

This work aligns with the following NOAA Goals:

Science: Climate Adaptation and Mitigation

Improved scientific understanding of the changing climate system and its impacts
 Assessments of current and future states of the climate system that identify potential impacts and inform science, service, and stewardship decisions
 A climate-literate public that understands its vulnerabilities to a changing climate and makes informed decisions

Science: Weather-Ready Nation

Reduced loss of life, property, and disruption from high-impact events
 Improve freshwater resource management
 Healthy people and communities due to improved air and water quality services
 A more productive and efficient economy through information relevant to key sectors of the U.S. economy

Science: Healthy Oceans

Improved understanding of ecosystems to inform resource management decisions
 Sustainable fisheries and safe seafood for healthy populations and vibrant communities

Science: Resilient Coastal Communities and Economies

Resilient coastal communities that can adapt to the impacts of hazards and climate change
 Improved coastal water quality supporting human health and coastal ecosystem services

Education: Science-Informed Society

Formal and informal educators integrate NOAA-related sciences into their curricula, practices, and programs
 Formal and informal education organizations integrate NOAA-related science content and collaborate with NOAA scientists on the development of exhibits, media, materials, and programs that support NOAA's mission

Education: Safety and Preparedness

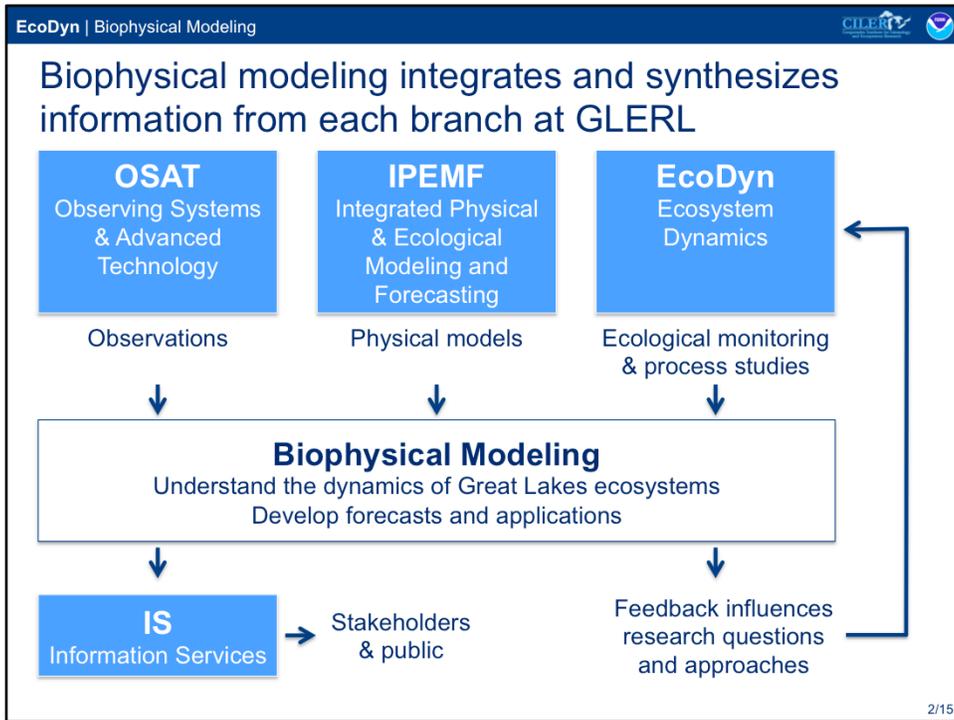
Youth and adults from all backgrounds are aware of, prepare for, and appropriately respond to environmental hazards that impact health, safety, and the economy in their communities
 Formal and informal education institutions integrate water, weather, and climate hazard awareness, preparedness, and response information into curricula, exhibits, and programs that create learning opportunities for youth and adults

Education: Future Workforce

Postsecondary students, particularly from underrepresented groups, pursue and complete degrees in disciplines critical to NOAA's mission

Education: Organizational Excellence

NOAA educators and partners collaborate at local, regional, and national levels to coordinate efforts, build capacity, and better



Biophysical modeling integrates and synthesizes information from each branch at GLERL with the goals of understanding the dynamics of Great Lakes ecosystems, and developing forecasts and applications. Scientific insights feed back to influence research questions and approaches of the branches.

Biophysical modeling research questions tied to NOAA's strategic plan

Research questions

- How will invasive mussels affect Great Lakes productivity?
- How will changing climate affect lake dynamics and the impact of invasive mussels on phytoplankton abundance?
- How can we use hydrodynamic forecasts to provide early warning of changing source water quality for public water systems due to HABs and hypoxia?



NOAA's core goals

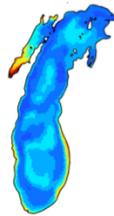
- Healthy Oceans: Fisheries, habitats, biodiversity, healthy and productive ecosystems
- Climate Adaptation and Mitigation
- Weather-Ready Nation
- Resilient Coastal Communities and Economies



In this presentation, I will give some examples of recent work that addresses research questions tied to NOAA's strategic plan.

How will invasive mussels affect Great Lakes productivity?

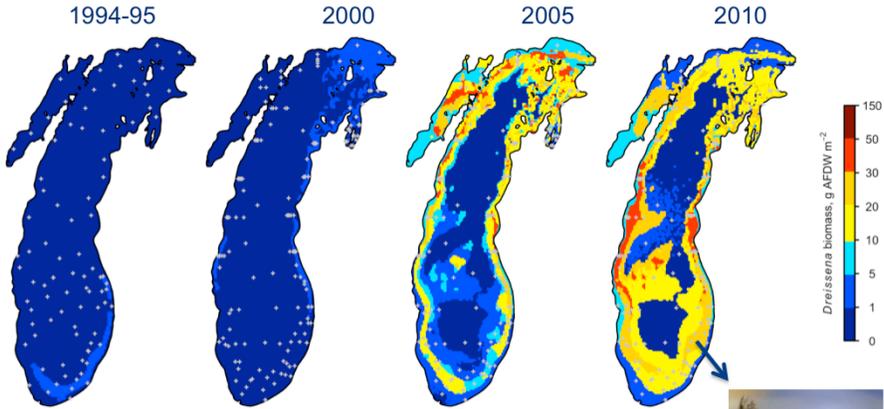
How will changing climate affect lake dynamics and the impact of invasive mussels on phytoplankton abundance?



I'll start with some examples addressing the first two questions related to impacts of invasive quagga mussels on the productivity of Lake Michigan.

Quagga mussel: A prolific invader that has dramatically altered freshwater systems worldwide

Benthic surveys → Geostatistical model → Publicly-available spatial data set



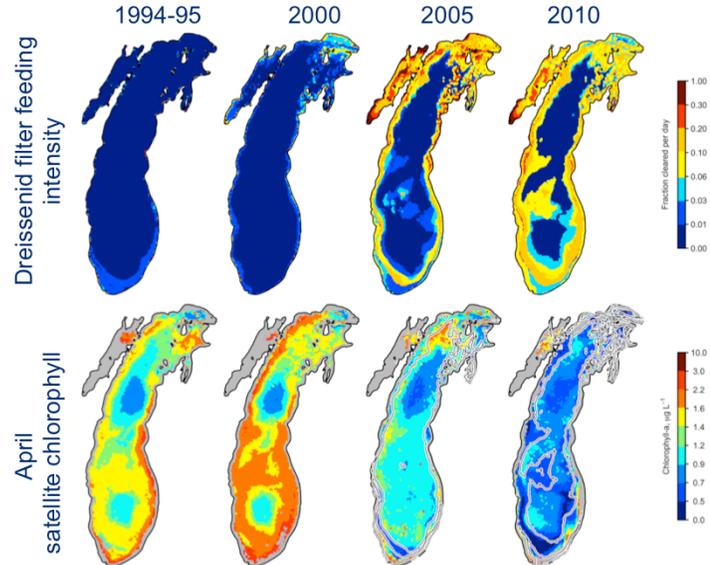
M.D. Rowe, D.R. Obenour, T.F. Nalepa, H.A. Vanderploeg, F. Yousef, W.C. Kerfoot. 2015. *Freshwater Biology*, 60(11): 2270-85

High densities of quagga mussels became established in Lake Michigan between 2000 and 2005, as documented by GLERL's long-term benthic monitoring program.

