

Combing survey and satellite data with circulation models for weekly predictions of right whale habitat suitability

Dan Pendleton



Acknowledgements

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Cornell University



Outline

- North Atlantic right whale background
- Generation 1 copepod model (*Calanus*)
- Weekly habitat modeling in CCB & GSC
- Generation 2 copepod model (*Calanus* & *Pseudocalanus*)
- Weekly habitat modeling in CCB & MB



Historic distribution of North Atlantic right whale fisheries

40

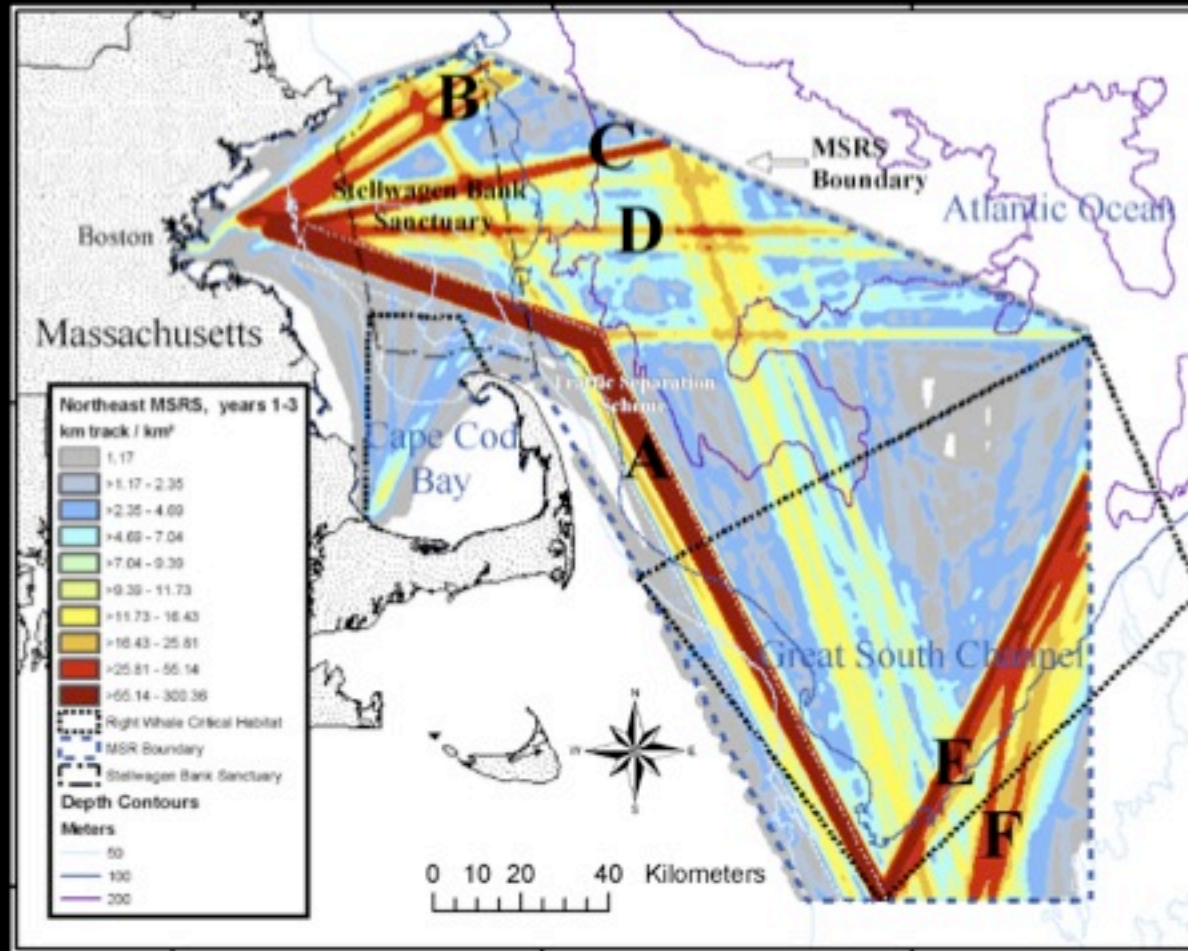
RANDALL R. REEVES ET AL.



Current distribution of NA right whales

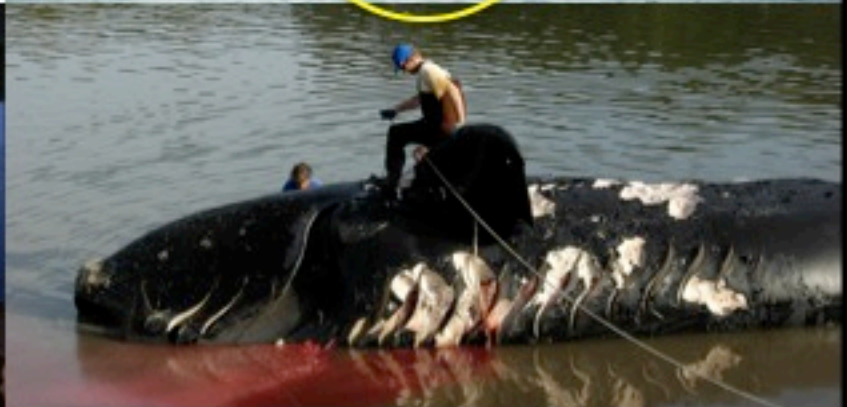


Ship traffic: 1999-2002



*Ward-Geiger et al. 2005,
Coastal Management*

Intense survey effort to reduce mortality



Regional scale data is useful

Vol. 37B: 211–225, 2009
doi: 10.3354/meps07872

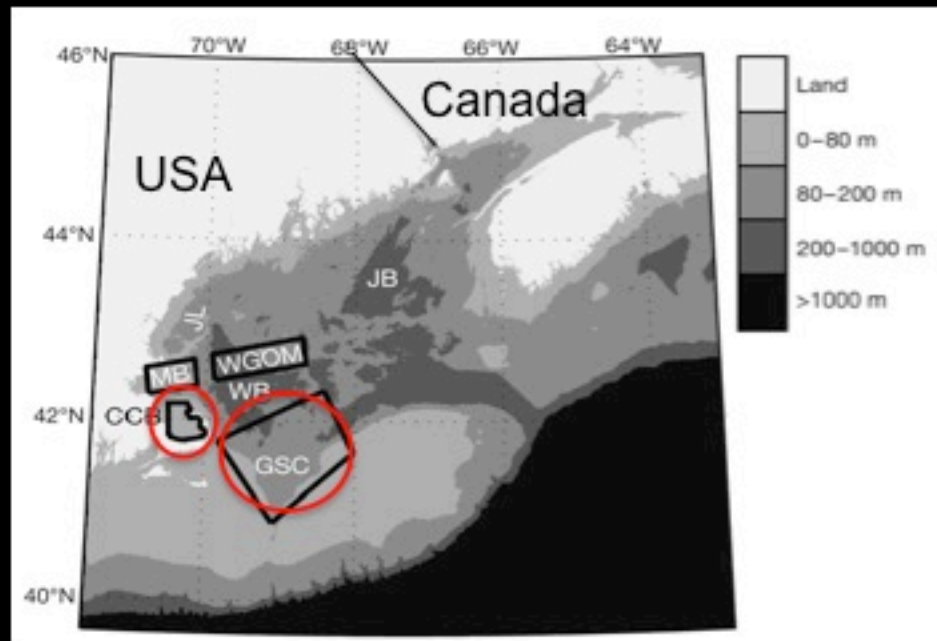
MARINE ECOLOGY PROGRESS SERIES
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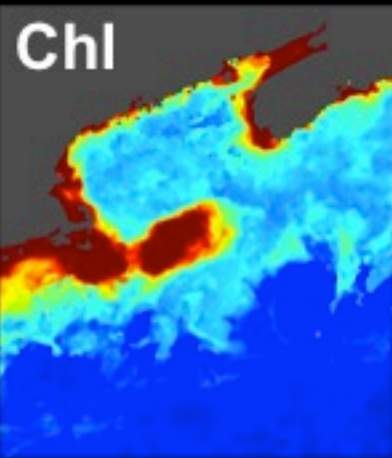
Published March 12



