## HAB and Hypoxia Science, Application, and Influence

## **University of Michigan and Partners**



Don Scavia University of Michigan



## 4 Primary Grants with 2 "Offshoots"

#### **CHRP** – Estuarine Susceptibility to Nutrient Pollution

**NGOMEX models** (w/Chesapeake Bay models)

Hypoxia Model Transition to Operations

**ECOFOR - Lake Erie** (w/Lake Erie HAB models)

## **CHRP - Susceptibility to Nutrient Pollution**

with Howarth, Breitburg, Alexander, plus several postdocs and associates

## **East Coast Estuarine Eutrophication**

4 components

Estuarine, fisheries, and 2 watershed models

Significant science contributions in all 4 areas



Alexander, R.B., R.A. Smith, G.E. Schwarz, E.W. Boyer, J.V. Nolan, and J.W. Brakebill. 2008. Differences in phosphorus and nitrogen delivery to the Gulf of Mexico from the Mississippi River Basin, Environ. Sci. Technol., 42, 3, 822-830. DOI: 10.1021/es0716103 Baojing, Gu, Yimei Zhu, Jie Chang, Chanhui Peng, Dong Liu, Yong Min, Weidong Luo, R. W. Howarth, and Y. Ge. 2011. The role of technology and policy in mitigating regional nitrogen pollution. Env. Res. Letters 6: 014011. DOI:10.1088/1748-9326/6/1/014011 Batiuk, R.A., D.L. Breitburg, R.J. Diaz, T.M. Cronin, D.H. Secor and G. Thursby. 2009. Derivation of habitat-specific dissolved oxygen criteria for Chesapeake Bay and its tidal tributaries 'ournal of Experimental Marine Biology and Ecology. 381: S204-S215. Bierman, V.J Jr., S.C. Hinz; D. Justić, D.Scavia, J.A. Veil, K. Satterlee, M. Parker. 2007. Predicted impacts from offshore produced water discharges on hypoxia in the Gulf of Mevi acilities, Construction, and Operations. Society of Petroleum Engineers. Ganeshram, A. Beusen, & C. Lancelot. 2011. Nitrogen flows from European regional watersheds to coastal marine Billen, G., M. Silvestre, B. Grizzetti, A. Leip, J. Garnier, M. Voss, R. Howarth, F. Bouraoui, H. Behrendt, A. Lepisto, P. Kortelainen, P. Johnes, C. Curtis, C. Humborg, E. Smo waters. Pages 271 -297 in M.A. Sutton et al. (editors), The European Nitrogen Assessment: Sources, Effects, and Policy Perspectives. Cambridge Univer-Boesch, D., L.B. Crowder, R.J. Diaz, R.W. Howarth, L.E. Mee, S.W. Nixon, N.N. Rabalais, R. Rosenberg, J.G. Sanders, D. Scavia, R.E. Turner . 2009. Nutrier ypoxia, Eos. Trans. Amercian Geophysical Union.

55 Publications Boyer, E. W., and R.W. Howarth. 2008. Nitrogen fluxes from rivers to the coastal oceans. Pages 1565-1587 in D. Capone, D. A. Bronk, M. R. M. Brakebill, J.W., D.M. Wolock, and S.E. Terziotti. 2011 Digital hydrologic networks supporting applications related to spatially referenced Breitburg, D. L., J.K. Craig, R.S. Fulford, K.A. Rose, W.R. Boynton, D. Brady, B.J. Ciotti, R.J. Diaz, K.D. Friedland, J.D. Hagy III, D.R '

resources and their management. Hydrobiologia. 629: 31-47. DOI: 10.1007/s10750-009-9762-4. http://www.spri-Breitburg, D.L., D.W. Hondorp, L.W. Davias, and R.J. Diaz. 2009. Hypoxia, nitrogen and fisheries: integrating effection Conley, D. J, H. W. Paerl, R. W. Howarth, D. F. Boesch, S. P. Seitzinger, K. E. Havens, C. Lancelot, and G. F Davidson, E. A., M. B. David, J. N Galloway, C. L. Goodale, R. Haeuber, J. A. Harrison, R. W. Howard Ecology, report #15, Ecological Society of America.

Diaz, R.J. and D.L. Breitburg. 2009. The hypoxic environment. Pp 2-23 in JG. Richa Díaz, R.J., N.N. Rabalais, and D.L. Breitburg. 2012. Agriculture's impact on Donner, S.D and D. Scavia. 2007. How climate controls the flux of nitrog Dubravko, J, V.J. Bierman Jr., D. Scavia. and R. Hetland. 2007. Forecasting Entringer, R., and R. Howarth. 2009. Workshop on atmospheric deposition Evans, M. A., G.A. Fahnenstiel, and D. Scavia. 2011. Incidental oligotrophica Evans, M. A. and D. Scavia. 2010. Forecasting hypoxia in the Chesapeake Bay Grizzetti, B., F. Bouraoui, G. Billen, H. van Grinsven, A. Cardoso, V. Thieu, J. Ga Cambridge University Press.

Howarth, R. W., G. Billen, F Howarth, R.W. and S. Bring

Howarth, R. W. & H. Paerl Howarth, R.W., D.P. Swane

Liu, Y., G.B. Arhonditsis, C. Liu, Y, M.A. Evans, D. Scavi Liu, Y. and D. Scavia. 2010.

Marino, R. and R. W. Howa Mörth, C.-M., C. Humborg,

Najjar, R., C. R. Pyke, M. B. Nassauer, J.I., M.V. Santelr Pvke, C. R., R. G. Naijar, M.

Rose, K.A., A.T. Adamack, Scavia, D. and K.A. Donnell

Germany. (http://c Howarth, R.W., F. Chan, D.

DOI:10.1890/10017

Science and Technic

'he Marine Environment, 2nd Edition, Elsevier, Oxford. ociation. 5: 916-932. DOI: 10.1111/j.1752-1688.2011.00578.x

.uce, D.H. Secor, T. E. Targett. 2009. Nutrient enrichment and fisheries exploitation: interactive effects on estuarine living

arine Science. 1: 329-350. .Jsphorus. Science 323: 1014-1015. rinder, E. Porder, C. S Snyder, A. R. Townsend, and M. H. Ward. 2012. Excess nitrogen in the U.S. environment: trends, risks, and solution. Issues in

... Organization of Economic Cooperation and Development, COM/TAD/CA/ENV/ EPOC 16, 36 pp. http://www.oecd.org/dataoecd/60/18/49841630.pdf

uppoxia in the Gulf of Mexico. Limnol. Oceanogr. 52(2): 856-861

Jgram Science and Technical Advisory Committee, January 8, 2009. STAC Publication 09-001. http://www.chesapeake.org/stac/Pubs/atmosphericnitrogen.report.pdf eat Lakes. Environmental Science and Technology 45(8): 3297-3303. DOI: 10.1021/es103892w

Loc: model accuracy, precision, and sensitivity to ecosystem change. Environmental Research Letters 6: 015001

. Curtis, R. Howarth, and P. Johnes. 2011. Nitrogen as a threat to European water quality. Pages 379 404 in M.A. Sutton et al. (editors), The European Nitrogen Assessment: Sources, Effects, and Policy Perspectives.

Hägg, H.E., C. Humborg, D.P. Swaney, and C.-M. Mörth. 2011. Riverine nitrogen export in Swedish catchments dominated by atmospheric inputs. Biogeochemistry. DOI 10.1007/s10533-011-9634-7 Hondorp, D.W., D.L. Breitburg and L.A. Davias. 2010. Eutrophication and fisheries: separating the effects of nitrogen loads and hypoxia on the pelagic-to-demersal ration and other measures of landings composition. Marine and Coastal Fisheries. 2:339-361. DOI:10.1577/C09-020.1 Hong, B., K. Limburg, M. Hall, G. Mountrakis, P. Groffman, K. Hyde, V. Kelly, L. Luo, and S. Myers. 2012. An integrated monitoring/modeling framework for assessing human-nature interactions in urbanizing watersheds: Wappinger and Onondaga Creek watersheds, New York, USA. Environmental Modelling and Software 32:1-1"

Hong, B., D. Swaney, and F Howarth, R.W., D.P. Swaney, G. Billen, J. Garnier, B. Hong, C. Humborg, P. Johnes, C.-M. Mörth, and R.M. Hong, B., D. P. Swaney, C.nagement implications in the multinational areas Marino. 2012. Nitrogen fluxes from large watersheds to coastal ecosystems controlled by net Hong, B., D.P. Swaney and Howarth, R. W. 2008. Coa anthropogenic nitrogen inputs and climate. *Frontiers in Ecology and the Environment*. 10(1): 37–43. Howarth, R. W. 2008. Estin Howarth R. 2009. Nitroger

Alexander, R.B., R.A. Smith, G.E. Schwarz, E.W. Boyer, J.V. Nolan, and J.W. Brakebill. 2008. Differences in phosphorus and nitrogen delivery to the Gulf of Mexico from the Mississippi River Basin, Environ. Sci. Technol., 42, 3, 822-830.

Liu, Y, M.A. Evans, D. Scavia. 2010. Gulf of Mexico hypoxia: exploring increasing sensitivity to nitrogen loads.

eptember 2008, Gummersbach,

DOI: 10.1890/100008

the Environment. 10(1): 37-43. ).1007/s10533-006-9010-1

port of the Chesapeake Bay Program

d Ecology. 381:S188-S203.

.-20.

ces and Interactions with Changing Land

Effects Across Local and Global Landscapes. Annu. Rev. Marine. Sci. 2009.1:329-349 Scavia, D. and Y. Liu. 2009. Simpson, T.W., L.A. Martin Use. Proceedings of the Scientific Committee on Problems of the Environment (SCOPE) International Biofuels Project Rapid Assessment, 22-25 September 2008, Gummersbach Germany. Cornell University, Ithaca NY, USA. (http://cip.cornell.edu/biofuels/ Simpson, T. W., A. N. Sharpley, R. W. Howarth, H. W. Paerl and K. R. Mankin. 2008. The new gold rush: fueling ethanol production while protecting water quality. Journal of Environmental Quality 37: 318-324.

Breitburg, D.L., D.W. Hondorp, L. A. Davias, R. J. Diaz 2009 Hypoxia, Nitrogen, and Fisheries: Integrating

Environ. Sci. Technol. 44(15): 5836-5841

Swaney, D. P., B. Hong, C. Ti, R.W. Howarth and C. Humborg. 2012. Net anthropogenic nitrogen inputs to watersheds and riverine N export to coastal waters: a brief overview. Current Opinion in Environmental Sustainability. 4:1-9. DOI: 10.1016/j.cosust.2012.03.004

Swaney, D.P., R. Santoro, R.W. Howarth, and K. Donaghy. 2011. Historical changes in the food and water supply systems of the New York Metropolitan Area. Regional Environmental Change. 14: 363-380. DOI: 10.1007/s10113-011-0266-1

Swaney, D.P., D. Scavia, R.W. Howarth, and R.M. Marino. 2008. Estuarine classification and response to nitrogen loading: insights from simple ecological models. Estuarine, Coastal and Shelf Science 77: 253-263.

