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Review of Species Distribution Modeling in the Northeast U.S. Continental Shelf Ecosystem

PICES Workshop

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Acknowledgements

This summary represents the joint work of a number of excellent people (40+)

Thank you to each one.



Outline

- Review of efforts to date
- Uncertainty
- Lessons Learned
- Next Steps

Species:

Climate Models:

Climate Scenarios:

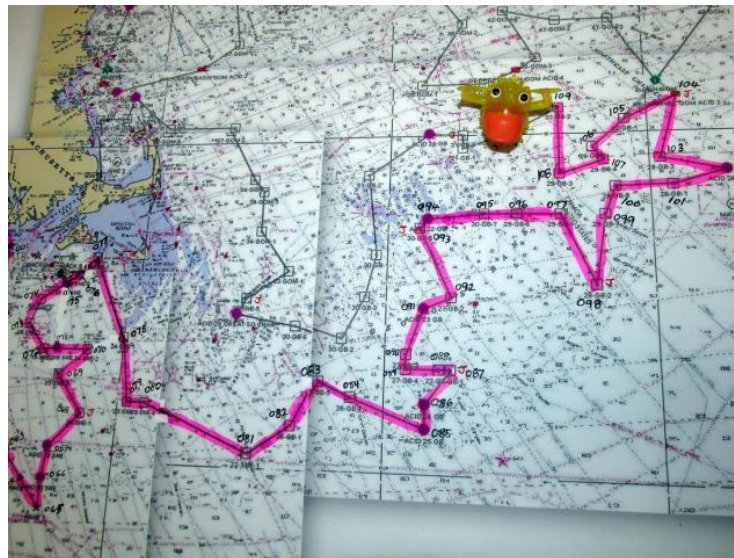
SDM Approach:

SDM Data:

SDM Independent:

SDM Dependent:

Notes:



Fogarty et al. (2008) Mitig Adapt Strat Glob Change

Species: Atlantic Cod

Climate Models: 3

Climate Scenarios: 2

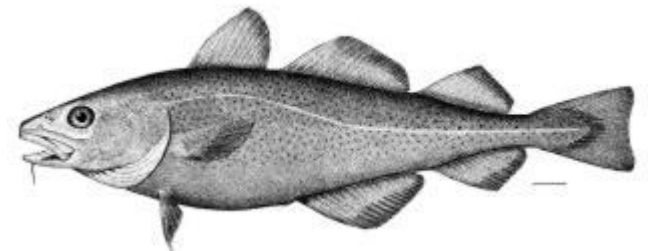
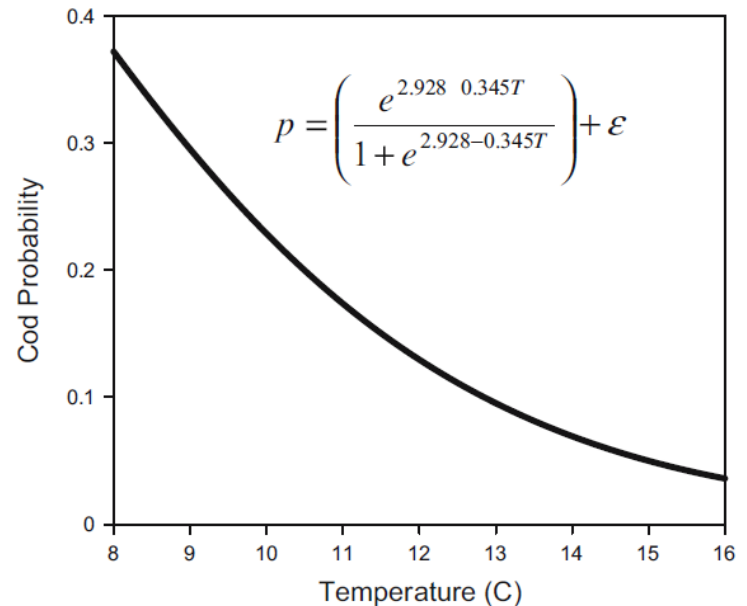
SDM Approach: logistic regression