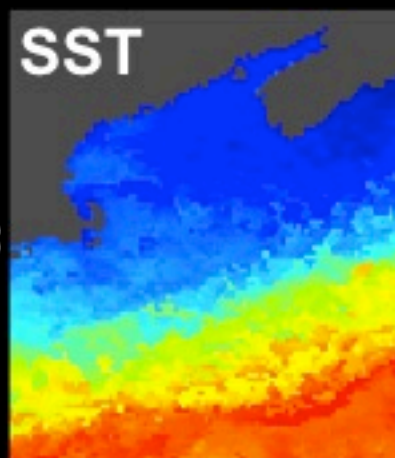
Regional-scale mean copepod concentration indicates relative abundance of North Atlantic right whales

Daniel E. Pendleton^{1,2,3,*}, Andrew J. Pershing^{2,3}, Moira W. Brown^{4,7}, Charles A. Mayo⁴, Robert D. Kenney⁵, Nicholas R. Record^{2,3}, Timothy V. N. Cole⁶

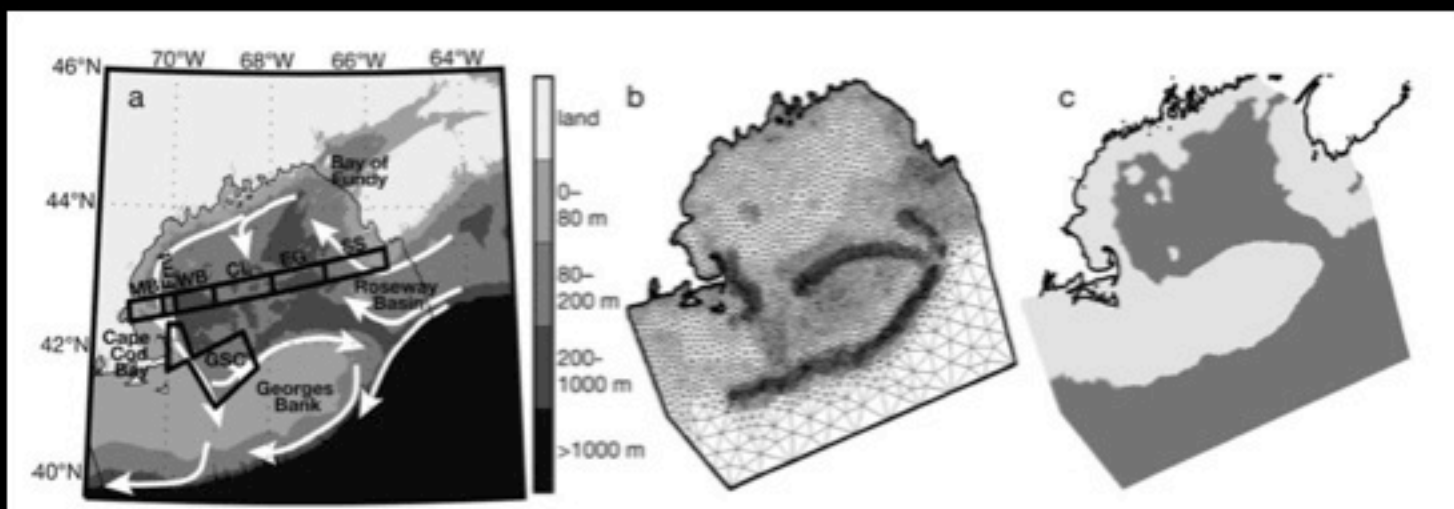
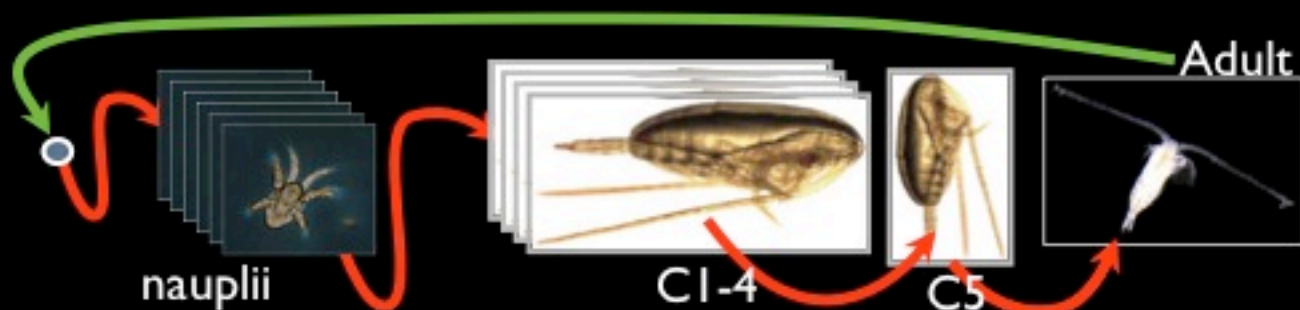




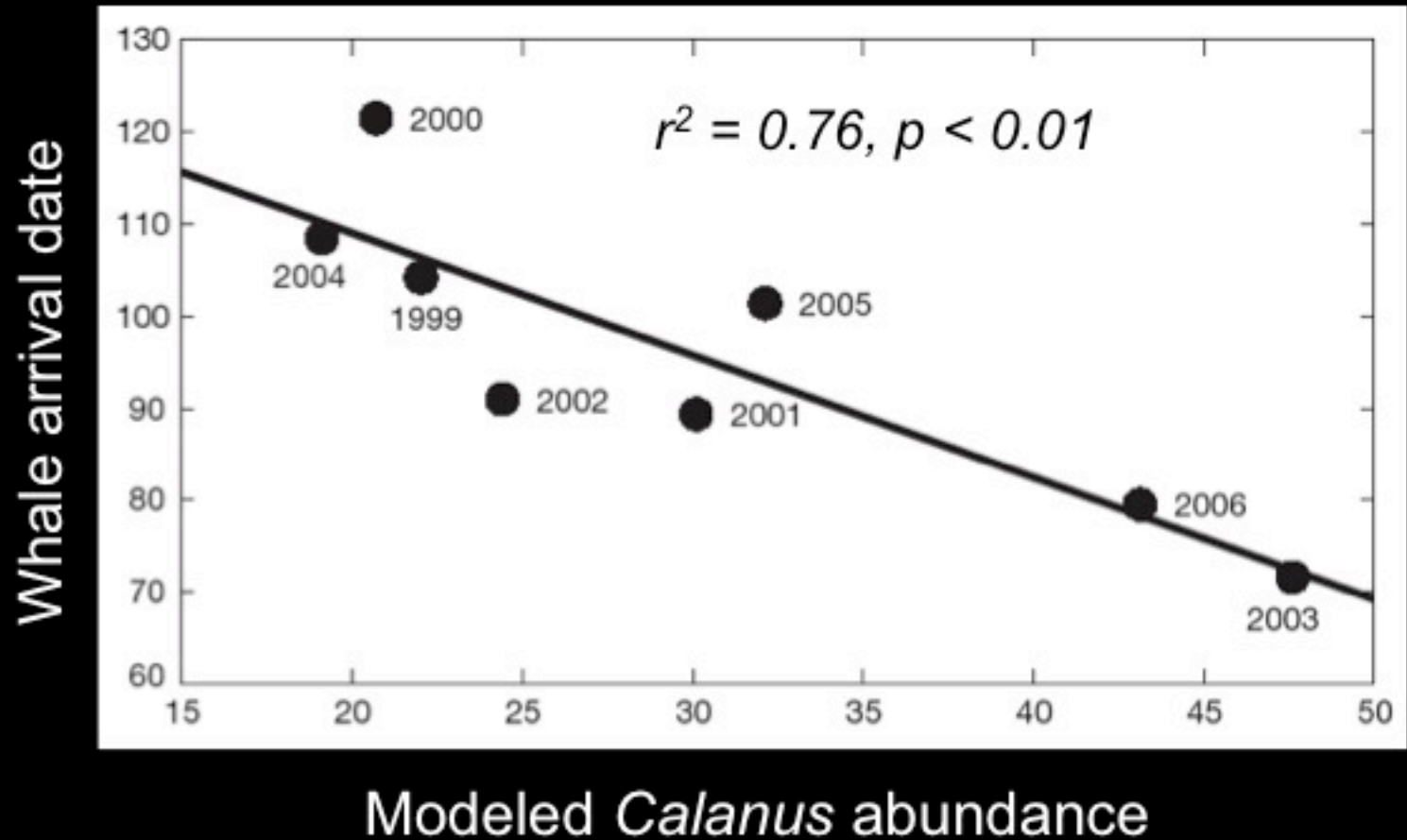
*



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Modeled *Calanus* predicts right whale arrival date



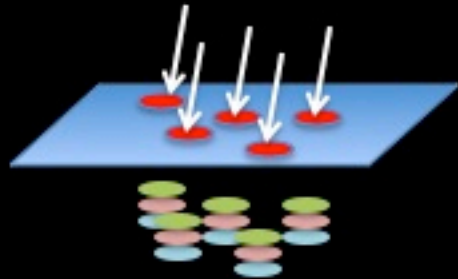
Pershing et al. 2009 MEPS
Also, Pendleton et al. 2009 MEPS

Can ENMs aid short term right whale conservation efforts?

