species.      |                       |
|  | 7-day mean $\geq 4$ mg liter <sup>-1</sup>  | Survival of open-water fish larvae.  |                       |
|  | Instantaneous minimum $\geq 3.2$ mg liter <sup>-1</sup>                                   | Survival of threatened/endangered sturgeon species. <sup>1</sup>   |                       |
| Deep-water seasonal fish and shellfish use | 30-day mean $\geq 3$ mg liter <sup>-1</sup>   | Survival and recruitment of bay anchovy eggs and larvae.   | June 1 - September 30 |
|  | 1-day mean $\geq 2.3$ mg liter <sup>-1</sup>  | Survival of open-water juvenile and adult fish.  |                       |
|  | Instantaneous minimum $\geq 1.7$ mg liter <sup>-1</sup>                                   | Survival of bay anchovy eggs and larvae.   |                       |
|  | Open-water fish and shellfish designated-use criteria apply                               |  | October 1 - May 31    |
| Deep-channel seasonal refuge use           | Instantaneous minimum $\geq 1$ mg liter <sup>-1</sup>                                     | Survival of bottom-dwelling worms and clams.   | June 1 - September 30 |
|  | Open-water fish and shellfish designated use criteria apply                               |  | October 1 - May 31    |

\*Note a 30-day mean 6 mg/L MSN value is evaluated for purpose of the WQ indicator.

<sup>1</sup> At temperatures considered stressful to shortnose sturgeon (>29°C), dissolved oxygen concentrations above an instantaneous minimum of 4.3 mg liter<sup>-1</sup> will protect survival of this listed sturgeon species.

# Water Quality Standards Indicator

- The indicator provides an estimate of what a full accounting (i.e., *hundreds of individual decisions we do not have data for*) for water quality criteria will show us.



# New data + New interpolator:

## Building a tool for more complete criteria assessment

Table 1. Chesapeake Bay dissolved oxygen criteria.

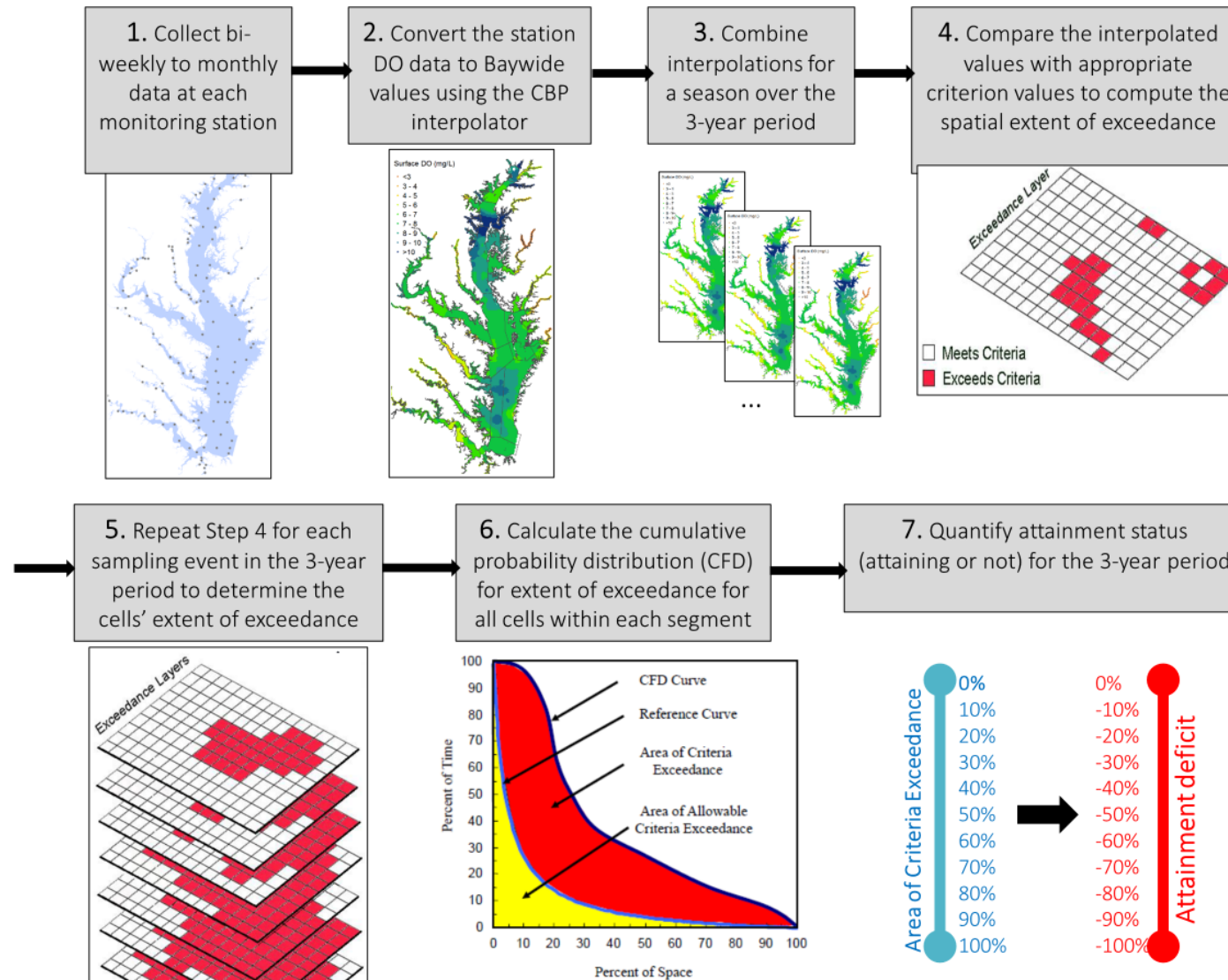
| Designated Use                             | Criteria Concentration/Duration  | Protection Provided  | Temporal Application  |
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<sup>1</sup> At temperatures considered stressful to shortnose sturgeon ( $>29^{\circ}\text{C}$ ), dissolved oxygen concentrations above an instantaneous minimum of  $4.3 \text{ mg liter}^{-1}$  will protect survival of this listed sturgeon species.



