

AK Climate-change Integrated Modeling project (ACLIM)

Photo: Mark Holsman

Identifying impacts and management solutions for Eastern Bering Sea fisheries.

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ACLIM PIs:

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Alan Haynie¹, Stephen Kasperski¹, Jim
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2. NOAA Office of Oceanic and Atmospheric Research, Pacific Marine Environmental Laboratory
3. Joint Institute for the Study of the Atmosphere and Ocean, University of Washington
4. Institute of Marine Research, Bergen Norway
5. School of Aquatic and Fisheries Science, University of Washington

The ACLIM team



Anne Hollowed



Kirstin Holsman



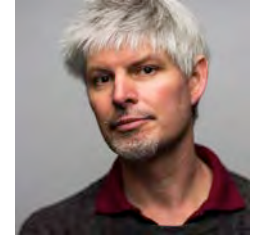
Alan Haynie



Albert Hermann



Wei Cheng



Andre Punt



Darren Pilcher



Kerim Aydin



Jim Ianelli



Ingrid Spies



Stephen Kasperski



Cody Szuwalski



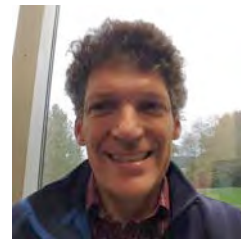
Amanda Faig



Jonathan Reum



Michael Dalton



Paul Spencer

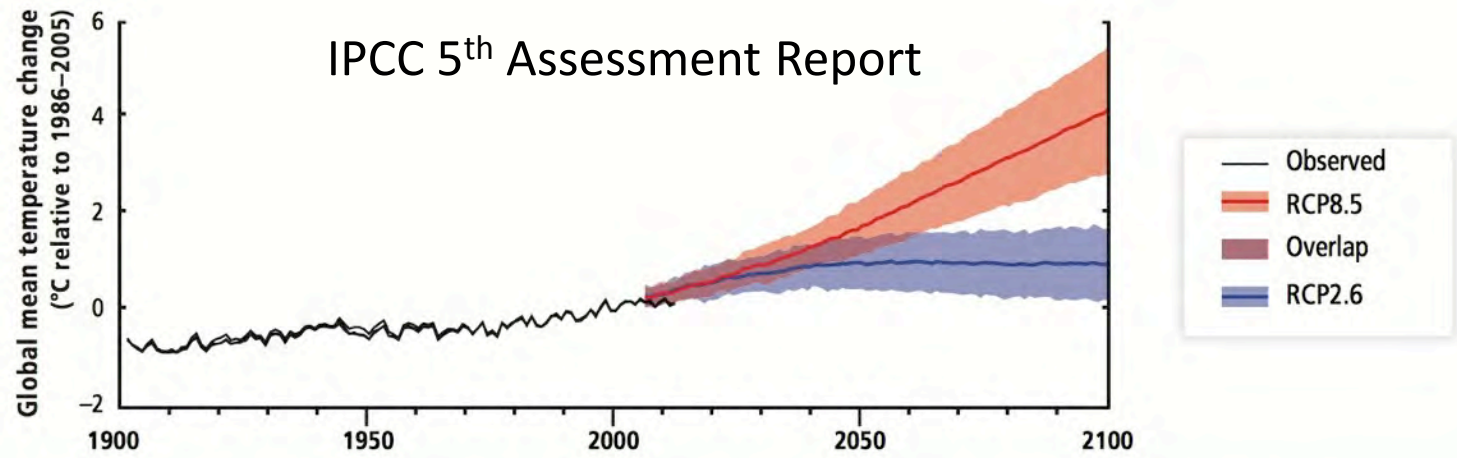


Tom Wilderbuer



William Stockhausen

(B)



(C)

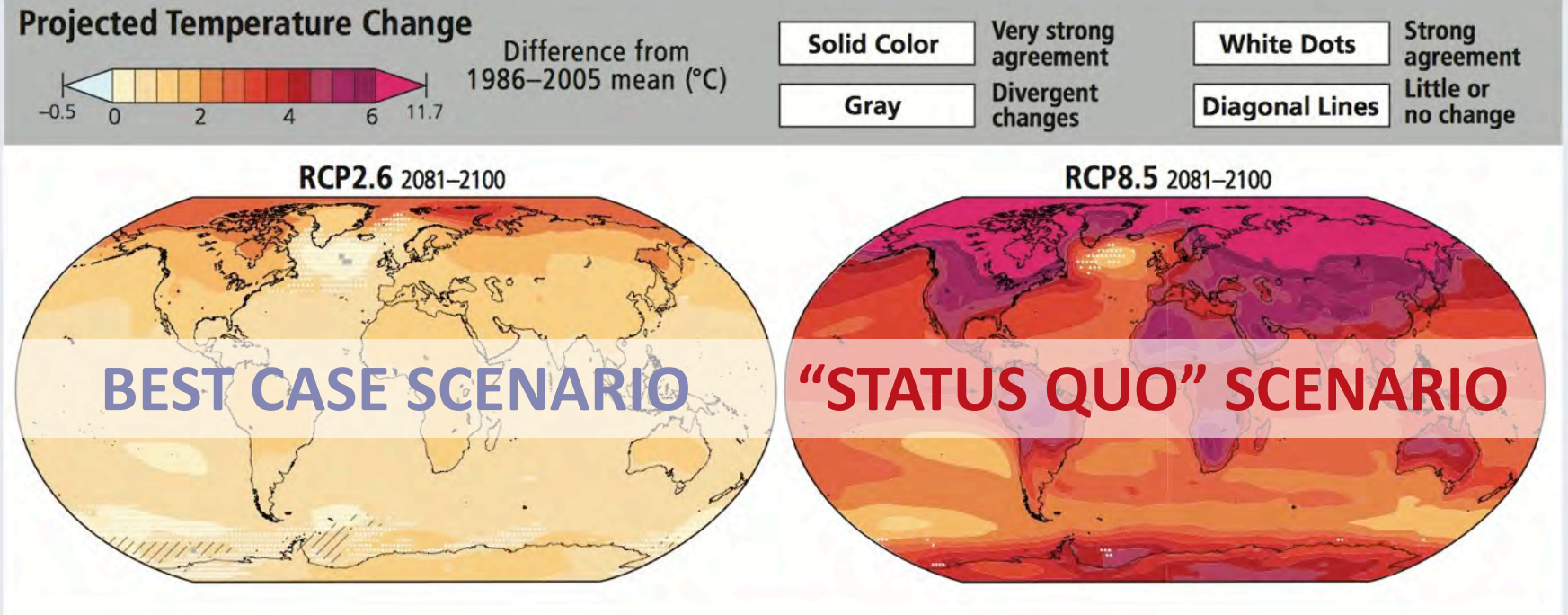


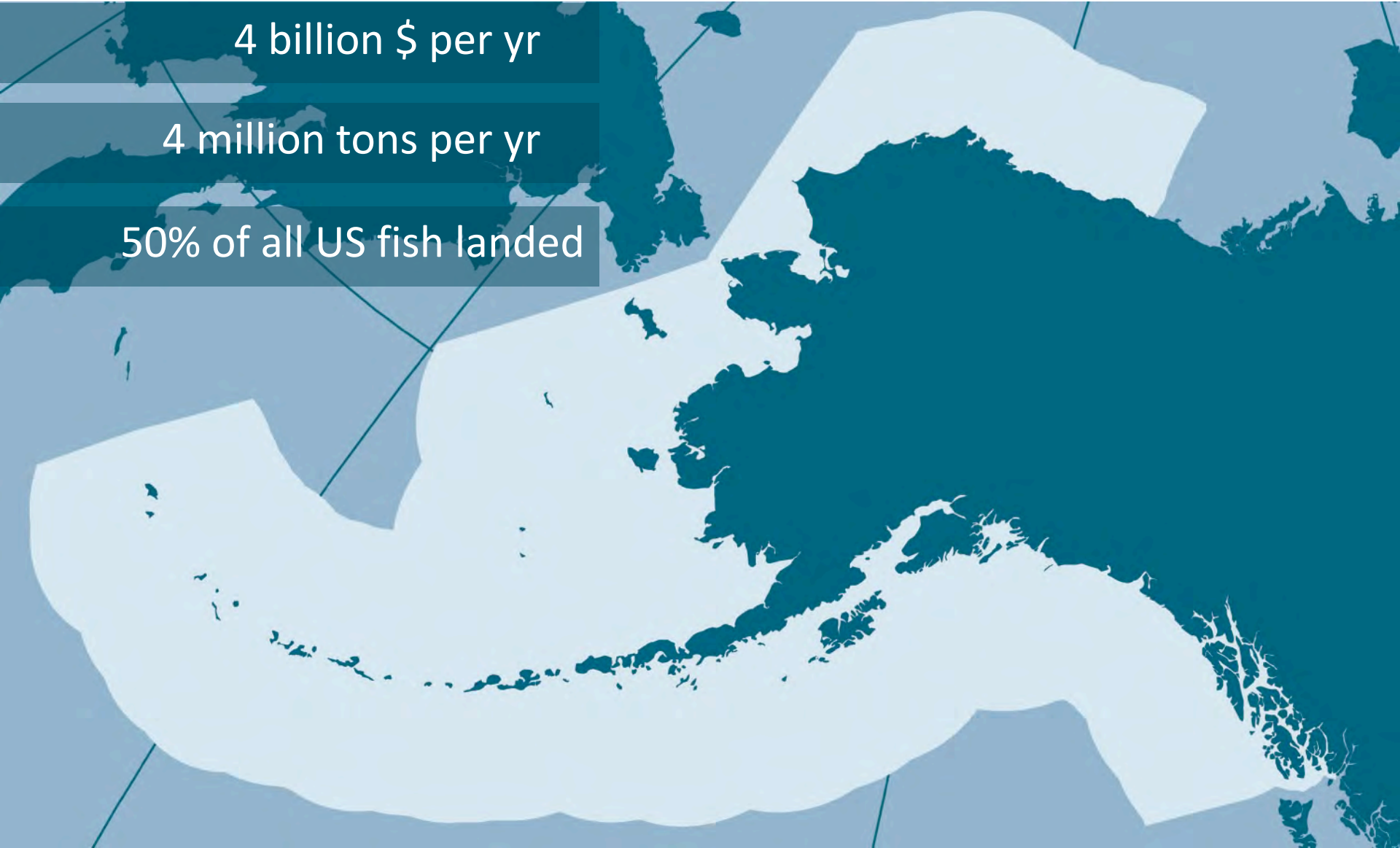
Figure SPM.4 | Observed and projected changes in annual average surface temperature. This figure informs understanding of climate-related risks in the WGII AR5. It illustrates temperature change observed to date and projected warming under continued high emissions and under ambitious mitigation.

Alaska-wide Fisheries

4 billion \$ per yr

4 million tons per yr

50% of all US fish landed



Alaska-wide Fisheries

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Bering Sea Fisheries

2 billion \$ per yr

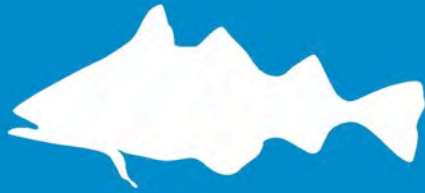
2 million tons per yr

40% of all US fish landed

Bering Sea

A map of Alaska and the Bering Sea region. The Bering Sea is highlighted in a light blue color. Three data callouts are positioned on the left side of the map, and three more are on the right side. The callouts on the left are for Alaska-wide fisheries, and the callouts on the right are for Bering Sea fisheries. The Bering Sea label is centered over the highlighted area.

**COLD
REGIME**



**Higher
Overwinter
Survival**



REGIME SHIFT



**Lower
Overwinter
Survival**



**WARM
REGIME**

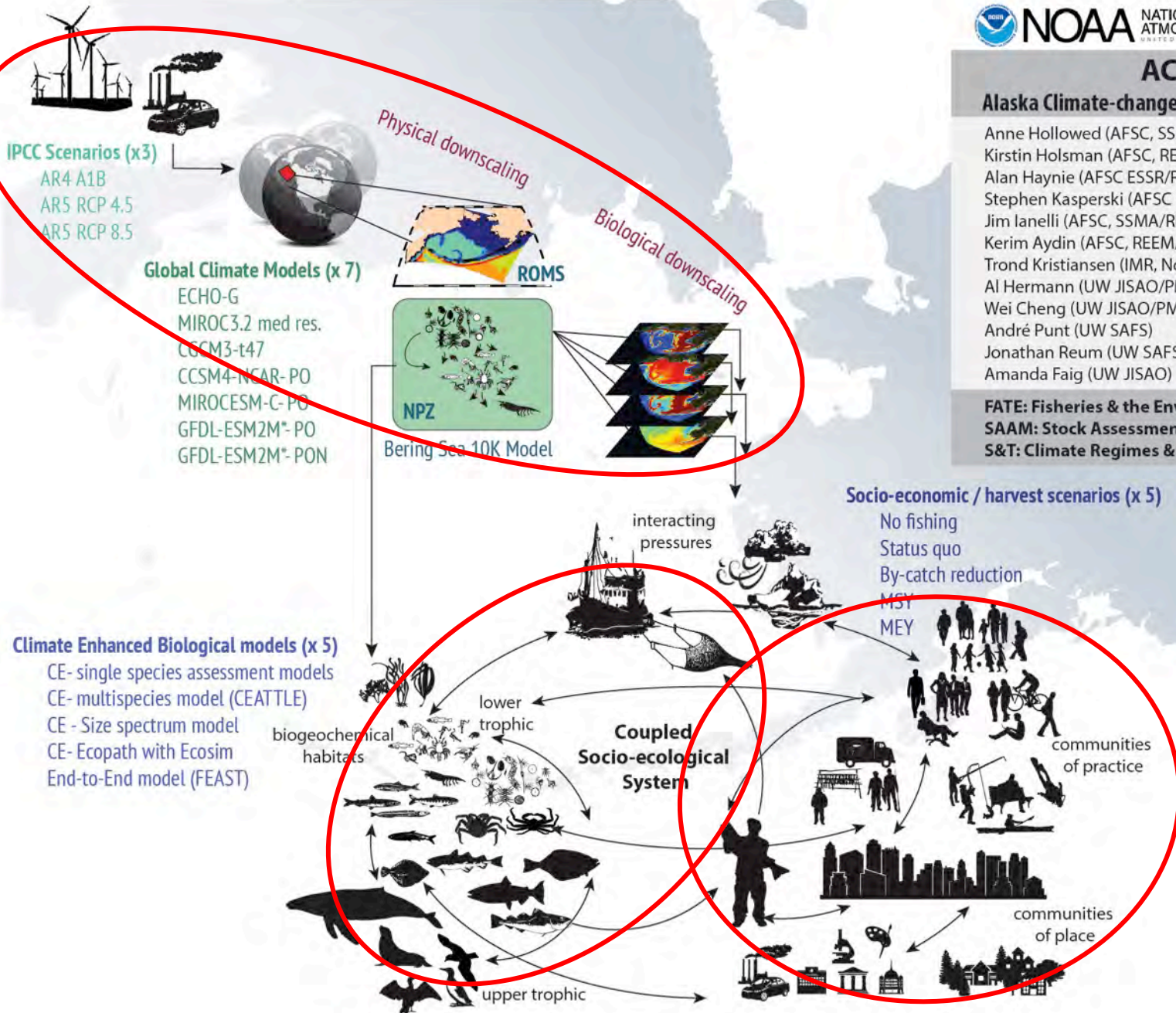
ACLIM

Alaska Climate-change Integrated Modeling Project

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FATE: Fisheries & the Environment
SAAM: Stock Assessment Analytical Methods
S&T: Climate Regimes & Ecosystem Productivity



