

# Economic Effects of Hypoxia on Fisheries

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# Mechanisms for Hypoxia to Affect Economic Performance in Commercial Fisheries

Slow growth

Less abundance – lower catches

Smaller individuals – lower prices

Mortality

Less abundance – lower catches

Mobility

Change spatial distribution of catches – travel costs

Aggregation -- catchability

# Approaches

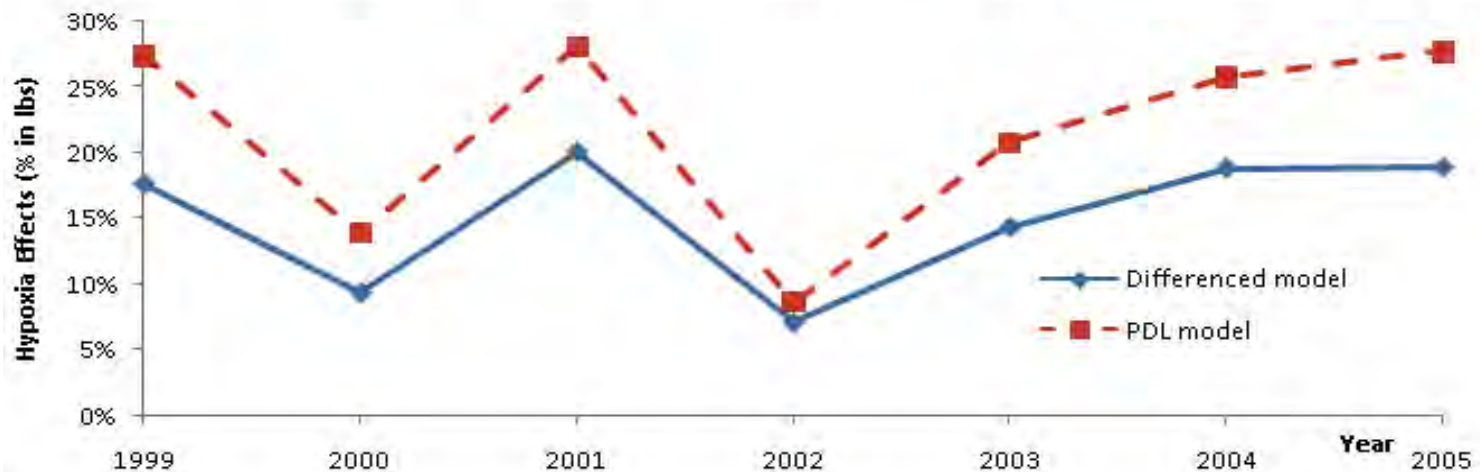
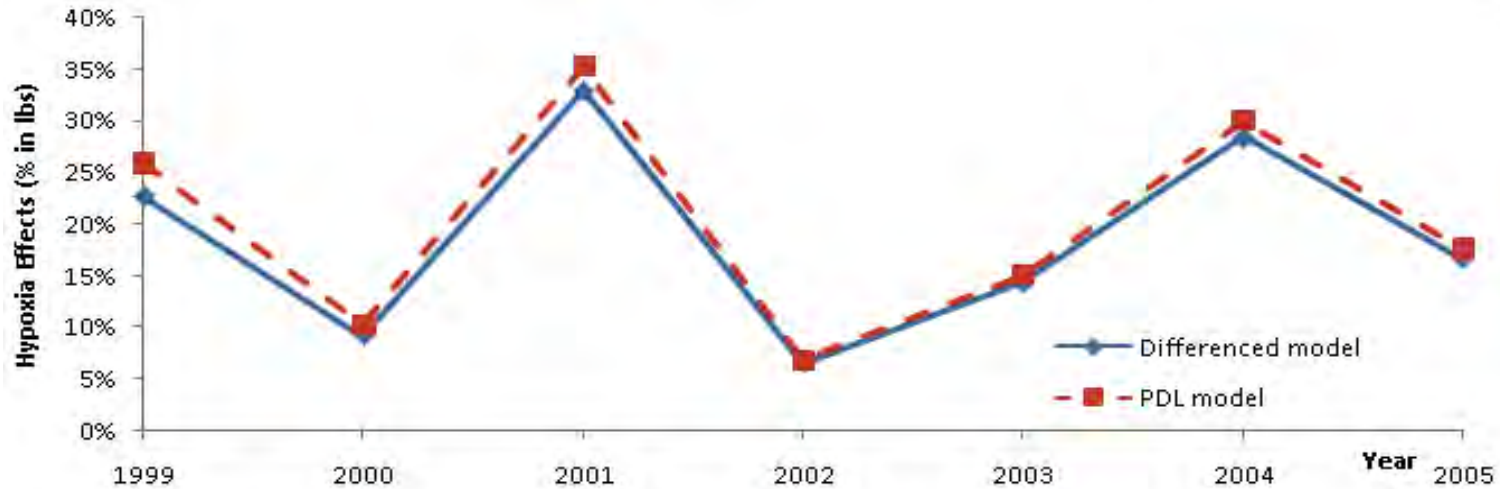
1. Empirical bioeconomic modeling
2. Treatment effects
3. Bioeconomic simulation
4. Time series analysis of prices

