# Marine-life Data & Analysis







#### Patrick N. Halpin

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Northeast Regional Ocean Council Public Webinar August 27, 2014















# Overview

- Team review
- Timeline review
- Expert working groups
  - Data acquisitions
  - Data product options

# Marine-life Data & Analysis Team

- Marine Geospatial Ecology Lab Duke University
  Pat Halpin, Jason Roberts, Corrie Curtice, Jesse Cleary
- NOAA NCCOS
  - Brian Kinlan (Co-I), Arliss Winship
- NOAA NMFS/NEFSC EcoAP
  - Mike Fogarty (Co-I), Charles Peretti
- Loyola University
  - Earvin Balderama

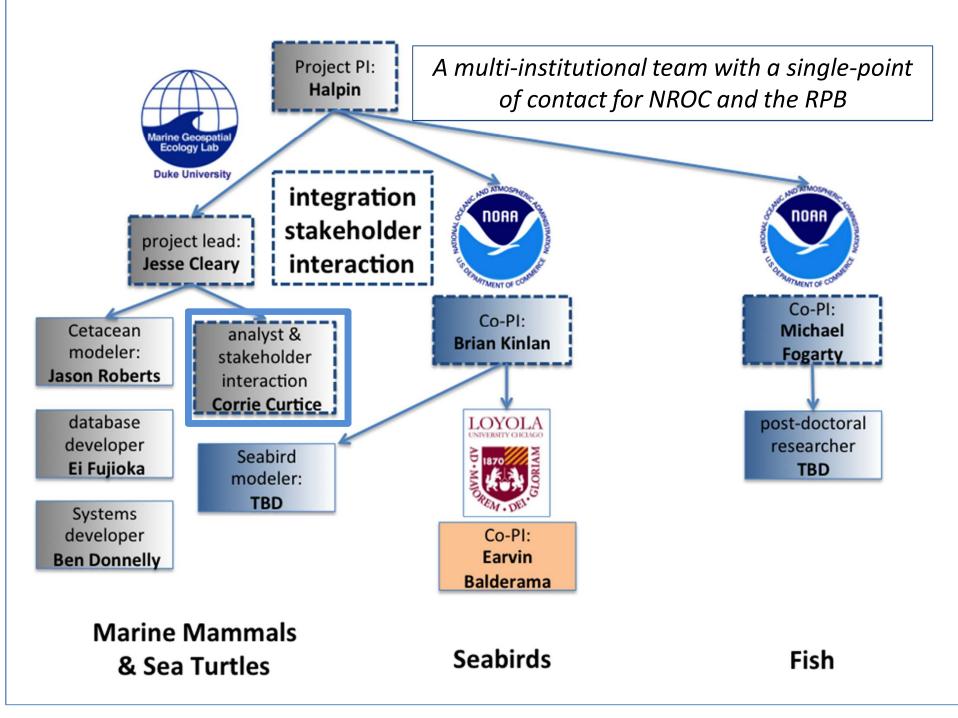




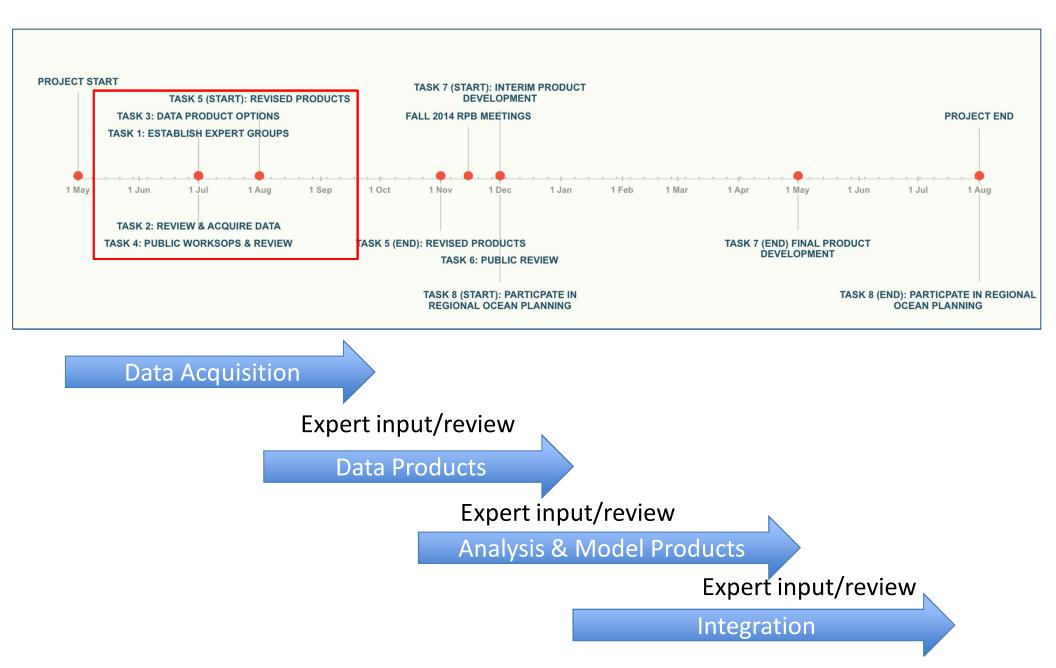


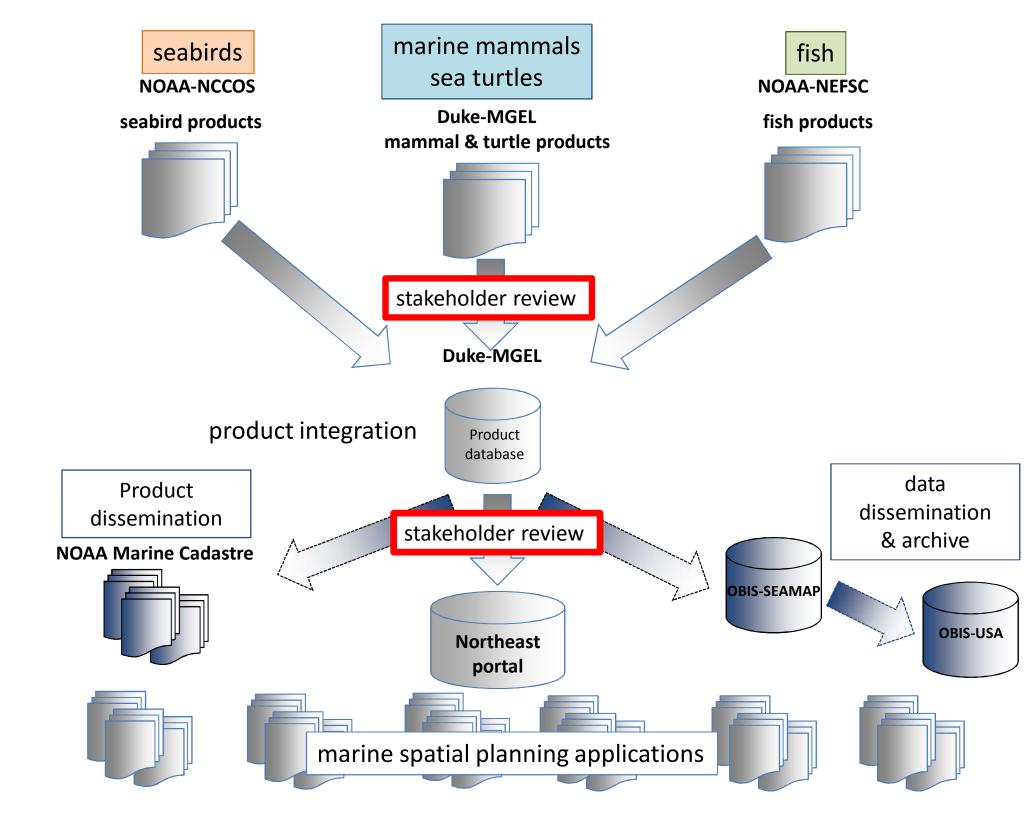


#### Project organization chart



# **Project timeline**





# Questions?

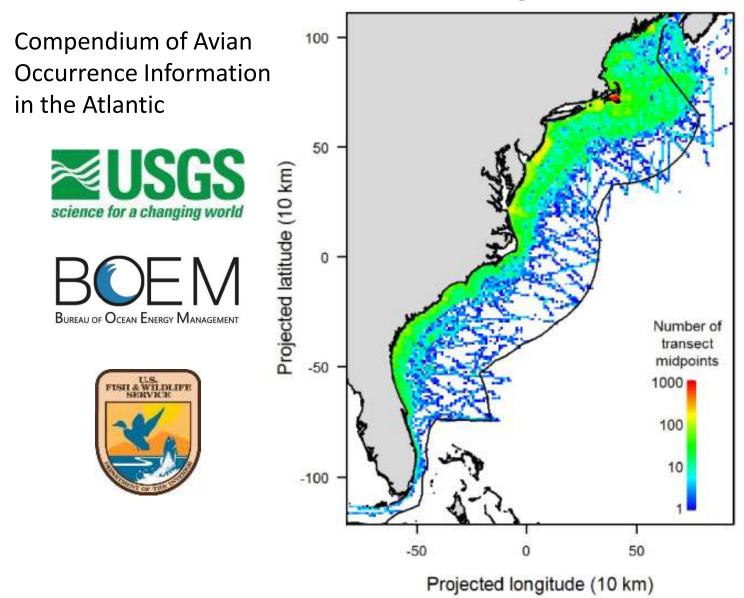
# Avian Working Group 8-1-2014 discussion topics

- How were season definitions decided?
- How is prioritization of species decided?
  - Species with enough observations will all be modeled
  - Species with too few observations need to be assessed for modeling potential
- How could species be grouped, ie: terns?
- How can models be combined, pre- or post- model
- Nearshore vs. at sea species, models
- Post processing options,

ie: hot spots, diversity spots



# At-Sea Avian Survey Effort Summary, as of Aug 1, 2014



J.

Figure 2. Map of survey effort (number of transect midpoints per 10-km square) across all datasets. The black line indicates the boundary of the Exclusive Economic Zone.

#### Species Table with Transect Segment Counts from all Atlantic At-Sea Data

Table. List of species and number of sightings in each season. For each season, only species with >= 100 sightings would normally be modelled. Number of sightings includes incomplete records (missing predictor data) that would be excluded from the analysis.

Species code Common r   razo Razorbill   dove Dovekie   blgu Black guillen   atpu Atlantic puffi   comu Common mu   lesc Lesser scaup   ltdu Long-tailed d   blsc Black scoter   wwsc White-winger   susc Surf scoter   rbme merganser	Alca torda Alle alle oot Cepphus grylle n Fratercula arcu ne Uria aalge Aythya affinis	Alcidae Alcidae Alcidae	3597 3597 1776 203 855 279	856 283 17 220	358 53 111	179 418	1904	gbòg lagu	Great black-backed gull Longhing gull Black-legged	Laruz marinuz Leucophaeuz atricilla	Laridae Laridae	16053 3726	3411 696	3347 1428	5449 1399	3846
dove Dovekie blgu Black guillen atpu Atlantic puffi comu Common mu lesc Lesser scaup ltdu Long-tailed d blsc Black scoter wwsc White-winge susc Surf scoter Red-breasted	Alle alle Not Cepphus grylle n Fratercula arcu ne Uria aalge Aythya affinis	Alcidae Alcidae ica Alcidae Alcidae	3597 1776 203 855	856 283 17	358 53	418	1904	18		Leucophoeus atricilla	Laridae	3726	696	1428	1399	- 3/5
dove Dovekie blgu Black guillen atpu Atlantic puffi comu Common mu lesc Lesser scaup ltdu Long-tailed d blsc Black scoter wwsc White-winge susc Surf scoter Red-breasted	Alle alle Not Cepphus grylle n Fratercula arcu ne Uria aalge Aythya affinis	Alcidae Alcidae ica Alcidae Alcidae	1776 203 855	283 17	53	418			Black-legend							200