Physical & NPZ modeling



Dr. Al Hermann



Dr. Wei Cheng

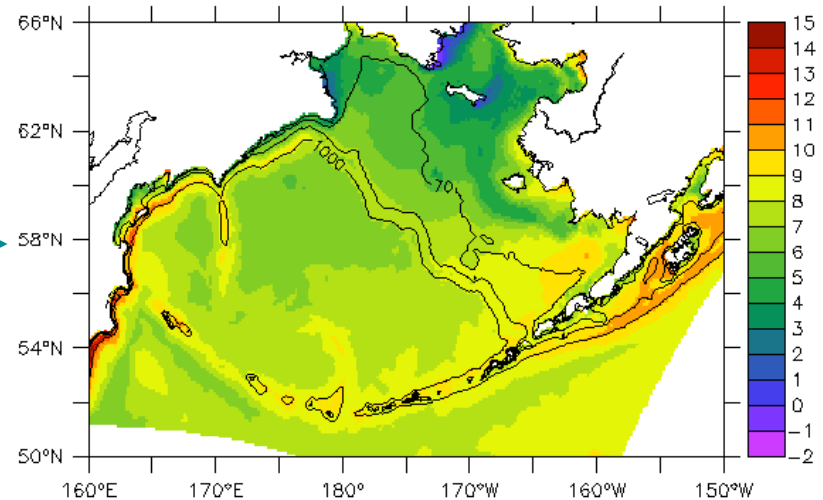
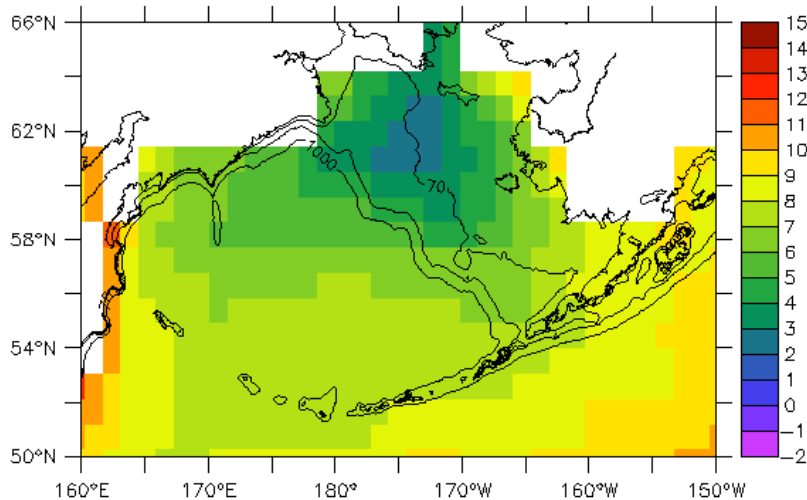
JISAO/UW and NOAA/PMEL

Photo: Mark Holsman

IPCC global projections drive regional model (*dynamical downscaling*)

IPCC model (MIROC)

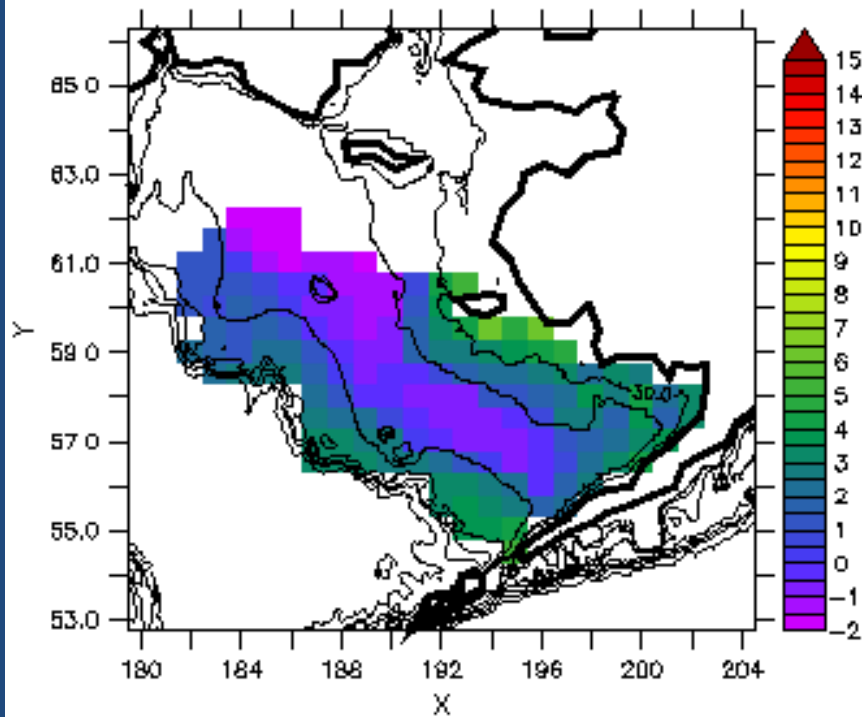
Regional model (Bering10K)



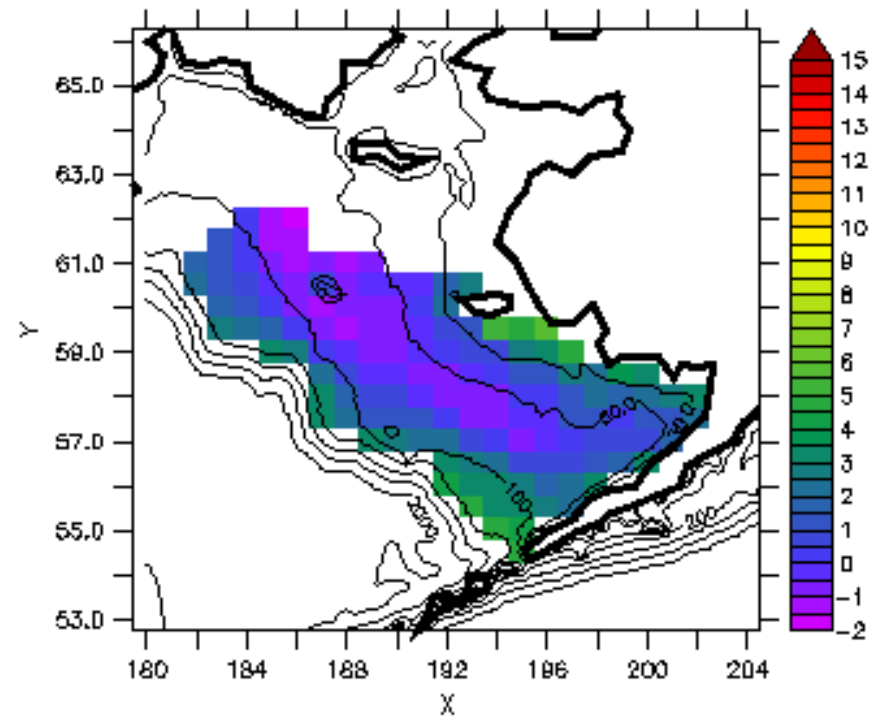
IPCC global atmosphere provides *surface forcing*
IPCC global ocean provides *boundary conditions*