Townsend, A. and R. W. Howarth. 2010. Fixing the global nitrogen cycle. Scientific American, February, 2010

Townsend, A. R., L. A. Martinelli, and R. W. Howarth. 2009. The global nitrogen cycle, biodiversity, and human health. Pages 159-178 in O. E. Sala, L. A Meyerson, and C. Parmeson (eds.). Biodiversity Change and Human Health. SCOPE #69. Island Press, Washington, DC.

Wieczorek, M.E and A.E. Lamotte, 2011. SPARROW model variables for MRB\_E2RF1 catchments, Attributes for MRB-E2RF1 Catchments by major river basins in the conterminous United States: (DS-491), http://water.usgs.gov/nawqa/modeling/rf1attributes.html, accessed June 14, 2011

Zhou, Y. 2006. A Nutrient-Phytoplankton-Zooplankton-Model For Classifying Estuaries Based on Susceptibility to Nitrogen Loads. MS Thesis, School of Natural Resources and Environment, University of Michigan, Ann Arbor, MI. , http://deepblue.lib.umich.edu/bitstream/2027.42/36310/1/Thesis\_Zhou.pdf

Stow, C.A. and D. Scavia 2009. Modeling hypoxia in the Chesapeake Bay: ensemble estimation using a Bayesian hierarchical model. J. Marine Systems 76: 244-250. DOI: 10.1016/j.jmarsys.2008.05.008



#### Don Scavia's Team



**Rich Alexander's Team** 



#### **Denise Breitburg's Team**



## **CHRP - Susceptibility to Nutrient Pollution**

with Howarth, Breitburg, Alexander, plus several postdocs and associates

## **East Coast estuarine eutrophication**

4 components Estuarine, fisheries, and 2 watershed models

Significant science contributions in all 4 areas

#### Important scientific contributions, but integration was a challenge

Large, diverse geography Significant model mismatches in temporal resolution Geographically dispersed investigators



## **Gulf of Mexico models**

with Evans, Obenour, Bertani, Liu, Rabalais, Turner

#### Annual forecasts started in 2002; updated and improved each year

Moved to Bayesian formulation in 2009 Added hypoxic volume forecasts in 2013 Developed strong track record

#### Built and added to NOAA's annual ensemble forecasts

Model-based scenarios guided various Gulf Hypoxia Action Plans

#### **Annual Forecasts**

2017 Gulf of Mexico Hypoxia Forecast Donald Scavia<sup>1</sup>, Isabella Bertani<sup>1</sup>, Colleen Long<sup>1</sup>, Yu-Chen Wang<sup>1</sup>, Dan Obenour<sup>2</sup>

> <sup>1</sup>University of Michigan <sup>2</sup>North Carolina State University

> > June 5, 2017

The Gulf of Mexico annual summer hypoxia forecasts are based on average May total nitrogen loads from the Mississippi River basin for that year. The load estimate, recently released by USGS, is 8,048 metric tons per day. Based on that estimate, we predict the area of this summer's hypoxic zone to be 20,000 square kilometers (95% credible interval, 13,500 to 26,500), an "above average year."

The measured extent this year was 22,750 square kilometers

Our forecast hypoxic volume is 83.1 km<sup>3</sup> (95% credible interval, 53.1 to 113.2).

#### Note: Atypical weather occured in 2003 and 2009 Observed No Measurement in 2016 30,000 Predicted 25,000 Gulf of Mexico Hypoxic area (km<sup>2</sup>) 20,000 15,000 10,000 5,000 2004 2006 2008 2010 2012 2014 2016 2002

#### **Track Record**

#### **Response Curves for Task Force**



#### **Other Model Uses**

Compared to other models (Scavia et al. 2004) Explored N vs. P control (Scavia and Donnelly 2007) Explored potential climate impacts (Donner and Scavia 2007) Predict impacts of oil drilling produced water (Bierman et al. 2007) Explored increasing sensitivity to N loads (Liu et al. 2010) Quantify Impacts of stratification and nutrients (Obenour et al. 2012) Assessing biophysical controls (Obenour et al. 2015)



# Ensemble modeling informs hypoxia management in the northern Gulf of Mexico

Donald Scavia<sup>a,b,1</sup>, Isabella Bertani<sup>a</sup>, Daniel R. Obenour<sup>c</sup>, R. Eugene Turner<sup>d</sup>, David R. Forrest<sup>e</sup>, and Alexey Katin<sup>c</sup>



#### Formal statistical ensemble

59% N reduction to reduce hypoxia to 5,000 km<sup>2</sup>

Interim 20% goal reduces it 18% over long term

But, at least 25% reduction needed to be 95% sure of observing <u>any</u> reduction between 2 consecutive 5 year assessments.

## **Chesapeake Bay models**

With Bertani, Evans

#### Built in as adjunct to Gulf grant (similar model)

#### Forecasts started in 2007

#### Moved to Bayesian formulation in 2009

Identified regime shift consistent with observations

#### Tested TMDL impact of main stem hypoxia

**Bioscience** retrospective emphasized model results drove policy attention

#### **Annual Forecasts**

#### **Chesapeake Bay Hypoxic Volume Forecasts**

Donald Scavia, Isabella Bertani, Yu-Chen Wang, and Colleen Long University of Michigan June 7, 2017

The 2017 Forecast - Given the average Jan-May 2017 total nitrogen load of 244,519 kg/day, this summer's hypoxia volume forecast is 7.9 km<sup>3</sup>, an above average size for the period of record.

#### Track Record



#### **Response Curve**



#### **Impact on Awareness**



## **Hypoxia Model Transition**

with Obenour, Forrest, Testa, Turner

#### Four Very different Gulf Models (Scavia, Obenour, Forrest, Turner)

#### Worked with NOAA on transition to operations plan

- 2017 forecast successfully done in parallel with NOAA
- Prepared to turn them over to NOAA for 2018
- PNAS article documented approach and scenario application

#### Two Chesapeake Bay Models (Scavia, Testa)

Not yet part of NOAA transition planning 2015 – 2017 hypoxia (Scavia) & anoxia (Testa) forecasts Progress tracked by Univ. Maryland "EcoCheck" website



## Ensemble modeling informs hypoxia management in the northern Gulf of Mexico

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How healthy is your ecosystem?

ecochec<sup>K</sup>

Home | Overview | July Hypoxia | Early Summer Anoxia | Late Summer Anoxia | FAQ

Chesapeake Bay Summer Forecast: 2017 ▼

Click on the items below for the 2017 summer forecast indicators:



http://ian.umces.edu/ecocheck/

## Lake Erie ECOFOR

with Allan, Arend, Bartell, Beletsky, Bosch, Brandt, Briland, Daloğlu, DePinto, Dolan, Evans, Farmer, Goto, Han, Höök, Knight, Ludsin, Mason, Richards, Roberts, Rucinski, Rutherford, Schwab, Sesterhenn, Zhang, Zhou, + many students and other postdocs