# Reminder of our assessment procedure

## WQS Criterion Assessment



# WQS Criterion Assessment

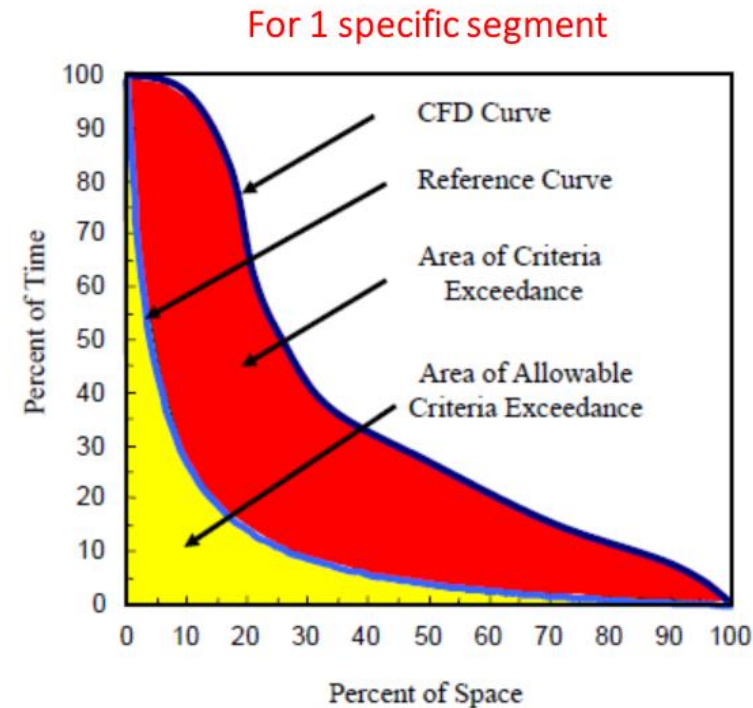
3. Determine the compliance status of each cell in the segment volume.