Bering10K validation: Bottom Temp (deg C) summer 2009

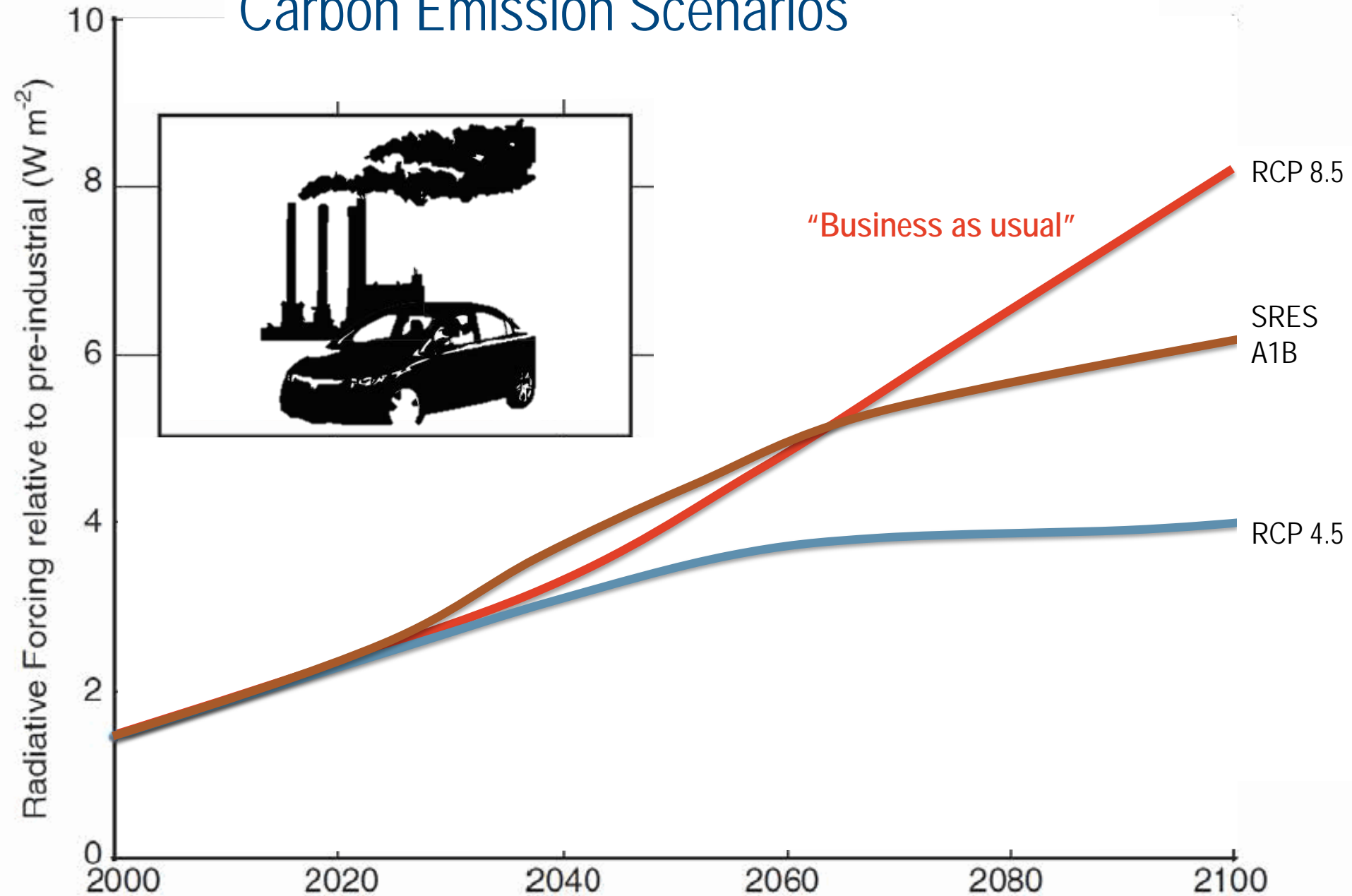
DATA



MODEL

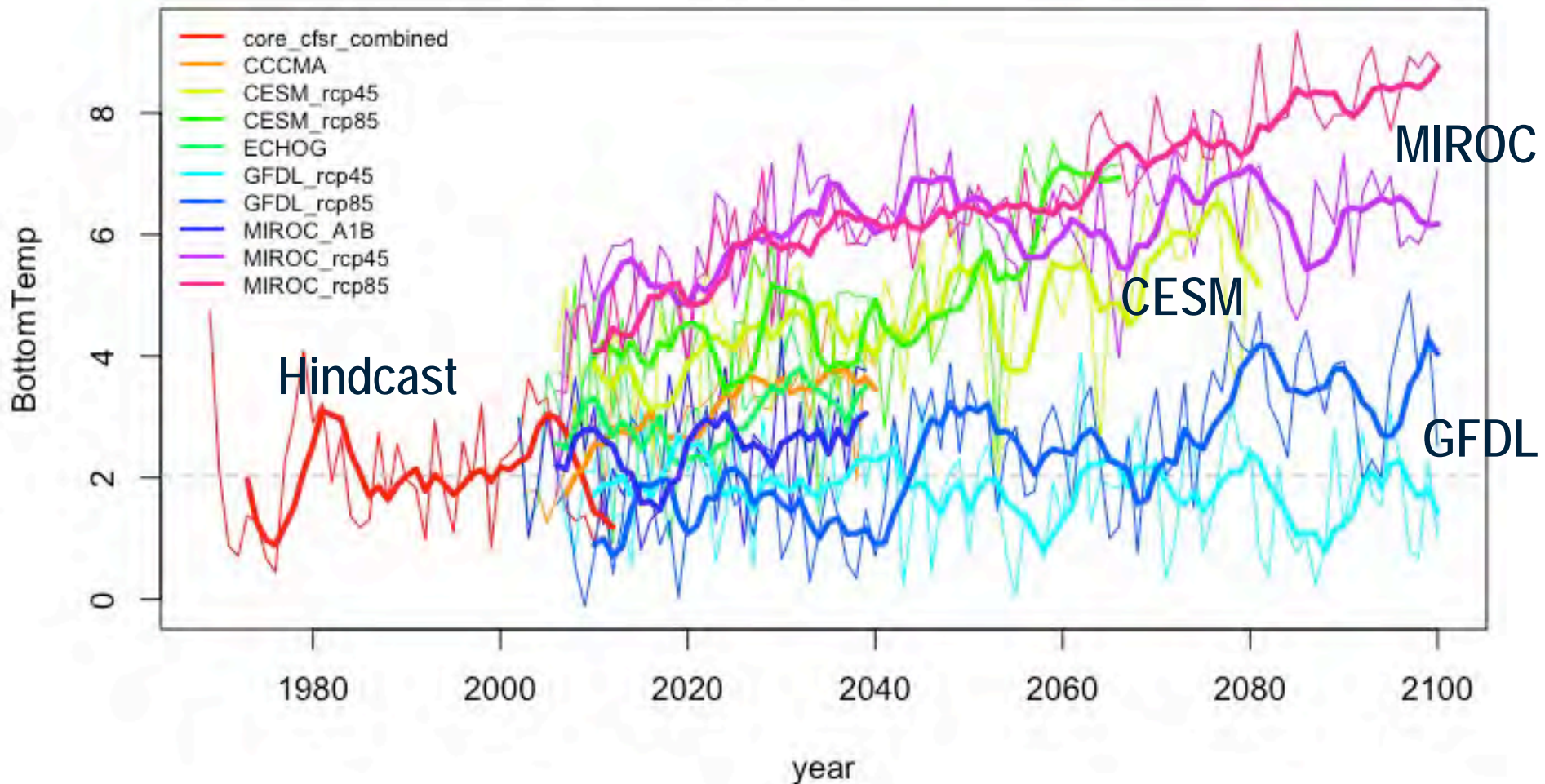


Carbon Emission Scenarios

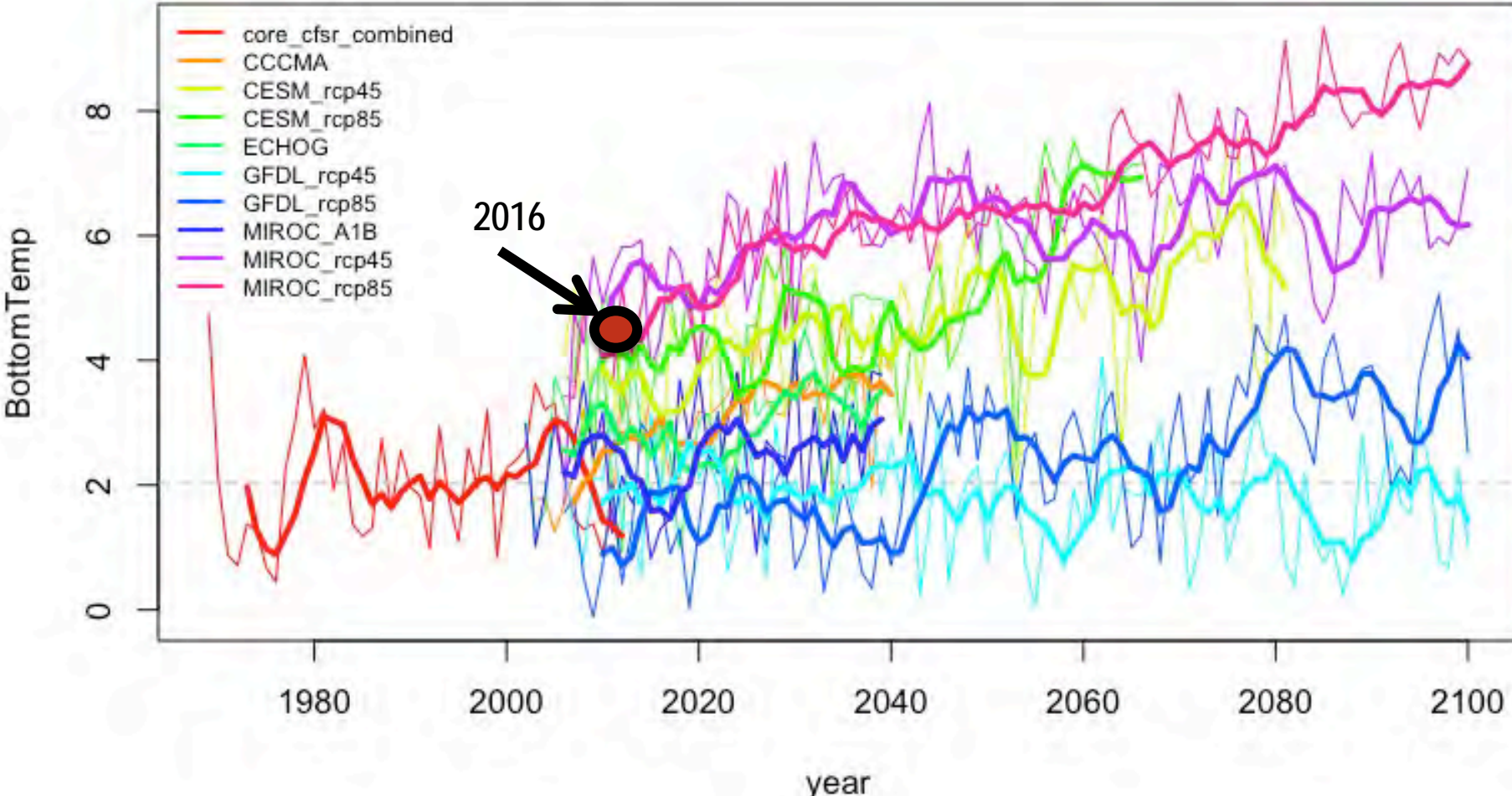


Ensemble of Bering10K output: Bottom Temperature

BottomTemp ; with smoother = 5 yr



BottomTemp ; with smoother = 5 yr



Biological modeling



Photo: Mark Holsman

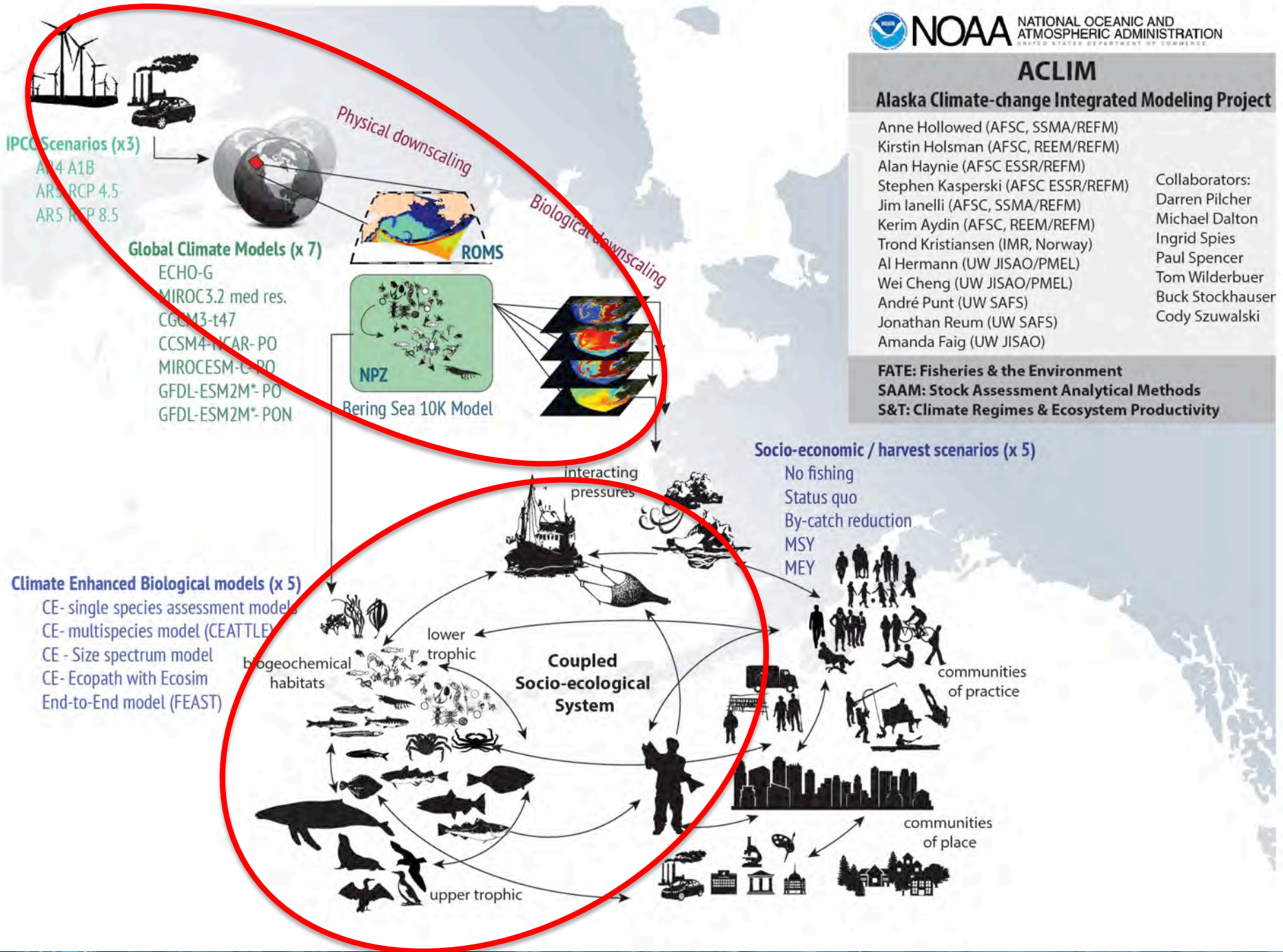
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FATE: Fisheries & the Environment
SAAM: Stock Assessment Analytical Methods
S&T: Climate Regimes & Ecosystem Productivity



Climate Enhanced Biological models (x 5)

CE- single species assessment model
 CE- multispecies model (CEATTLE)
 CE - Size spectrum model
 CE- Ecopath with Ecosim
 End-to-End model (FEAST)

