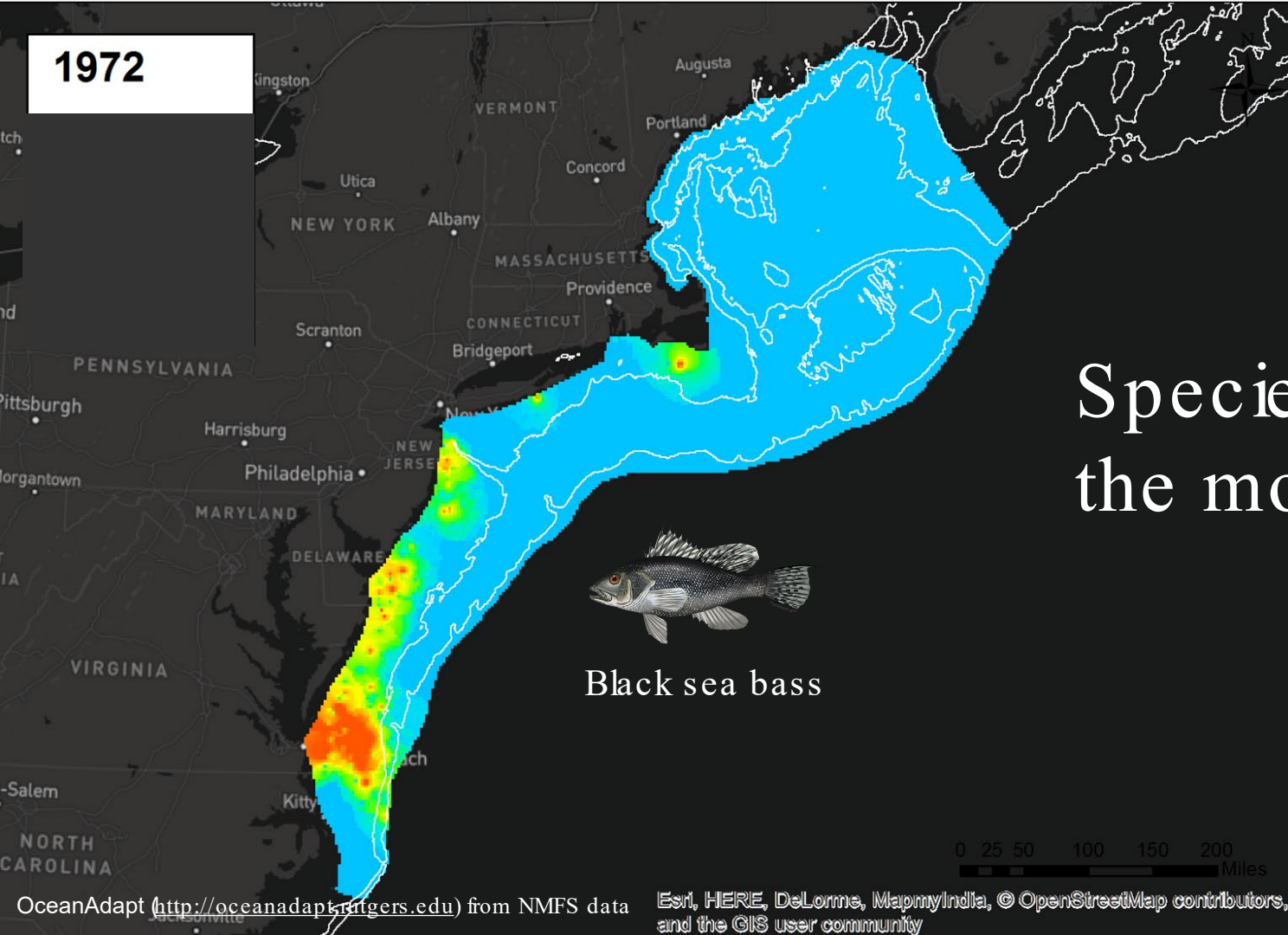


Short-term forecasts of species distributions for fisheries management

Malin Pinsky, Rutgers University
Alexa Fredston, University of California Santa Cruz
Brandon Muffley, Mid-Atlantic Fishery Management Council



1972



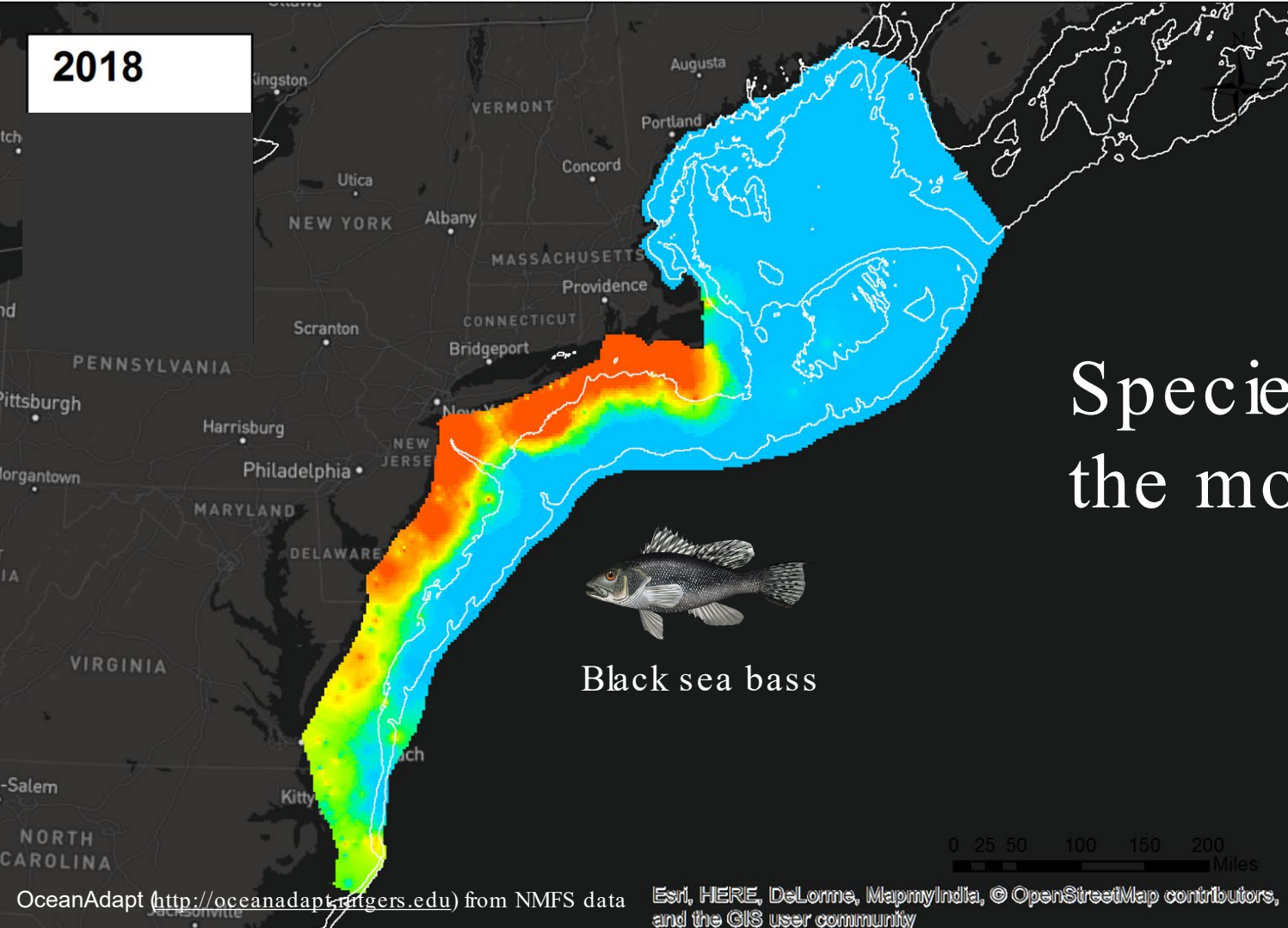
Species are on
the move



Black sea bass

0 25 50 100 150 200
Miles

2018



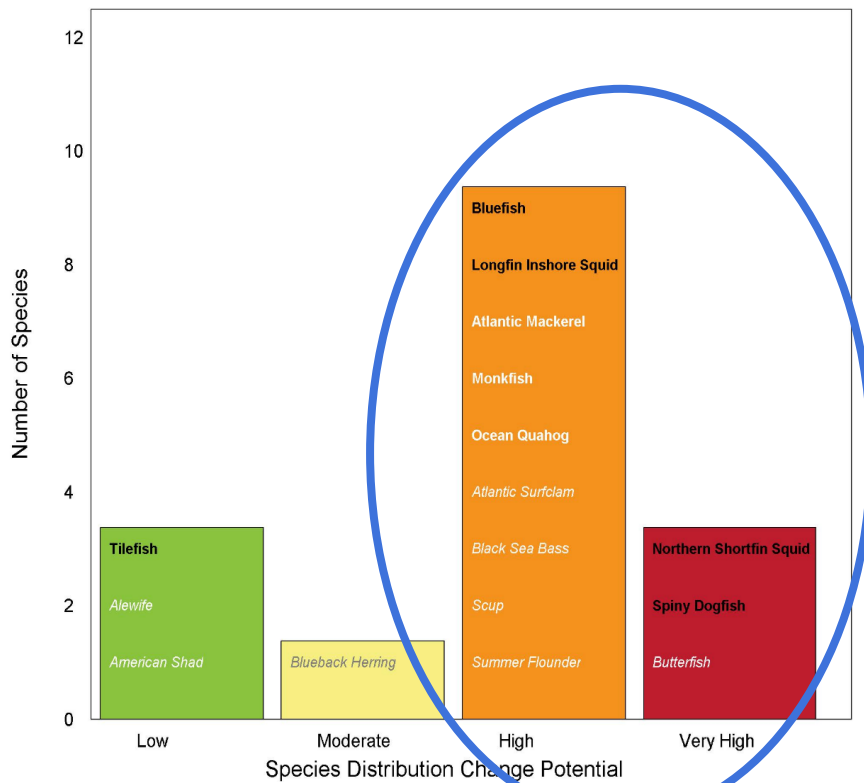
Species are on
the move



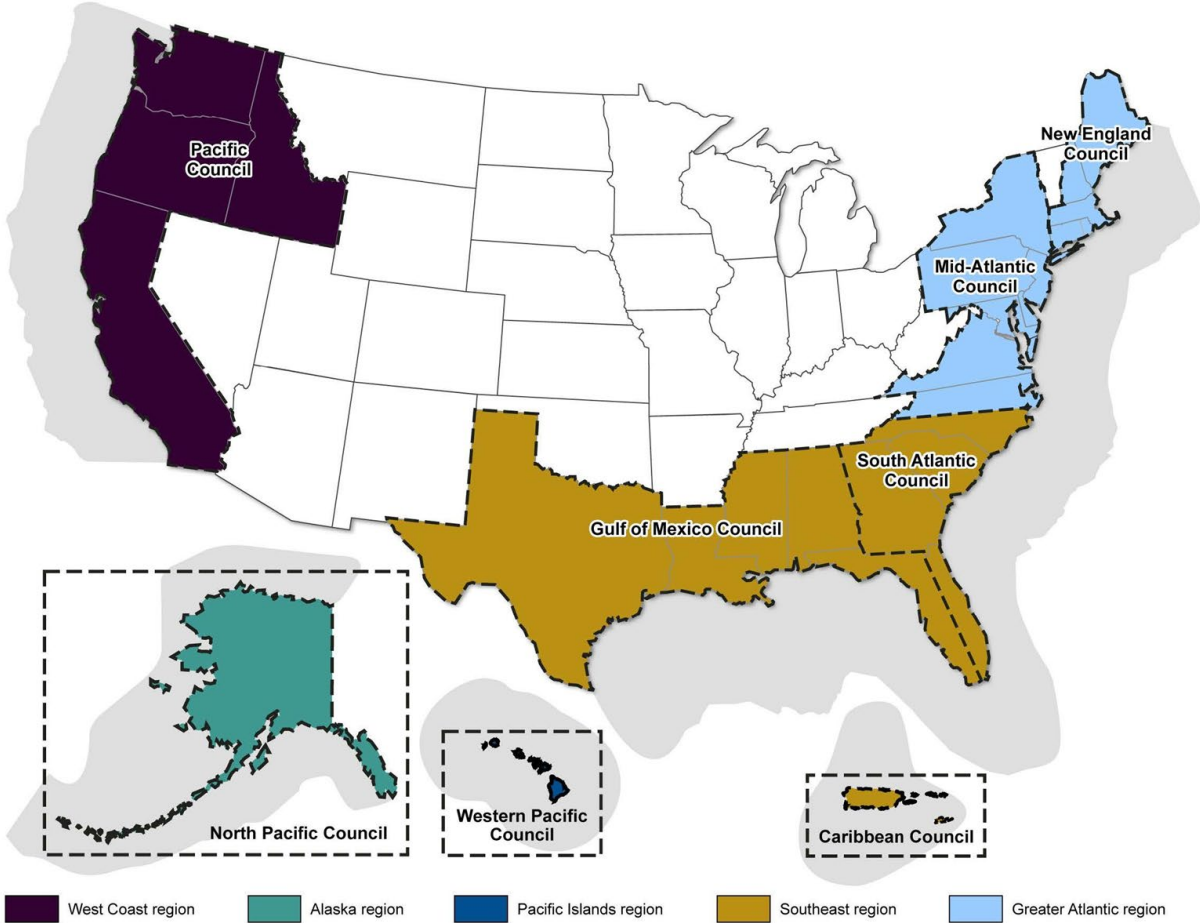
Black sea bass

0 25 50 100 150 200
Miles

Potential change in species distribution



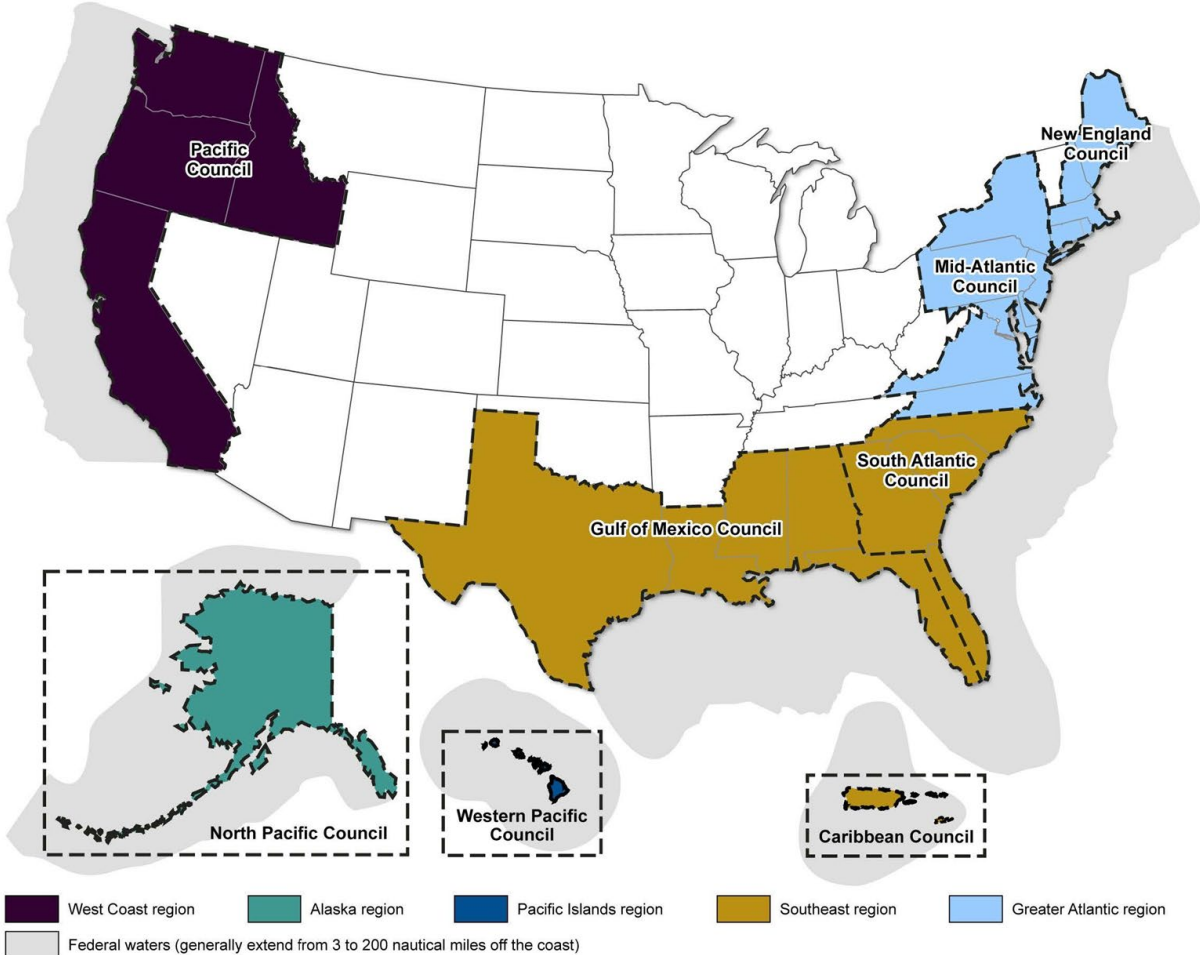
Fisheries management requires knowing where fish are



