

# Quantifying and Comparing Fisher Decision-making Strategies Before and After the Deepwater Horizon Oil Spill



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# Objectives

- Background, fishery, and research objectives
- Panel dataset development
- Model results and Discussion
- Ongoing and future research



# Background

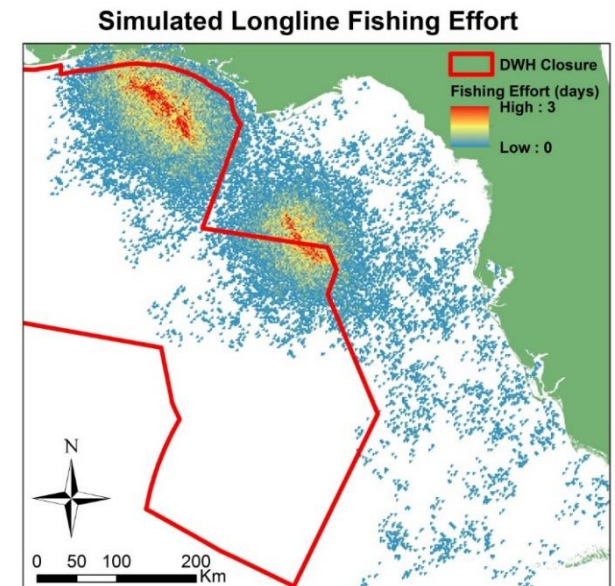
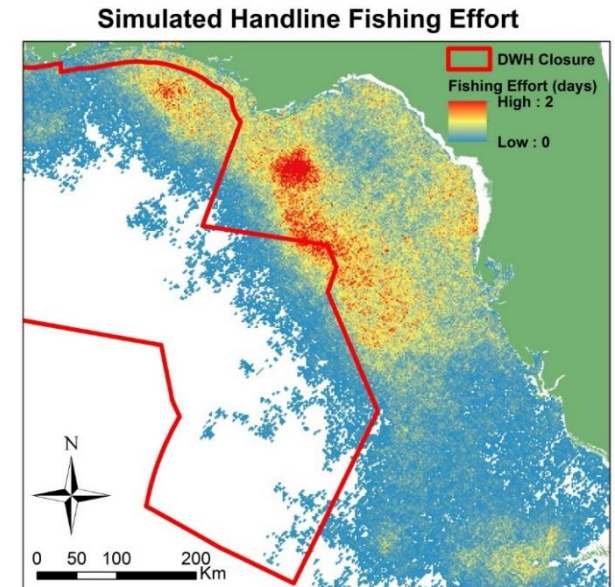
- DWH estimated to have cost the Gulf of Mexico's commercial fishing industry between \$94.7 million to \$1.6 billion and, from 740 to 9,315 jobs (U.S. Bureau of Ocean Energy Management).
- Large spatial closures excluded fishing from frequented fishing grounds.
- Fisheries dependent data collection also affected.