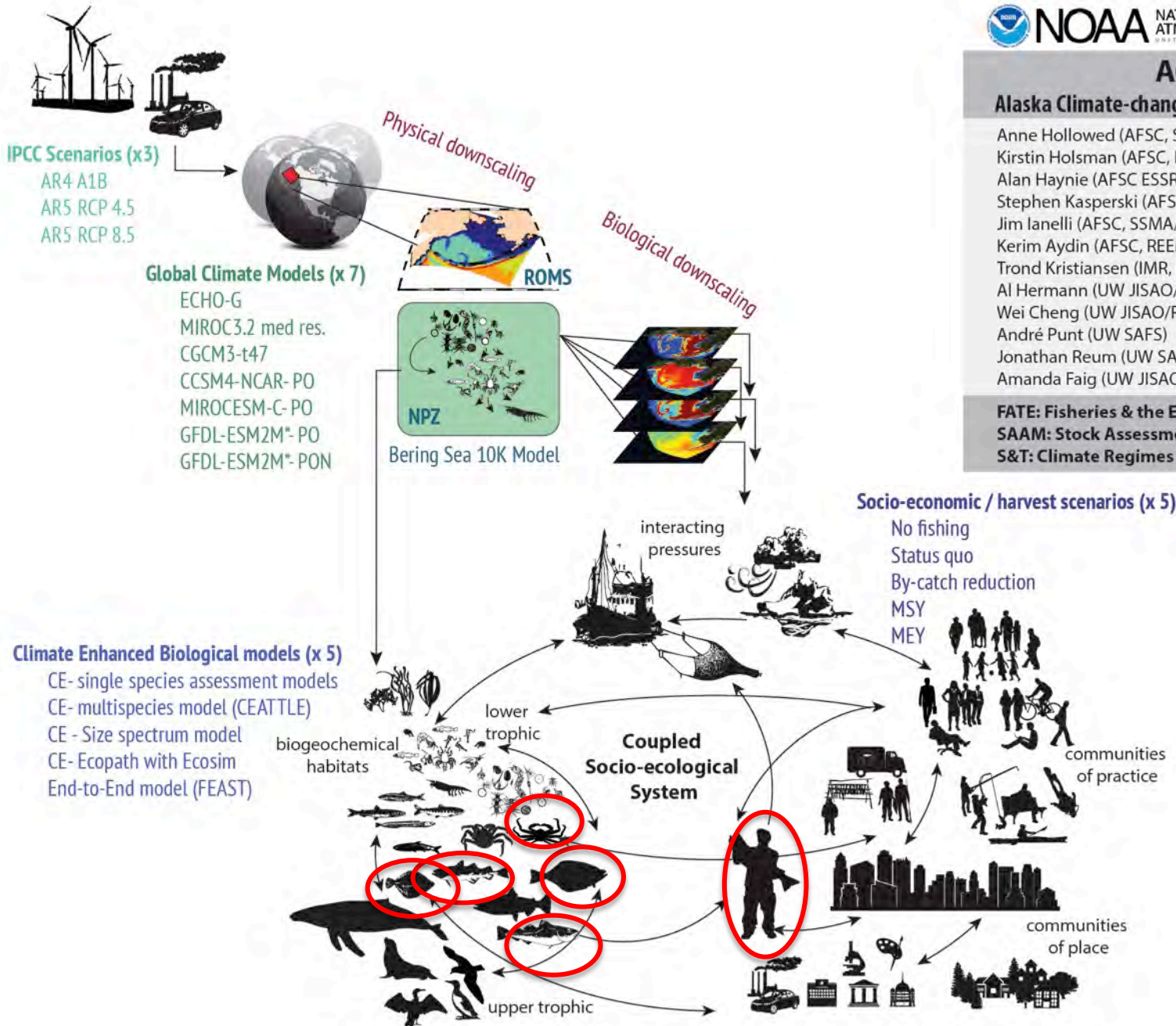
ACLIM

Alaska Climate-change Integrated Modeling Project

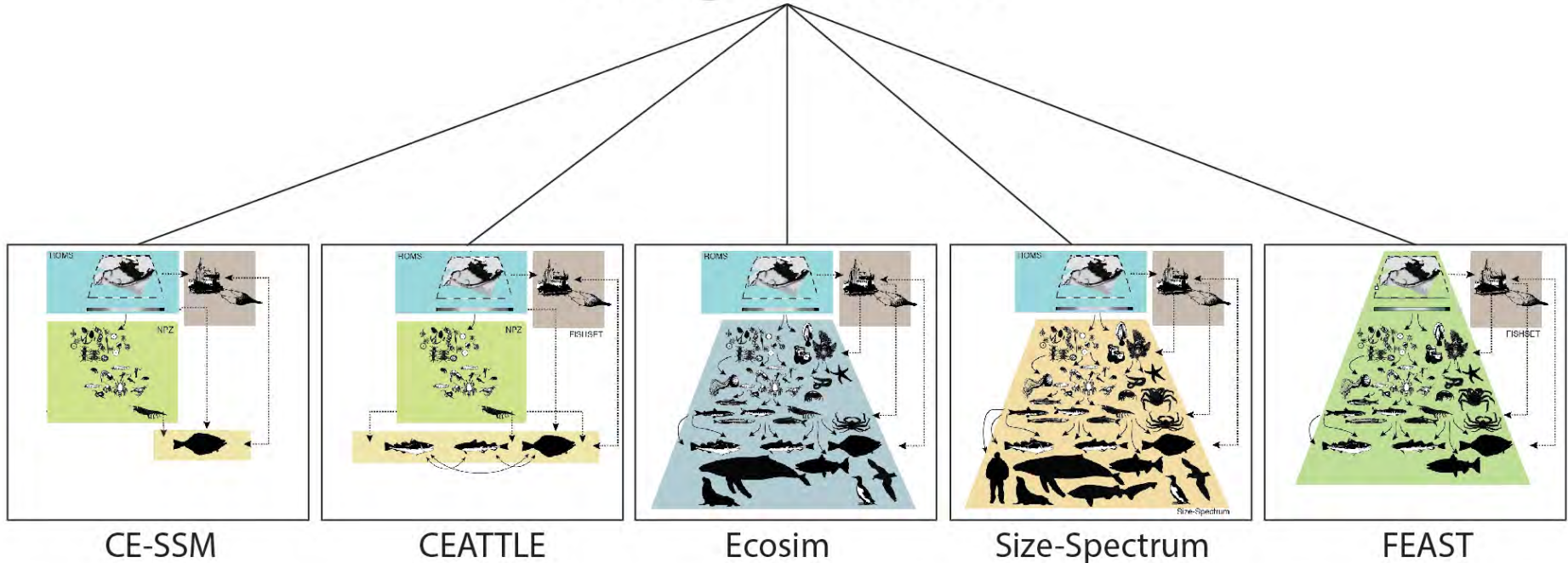
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Bering Sea Models

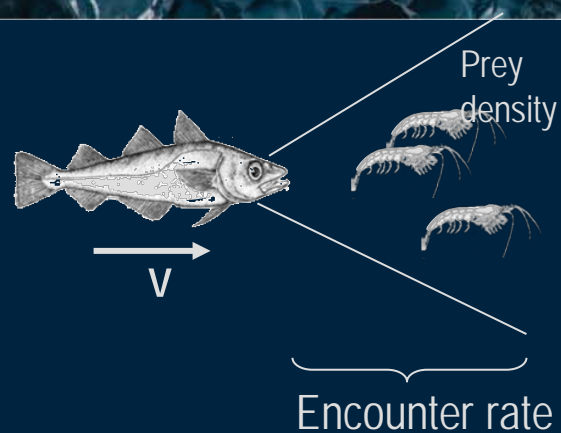


Additive Pressures

Multiple Interacting (non-linear) Pressures

Increasing complexity

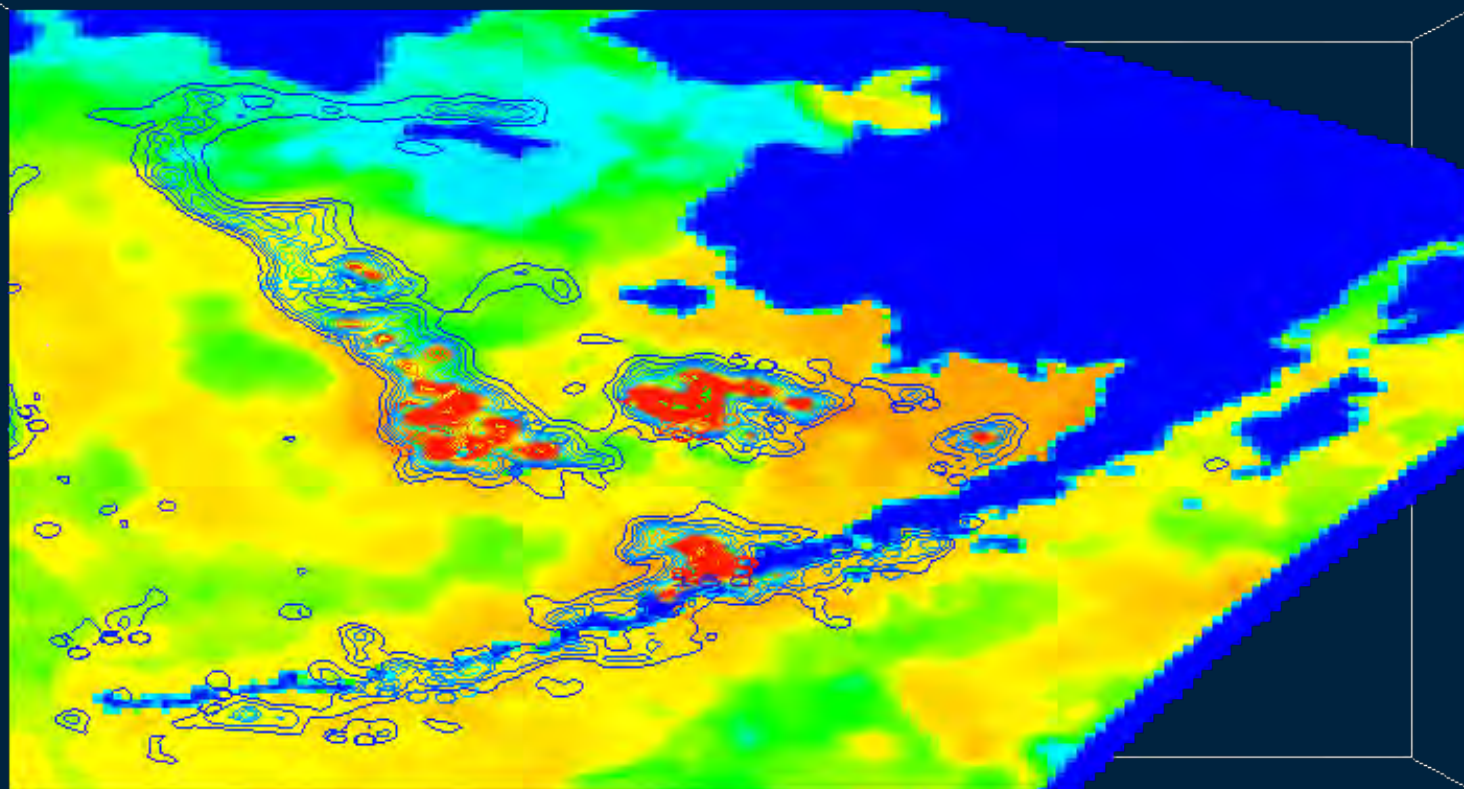
Faster



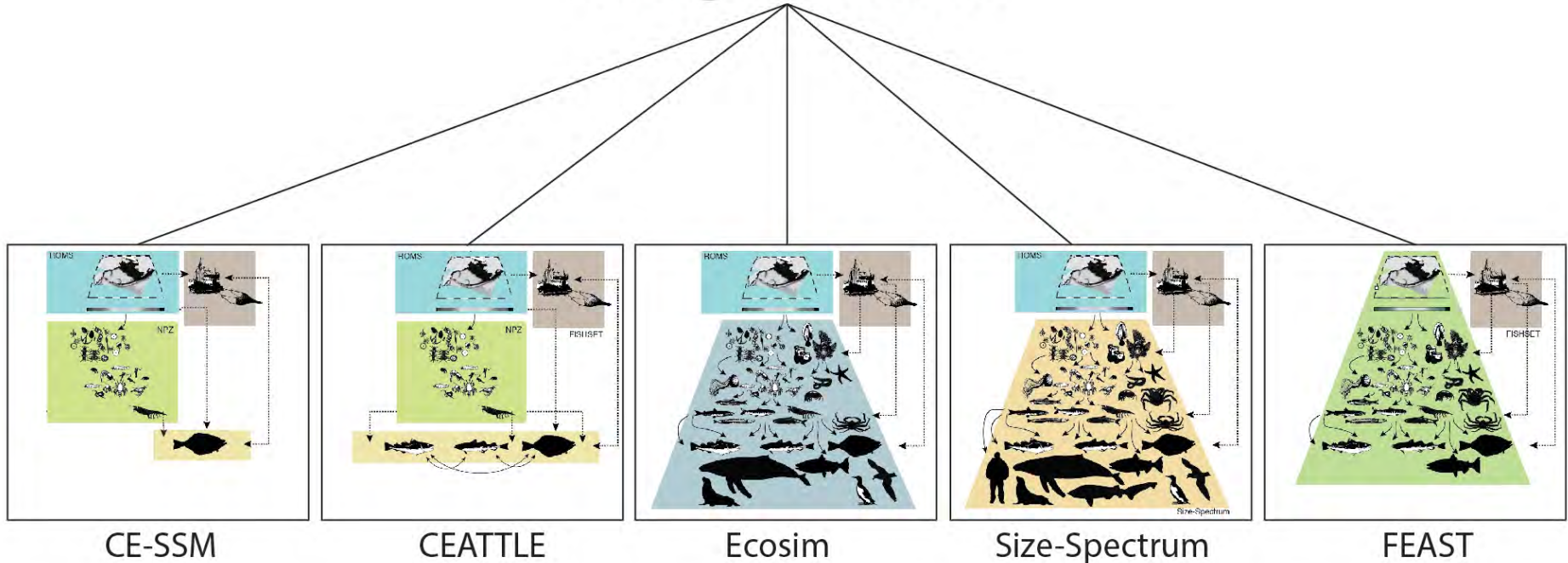
Modeled age 5 pollock biomass (colored contours)
and 0-300m integrated euphausiid density (color field)
for July, 2004.