SDM Dependent: presence/absence

SDM Independent: bottom temp

SDM Data: NEFSC Trawl Survey

Notes: also modeled productivity



Hare et al. (2010) Ecol Appl

Species: Atlantic croaker

Climate Models: 15

Climate Scenarios: 3

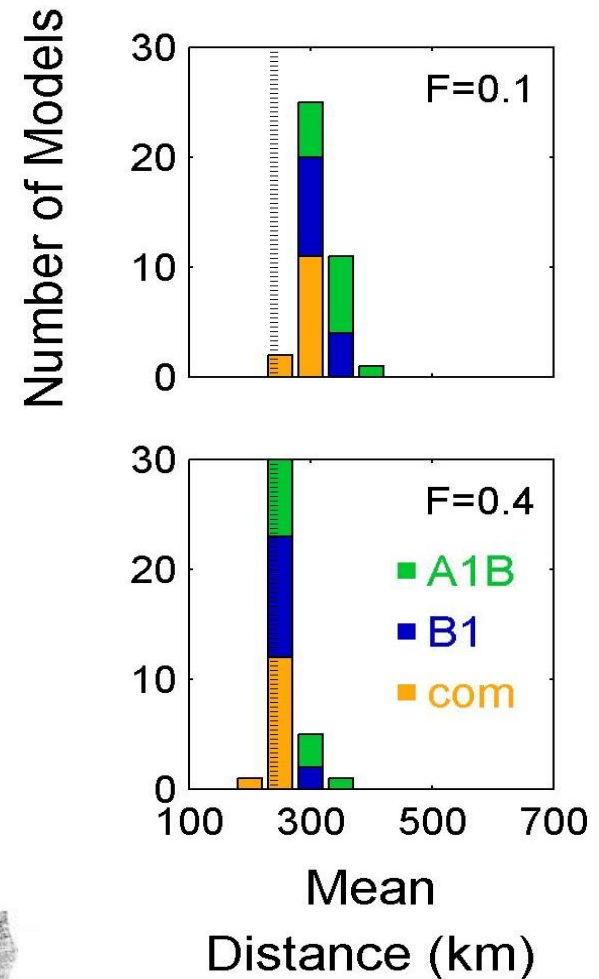
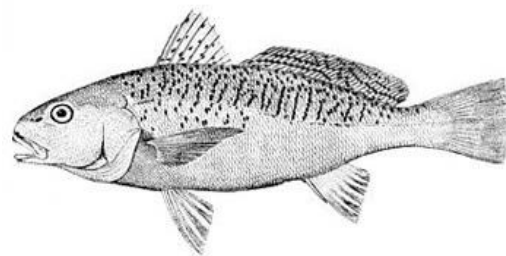
SDM Approach: multiple regression