Future: combine 1 and 3

# **1. EMPIRICAL BIOECONOMIC MODELING OF HYPOXIA AND SHRIMP FISHERIES**

# Impact: Lost Catches From Hypoxia

## Neuse R. and Pamlico Sound

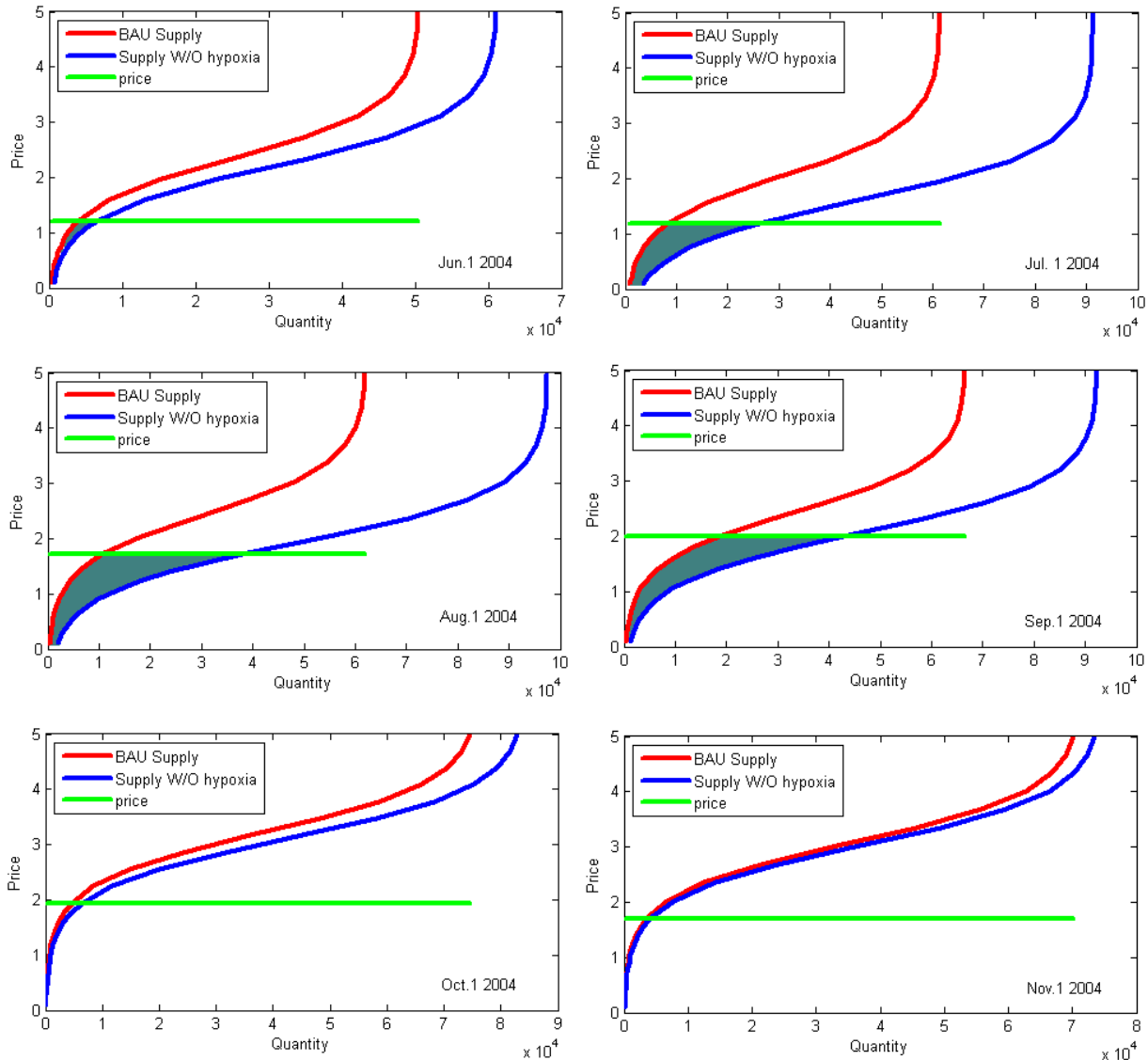


Huang, Smith, and Craig (2010)  
“Measuring Lagged Economic Effects of Hypoxia in a Bioeconomic Fishery Model”  
*Marine and Coastal Fisheries: Dynamics, Management, and Ecosystem Science*

# From impacts to value

- Price for NC shrimp determined non-locally – no effects on consumers
- A hypothetical reduction in hypoxia would **increase revenues by \$1.2 million annually**
- A hypothetical reduction in hypoxia would **increase value \$0.3 million annually** (~25% of revenue loss)