- Issue warnings to vessel operators and members of the fishing community
- Identify areas likely to host aggregations of right whales in the next week
- Direct survey effort
- Find new habitat

Standard (time invariant) ENM

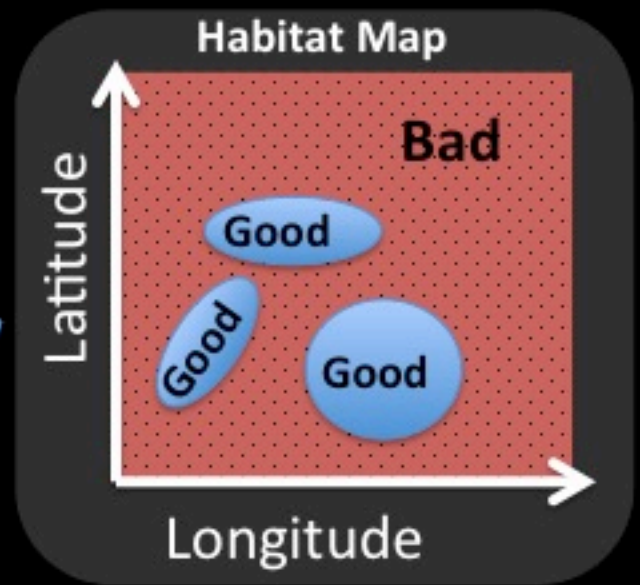
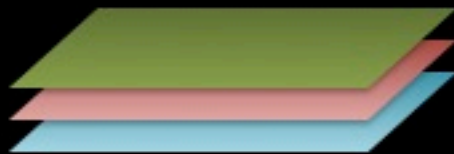
Species occurrences

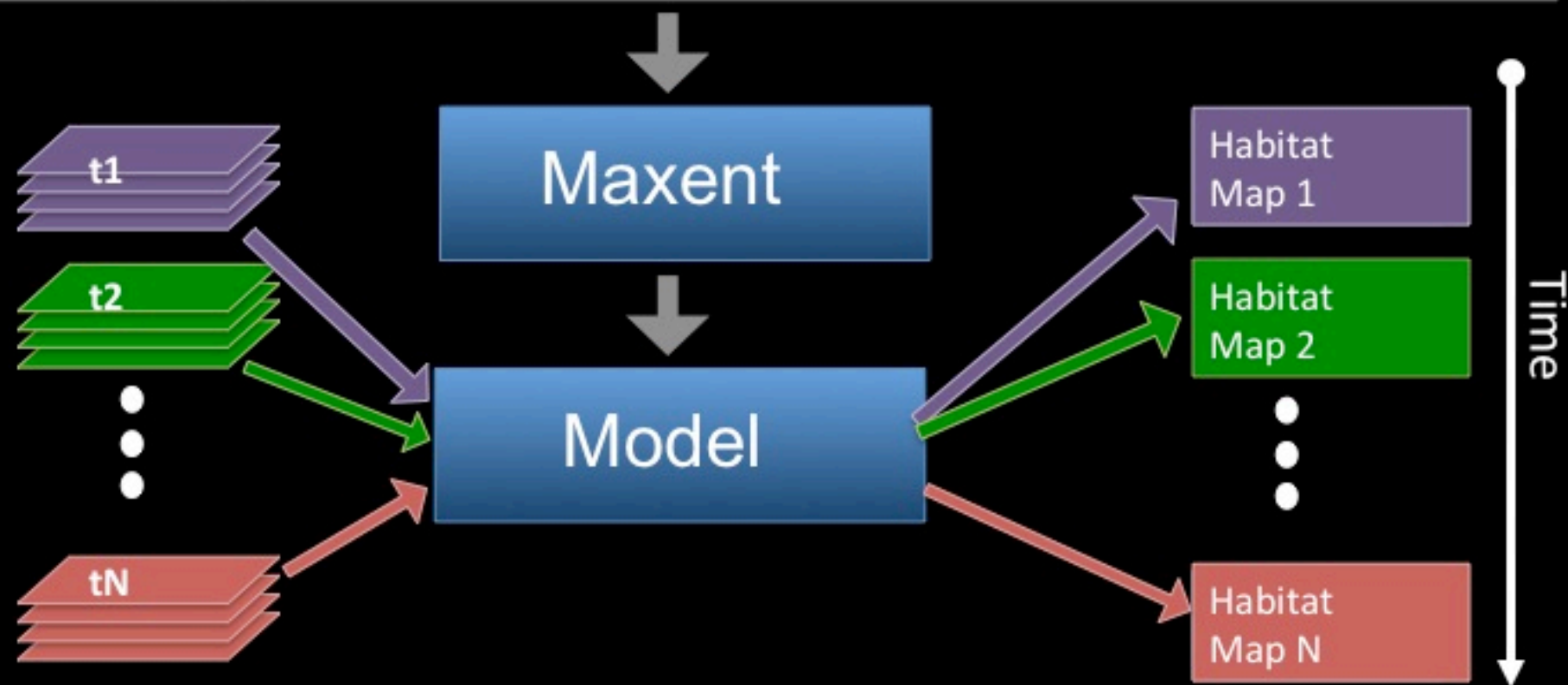
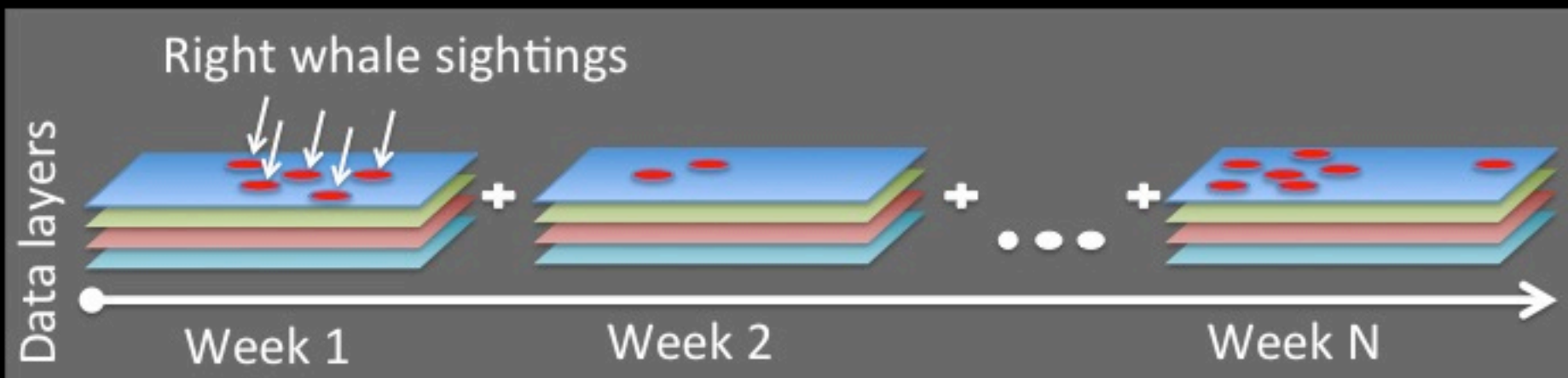