SDM Dependent: center of mass

SDM Independent: winter temp

SDM Data: NEFSC Trawl Survey

Notes: also modeled productivity



Hare et al. (2012) ICES JMS

Species: Cusk

Climate Models: 8

Climate Scenarios: 3

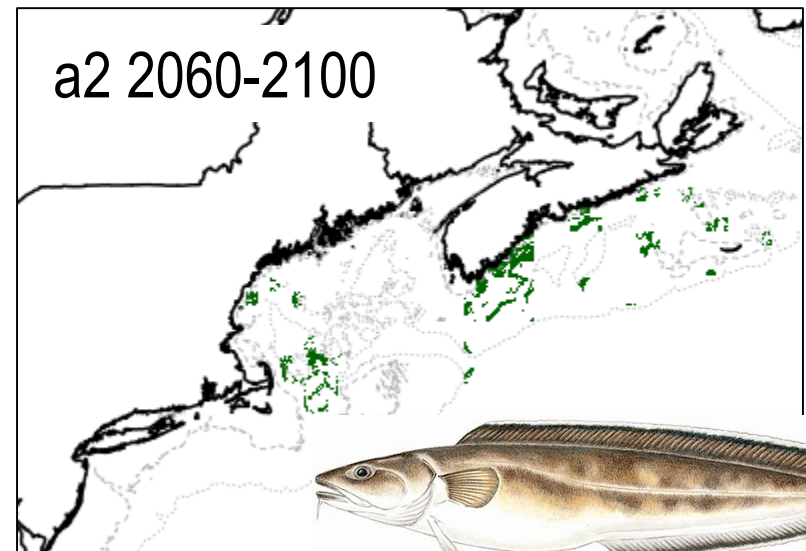
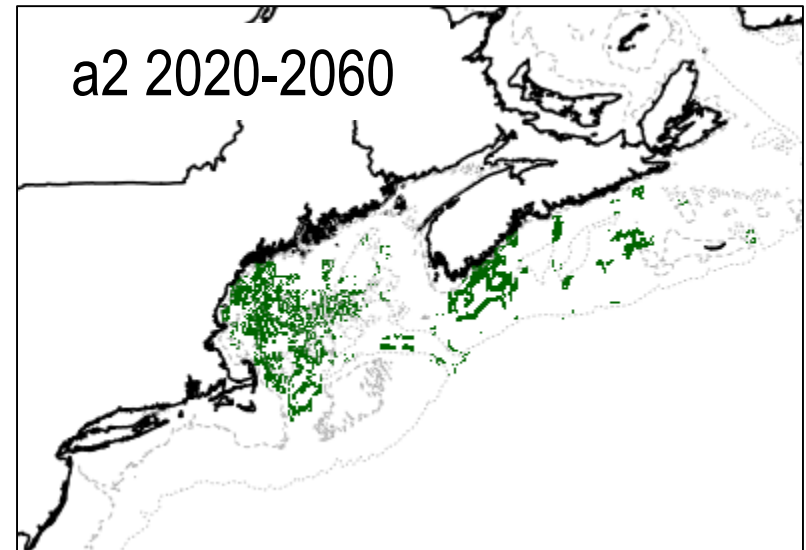
SDM Approach: GAM

SDM Dependent: presence/absence

SDM Independent: bottom temp & bottom roughness

SDM Data: NEFSC & DFO Trawl Survey

Notes: evaluated other distribution metrics (e.g., patchiness)