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atpu Atlantic puffi comu Common mu lesc Lesser scaup ltdu Long-tailed d blsc Black scoter wwsc White-winge susc Surf scoter Red-breasted	n Fratercula arci ne Uria aalge Aythya affinis	ica Alcidae Alcidae	855		111		a se	blks								
comu Common mu lesc Lesser scaup ltdu Long-tailed d blsc Black scoter wwsc White-winge susc Surf scoter Red-breasted	re Uria aalge Aythya affinis	Alcidae	19	220		15	60	brpe	Brown pelican	Pelecanuz occidentaliz	Pelecznidze	513	104	167	100	143
lesc Lesser scaup ltdu Long-tailed d blsc Black scoter wwsc White-winger susc Surf scoter Red-breasted	Aythya affinis		279	220	273	95	267	deco	Double-crested cormorant	Phalacrocorax awritus	Phalacrocoracidae	906	131	230	237	30
ltdu Long-tailed d blsc Black scoter wwsc White-winge susc Surf scoter Red-breasted		Anatidae	1994 S	87	41	12	139	hogr	Homed grebe	Podiceps auritus	Podicipedidae	186	33	16	31	106
blsc Black scoter wwsc White-winge susc Surf scoter Red-breasted	uck Clangula hyem		103	0	0	0	103	cosh	Cery's shearwater	Calonectris diomedea	Procellanidae	4368	135	2658	1549	26
wwsc White-winge susc Surf scoter Red-breasted		alis Anatidae	7634	1581	782	1317	3954	nofu	Northern fulmar	Fulmaruz glacializ	Procellanidae	6678	2253	742	1828	1855
susc Surf scoter Red-breasted	Melanitta amer	icana Anatidae	2772	581	155	449	1587	bcpe	Black-capped petrel	Pterodroma hazitata	Procellanudae	600	158	339	93	10
Red-breasted	l scoter Melanitta fusca	Anatidae	3438	698	313	751	1676	grah	Great shearwater	Puffinne gravie	Procellanudae	12765	614	5817	6190	14
17.50423.23523.3357	Melanitta persp	<i>icillata</i> Anatidae	5094	1192	621	1141	2140	soch	Sooty shearwater	Puffmus griseus	Procellariidae	2447	784	1548	111	1
	Mergus serrato	r Anatidae	297	131	0	28	138	aush	Audubon's shearwater	Puffinus Iherminieri	Procellariidae	1205	130	753	278	44
coei Common eide	ar Somateria moll	issima Anatidae	5688	1210	710	1084	2684	mash	Manx shearwater	Paffinns paffinns	Procellanidae	687	101	306	265	15
			25-2003		Muter	10000000	100000000	rebp	Red phalmope	Phalaropus fulicarise	Scolopacidae	1030	462	220	286	62
colo Common loo		Gaviidae	8299	2445	621	1327	3906	mph	Red-necked phalarope	Phalaropus lobatus	Scolopacidae	471	130	172	155	14
rtlo Red-throated	loon Gavia stellata	Gaviidae	5696	2237	173	503	2783		Paramopa	TREVER CONSIDER.		7/15/				
Wilson's ston wisp petrel	n- Oceanites ocea	nicus Hydrobatidae	10886	1722	7743	1331	90	spak	South polar skua	Storeorariuz maccormicki	Stercorariidae	216	21	72	123	4
Band-rumped	storm-	100 AND 000 AN	0000000					paja	Paratitic jaeger	Stercororius paraziticus	Stercorariidae	298	48	75.	160	35
brsp petrel	Oceanodroma	nastro Hydrobatidae	275	14	251	10	0	poja	Pomarine jaeger	Stercorarius pomarinus	Stercorariidae	983	111	146	714	12
lesp Leach's storm	-petrel Oceanodroma	eucorhoa Hydrobatidae	2654	227	1969	457	1	grik	Great skua	Stercorartisz skua	Stercorariidae	242	16	26	174	26
1 1200 CARN	Chroicocephali	(4.2) 32284		- 		10000		lete	Least tern	Sterna antillarum	Stemidae	303	28	183	86	
bogu Bonaparte's g	ull philadelphia	Laridae	2311	551	113	383	1264	rost	Roseate tem	Sterna dougallii	Stemidae	621	\$7	265	208	61
herg Herring gull	Larus argentati	us Laridae	22300	5845	3291	7663	5501	cote	Common term	Sterna htrundo	Sternidae	3089	543	1448	908	190
·							••••••	royt	Royal tem	Sterna maxima	Stemidae	968	391	271	287	1
											and the second se					