Sources: National Marine Fisheries Service, *Fisheries of the United States, 2014* (data); Map Resources (map). | GAO-16-827

Fisheries management requires knowing where fish are

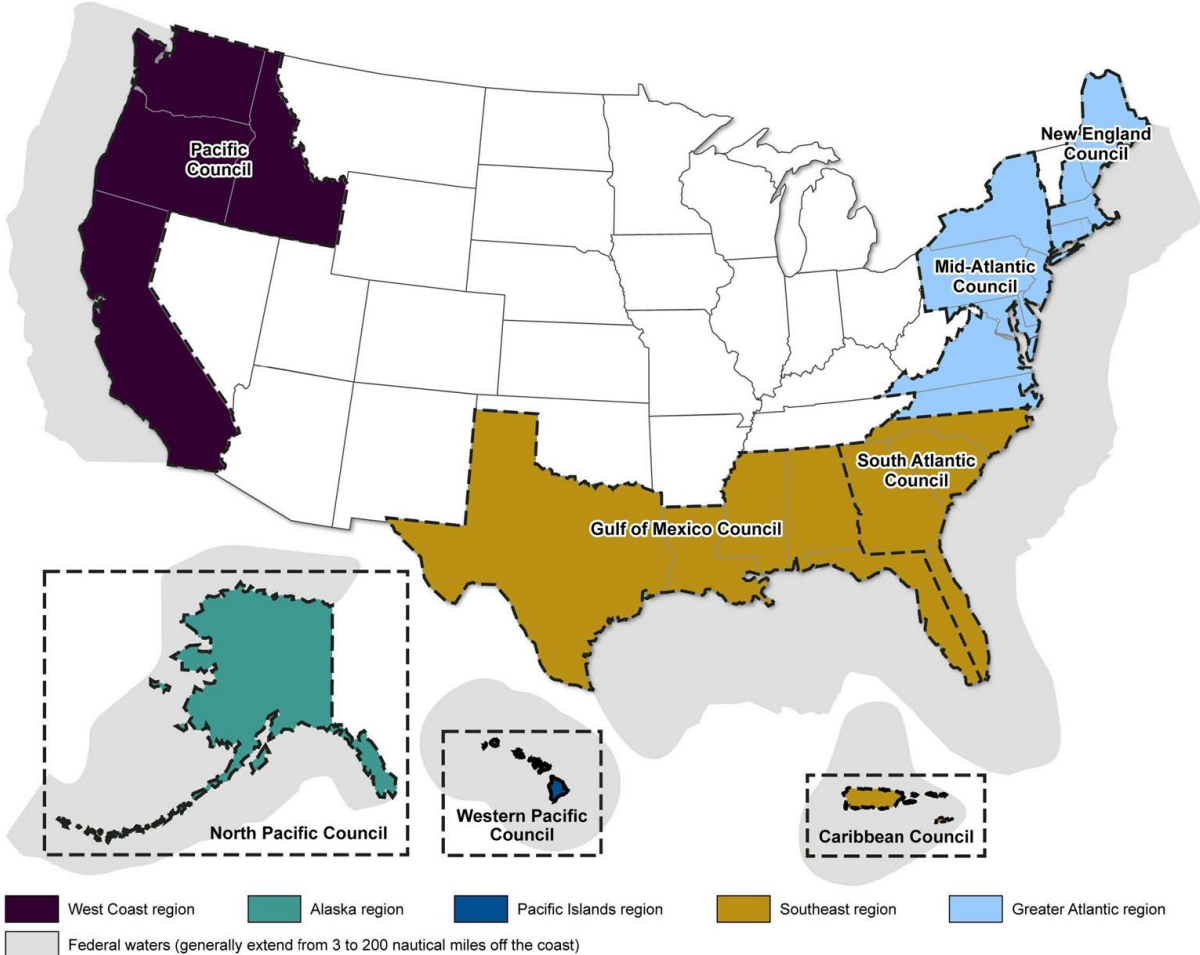
- Stock definitions



Sources: National Marine Fisheries Service, *Fisheries of the United States, 2014* (data); Map Resources (map). | GAO-16-827

Fisheries management requires knowing where fish are

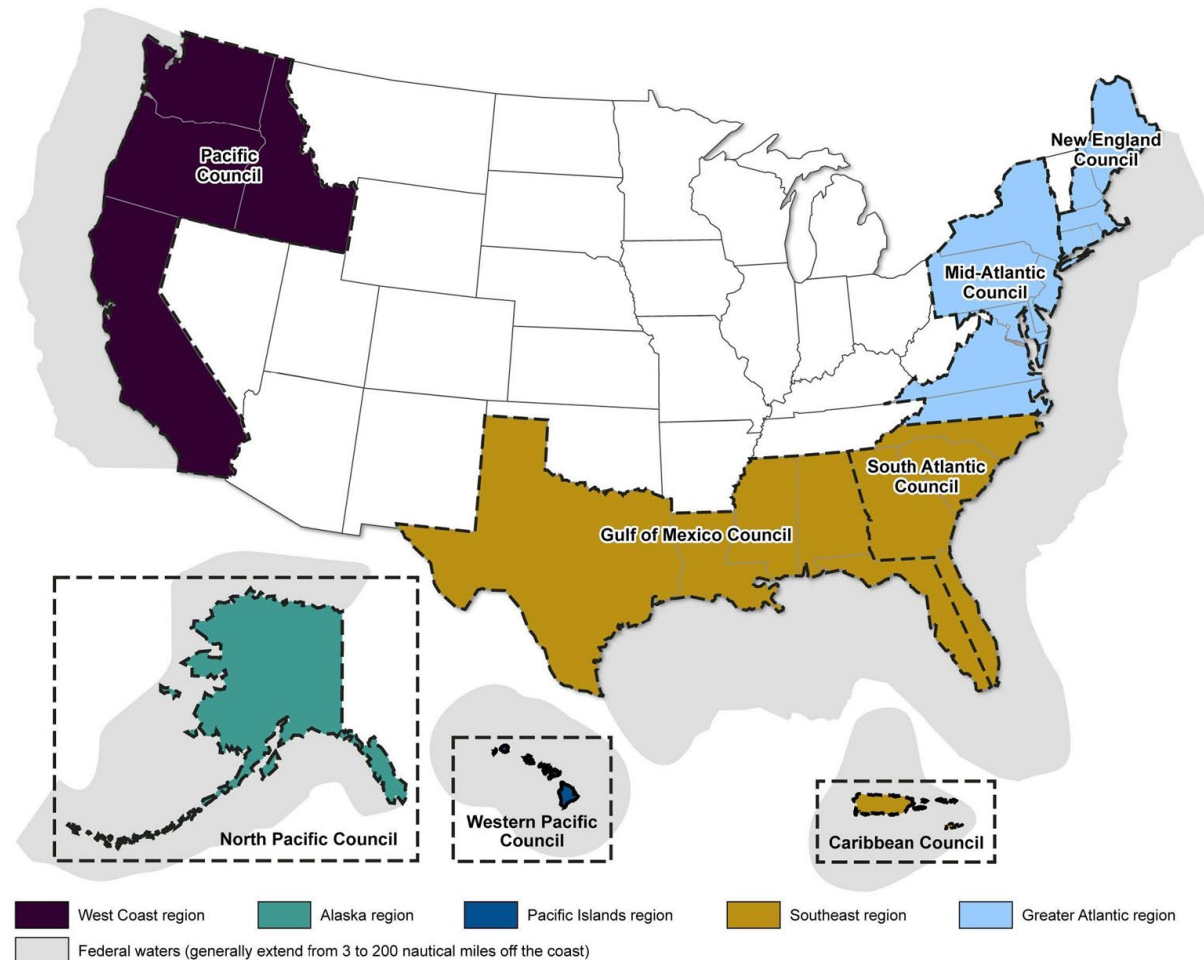
- Stock definitions
- Stakeholder representation



Sources: National Marine Fisheries Service, *Fisheries of the United States, 2014* (data); Map Resources (map). | GAO-16-827

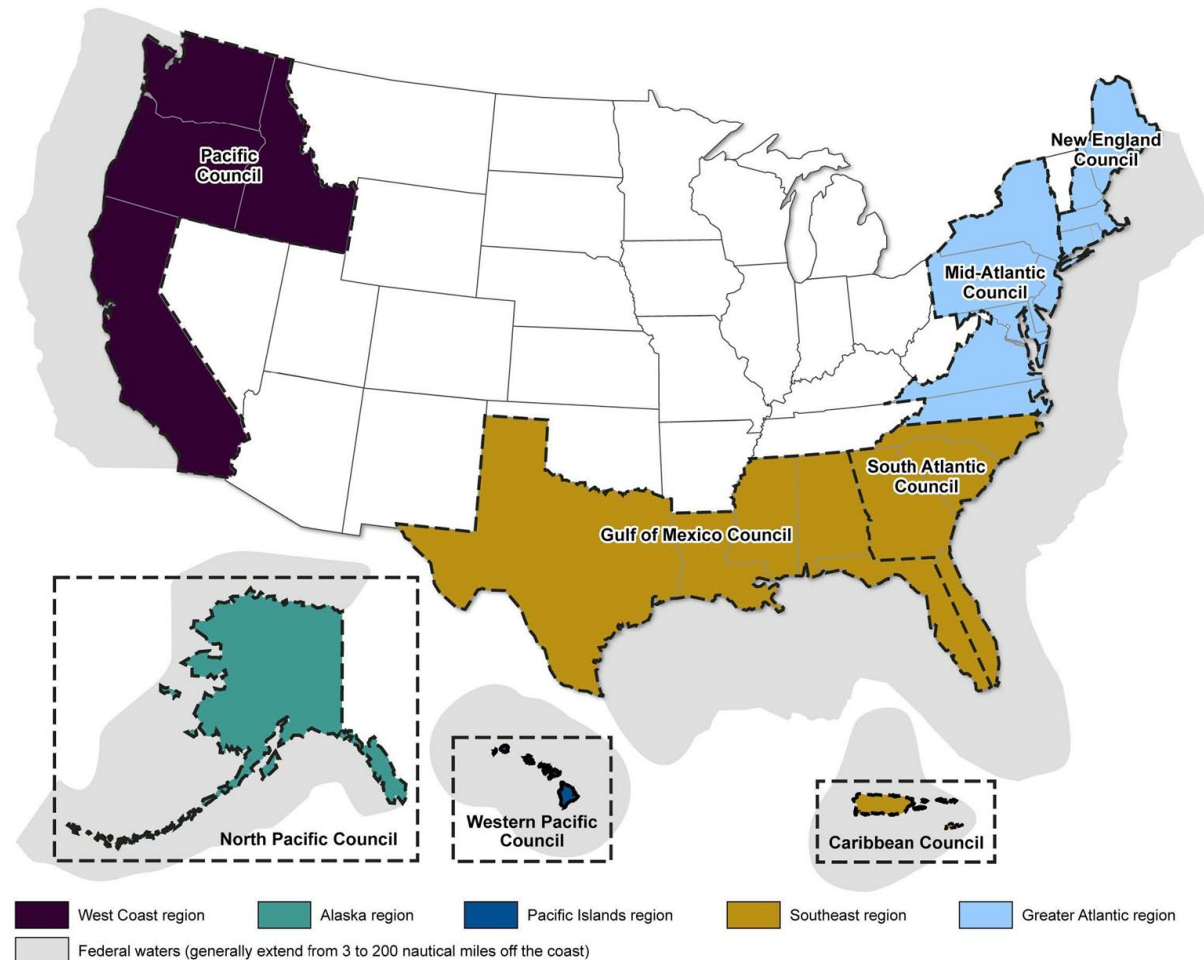
Fisheries management requires knowing where fish are

- Stock definitions
- Stakeholder representation
- Spatial management



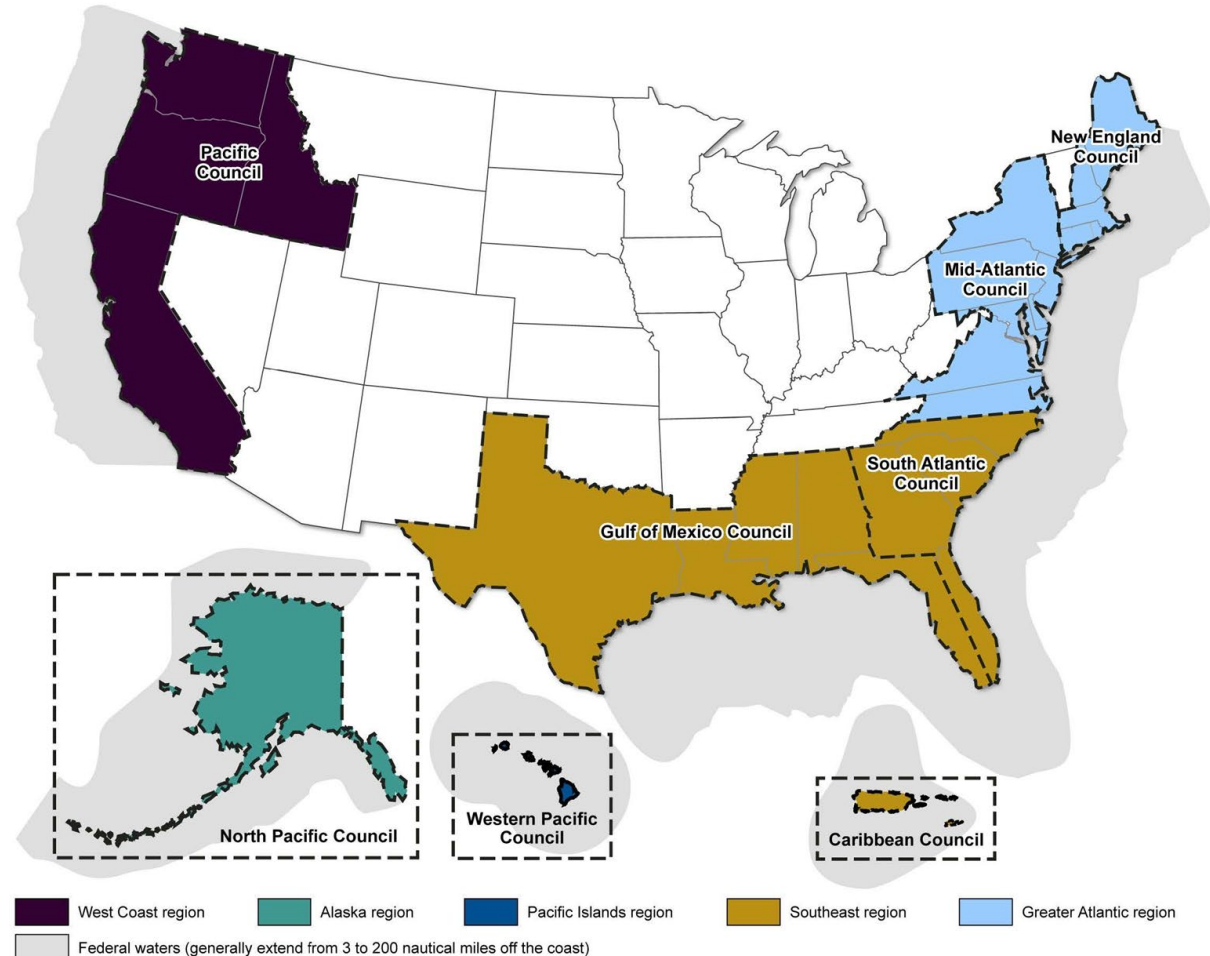
Fisheries management requires knowing where fish are