4. Produce a percent compliance matrix with sample period and percent space in compliance.

5. Rank the percent compliance in space from greatest to lowest values and assign percent of time associated with the compliance values.

6. Plot ranked percent space (x-axis) against percent time (y-axis).

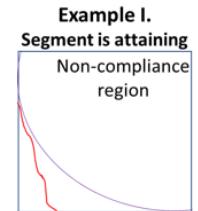
7. Evaluate compliance against the reference curve.



Source: Tango and Batiuk (2013)

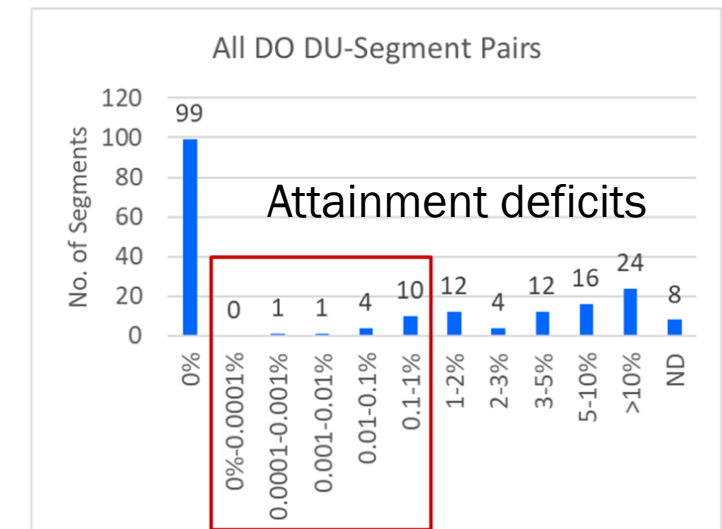
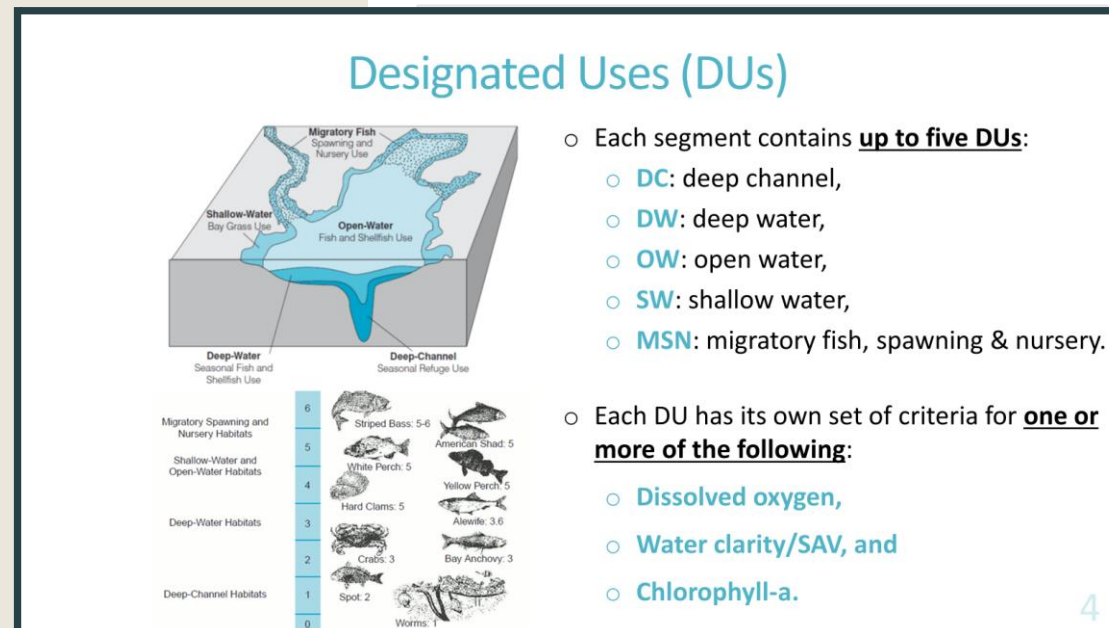
# Breakdown of Attainment Status by Threshold 2019-2021