Modeling
Algorithm

Model

Static data
layers





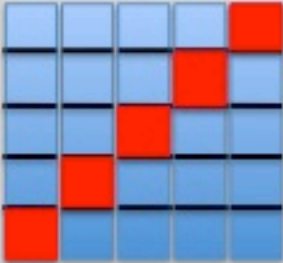
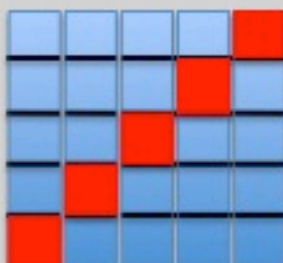
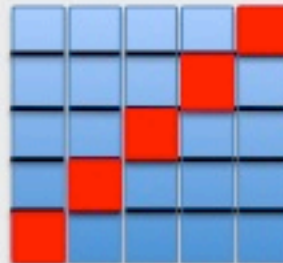
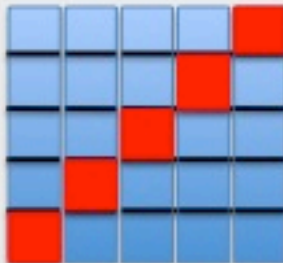
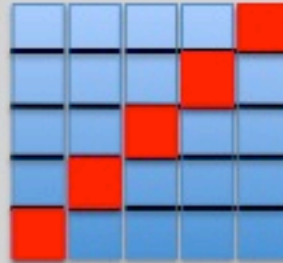
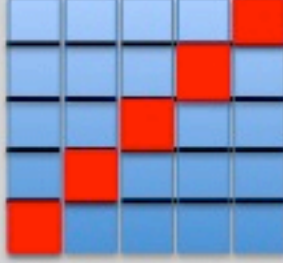
Hypotheses

- *H1*: Prey is an important predictor of the distribution of right whales
- *H2*: Right whale environmental preferences are dynamic

Cross validation

	Model 1	Model 2	Model 3	Model 4	Model 5
2006					Test Data
2005				Test Data	
2004			Test Data		
2003		Test Data			
2002	Test Data				

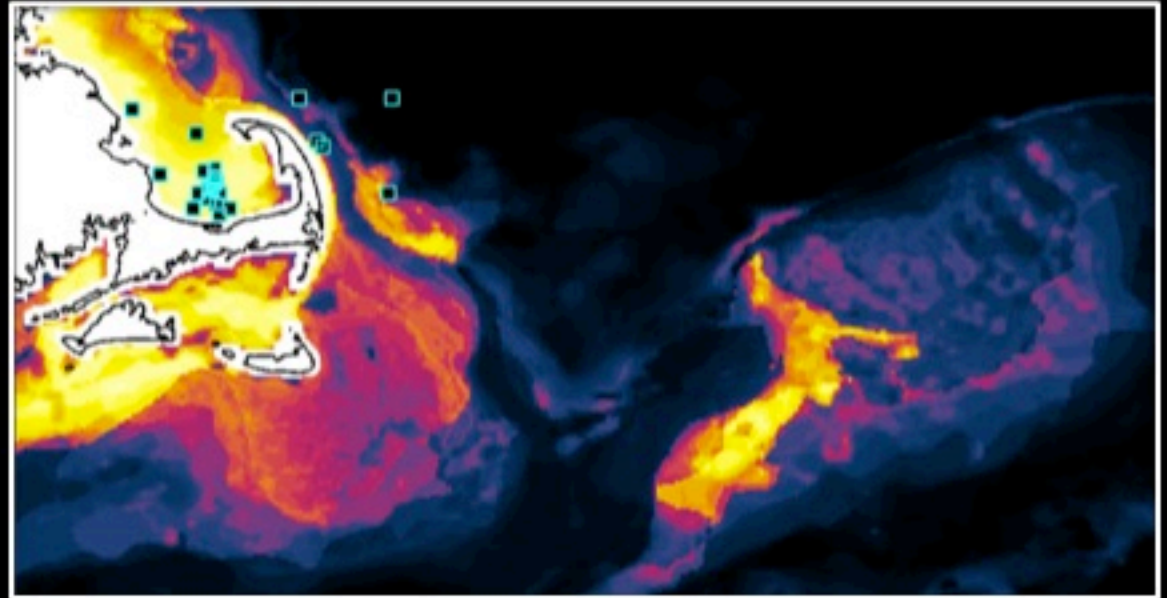
Experimental Design

$H1$		
	With <i>Calanus</i>	Without <i>Calanus</i>
$H2$	Winter+Spring 	
	Winter 	
	Spring 	