In order to develop a spatial data set of quagga mussel biomass for use in various modeling applications, we applied a geostatistical model to the benthic survey data to estimate biomass at locations where it was not measured.

We produced a spatial data set that we made available to the public in the supplement to this paper in *Freshwater Biology*. M.D. Rowe, D.R. Obenour, T.F. Nalepa, H.A. Vanderploeg, F. Yousef, W.C. Kerfoot. 2015. *Freshwater Biology*, 60(11): 2270-85

Chlorophyll depletion in Lake Michigan is spatially associated with quagga mussel filter feeding intensity



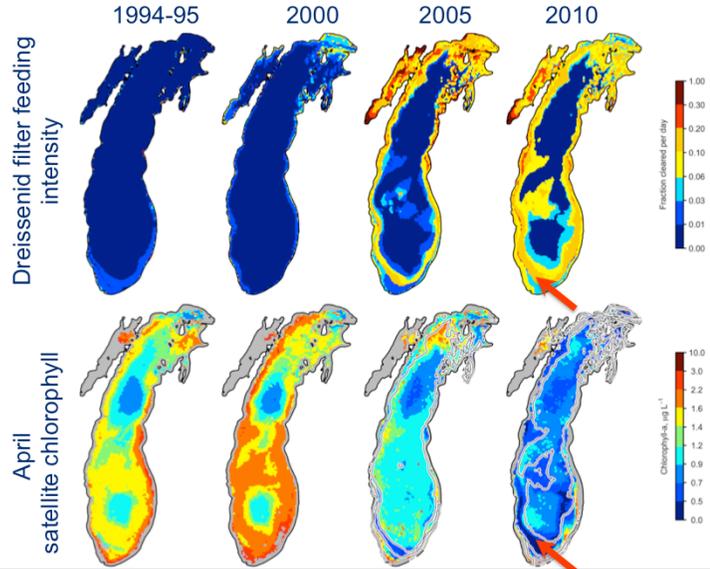
M.D. Rowe, et al.
Freshwater Biology,
60(11): 2270-85

6/15

In the same paper, we showed for the first time a spatial association between mussel filter-feeding intensity and reduction in chlorophyll concentration observed in satellite imagery.

In the upper set of maps, we combined the biomass spatial distribution with mussel clearance rate measured by the Ecosystem Dynamics group and bathymetry to estimate the fraction of the water column cleared per day by filter feeding, under vertically-mixed conditions as occurs during the spring bloom in April.

Chlorophyll depletion in Lake Michigan is spatially associated with quagga mussel filter feeding intensity



M.D. Rowe, et al.
Freshwater Biology,
60(11): 2270-85

6/15

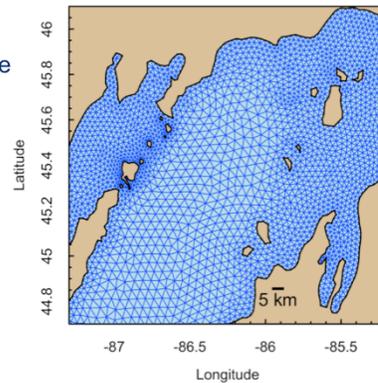
We showed a statistically significant spatial association between filter feeding intensity and reduction in chlorophyll from pre to post invasion.

M.D. Rowe, D.R. Obenour, T.F. Nalepa, H.A. Vanderploeg, F. Yousef, W.C. Kerfoot. 2015. *Freshwater Biology*, 60(11): 2270-85

Finite Volume Community Ocean Model (FVCOM)

- Great Lakes Coastal Forecasting System models are being replaced with FVCOM (Eric Anderson)
- Nearshore water quality is of current interest because of invasive mussel impacts and Great Lakes Water Quality Protocol of 2012
- Unstructured grid provides new opportunities for nearshore biophysical modeling
 - Conforms to shoreline morphology
 - Provides increased resolution nearshore

M.D. Rowe, E.J. Anderson, J. Wang, H.A. Vanderploeg. 2015. [J. Great Lakes Research](#), 41(S3):49-65



7/15

The Great Lakes Coastal Forecasting System models are being replaced with FVCOM models. Eric Anderson will present more on this tomorrow.

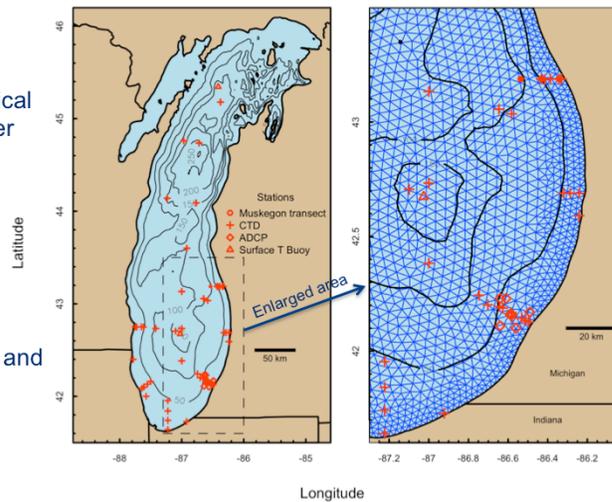
Nearshore water quality is currently of great interest because of invasive dreissenid mussels, and the revised Great Lakes Water Quality Protocol of 2012 has new language requiring US EPA and Environment Canada to consider nearshore water quality for the first time.

The unstructured grid FVCOM model conforms to complex shoreline morphologies and allows for increased resolution nearshore, resulting in new opportunities for nearshore biophysical modeling that did not exist with the previous generation of models with a 2km structured grid.

In the examples I am showing here, grid resolution on the shoreline was ~600 m, but the Michigan-Huron model for the updated forecasting system will have a nearshore resolution of 200 m.

Lake Michigan FVCOM was skill assessed for biophysical modeling

- Interpolated meteorological forcing resulted in greater skill compared to North American Regional Reanalysis (NARR)
 - Currents
 - Temperature
 - Spatial extent and duration of summer and winter stratification



M.D. Rowe, E.J. Anderson, J. Wang, H.A. Vanderploeg. 2015. *J. Great Lakes Research*, 41(S3):49-65

8/15

We conducted a skill assessment of a Lake Michigan FVCOM unstructured grid hydrodynamic model, paying particular attention to the ecologically significant winter to summer transition period, and including nearshore and offshore observations.

We found that interpolated meteorological forcing resulted in greater skill than NARR forcing for currents, temperature, and the spatial extent and during of summer and winter stratification, which have a strong influence on phytoplankton model simulations.