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Northern gannet

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#### 1. Prioritization and species selection for analysis

			Federal			Stat	e			Other	r a a constante	
Species - common name	ESA	ммра	EFH	FWS BCR30 Priority	MBTA	E, T, SC	Ocean Plans	Managed fishery	Keystone	Likely to interact with priority human uses	Range info, migratory, etc.	MDAT no. of observations
American avocet				Moderate	х							
American black duck				Highest	x							
American golden plover				High	х							
American oystercatcher				Highest	х	ME, RI, CT (SC)						
Arctic tern				11.00	х	ME (E); NH, MA (SC)	MA 55U					263
Atlantic brant				Highest	х							
Atlantic puffin				21.5576.92	х	ME (E)						855
Audubon's shearwater				High	х							
Black guillemot				5.56	х							203
Black rail				Highest	х	CT, NY (E)						
Black scoter				High	х	- 1991	MA SSU; RI ADP					2772
Black skimmer				2070	х		MA SSU					

2. At-sea focused analyses vs shore/estuarine/marsh/land-based analyses

3. Grouping of species



# **Product Examples**

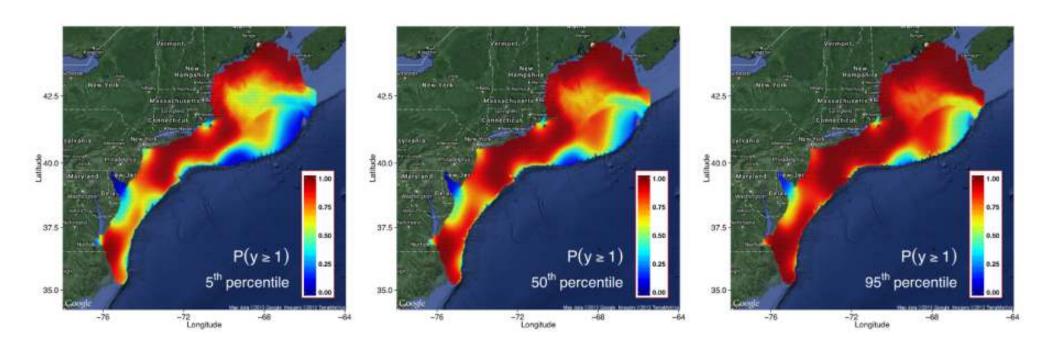
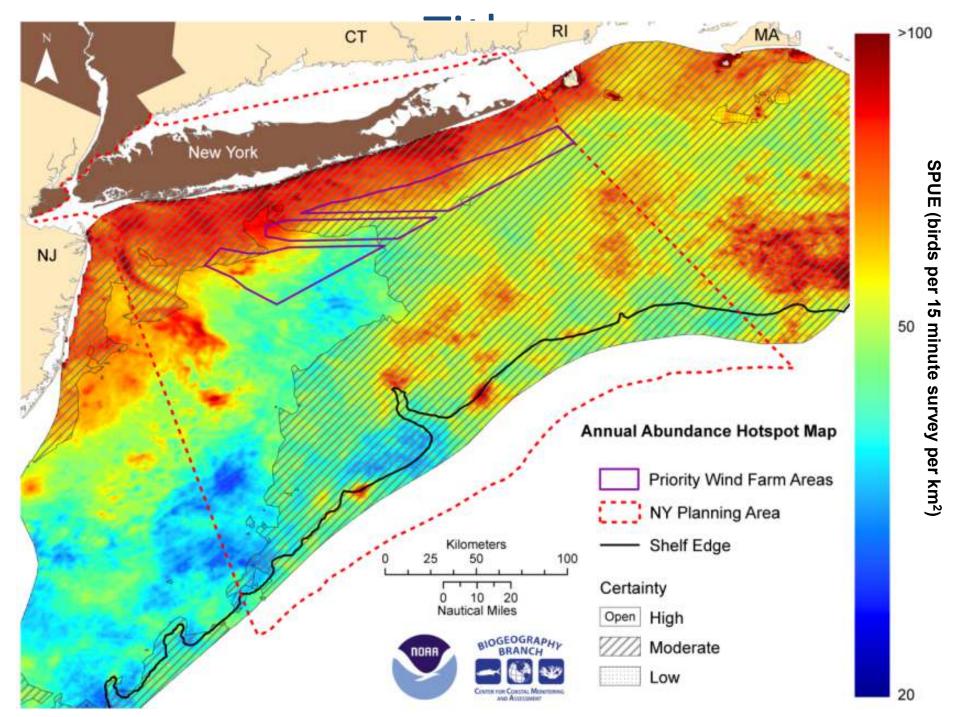


Figure 2: Northern Gannet: Risk maps of the probability of observing at least one individual during the year. The median estimate is presented along with the  $5^{th}$  and  $95^{th}$  percentiles to show uncertainty in parameter estimates.