# Actual economic losses are only 25% of revenue losses



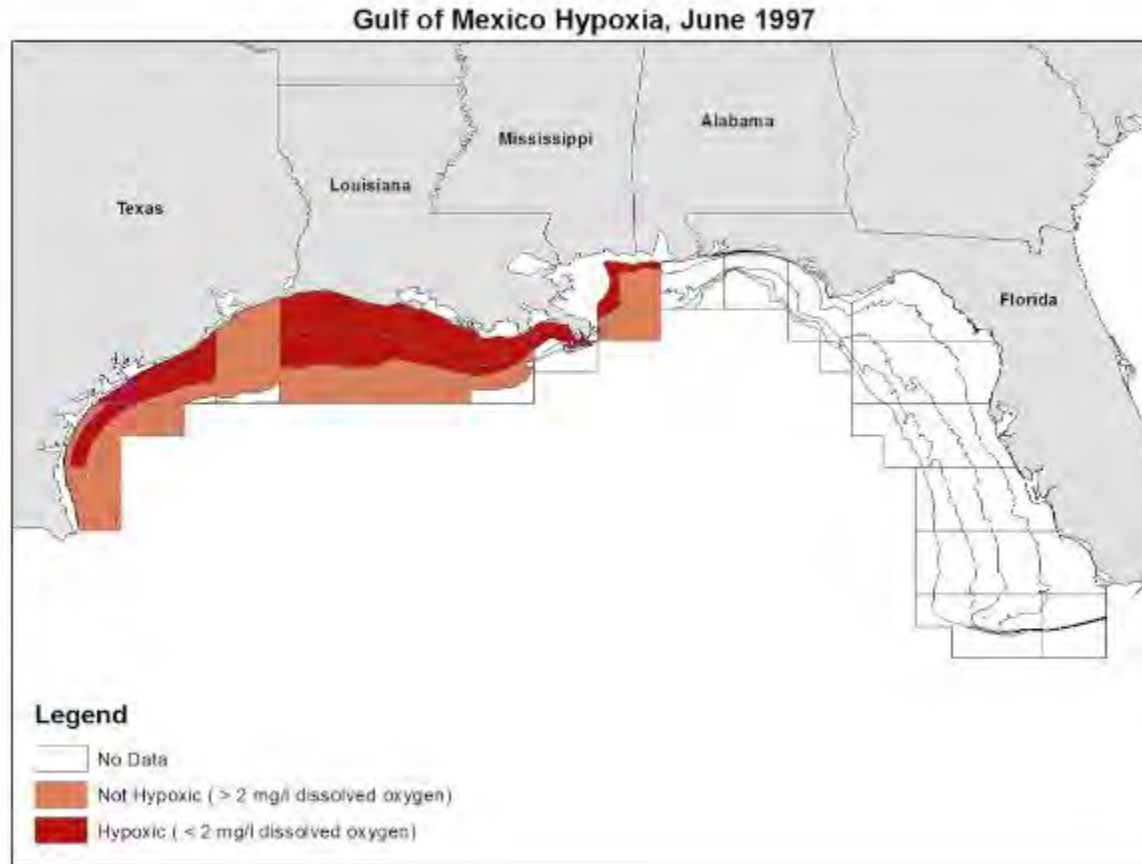
**3. TREATMENT EFFECTS –HYPOXIC  
AREAS AS “TREATMENT” AND NON-  
HYPOXIC AREAS AS “CONTROLS”**



# Subarea-Depth Zone



# Snapshot of Hypoxia



# Treatment Effects Models

- Triple differences – space, time, and hypoxia
- $\ln(\text{Catch})$  dependent variable with Effort as independent variable
- 31-choice conditional logit model with BLP contraction mapping and stratified random sample of the fleet to predict Effort and purge endogeneity
- Fixed effects for year, month, zone, year-zone

# Conditional Logit Results

| <b>Variable</b> | <b>Estimate</b> | <b>std error</b> | <b>t-stat</b> |
|-----------------|-----------------|------------------|---------------|
| Wind Speed      | -2.2196         | 0.0423           | -52.4610      |
| Shrimp Price    | 8.9512          | 0.2109           | 42.4349       |
| Diesel Price    | -15.6177        | 0.4554           | -34.2954      |
| E(revenue)      | 0.2567          | 0.0039           | 66.3616       |
| E(catch)        | 0.1784          | 0.0040           | 44.3949       |
| Distance        | -42.3594        | 0.1210           | -350.1362     |

# Treatment effects results

- No statistically significant effect on aggregate catches
- No statistically significant pattern of effects on individual size classes
- No statistically significant dynamic (lagged) effects of hypoxia
- Still exploring alternative identification strategies

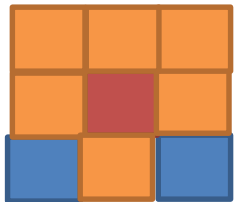
## **3. BIOECONOMIC SIMULATION**

# Results from Prior Work

- Economic benefits from reduced hypoxia are temporary increases in profits (Smith and Crowder, *Sustainability*, 2011)
- Gains from improved fisheries management of NC blue crabs far outweigh gains from eliminating hypoxia (Smith, *Land Economics*, 2007)
- Optimal fishery management response to hypoxia (in shrimp/annual species) – open season earlier, but gains are small (Huang and Smith, *Ecological Economics* 2011)
- Improved environmental quality becomes a margin for rent dissipation (Smith, *Annual Review of Resource Economics* 2012)

# Gulf Shrimp Spatial-dynamic Bioeconomic Simulation

(Smith et al. *Marine Resource Economics* 2014)



Space as (3 x 3) Grid with stochastic hypoxia (worse in middle)

$$N_{0,j,y} = \tilde{N}(1 + \varepsilon_{j,y})\theta_j$$

Recruitment

$$N_{t,j,y} = N_{0,j,y}e^{\sum_s -m_s + \sum_s -f_s}$$

Survival

$$m_t = \beta(L_t)^\rho$$

Natural Mortality

$$f_t = qE_t$$

Fishing Mortality

$$L_t = L_\infty(1 - e^{-\delta t})$$

Growth

$$w_t = \omega(L_t)^\gamma$$

Allometric (length to weight)

$$H_t = \frac{f_t}{f_t + m_t} (1 - e^{-f_t})w_t N_t$$

Harvest

## Hypoxia Adjustments

$$\tilde{m}_t = (1 + \Delta_m)m_t$$

$$\tilde{q}_t = (1 + \Delta_q)q$$

$$\tilde{\delta}_t = (1 - \Delta_\delta)\delta$$

$N_{a,t,j,y}$  Now adding cohorts!