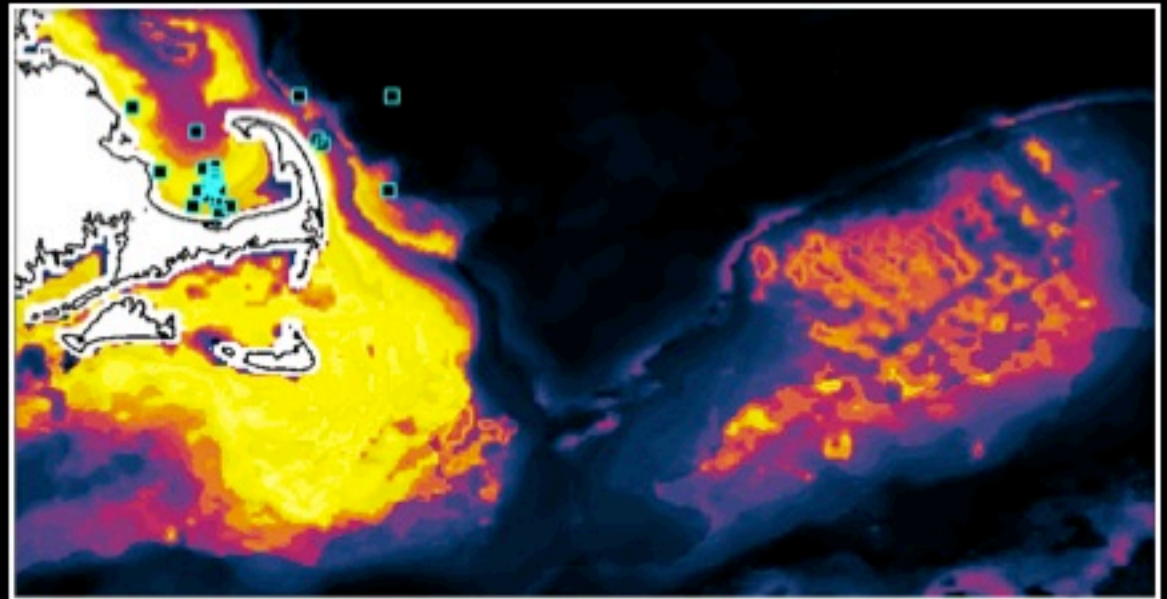
Test year = 2005

March 22 – March 29

with
Calanus



without
Calanus



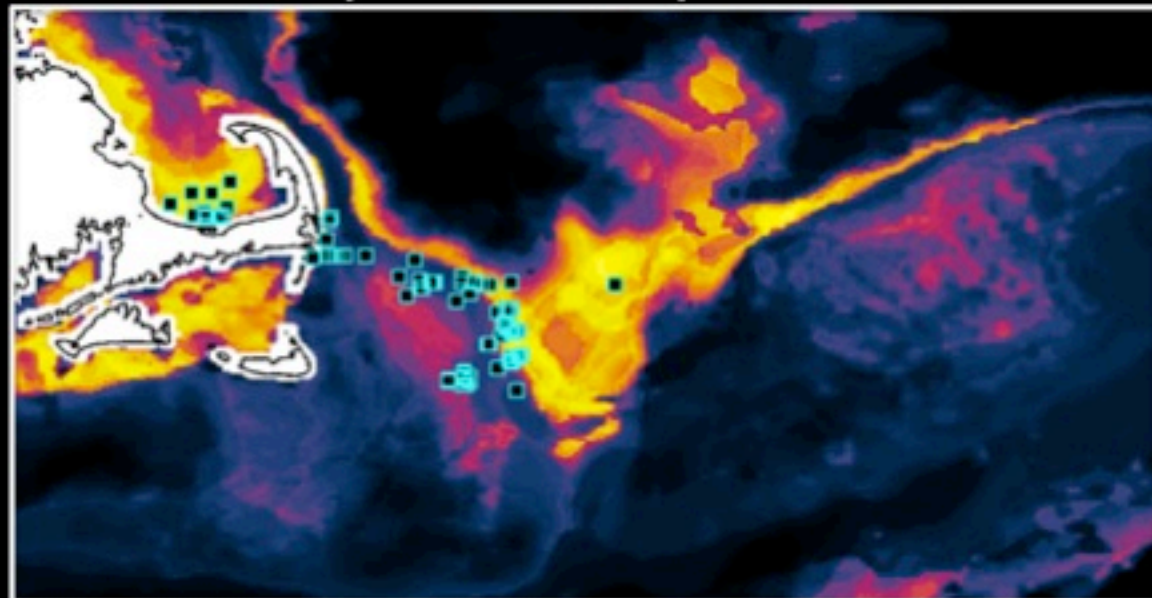
1 = high
suitability

0 = low
suitability

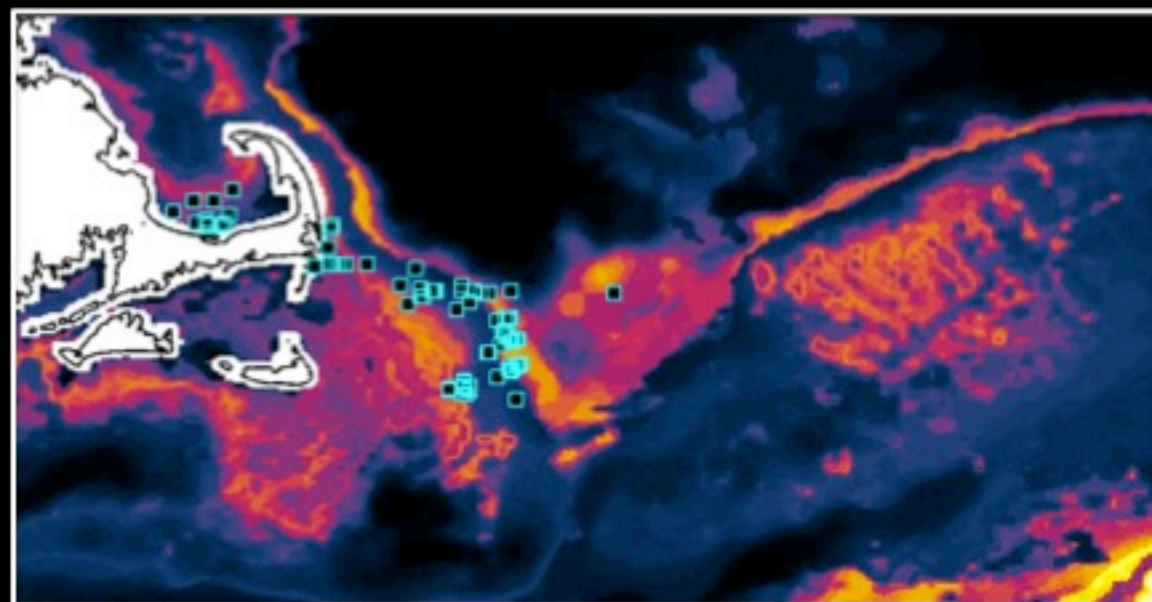
Test year = 2005

April 15 – April 22

with
Calanus



without
Calanus



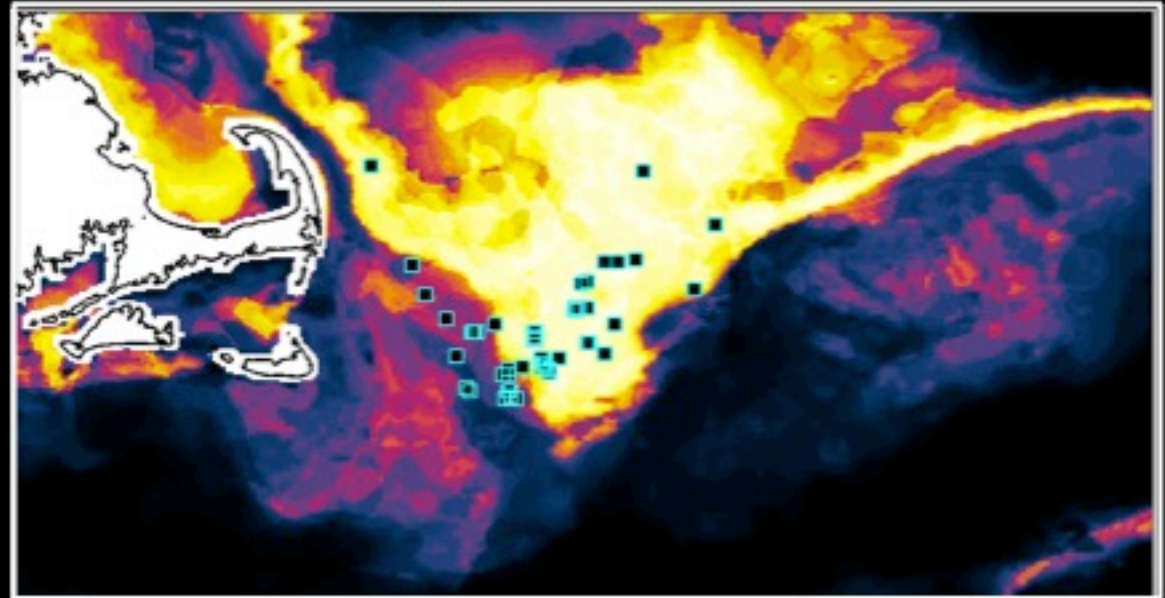
1 = high
suitability

0 = high
suitability

Test year = 2005

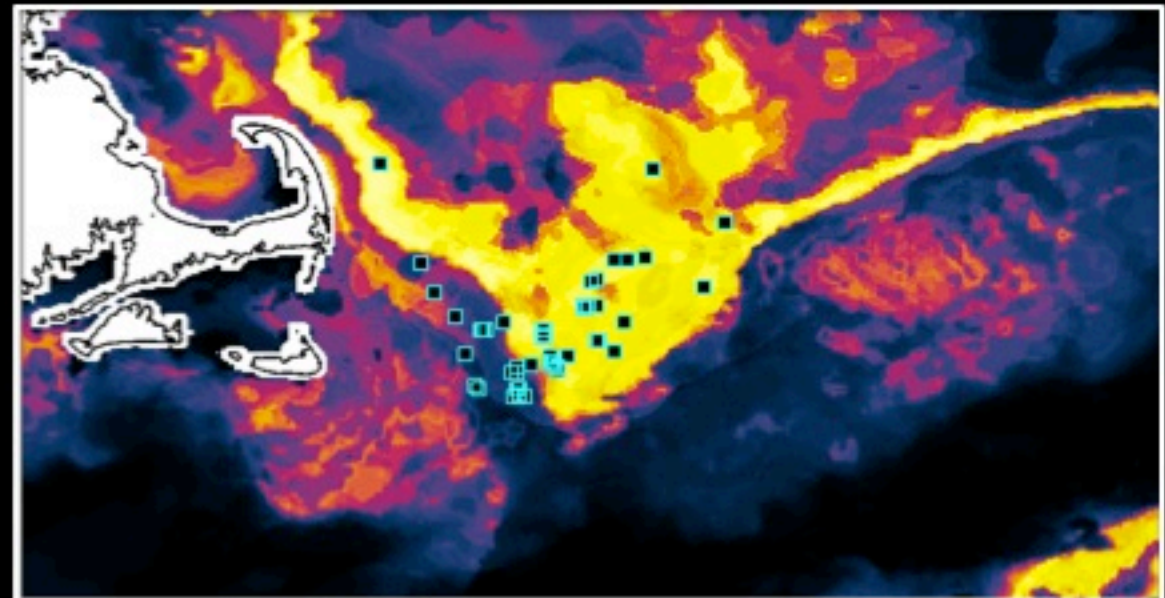
May 1 – May 8

with
Calanus



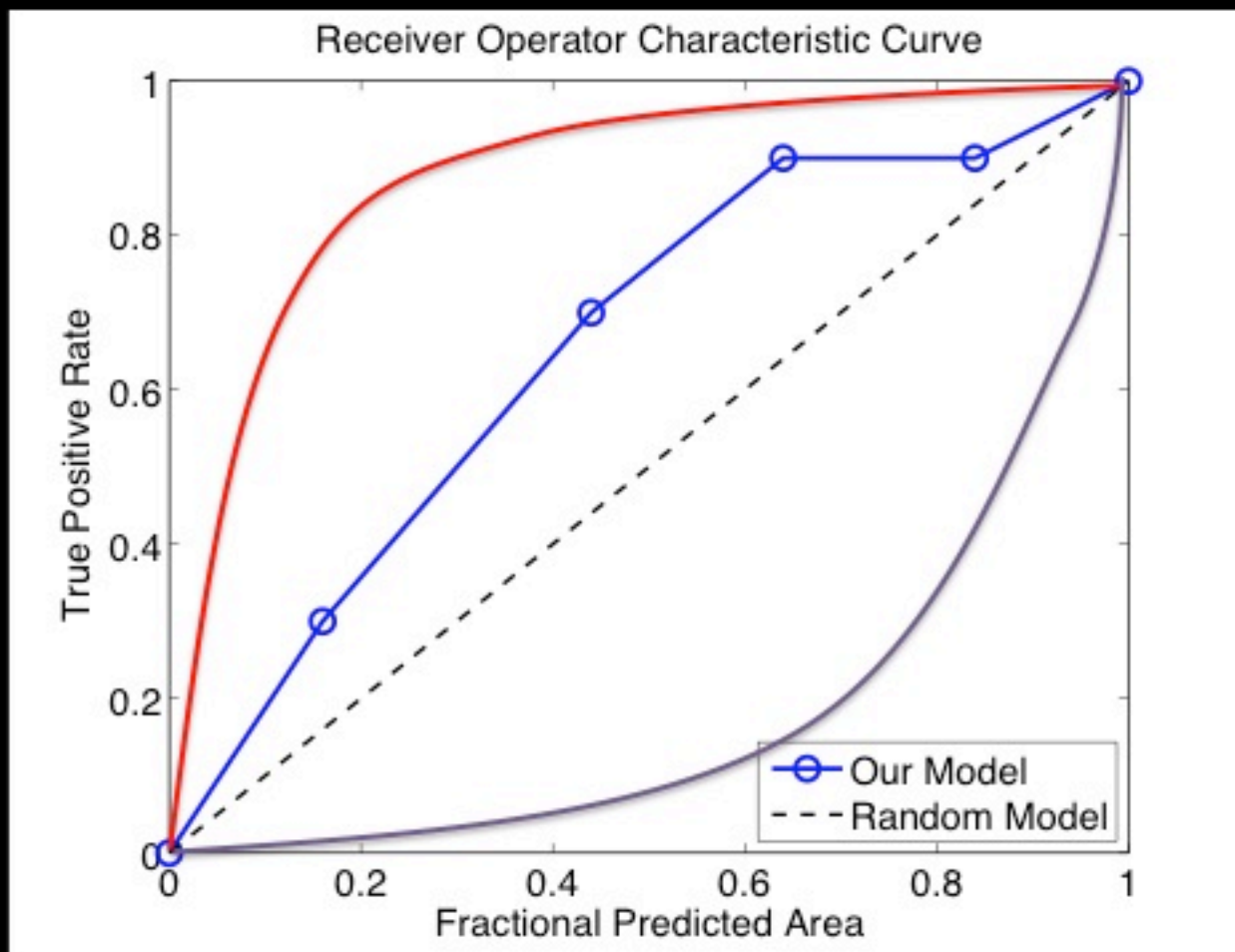
1 = high
suitability

without
Calanus

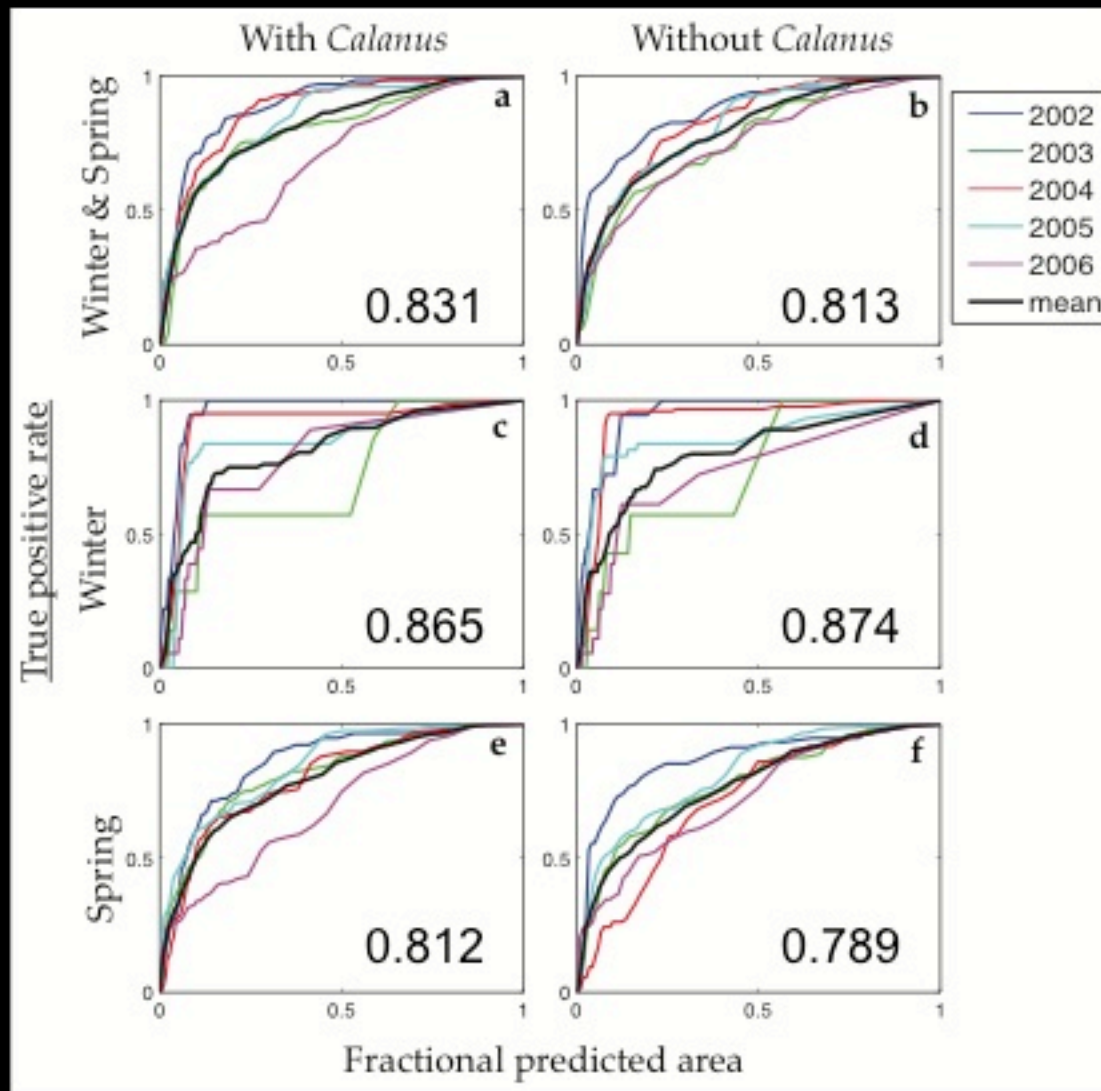


0 = high
suitability

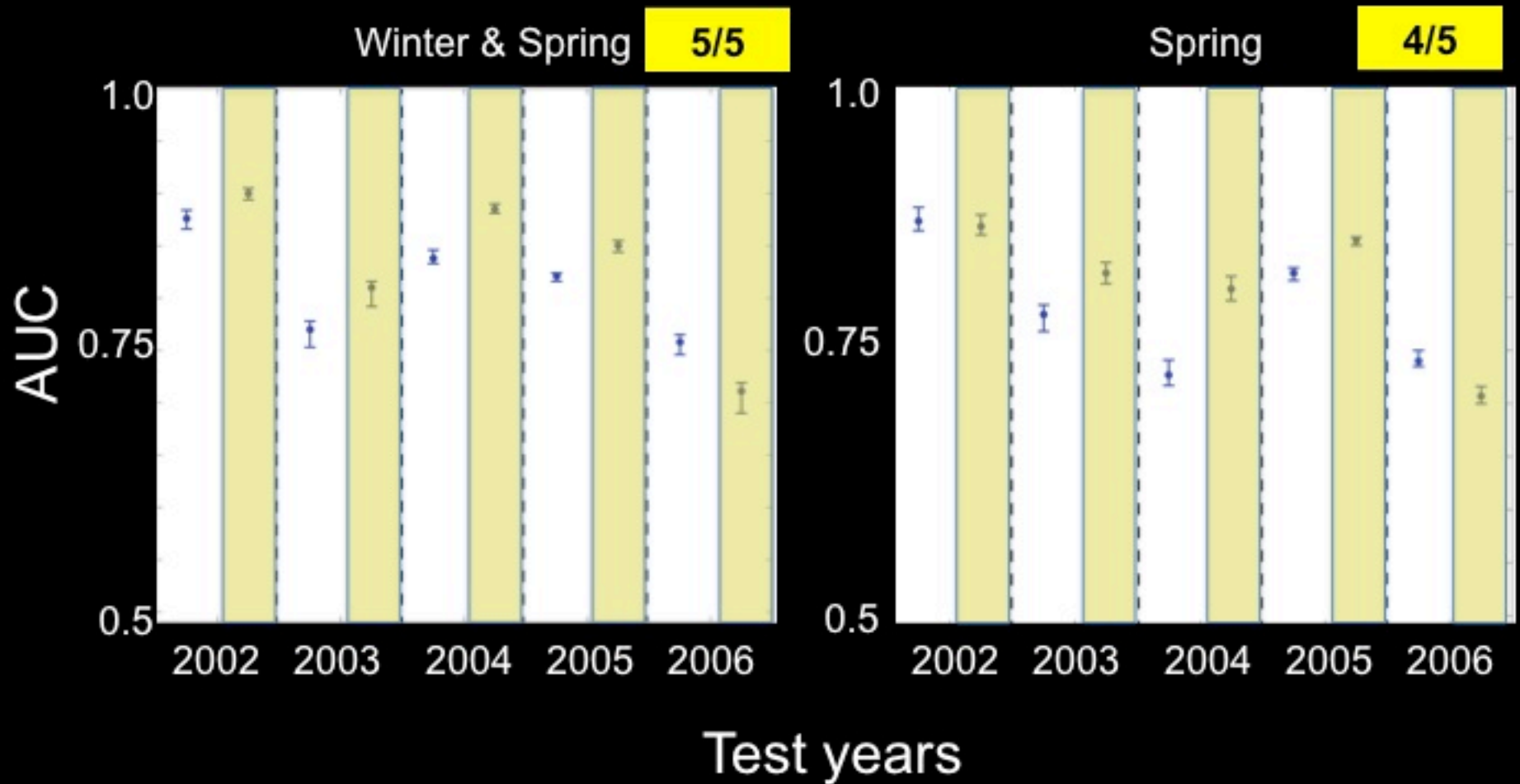
Interpreting ROC