- Stock definitions
- Stakeholder representation
- Spatial management
- Incidental catch



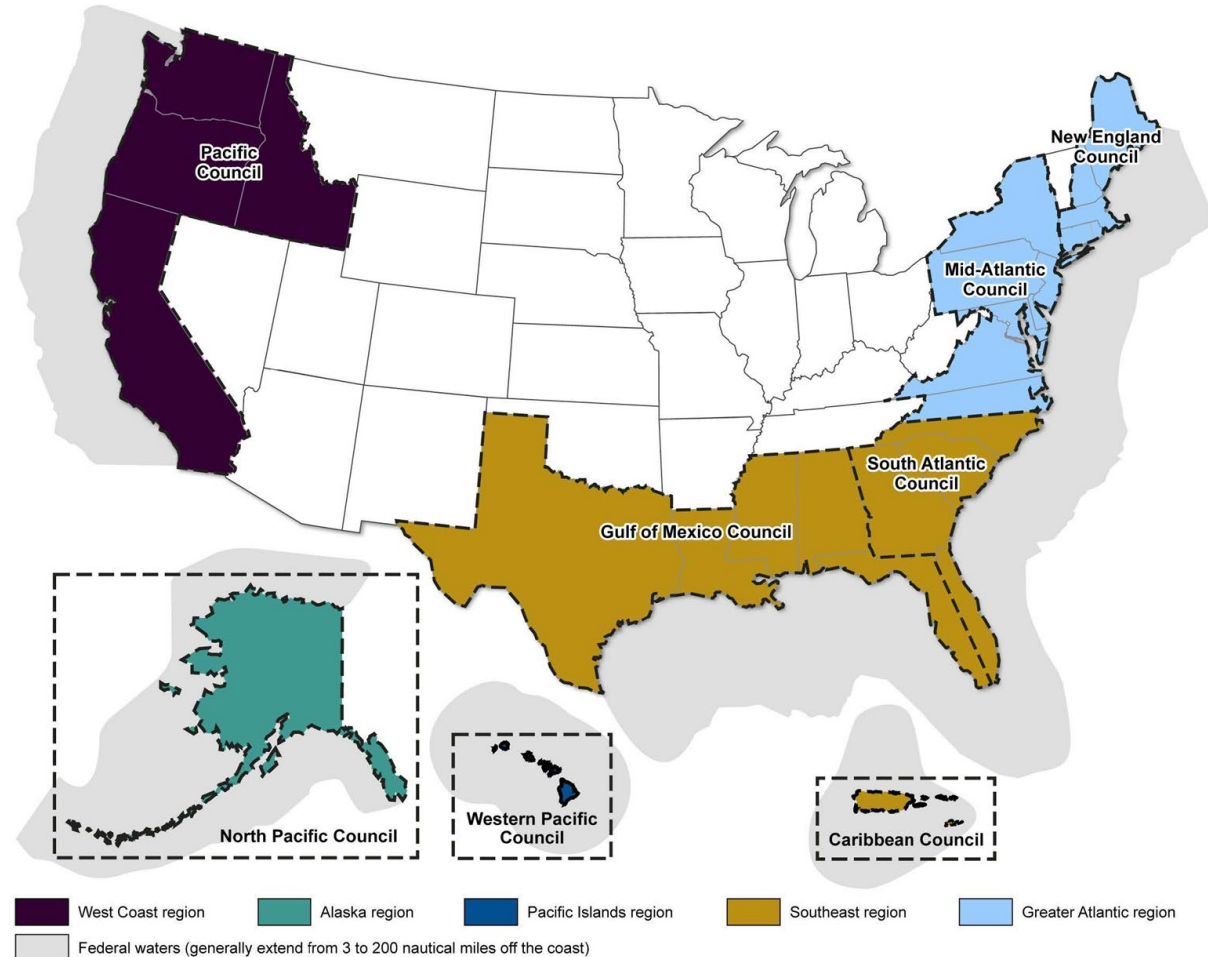
Fisheries management requires knowing where fish are

- Stock definitions
- Stakeholder representation
- Spatial management
- Incidental catch
- New fishery species



Fisheries management requires knowing where fish are

- Stock definitions
- Stakeholder representation
- Spatial management
- Incidental catch
- New fishery species
- Allocations



Research questions

1. Can dynamic range models **forecast** changes in species distributions?

Research questions

1. Can dynamic range models forecast changes in species distributions?
2. At what **time-scales** do forecasts have skill (1- 10 years)?

Research questions

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3. Does information on **fishing** pressure improve forecasts of species distributions?

Goals



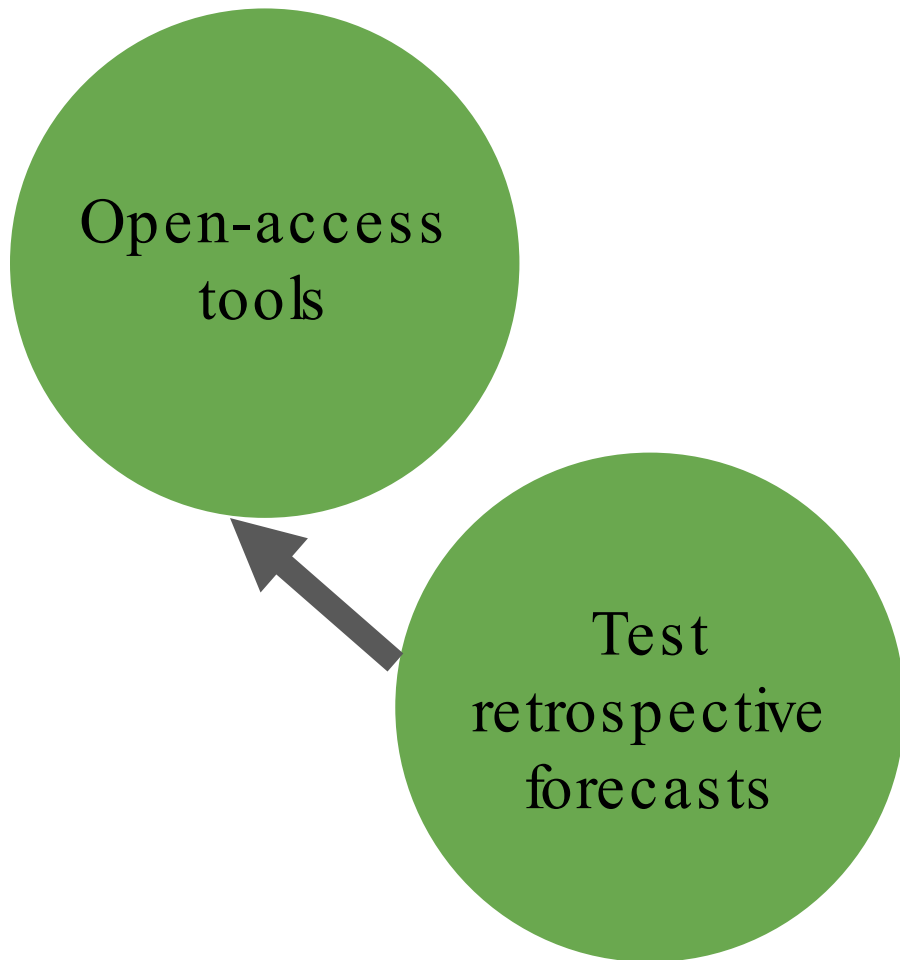
Test
retrospective
forecasts

Goals

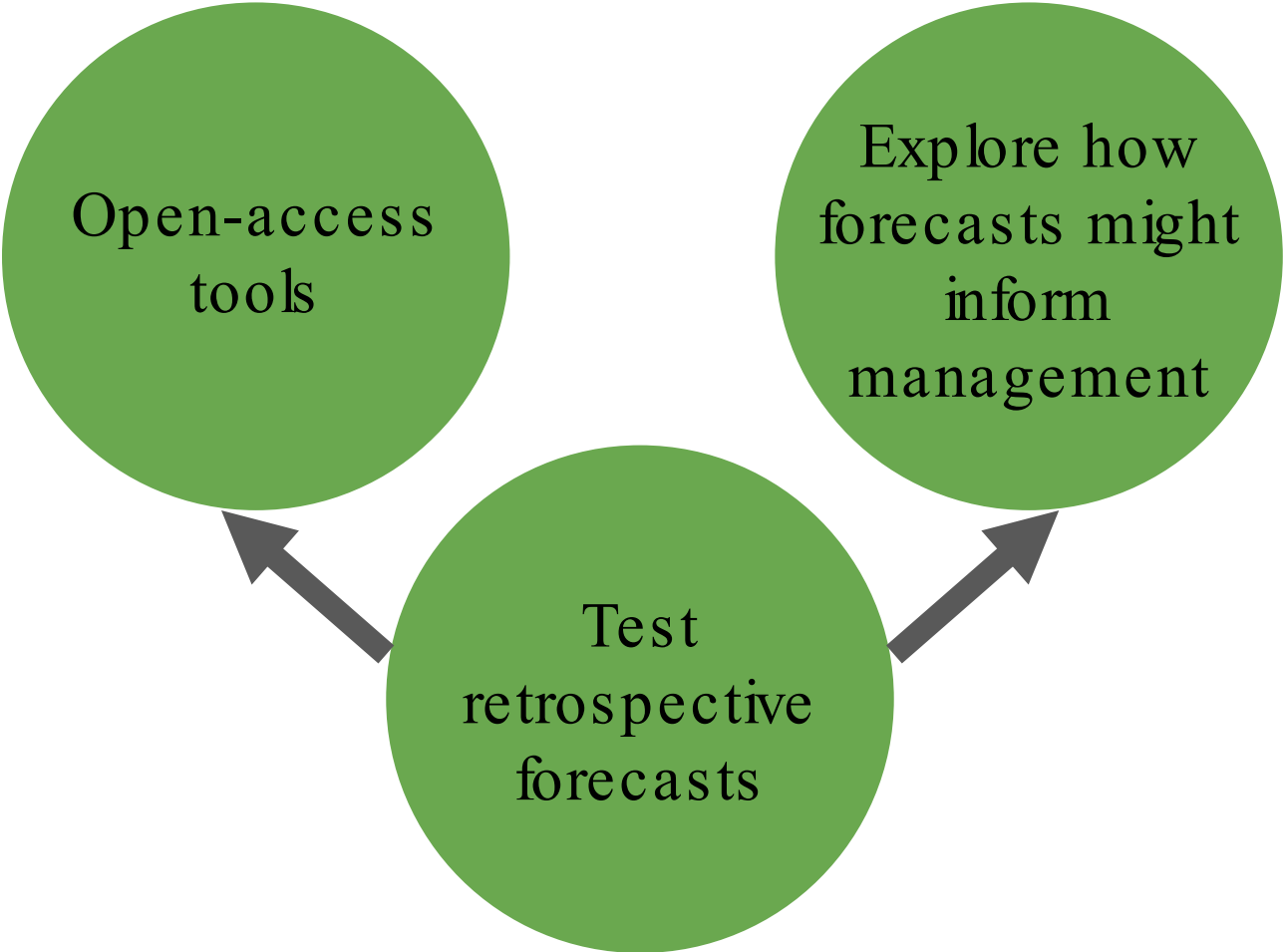
True forecasts will
require forecast
oceanographic
conditions

Test
retrospective
forecasts

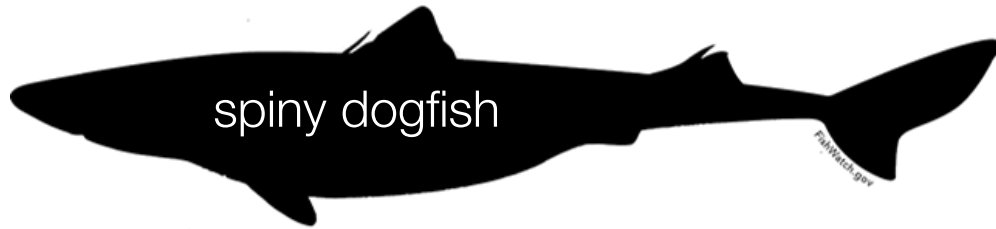
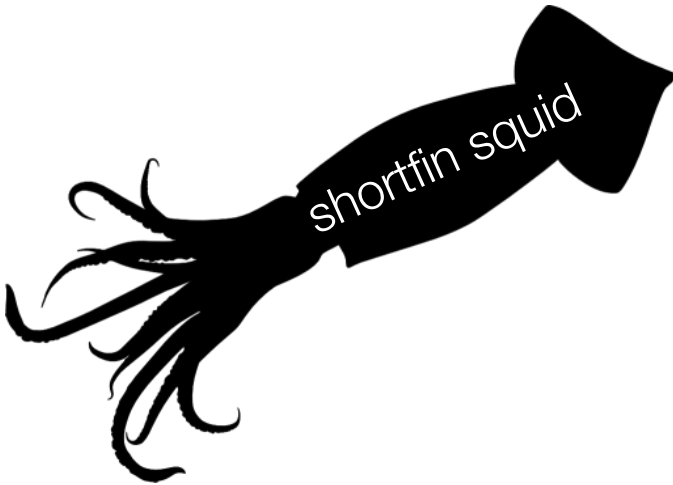
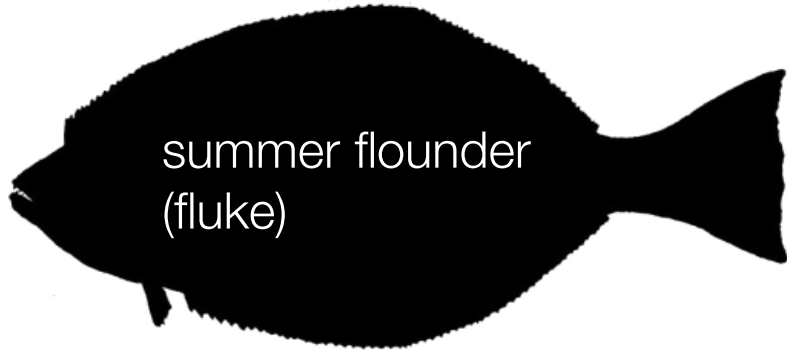
Goals



Goals



Focal species



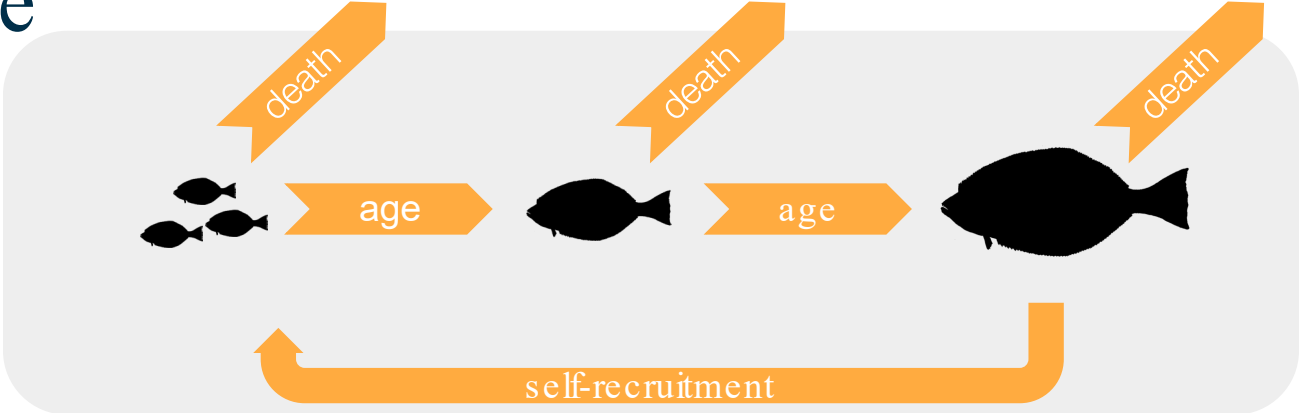
Spoiler alerts: summer flounder models

1. Non-climate factors (fishing, dispersal) influence species distributions
2. Species distributions are highly variable, not marching up the coast
3. Dynamic range models can forecast distribution shifts with some skill