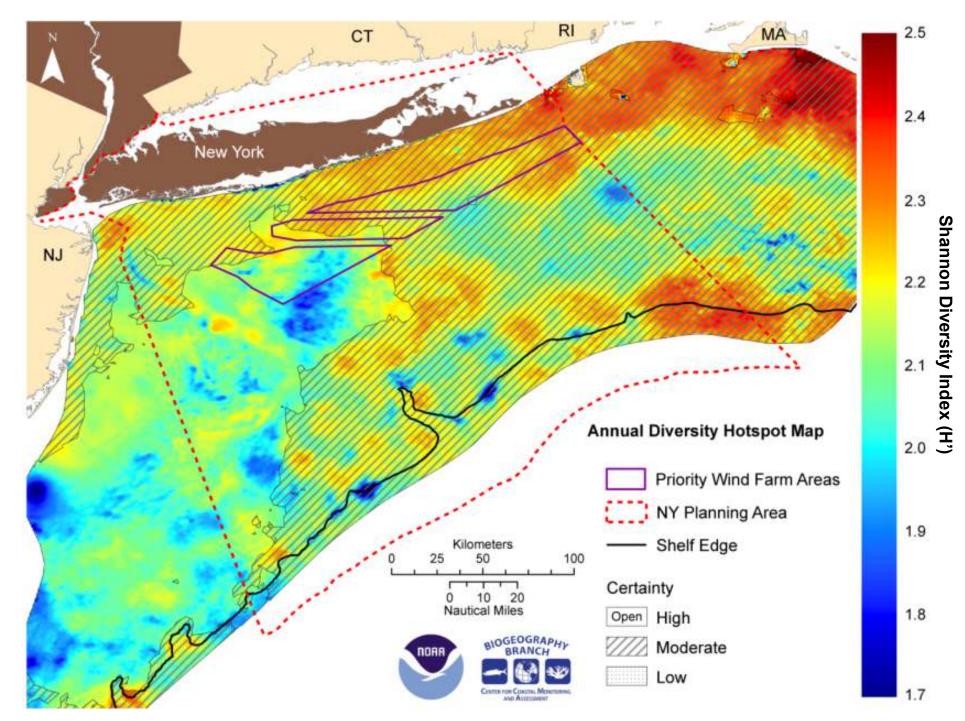


From Balderama, Gardner and Reich, in prep.

## Synthetic map products: abundance hotspots



## Synthetic map products: diversity hotspots



# Questions?

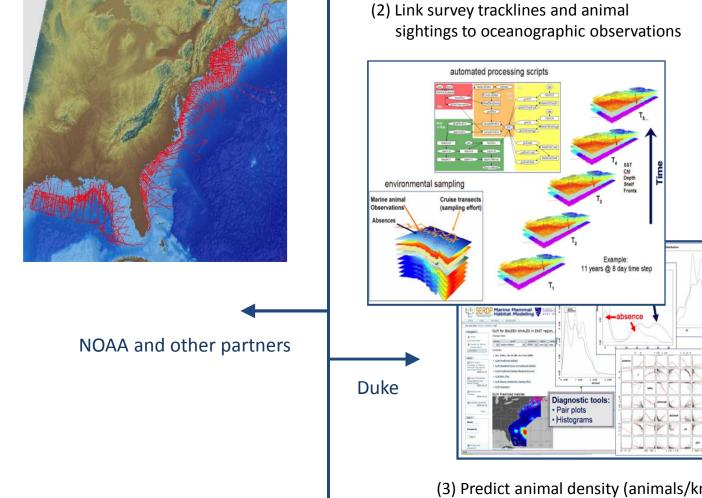


# Marine Mammal & Sea Turtle Working Group 8-7-2014 discussion topics

- What additional line transect surveys we should incorporate?
- What spatial extent does NROC want?
- Should we summarize models into multi-species summaries (e.g. all baleen whales)?
- How to handle situations where density modeling is not possible?
  - Rare species
  - Near-shore / estuarine areas
- How to best present model uncertainty?
- Do members of the working group have expertise in particular species, and would they be interested in reviewing models in detail offline?
- Should we produce alternative products, other than density models?

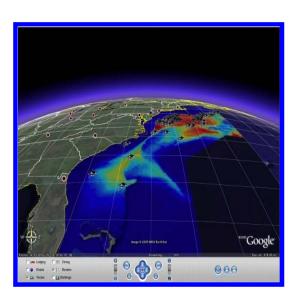
# Density modeling process in a nutshell

#### (1) Conduct line transect surveys



(3) Predict animal density (animals/km<sup>2</sup>) from oceanographic conditions using multivariate statistics