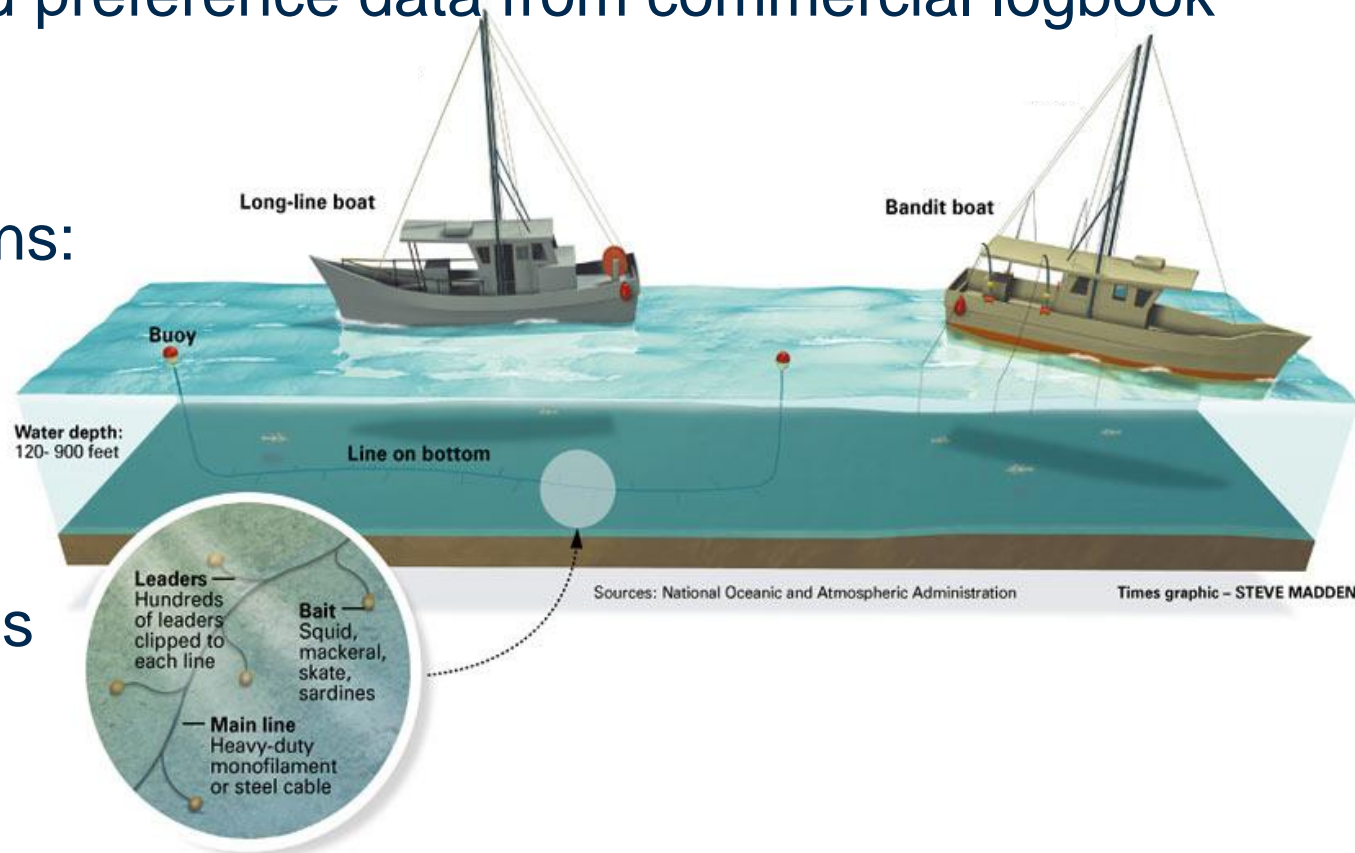
# Context

- Spatially explicit bioeconomic agent-based model under development.
- West Florida Shelf model (Saul 2012) estimated that during DWH: 18% of simulated handline effort and 65% of simulated longline effort occurred within closure area.
- Full model will (1) evaluate socioeconomic and fisheries population, stock assessment, and management affects of oil spill, and (2) consider alternative response scenarios to the spill to gain insight on best practices for the future.



# Study Objectives and Fleets

- Discrete choice models of fisher behavior: before DWH, after DWH, and once ITQs implemented.
- Uses revealed preference data from commercial logbook observations
- Three decisions:
  - Participation
  - Site choice
  - Return to port
- Nested models



# Context

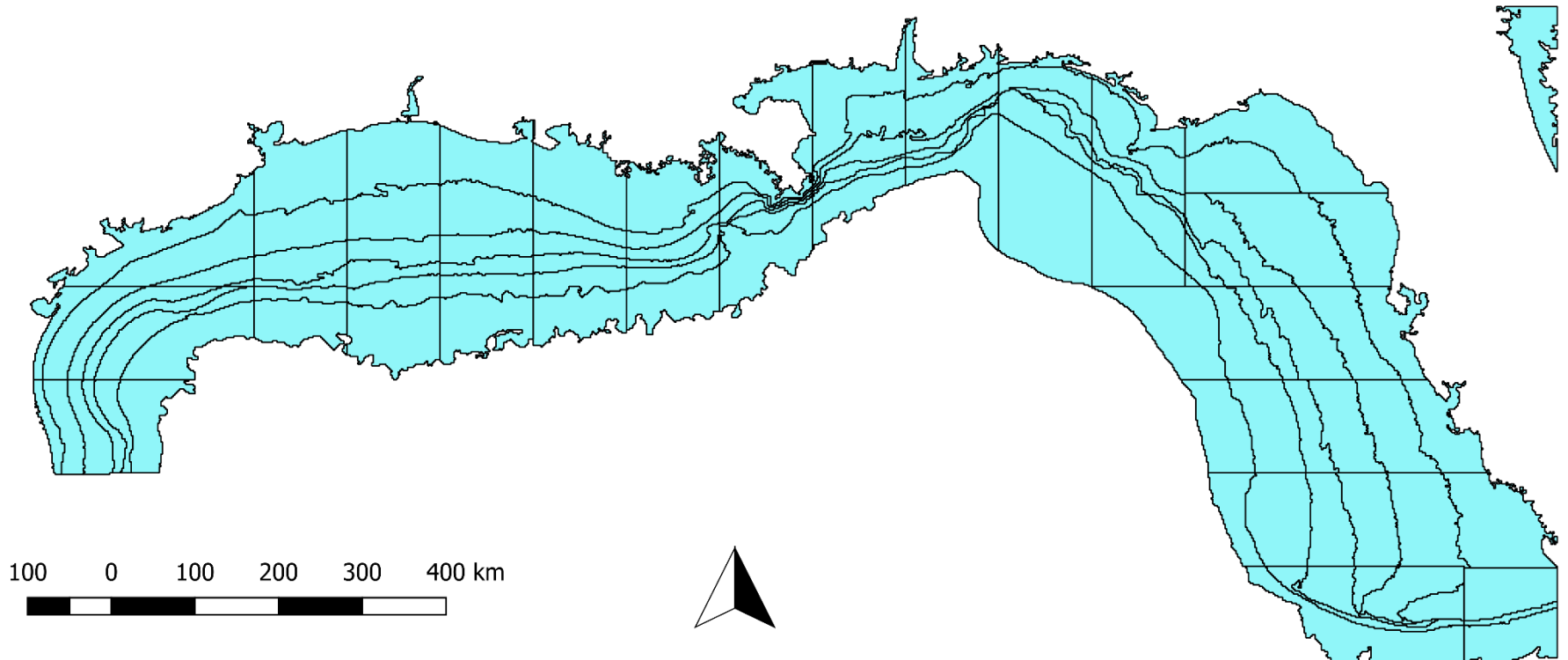
- Years 2005 and 2007 indicated:
  - The larger your boat, the less frequently you will take a trip.
  - Wind impacts handline boats but has minimal impact on longline boat site choice
  - An increase in fuel price reduces trip frequency, and alters where one decides to fish when they go.

(Saul et al. 2016. Modeling the decision making behavior of fishers in the reef fish fishery on the West Coast of Florida. *Human Dimensions of Wildlife* 21(6): 567-586).