M.D. Rowe, E.J. Anderson, J. Wang, H.A. Vanderploeg. 2015. *J. Great Lakes Research*, 41(S3):49-65

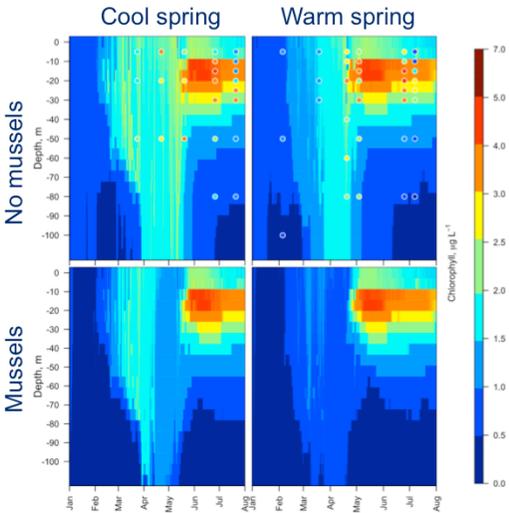
Quagga mussels have greater impact on Lake Michigan spring bloom under warm spring climate scenario

Warm and cool climate meteorological scenarios

Measured quagga mussel clearance rates

3-D hydrodynamic model (FVCOM) vertical mixing

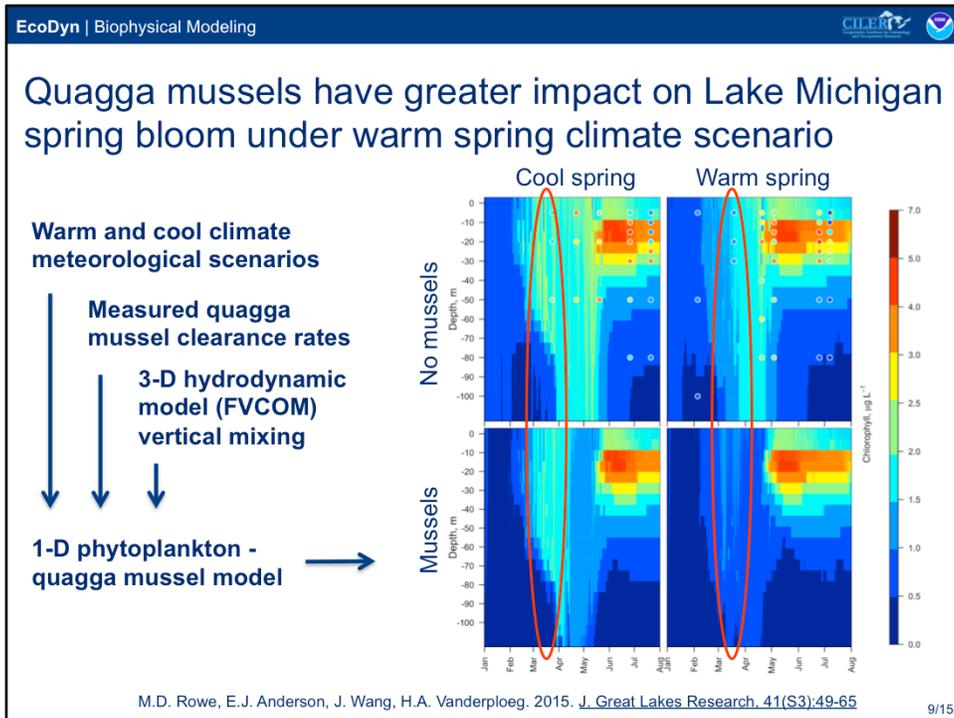
1-D phytoplankton - quagga mussel model



M.D. Rowe, E.J. Anderson, J. Wang, H.A. Vanderploeg. 2015. *J. Great Lakes Research*, 41(S3):49-65

In the same paper, we showed that quagga mussels can have greater impact on the Lake Michigan spring phytoplankton bloom under a warm spring climate scenario.

We combined warm and cool climate meteorological scenarios, quagga mussel clearance rates measured by EcoDyn, and a 1D phytoplankton-quagga mussel model with realistic vertical mixing from the 3D hydrodynamic model.



We found that the cold-spring scenario (1997) led to greater winter stratification in March and early April than the warm spring scenario (1998).

The maximum density of freshwater is at 4 C.

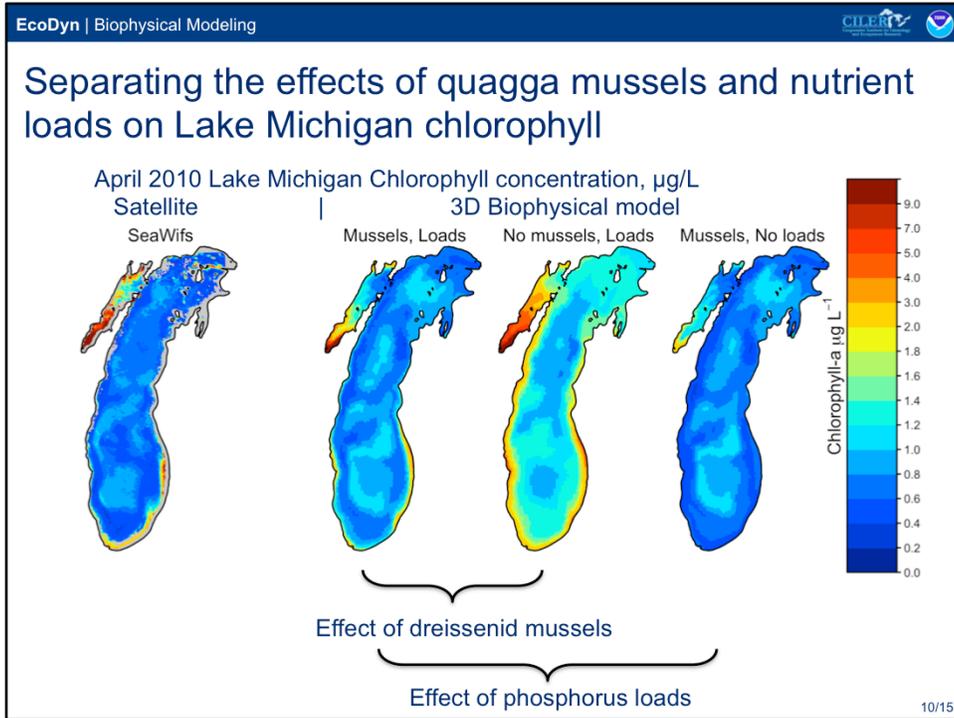
Winter stratification occurs when surface water cools below 4 C, resulting in colder (less dense) water floating on warmer water. Winter stratification enhanced the early spring phytoplankton bloom through two mechanisms

- 1) Limited mixed layer depth reduced light limitation, and stimulated phytoplankton growth
- 2) Reduced vertical mixing limited transport of phytoplankton from the euphotic zone to mussels on the bottom.

The first mechanism was seen in observations from the Muskegon transect Long Term Research program data (colored circles in the figure, also see paper).

The second mechanism was shown in a model sensitivity simulation that included quagga mussel filter feeding.