Lynch et al. (2014) ICES JMS

Species: 2 species of river herring

Climate Models: 8

Climate Scenarios: 3

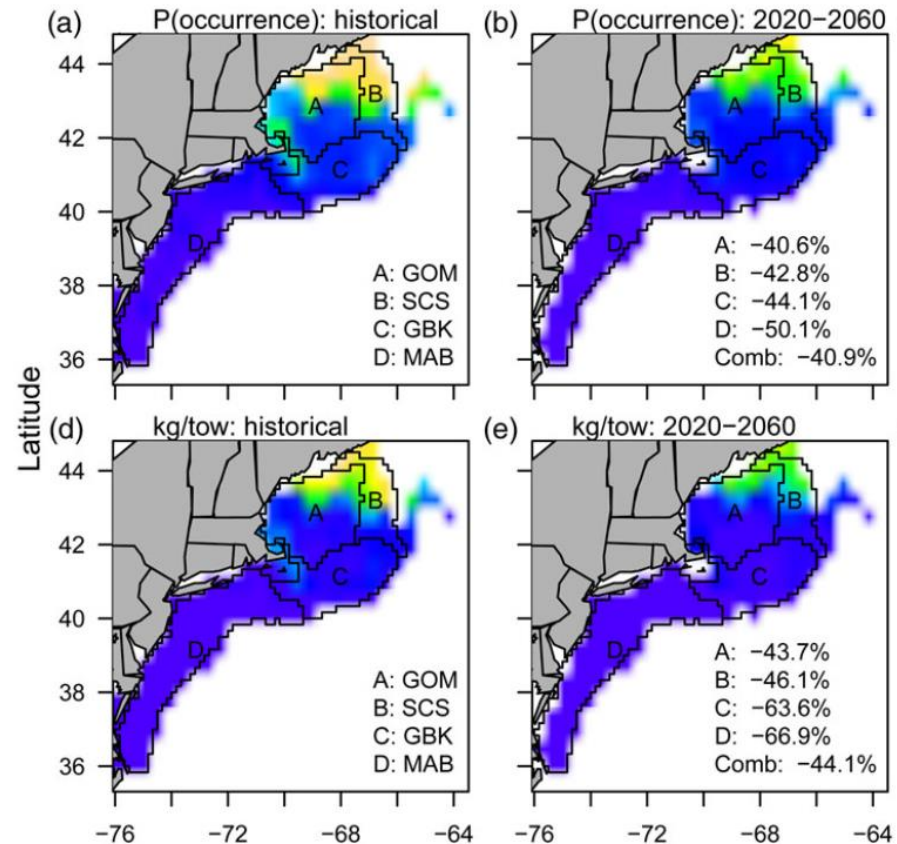
SDM Approach: delta GAM

SDM Dependent:
presence/absence & abundance

SDM Independent: bottom temp &
surface temperature

SDM Data: NEFSC Trawl Survey

Notes: included abundance as
covariate



Kleisner et al. (in review) Prog. Oceanogr.