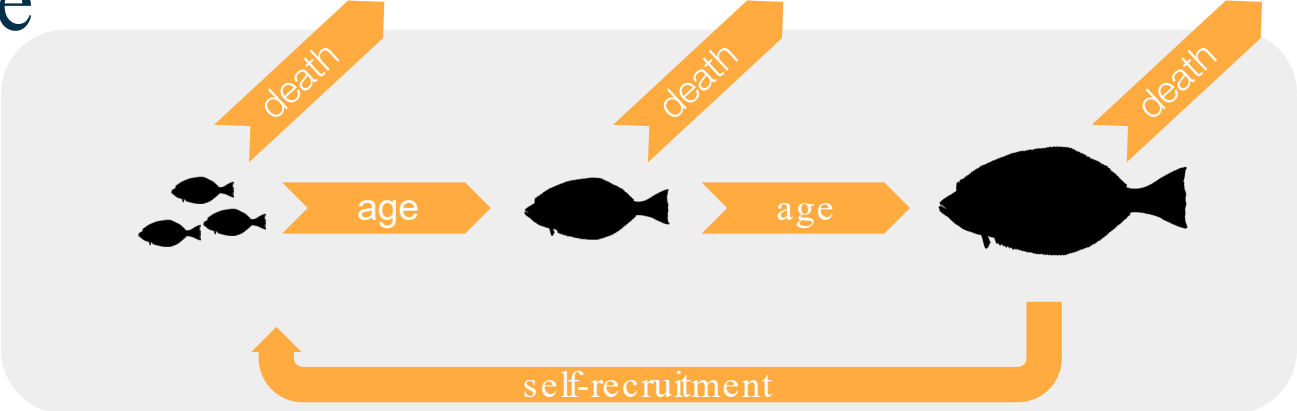
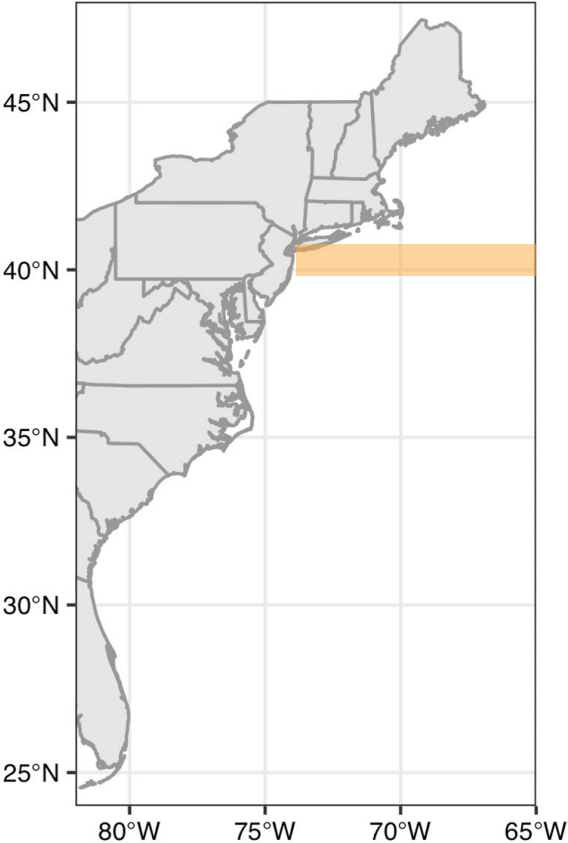
Model structure



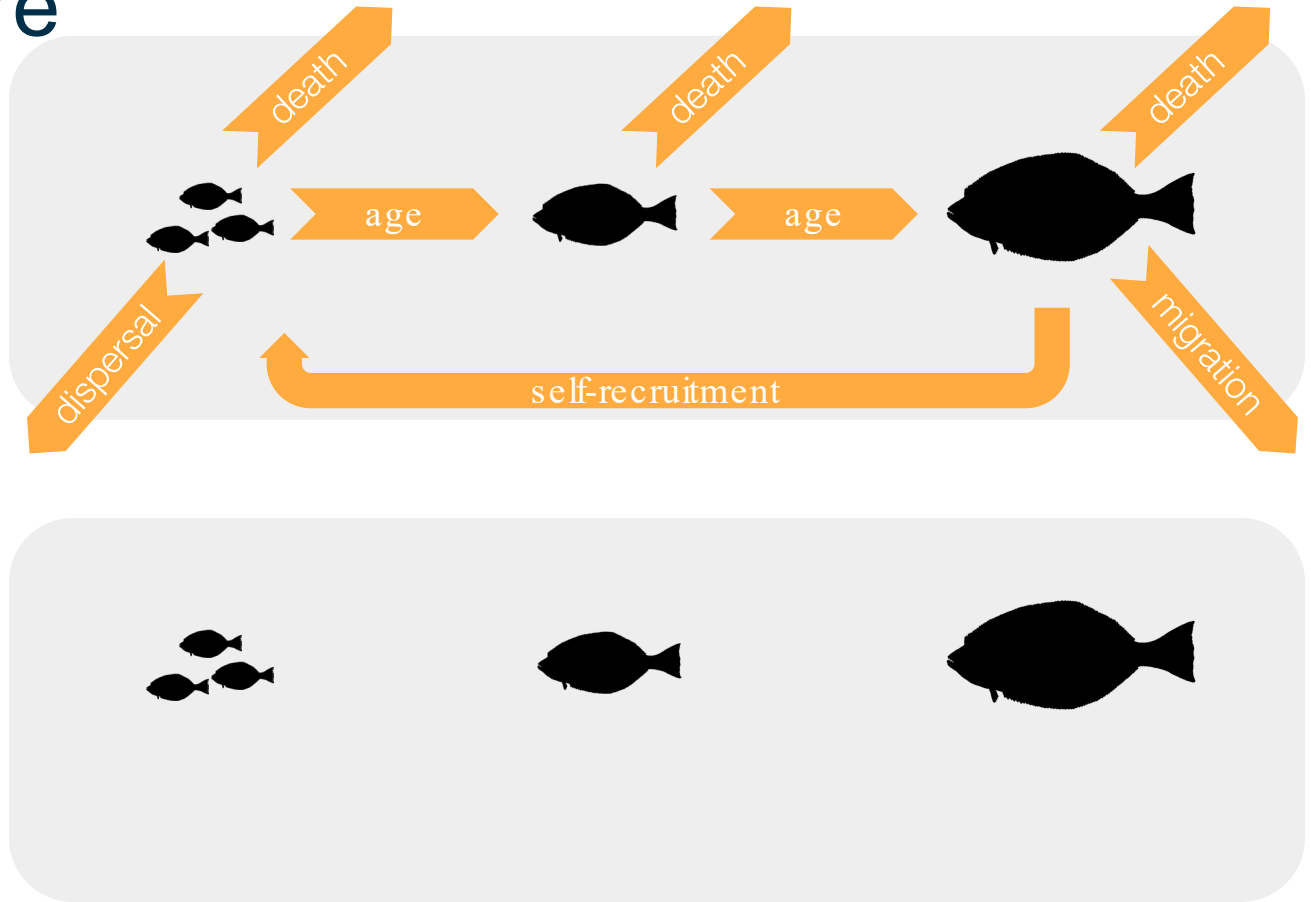
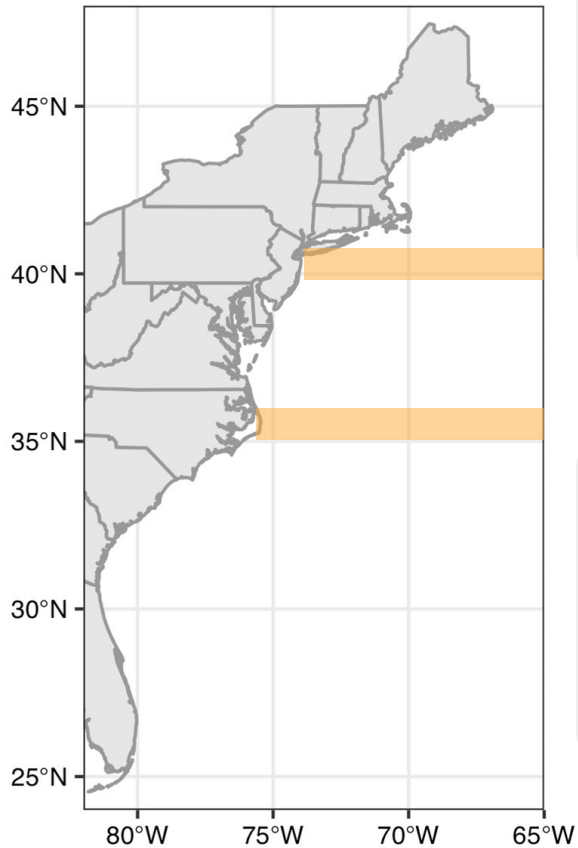
Model structure



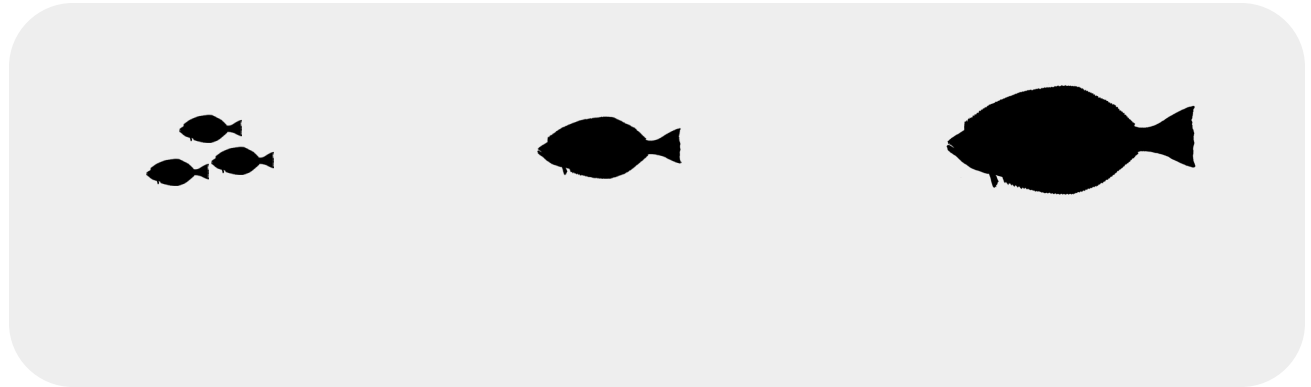
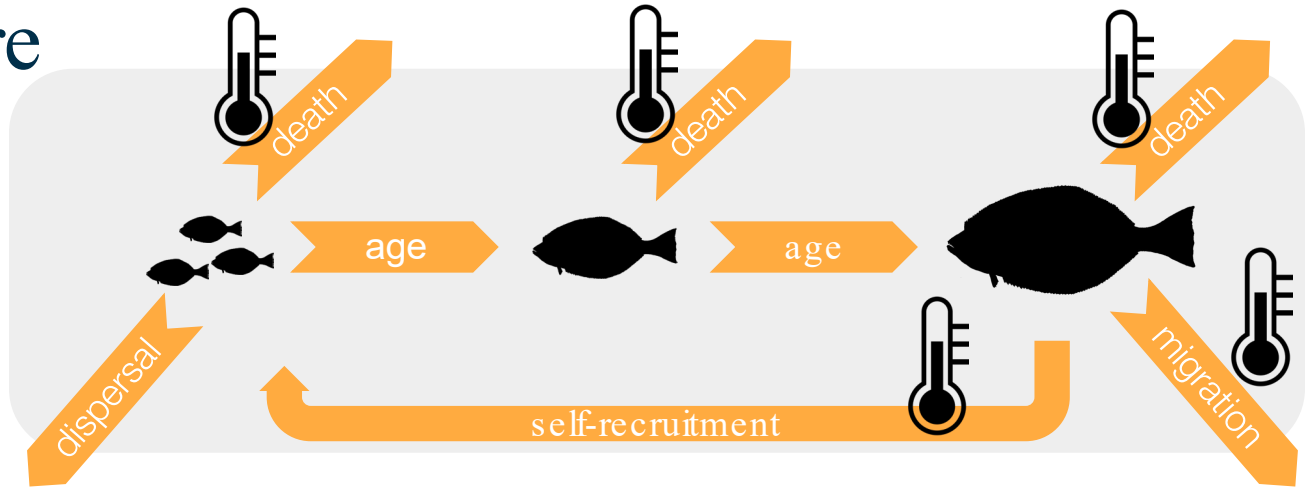
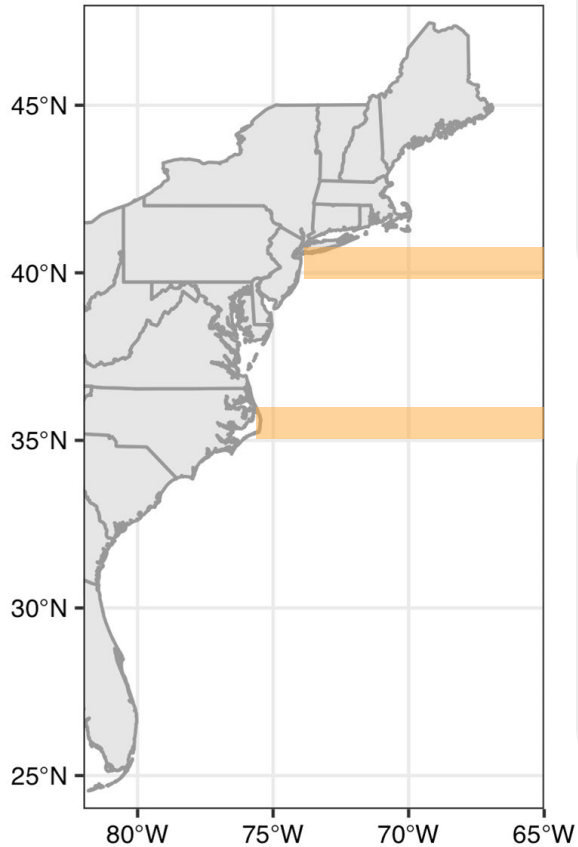
Model structure