#### Focus: Lake Erie Central Basin hypoxia

3 components: watersheds, lake ecosystem, fisheries

Very significant progress in all three areas

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A. J. Alam, J. S. Sergia, and S. Serki, 2013. Security Security General Calculation Bet Metales and Market State Market
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ch. H.S., M. Least, D. S. Zowi, and J. Allen für neironize fielders of Linear Change and Agricultural BMPs on Nationet Runot 1. General BM agricultural BMPs on Nationet Runot 1. General BMB agricultural BMPs on Nationet Runot 1. General BMBB agricultural BMPs on Nationet BMB agr
Mit S. 2. Michaelers, S. Ludzin, D. M. Mason, C. M. Bar, and H. Zhang. 2011. Desires hypota Reduce Healand Duality for Lade Walker Source W
key Lie Jund Lie 2008. Chapter 3. Spatially Distributed Waterhale Model of Water and Materials Kunoff. In: J. W. (ed). Wettin and Materials Kunoff. In: J
Hey, E. E., J. D. F. Rikkow, C. He, and J.F. Atkinon. 2008. Hydrological Bescures Shes. Journal of Hydrolice Togins ender genes of Basel Sheet Shee
<pre>leq. T.E. I. I.F. Alkinson, and D.F. Rakow. 2007. Hydrologic-hydrolautic-cologic Model: Insex of Argenizations Conservation Practices on Water Galaxy, PhD Dissertation, UP and Dissolved Reactive Phosphorus Loading Enterement. The Solved Reactive Phosphorus Loading Enterement and Phosphorus Loading Enterement and Phosphorus Loading Analysia and Up Attract Agric C. E. P. Colley, C. He, and Y. Wang, 2011. Application of a Distributed Large Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application of a Distributed Basin Runoff Model to Lake Fir. Fording, C. He, and S. Humer, 2000. Application for Distributed Basin Runoff Model to Lake Fir. Fording Fir. Runoff, C. He, and S. Humer, 2000. Application for Distributed Large Basin Runoff Model In the Grave Lakes Matersheds Structure Basin Runoff Model in the Grave Lakes Matersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model In the Grave Lakes Watersheds Structure Basin Runoff Model Proc. Papers of Americania Water Resources</pre>
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glin, J., H. Abayan, S. Lakoba, and D. Savia, Jongs A. Hunder, Sozia (Jangs A. Jangs A. Savia (Jangs A. Jangs A.
glu, J., J. Massauer, R.L. Rolo, and D. Scavia (in press) An integrated Social and Ecological Modeling Framework - Impacts of a Distributed Type Statistical and Ecological Modeling Framework - Impacts of a Distributed Water Network (C.K. K. M. K. K. Arrend, S. Bartell, D. Beletsky, N. S. Bosch, S. B. Brandt, R. R. D. Briland, J. Dudigiu, J. V. DePinto, D. M.
Marchi, L., Lorge, C. He, and Y. Mag, Zull. Application of a bisthouted large stain knowl Model to Law Marchi, C. T. E. Cofey, C. He, and Y. Hunter. 2003. Application of a bisthouted large stain knowl Model to Law Marchi, C. H. Z. M. Starley, C. He, and Y. Hunter. 2004. Application of a bisthouted large stain knowl Model to Law M. And K. P. McGunage 2005. Lake Eric fotal Phosphorus Roadiest. J. Loading Analysis and Update: 1995-2014 Marchi, C. H. Z. McGunage 2005. Lake Eric fotal Phosphorus Roadiest. J. Loading Analysis and Update: 1995-2014 Marchi, J. M. Bosch, and N.S. Bosch. 2012. Indirect Consequences of Hypothemic Hypoth
And Mark (1, 12, Usery C. Heg, and T. Schlard, 2005. Like Life Tod Broken hashes and Updates and Type Life, 2005. An JUM and K. C. Chapra. 2005. Like Life Tod Phosphorus Ladies (and T. Heg) (a) J.J. Roberts, H. M. Ginagle 2005. Like Life Tod Phosphorus Ladies (and T. Heg) (b) J.J. Roberts, H. M. Schladin, S.A. Pothoven, H.J. Roberts, H.A. (derploeg, A.E. Wilson, and T. Cholov. 2012. Integration of Distribution large basin Ruori (b) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution large basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution large basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution large basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution large basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution large basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J.J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J. J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J. J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J. J. Roberts, H.A. Sock, 2012. Integration of Distribution Large Basin Ruori (c) J. J. Roberts, R.P. Ruori, J. D. Sock, A. Lindels, J. Sock, J. J. Baker, R.P. Richards, and A.N. Sharplez. 2011. Quantifying Phosphorus Retention and Researces Needel and Matter Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. (c) Conduction, J. D. A. Baker, R.P. Richards, and A.N. Sharplez. 2011. Quantifying Phosphorus Retention and
Jun Jun Mark F. Median S. Chapra 2012. Great Lakes Total Phosphores Residence of Nonpolinos Loading Analysis and Chapter 2012. Creat Lakes Total Phosphores Residence of Nonpolinos Loading Analysis and Chapter 2012. Creat Lakes Total Phosphores Residence of Nonpolinos Construction of Distributed Large Basin Runol Model In the Great Lakes Watersheds Unig the States Rearch. In preparation. Law Chapter 2012. Construction of Distributed Large Basin Runol Model In the Great Lakes Watersheds Inter 2014 Phosphores Residence of Nonpolinos Construction States Phosphores Residence of Nonpolinos Constructions. Journal of Phosphores Residence of Nonpolinos Constructions. Journal of Residence of Nonpolinos Constructions. Journal of Residence of Nonpolinos Construction States Phosphores Residence Induced Induce Phosphores Residence Induced Induced Induce Phosphores Residence Induced
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Merginger, A.E. Wilson, and J.D. Hokik. 2012. Indirect Consequences of Hypolimentic Hypoly, H.J.D. Allian. NS. Bosck. 2012. Historical Prends in Phosphorus Loading to Ukersheds of the Society of the Michigan Basins. Biogeochemistry 102: 45-28. Constrained in Phosphorus Loading to Ukersheds of the Society of the Michigan Basins. Biogeochemistry 102: 45-28. Constrained in Phosphorus Loading to Ukersheds of the Society II. 2007. Integration of a Distributed Large Basin Rum of Model In Volta Large Basin Rum of Model In Volta Large Basin Rum of Model Integration of Distributed Large Basin Rum of Model Integration for Distributed Large Basin Rum of Model Integration of Distributed Large Basin Rum of Model Integration of Distributed Large Basin Rum of Model Integration and Vister Resources Modeling and Xasessment: A Watershed Perspective. CRC Press, New York, p. 115-127. C. and T.E. Croley 11, 2008. Modeling Spatial Distributions of Nonpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Rum of Model. Proc. Papers of American Water Resources V, San Mateo, California, March 17-19. C. DeWarchi. 2010. Modeling Spatial Distributions of Polint and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Rum of Model. Proc. Papers of American Water Resources V, San Mateo, California, March 17-19. C. DeWarchi. 2010. Modeling Spatial Distributions of Polint and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds Using Extended End-American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C., and C. DeWarchi. 2010. Modeling Spatial Distributions of Polint and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds Using Extended End-American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C., and C. DeWarchi. 2010. Modeling Spatial Distributions of Polint and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds Using
1. H. J. Balan, and N.S. Bosch. 2012. Historical Pattern of Phosphorus Loading to Like Fin W.H. N. Bosch, and J. D. Allan. Historical Trends in Phosphorus Loading to Watersheds of the W.H. N. Bosch, and J. D. Allan. Historical Trends in Phosphorus Loading to Watersheds of the W.H. N. Bosch, and J. D. Allan. Historical Trends in Phosphorus Loading to Watersheds of the W.H. N. Bosch, and J. D. Allan. Historical Trends in Phosphorus Loading to Watersheds of the W.H. N. Bosch, and J. D. Allan. Historical Trends in Phosphorus Loading to Watersheds of the C. and T.E. Croley II. 2007. Application of GS and Visualization for Distributed Large Basin Runo C. and T.E. Croley II. 2008. Chapter 10. Estimating Nonpoint Source Pollution Loadings in the Great Lakes Watersheds. In: J. W. (ed). Wetland and Water Resource Modeling and Assessment: A Watershed Perspective. CRC Press, New York, p. 115-127. C. and T.E. Croley II. 2008. Modeling Spatial Distributions of Nonpoint Source Pollution Loadings in the Great Lakes Watersheds In: Sarpatian Journal of Senorces and Ecology 1(1):1-6. C. C. DeWarchi, and T.E. Croley II. 2008. Modeling Spatial Distributions of Nonpoint Source Pollution Loadings in the Great Lakes Watersheds Null Sung the Distributed Large Basin Runo Great Lake Swatersheds Null Sung Katersheds Jusing Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 (1). D.C. and T.E. Croley II. 2008. Modeling Spatial Distributions of Policino Loadings in the Great Lakes Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 (1). D.K. J. Environmental Quality 40(1)
1, H., N. Bosch, and J. D. Allan. Historical Trends in Phosphorus Lading to Watersheds of the Great Lakes Active Activ
h. H. N. Bosch, and J.D. Allan. 2011. Spatial and Temporal Variation in Phosphorus Budges fo. C. and T.E. Croley II. 2007. Application of a Distributed Large Basin Runoff Model in the Great. Large Tein and Lake Michigan Basins. Biogeochemistry 102: 45-58. L. croley II. 2007. Application of a Distributed Large Basin Runoff Model in the Great. Law Efric and Lake Michigan Basins. Biogeochemistry 102: 45-58. L. croley II. 2008. Chapter 10. Estimating Nonpoint Source Pollution Loadings in the Great Lakes Watersheds. In: J. W. (ed). Wettand and Water Resource Modeling and Assessment: A Watershed Perspective. CRC Press, New York, p.115-127. C. and T.E. Croley II. 2008. Modeling Spatial Distributions of Point and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Runoff Model. Proc. Papers of American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C., and C. DeMarchi, and T.E. Croley II. 2008. Modeling Spatial Distributions of Point and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Runoff Model. Proc. Papers of American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C., and C. DeMarchi, and T.E. Croley II. 2008. Modeling Spatial Distributions of Point and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 well, D.M., Kins, A.A., Sone, M. T. Tinggradow Halak, AM Barchak, AM
C. and T.E. Croley II. 2007. Application of a Distributed Large Basin Runoff Model in the Great Lakes Watersheds. In: <i>Ji</i> , W. (ed). Wetland and Jones (ed). Environmental Change and Rational Water Use. Orientación Gráfica Editora S. R.L., Buenos Aires, Argentina, pp. 247-260. C. and T.E. Croley II. 2007. Maplication for Distributed Large Basin Runoff Model In the Great Lakes Watersheds. In: <i>Ji</i> , W. (ed). Wetland and Water Resource Modeling and Assessment: A Watershed Perspective. CRC Press, New York, p.115-127. C. and T.E. Croley II. 2008. Chapter 10. Estimating Nonpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Runoff Model. Proc. Papers of American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C. and C. DeWarchi. 2010. Modeling Spatial Distributions of Point and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds. International Journal of Science and Engineering 2(1):24-30. (e, H.P., C. Naal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 well, D.M., J. Song, M. T. Scavatia, D., J. D. Allann, K. K. Arrend, S. Bartell, D. Beletsky, N. S. Bosch, S. B. Brandt, R. D. Briland, I. Daloğlu, J. V. DePinto, D. M., hadk, A.M. agorski. Z. Dolann, M. A. Evans, T. M. Earmer D. Goto, H. Han, T. O. Höökk, P. Knight, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, P. B. Pichards, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, S. Cavia, C. H. Han, T. O. Höökk, P. Knight, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, S. Scavia, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, S. Scavia, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, S. Scavia, S. A. Ludsin, D. Masconn, A. M. Michalack, P. B. Pichards, S. Scavia, S. A. Ludsin,
C. and T.E. Croley II. 2007. Integration of GIS and Visualization for Distributed Large Basin Ruomeling of the Great Lakes Watersheds. In: Scarpati and Jones (eds). Environmental Change and Rational Water Use. Orthoaction Grafica Editors 3.R.L., Buenos Aires, Argentina, pp. 247-260. C. and T.E. Croley II. 2008. Modeling Spatial Distributions Source Pollution Loadings in the Great Lakes Watersheds. In: J. W. (ed.). Wetland and Water Resource Modeling and Assessment: A Watershed Perspective. CRC Press, New York, p.115-127. C. and T.E. Croley. 2010. Hydrological Resources Sheds and the U.S. Great Lakes Matersheds. Inter Stational Journal of Science and Engineering 2(1):24-30. (e, n.P. C. Neal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds. International Journal of Science and Engineering 2(1):24-30. (its, S.A., K. Sone, M. T. Ingradov halak, A.M. agorski. 20 Nataka, N. agorski. 20 Noven, S.A. Doclan, M. A. Evanns, T. M. Earmer, D. Gocto, H. Hap, T. O. Höökk, P. Kniight, S. A. Ludscin, D. Mascon, A. M. Maichalak, P. P. Piichards, N. C. J. C. Dearne, J. M. A. Evanns, T. M. Earmer, D. Gocto, H. Hap, T. O. Höökk, P. Kniight, S. A. Ludscin, D. Mascon, A. M. Maichalak, P. P. Piichards
C. and T.E. Croley II. 2008. Chapter 10. Estimating Nonpoint Source Pollution Loadings in the Great Lakes Watersheds. In: Ji, W. (ed). Wetland and Water Resource Modeling and Assessment: A Watershed Perspective. CRC Press, New York, p.115-127. C. and T.E. Croley II. 2008. Modeling Spatial Distributions of Nonpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Runoff Model. Proc. Papers of American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C. c. DeMarchi. 2010. Modeling Spatial Distributions of Point and Nonpoint Source Pollution Loadings in the Great Lakes Watersheds. International Journal of Science and Engineering 2(1):24-30. (ie, H.P., C. Neal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 well, D.M., ins, S.A., N. Song M. T. 'inogradov halak, A.M. agorski. 20 oven, S.A. Dolan, M. A. Evans, T. M. Earmer, D. Goto, H. Han, T. O. Höök, R. Knight, S. A. Ludsin, D. Mascon, A. M. Mitchalak, P. P. Pichards, N. M. A. Evans, T. M. Earmer, D. Goto, H. Han, T. O. Höök, R. Knight, S. A. Ludsin, D. Mascon, A. M. Mitchalak, P. P. Pichards, 'ht, and M.A. 'ht, and M.A. Evans, T. M. Earmer, D. Goto, H. Han, T. O. Höök, R. Knight, S. A. Ludsin, D. Mascon, A. M. Mitchalak, P. P. Pichards, 'ht, and M.A.
C. and T.E. Croley. 2010. Hydrological Resources Sheds and the U.S. Great Lakes Applications of Monpoint Source Pollution Loadings in the Great Lakes Watersheds by Using the Distributed Large Basin Runoff Model. Proc. Papers of American Water Resources Association GIS and Water Resources V, San Mateo, California, March 17-19. C., and C. DeMarchi. 2010. Modeling Spatial Distributions of Monpoint Source Pollution Loadings in the Great Lakes Watersheds. International Journal of Science and Engineering 2(1):24-30. <i>ite</i> , H.P., C. Neal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 well, D.M., <i>ite</i> , H.P., C. Neal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 <i>Synthesis: 2014 Best Paper of the Year</i> <i>ite</i> , H.P., C. Neal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 <i>Synthesis: 2014 Best Paper of the Year</i> <i>ite</i> , H.P., C. Neal, P.J.A. Withers, D.B. Baker, R.P. Richards, and A.N. Sharpley. 2011. Quantifying Phosphorus Retention and Release in Rivers and Watersheds Using Extended End-Member Mixing Analysis (E-EMMA). J. Environmental Quality 40(1):492-504 <i>Synthesis: 2014 Best Paper of the Year</i> <i>Synthesis: Song and the Year</i> <i>Song and the</i>
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Conservation Con
perts, J., Tereputrophication of Lake Frie: Central Basin Hypoxia   Great Lakes Res. 40: 226–246
erts, J., P
iefts, J.J., S. b. Branuc, D. Fansiow, S.A. Luusin, S. Founoven, D. Scavia, and T.O. nook. Growth and Condition of Yellow percent response to hypoxia. Synthesis of nad and neurolesuits. Transactions of the American Ensite Society. 40, 1574–1580.
erts, J.J., S.B. Brandt, D. Fanslow, S.A. Ludsin, S.A. Pothoven, D. Scavia, and T.O. Höök. 2011. Effects of Hypoxia on Consumption, Growth, and RNA:DNA Ratios of Young Yellow Perch. Transactions of the American Fisheries Society 40:1574–1586.
erts, 1. L. 2007. Kight Product, Kight Yate, Kight Time and Kight Placethe Foundation of Best Management Practices for Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices for Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices: General Principles, Strategy for Their Adoption and Voluntary Initiatives vs Regulations: Papers Presented at the IFA International Workshop Loss Fertilizer Best Management Practices (Strat
in recunzer best windigenemic Fracuces, 7-9 warch 2007, Brussels, belgium, international recunzing Aris, France, ISBN 2-352333-2-A.
nak, D. S. Scava, J. Defino, D. Beltsky. 2014. A simple to utilinate based bisorded oxygen index to the central basin of take the bolination deat takes research 30.400-470.