Species: ~70

Climate Models: 1

Climate Scenarios: 1

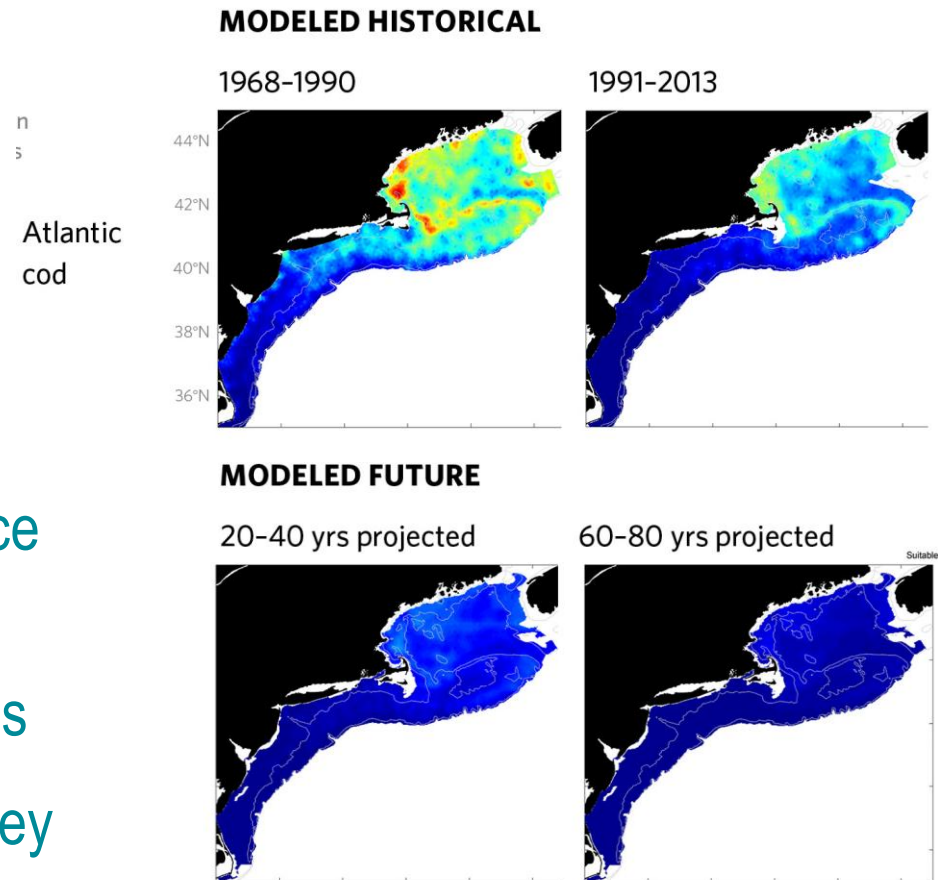
SDM Approach: delta GAM

SDM Dependent:
presence/absence & abundance

SDM Independent: surface &
bottom temp, bottom roughness

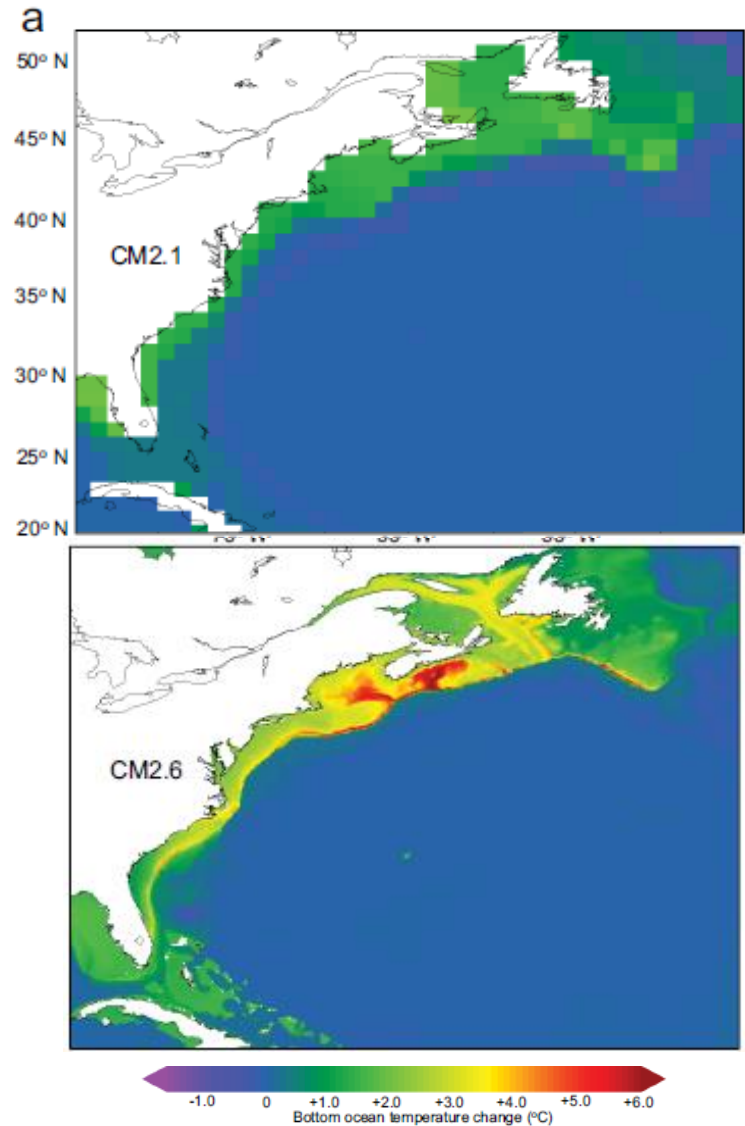
SDM Data: NEFSC Trawl Survey

Notes: included abundance as
covariate



Saba et al. (2015) JGR Oceans

- Kleisner et al. (in review) used GFDL high resolution global model
- Previous studies used standard global models downscaled as a delta relative to a climatology
- High resolution model projects changes in circulation warming