| Segments attaining  | <u>Deficit</u> | <u>Count</u> |
|---|----------------|--------------|
|   | 0%             | ?            |
| Segments approaching<br>Attainment expressed<br>as % away from attainment | 0%-0.0001%     | ?            |
|   | 0.0001-0.001%  | ?            |
|   | 0.001-0.01%    | ?            |
|   | 0.01-0.1%      | ?            |
|   | 0.1-1%         | ?            |
|   | 1-2%           | ?            |
|   | 2-3%           | ?            |
|   | 3-5%           | ?            |
|   | 5-10%          | ?            |
|   | >10%           | ?            |
|   | ND             | ?            |



# Nearly 200 segment-designated use-dissolved oxygen criterion assessments evaluated: Some are fractionally close to attainment

## Examples: Breakdown of Attainment Status by Threshold 2019-2021



# Lessons on benefits of 4D dissolved oxygen assessment

## The Gulf of Mexico dead zone

- More accurate representation of conditions, improved confidence in assessment
- Reduced hypoxic area uncertainties by 11% on average
- Reduced hypoxic area uncertainties up to 40% in months with sparse sampling.

### **Fusion-Based Hypoxia Estimates: Combining Geostatistical and Mechanistic Models of Dissolved Oxygen Variability**

Venkata Rohith Reddy Matli\*, Arnaud Laurent, Katja Fennel, Kevin Craig, Jacob Krause, and Daniel R. Obenour

✓ **Cite this:** *Environ. Sci. Technol.* 2020, 54, 20, 13016–13025

Publication Date: September 3, 2020 ▾

<https://doi.org/10.1021/acs.est.0c03655>

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*4D Water Quality Assessment of GOM*

# Thank you's! Development Process & Community updates

## 1. Development team

- *CBP staff, contractors, EPA researchers, state partners and academic future users*
- *Provides guidance and feedback on development details*
- *Meets monthly*

## 2. Bay Oxygen Research Group (larger):

- *Development team plus broader community of interested parties from partnership*
- *Provides feedback on big-picture impacts*
- *Approximately every 3 months*

## 3. Collaboration among workgroups: Modeling workgroup, CAP workgroup, STAR Hypoxia Collaborative

- *Overlapping team members and update presentations at these meetings will continue for coordination and feedback*

## 4. STAC Review: Coordination for 2026 with Phase 7 development timeline





# 4-D interpolator development timeline

|   |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
|---|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|--|--|--|
| Draft January 2024                      |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| Priority categories for 2024 are in red |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| Calendar Year                           | 2022    |         |         |         | 2023    |         |         |         | 2024    |         |         |         | 2025    |         |         |         | 2026    |         |         |         | 2027    |         |         |         |  |  |  |
| Calendar Quarter                        | Q1      | Q2      | Q3      | Q4      | Q1      | Q2      | Q3      | Q4      | Q1      | Q2      | Q3      | Q4      | Q1      | Q2      | Q3      | Q4      | Q1      | Q2      | Q3      | Q4      | Q1      | Q2      | Q3      | Q4      |  |  |  |
|   | Jan-Mar | Apr-Jun | Jul-Sep | Oct-Dec | Jan-Mar | Apr-Jun | Jul-Sep | Oct-Dec | Jan-Mar | Apr-Jun | Jul-Sep | Oct-Dec | Jan-Mar | Apr-Jun | Jul-Sep | Oct-Dec | Jan-Mar | Apr-Jun | Jul-Sep | Oct-Dec | Jan-Mar | Apr-Jun | Jul-Sep | Oct-Dec |  |  |  |
| Project Year                            | Year 1  |         |         |         | Year 2  |         |         |         | Year 3  |         |         |         | Year 4  |         |         |         | Year 5  |         |         |         | Year 6  |         |         |         |  |  |  |
| 1. Development-daily estimates          |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 2. Develoment-hourly estimates          |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 3. Development - shallow water          |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 4. Development - GIS tasks              |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 5. Development -combined daily & hourly |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 6. Development-criteria evaluation      |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 7. Software                             |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 8. Documenting                          |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 9. Training                             |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 10. Year of Review                      |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |
| 11. Operational                         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |  |  |  |