Scavia, D., J. D. Allan, K. K. Arend, S. Bartell, D. Beletsky, N. S. Bosch, S. B. Brandt, R. D. Briland, I. Daloğlu, J. V. DePinto, D. M. Dolan, M. A. Evans, T. M. Farmer, D. Goto, H.Han, T. O. Höök, R. Knight, S. A. Ludsin, D. Mason, A. M. Michalak, R. P. Richards, J. J. Roberts, D. K. Rucinski, E. Rutherford, D. J. Schwab, T. Sesterhenn, H. Zhang, Y. Zhou. 2014.

Assessing and addressing the re-eutrophication of Lake Erie: Central Basin Hypoxia. Journal of Great Lakes Research

Schwab, D.J., D. Beletsky, J.V. DePinto, and D.M. Dolan. 2009. A Hydrodynamic Approach to Modeling Phosphorus Distribution in Lake Erie. Journal of Great Lakes Research 35(1):50-60.

Sharpley, A., P. Richards, S. Herron, and D. Baker. 2012. Case Study Comparison between Litigated and Voluntary Management Strategies. J. Soil and Water Cons. 67:442-450

Vanderploeg, H.A., S.A. Ludsin, J.F. Cavaletto, T.O. Höök, S.A. Pothoven, S.B. Brandt, J.R. Liebig, and G.A. Lang. 2009b. Hypoxic Zones as Habitat for Zooplankton in Lake Erie: Refuges from Predation or Exclusion Zones? Journal of Experimental Marine Biology and Ecology 381:S108-S120.

Vanderploeg, H.A., S.A. Ludsin, S.A. Ruberg, T.O. Höök, S.A. Pothoven, S. B. Brandt, G.A. Lang, J.R. Liebig, and J.F. Cavaletto . 2009a. Hypoxia Affects Spatial Distributions and Overlap of Pelagic Fish, Zooplankton in Lake Erie. Journal of Experimental Marine Biology 381:S92-S107.

Wang, J., H. Hu, D. Schwab, G. Leshkevich, D. Beletsky, N Hawley, and A. Clites. 2010. Development of the Great Lakes Ice-circulation Model (GLIM): Application to Lake Erie in 2003-2004. Journal of Great Lakes Research 36(3): 425-436.

Xing, F., C. DeMarchi, T. E. Croley, and Y. Wang. Application of Distributed Large Basin Runoff Model to Lake Erie: Model Calibration and Analysis of Parameter Spatial Variation. In review.

Zhang, H., Culver, D.A., and Boegman, L. 2008. A Two-dimensional Ecological Model of Lake Erie: Application to Estimate Dreissenid Impacts on Large Lake Plankton Populations. Ecological Modeling 214: 219-241.

Zhou, Y., D.R. Obenour and D. Scavia, T.H. Johengen, and A.M. Michalak. 2013. Spatial and Temporal Trends in Lake Erie Hypoxia, 1987-2007. Environmental Science & Technology 47: 899-905, dx.doi.org/10.102/es303401b.

#### **Document Historical Loads (Dolan et al.)**



#### Document 1990s Hypoxia Resurgence (Zhou et al.)



#### Identify Current Primary P Sources (Scavia Team)



## Fisheries Effects: Oxy-Thermal Squeeze (Höök et al.)



#### Response Curve to Set Targets (Rucinski et al.)



Land-use Load Reduction Strategies (Bosch et al.)



## Lake Erie ECOFOR

with Allan, Arend, Bartell, Beletsky, Bosch, Brandt, Briland, Daloğlu, DePinto, Dolan, Evans, Farmer, Goto, Han, Höök, Knight, Ludsin, Mason, Richards, Roberts, Rucinski, Rutherford, Schwab, Sesterhenn, Zhang, Zhou, + many students and other postdocs

> Focus: Lake Erie Central Basin hypoxia 3 components: watersheds, lake ecosystem, fisheries Very significant progress in all three areas (pubs, examples)

## Integration was easier because it focused on one system and teams were geographically connected

#### Influence was powerful - New International P load Targets

International Joint Commission – Lake Erie Priority Report Great Lakes Fisheries Commission – Technical Committees <u>EPA, Environment Canada – GL Water Quality Agreement</u> Healing our Waters Coalition – Great Lakes Advocates

## Lake Erie HAB models

with Obenour, Bertani, Stow, Gronewold

#### Built as adjunct to ECOFORE

#### **Bayesian hierarchical formulation**

HAB as function of phosphorus loadFirst to account for both model and observation errorFirst to identify increasing sensitivity to loads

**Contributes to NOAA's annual HAB ensemble forecasts** 

Used in setting new US-Canada GLWQA phosphorus loads

#### **Annual Forecast team feeds NOAA Ensemble**





#### Response Curves guide GLWQA load targets



#### ECOFORE Contributions to new GLWQA Nutrient Load Targets Special Issue of J. Great Lakes Res.

#### Synthesis

Scavia, D., J.V. DePinto, I. Bertani. 2016. A Multi-model approach to evaluating target phosphorus loads for Lake Erie. J. Great Lakes Res. 42: 1139-1150

#### **Central Basin Hypoxia Models**

- Zhang, H., L. Boegman, D. Scavia, D. A. Culver. 2016. Spatial distributions of external and internal phosphorus loads in Lake Erie and their impacts on phytoplankton and water quality. J Great Lakes Res. 42: 1212-1227
- Bocaniov, S.A, L.F. Keon, Y.R. Rao, D.J. Schwab, D. Scavia. 2016 Simulating the effect of nutrient reduction on hypoxia in a large lake (Lake Erie, USA-Canada) with a three-dimensional lake model. J. Great Lakes. Res 42: 1228-1240
- Rucinski, D., DePinto, J., Beletsky, D., Scavia, D. 2016 Modeling hypoxia in the Central Basin of Lake Erie under potential phosphorus load reduction scenarios. J. Great. Lakes Res. 42: 1206-1211
- Bocaniov, S. and D. Scavia 2016 Temporal and spatial dynamics of large lake hypoxia: Integrating statistical and three-dimensional dynamic models to enhance lake management criteria. Water Resources Res. (Supplemental Information) 52: 4247-4263

#### Western Basin HAB Models

- Bertani, I., C. E. Steger, D. R. Obenour, G. L. Fahnenstiel, T. B. Bridgeman, T. H. Johengen, M. J. Sayers, R. A. Shuchman, D. Scavia.
   2016. Tracking cyanobacteria blooms: do different monitoring approaches tell the same story? Science of the Total Environment 575: 294-30
- Bertani, I, D.R. Obenour, C. E. Steger, C. A. Stow, A. D. Gronewold, D. Scavia 2016. Probabilistically assessing the role of nutrient loading in harmful algal bloom formation in western Lake Erie. J Great Lakes. Res. 42: 1184:1192
- Obenour, D.R. A.D. Gronewold, C.A. Stow, and D. Scavia 2014 Using a Bayesian hierarchical model with a gamma error distribution to improve Lake Erie cyanobacteria bloom forecasts. Water Resources Res.