Hare et al. (2016) PLoS ONE

Species: 82

Climate Models: 27

Climate Scenarios: 1

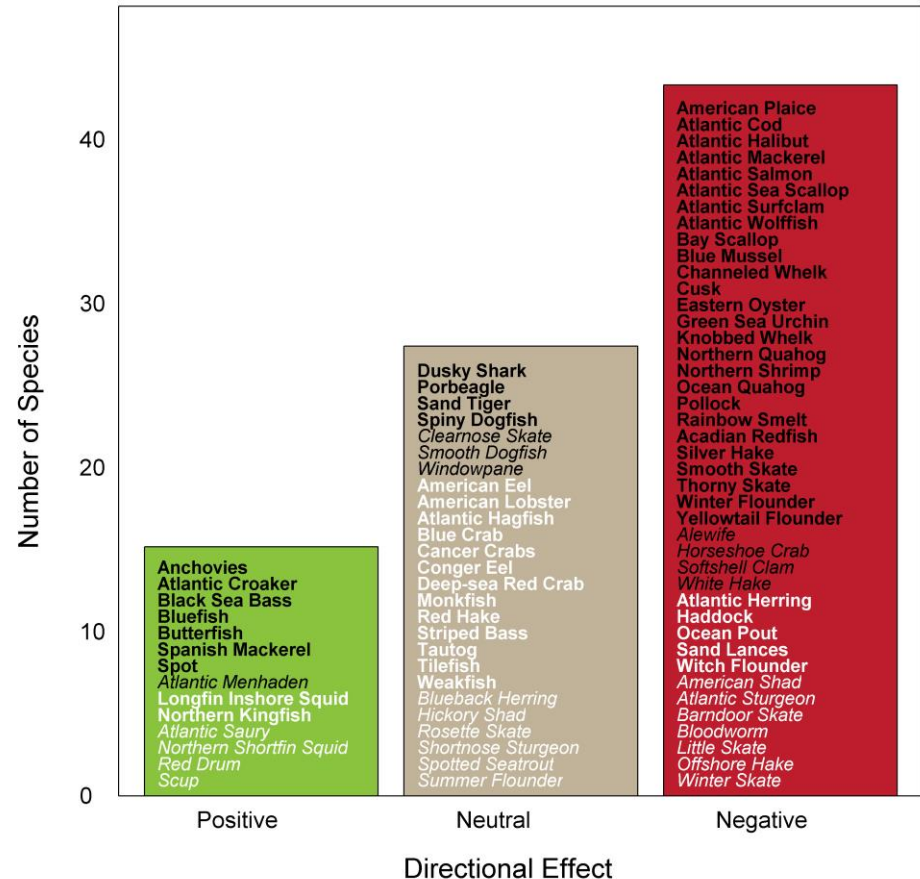
Approach: expert opinion

SDM Dependent: positive or negative effect

SDM Independent: 14 climate variables

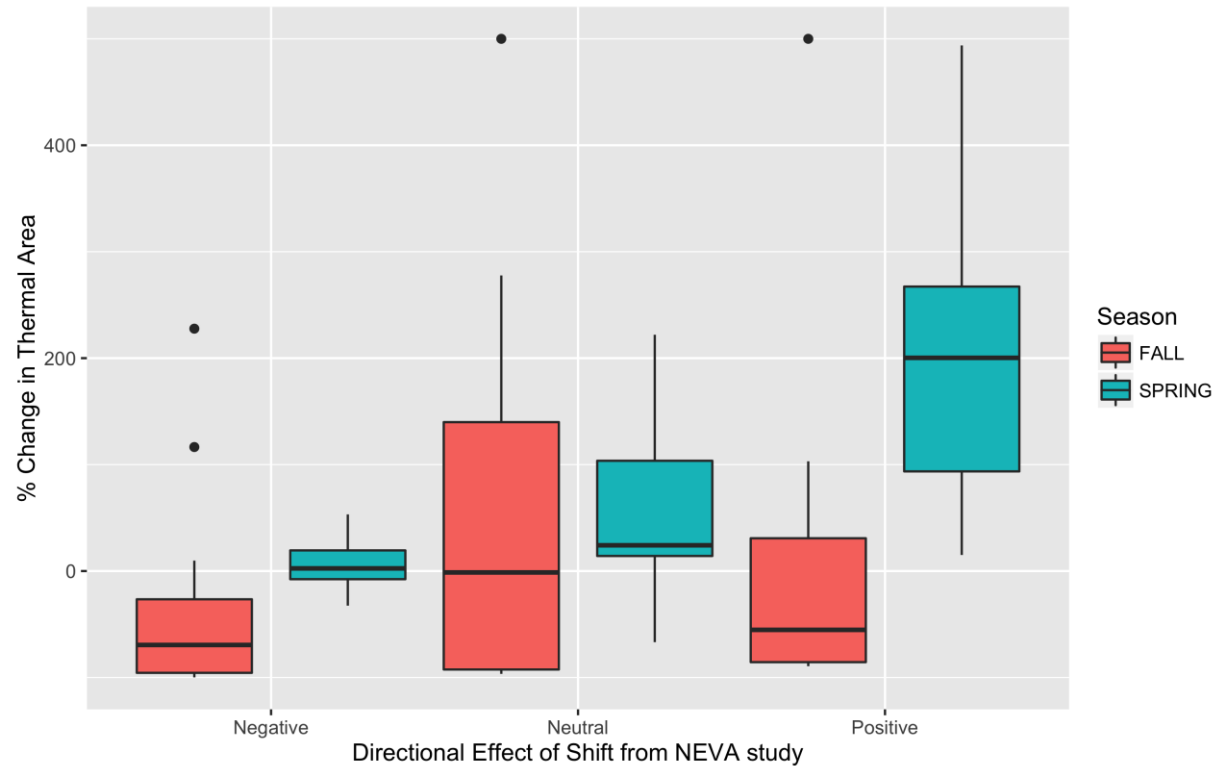
Data: all available

Notes: vulnerability assessment framework



SDM v Expert Opinion

- SDM approaches and expert opinion agreed for spring not fall
- Seasonal dynamics important



Shackell et al. (2014) PLoS One