FEAST

Ortiz et al. 2016



Bering Sea Models



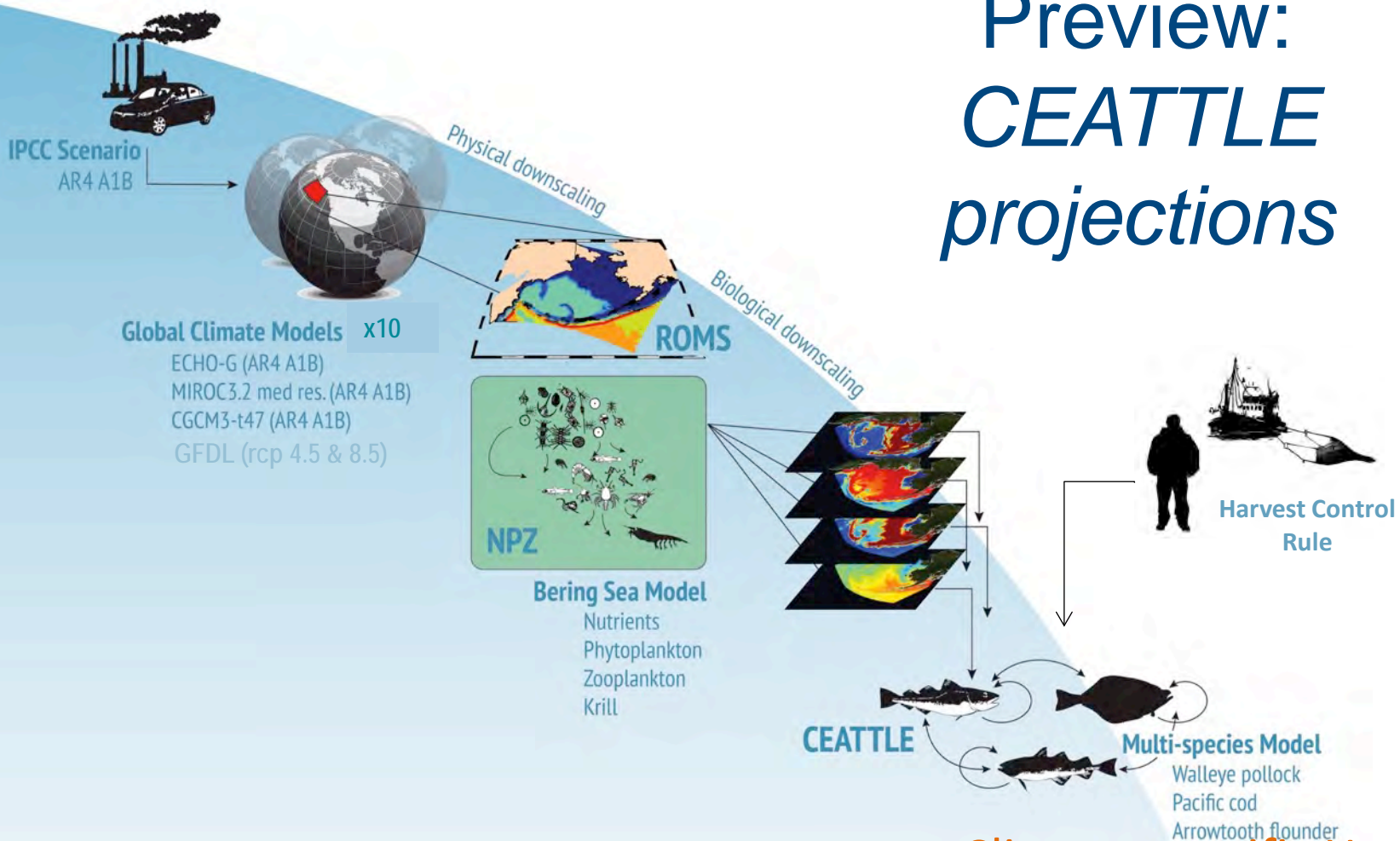
Additive Pressures

Multiple Interacting (non-linear) Pressures

Increasing complexity

Faster

Preview: *CEATTLE* projections



Holsman et al. in prep

Climate-specific Harvest &
Population Projections

Coupled Socio-Ecological System

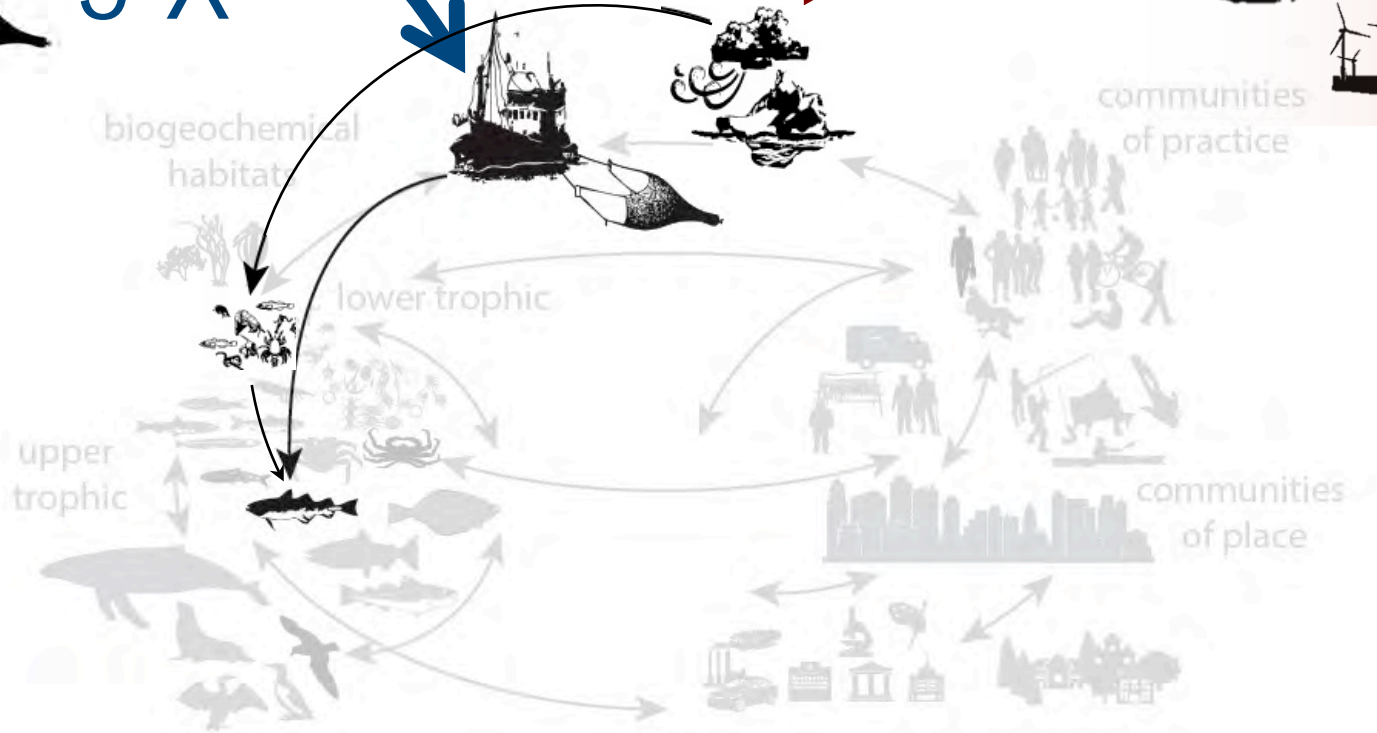
**Future
Climate Scenarios**

Harvest Scenarios

5 X

interacting pressures

11 X



Climate-enhanced Single-species Assessment Model

ACLIM: *Alaska Climate-change
Integrated Modeling project*



NOAA FISHERIES

Part 2 Presenter: Kirstin Holsman

Coupled Socio-Ecological System

Future
Climate Scenarios

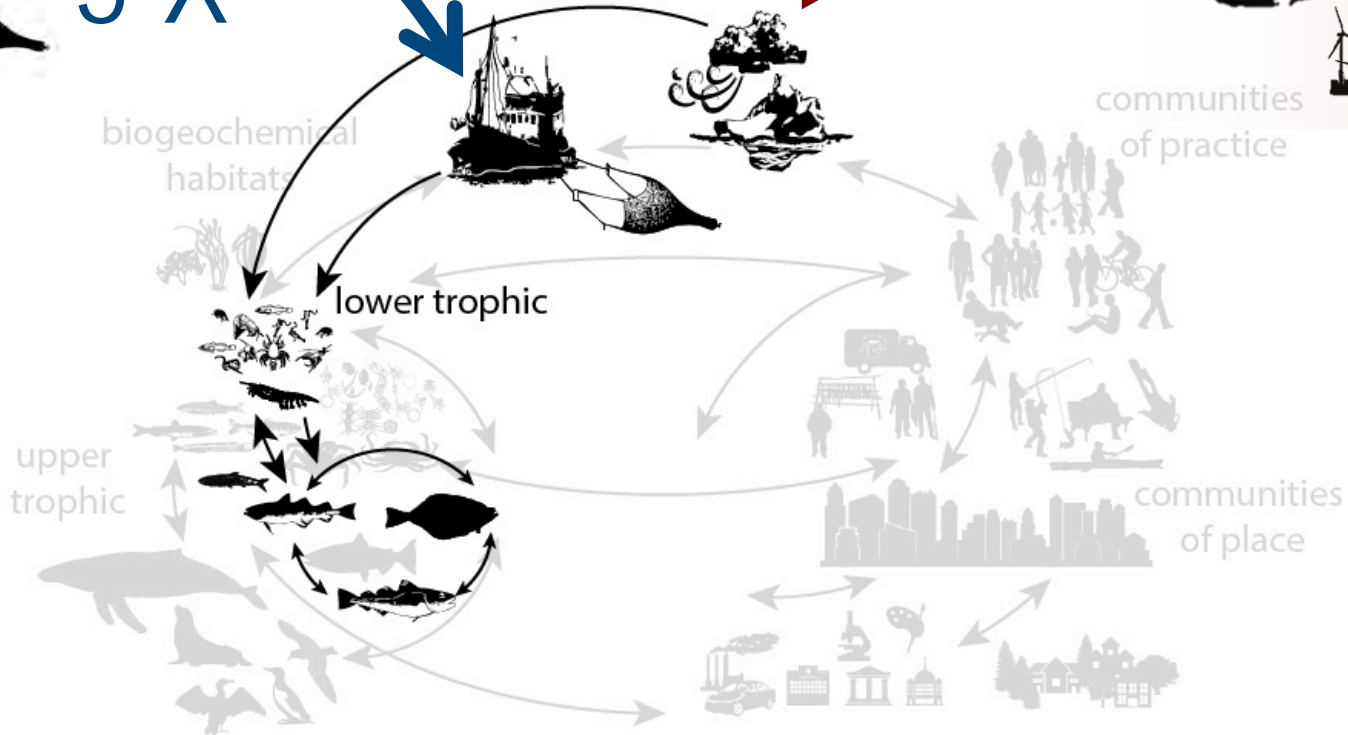


Harvest Scenarios

5 X

interacting pressures

11 X



Climate-enhanced Multi-species Assessment Model

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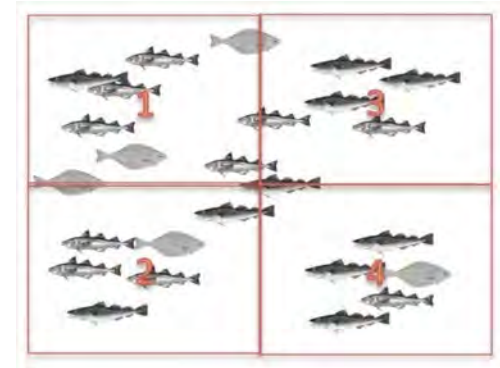
NOAA FISHERIES

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Sources of Error

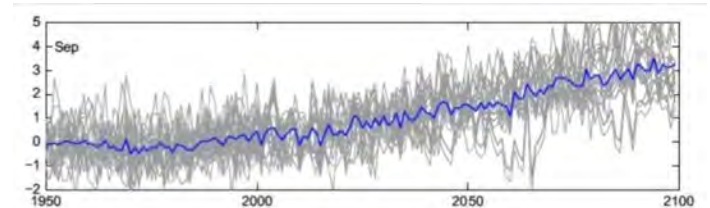
1. Observation error

- Measurement error
- Spatial heterogeneity
- Temporal variability
- Reduce through replication



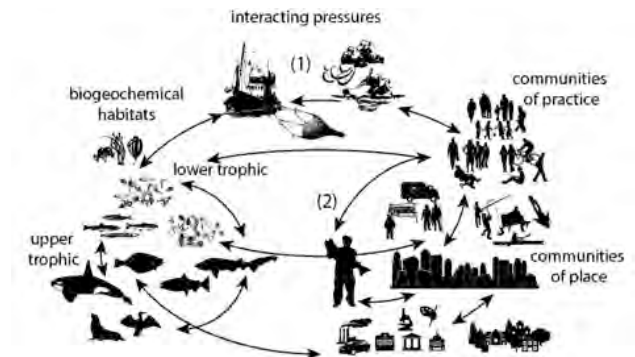
2. Process error

- “Noise” due to environmental variability
- Can be recreated using climate models
- MCMC to get “avg” trend right

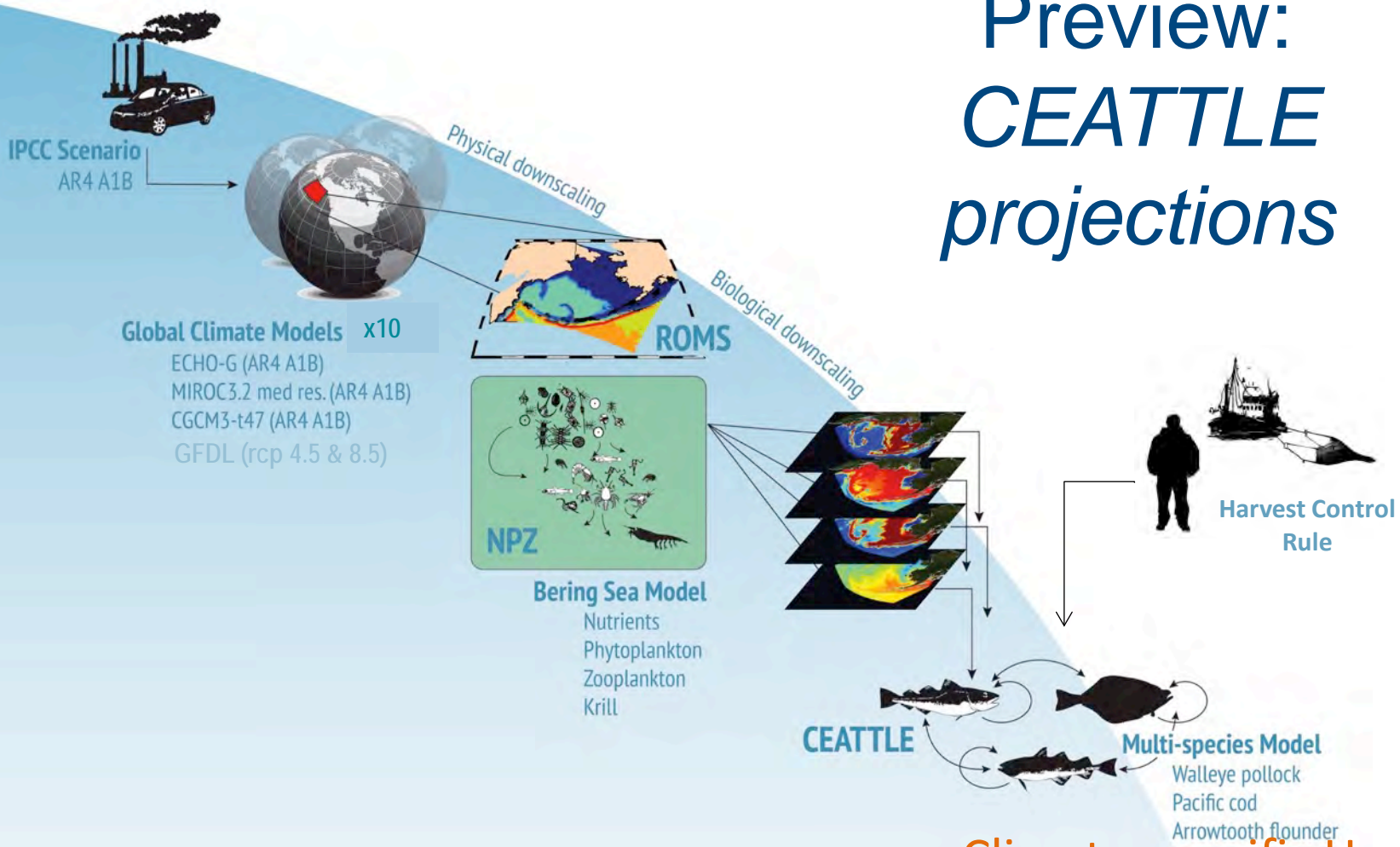


3. Model misspecification error

- Can result from spurious correlations
- Under or over estimate interactions
- More likely with indirect effects ?
- Experimental manipulation to reduce error
- Avg. from multiple models can help reduce error (“multi-model inference”)?