## Worth noting

#### **Ecofore began in 2005:**

- NCCOS saw an emerging issue and wanted to get ahead of the curve
- At the time, rare for a Federal agency to support competitive GL research
- Ecofore results & capabilities in place two years before the poop hit the fan
- Well positioned for leadership to guide new GLWQA load reductions

Since then, **building on Ecofore**, we have had grants from:

- **NSF** Water, Sustainability, and Climate
- **NSF** SEES: Enhancing sustainability in communities threatened by HABs
- **NOAA/**COCA: Enhancing awareness of Lake Erie climate impacts
- EPA/Environment Canada: Multi lake model effort to guide load targets
- Joyce/Erb Foundations: Multi watershed model effort to guide reduction actions
- **EPA:** Evaluating Pay for Performance approach in agriculture



#### Hypoxia Modeling, Nutrient Reduction Targets, and Stakeholder Engagement (Northern Gulf of Mexico)

#### Nancy Rabalais Louisiana State University Louisiana Universities Marine Consortium

Alan Lewitus NOAA National Ocean Service National Centers for Coastal Ocean Science

NCCOS HAB and Hypoxia Portfolio Review

26 February 2018, Silver Spring, MD



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## Hypoxia Task Force

- 5 Federal Agencies and Tribes:
- US Army Corps
- US EPA
- USDA
- USGS
- NOAA
- National Tribal Water Council

- 12 State Agencies:
- Arkansas
- Missouri
- Iowa
- Tennessee
- Minnesota
- Indiana
- Ohio
- Louisiana
- Illinois
- Mississippi
- Kentucky

#### Data from Water Resources Inst. • Wisconsin



#### **Hypoxia Task Force Action Plans**



#### Workshops to Inform Hypoxia Task Force & other Gulf Management Efforts

Year	Theme
2006	Gulf Science Symposium – 2007 reassessment of Action Plan
2007	Monitoring
2007	Ecological Impacts
2010*	Fisheries Impacts, Monitoring, Communication
2011*	Monitoring and Modeling
2011	Miss River Diversions
2012*	Living Resource Impacts, Biogeochemical Processing – for Action Plan reassessment
2013*	Glider Applications, Scenario Forecast Modeling
2014*	Miss River Diversions/Hypoxia Interaction
2016*	Monitoring
2018*	Monitoring (CHAMP)
2018	Fisheries Effects

#### \*Annual NOAA/NGI Hypoxia Research Coordination Workshops

#### Monitoring









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#### Long-term Monitoring of Hypoxic Zone Areal Extent

Coastal Goal: Reduce 5-year running average size of the Gulf hypoxic zone to 5,000 km<sup>2</sup> by 2035





2017 Hypoxic Zone areal extent = 22,720 km<sup>2</sup>

From Nancy Rabalais (LSU/LUMCON)

#### Hypoxic Zone Monitoring Activities in Recent Past



<u>Goal</u>: Identify and coordinate partner interests for establishing a cooperative sustainable monitoring program for the Gulf hypoxic zone that achieves management-driven objectives.

#### Core principles:

- Management Outcomes monitoring requirements are driven by management needs;
- Broad User Community the monitoring program will extend beyond the hypoxic zone region, and integrate with monitoring programs that target other interrelated issues important to ecosystem conservation and restoration;
- Cooperative Support Network cooperative support from multiple partners with diverse interests is critical to sustainability of a comprehensive and robust monitoring program.

## **Management Products Informing Mitigation of Hypoxia**



### **Monitoring Requirements for Management Products**

Requirement	Collaborators	Support
Mid-summer shelf-wide ship survey west of Mississippi Delta	LSU/LUMCON	NOAA NCCOS
Nutrient monitoring and annual and spring P and N loading estimates from Miss/Atchafalaya River Basin	USGS	USGS
Daily discharge monitoring	USACE	USACE
Maintain Hypoxia Data Portal	NOAA NCEI IOOS GCOOS	NOAA NCEI IOOS GCOOS

## Hypoxia Monitoring Workgroups for the Cooperative Hypoxia Assessment and Monitoring Program (CHAMP)

Workgroup	Lead(s)
Louisiana	Angelina Freeman (LA CPRA), Dubravko Justić (LSU)
Mississippi/Alabama	Steve Ashby (MSU/NGI), Stephan Howden (USM), Brian Dzwonkowski (DISL)
Texas	Steve DiMarco (TAMU)
Autonomous Vehicles	Steve DiMarco (TAMU)
Fisheries	Kevin Craig (NOAA), Chris Brown (NOAA)
Hypoxia Task Force	Katie Flahive (EPA), Danny Wiegand (EPA)
Ocean Acidification	Barb Kirkpatrick (GCOOS), Nancy Rabalais (LSU/LUMCON), Steve DiMarco (TAMU)
Gulf Restoration	Steve Giordano (NOAA), Becky Allee (NOAA)

#### **Scenario Forecast Modeling**

#### See Don Scavia presentation



Nutrient reduction targets in 2001 and 2008 HTF Action Plans informed by scenario forecast models



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#### **Task Force Goals**

- Coastal Goal: reduce the five-year running average areal extent of the Gulf of Mexico hypoxic zone to less than 5,000 km<sup>2</sup> (1,928 mi<sup>2</sup>) by 2035;
- an Interim Goal of a 20% reduction of N and P loading by 2025 is a milestone for immediate planning and implementation actions...

Lake Superior Lake Huron ake Toronto, Chicago Detroit Atlanta Total Nitrogen Yield Delivered to Gulf of Mexico Housto High Miami Gulf of Mexico Low

Total Nitrogen Yields Delivered to Gulf of Mexico

USGS SPARROW MAPPER

Watersheds contributing the highest nitrogen yields to the Gulf
### **Scenario Forecast Modeling**

#### See Don Scavia presentation

Model Type	Modelers
Statistical regression	Gene Turner (LSU)
Streeter-Phelps adaptation	Don Scavia (U. Michigan)
Bayesian biophysical	Dan Obenour (NCSU)
Statistical regression	David Forrest (VIMS)

## **Scenario Forecast Modeling**

Model Type	Modelers
Statistical regression	Gene Turner (LSU)
Streeter-Phelps adaptation	Don Scavia (U. Michigan)
Bayesian biophysical	Dan Obenour (NCSU)
Statistical regression	David Forrest (VIMS)
Hydrodynamic/biogeochemical	Katja Fennel (Dalhousie) Rob Hetland (TAMU) Dubravko Justić (LSU)

#### Nutrient Reduction Guidance from Ensemble of Scenario Forecast Models

Question 1: What reductions in N and P loading are needed to shrink the Dead Zone to 5,000 km<sup>2</sup> (Coastal Goal)?

Models confirmed the importance of a <u>dual nutrient reduction strategy</u>:

Targeting N alone would require a ~60% reduction to reach 5,000 km<sup>2</sup> goal;

 Targeting both N and P would require a 48% reduction of each nutrient, close to the 45% reduction recommended in 2008 Action Plan.



### Nutrient Reduction Guidance from Ensemble of Scenario Forecast Models

Question 2: How much will 20% reductions in N and P loading shrink the zone (Interim Goal)?

 3D Model simulations showed that the sensitivity of changes in hypoxia to nutrient load reductions is variable – reaching the 20% interim nutrient reduction goal will not reduce hypoxia significantly, but will bring us closer to the point where the amount of hypoxia reduction per unit nutrient reduction increases - i.e. moving beyond 20% reduction will have an impact on the size of the hypoxic zone



#### **3D Time Variable Models**

**Applications:** 

- •HTF guidance on nutrient reduction goals
- Hypoxic zone annual characterization presented to HTF
- •Effect of Miss River Diversions on nutrient loading/hypoxia
- Ecological impacts
- Future projections of climate effects

### **Model Simulations of 2017 Hypoxic Zone Dynamics**

-100 -

30.5

Latitude (°N)

NOAA supported modelers: •Katja Fennel (Dalhousie U) •Dubravko Justić (LSU) •Robert Hetland (Texas A&M)

**Biogeochemical model coupled to:** 

1. ROMS Hydrodynamic Model

## Simulated 3D view at midpoint of July 2017 ship survey



-91

-92 Longitude (°W)

2. FVCOM Hydrodynamic Model

#### **Model Simulations of 2017 Hypoxic Zone Dynamics**





-- June 20, 2017 –

# NOAA, USGS and partners predict third largest Gulf of Mexico summer 'dead zone' ever

Federal scientists forecast that this summer's Gulf of Mexico dead zone – an area of low to no oxygen that can kill fish and other marine life – will be approximately 8,185 square miles [21,199 square kilometers], or about the size of New Jersey.

-- August 2, 2017 –

#### Gulf of Mexico 'dead zone' is the largest ever measured

Scientists have determined this year's Gulf of Mexico "dead zone," is 8,776 square miles [22,720 square kilometers], an area about the size of New Jersey. It is the largest measured since dead zone mapping began there in 1985.

#### **Press Releases of Forecast and Measured Size**

Page Title	Pageviews	Avg. Time on Page	Bounce Rate
Homepage	6,052,199	0:03:50	11.63%
East Coast storm born from 'bombogenesis'. It's less scary than it sounds.	39,112	0:01:50	67.12%
2017 was 3rd warmest year on record for U.S.	18,289	0:02:25	72.97%
NOAA: 2017 was 3rd warmest year on record fcr the globe	18,137	0:02:29	70.75%
Snow squall warnings to begin this winter	14,383	0:02:01	78.23%
NOAA kicks off 2018 with massive supercomputer upgrade	13,754	0:02:29	86.47%
U.S. Winter Outlook: NOAA forecasters predict cooler, wetter North and warmer, drier South	10,589	0:02:32	81.25%
How do snowflakes form? Get the science behind snow	7,654	0:06:19	84.51%
Globe had 3rd warmest year to date and 5th warmest November on record	5,196	0:01:49	64.71%
Extremely active 2017 Atlantic hurricane season finally ends	5,145	0:04:32	79.70%
New storm surge watches and warnings saved lives	5,078	0:01:22	73.85%
NOAA's GOES-16, now at GOES-East, ready to improve forecasts even more	4,356	0:01:14	75.23%
Gulf of Mexico 'dead zone' is the largest ever measured	3,578	0:06:43	78.12%
Q&A: Winter weather forecasts, from our national centers to your neighborhood	2,740	0:01:25	73.37%
Photo story: Rescued seals make it home for the holidays	2,205	0: <mark>01:4</mark> 8	80.14%
6 tools our meteorologists use to forecast the weather	2,192	0:07:47	73.87%
Scientists: Strong evidence that human-caused climate change intensified 2015 heat waves	1,939	0:05:19	91.41%
Whale science on the high seas	1,485	0:02:03	65.22%
Deepwater Horizon oil spill settlements: Where the money went	1,484	0:10:38	75.92%
What is a harmful algal bloom?	1,270	0:06:52	81.13%