Species: ~46

Climate Models: not direct

Climate Scenarios: 2

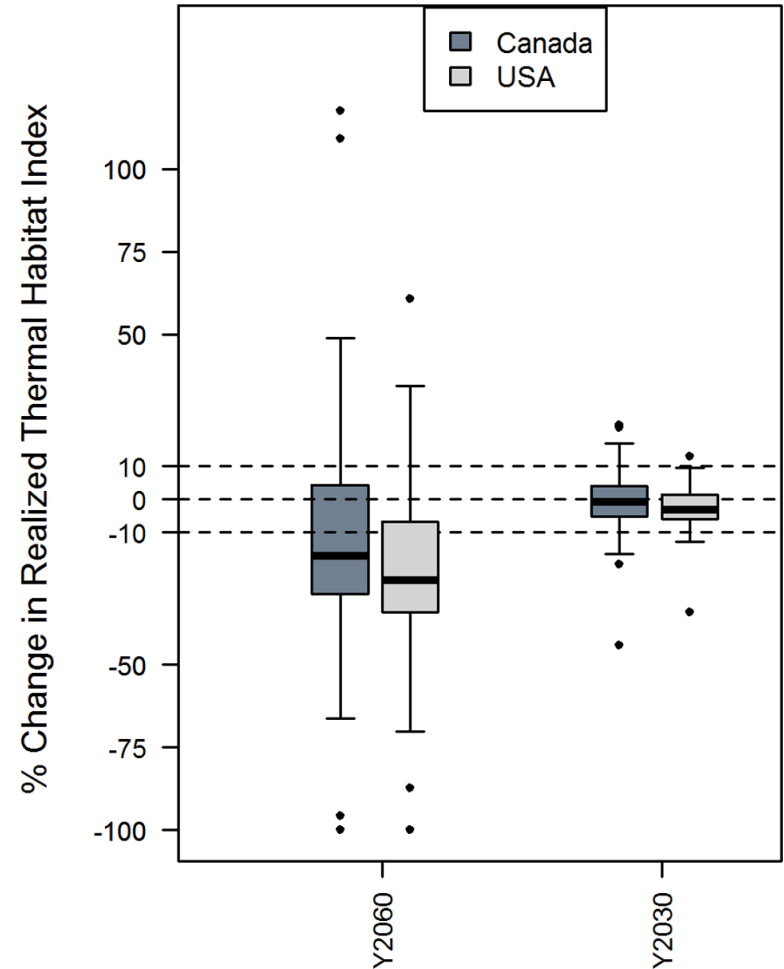
SDM Approach: binomial GAM

SDM Dependent:
presence/absence

SDM Independent: surface &
bottom temp

SDM Data: DFO & NEFSC Trawl
Survey

Notes:



Hare et al. (2012) PLoS ONE

Parameter x SDM
x 14 models x 3
scenarios x 3 time
periods

Uncertainty is in
biological
models

Table 3. Percent variance in estimate of gray snapper northern range attributable to different factors.