# Requirements for an Updated Chesapeake Bay Interpolator

- New features (compared to current interpolation approach):

- *Temporal and spatial interpolation of water quality parameters in Chesapeake Bay*
- *Statistical estimates of uncertainty in the estimates*
- *Reproduce the short-term variability in the data*
- *Integrated vertical interpolation technique*

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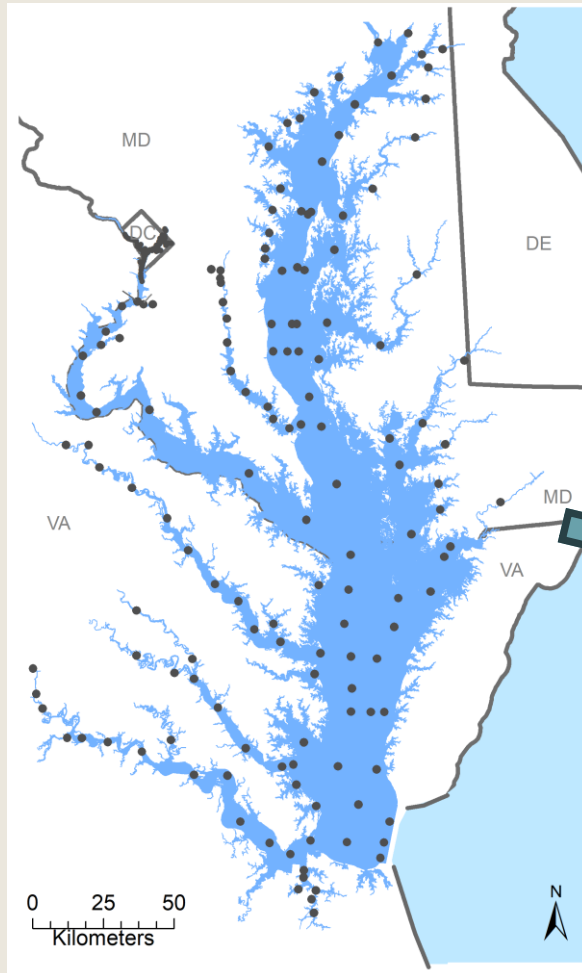
- *Temporal and spatial interpolation of water quality parameters in Chesapeake Bay*
- *Statistical estimates of uncertainty in the estimates*
- *Reproduce the short-term variability in the data*
- *Integrated vertical interpolation technique*

## ■ Features to retain and update:

- *Usability by partner analysts with automation for routine analyses*
- *Visualization of the results*
- *Analysis of dissolved oxygen, clarity, and chlorophyll a*
- *Post-processing to identify regions for each designated use (DU)*
- *Reasonable spatial extents for interpolation (e.g., not interpolating across land)*
- *Incorporation of new data streams & types, as available*

# Combine existing and emerging data sets

Bi-weekly long-term sampling  
(DOEE, MDDNR, VADEQ, CBP)



Shallow water continuous monitoring (MDDNR  
and VECOS)

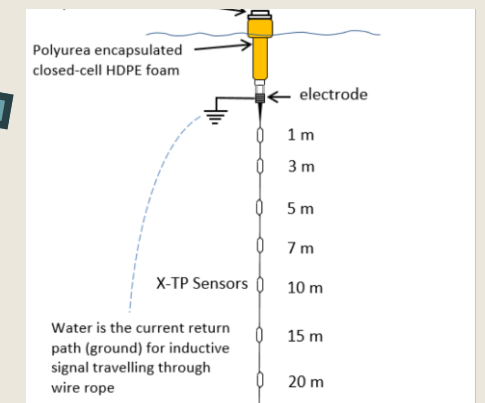


From <https://eyesonthebay.dnr.maryland.gov/>



From <http://vecos.vims.edu/>

New continuous vertical  
arrays (NOAA & CBP)



<https://www.chesapeakebay.net/who/group/hypoxia-collaborative-team>

And more: Citizen  
science, riverkeepers,  
and research data sets