(4) Produce density maps for use in marine spatial planning processes

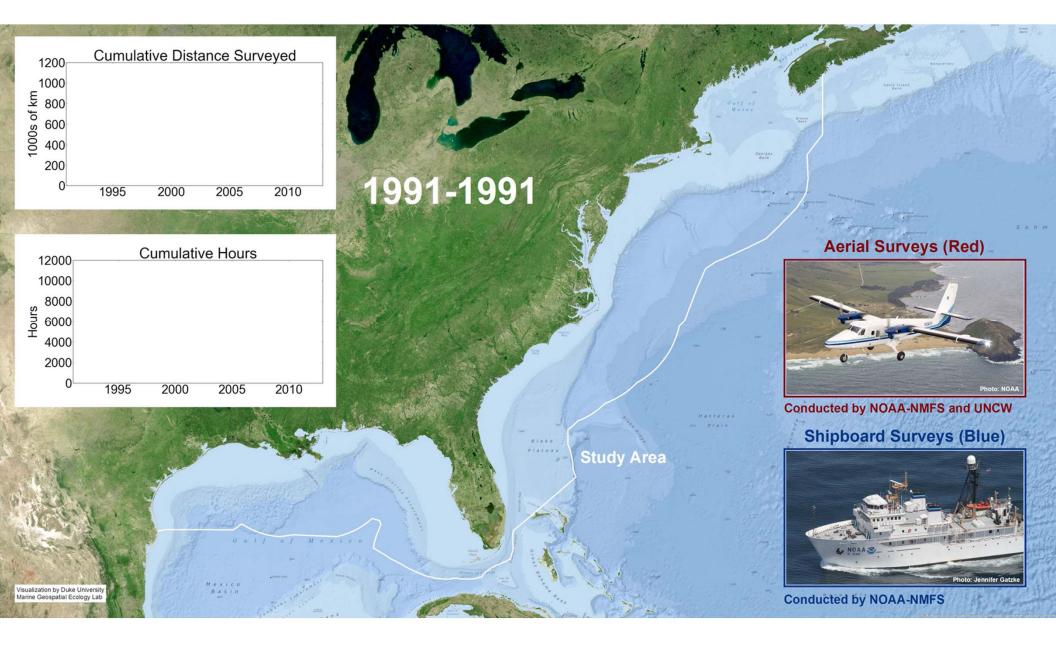




# Approach, philosophy, and key assumptions

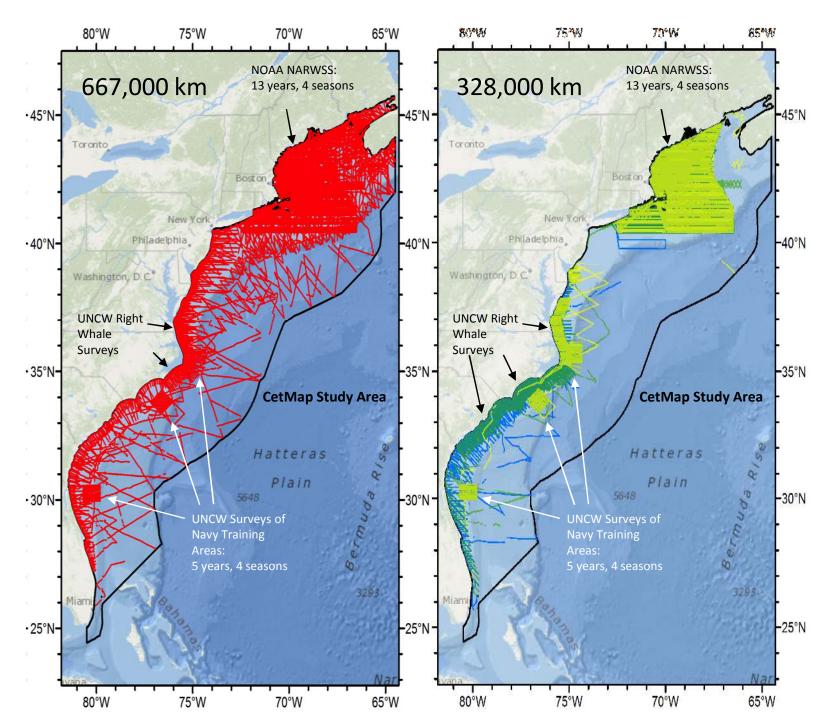
- Use a habitat-based approach, with generalized additive models (GAMs)
- When sufficient sightings are available, fit different models where different behaviors or relationships are expected (e.g. breeding vs. feeding seasons)
  - When few sightings are available, fit one model to available sightings
  - When sightings are very sparse, distribute density uniformly
- Define species-specific seasons based on patterns in the sightings and reports in the literature
- For rare species that may be ecologically similar (e.g. beaked whales), group their sightings and model the group
- For ambiguous sightings in which the definitive sightings appear to show distinct habitats (e.g. "fin/sei whale"), we are experimenting with a habitatbased classification model prior to density modeling
- For ambiguous sightings in which the definitive sightings do not show distinct habitats (e.g. "pilot whale"), model the group

# Marine mammal aggregation data overview



#### **Atlantic Surveys**

#### Summer (Red), Fall (Yellow), Winter (Blue), Spring (Green)





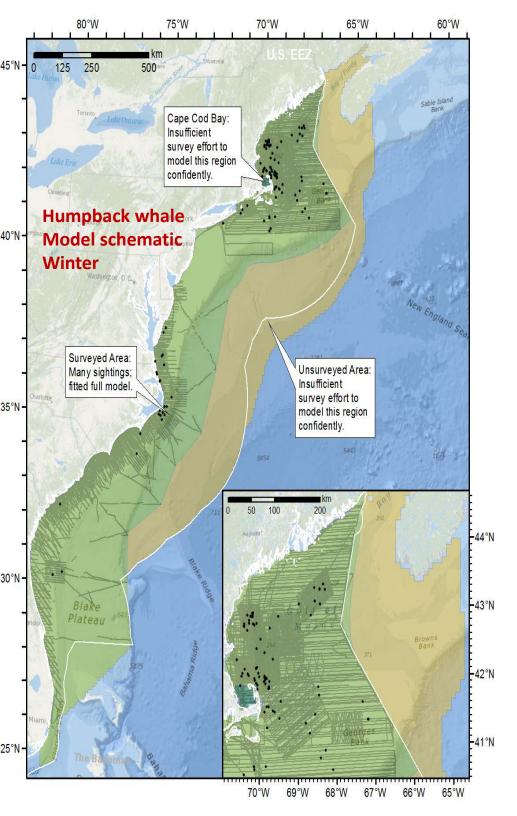
# Marine mammal survey data

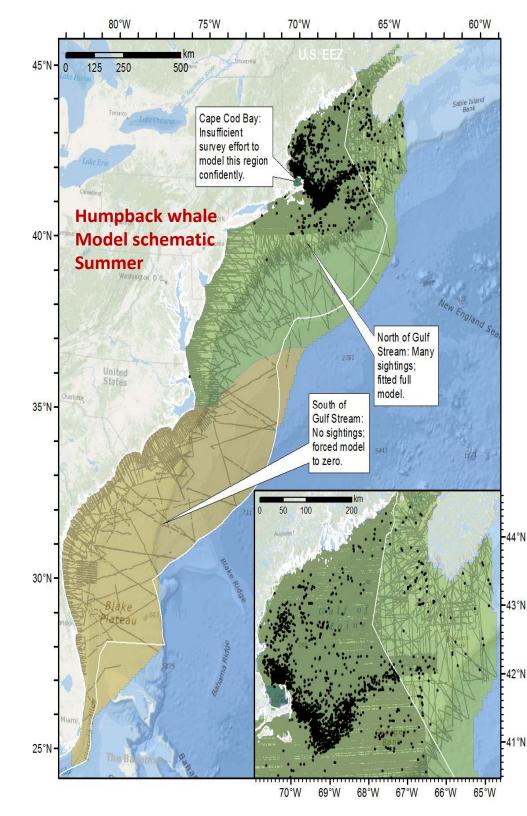
			On Effort Length	Effort	Survey
Surveys	Started	Ended	(1000s km)	Hours	Count
NEFSC Aerial Surveys	1995	2008	70	412	8
NEFSC North Atlantic Right Whale Sighting Survey	1999	2013	438	2366	24
NEFSC Shipboard Surveys	1995	2004	16	1145	6
NJDEP Aerial Surveys	2008	2009	11	60	2
NJDEP Shipboard Surveys	2008	2009	14	836	2
SEFSC Atlantic Shipboard Surveys	1992	2005	29	1764	6
SEFSC Mid Atlantic Tursiops Aerial Surveys	1995	2005	35	196	7
SEFSC Southeast Cetacean Aerial Surveys	1992	1995	8	42	2
UNCW Cape Hatteras Aerial Surveys (Navy)	2011	2013	38	250	4
UNCW Early Marine Mammal Aerial Surveys	2002	2002	18	98	1
UNCW Jacksonville Aerial Surveys (Navy)	2009	2013	132	805	10
UNCW Onslow Bay Aerial Surveys (Navy)	2007	2011	98	563	6
UNCW Right Whale Aerial Surveys	2005	2008	114	586	3
Virginia Aquarium Aerial Surveys (in progress)	2012	2014			1