M.D. Rowe, E.J. Anderson, J. Wang, H.A. Vanderploeg. 2015. *J. Great Lakes Research*, 41(S3):49-65



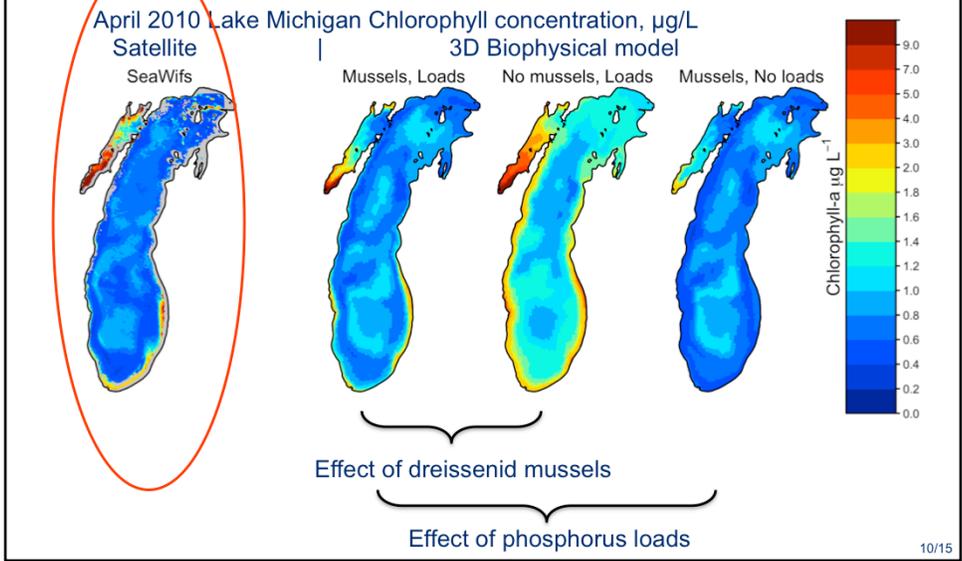
As a further ecological application of the Lake Michigan unstructured grid hydrodynamic model, we developed a 3D biophysical model.

in order to separate the effects of quagga mussels and declining phosphorus concentrations on the spatial distribution of chlorophyll.

Spring total phosphorus concentrations have declined over the same period that quagga mussels invaded Lake Michigan, so there has been some controversy regarding to what extent declining chlorophyll is due to benthic filter feeders versus declining nutrient availability.

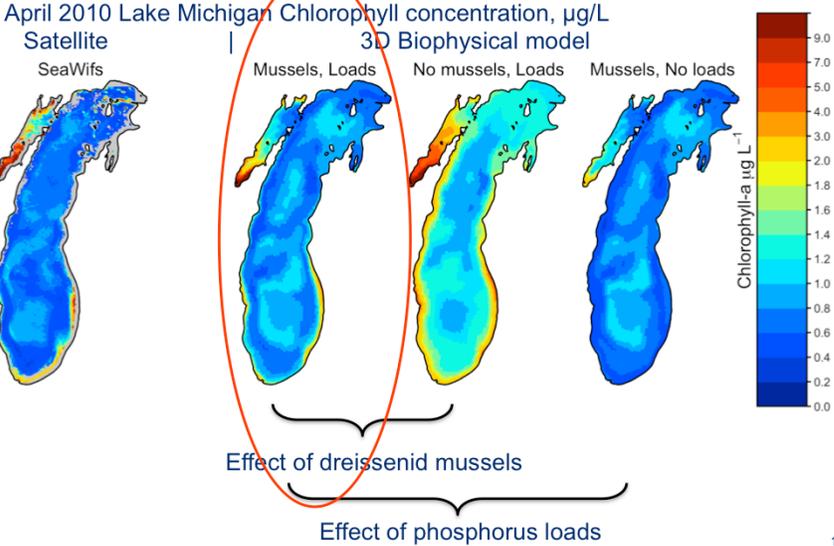
To explore this question, we ran the biophysical model with and without mussels and nutrient loads.

Separating the effects of quagga mussels and nutrient loads on Lake Michigan chlorophyll



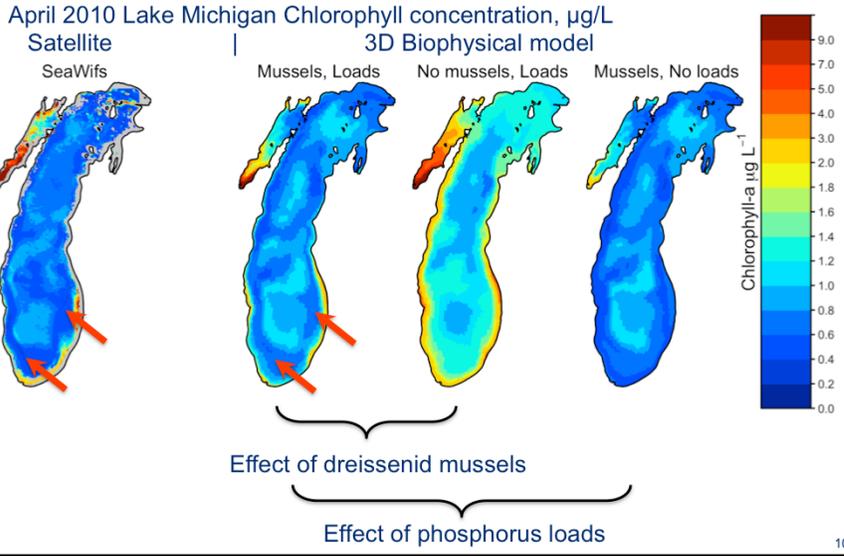
The map on the left shows observed mean April chlorophyll in 2010 from SeaWiFS OC4 satellite retrieval.

Separating the effects of quagga mussels and nutrient loads on Lake Michigan chlorophyll



The map in the middle shows the historical model simulation with mussels and nutrient loads, which produced low chlorophyll in mid-depth regions where filter feeding intensity is high, similar what was observed in the satellite imagery.

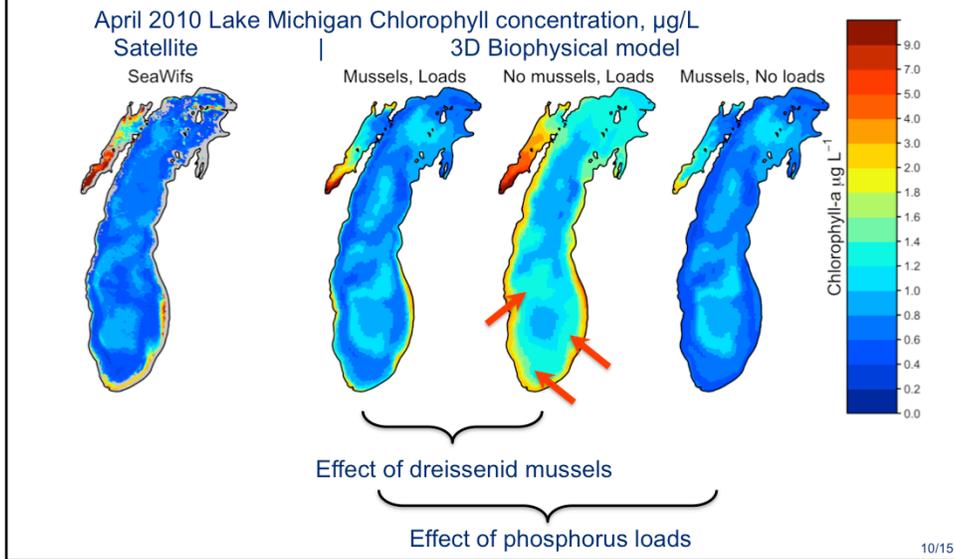
Separating the effects of quagga mussels and nutrient loads on Lake Michigan chlorophyll