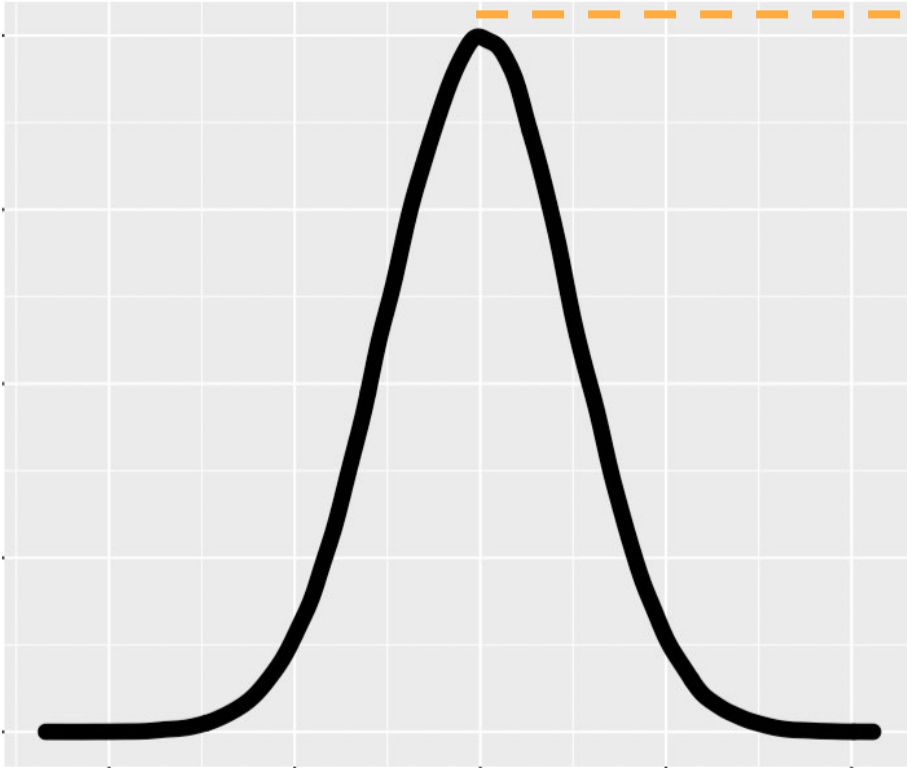
Model structure



Model structure



Temperature dependence

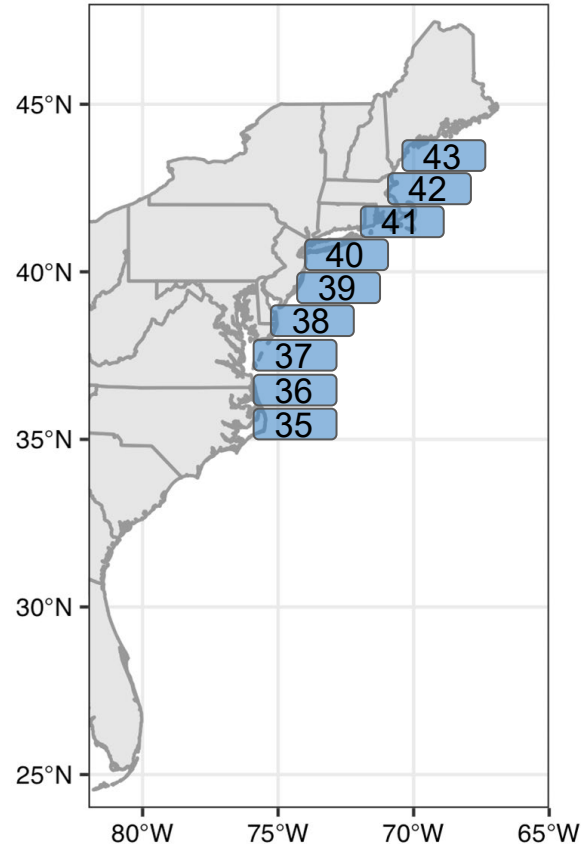


Temperature

Temperature at which
recruitment is maximized
mortality is minimized
movement is maximized

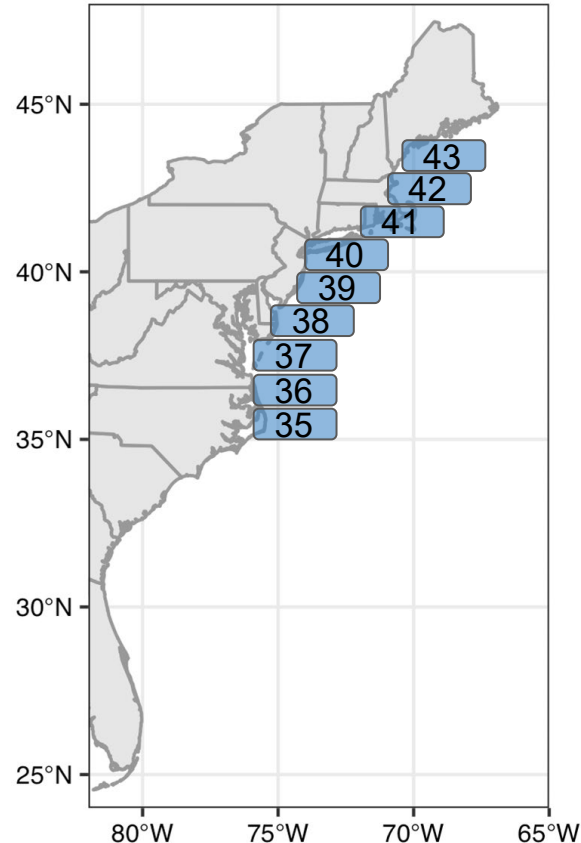
Summary of approach

Fit to data
from bottom
trawl survey,
1972-2006



Summary of approach

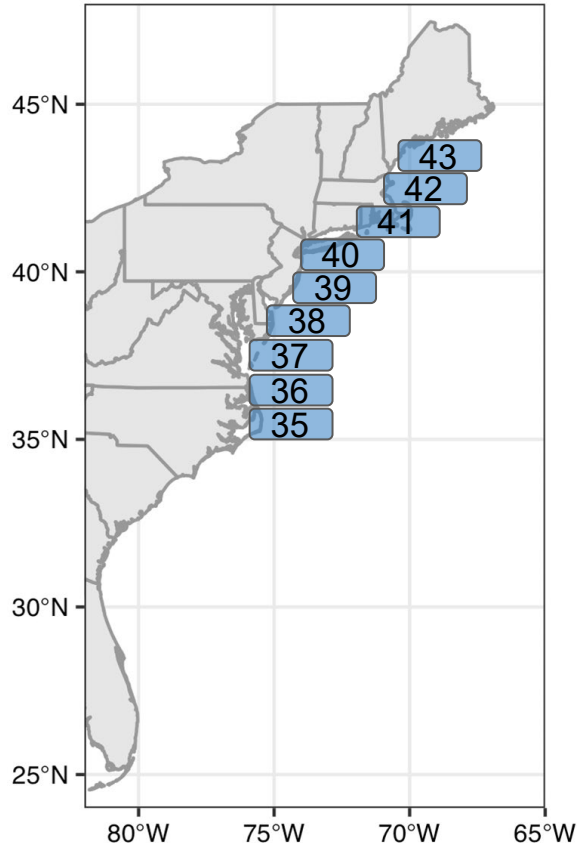
Fit to data
from bottom
trawl survey,
1972-2006



Test the
forecast 2007-
2016

Summary of approach

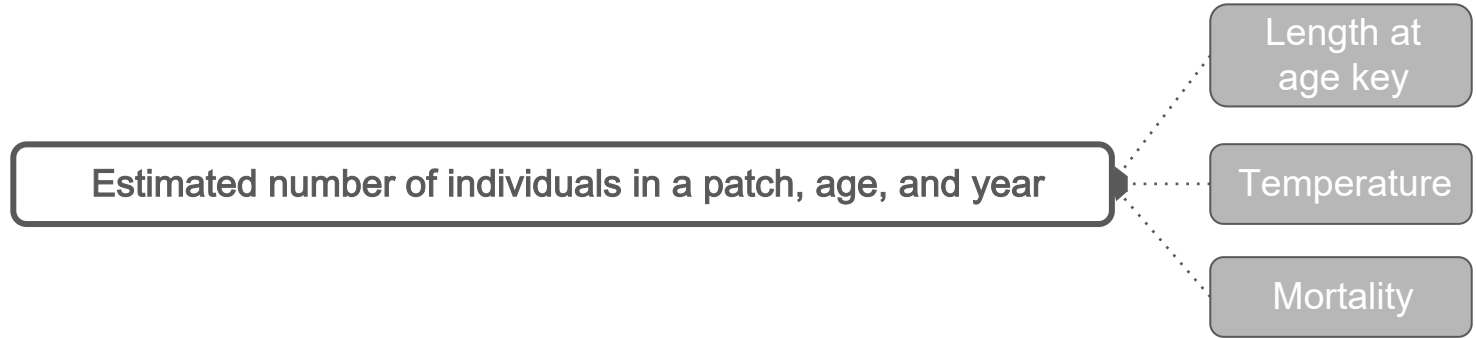
Fit to data
from bottom
trawl survey,
1972-2006



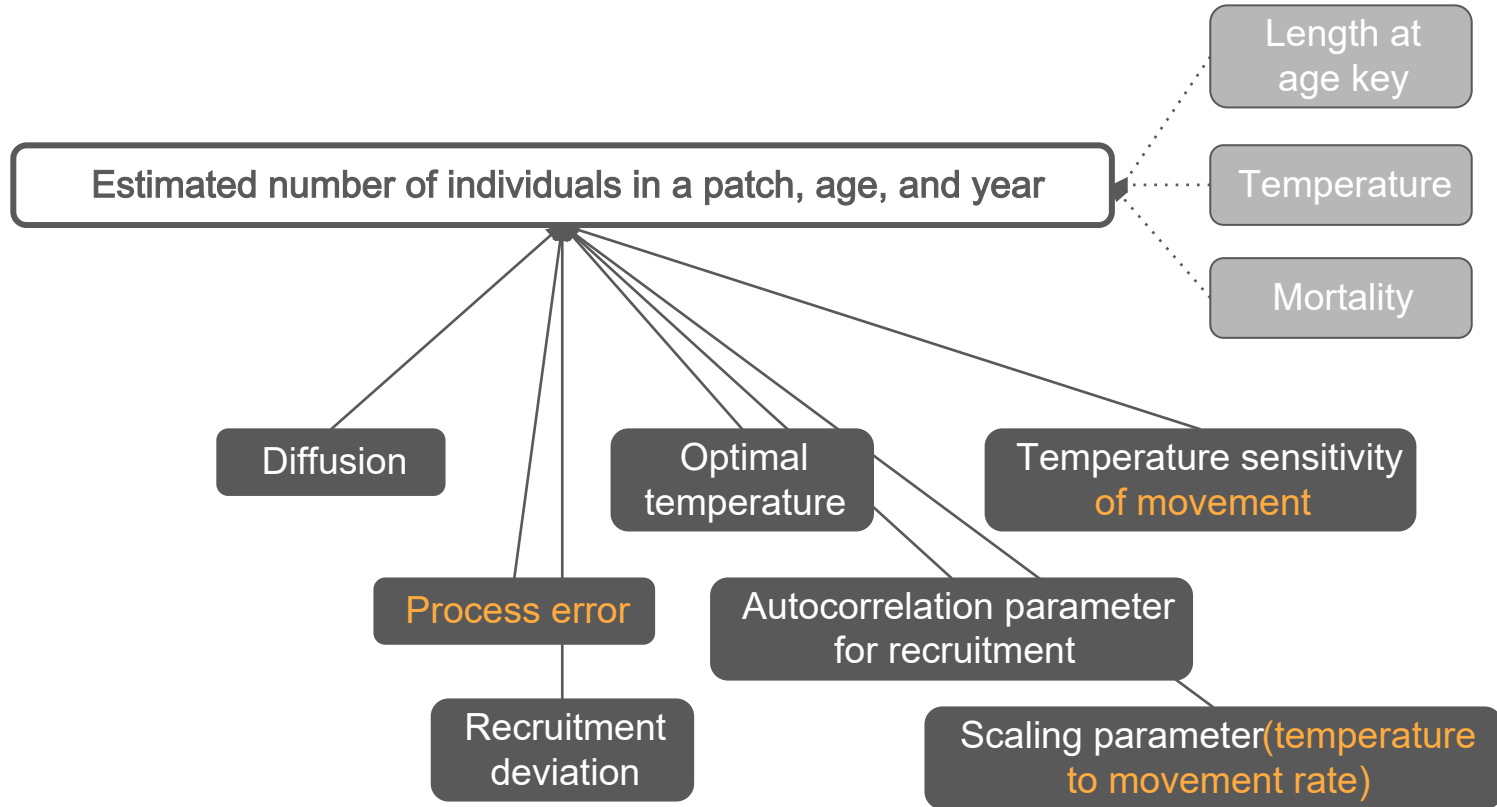
Test the
forecast 2007-
2016

**This is a proof of
concept, not a
future forecast!**

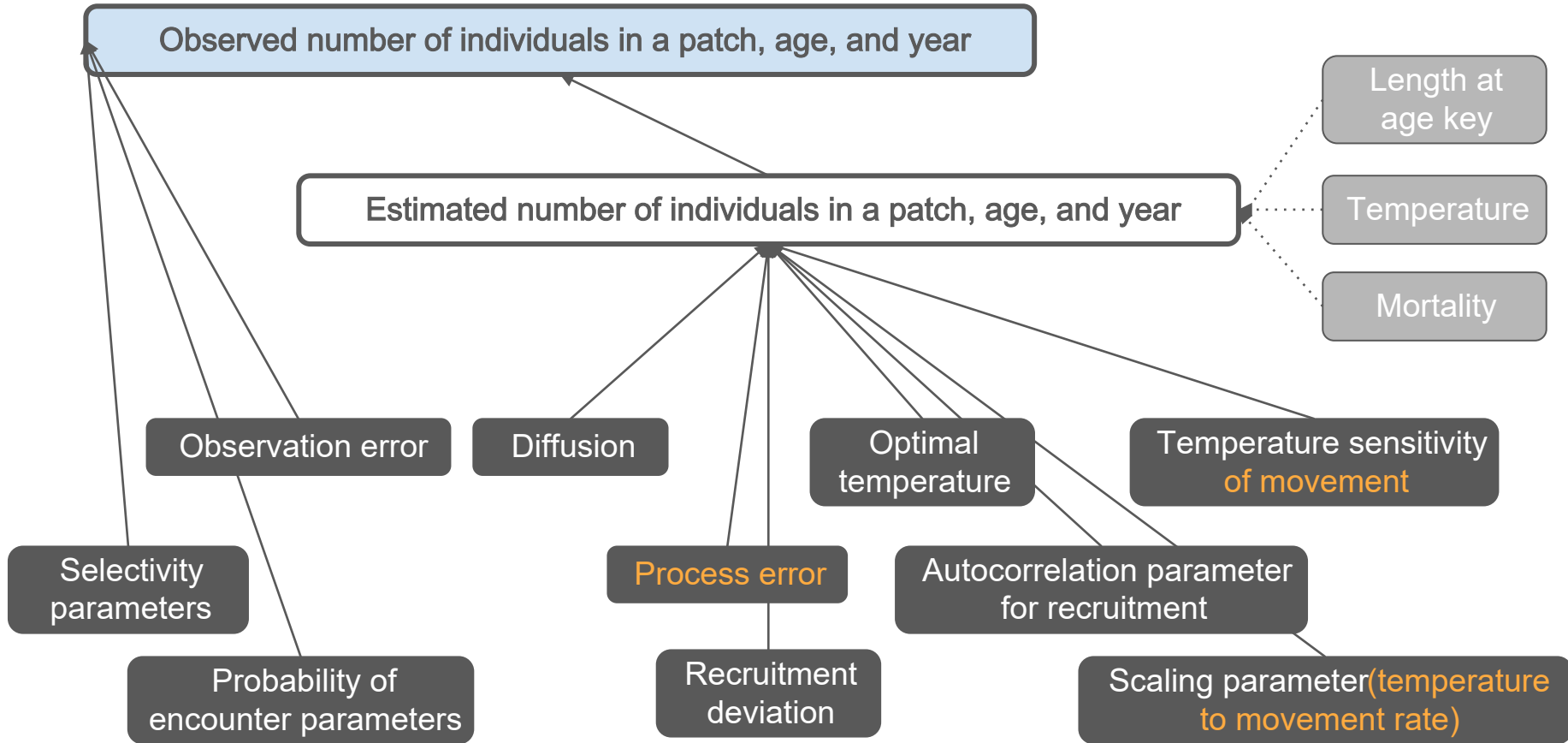
Bayesian network (DAG); $T \rightarrow \text{movement}$