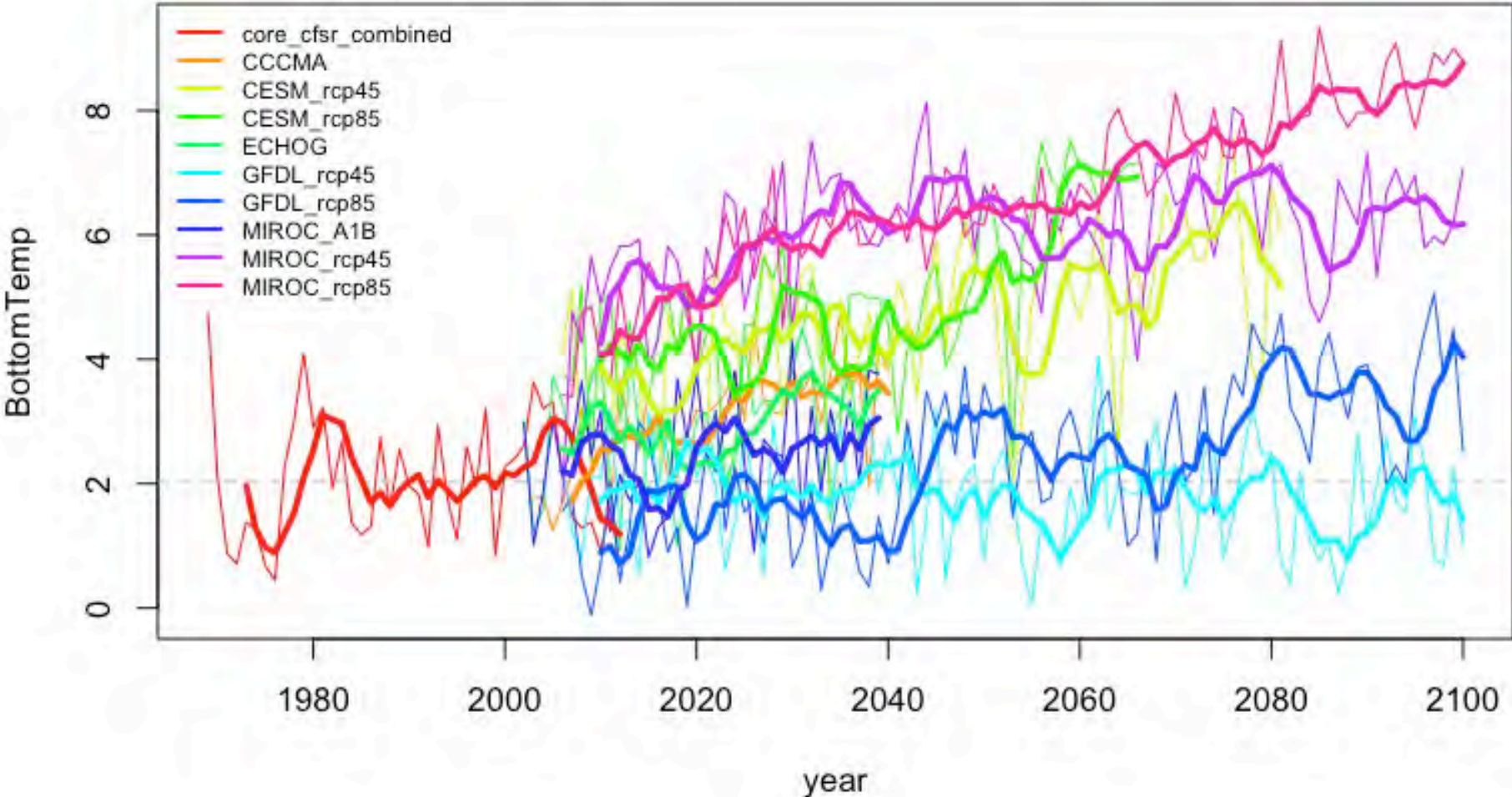
Preview: *CEATTLE* projections



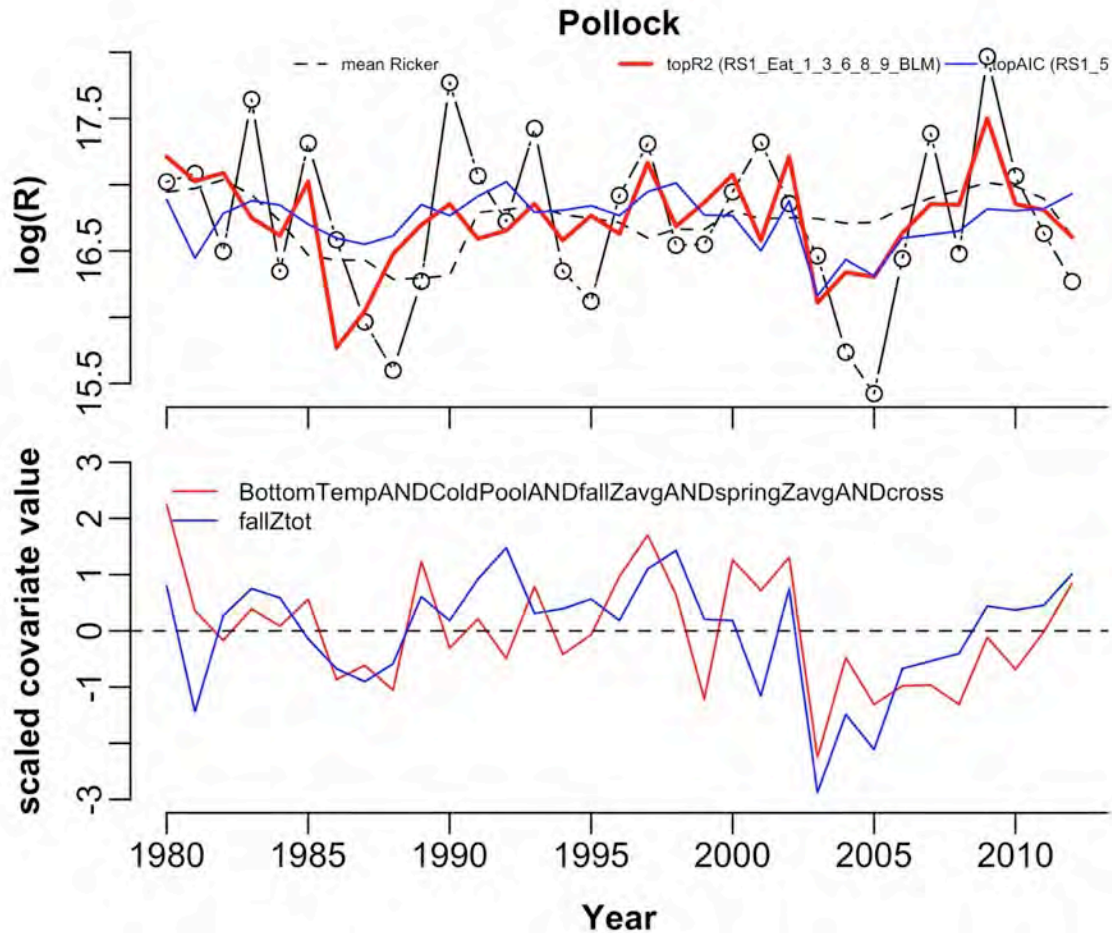
Holsman et al. in prep

Climate-specific Harvest &
Population Projections

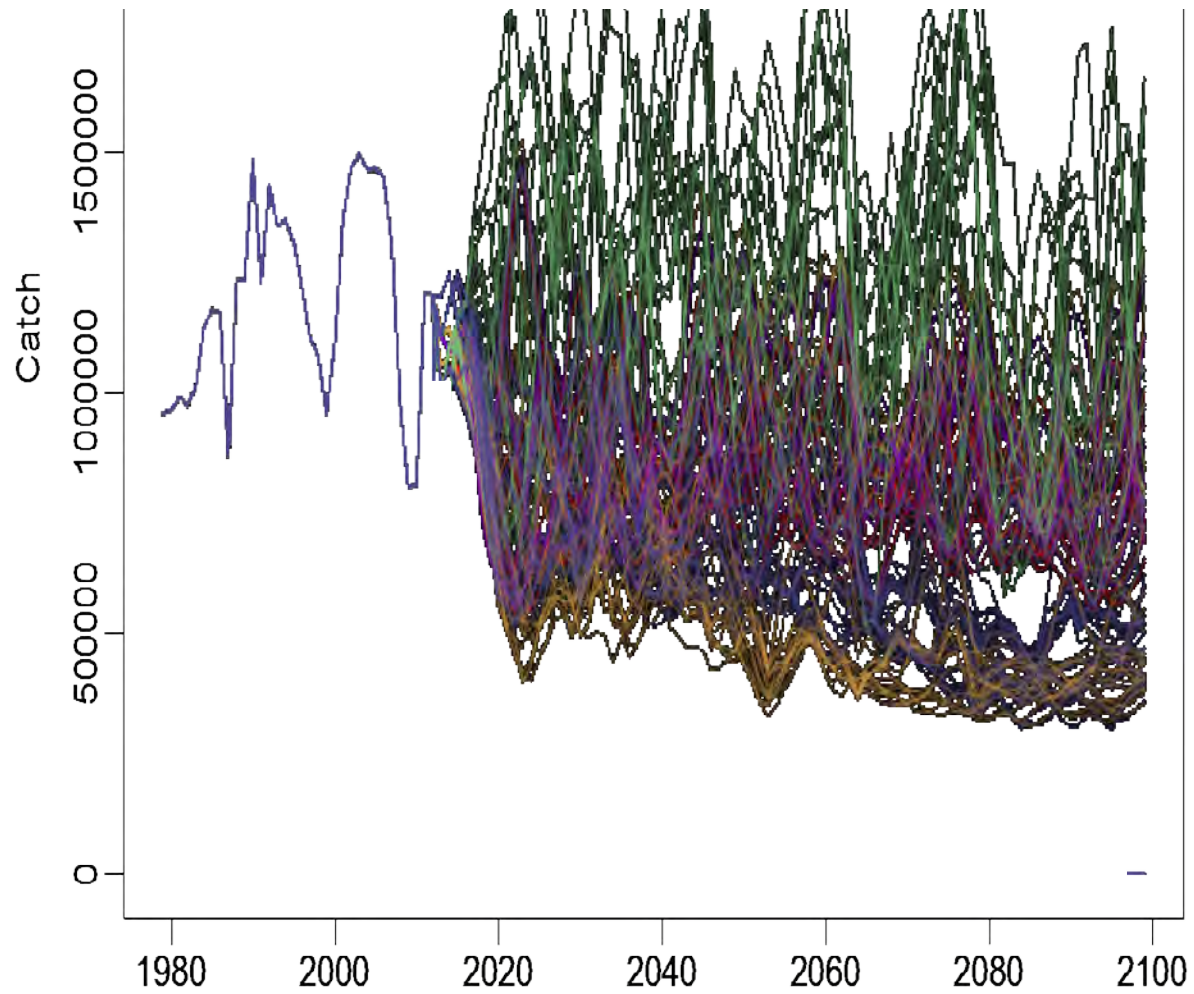
BottomTemp ; with smoother = 5 yr



CEATTLE: Recruitment



Catch under mean F





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Deep-Sea Research II

journal homepage: www.elsevier.com/locate/dsr2



Multi-model inference for incorporating trophic and climate uncertainty into stock assessments

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ARTICLE INFO

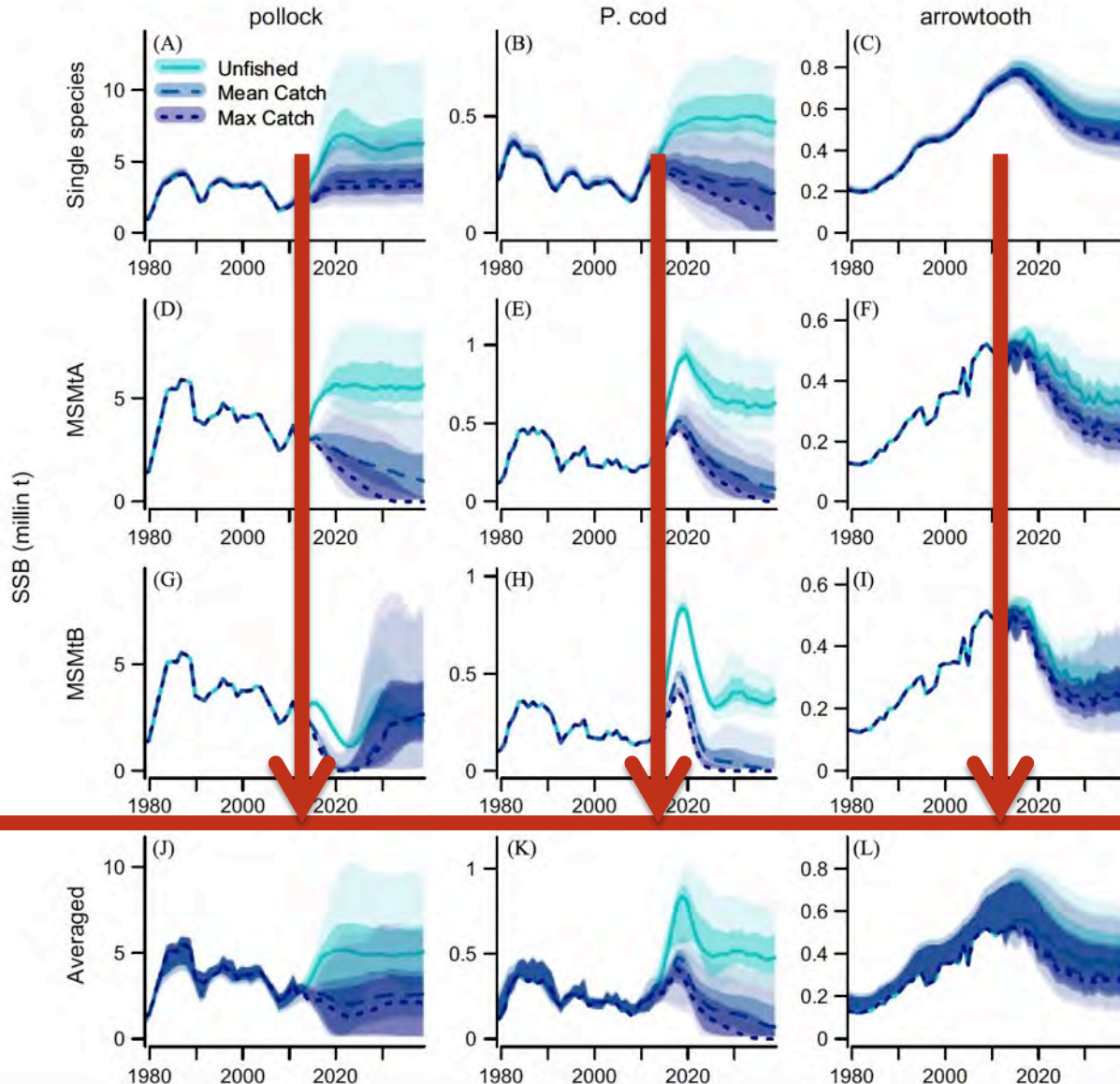
Keywords:

Model averaging
Model ensemble
Multi-species model

ABSTRACT

Ecosystem-based fisheries management (EBFM) approaches allow a broader and more extensive consideration of objectives than is typically possible with conventional single-species approaches. Ecosystem linkages may include trophic interactions and climate change effects on productivity for the relevant species within the system. Presently, models are evolving to include a comprehensive set of fishery and ecosystem information to address these broader management considerations. The increased

Blended results (three models)



Single spp.
No Temp.