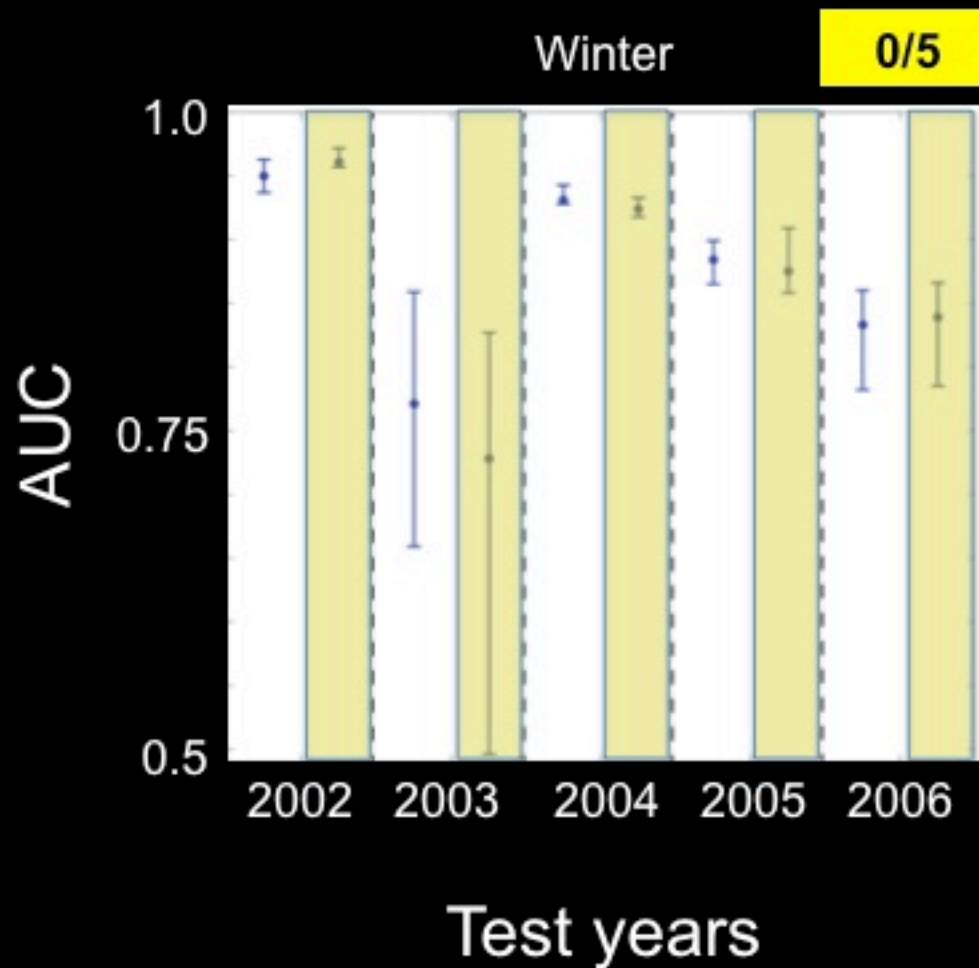
Predictive capacity measured by ROC



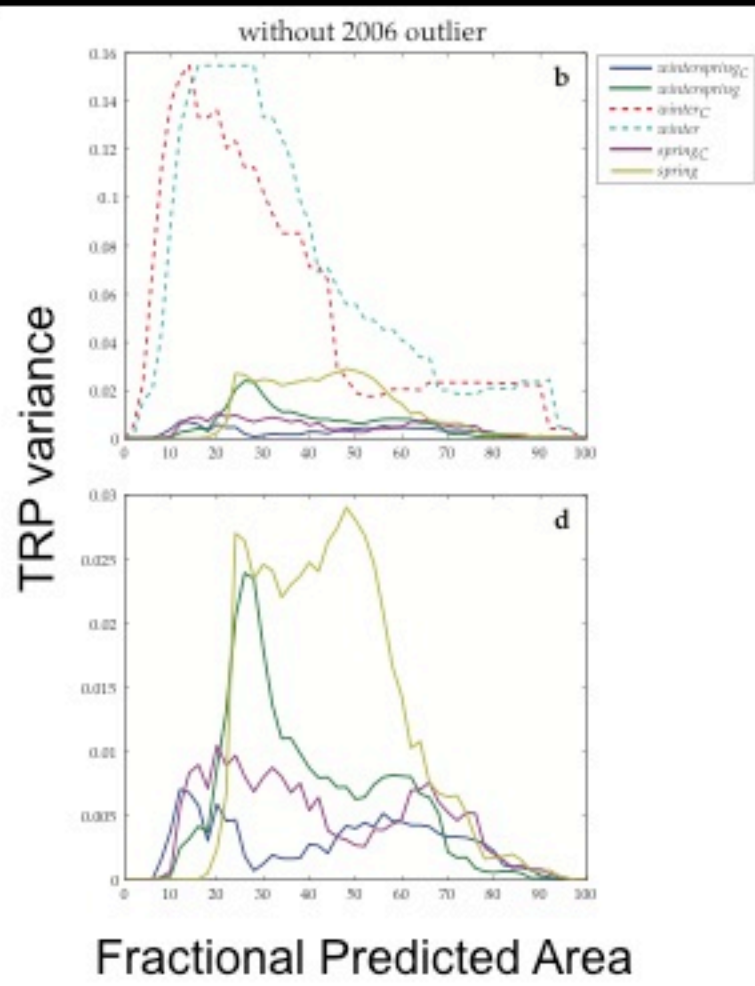
Significance of modeled *Calanus*



Significance of modeled *Calanus*



Model response to Inter-annual environmental variability



Inter-annual variability



Spring withOUT *Calanus*

Winter+Spring withOUT *Calanus*

Spring with *Calanus*

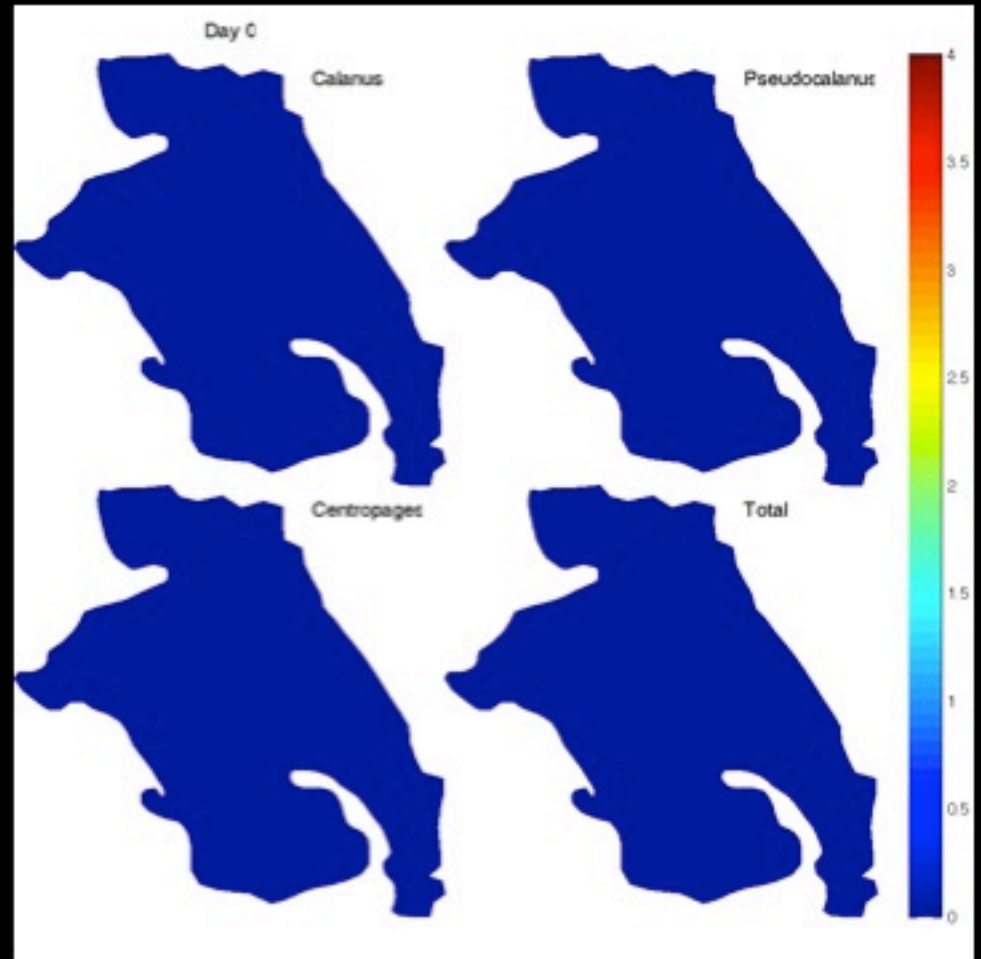
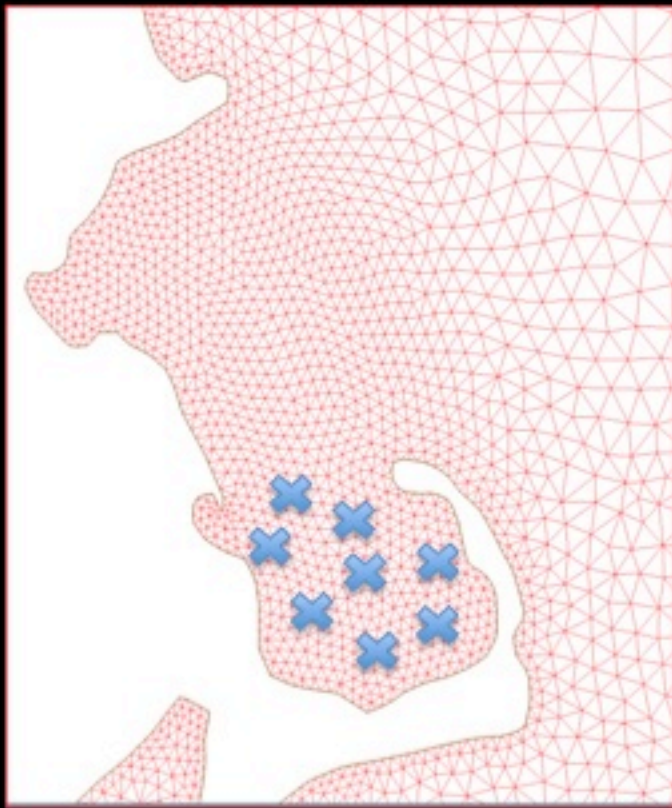
Winter+Spring with *Calanus*

Influence of predictor variables

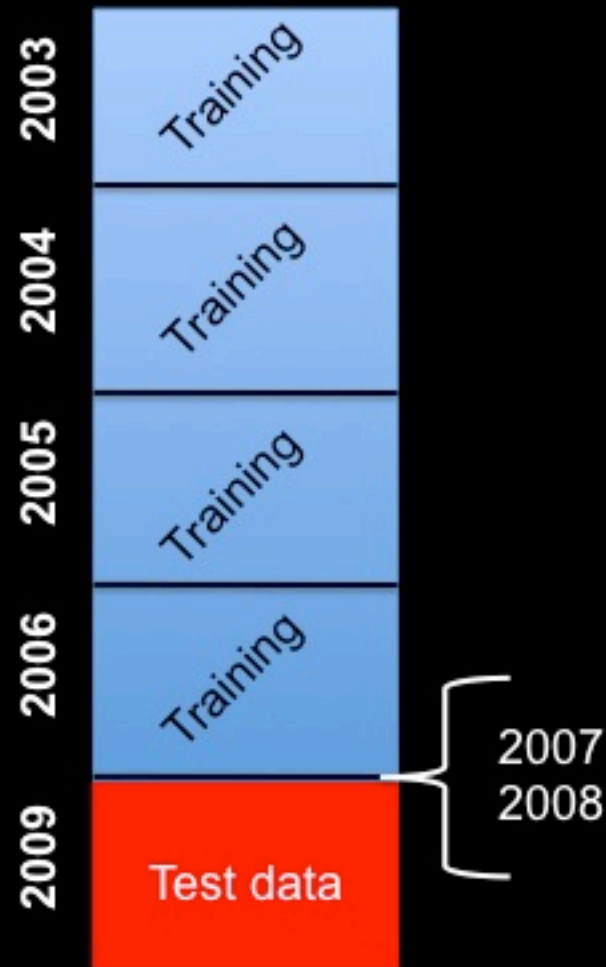
Model ID		A1	A2	B1	B2	C1	C2
Test Year		Winter+Spring w/ <i>Calanus</i>	Winter+Spring wo/ <i>Calanus</i>	Winter w/ <i>Calanus</i>	Winter wo/ <i>Calanus</i>	Spring w/ <i>Calanus</i>	Spring wo/ <i>Calanus</i>