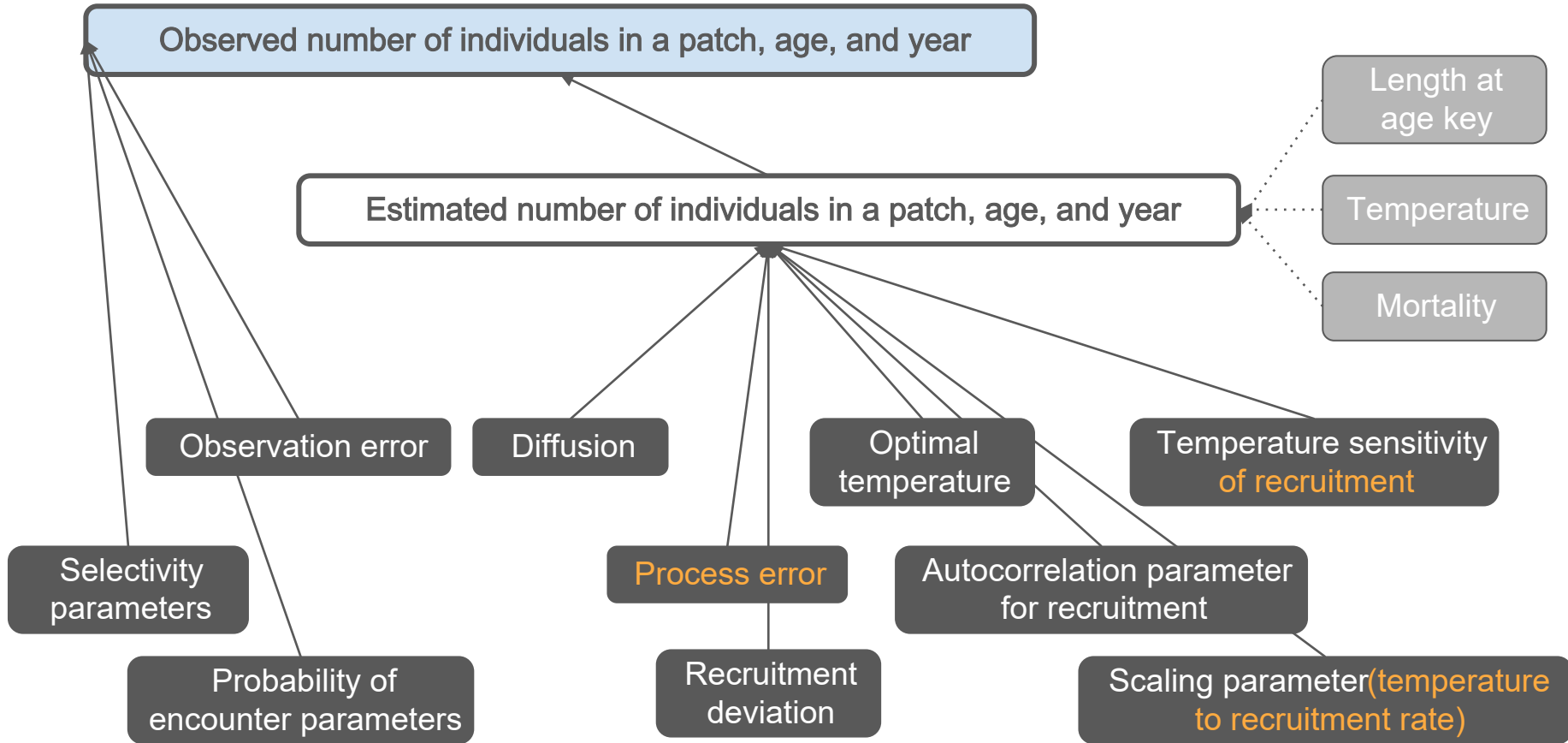
Bayesian network (DAG); $T \rightarrow$ movement



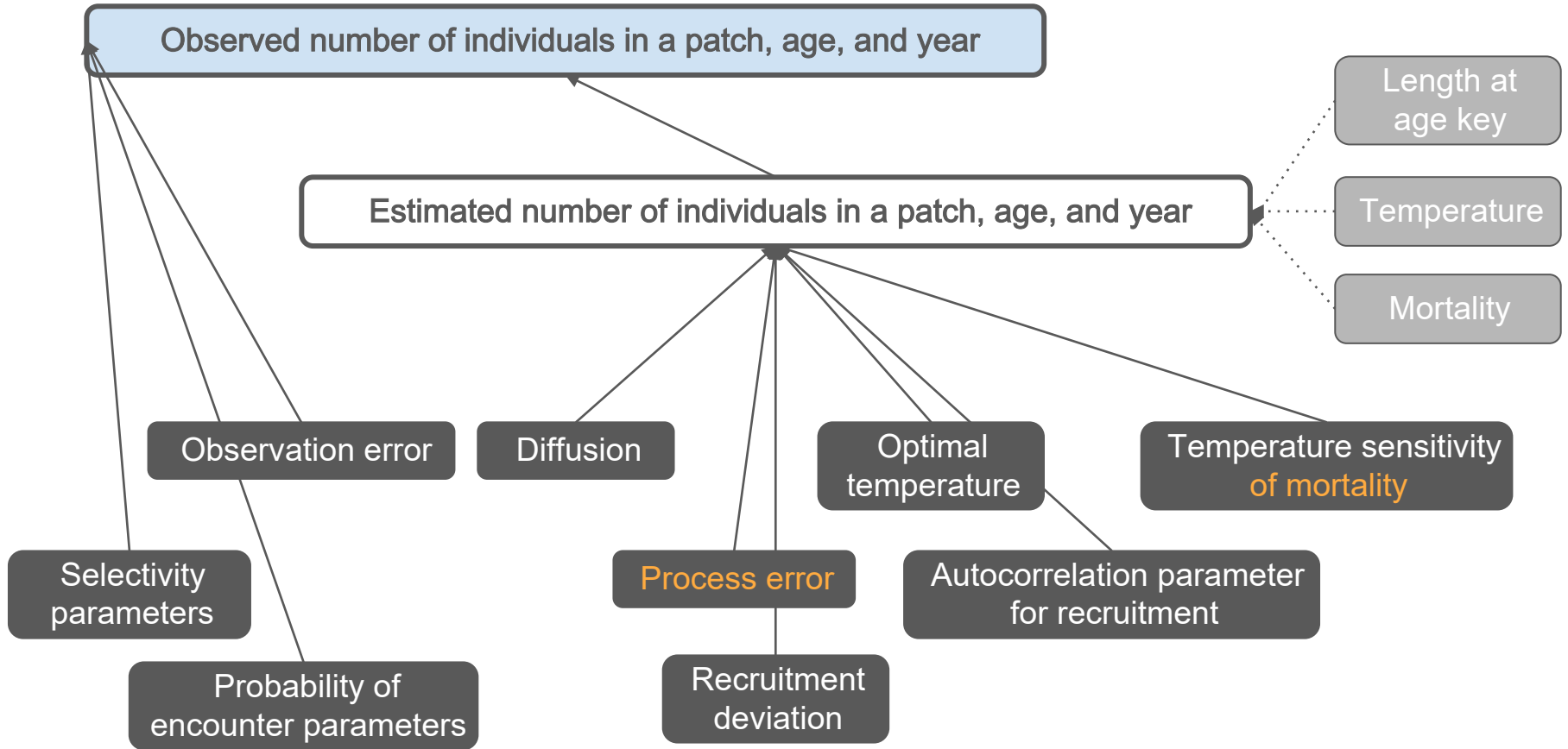
Bayesian network (DAG); $T \rightarrow$ movement



Bayesian network (DAG); $T \rightarrow$ recruitment

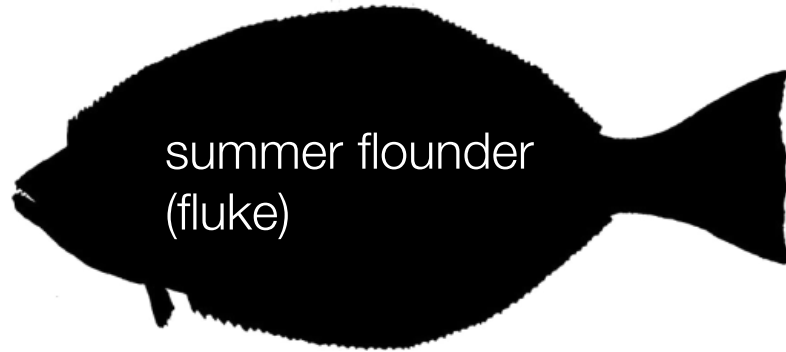


Bayesian network (DAG); $T \rightarrow$ mortality

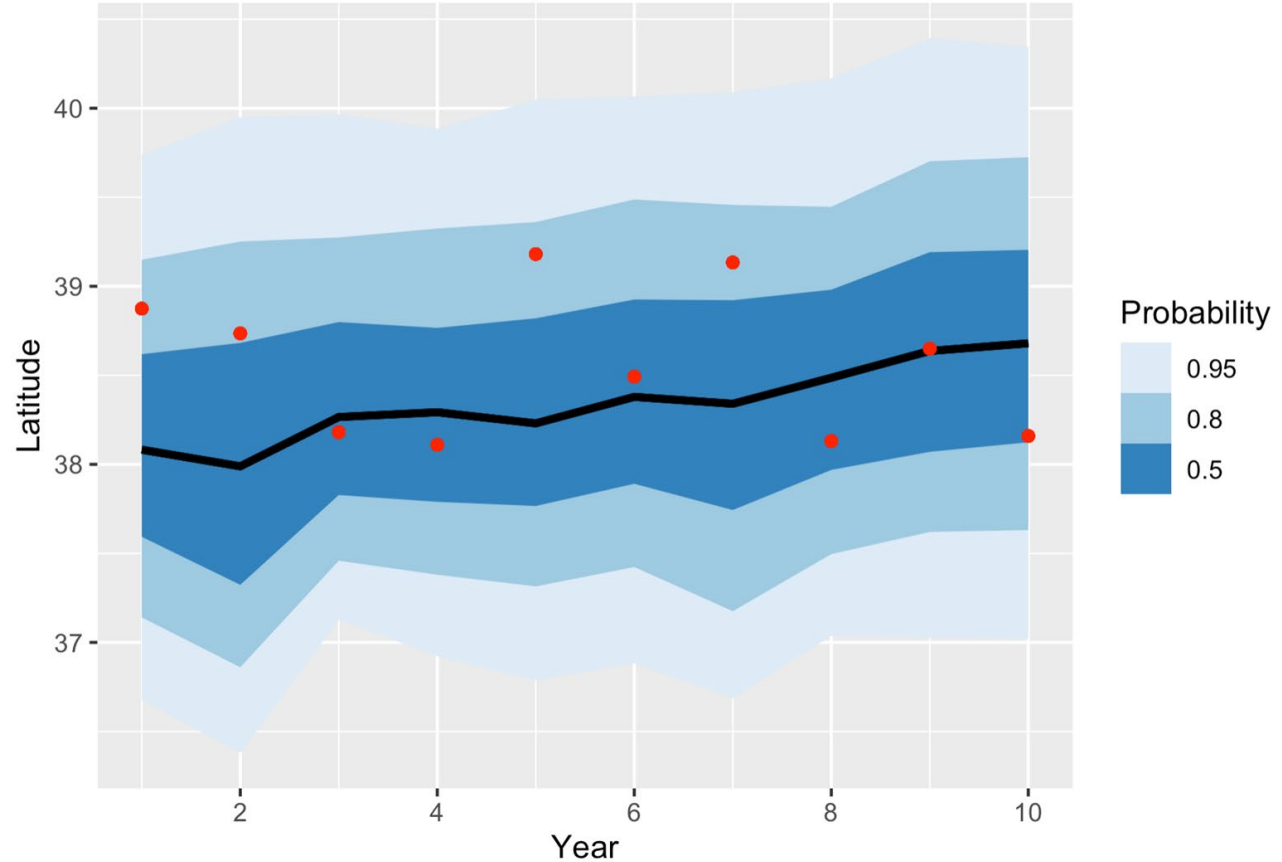
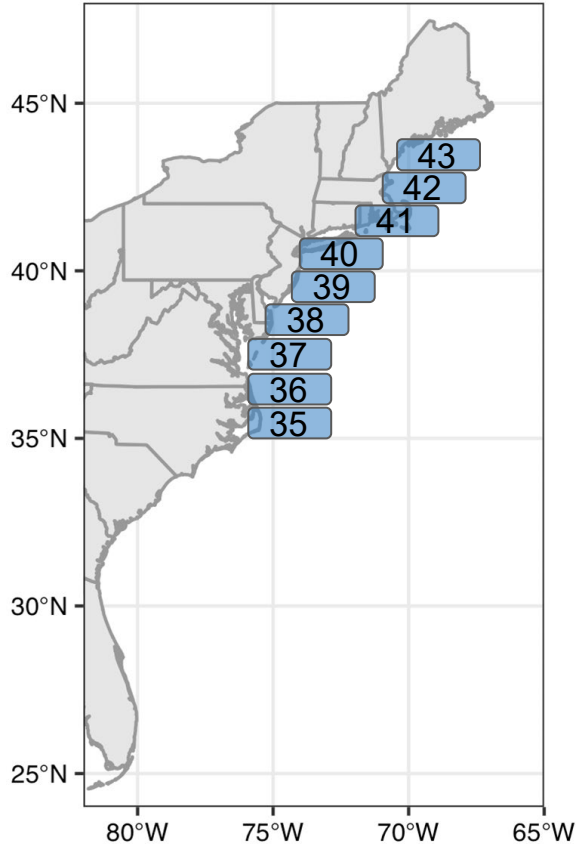


Research questions

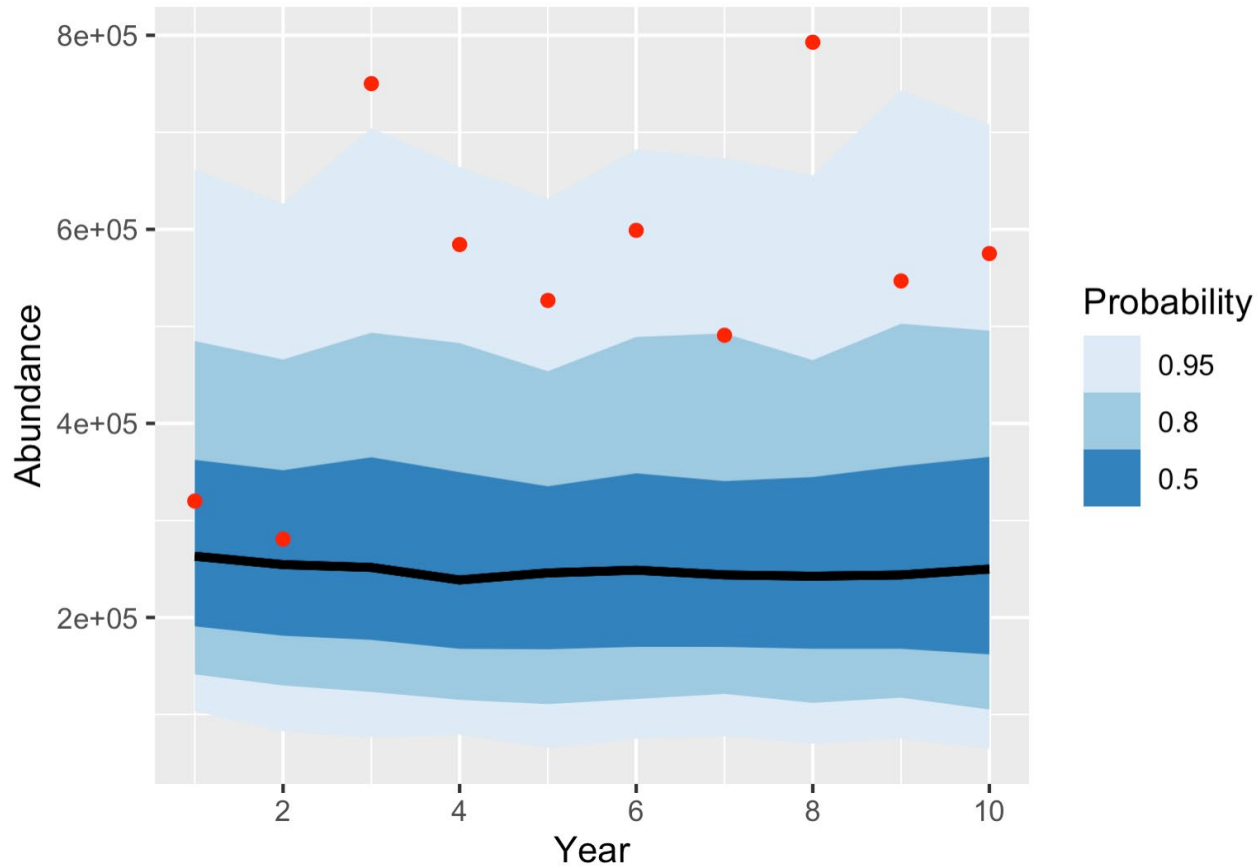
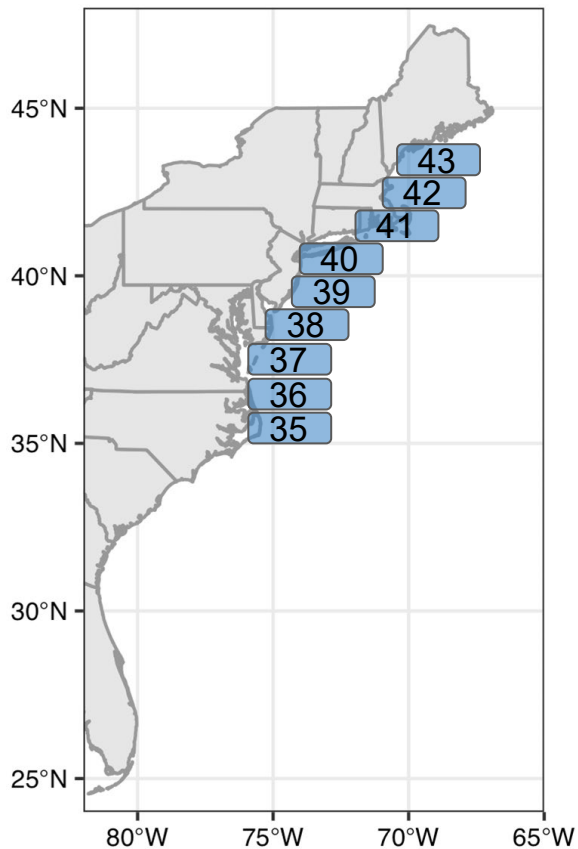
1. Can dynamic range models **forecast** changes in species distributions?