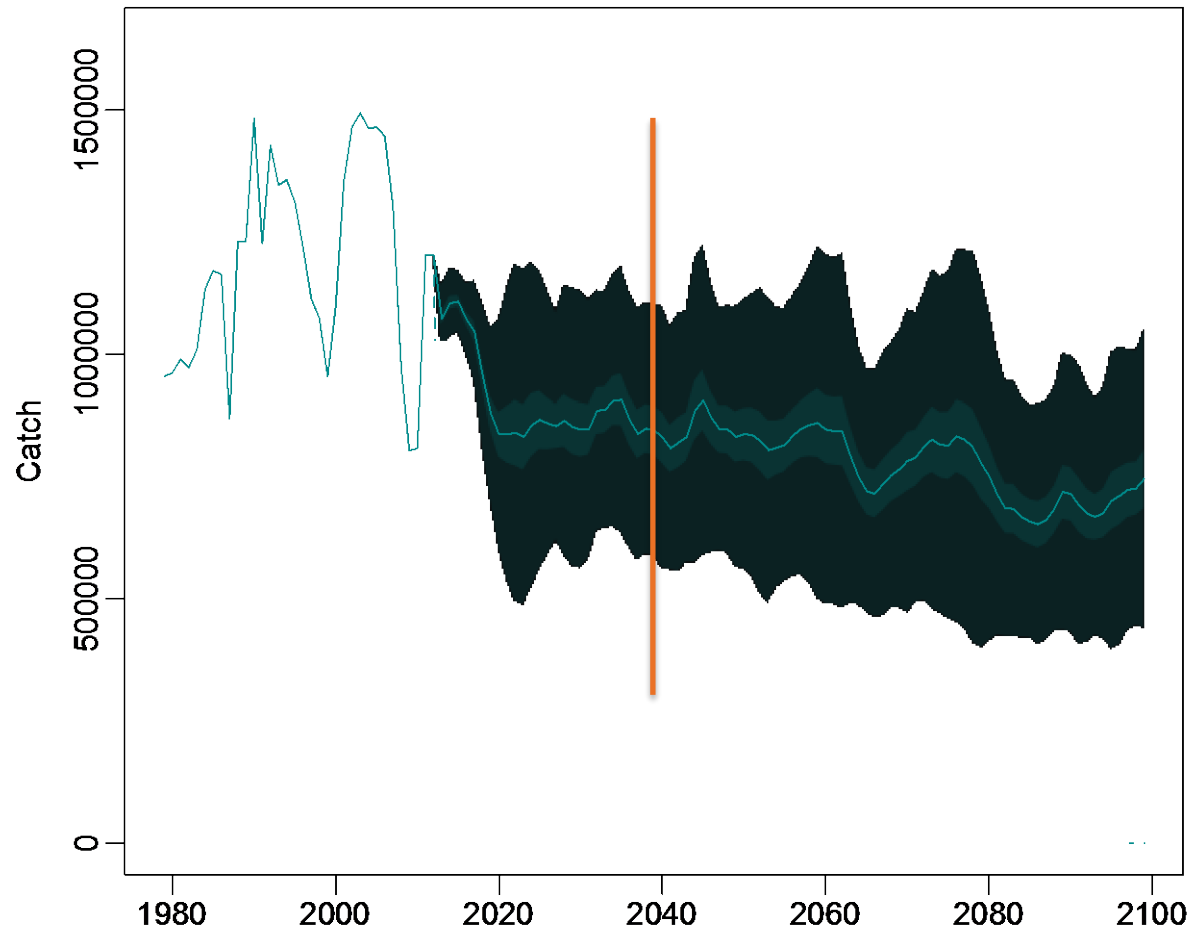
Single spp.
Avg. R_{hist}
Temp. \rightarrow W@A