Parameter	Estimate	Std. Error	t-value	Pr(> t )	Significance Category
DistanceKm	-0.0011	0.0014	-0.7890	0.4301	
ExpCpueRG	0.0029	0.0041	0.6994	0.4843	
ExpCpueGG	-0.0004	0.0007	-0.5725	0.5670	
ExpCpueRS	-0.0098	0.0136	-0.7228	0.4698	
ExpCpueMS	0.0004	0.0005	0.7384	0.4603	
ExpCpueVS	0.0008	0.0108	0.0778	0.9380	
Length.VOU:8	-0.0289	0.0097	-2.9782	0.0029	**
Length.VOU:9	-0.0238	0.0061	-3.8814	0.0001	***
Length.VOU:10	-0.0232	0.0062	-3.7659	0.0002	***
Length.VOU:13	-0.0251	0.0072	-3.4974	0.0005	***
Length.VOU:16	-0.0223	0.0058	-3.8473	0.0001	***
Length.VOU:17	-0.0276	0.0079	-3.5135	0.0004	***
Length.VOU:20	-0.0190	0.0087	-2.1994	0.0279	*
Length.VOU:21	-0.0267	0.0066	-4.0400	0.0001	***
Length.VOU:24	-0.0214	0.0069	-3.0998	0.0019	**
Length.VOU:26	-0.0290	0.0087	-3.3329	0.0009	***
Length.VOU:30	-0.0191	0.0092	-2.0695	0.0385	*
WindSpeedKnots:8	0.0029	0.0157	0.1835	0.8544	
WindSpeedKnots:9	0.0162	0.0122	1.3278	0.1842	
WindSpeedKnots:10	0.0111	0.0096	1.1486	0.2507	
WindSpeedKnots:13	0.0113	0.0105	1.0829	0.2788	
WindSpeedKnots:16	0.0127	0.0093	1.3671	0.1716	
WindSpeedKnots:17	0.0082	0.0096	0.8543	0.3929	
WindSpeedKnots:20	0.0110	0.0088	1.2497	0.2114	
WindSpeedKnots:21	0.0106	0.0087	1.2149	0.2244	
WindSpeedKnots:24	0.0061	0.0102	0.5916	0.5541	
WindSpeedKnots:26	0.0080	0.0092	0.8637	0.3877	
WindSpeedKnots:30	-0.0340	0.0579	-0.5883	0.5563	
RealDieselPrice:8	-0.7011	0.1829	-3.8332	0.0001	***
RealDieselPrice:9	-0.8248	0.1085	-7.6008	<0.0001	***
RealDieselPrice:10	-0.7839	0.1135	-6.9093	<0.0001	***
RealDieselPrice:13	-0.8276	0.1294	-6.3953	<0.0001	***
RealDieselPrice:16	-0.8556	0.1095	-7.8152	<0.0001	***
RealDieselPrice:17	-0.7585	0.1287	-5.8914	<0.0001	***
RealDieselPrice:20	-0.9009	0.1539	-5.8530	<0.0001	***
RealDieselPrice:21	-0.8100	0.0962	-8.4171	<0.0001	***
RealDieselPrice:24	-0.8597	0.1230	-6.9921	<0.0001	***
RealDieselPrice:26	-0.7712	0.1122	-6.8750	<0.0001	***
RealDieselPrice:30	-0.7293	0.1473	-4.9500	<0.0001	***
iv	0.0899	0.1146	0.7840	0.4330	

# Spatial Partitioning for Site Choice

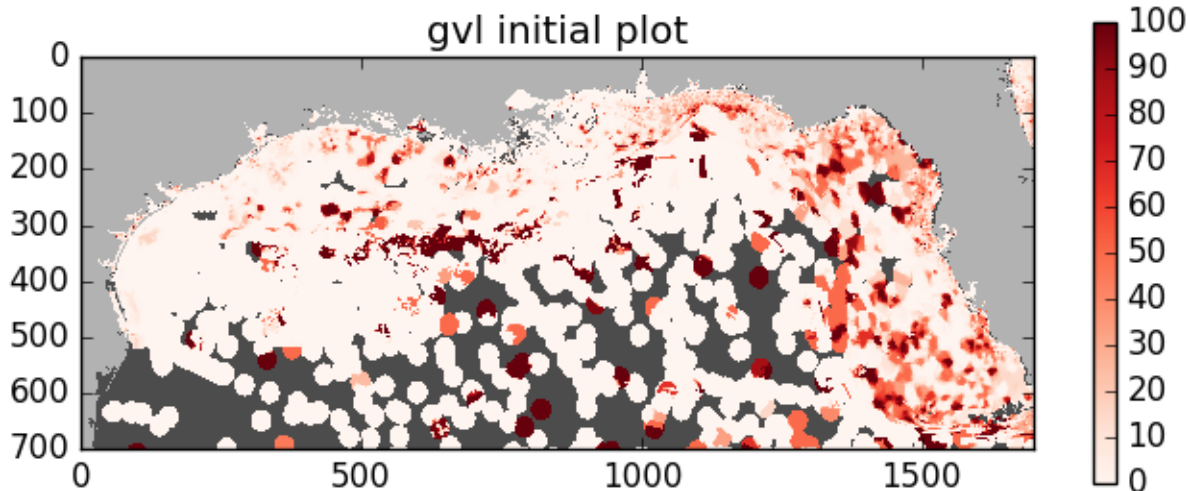
## Large Scale Spatial Partitioning of Gulf of Mexico



# Panel Dataset Construction

- Logbook data
- Habitat (dbSEABED bottom composition)
- Fuel price data (CPI adjusted)
- Wind speed, NOAA buoy data
- Fish price, landings data (CPI adjusted)
- Vessel characteristics, vessel registration
- Fish house location information

Species Name	Code	Gutted-lbs	Whole-lbs	Gear	Area	Depth
Amberjack-Great	1812	#	#			'
Amberjack-Lesser	1815	#	#			'
Almaco	1810	#	#			'
Banded Rudder	1817	#	#			'
Crevaille	0870	#	#			'
Cobia	0570	#	#			'
Dolphin Fish	1050	#	#			'
Black	1422	#	#			'
Gag	1423	#	#			'
Warsaw	4740	#	#			'
Red	1416	#	#			'
Scamp	1424	#	#			'
Snowy	1414	#	#			'
Yellowedge	1415	#	#			'
Yellowfin	1426	#	#			'