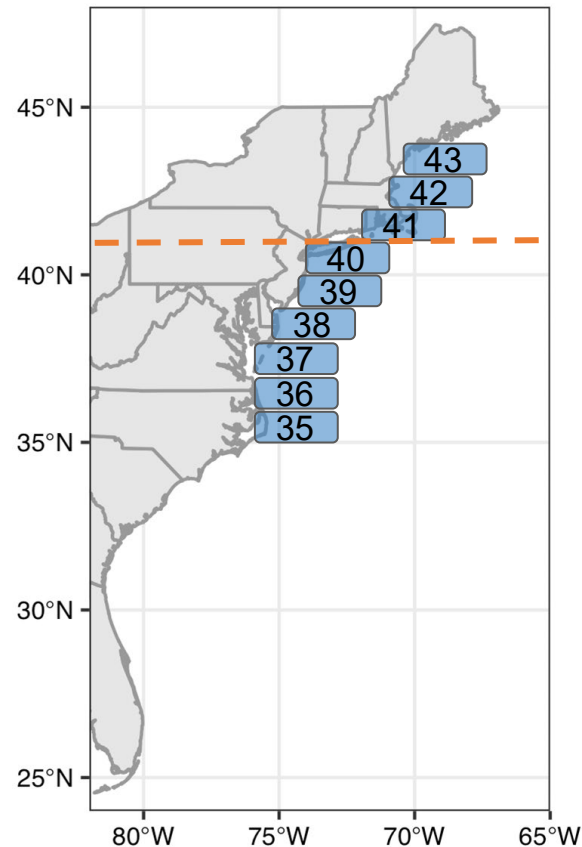
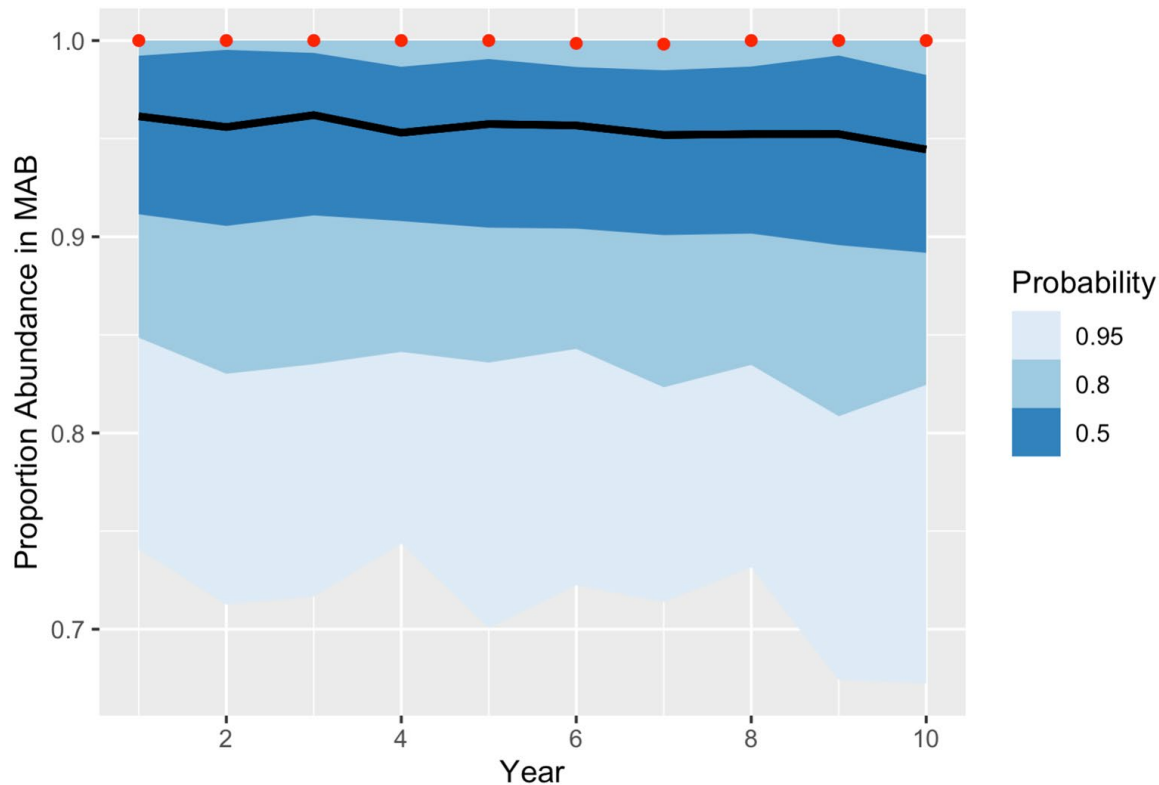
Forecast vs. reality: centroid position



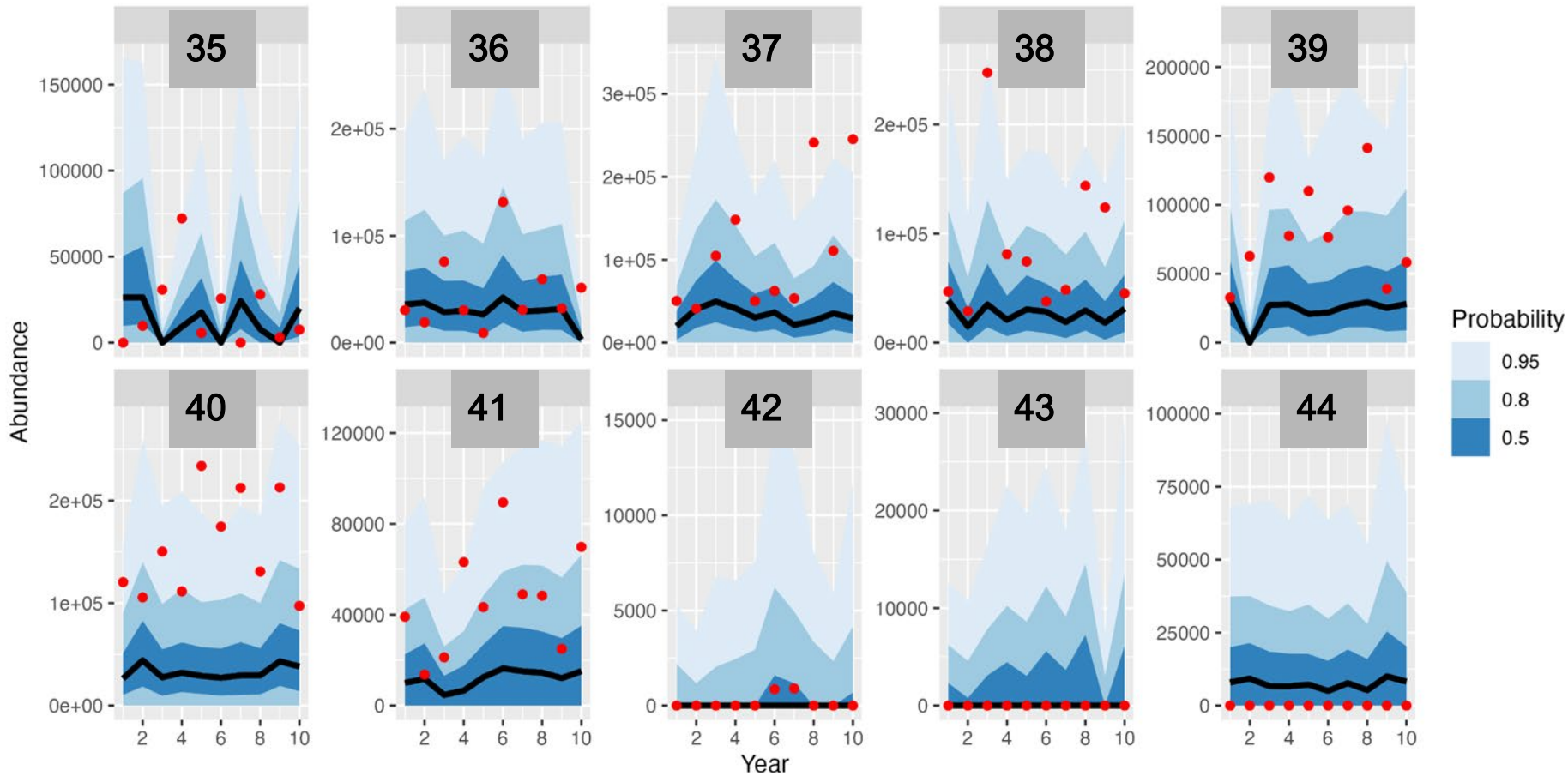
Forecast vs. reality: overall abundance



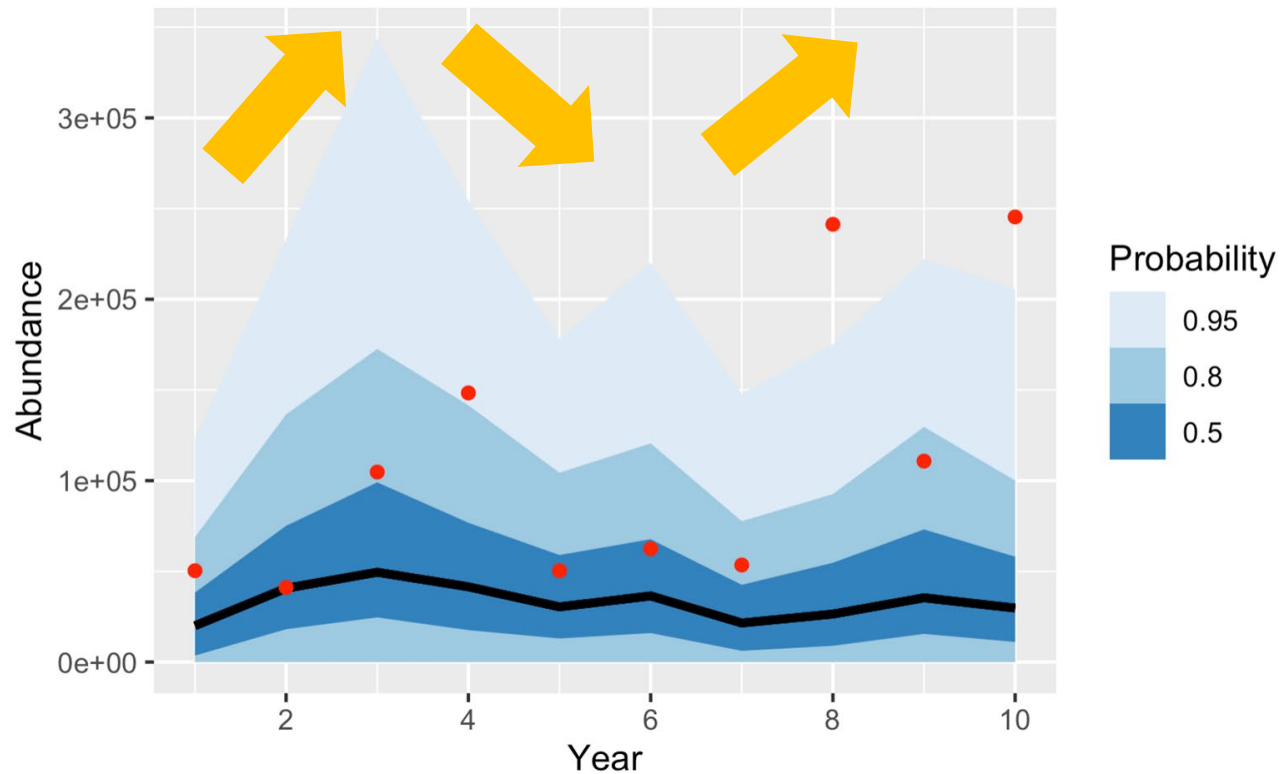
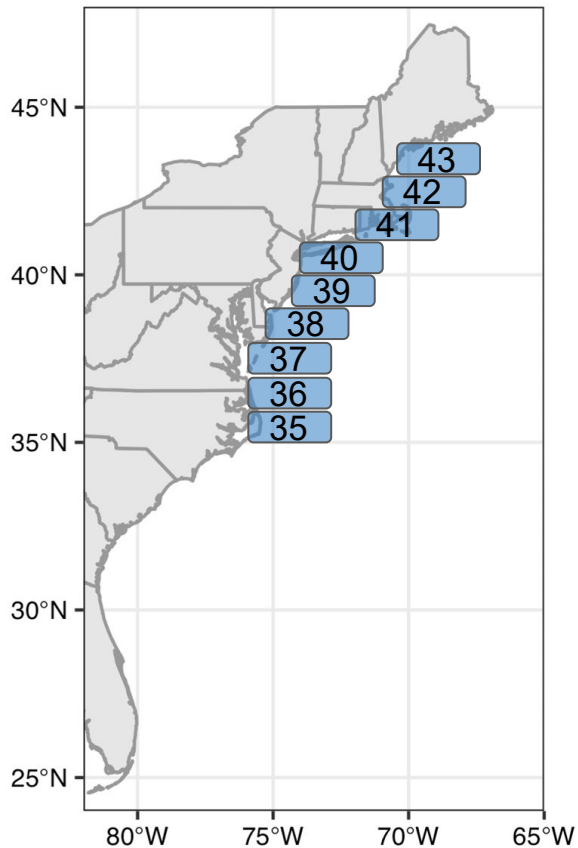
Forecast vs. reality: Mid-Atlantic Bight vs Gulf of Maine / Georges Bank