# Spatial-dynamic Bioeconomic Simulation

$$U_{ijt} = v_{ijt} + \eta_{ijt}$$

Random Utility Maximization

$$v_{ijt} = \begin{cases} \alpha, & \text{for } j = 0 \\ p_t h_{ijt} - c - \phi l_{ij}, & \text{for } j = 1, 2, 3, \dots, J \end{cases}$$

from Smith et al. *PNAS* 2010

$$p_t = \bar{p}_t + \varphi w_t$$

Weight-based Prices

$$E_{t,j} = I \left( \frac{e^{v_{i,t,j}}}{\sum_{k=0}^J e^{v_{i,t,k}}} \right)$$

Effort (closes the model)

## **Key Lesson**

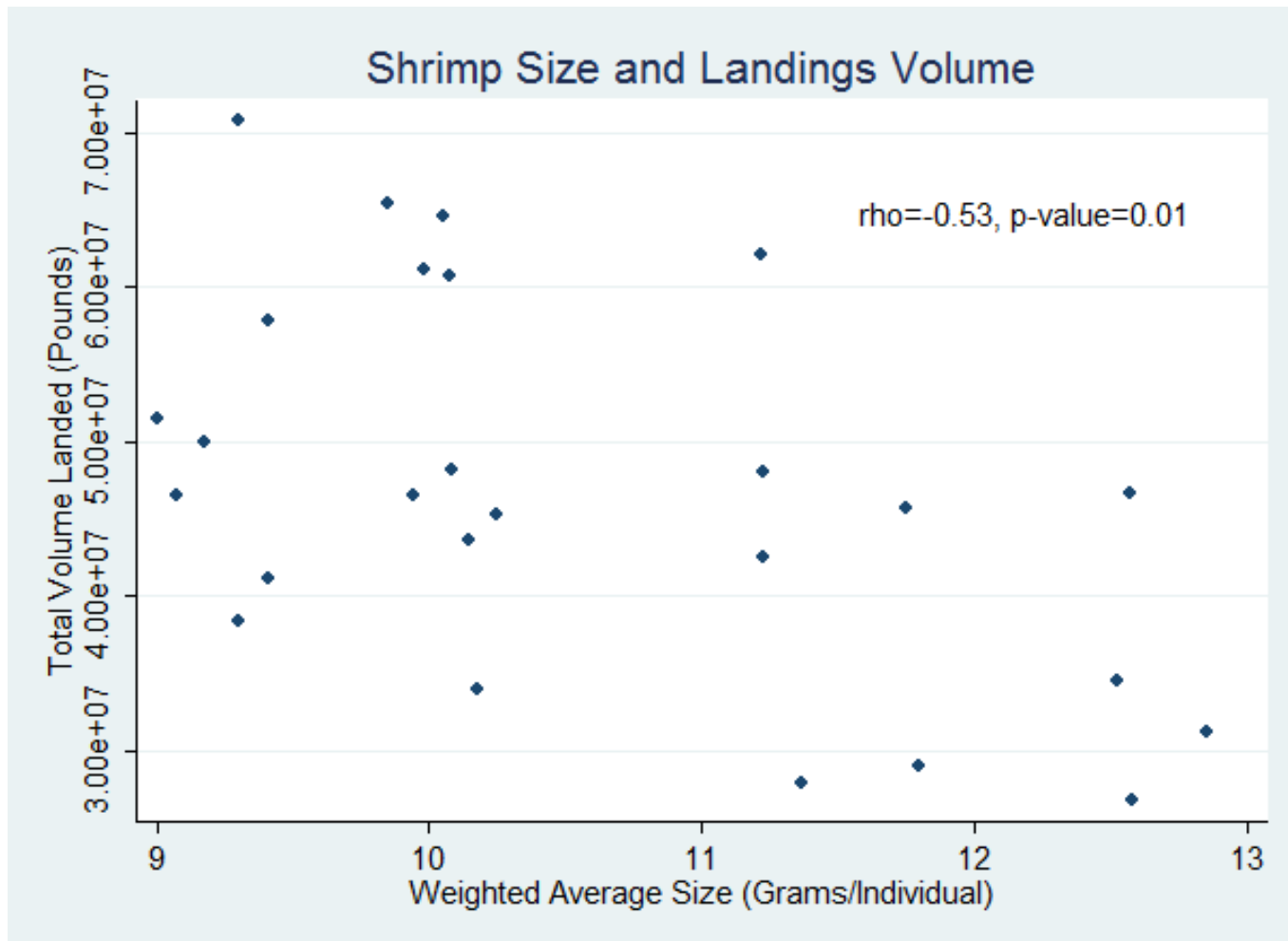
Detecting hypoxic effects from perfect data would be difficult

## Simulation Outcome 1

# Weighted shrimp size and total landings negatively correlated in simulations

- All correlations are negative and statistically significant (range  $\rho = -0.31$  to  $-0.67$ )
- Robust across hypoxic and counterfactual (non-hypoxic) cases
- Growth overfishing as key mechanism