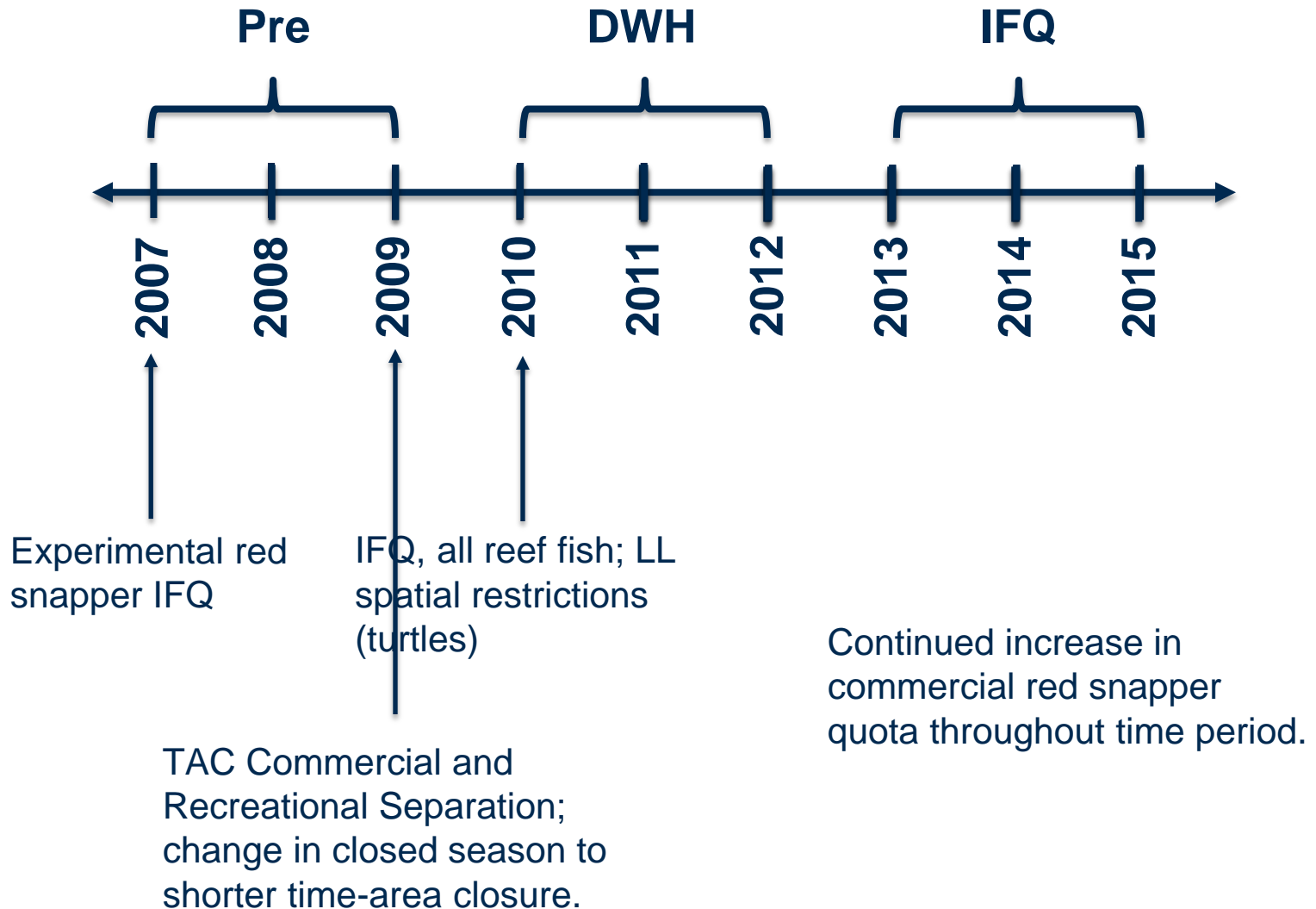


# Model Development: Factors Considered

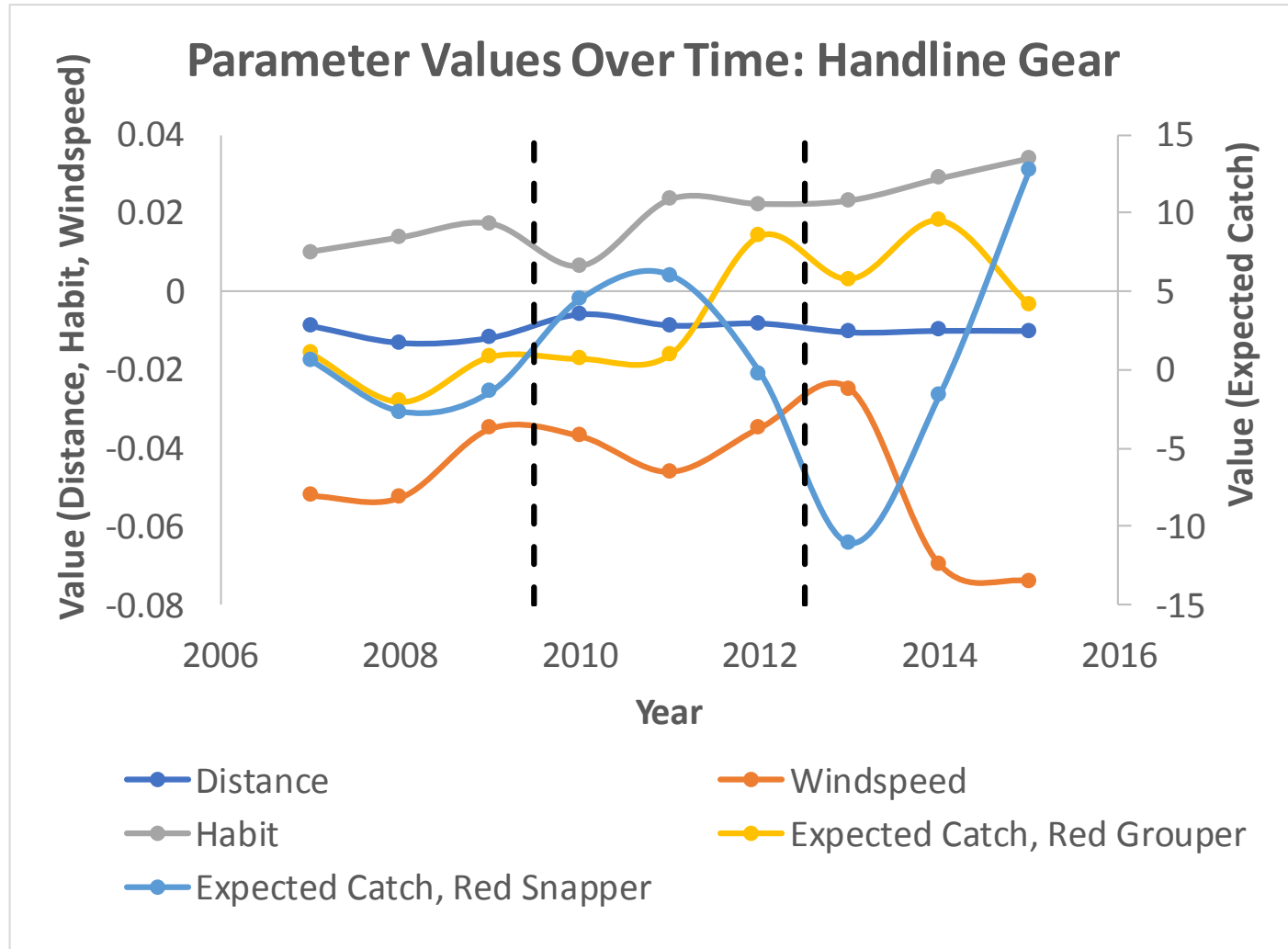
- Participation decision tested: wind speed, vessel length, fuel price, days since last trip, day of the week, fish prices, fuel price
- Site choice decision tested: distance, windspeed, habitat composition, fuel price, fish price, expected catch, habit
- Return decision tested: ratio catch to fish hold size, wind speed, fuel price, day of the week, vessel length, fish prices