Parameter	Percent Variance
Thermal Tolerance Estimate	65.3
Mapping to Latitude	20.8
Unexplained Error	6.0
Time Period	5.6
Scenario	1.8
Model	0.5
Statistical Downscaling	0.0



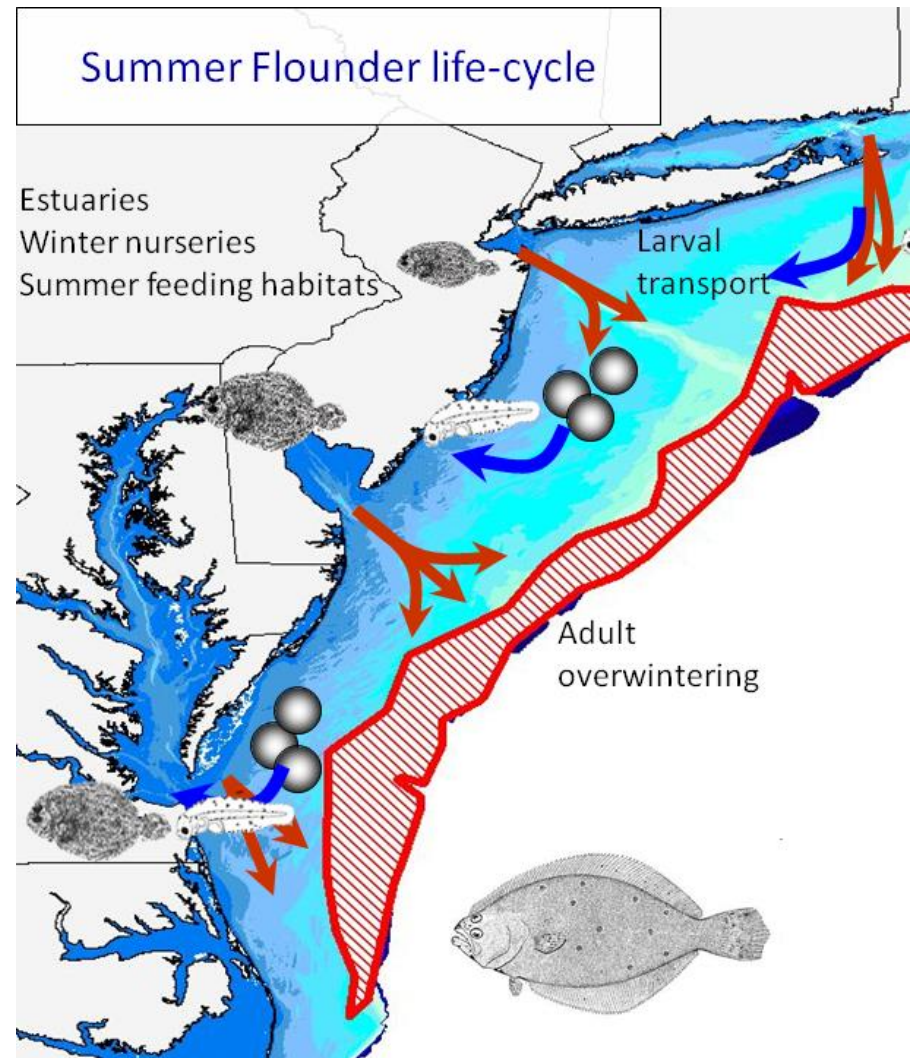
Lessons

- Most SDMs focus on uncertainty resulting from climate models; yet most uncertainty is likely in statistical functions used to describe biological distribution
- Abundance and by extension fishing has a large influence on distribution
- Expert opinion can be comparable to statistical SDM
- Visualization



Next Steps

- Uncertainty
- Other data
- Seasonal migration
- Life history connectivity
- Process-based models
- Species interactions
- High-resolution climate models or dynamical downscaling



Next Steps

- Social and economic effects (Cooley et al., 2015; Colburn et al., 2016; Kleisner et al., in review, others)
- Management (e.g., ESA Decisions, MAFMC EAFM Guidance, Pinsky et al. COCA)
- Fishing scenarios
 - Complicated fleet dynamics in the Northeast U.S.



ICES Theme Session

Projected impacts of climate change on marine ecosystems, wild captured and cultured fisheries, and fishery dependent communities

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Fort Lauderdale, Florida, US