10/15

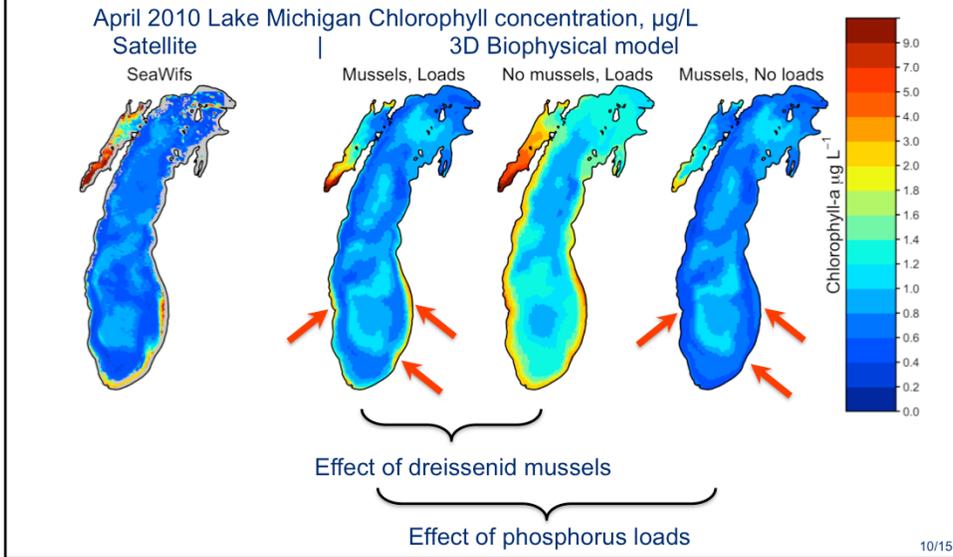
The map in the middle shows the historical model simulation with mussels and nutrient loads, which produced low chlorophyll in mid-depth regions where filter feeding intensity is high, similar what was observed in the satellite imagery.

Separating the effects of quagga mussels and nutrient loads on Lake Michigan chlorophyll



The simulation without mussels shows a spatial distribution of chlorophyll similar to the pre-mussel spring bloom with high chlorophyll in mid-depth regions, even though spring total phosphorus concentrations declined in the post-invasion period.

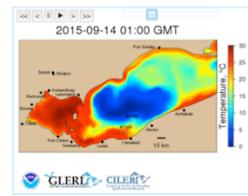
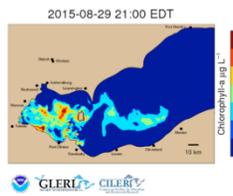
Separating the effects of quagga mussels and nutrient loads on Lake Michigan chlorophyll



Finally, the simulation without tributary phosphorus loads shows that phosphorus loads maintain higher productivity in the nearshore, even in the presence of deep-water quagga mussels.

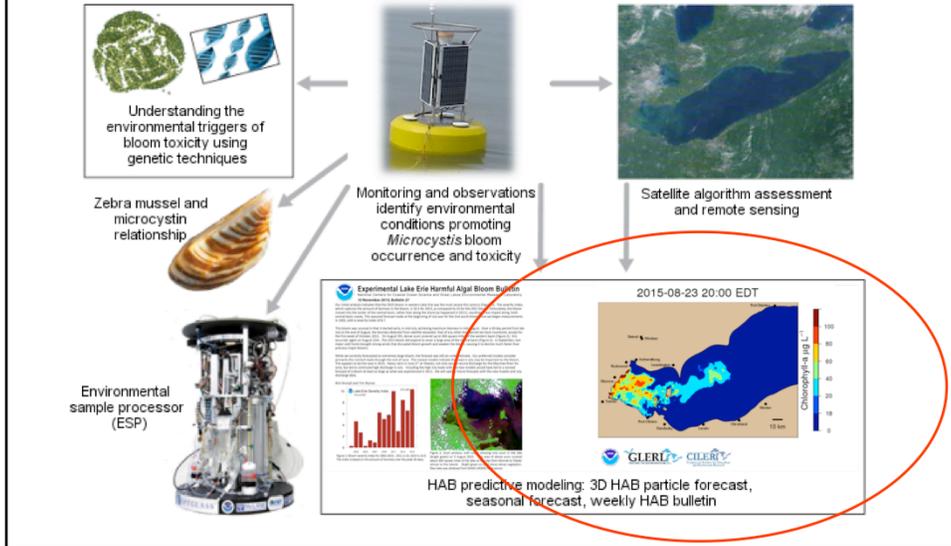
Nearshore productivity has provided an increasingly important resource to the food web now that offshore productivity is so low.

How can we use hydrodynamic forecasts to provide early warning of changing source water quality for public water systems due to HABs and hypoxia?



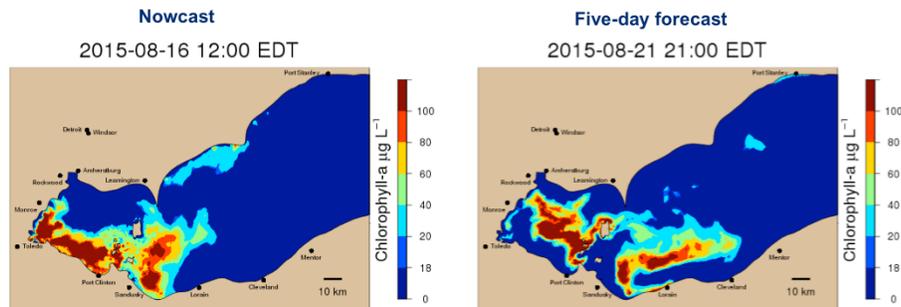
I will move on to give some examples of recent and proposed work in Lake Erie

An integrated approach to studying HABs



As part of GLERL's HAB program that Tim Davis described earlier, GLERL collaborates with NCCOS to provide a nowcast and forecast for HABs in Lake Erie.

GLERL provides a nowcast/forecast of harmful algal bloom distribution in Lake Erie: HAB Tracker



Initialize bloom location and intensity in a Lagrangian particle tracking model based on satellite remote sensing imagery



Five-day forecast of bloom intensity and location based on

1. Forecast meteorology
2. Currents from a hydrodynamic model
3. Lagrangian particle tracking model

12/15

The nowcast is initialized from a satellite retrieval.

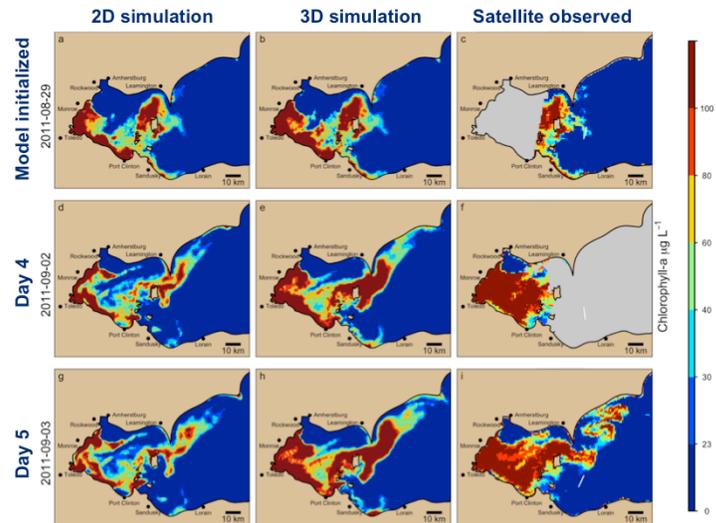
The OSAT group and CILER provided satellite retrievals for the first research versions of the HAB Tracker. In 2015, HAB Tracker transitioned to use the cyanobacterial index retrieval from NCCOS for consistency with the HAB Bulletin. Forecast is based on

1. Forecast meteorology
2. Currents from a hydrodynamic model
3. Lagrangian particle tracking model

In August 2014, the City of Toledo detected the cyanobacterial toxin microcystin in their treated water, and issued a “do not drink” order that affected a half million people for two days, and received international attention.

After the Toledo water crisis NOAA’s Lake Erie HAB information products, including the HAB Tracker nowcast/forecast, have received increased attention from regional stakeholders.