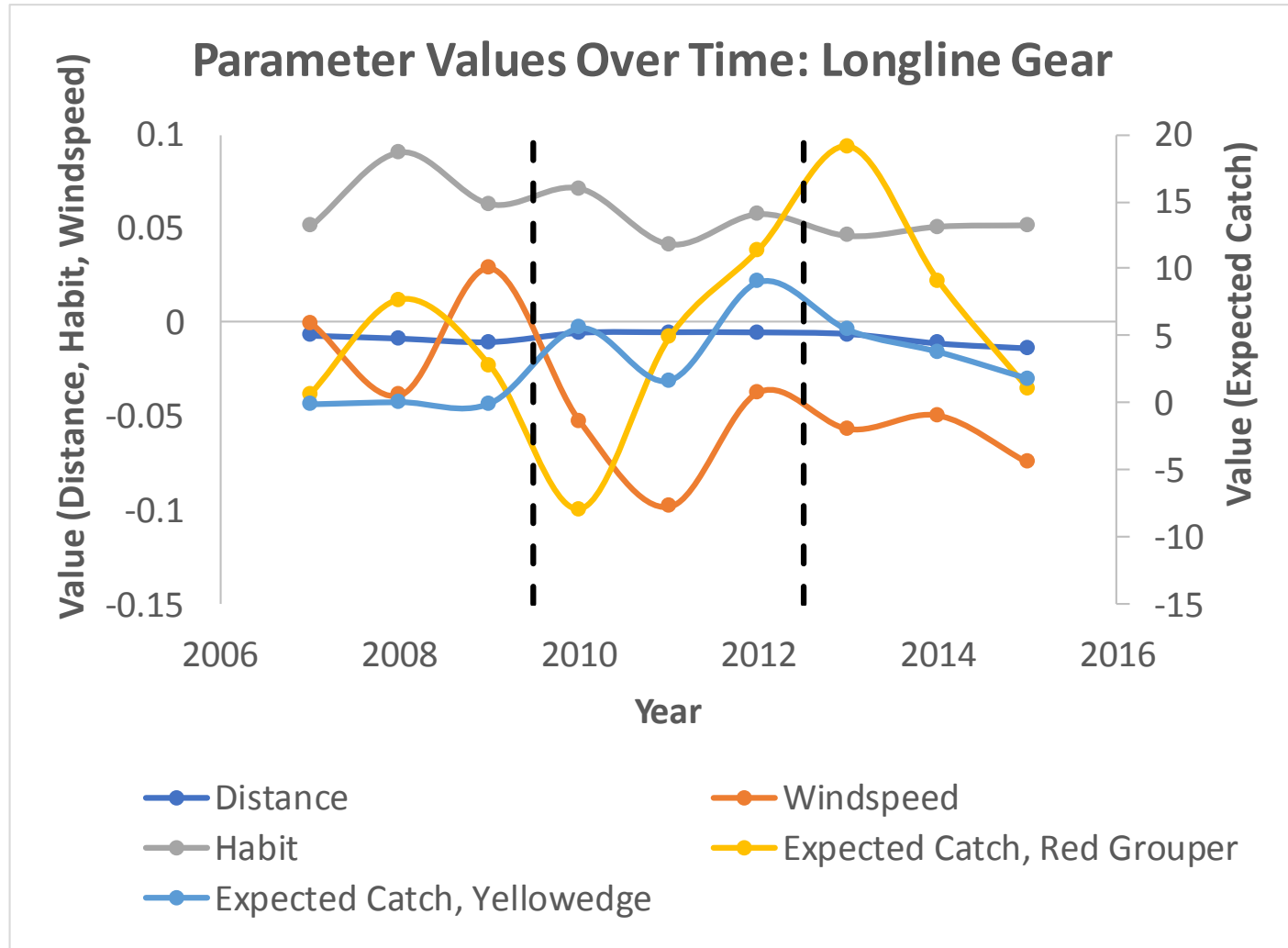
# Model Development: Time Blocks



# Site Choice: Non-alternative Specific Parameters



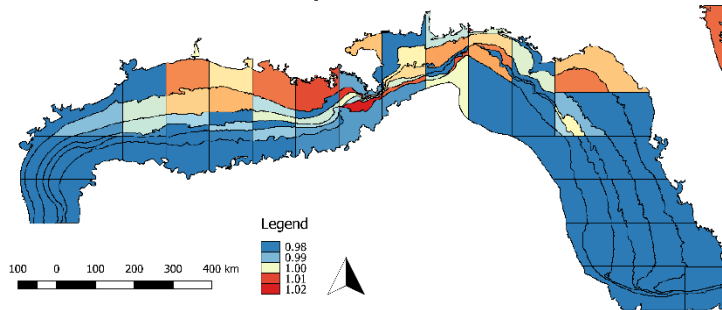
# Site Choice: Non-alternative Specific Parameters