# Robust Relationship Between Landings and Average Shrimp Size in Simulations Appears in the Empirical Data

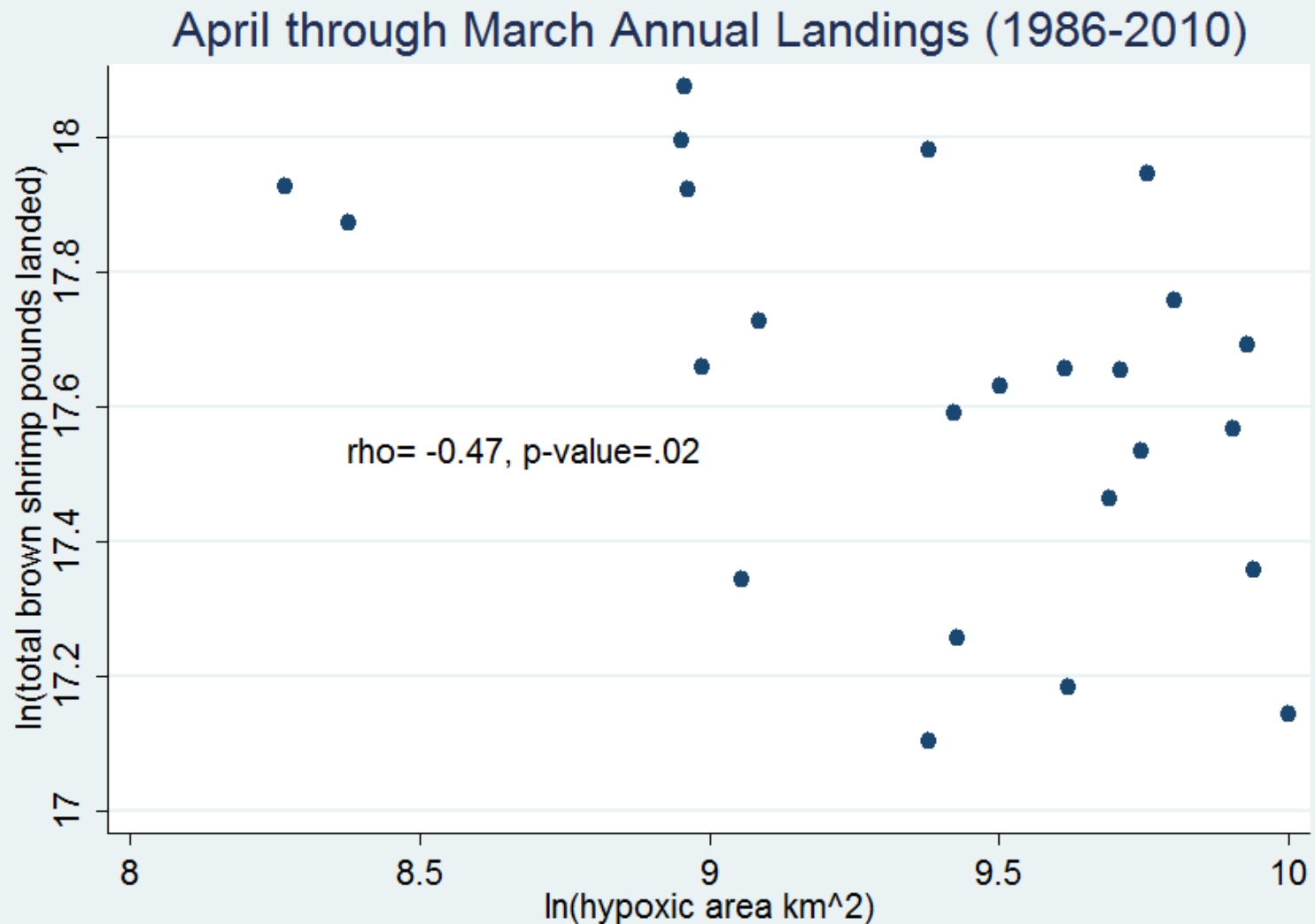


## Simulation Outcome 2

Total landings and hypoxic severity negatively correlated in simulations but weakly (thought experiment of hypoxic extent with no counterfactual)

| Sim #   | Hypoxia Simulations |              |        |              | Counterfactual Non-Hypoxic Simulations |              |        |          |
|---|---------------------|--------------|--------|--------------|--|--------------|--------|----------|
|   | Mortality           | Catchability | Growth | Combined     | Mortality                              | Catchability | Growth | Combined |
| 1   | <b>-0.35</b>        | 0.01         | -0.14  | <b>-0.31</b> | <i>-0.25</i>                           | -0.05        | -0.05  | -0.17    |
| 2   | -0.08               | 0.01         | -0.12  | -0.10        | 0.03                                   | -0.05        | -0.02  | 0.07     |
| 3   | -0.14               | 0.17         | -0.01  | <b>-0.34</b> | -0.04                                  | 0.11         | 0.08   | -0.17    |
| 4   | <b>-0.35</b>        | -0.16        | -0.23  | -0.10        | -0.21                                  | -0.21        | -0.11  | 0.04     |
| 5   | -0.09               | 0.16         | -0.05  | 0.03         | 0.03                                   | 0.10         | 0.04   | 0.22     |
| Bold means significant at 5% level, italics significant at 10% level. |                     |              |        |              |  |              |        |          |

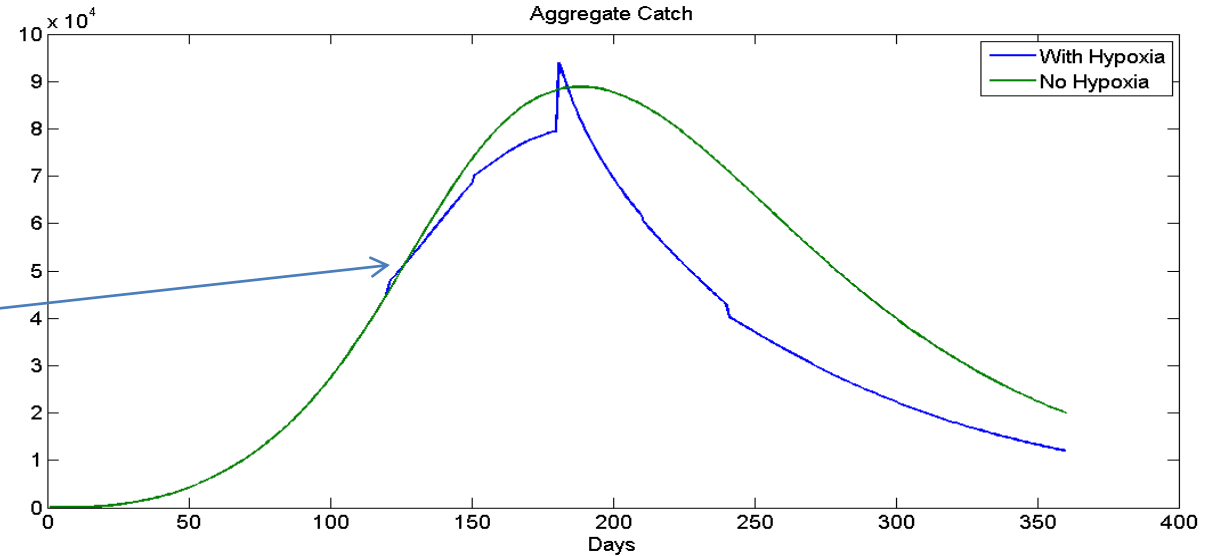
# Empirical annual total landings negatively correlated with hypoxia