2002	<i>Calanus</i>	35.3	na	10.8	na	45.1	na
	Bathymetry	32.5	42.6	20.7	23.2	34.3	54.3
	Chlorophyll a	19.6	33.7	26.9	33.8	12.1	24.0
	Sea Surface Temperature	12.6	23.7	41.7	43.0	8.4	21.7
2003	<i>Calanus</i>	37.6	na	17.6	na	44.4	na
	Bathymetry	28.5	44.4	21.1	28.2	35.6	57.3
	Chlorophyll	18.5	29.0	26.2	30.3	11.2	21.7
	Sea Surface Temperature	15.4	26.6	35.1	41.6	8.8	21.0
2004	<i>Calanus</i>	36.9	na	18.7	na	35.7	na
	Bathymetry	31.8	48.4	22.7	26.3	38.6	56.7
	Chlorophyll	18.0	27.7	24.6	30.0	14.2	22.9
	Sea Surface Temperature	13.4	23.9	34.0	43.7	11.4	20.4
2005	<i>Calanus</i>	33.2	na	15.4	na	42.5	na
	Bathymetry	31.6	45.0	20.6	26.7	39.0	60.6
	Chlorophyll	19.2	35.0	24.3	27.9	11.4	21.4
	Sea Surface Temperature	16.0	25.0	39.6	45.3	7.1	18.1
2006	<i>Calanus</i>	40.9	na	16.9	na	46.3	na
	Bathymetry	31.0	47.7	22.9	26.5	34.9	61.4
	Chlorophyll	15.8	27.8	22.6	31.4	11.6	20.7
	Sea Surface Temperature	12.3	24.4	37.6	42.1	7.10	17.9

Copepod models embedded in high resolution circulation model

FVCOM



Prediction into 2009



Conclusions

- Weekly estimates of habitat suitability can be made with reasonable accuracy
- Modeled *Calanus* provides significant improvement
- Transition between critical habitats observable
- Temporal rather than spatial management in CCB
- Continued Zpltn and right whale surveys are critical
- Assimilating whale survey could be the next step