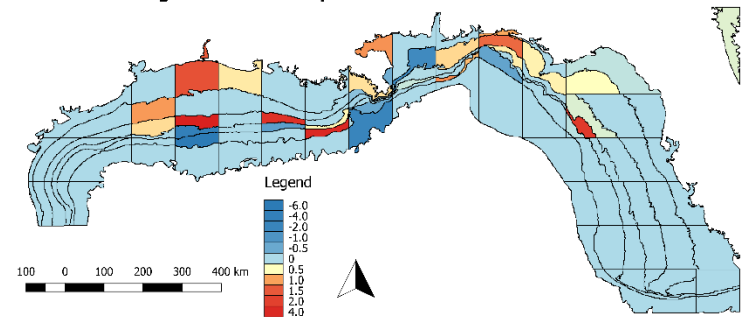


# Site Choice: Alternative Specific Fuel Price

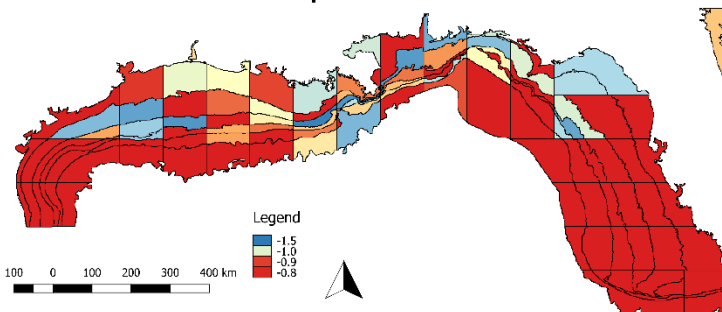
Handline Fuel Price Spatial Parameters: 2007-2009



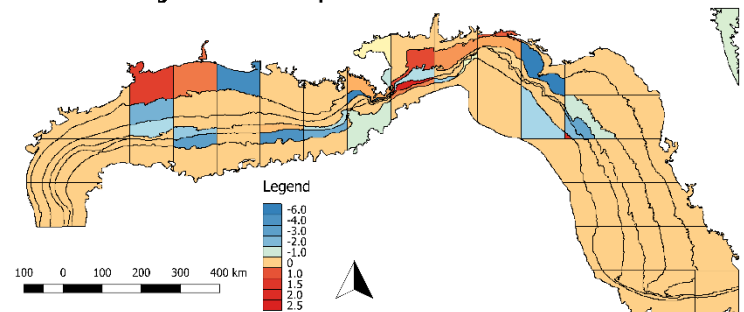
Longline Fuel Price Spatial Parameters: 2007-2009



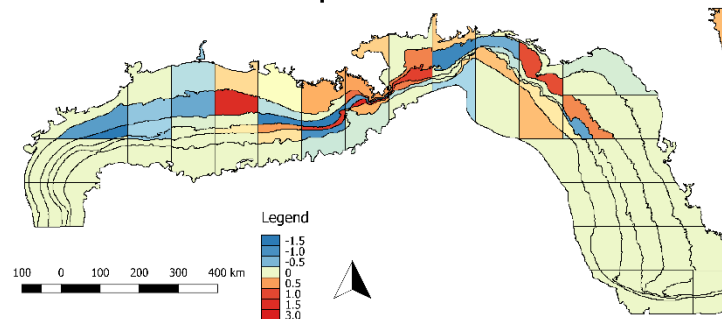
Handline Fuel Price Spatial Parameters: 2010-2012



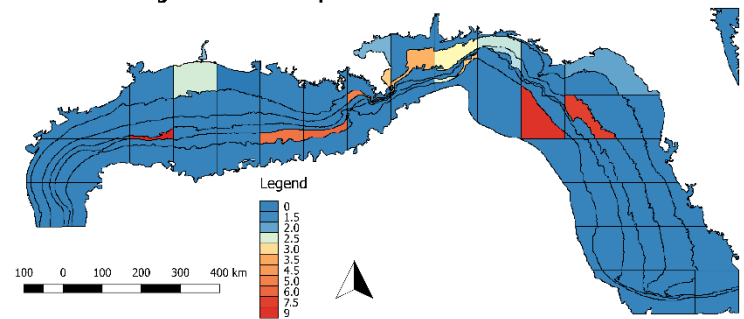
Longline Fuel Price Spatial Parameters: 2010-2012