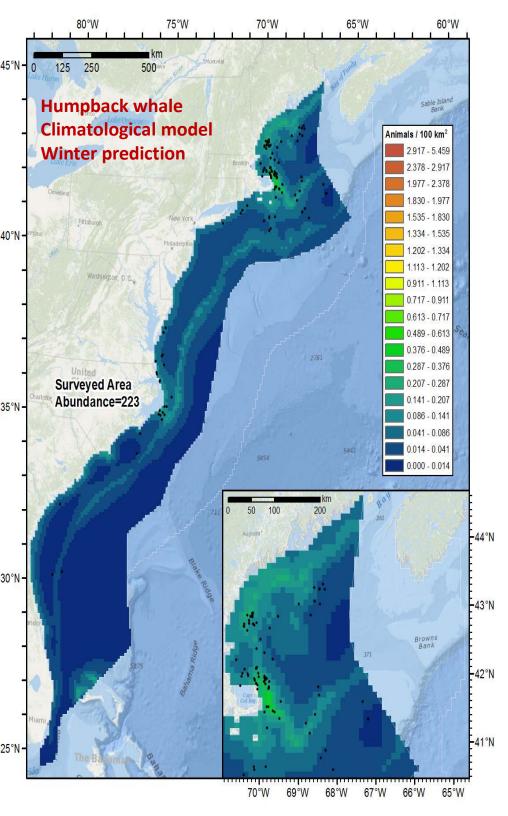
Table 1: Northwest Atlantic line transect surveys used in Duke marine mammal and sea turtle density models for the east coast of the United States and southern Canada.

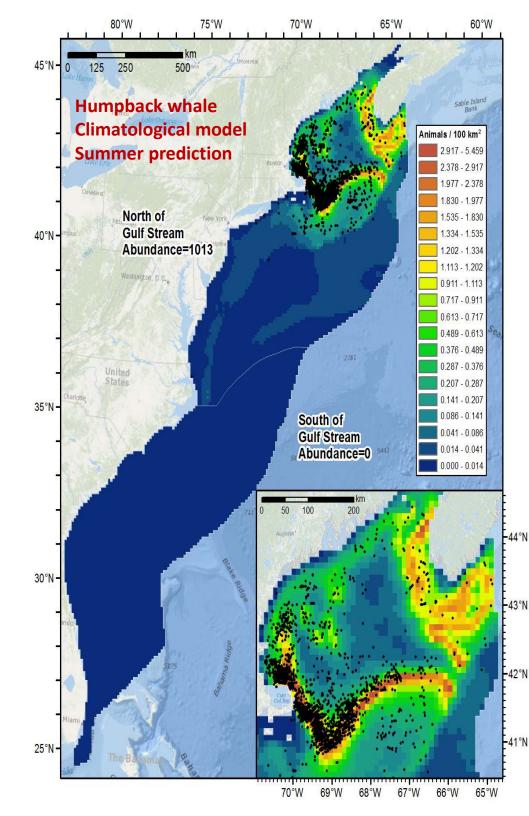
Family	Scientific Name	Common Name	Sightings	Modeled as group
Cetaceans	Balaenoptera acutorostrata	Minke whale	1010	
	Balaenoptera borealis	Sei whale	589	
	Balaenoptera musculus	Blue whale	7	
	Balaenoptera physalus	Fin whale	1730	
	Delphinus delphis	Common dolphin	803	
	Eubalaena glacialis	North Atlantic right whale	1595	
	Globicephala	Unidentified pilot whale	670	Pilot whales
	Grampus griseus	Risso's dolphin	514	
	Hyperoodon ampullatus	Northern bottlenose whale	3	Beaked whales
	Kogia	Unidentified small sperm whale	3	
	Kogia sima	Dwarf sperm whale	1	
	Lagenorhynchus acutus	Atlantic white-sided dolphin	1677	
	Lagenorhynchus albirostris	White-beaked dolphin	12	
	Megaptera novaeangliae	Humpback whale	2700	
	Mesoplodon	Unidentified beaked whale	82	Beaked whales
	Mesoplodon bidens	Sowerby's beaked whale	8	Beaked whales
	Mesoplodon densirostris	Blainville's beaked whale	2	Beaked whales
	Mesoplodon mirus	True's beaked whale	2	Beaked whales
	Orcinus orca	Killer whale	4	
	Phocoena	Harbor porpoise	2781	
	Physeter macrocephalus	Sperm whale	247	
	Stenella attenuata	Pantropical spotted dolphin	4	
	Stenella coeruleoalba	Striped dolphin	84	
	Stenella frontalis	Atlantic spotted dolphin	7	
	Stenella longirostris	Spinner dolphin	1	
	Tursiops truncatus	Bottlenose dolphin	477	
	Ziphiidae	Unidentified beaked whale	2	Beaked whales
	Ziphius cavirostris	Cuvier's beaked whale	21	Beaked whales
Pinnipeds	Caniformia	Unidentified seal	909	Seals
	Halichoerus grypus	Gray seal	24	Seals
	Phoca vitulina	Harbor seal	250	Seals
Turtles	Caretta	Loggerhead turtle	470	
	Chelonia mydas	Green turtle	3	
	Dermochelys coriacea	Leatherback turtle	232	
	Lepidochelys kempii	Kemp's ridley turtle	59	