## Summary

- Providing management guidance built on years of research that developed a series of linked statistical, two-dimensional and threedimensional models and supportive field efforts that:
  - couple the Mississippi River watershed with the northern Gulf of Mexico,
  - explain diverse synergistic influences on the physical and biological factors in the northern Gulf that control the development of hypoxia, and
  - provide improved forecasting tools to inform hypoxia mitigation strategies.
- Recent emphasis on transitioning of monitoring requirements and modeling tools to operations
- Strong network of researchers, managers, and stakeholders, and extensive outreach at multiple levels

#### **Ecological Impacts – Kevin Craig Talk**

Coupling between hydr/biogeoch models and ecological models is needed to capture environmental forcings of hypoxia and its effects;



## The End

• Next up –

Don Scavia (University of Michigan). *Hypoxia modeling, relationship with nutrient loading, water quality targets, and transition planning (Chesapeake Bay, Lake Erie, Gulf of Mexico)* 



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## **Monitoring Requirements are driven by Management Products**



## **Monitoring Requirements are driven by Management Products**



### **Progression of Forecast Models**

Year	Modeler	Predicted Areal Extent (km <sup>2</sup> )	Observed Areal Extent (km <sup>2</sup> )
2007	Turner	22,127	20,480
2008	Turner & Scavia	22,404	21,764
2009	Turner & Scavia	19,325 - 21,935	8,240*
2010	Turner & Scavia	16,861 - 20,233	18,400
2011	Turner & Scavia	22,049 - 24,438	17,680
2012	Turner & Scavia Turner (sediment legacy effect)	3,371 <mark>16,117</mark>	7,480
2013	Turner & Scavia	18,900 - 22,207	15,120

\*Persistent westerly winds for weeks before cruise "piled up" hypoxic water along SE LA shelf

### **Progression of Forecast Models**

Year	Modeler	Predicted Areal Extent (km <sup>2</sup> )	Observed Areal Extent (km <sup>2</sup> )
2014	Turner & Scavia & Forrest	12,018 - 14,807	13,080
2015	Turner & Scavia & Forrest & Obenour	14,201	16,760
2016	Turner & Scavia & Forrest & Obenour	15,276	*
2017	Turner & Scavia & Forrest & Obenour	21,199	22,720

### \*2016: model simulations of mid-summer areal extent were 13,900 km<sup>2</sup> (ROMS) and 21,100 km<sup>2</sup> (FVCOM)

#### Project

CHRP: Observations and Modeling of Narragansett Bay Hypoxia and Its Response to Nutrient Management

## Observed and modeled responses of Narragansett Bay to managed nutrient load reductions under an engaged stakeholder process

Candace Oviatt and Daniel Codiga Graduate School of Oceanography University of Rhode Island

> February 26, 2018 NCCOS Science Review Silver Spring, MD

# **Project Investigators**

- Candace Oviatt, GSO
- Daniel Codiga, GSO
- James Kremer, UCONN
- Jaime Vaudrey, UCONN
- Mark Brush, VIMS
- Scott Nixon, GSO
- Chris Kincaid, GSO
- David Ullman, GSO
- Warren Prell, Brown University
- David Murray, Brown University

# **Project Goals**

- Advance understanding of nutrient loading and circulation processes that dictate Narragansett Bay hypoxia, and assess their relative importance;
- Implement multiple modeling approaches to develop tools for (i) evaluating the response of hypoxia to alternative management scenarios and climate change, and (ii) enhanced predictive capabilities.
- Engage all stakeholder and make all information and tools available to them on a regular basis.

#### **Observational Program**

- Document the nutrient reduction by measuring standing stock concentrations of nutrients in the surface waters of Narragansett Bay;
- Document ecosystem productivity and hypoxia changes to nutrient reduction;
- Measure physical parameters such as currents and vertical mixing to improve the ROMS circulation model for Narragansett Bay.





#### **Results Observations**



Β.



## Decrease in Summer Chlorophyll







Primary production patterns in the Bay change with nitrogen reduction.



Figure from Jason Krumholz.

### Continued periods of low oxygen in the Bay









Most severe hypoxia mostly limited to Greenwich Bay

#### Modeling Program

- Empirical modeling
- Refine material exchange methods in two ecological models using 1) the ROMS circulation model and 2) a box model for circulation;
- Validate the General Ecosystem Model and the Ecosystem Box Models;
- Model Management and climate scenarios and develop userfriendly version of the model for use by managers.

# **Empirical modeling**

- Using time series D.O. obs. (Codiga et al. 2009)
- Multiple linear regressions with observed biological/physical parameters
  - Temp, riverflow, spring/neap, stratification
- Conclusion: Spring/neap weakly important
- Conclusion: River flow (stratification) is strongest driver of interannual variability

#### Simulation Modeling: Two Approaches

#### **Estuarine Eutrophication Model**



#### MODEL RESULTS





Panel B – RIDOCS results

Figure V8: (Panel A) Number of days predicted by the EcaGEM model where the bottom water oxygen predicted minimum value is less than 2.9 mg/L. Model was run using the 2006 and 2007 nutrient inputs. (Panel B) <u>BIDOCS values for 2006 and 2007</u>. The RIDOCS results is a more complex formula involving multiple criteria beyond the < 2.9 mg/L. Both figures use the same color scheme: 0-3 dark green; 4-9 light green; 10-29 yellow; 30-49 orange; >50 red.



Figure V9: Projected number of days where instantaneous dissolved oxygen in bottom water is less than 2.9 mg/L. This scenario is the predicted results of target nitrogen reductions goals from WWTFs of 50% relative to 1995, achieved in 2013. The two panels provide <u>a high and low estimates</u> of number of days below 2.9 mg/L.



Figure V10: Projected number of days where instantaneous dissolved oxygen in bottom water is less than 2.9 mg/L. This scenario is the predicted results of target nitrogen reductions goals from WWTFs of 75% relative to 1995. The two panels provide <u>a high and low estimates</u> of number of days below 2.9 mg/L. This is an additional 25% reduction over what was achieved in 2013. While modeled as reductions to WWTF nitrogen inputs, these reductions could also be achieved in combination with non-point source reductions.

#### Comparison of Output from EcoGEM and EcoOBM



Fig. 1. Example tracer distributions by model element after a <u>24 hour</u> simulation in <u>EcoGEM</u>, using exchanges from ROMS (black) and the OBM (red), provided by J. <u>Vaudrey</u>. Plots show the fraction of tracer starting in a given element ('Source Box', numbers across the top), present in each model box after 24 hours ('Destination Box', x-axis). Box numbering is that used in <u>EcoGEM</u>.

#### **EcoOBM Verification**



Fig. 2. Example EcoOBM output for surface chl-a and phytoplankton NPP for the 2001-09 period along a transect down the Providence River and West Passage. Model output is in blue, data from Smith & Oviatt are in green (two stations in Box 3), and NBFSMN (buoy) data are in grey, with the exception of Box 13 which is the long-term time series maintained by MERL at the GSO pier.
## EcoOBM: Predicted decrease in low oxygen events with different levels of nutrient reduction.



Fig. 5. EcoOBM scenario analysis results with changes in nutrient loading from rivers and WWTFs. Graphs show the predicted number of days with O2 < 4.8 mg l-1 in the bottom layer of boxes in the upper bay. (a) Effect of decreasing loads year-round from current values (stdrun) to 0, 0.25, 0.5, and 0.75 times current values. (b) Effect of removing riverine and WWTF loads in January through April vs. May through October, compared to removing loads year-round (0x) and current conditions (stdrun).

#### Stakeholder Program

- Conduct targeted meetings with Environmental Mangers;
- Conduct an annual workshop to announce findings of the project and engage advice from the stakeholder community.

#### Hypoxia Workshop October 2, 2006 Graduate School of Oceanography, URI

Organization	Visitor's Name	Email	NBNERR	Raposa, Kenny	Kenny@nbnerr.org
AE	Hittingerr, Rich			Stankells, Bob	Kristin@nbnorr.org
Rhittinger@AllianceEnviron	mentalGroup.com		INDINERK	van wagner, Kristin	Kristin@nonerr.org
ASA	Swanson, Craig	cswanson@appsci.com	RI. Coord. Team	Colt, Ames B.	ames.colt@dem.ri.gov
Brown	Murray David	dmurray@brown edu	RIDEM	Beck, Eric	eric.beck@dem.ri.gov
Brown	Drall Warren	warren prell@brown edu	RIDEM	Haberek, Joe	joseph.haberek@dem.ri.gov
Brown	Prior Don	Donald prever@brown.edu	RIDEM	Kiernan, Sue	sue.kiernan@dem.ri.gov
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	24911411, 1144110		RIDEM	Zalewsky, Brian	brian.zalewsky@dem.ri.gov
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EPA	Cote, Mel	cote.mel@epa.gov	RISA	Cook, Ed	edcookcharters@cox.net
EPA	Latimer, Jim	latimer.jim@epa.gov			
	,		RI Sea Grant	Desbonnet, Allen	aland@gso.uri.edu
EPA-LISO	Tedesco, Mark	Tedesco.Mark@epa.gov	RI Sea Grant	Pierce, Barry Costa	bcp@gso.uri.edu
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NBC	Walker, Catherine	Catherine.walker@narrabay.c	com		
NBNERR	Comeau, Christine	chris@nbnerr.org			

#### **Summary**

Data observations indicate the 50% managed nutrient reduction was achieved and resulted in a 30% reduction in primary production. A trend of a 30% reduction in hypoxia is not yet statistically significant.

Two models have been developed to predict the summer low oxygen events in Narragansett Bay. One uses the detailed circulation dynamics of the ROMs model to predict oxygen during a wet and a dry year with different nutrient levels. The other uses a coarse box model to predict circulation and can easily run annual oxygen predictions with different nutrient levels. Both models have been inter-compared, data verified and exhibit acceptable skill levels. Both models indicate that some hypoxia will continue at a 50% reduction in nutrients and that a 75% reduction will be necessary to further decrease hypoxia.

R I DEM managers have access to both models but for the time being prefer observations to models. Thus we have the contract from RI DEM to maintain the DEM portion of the monitoring network and manage data from the monitoring network of fixed sites and buoys to assess water quality oxygen levels.

DEM continues to evaluate the impacts of the 50% nutrient reduction and faces criticism From fishing industry interests for making the Bay "too clean".