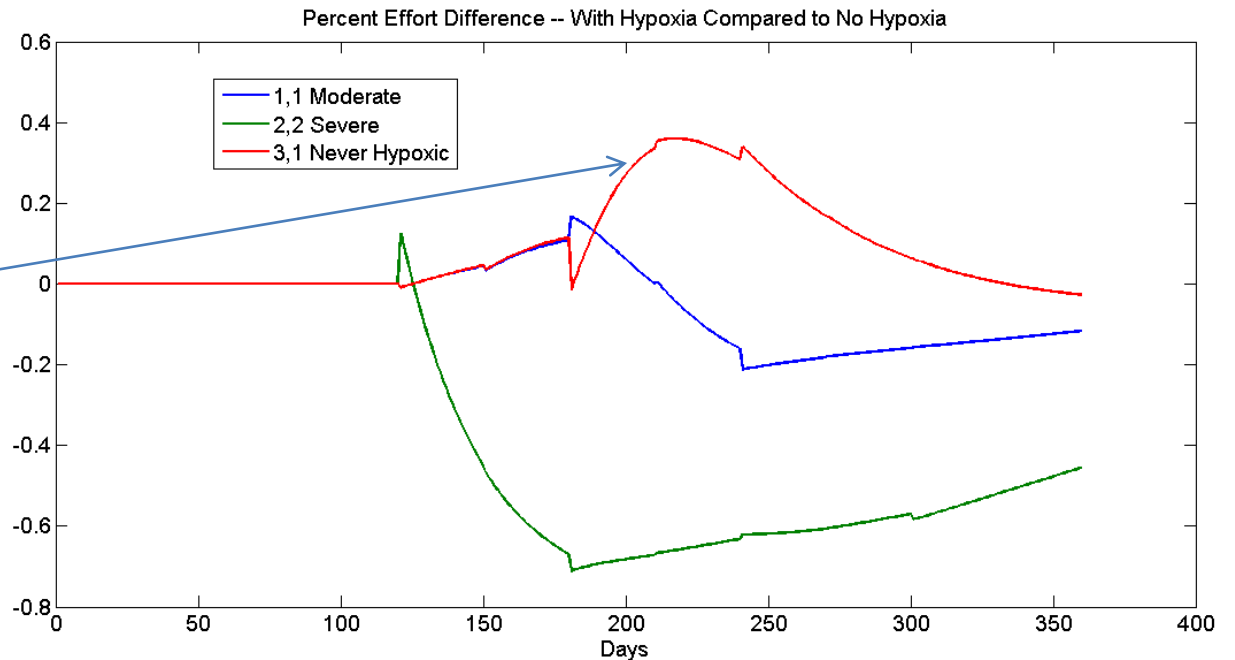
# Simulation Outcome 3

## Major roadblocks in detecting treatment effect!

Dynamic,  
Nonlinear,  
and more peaked

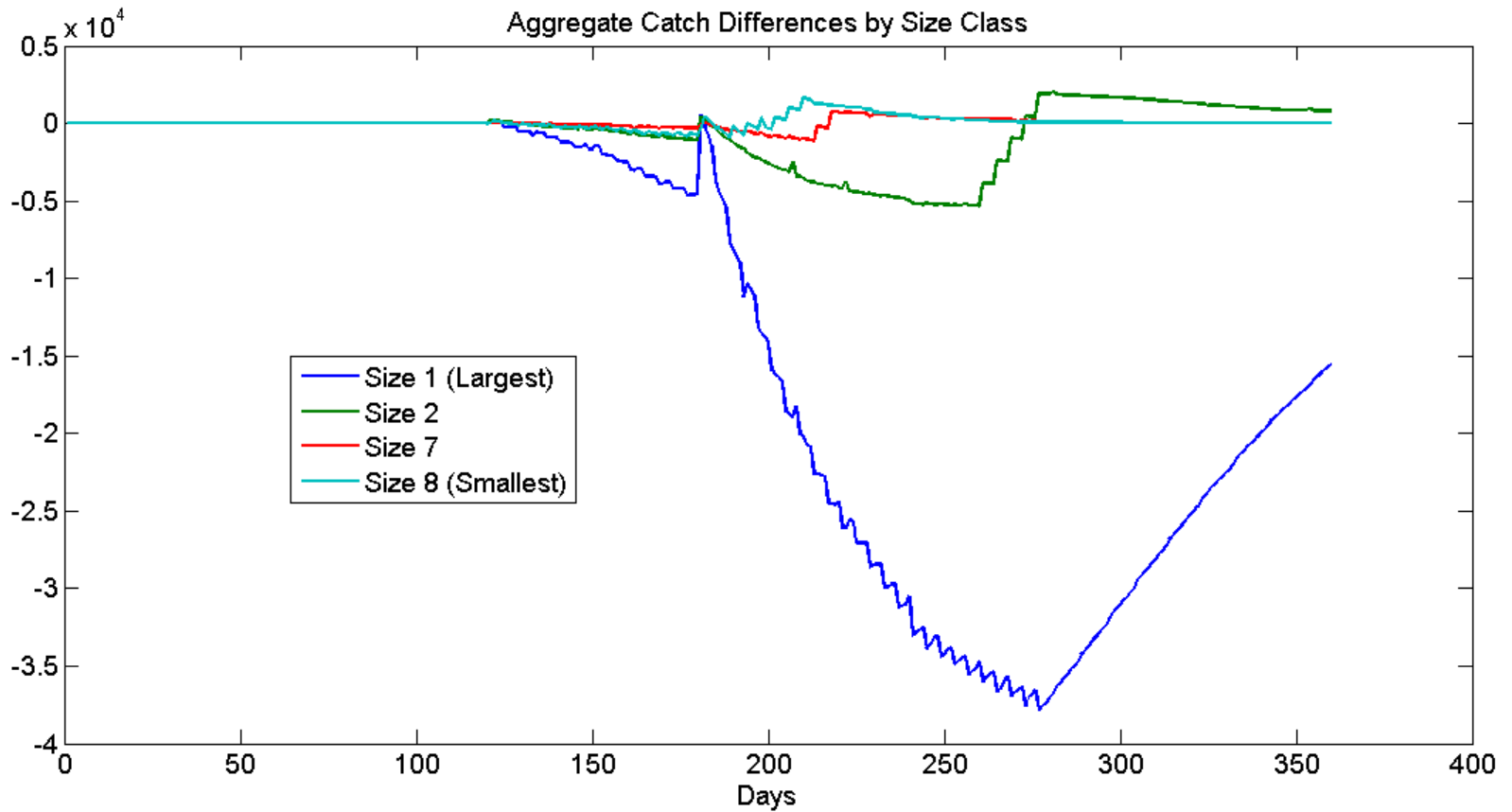


Contamination  
of the control