Improved model for short term forecast of Lake Erie HABs including vertical mixing of buoyant *Microcystis*

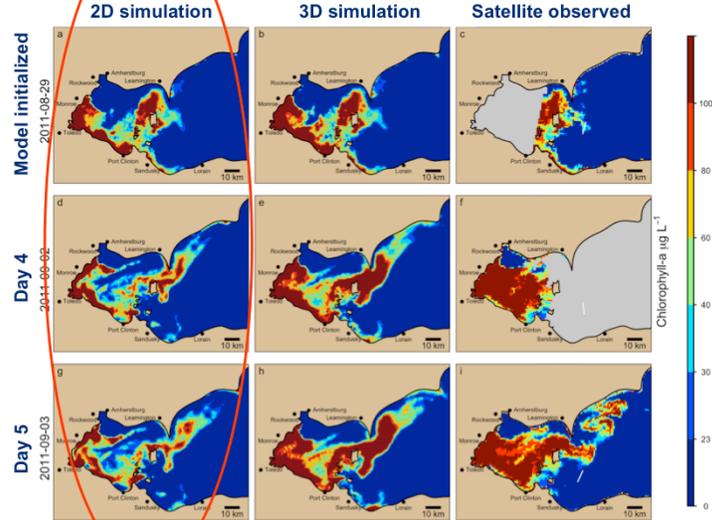


M.D. Rowe, E.J. Anderson, T. T. Wynne, R. P. Stumpf, D. L. Fanslow, K. Kijanka, H. A. Vanderploeg, T. W. Davis. [J. Geophysical Research](#). submitted

13/15

We developed an improved model for short term forecasts of Lake Erie HABs that includes vertical mixing of buoyant *Microcystis* colonies, using field and laboratory data from the EcoDyn group.

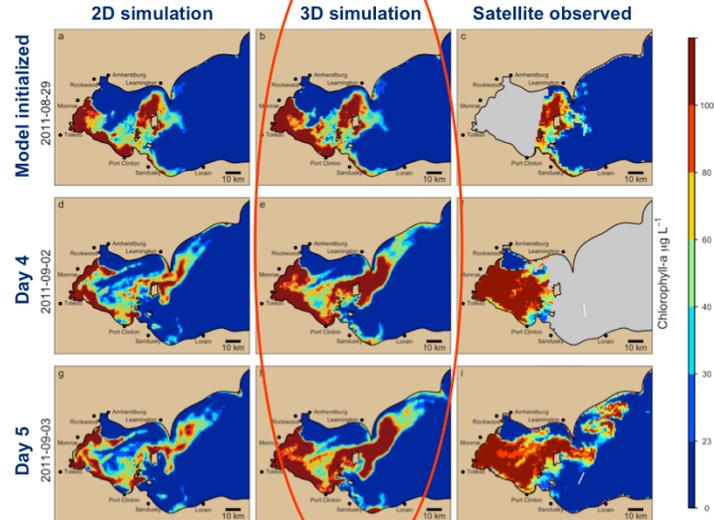
Improved model for short term forecast of Lake Erie HABs including vertical mixing of buoyant *Microcystis*



M.D. Rowe, E.J. Anderson, T. T. Wynne, R. P. Stumpf, D. L. Fanslow, K. Kijanka, H. A. Vanderploeg, T. W. Davis. *J. Geophysical Research*. *submitted*

This figure shows hindcast simulations from 2011 with the 2D model that assumes HABs are always on the surface, As in the current version of the HAB Tracker forecast model.

Improved model for short term forecast of Lake Erie HABs including vertical mixing of buoyant *Microcystis*

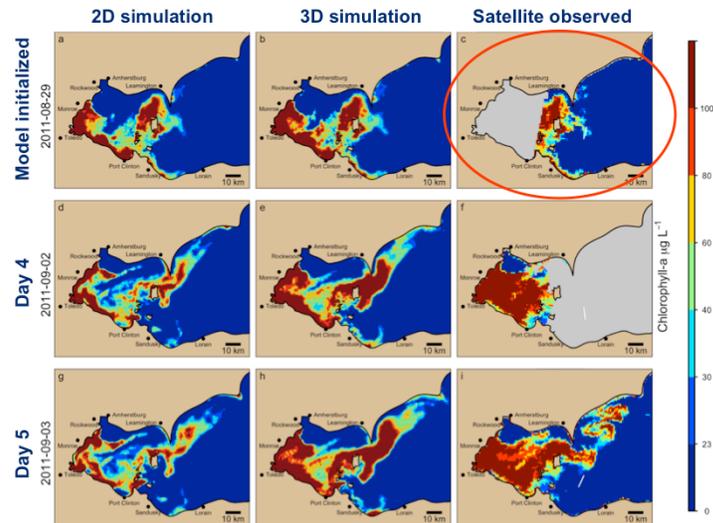


M.D. Rowe, E.J. Anderson, T. T. Wynne, R. P. Stumpf, D. L. Fanslow, K. Kijanka, H. A. Vanderploeg, T. W. Davis. *J. Geophysical Research*. submitted

13/15

The 3D model includes estimated vertical distribution of buoyant HAB as a function of vertical mixing from the LEOFS model. Particles are assigned a floating velocity by sampling from a frequency distribution of floating velocity, which was developed from measured size distribution and buoyant velocities by the EcoDyn group.

Improved model for short term forecast of Lake Erie HABs including vertical mixing of buoyant *Microcystis*



M.D. Rowe, E.J. Anderson, T. T. Wynne, R. P. Stumpf, D. L. Fanslow, K. Kijanka, H. A. Vanderploeg, T. W. Davis. *J. Geophysical Research*. submitted

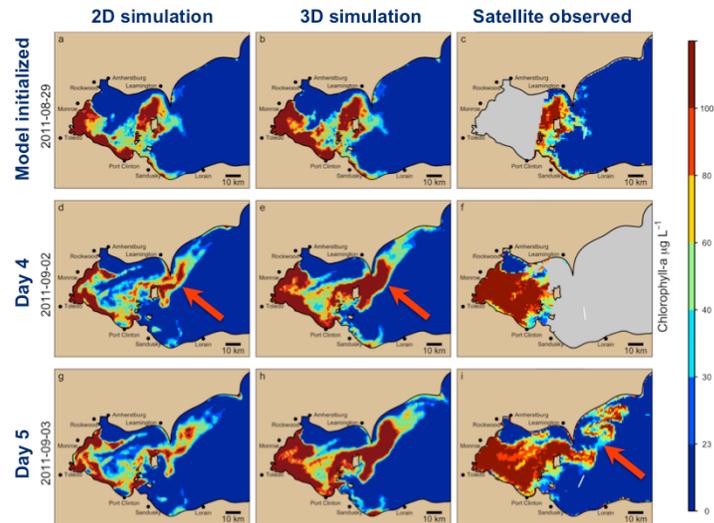
13/15

This hindcast simulation was initialized using the partial satellite image in the upper right.

To initialize the model in areas where satellite data were missing, the HAB distribution in the western basin was carried forward from a previous model run.

This method provides a complete nowcast estimate of the HAB distribution in the presence of missing satellite data.