Handline Fuel Price Spatial Parameters: 2013-2015



Longline Fuel Price Spatial Parameters: 2013-2015



# Nested Models

The screenshot displays an RStudio interface with a script editor and a console. The script editor shows R code for fitting a nested logit model. The console shows the execution of the code, including an error message: "Error: cannot allocate vector of size 83.4 Gb". A Windows Task Manager window is overlaid on the RStudio interface, showing system performance metrics.

```
gc()
fwrite(PanelData_HL_Pre, paste(PATH_in, "PanelData_HL_Pre.csv", sep="/"), sep=",", col.names=TRUE, row.names=FALSE)
gc()
PanelData_HL_Pre = fread(paste(PATH_in, "PanelData_HL_Pre.csv", sep="/"), sep=",", header=TRUE)
PanelData_HL_Pre_mlogit = mlogit.data(PanelData_HL_Pre, choice="CHOICE", shape="long", alt.var="NewArea", chid.var="choiceOccasion")
yes_fish_areas_string = as.character(sort(unique(PanelData_HL_Pre$NewArea)))
yes_fish_areas_string = subset(yes_fish_areas_string, yes_fish_areas_string!="0")
gc()
PanelData_HL_Pre_Nested_MODEL = mlogit(CHOICE ~ Distance + Windspeed + habit3 + DaysSinceLastTrip + Weekend + ExpCatch_HL_RG +
ExpCatch_HL_RS | FuelPrice, data=PanelData_HL_Pre_mlogit, na.action=na.pass, nests=list(no_fish=c("0"), yes_fish=yes_fish_areas_string,
un.nest.el=TRUE, print.level=1)
```

```
> source(.trPaths[5], echo=TRUE, max.deparse.length=150)

> PanelData_HL_Pre_Nested_MODEL = mlogit(CHOICE ~ Distance + Windspeed + habit3 +
+ ExpCatch_HL_RS | .... [TRUNCATED]

> summary(PanelData_HL_Pre_Nested_MODEL)
Error in summary(PanelData_HL_Pre_Nested_MODEL) :
  object 'PanelData_HL_Pre_Nested_MODEL' not found
> PanelData_HL_Pre_Nested_MODEL = mlogit(CHOICE ~ Distance + Windspeed + habit3 +
Error: cannot allocate vector of size 83.4 Gb
> |
```

**Task Manager Performance Tab:**

- CPU:** 1% 2.85 GHz
- Memory:** 115/128 GB (90%)
- Disk 0 (C:):** 0%
- Disk 1 (E:):** 0%
- Disk 2 (F:):** 0%
- Ethernet:** Not connected

**Memory Usage Graph:** Shows memory usage over 60 seconds, peaking at 115 GB.

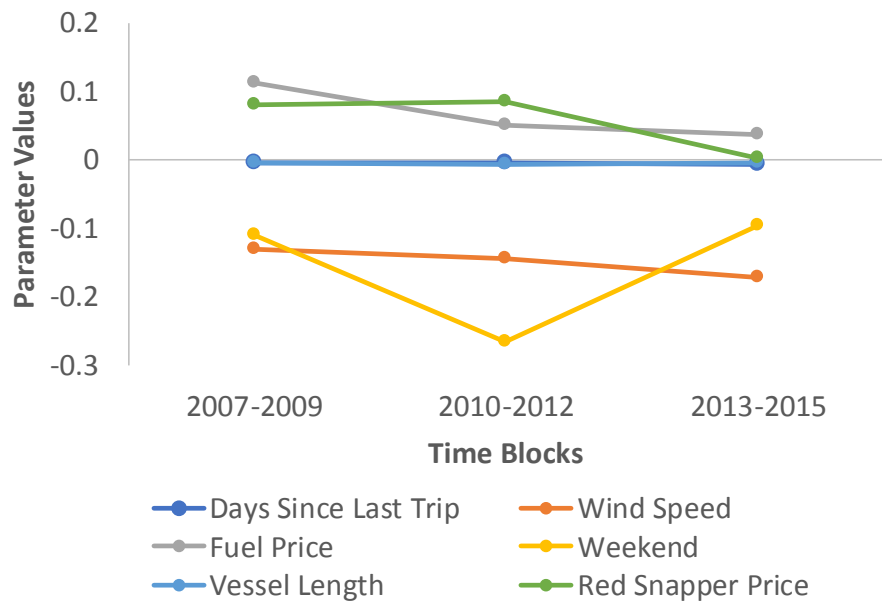
**Memory Composition:**

Category	Value
In use (Compressed)	114 GB (107 MB)
Available	13.4 GB
Speed	2400 ...
Slots used	4 of 8
Form factor	RIMM
Hardware reserved	72.6