# Simulation Outcome 4

## Non-monotonic treatment effects in size-based catches





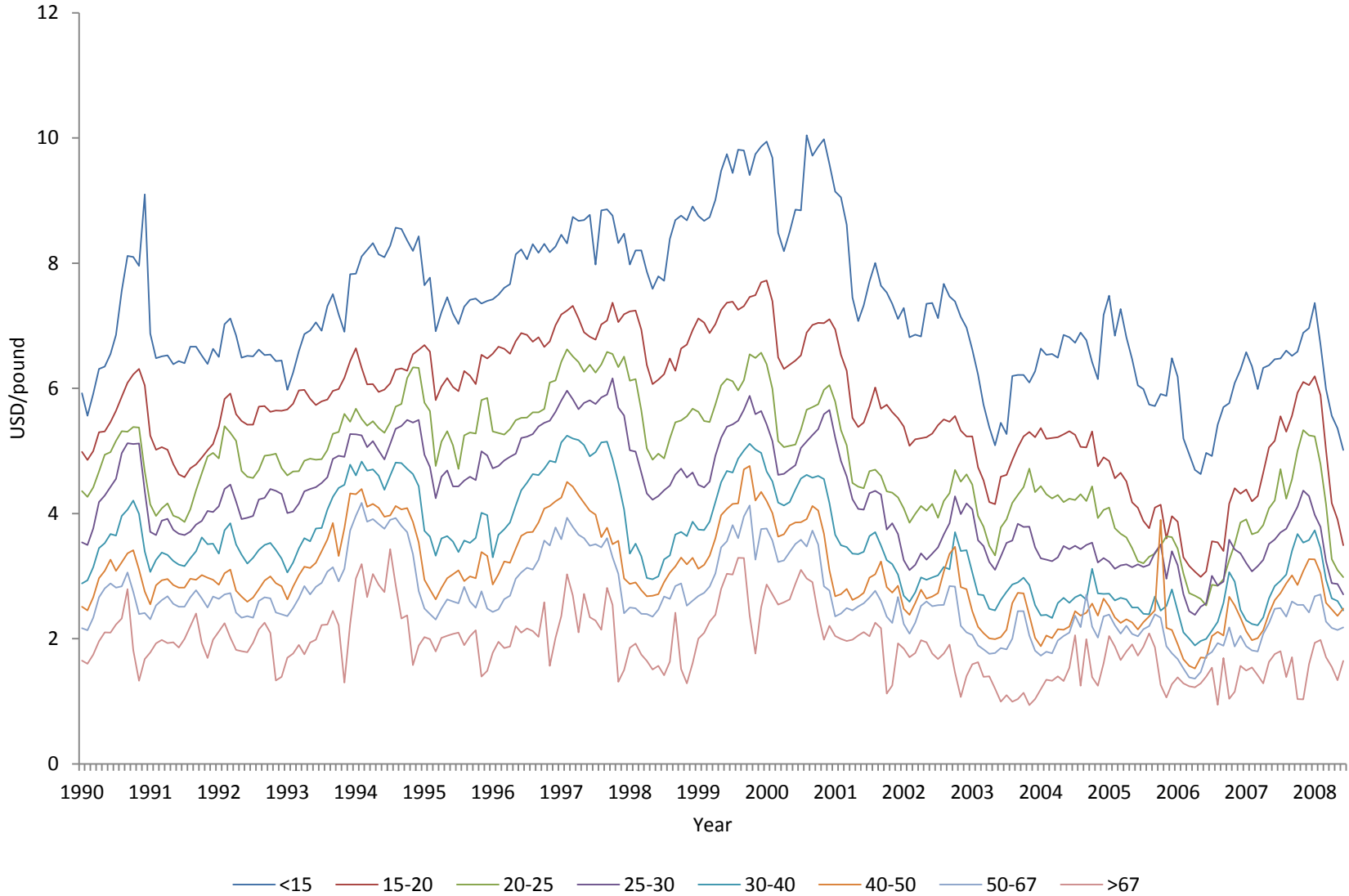
Aggregate-level data and bioeconomic simulations are generally consistent but highlight difficulty in finding effects of hypoxia on fisheries