# Marine mammal and sea turtle sightings







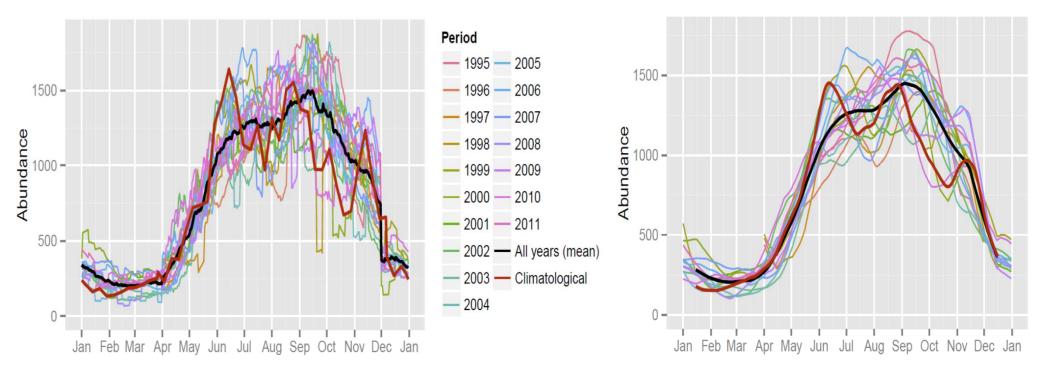




# Predicted temporal variability

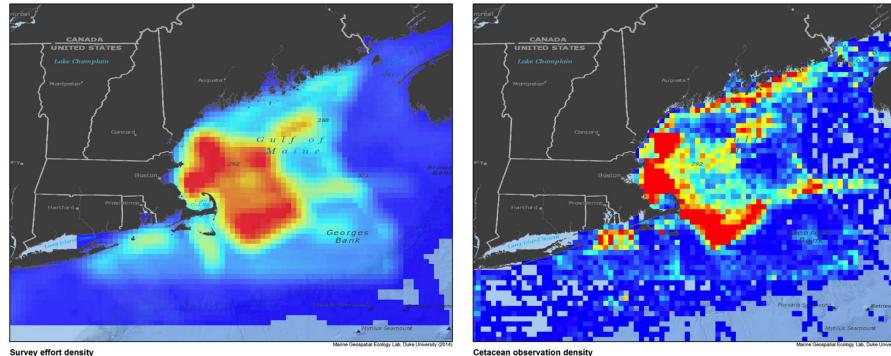
#### Unsmoothed

#### 30-day moving average



Comparison of Humpback whale abundance predicted at a daily time step for different time periods. Individual years were predicted using contemporaneous models. "All years (mean)" averages the individual years, giving the mean annual abundance of the contemporaneous model. "Climatological" was predicted using the climatological model.

# Example: Survey & observation density



low

High

Survey effort density

Low

High

# Questions?

# Fish Working Group 8-12-2014 discussion topics

- Summary of species covered by data sets in-hand
- Regulatory and other considerations of species
- Data input opportunities
- Under-represented species, from trawl surveys
- Nearshore vs. offshore trawls
- Type of analyses options



Map and animation data product options

### NOAA Fish Species Datasets

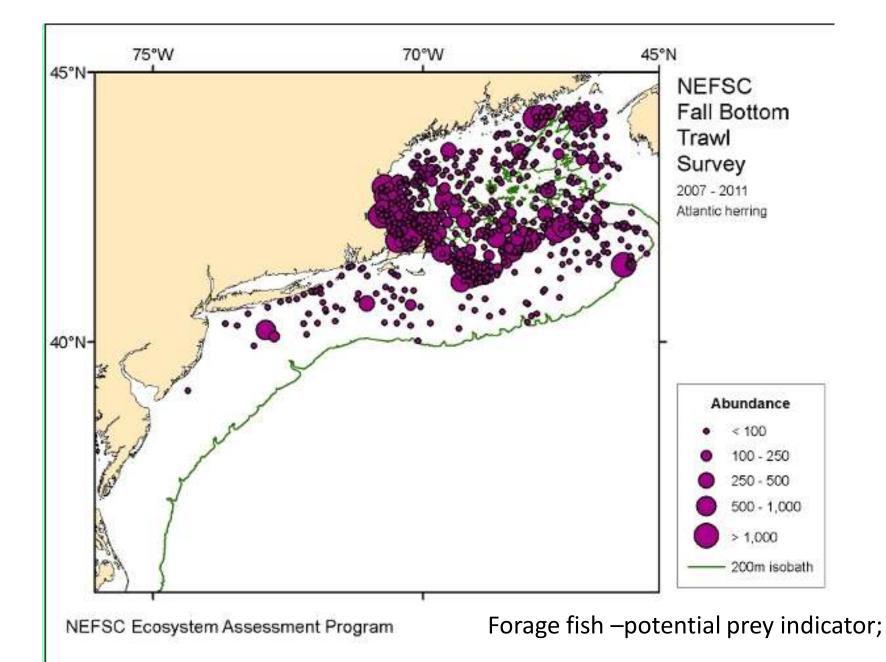


Species	Not Used	Species	Not Used
Acadian Redfish		Pollock	
Alewife		Red Drum	Spring
American Lobster		Red Hake	
American Plaice		Rosette Skate	
American Shad		Roughtail Stingray	Spring
Atlantic Cod		Sand Lance	
Atlantic Croaker		Sand Tiger Shark	Spring
Atlantic Herring		Scup	
Atlantic Mackerel		Sea Raven	
Atlantic Stingray	Fall & Spring	Sea Scallop	
Atlantic torpedo		Sharpnose Shark	
Banded Drum	Spring	Shortfin Squid	
Barndoor Skate		Shorthorn Sculpin	Fall
Black Drum	Spring	Silver Hake	
Black Sea Bass		Smooth Butterfly Ray	
Blackbelly Rosefish		Smooth Dogfish	
Blueback Herring		Smooth Skate	
Bluefish		Southern Eagle Stingray	Fall
Bluntnose Stingray	Spring	Southern Stingray	Spring
Bullnose Stingray	Spring	Spiny Butterfly Ray	Spring
Butterfish		Spiny Dogfish	
Clearnose Skate		Spot	
Cownose Ray		Spotted Hake	
Cravelle Jack		Star Drum	Fall & Spring
Cunner		Striped Bass	
Cusk		Striped Burrfish	Spring
Fourspot Flounder		Striped Sea Robin	
Gulf Stream Flounder		Summer Flounder	
Haddock		Tautog	
Little Skate		Thorney Skate	
Longfin Squid		Tilefish	
Longhorn Sculpin		Weakfish	
Monkfish		White Hake	
Northern Kingfish		Windowpane Flounder	
Northern Puffer	Spring	Winter Flounder	
Northern Sea Robin		Winter Skate	
Ocean Pout		Witch Flounder	
Pig Fish	Spring	Wolffish	
Pin Fish		Yellowtail Flounder	
Pipefish			