#### **Evaluation Criteria for the Narragansett Bay CHRP program (2005-2016)**

**Quality:** 48+ presentations; 28 publication; 6 PhD dissertations; 3 Master's Theses;

EcoGem User's Guide, Jaime Vaudrey

Online EcoOBM, Mark Brush

#### **Relevance:**

1-Up-to-date information on nutrient concentrations, primary production, water clarity, bay circulation, and summer hypoxia distribution, intensity and duration.

2-Two ecological and circulation models able to predict oxygen concentration spatially and temporally in Narragansett Bay.

#### **Performance:**

Continuing stakeholder engagement (NOAA, NBEP, Baird Symposium, RI C-AIM program, RI DEM).



#### **NOAA** FISHERIES

## Hypoxia Impacts on Living Resources and Implications for Management

J. Kevin Craig

NOAA Southeast Fisheries Science Center Beaufort Laboratory

#### **Projects and Peer-Reviewed Papers**

<u>NGOMEX 2009</u>: Effects of Hypoxia on Harvest Dynamics and Economics of the Shrimp Fishery in the Northwestern Gulf of Mexico.

<u>CHRP 2005</u>: Linking Hypoxia-induced Habitat Degradation to Fishery Outcomes: A Bioeconomic Approach Based on Brown Shrimp

<u>FATE 2012</u>: (leveraged): Effect of Shelf Hypoxia on the Gulf Menhaden Fishery and Implications for Stock Assessment.

- PIs and Collaborators: Martin Smith (Duke), Kevin Craig (FSU), Lori Bennear (Duke), James Nance (NOAA SEFSC)
- 18 peer-reviewed papers since 2010

<u>NGOMEX 2009</u>: Modeling Reproductive and Population Impacts of Hypoxia in the Northern Gulf of Mexico.

- PIs and Collaborators: Peter Thomas, (UT), Kenneth Rose (LSU), Dubravko Justic (LSU), Kevin Craig (FSU), Thomas Grothues (Rutgers).
- 24 peer-reviewed papers since 2011

#### Making the Link to Living Resources

3300 3200

40 60 80

20



Gulf hypoxic zone overlaps in time and space with:

- Region of highest productivity of fish and invertebrates
- Highest valued fishery in the Gulf (penaeid shrimp)
- Highest biomass fishery in the Gulf (Gulf menhaden)

Little research on potential effects on managed resources (i.e., fisheries) prior to early to mid-2000s







#### **Brown Shrimp Spatial Distribution**

Fishery-Independent SEAMAP Survey (June-July)





#### Atlantic Croaker Spatial Distribution

Low to moderate hypoxia (< 7,000 km<sup>2</sup>)



## Aggregation Near Hypoxic Edge



## Spatial Responses to Hypoxia

#### > Mobile organisms effectively avoid low DO

- Field-estimated avoidance thresholds range from 1-2 mg L<sup>-1</sup> across species
- Avoidance thresholds are above laboratory-based lethal thresholds

#### > Sub-lethal and indirect effects are important

- Organisms occupy moderately low DO (2-4 mg L<sup>-1</sup>) in the field
- Occupy DO levels where sub-lethal effects observed in lab
- Habitat loss induces strong aggregations near hypoxic edges

#### Primary Limitation

- Based mostly on point-in-time surveys
- Spatio-temporal dynamics of organism (and fishery response) to seasonally dynamic oxygen conditions not well-known

Craig et al. (2010, 2012, 2013)





## **Reproductive Impairment of Atlantic Croaker**

#### October 2007



#### Gonads smaller at hypoxic sites



October 2010



#### Marked decrease in fully developed oocytes



Thomas et al. (2011, 2015)

## Hypoxia Effects on Croaker Reproduction & Growth

#### Masculinization of females

- Sperm detected in 25% ovaries
- Decrease in aromatase activity
- Thomas and Rahman (2011)





#### Growth impairment

- Elevated growth inhibitors (IGF binding protein (IGFBP-1, IGFBP-2)
- IGFBP increased and growth decreased over 20 wks hypoxia exposure in the lab
- Rahman and Thomas (2018)

#### Hypoxia exposure biomarkers elevated

- Hypoxia-Inducible Factor (HIF-α) an oxygen sensitive transcription factor- regulates metabolic adaptation to hypoxia
- Rahman and Thomas (2018)





## **Atlantic Croaker Population Model**

Project long-term popn consequences of hypoxia exposure

- Spatially explicit, IBM
  - Follows 7 stages to age 8
  - September 1 birthday
  - Model year begins Sept. 1
  - Each year 365 days long
- Hourly processes
  - Growth
  - Mortality
  - Reproduction
  - Movement (routine & avoidance)
- Environmental conditions simulated on a 2-D spatial grid
  - Climatological temperature
  - Climatological surface Chl-a
  - Dissolved oxygen from 3-D hydrodynamics-WQ model



## **Dissolved Oxygen**

8

- Grid encompasses La. and N. Texas coast
- 3-D coupled hydrodynamicwater quality model
  - FVCOM + WASP
  - 1-10 km horizontal
  - 0.2-2.0 m vertical





 Calibrated and assessed using multiple independent data sources for 2002

Justic and Wang. 2014. Continental Shelf Research

#### Midyear snapshots of predicted bottom DO (FVCOM interpolated to the IBM grid)

June 15th

July 16th

August 16th



#### Croaker Avoidance (July 16<sup>th</sup>)



#### Hypoxia Effect on Long-Term Population Abundance



- Random times series of idealized 'severe,' 'moderate,' and 'mild' hypoxic years in proportion to their historical occurrence
- Response dominated by the effect of reduced fecundity

Rose et al. (2017a)

#### Nutrient-Hypoxia Tradeoffs



- Magnitude of hypoxia effect is larger (~25% decline) with the more realistic DO (blue)
- Reductions in nutrients result in further croaker declines due to decreased food (red)
- These reductions in food availability can be offset by relatively modest increases in DO associated with the lower nutrients (gray lines)
- Pos. effect of reduced hypoxia outweighs neg effect of reduced food (preliminary conclusion) Rose et al. (2017b)

#### NGOMEX 2016 (new)

D. Justic (LSU), K. Rose (UMCES), E. Meselhe (Water Institute), H. Tian (Auburn), J. Xu (LSU), L. Huang (LSU), K. Craig (SEFSC)

- Link IBM to 3D FVCOM and WASP models
  - Predictions of Chl (food availability) and DO
  - Potential for vertical movement
- Link watershed and river diversion models (DLEM and Delft 3D) to FVCOM
  - supply nutrients and water flow to FVCOM
  - Evaluate diversion scenarios
- Coupled models allow for more seamless evaluation of nutrient-hypoxia tradeoffs
- Expand to additional species (Gulf menhaden, brown shrimp, red snapper)







## How do Fisheries Respond to Hypoxia?

Mine existing fisheries datasets:

- Electronic logbook data on shrimp vessel tow locations
  - Maintained by NOAA SEFSC Galveston Lab (2005-2010)
  - Random sample of vessels with recorded trawl set locations over the fishing season (April to October)
  - 17,843 53,242 individual shrimp trawl locations per year

#### Gulf Menhaden Coastal Logbook Program

- Maintained by NOAA SEFSC Beaufort Lab
- 100% catch and effort reporting since 2006
- 75,132 purse seine set locations (2006-2009)

Merge with survey or model estimates of dissolved oxygen

- Brown Shrimp: SEAMAP survey estimates of bottom DO
- Gulf Menhaden: WQ model output (Fennel et al. 2013)

Test for effects on fishery response variables (e.g., effort, catch, CPUE) using geospatial regression models

## Two Key Finding

Fishing fleets are responsive to hypoxia (or hypoxia-induced effects on target species)

These shifts in spatial distribution influence catchability (q), or the proportion of the stock harvested by a given unit of fishing effort—key parameter of stock assessment models

## Hypoxia Effects on the Shrimp Fishery

(Results from Geospatial Regression Model)



#### Slope of Spatially Varying DO Effect

Green: Decrease in effort when DO is low (positive slope)

Blue: Increase in effort when DO is low (negative slope)

Purcell et al. (2017)

## Gulf Menhaden Fishery

- Second largest US fishery by weight (0.5 million metric tons annually)
- Fishery extends from April to November but peaks in June-July
- Mostly prosecuted close to shore (within 5 miles)
- Merged with DO predictions from coupled hydrographicbiogeochemical model (Fennel et al. 2013)



## Shift in Spatial Distribution of the Menhaden Fishery

#### P(fishing)





#### Under low DO conditions:

- Decrease in catch and effort in regions typically experiencing chronic hypoxia
- Fleet shifts westward, inshore, and eastward when hypoxia is severe

Langseth et al. 2014)

# What are the economic consequences to the shrimp fishery?



#### Shrimp Bioeconomic Modeling

Led by Marty Smith (Duke)

#### Brown shrimp life history

 $N_{0,i,\nu} = \widetilde{N}(1 + \varepsilon_{i,\nu})\theta_i$ Recruitment Hypoxia Adjustments  $N_{t,i,v} = N_{0,i,v}e^{\sum_{s} - m_{s} + \sum_{s} - f_{s}}$  Survival  $\widetilde{m_t} = (1 + \Delta_m)m_t$  $m_t = \beta(L_t)^{\rho}$ Natural Mortality  $\widetilde{q_t} = (1 + \Delta_a)q$  $f_t = qE_t$ **Fishing Mortality**  $L_t = L_{\infty}(1 - e^{-\delta t})$ Growth  $\widetilde{\delta}_t = (1 - \Delta_\delta)\delta$ Allometric (length to weight)  $w_t = \omega(L_t)^{\gamma}$  $H_t = \frac{f_t}{f_t + m_t} (1 - e^{-f_t}) w_t N_t \quad \text{Harvest}$ 

Microdata:

 Requires high resolution data on shrimp catches and environmental conditions over the course of a fishing season

#### Neue River Estuary (NRE) 9 Shallow, wind-driven system 9 Seasonal hypoxia (May-Sept) 9 hypoxia is highly episodic NE NE

- Daily shrimp catches (NCDMF trip ticket program)
- Daily DO (USGS moorings)

## Main Results from North Carolina



#### Harvest losses from hypoxia (1999-2005):

- > Avg losses of 13-21% across the range of models considered (compared to no hypoxia)
- For Neuse-Pamlico system \$1.2 million in lost annual revenues
- Modeling fisher participation (respond to abundance and price) suggests behavioral adjustments can partially mitigate this loss
  - 4% annual loss in revenue (\$0.3 million annually)

#### Huang et al. (2010, 2012)

#### Is this approach transferable to the Gulf?

#### No....resolution of catch and DO data not sufficient

Key findings from <u>spatially dynamic</u> bioeconomic model:

- 1. Net effect of all three processes (q, growth, mortality) on total catch can be pos or neg and vary depending on when in the season the system is observed
- 2. Even with perfect info., detecting hypoxia effects in catch data would be difficult
- 3. No counterfactual (i.e., control)--What would happen in the absence of hypoxia?
  - Shrimp fleet highly mobile and trips can extend over several weeks
  - Contamination of potential controls (e.g., Texas fishery)

(Smith et al. 2014. Marine Resource Economics 29:111-131)

Expect increased harvest of small relative to large shrimp Catchability, growth, and mortality skew size distn to smaller sizes

Do size-based shrimp prices contain info. on the effects of hypoxia?