**4. TIME SERIES ANALYSIS OF SHRIMP  
PRICES – LET THE MARKET REVEAL  
THE ECOLOGICAL DISTURBANCE**

# Brown Shrimp Price by Size Class (#/pound)

**Prices have stable long-run relationships**

(Asche, Bennear, Oglend, and Smith, Marine Resource Econ. 2012)

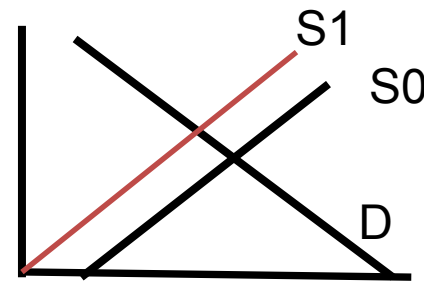
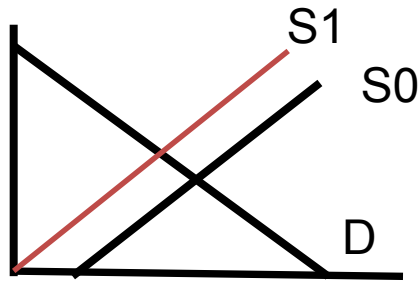


# Hypothesis: Hypoxic mechanisms change relative prices (deviate from long-run relationships)

Small Shrimp

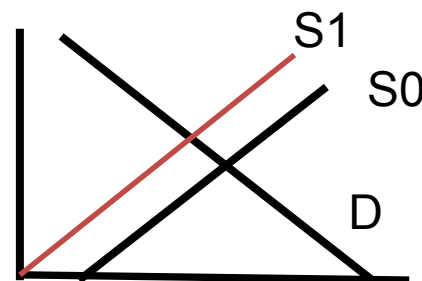
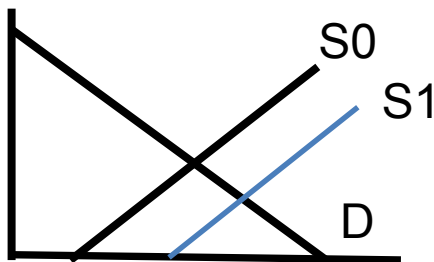
Large Shrimp

Ordinary  
Recruitment  
Shock



|           |   |
|-----------|---|
| $P_S$     | + |
| $P_L$     | + |
| $P_S/P_L$ | ? |

Hypoxia  
Shock



|           |   |
|-----------|---|
| $P_S$     | - |
| $P_L$     | + |
| $P_S/P_L$ | - |

Key assumption: markets determine what a meaningful supply shift is

# Hypoxia “causes” increase in relative price of large to small shrimp

| <b><i>B15-B3040</i></b>   | <b><i>COEF</i></b> | <b><i>STD</i></b> | <b><i>T-VAL</i></b> |
|---------------------------|--------------------|-------------------|---------------------|
| Interpolation 1           | 0.054              | 0.026             | 2.038               |
| Interpolation 2           | 0.014              | 0.018             | 0.824               |
| <b><i>B1520-B3040</i></b> |                    |                   |                     |
| Interpolation 1           | 0.073              | 0.026             | 2.765               |
| Interpolation 2           | 0.037              | 0.015             | 2.441               |
| <b><i>B2025-B3040</i></b> |                    |                   |                     |
| Interpolation 1           | 0.047              | 0.019             | 2.482               |
| Interpolation 2           | 0.046              | 0.011             | 4.355               |
| <b><i>B15-B4050</i></b>   |                    |                   |                     |
| Interpolation 1           | 0.067              | 0.031             | 2.159               |
| Interpolation 2           | 0.036              | 0.022             | 1.682               |
| <b><i>B1520-B4050</i></b> |                    |                   |                     |
| Interpolation 1           | 0.085              | 0.031             | 2.713               |
| Interpolation 2           | 0.058              | 0.020             | 2.901               |
| <b><i>B2025-B4050</i></b> |                    |                   |                     |
| Interpolation 1           | 0.058              | 0.026             | 2.194               |
| Interpolation 2           | 0.068              | 0.016             | 4.130               |
| <b><i>B15-B5060</i></b>   |                    |                   |                     |
| Interpolation 1           | 0.089              | 0.032             | 2.756               |
| Interpolation 2           | 0.088              | 0.021             | 4.233               |
| <b><i>B1520-B5060</i></b> |                    |                   |                     |
| Interpolation 1           | 0.105              | 0.037             | 2.849               |
| Interpolation 2           | 0.110              | 0.021             | 5.315               |
| <b><i>B2025-B5060</i></b> |                    |                   |                     |
| Interpolation 1           | 0.078              | 0.033             | 2.374               |
| Interpolation 2           | 0.119              | 0.019             | 6.251               |

Results robust to including fuel prices, sea surface temperature, and seasonal dummies!

# Future Work

- Refine spatial-dynamic bioeconomic simulation
- Build structural econometric model forced by simulation model (using Method of Moments) to estimate deep parameters
- Run parameterized structural model with hypoxia turned on/off to trace out economic effects