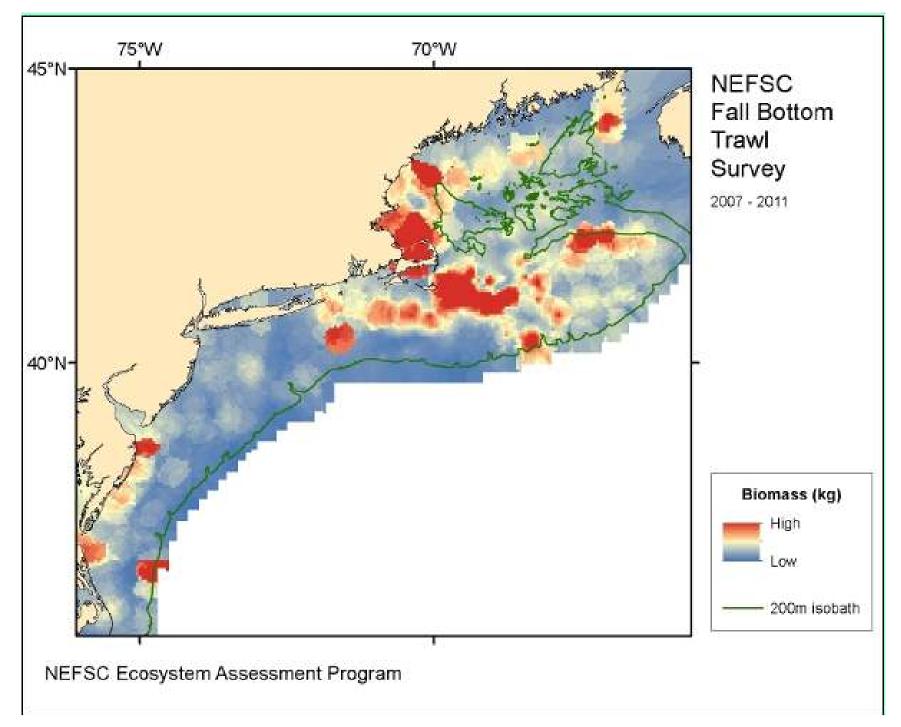
# Prioritization and species selection for analysis (abbreviated...)

Federal		Sta	ate					
ESA	EFH	E. T. SC	Ocean Plans	Managed fisherv	Kevstone	priority	migratory,	Data (quality/q uantity)
SC				,	,			
		ME, NH (SC)		X				
				x				
	Х			X				
		NH (SC)		x				
		ME (SC)						
SC								
	x			x				
				x				
SC	x			x				
	x			x	х			
	x			x				
				x				
E	x	ME (E)		x				
	Х			x				
E		MA (E); CT (T	)	x				
SC					Х			
	ESA SC SC SC E	ESA EFH SC X X SC X SC X SC X SC X SC X X SC X X E X	ESA     EFH     E, T, SC       SC     NH (SC)       ME, NH (SC)       X       X       NH (SC)       X       SC       X       B       X       ME (SC)       SC       X       B       X       ME (SC)       X       ME (SC)       X       ME (SC)       X       ME (SC)	ESAEFHE, T, SCOcean PlansSCNH (SC)ME, NH (SC)XME, NH (SC)XNH (SC)SCME (SC)SCXXInterventionSCXXInterventionSCXXInterventionSCXXInterventionSCXXInterventionSCXXInterventionXInterventionXInterventionXInterventionEXMA (E); CT (T)	ESAEFHE, T, SCOcean PlansManaged fisherySCNH (SC)XME, NH (SC)XME, NH (SC)XXNH (SC)XXNH (SC)XME (SC)XSCME (SC)XSCXXXXXSCXXXXXSCXXXXXSCXXX	ESAEFHE, T, SCOcean PlansManaged fisheryKeystoneSCNH (SC)XME, NH (SC)XXXNH (SC)XXNH (SC)XME, NH (SC)XXNH (SC)XME (SC)XSCME (SC)SCXSCXXSCXXXNXXXXXXSCXXXXXXXXXXXXME (E)XXEXMA (E); CT (T)X	ESAEFHE, T, SCOcean PlansManaged fisheryLikely to interact with prioritySCNH (SC)X	ESAEFHE, T, SCOcean PlansManaged fisheryLikely to interact with priority human usesRange info, migratory, etc.SCNH (SC)X

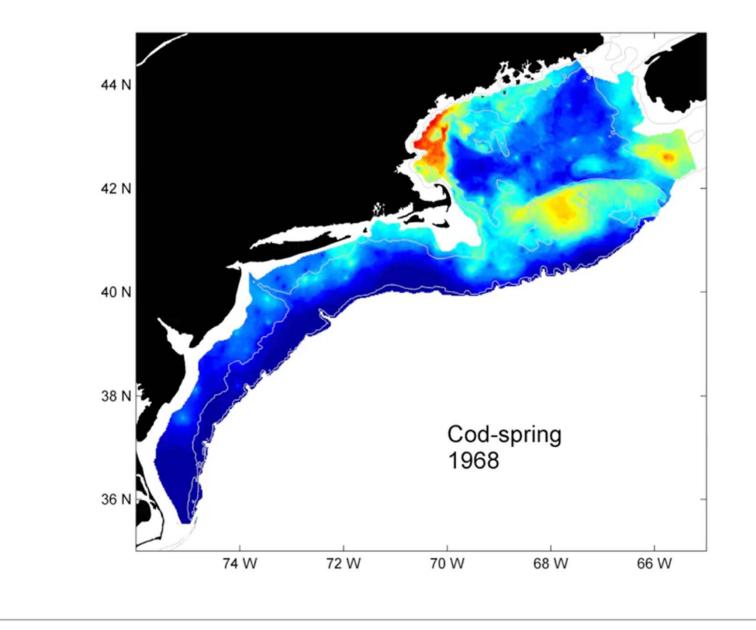
# Atlantic herring – keystone species



# **Total biomass**



# Atlantic Cod distribution over time

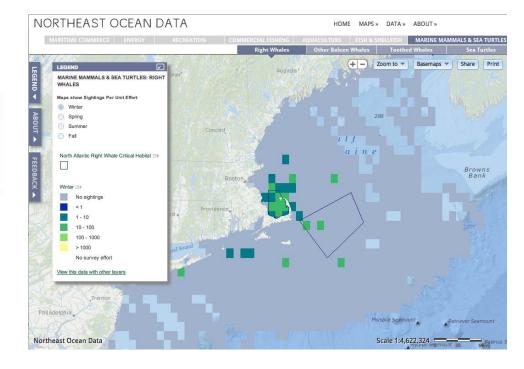


NEFSC Spring Bottom Trawl Survey 1968 – 2008

# Stakeholder Input

- Future synthesis products
  - Identify focal species
  - Mapping products and visualization options
  - Visualizing uncertainty
  - Portal integration

Integrated Data & Model Products	Map products
Data richness and density	Seasonal data richness
Areas of expected data gaps (space & time)	Seasonal data gaps
Areas of high species overlap (hot spots)	Seasonal / annual
Areas of management concern and human use	Per activity
Prey species	As available



# Questions

- **Species** Which species are of highest priority?
- Resolution and Extent What spatial resolution of predictions and over what geographic extent would be most useful for marine spatial planning? What time scales are of interest?

# Contact email: northeast\_marinelife\_data@duke.edu