Forecast vs. reality: abundance by patch



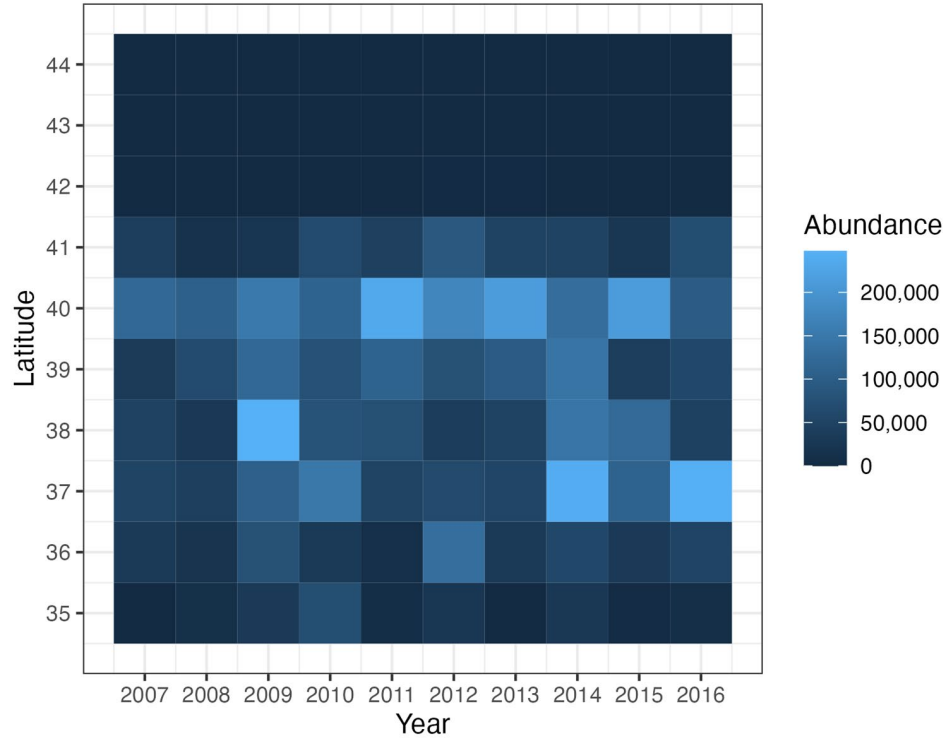
Forecast vs. reality: 37-38 N



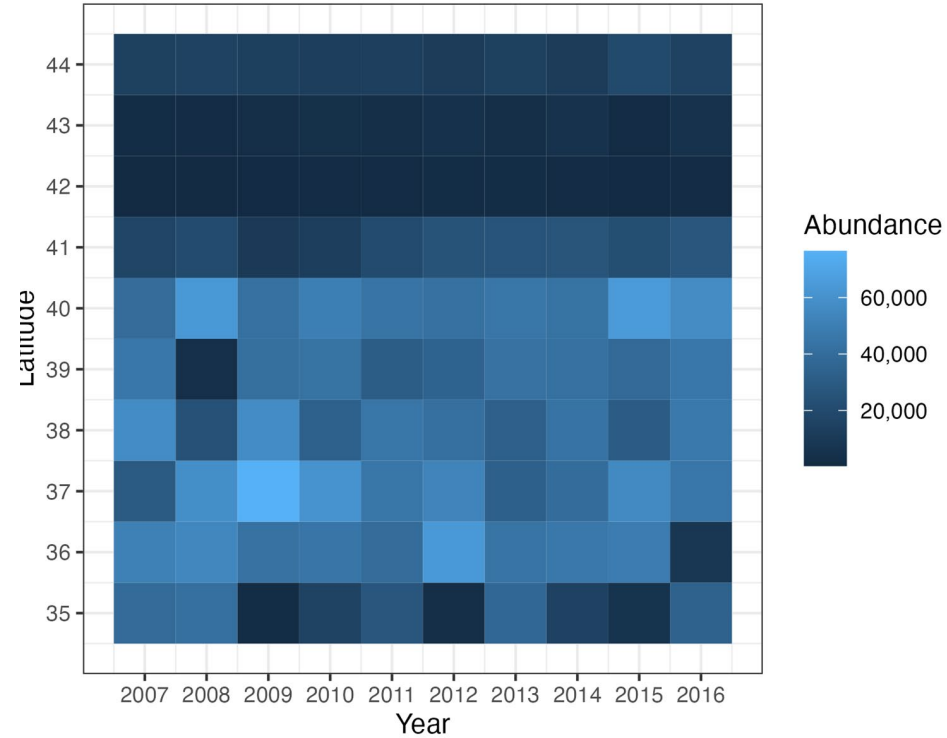
Forecast vs. reality: best estimates



Observed



Estimated

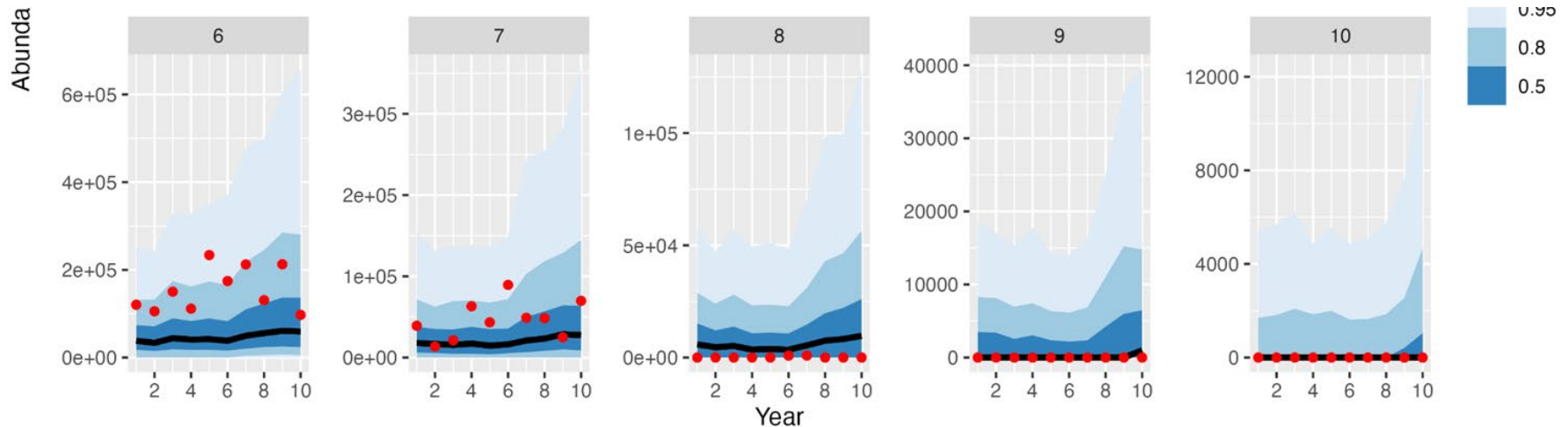


Research questions

1. Can dynamic range models forecast changes in species distributions?
2. At what **time-scales** do forecasts have skill (1-10 years)?

Research questions

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Research questions

1. Can dynamic range models forecast changes in species distributions?
2. At what time-scales do forecasts have skill (1- 10 years)?
3. Does information on **fishing** pressure improve forecasts of species distributions?

Yes!

Updates and next steps

1. All model features are programmed
Not shown: options to fit to length data or add a stock-recruit relationship
2. Summer flounder models are running on supercomputers at Rutgers this month
3. Ran traditional SDMs for comparison
4. Next up: formally evaluate and compare models
5. Other three species are in the works

Our questions for you

1. If this was a future forecast, what would you do with it?
2. What types of information (for example, biomass in/out of Mid-Atlantic Bight) would be most useful?
3. Are there other data streams or parameter estimates you suggest we use, recognizing the generality / specificity trade-off?

Potential Project Application(s)

Stocks maintained, but hard to assess / locate

Mostly maintained

Stocks maintained, mostly straightforward to assess / locate

Stock

production

decline

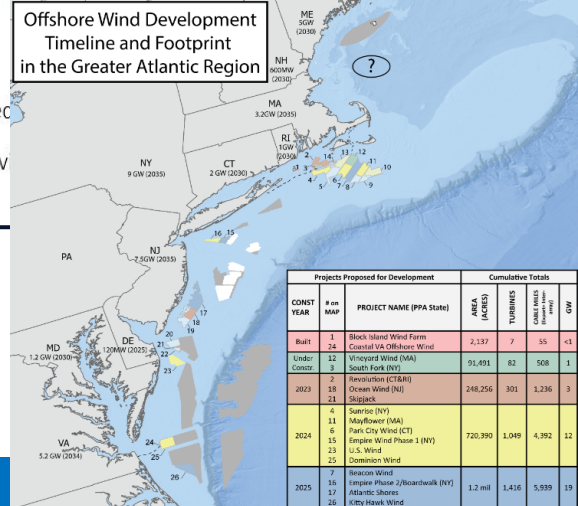
/ ability of science to assess

Predictable conditions, high ability to assess & predict

Stocks decline, straightforward to assess / locate



Ecosystem Approach to Fisheries Management Guidance Document



Coastwide Quota

% Initial Allocation

% Stock Distribution



EAFM Guidance Document

Example Climate-Related Policies and Recommendations

- Develop and evaluate approaches for MAFMC fisheries and their management to become more adaptive to change
- Use models to develop short-term forecasts and medium-term projections
- Identify new species likely to become established in the Mid-Atlantic (from the South Atlantic) and species likely to expand or shift distribution into waters under the jurisdiction of New England

Species Distribution Shifts

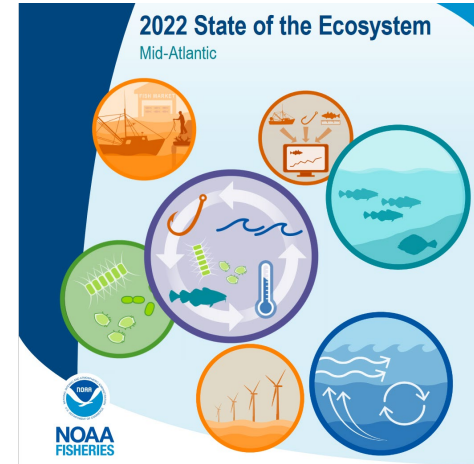
- Collaborated with Morley et al. 2018 on *Projecting shifts in thermal habitat during the 21st century* project
- Highly informative and considered in a strategic way - i.e., EAFM guidance document
- This project allows Council to potentially consider distribution change in a more tactical way
 - Focus on Mid At. species, but interest in possible South At. changes



Examples of Potential Science Applications

Less Uncertainty  More Uncertainty

<p>Ecosystem factors accounted</p>	<p>Assessment considered habitat and ecosystem effects on stock productivity, distribution, mortality and quantitatively included appropriate factors reducing uncertainty in short term predictions. Evidence outside the assessment suggests that ecosystem productivity and habitat quality are stable. Comparable species in the region have synchronous production characteristics and stable short-term predictions. Climate vulnerability analysis suggests low risk of change in productivity due to changing climate.</p>	<p>Assessment considered habitat/ecosystem factors but did not demonstrate either reduced or inflated short-term prediction uncertainty based on these factors. Evidence outside the assessment suggests that ecosystem productivity and habitat quality are variable, with mixed productivity and uncertainty signals among comparable species in the region. Climate vulnerability analysis suggests moderate risk of change in productivity from changing climate.</p>	<p>Assessment either demonstrated that including appropriate ecosystem/habitat factors increases short-term prediction uncertainty, or did not consider habitat and ecosystem factors. Evidence outside the assessment suggests that ecosystem productivity and habitat quality are variable and degrading. Comparable species in the region have high uncertainty in short term predictions. Climate vulnerability analysis suggests high risk of changing productivity from changing climate.</p>
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- SOE risks to meeting management objectives
 - Linking ecosystem indicators to distribution changes

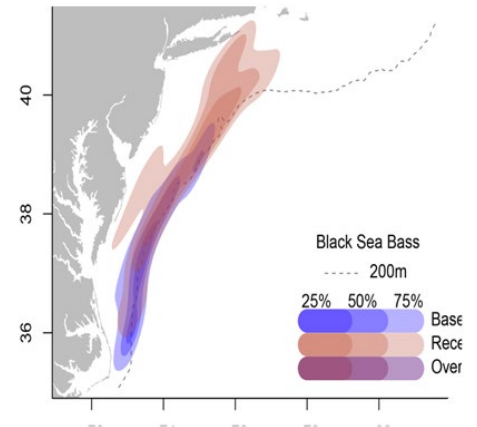
Examples of Potential Science Applications

- Inform research priority projects
 - SSC priority area - *Climate change impacts on stock productivity and distribution shifts*
- Stock assessment information
 - Ecosystem TORs and Ecosystem and Socio-Economic Profiles for assessments
 - Stock projection considerations



Mid-Atlantic Fishery Management Council
Comprehensive Five Year (2020–2024) Research
Priorities

Approved December 2019



Examples of Potential Council Application

- Continued development and implementation of EAFM guidance document

Risk Assessment Update 2020

- Comprehensive review this year
- Connection/link with Ecosystem Work Group

Table 4: Species level risk analysis results; l=low risk (green), lm= low-moderate risk (yellow), mh=moderate to high risk (orange), h=high risk (red)

Species	Assess	Fstatus	Bstatus	FW1Pred	FW1Prey	FW2Prey	Climate	DistShift	EstHabitat
Ocean Quahog	l	l	l	l	l	l	h	mh	l
Surflam	l	l	l	l	l	l	mh	mh	l
Summer flounder	l	l	lm	l	l	l	lm	mh	h
Scup	l	l	l	l	l	l	lm	mh	h
Black sea bass	l	l	l	l	l	l	mh	mh	h
Atl. mackerel	l	h	h	l	l	l	lm	mh	l
Butterfish	l	l	l	l	l	l	l	h	l
Longfin squid	lm	lm	lm	l	l	lm	l	mh	l
Shortfin squid	lm	lm	lm	l	l	lm	l	h	l
Golden tilefish	l	l	lm	l	l	l	mh	l	l
Blueline tilefish	h	h	mh	l	l	l	mh	l	l
Bluefish	l	l	h	l	l	l	l	mh	h
Spiny dogfish	lm	l	l	l	l	l	l	h	l
Monkfish	h	lm	lm	l	l	l	l	mh	l
Unmanaged forage	na	na	na	l	lm	lm	na	na	na
Deepsea corals	na	na	na	l	l	l	na	na	na

Table 5: Ecosystem level risk analysis results; l=low risk (green), lm= low-moderate risk (yellow), mh=moderate to high risk (orange), h=high risk (red)

System	EcoProd	CommRev	RecVal	FishRes1	FishRes4	FleetDiv	Social	ComFood	RecFood
Mid-Atlantic	lm	mh	h	l	mh	l	lm	h	mh

Potential Management Applications

(cont.)

- Council Actions

- Dynamic allocation strategies/considerations (e.g. black sea bass)

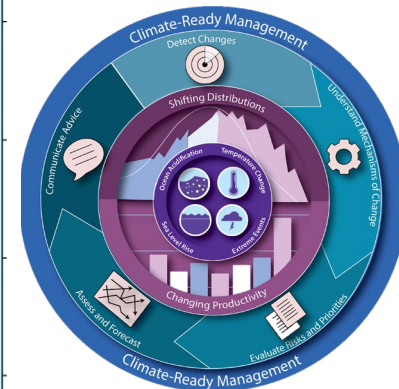
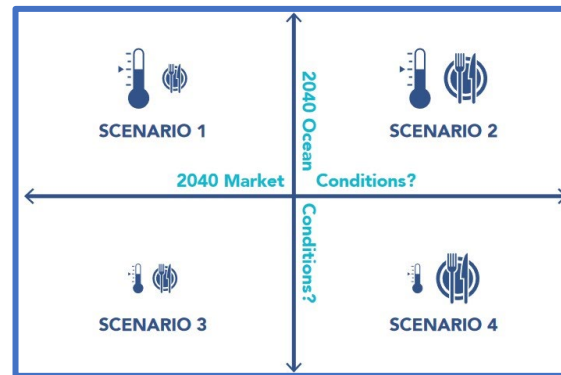
- East Coast Climate Change and Distribution Shift Scenario Planning Project

- MSE to evaluate summit outcomes
- Adaptive governance/management

- Marine Spatial Planning/Coordination

- Offshore wind and aquaculture development

- NOAA Fisheries Climate Ready Fisheries Management



Research Application Questions for SSC

1. Comment on potential applicability of short-term forecasts of species distribution for stock assessment, science, and management purposes of Mid-Atlantic species. Consider potential implications for the SSC's OFL CV approach
1. Provide any research recommendations and inclusion of relevant data for future model development that could facilitate their consideration of factors influencing determination of ABCs.

Feedback from the SSC and EOP Committee/AP (2/23 meeting) will be provided to the Council for consideration at April Council meeting