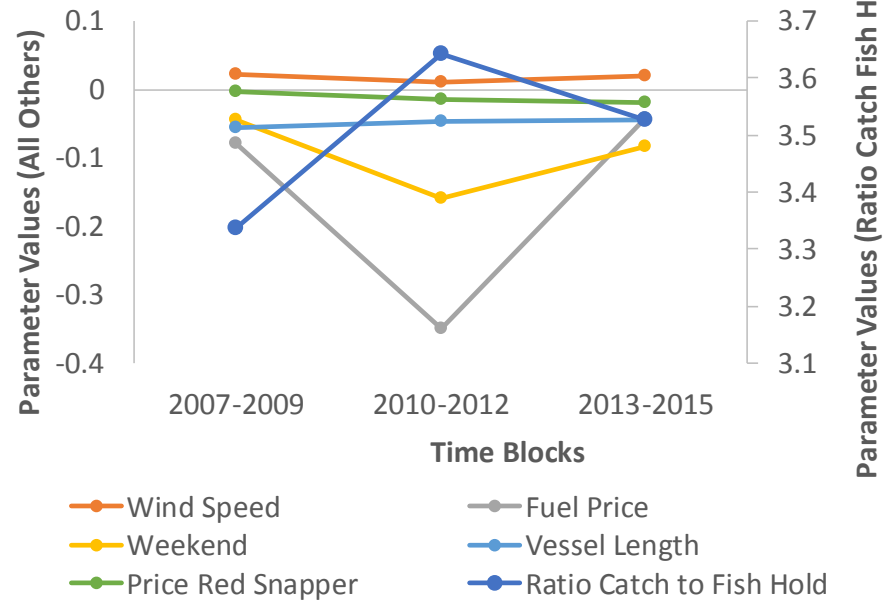
**System Information:**

- Wi-Fi: 119/147 GB 12.1 GB
- Time: 12:03 PM 7/7/2018

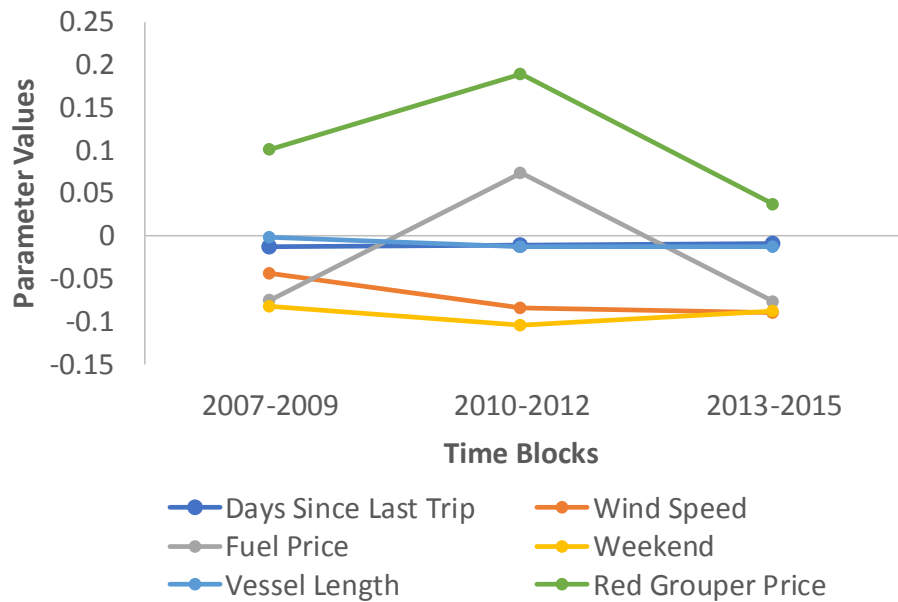
### Participation Decision: Handline



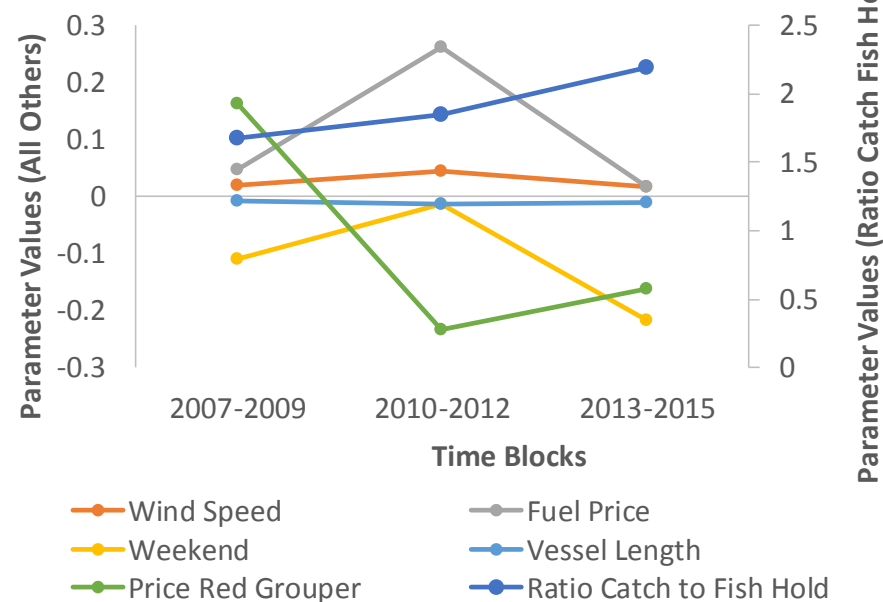
### Return Decision: Handline



### Participation Decision: Longline



### Return Decision: Longline



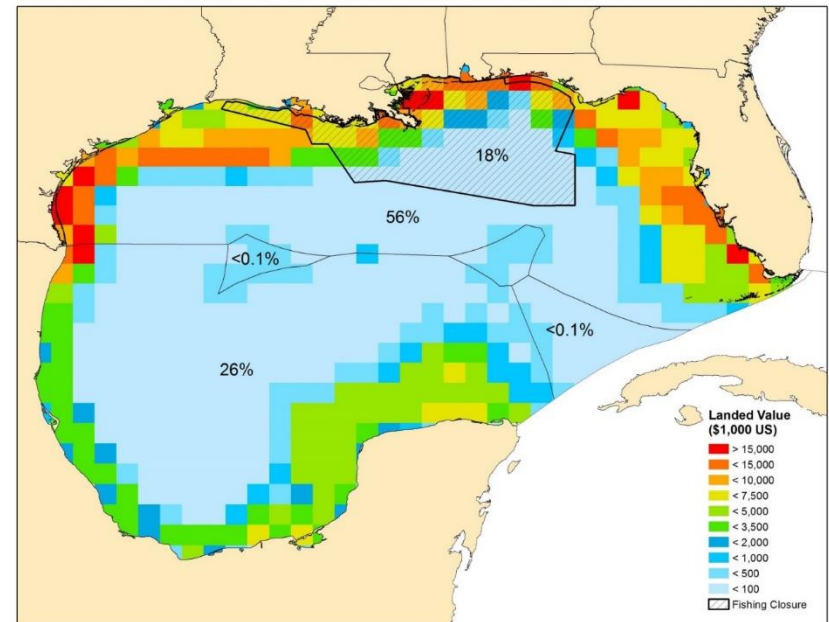
# Summary

- Could not tease out much of a signal in fisher behavioral changes around the time of the oil spill.
  - This could be due in part to other events occurring in the fishery
  - No significant behavioral change occurred, or it occurred for such a short time.
- Habitat parameters were tried in each site choice model but did not have sufficient contrast against the data to fit (info is very coarse).
- Distance, habit, ratio catch to fish hold, and days since last trip all showed expected signs and were consistent across time blocks.
- Changes in wind speed sign and magnitude since a change toward being more selective about when and where one fishes.
- Expected catch of indicator species increasing may signal that people were becoming more selective (i.e. showing more preference for those sites with known higher abundances) when choosing a place to fish.



# Future Research

- Split the GOM into regions
- Survey commercial fishers along the Gulf Coast
- Fit nested multinomial models
- Does fishery-dependent data contain a biased due to changes in fisher behavior in response to DWH?
- Effect of oil pollution on the survival of adult fish, recruitment (larval fitness and survival), and how this affects fishing.
- Consider alternative response scenarios to the spill with respect to fisheries.



Source: *The Sea Around Us Project*, University of British Columbia

# Acknowledgements

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