#### Size-Based Prices of Brown Shrimp



- Shrimp are sold in size-based categories based on the number of shrimp per pound
- Price per pound of large shrimp is higher than for small shrimp (different economic value)
- Relative size-based prices are stable in the <u>long-term</u> so that <u>short-term</u> deviations in relative price should be random in the absence of intervening effects
- Shrimp prices provide a market-based counterfactual against which to test effects of hypoxia

Smith et al. (2017)

# Seafood prices reveal impacts of a major ecological disturbance

January 2017



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## Demonstrated effect of hypoxia on a major commercial fishery

#### ➤ Main result:

**PNAS** 



- When hypoxia is severe, prices of large shrimp increase relative to small shrimp (growth overfishing is a key mediating process)
- Result is consistent with known or hypothesized mechanisms: catchability, growth, and mortality skew size distributions to smaller sizes so that fewer large shrimp are available
- Cannot separate out the relative importance of alternative mechanisms with this analysis
- Magnitude of the effect is unknown, but regression model suggests 1000 km<sup>2</sup> increase in area hypoxia triggers a 1% increase in the relative price of large shrimp

## Effects on the Gulf Menhaden Stock Assessment



Key Result: Hypoxia may bias management advice from stock assessment models (Underestimate fishing mortality and overestimate stoc biomass)
## Simulate the Gulf Menhaden Stock Assessment

### Catchability (q):

- Avg proportion of a stock harvested by a given unit of fishing effort
- Key parameter of stock assessment models used to set catch limits

	4 patterns in q	
Operating model "Create Truth" (2013 assessment)	Proportional to area (Obenour et al. 2013)	<ul> <li>% Fleet affected:</li> <li>31% (Langseth et al. 2014)</li> <li>100% (max effect)</li> </ul>
	Step increase in 1993 Gradual increase	
Generate data	Back-calculated from the assessment	Estimation model assume constant q as in current assessment

### Effects on Fishing and Biomass Reference Points

Not accounting for effects of hypoxia:

F30% reference point

- Fishing mortality (F) biased low
- Spawning biomass (SSB) biased high
- Magnitude of effect is highly uncertain
- Potential leads to risk-prone management advice



#### SSB30% reference point



Hypoxia Scenarios

Langseth et al. (2016)

### NGOMEX 2016 (new)

D. Obenour (NCSU), K. Craig (SEFSC)

Primary limitation to understanding hypoxia effects on fisheries is the lack of empirically-based, high resolution DO data



- > Objectives:
- Geostatistical modeling of available DO data to generate within-season spatial maps of DO
- Fusion of geostatistical and mechanistic model results to develop optimal estimates of hypoxia through time and over multiple sections of the Louisiana-Texas Shelf
- Re-evaluate hypoxia effects on the Gulf Menhaden assessment model
- Extend approach to the Brown Shrimp assessment





# Stock Assessment Process for Federally-Managed Species

SEDAR (Southeast Data, Analysis, Review)



accounts for hypoxia effects

### Gulf of Mexico Ecosystem Status Report (ESR)

# ESR develops and tracks ecosystem drivers, pressures, and state across multiple components of the ecosystem



NOAA Technical Memorandum NMFS-SEFSC-706

#### 2017 ECOSYSTEM STATUS REPORT UPDATE FOR THE GULF OF MEXICO

Mandy Karnauskas, Christopher R. Kelble, Seann Regan, Charline Quenée, Rebecca Allee, Michael Jepson, Amy Freitag, J. Kevin Craig, Cristina Carollo, Leticia Barbero, Neda Trifonova, David Hanisko, and Glenn Zapfe



U.S. DEPARTMENT OF COMMERCE National Oceanic and Atmospheric Administration National Marine Fisheries Service Southeast Fisheries Science Center 75 Virginia Beach Drive Miami, Florida 33149

March 2017

http://www.aoml.noaa.gov/ocd/ocdweb/ESR\_GOMIEA/



Figure 5.2. Average annual dissolved oxygen concentration values for the Louisiana (left) and Texas (right) coastal shelf, in summer (top) and fall (bottom).



Figure 8.2. Species diversity metrics calculated from the SEAMAP survey. Metrics are reported separately for Louisiana (left) and Texas (right) waters and for summer (top) and fall (bottom) surveys.

# Gulf Integrated Ecosystem Assessment (IEA)

# The Ecosystem Status Report is one product of the Gulf IEA



#### Provide analytical frameworks to implement ecosystem-based management

- Is a decision-support process that synthesizes and analyzes diverse data and ecosystem model outputs
- Is modular, iterative, scaleable, and adaptable
- Shares a common national framework, yet with regional variation in implementation
- Provides assessments of the ecosystem across and within multiple ocean-use sectors
- http://www.aoml.noaa.gov/ocd/ocdweb/gomiea.html

### Movement toward EBFM in the Gulf

NOAA Ecosystem-Based Fisheries Management Policy Statement (published May 2016)

- Defines EBFM and its benefits
- Establish relationship to current legal authorities (e.g., MSA, MMPA, ESA, NEPA)
- Articulate guiding principles



NOAA Fisheries Ecosystem-Based Fisheries Management Road Map (published November 2016)

Gulf of Mexico Ecosystem-Based Fisheries Management Road Map Implementation Plan (currently in review)





# **Thank You**

### Levels of Ecosystem-Based Management



Increasing interest in

Provide analytical frameworks to implement ecosystem-based management

- Is a decision-support process that synthesizes and analyzes diverse data and ecosystem model outputs
- · Is modular, iterative, scaleable, and adaptable
- Shares a common national framework, yet with regional variation in implementation
- Provides assessments of the ecosystem across and within multiple ocean-use sectors
- http://www.aoml.noaa.gov/ocd/ocdweb/gomiea.html







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#### Extensive reproductive disruption, ovarian masculinization and aromatase suppression in Atlantic croaker in the northern Gulf of Mexico hypoxic zone

Peter Thomas\* and Md. Saydur Rahman

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journal homepage: www.elsevier.com/locate/jembe

Biomarkers of hypoxia exposure and reproductive function in Atlantic croaker: A review with some preliminary findings from the northern Gulf of Mexico hypoxic zone

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Estuaries and Coasts (2018) 41:233–254 DOI 10.1007/s12237-017-0266-6



Modeling the Population Effects of Hypoxia on Atlantic Croaker (*Micropogonias undulatus*) in the Northwestern Gulf of Mexico: Part 1—Model Description and Idealized Hypoxia

Kenneth A. Rose<sup>1,2</sup> • Sean Creekmore<sup>1</sup> • Peter Thomas<sup>3</sup> • J. Kevin Craig<sup>4</sup> • Md Saydur Rahman<sup>5</sup> • Rachael Miller Neilan<sup>6</sup>

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Estuaries and Coasts (2018) 41:255–279 DOI 10.1007/s12237-017-0267-5

Modeling the Population Effects of Hypoxia on Atlantic Croaker (*Micropogonias undulatus*) in the Northwestern Gulf of Mexico: Part 2—Realistic Hypoxia and Eutrophication

Kenneth A. Rose<sup>1,2</sup> · Sean Creekmore<sup>1</sup> · Dubravko Justić<sup>1</sup> · Peter Thomas<sup>3</sup> · J. Kevin Craig<sup>4</sup> · Rachael Miller Neilan<sup>5</sup> · Lixia Wang<sup>1</sup> · Md Saydur Rahman<sup>6</sup> · David Kidwell<sup>7</sup>



### Hypoxia Avoidance Thresholds





### Shrimpers Target Hypoxic Edges



### Example-1 yr Simulations



#### Growth, mortality and catchability



#### Contamination of controls



- Net effect of hypoxia can be positive or negative
- Direction and magnitude of effect varies over the season
- Mobility of shrimp fleet contaminants (nonhypoxic) controls

Key Lesson: Detecting hypoxia effects from perfect catch data would be difficult

### Time Series Modeling of Brown Shrimp Prices

Hypothesis: Relative price of large to small shrimp increases with increasing hypoxia severity

$$\frac{P_{L,t}}{P_{S,t}} = \alpha + \beta H_{k,t} + \gamma (P_{s,t}) + X_t (\theta) + \epsilon_{L,t}$$

Price<sub>large shrimp</sub> / Price<sub>small shrimp</sub> = hypoxia severity + covariates

#### <u>Data</u>

• Monthly sizes-based prices (1990-2010; 252 observations)

### <u>Covariates</u>

- Hypoxic area and volume
- Diesel fuel price (influences effort--major driver of variable costs)
- Sea surface temperature (could influence supply, i.e., via recruitment)
- Monthly dummy variables

#### **Permutations**

- 3 separate large shrimp categories (<15, 15-20, 20-25 count)
- 3 separate (reference) small shrimp categories (30-40, 40-50, 50-67 count)
- Hypoxia area and volume via two alternative interpolation methods

# Shrimp Fishery Electronic Logbooks

Merged with bottom DO from SEAMAP trawl and hydrographic survey

- FI trawl and hydrographic survey (~300 stations/ yr)
- Interpolate bottom DO from annual SEAMAP surveys (June-July)
- Censor ELB data to match temporal scale of DO interpolation
- Smooth interpolated surface to account for uncertainty in DO data and trawl path
- Aggregate tow and DO data to 10 min x 10 min grid
- Synoptic on a scale of 1-2 weeks and 30-40 km



Longitude (°W)

Longitude (°W)

### Partial Effect of DO on Shrimping Effort (averaged over space)



Avoidance of limited areas of low DO

- Mouths of major estuaries
- Extension of Miss. Plume west

#### Some avoidance of low DO

- Hypoxia extends over most of shrimping grounds
- Shrimpers active in and around low DO water

#### Purcell et al. (2017)

### Hypoxia Effects on Fishing Mortality Reference Points



- Magnitude of the effect is highly uncertain
- Maximum estimates of bias assuming effects persist over the entire fishing season (May-Sept)
- Depends strongly on the proportion of the fleet affected by hypoxia
- Need better understanding of within-season spatio-temporal dynamics of hypoxia and the fishing process