Improved model for short term forecast of Lake Erie HABs including vertical mixing of buoyant *Microcystis*



M.D. Rowe, E.J. Anderson, T. T. Wynne, R. P. Stumpf, D. L. Fanslow, K. Kijanka, H. A. Vanderploeg, T. W. Davis. [J. Geophysical Research](#). *submitted*

13/15

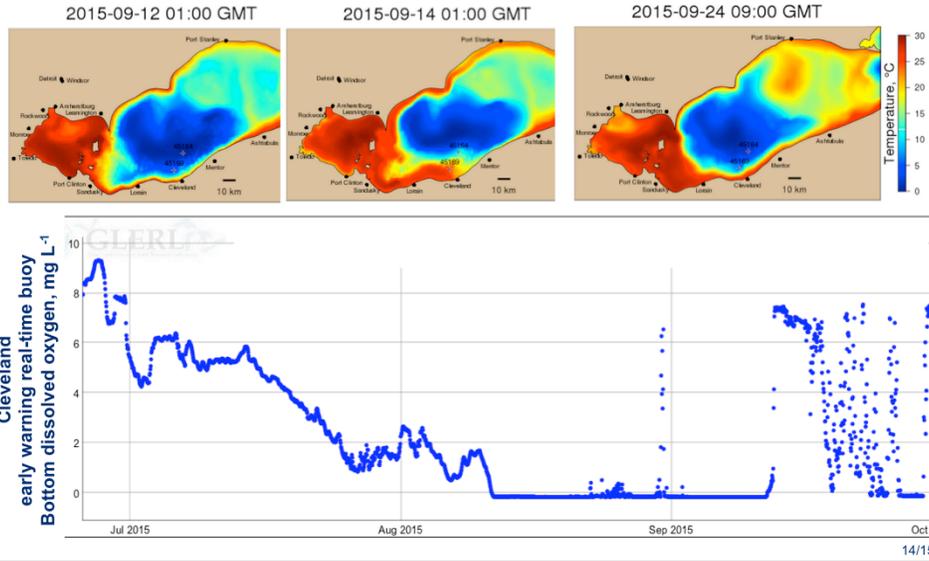
On day 4, both models simulated a major advection event that carried HABs into the central basin, which was confirmed in the satellite image on Day 5.

The 3D model better simulated the spatial distribution of HAB in the western basin on day 5.

We showed a statistically significant improvement in skill statistics for the 3D model, compared to the 2D model, in a series of 26 hindcast simulations from the record 2011 HAB season, which is documented in this manuscript that was submitted to the *Journal of Geophysical Research*.

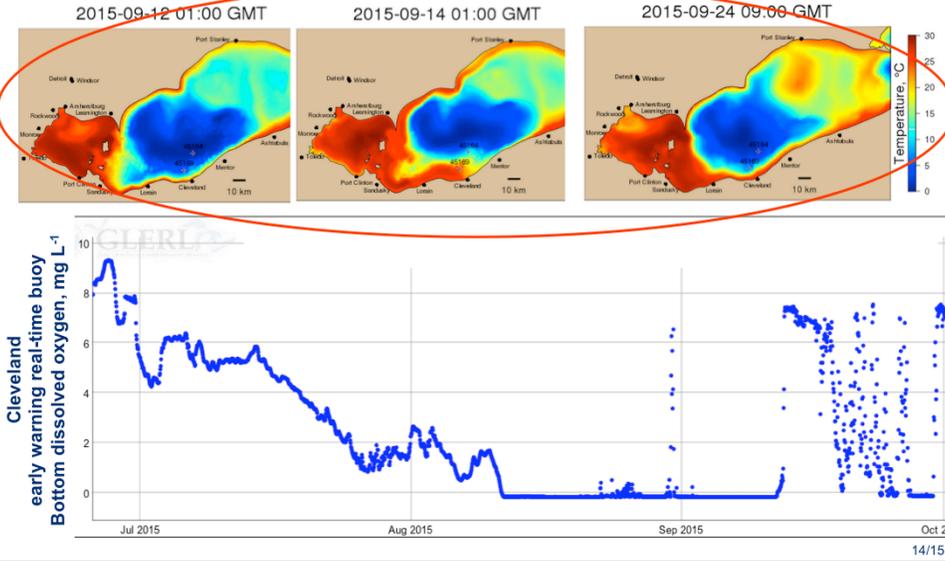
Some of these improvements were included in the 2015 real-time model that was available to the public through the GLERL website, and the full 3D model will be used in the 2016 season.

Future work: Proposed hypoxia forecast model for Lake Erie public water systems



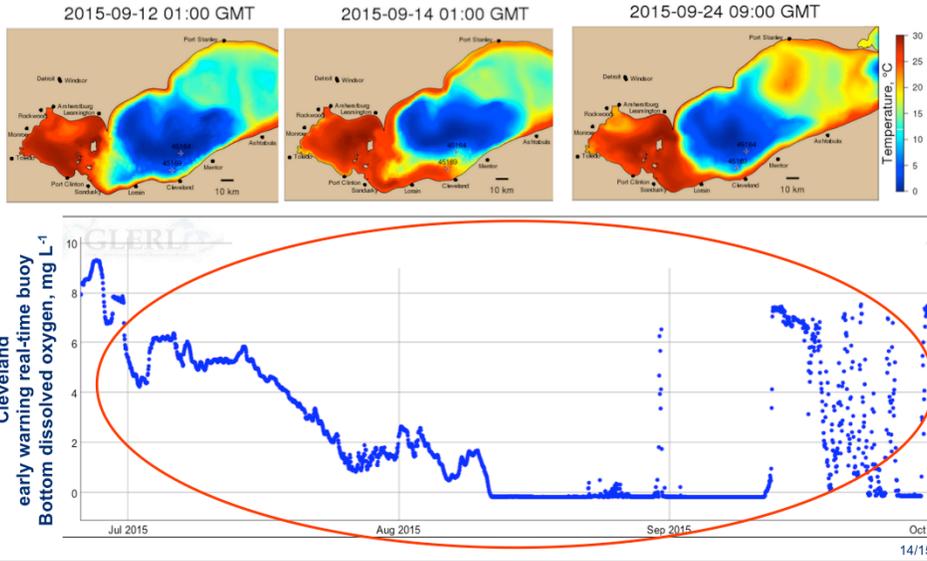
Moving on to future work, GLERL and CILER collaborated on a proposal to develop a hypoxia forecast model for Lake Erie public water systems.

Future work: Proposed hypoxia forecast model for Lake Erie public water systems



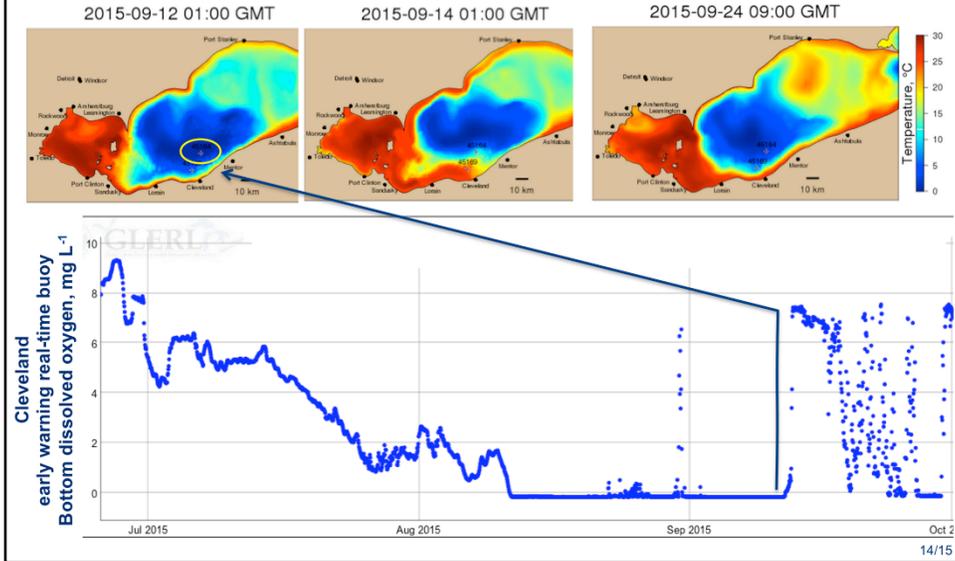
In 2015, we included these animations of forecast Lake Erie bottom water temperature from the LEOFS model on GLERL's Hypoxia Warning System website. This series of graphics illustrates dynamic movement of the hypolimnion that causes variable source water quality at public water system intakes along the Erie shoreline,

Future work: Proposed hypoxia forecast model for Lake Erie public water systems



as indicated by this time series of bottom water dissolved oxygen from the early-warning buoy installed offshore of Cleveland by the OSAT branch.

Future work: Proposed hypoxia forecast model for Lake Erie public water systems



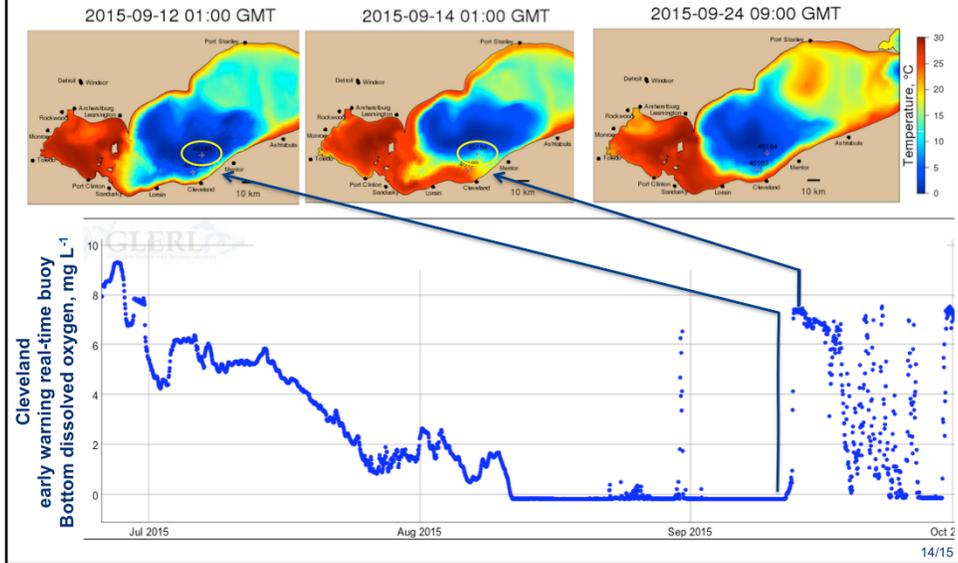
On September 12, there was cold, hypoxic, hypolimnetic water at the buoy location.

The cold bottom water is indicated in blue in the temperature color bar scale on these maps.

When hypoxia occurs, it is associated with the cold water of the hypolimnion.

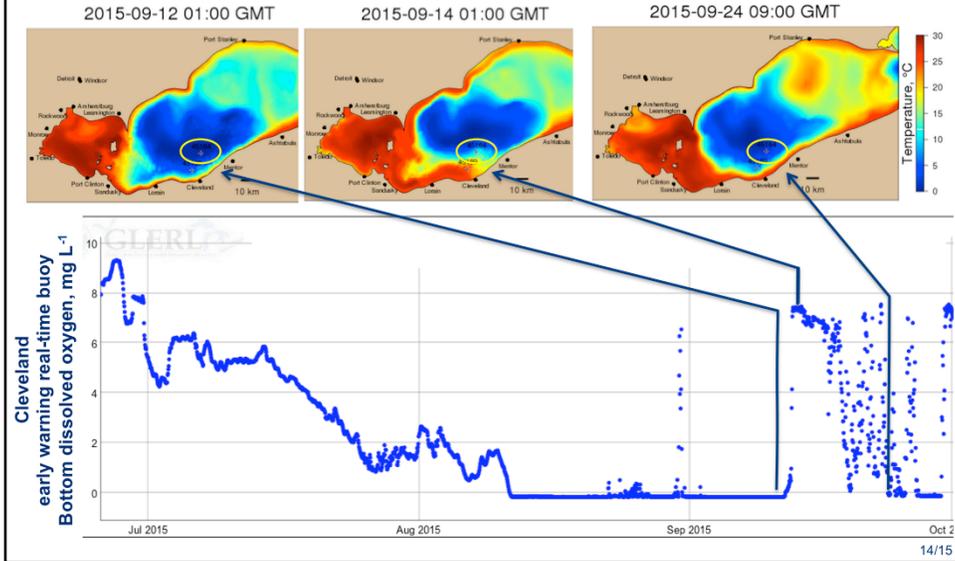
These maps show temperature, not hypoxia, but short-term dynamics of hypoxia are often driven by movement of the cold water of the hypolimnion.

Future work: Proposed hypoxia forecast model for Lake Erie public water systems



A wind event on September 13 caused downwelling of warm, oxygenated epilimnetic water to the bottom.

Future work: Proposed hypoxia forecast model for Lake Erie public water systems

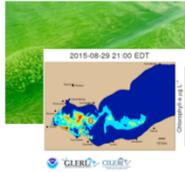


The hypolimnion later oscillated back and caused a return of hypoxia at the buoy location.

A hypoxia forecast model would provide advance warning to public water systems of lake dynamics that are likely to bring changing source water quality to their intakes.

Future work: GLERL's draft strategic plan

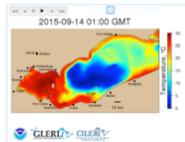
Milestones related to biophysical modeling



Improved representation of *Microcystis* buoyancy and growth in Lake Erie HAB Tracker model

Customers:

Public water systems, anglers, beach users, recreational boaters



Develop a Lake Erie hypoxia model for nowcast/forecast and scenario-based simulations

Customers:

Public water systems, anglers, fisheries managers, USEPA (nutrient management)



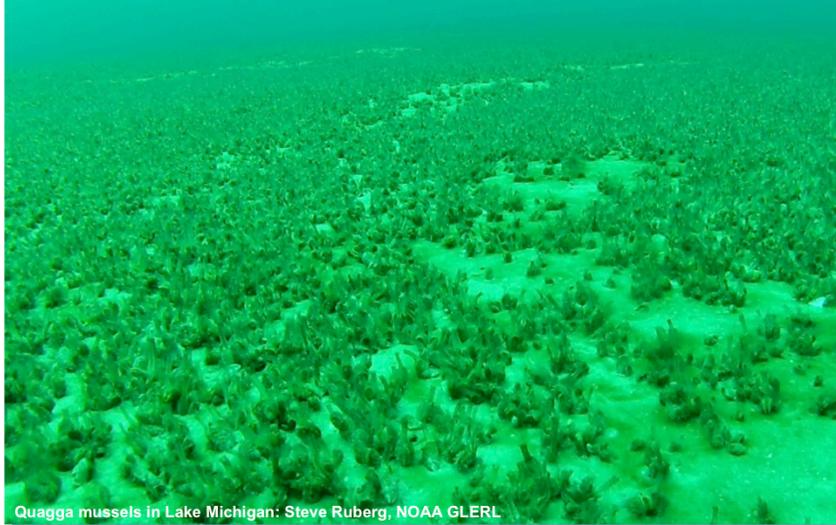
Develop nearshore-resolving water quality and lower food web models for Lakes Michigan and Erie

Customers:

USEPA (nutrient management), fisheries managers

I'll wrap up by mentioning some milestones in GLERL's draft strategic plan related to biophysical modeling.

Questions?



Quagga mussels in Lake Michigan: Steve Ruberg, NOAA GLERL