Multi spp.
Temp. \rightarrow Ration
Avg. R_{hist}
Temp. \rightarrow W@A

Blended Result



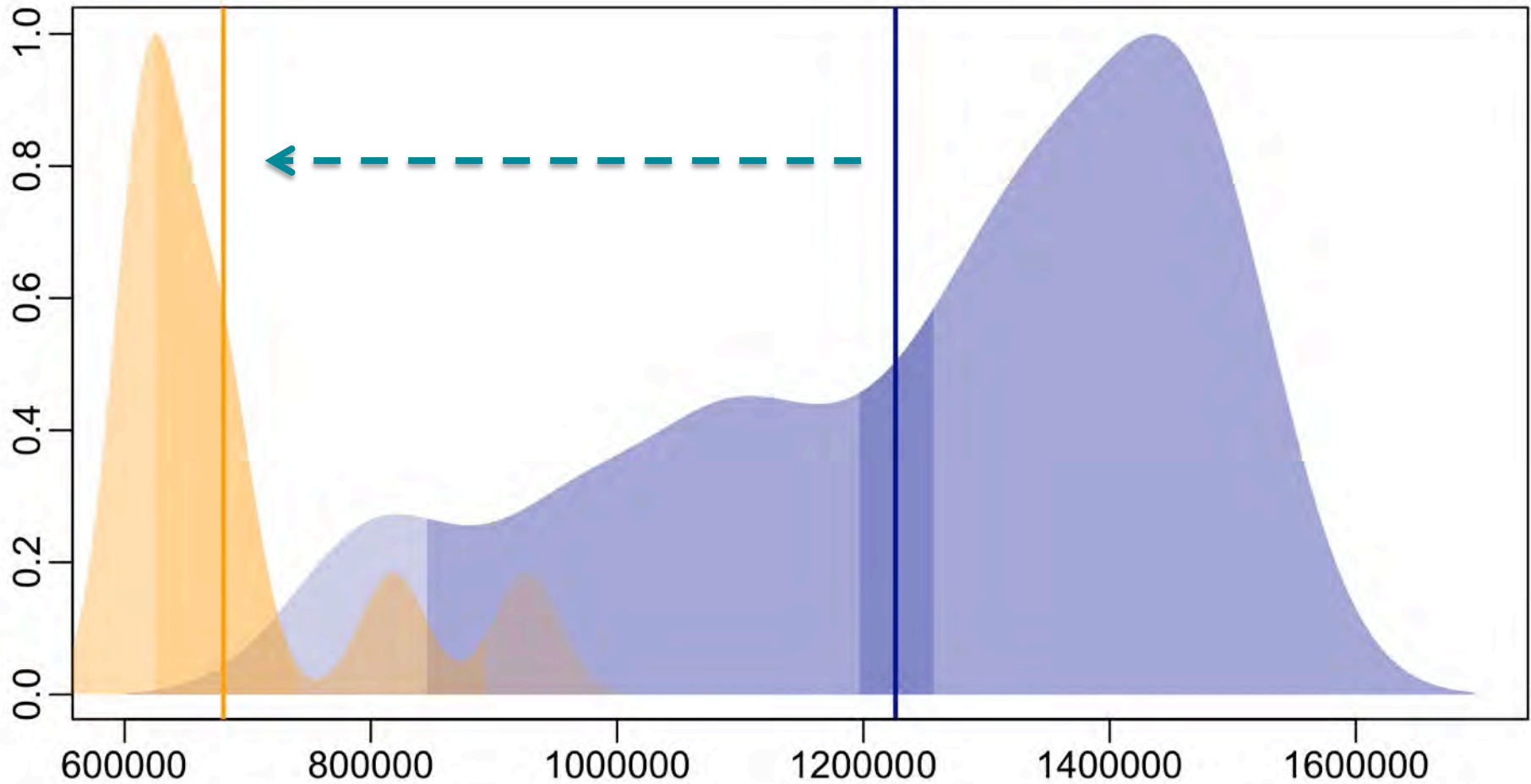
Catch under mean F



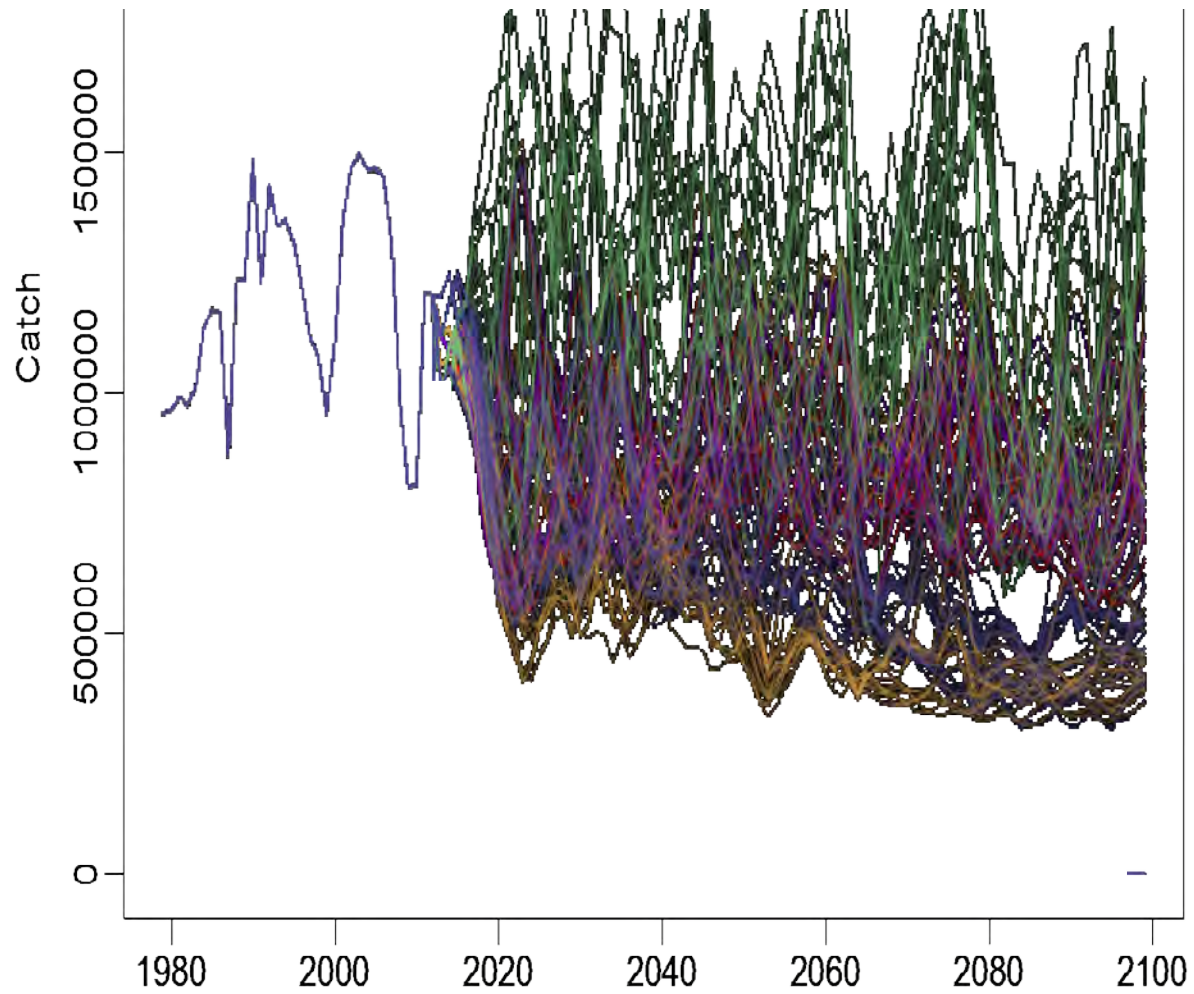
Catch under mean F

2040

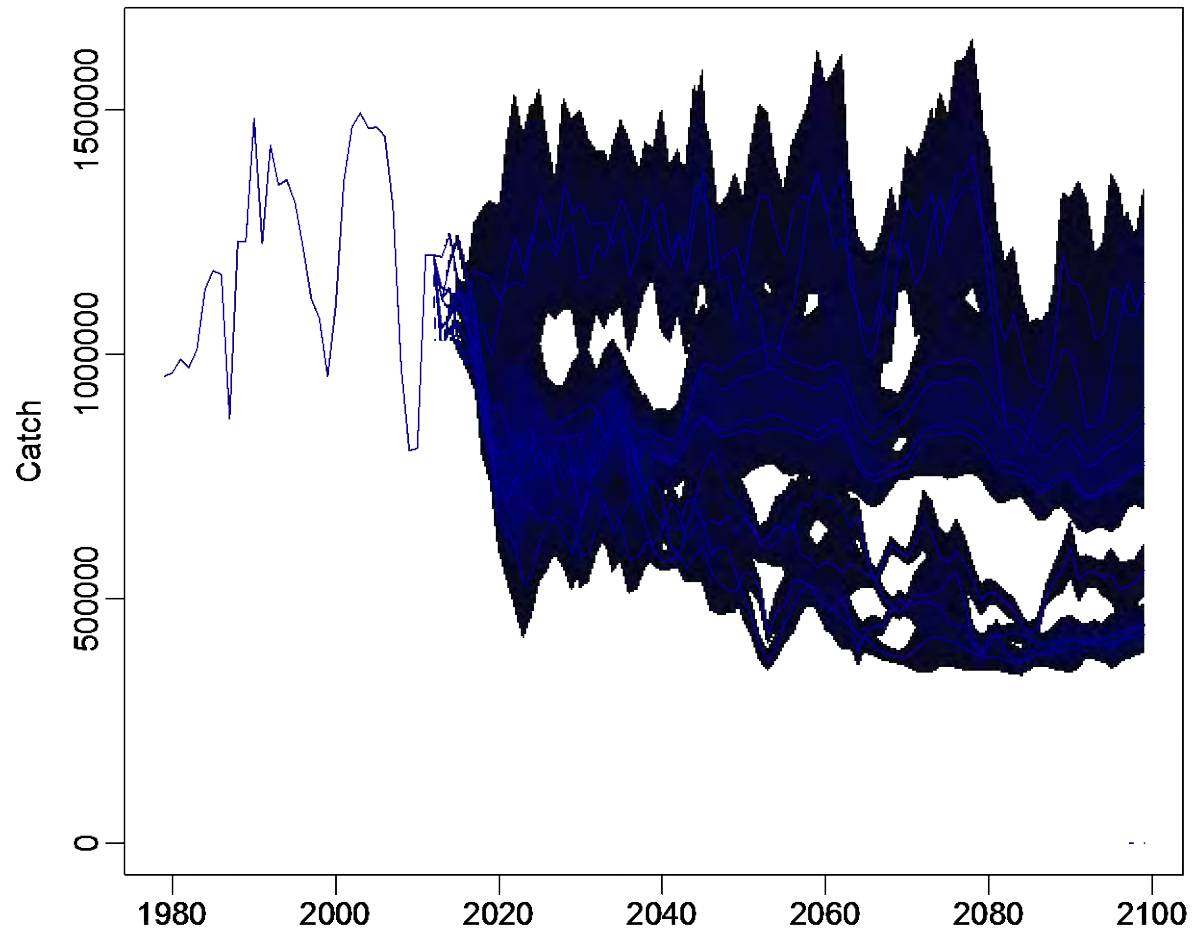
1990-2010



Catch under mean F

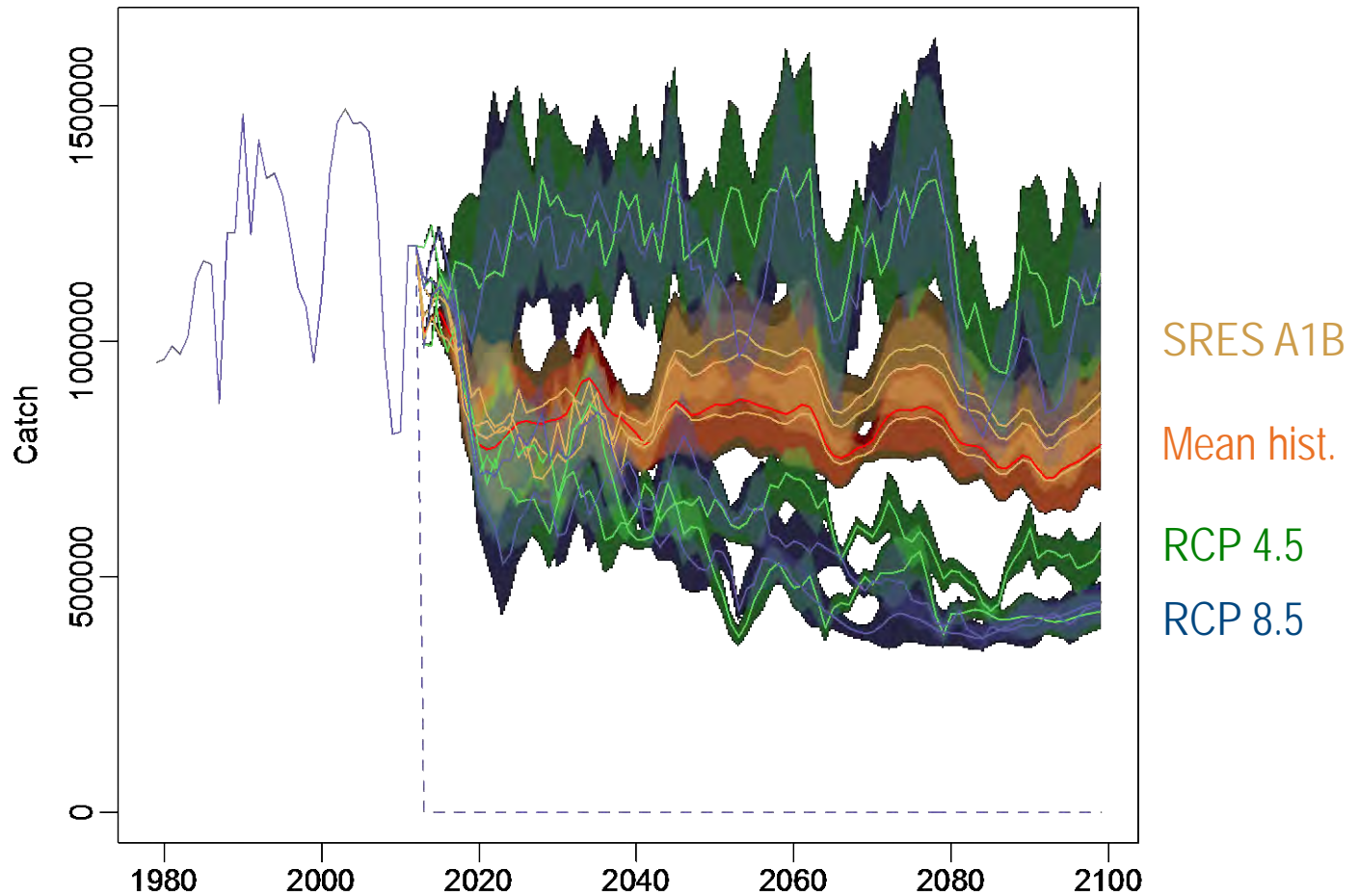


Catch under mean F

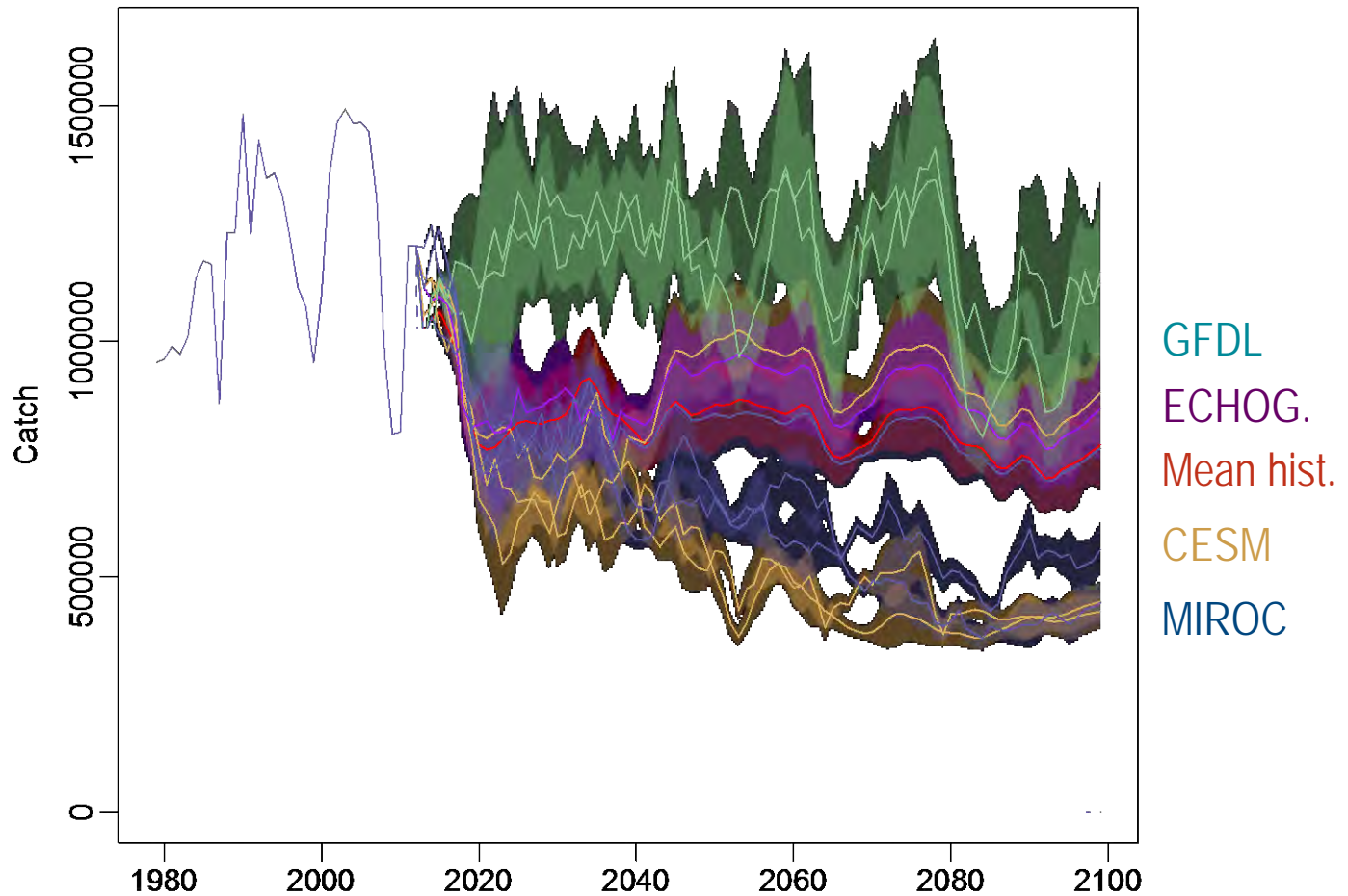


Catch under mean F

By climate scenario



Catch under mean F



Considerations for MMI:

- Consider “baseline” → bias correction
- Near-term or long-term? → Avg. or indiv.
- Tactical vs strategic? → communication
- Model weighting



Coupled Socio-Ecological System

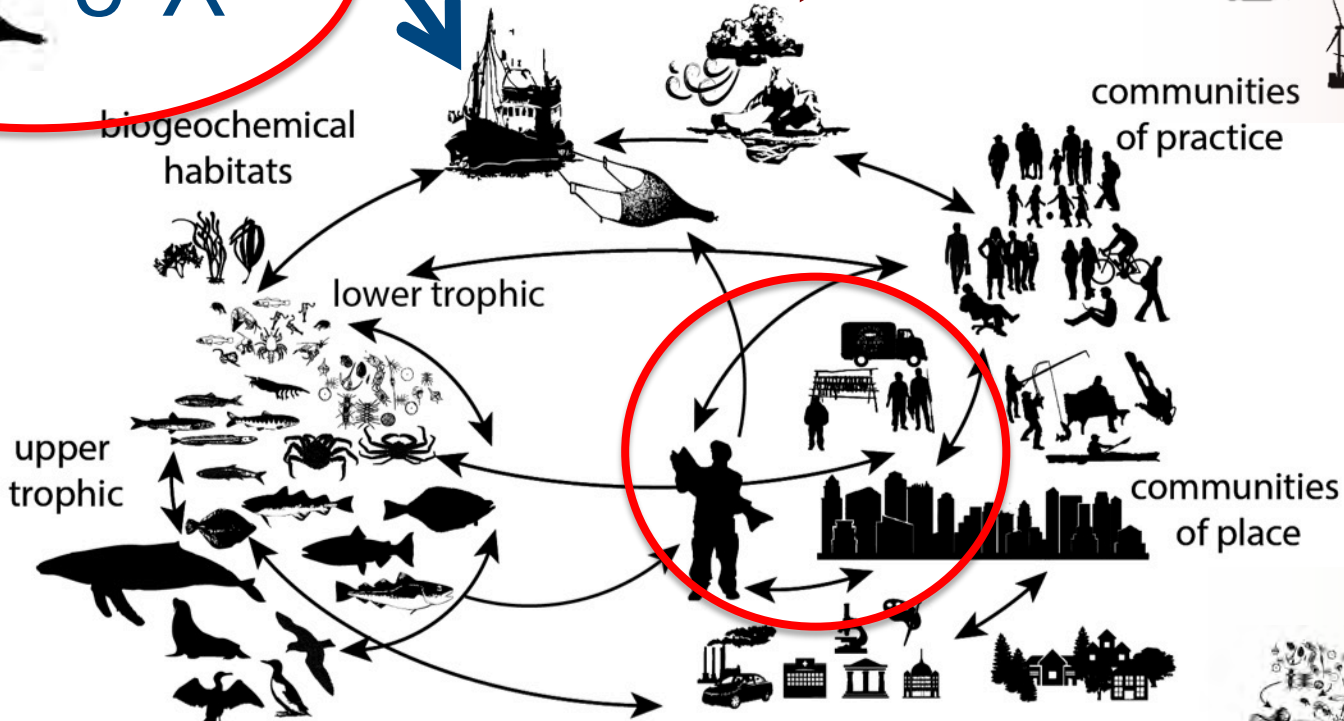
Future Climate Scenarios

Harvest Scenarios

5 X

interacting pressures

11 X



Climate-enhanced Biological Models

5 X

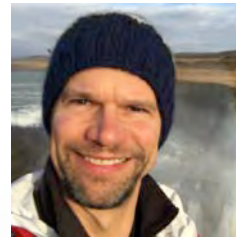
ACLIM: *Alaska Climate-change Integrated Modeling project*



NOAA FISHERIES

Part 2 Presenter: Kirstin Holsman

Socioeconomic elements (Alan Haynie)



Dr. Alan Haynie
Economist at
NMFS/AFSC/NOAA
alan.haynie@noaa.gov



Photo: Mark Holsman

Thanks!

Photo: Mark Holsman

NPRB & BSIERP Team
ACLIM Team
NOAA IEA Program

*"Behind these numbers lies, of course, an infinity
of movements and of destinies."
– von Bertalanffy 1938
...and of people!*

FATE: Fisheries & the Environment
SAAM: Stock Assessment Analytical Methods
S&T: Climate Regimes & Ecosystem Productivity

Coupled Socio-Ecological System

**Future
Climate Scenarios**

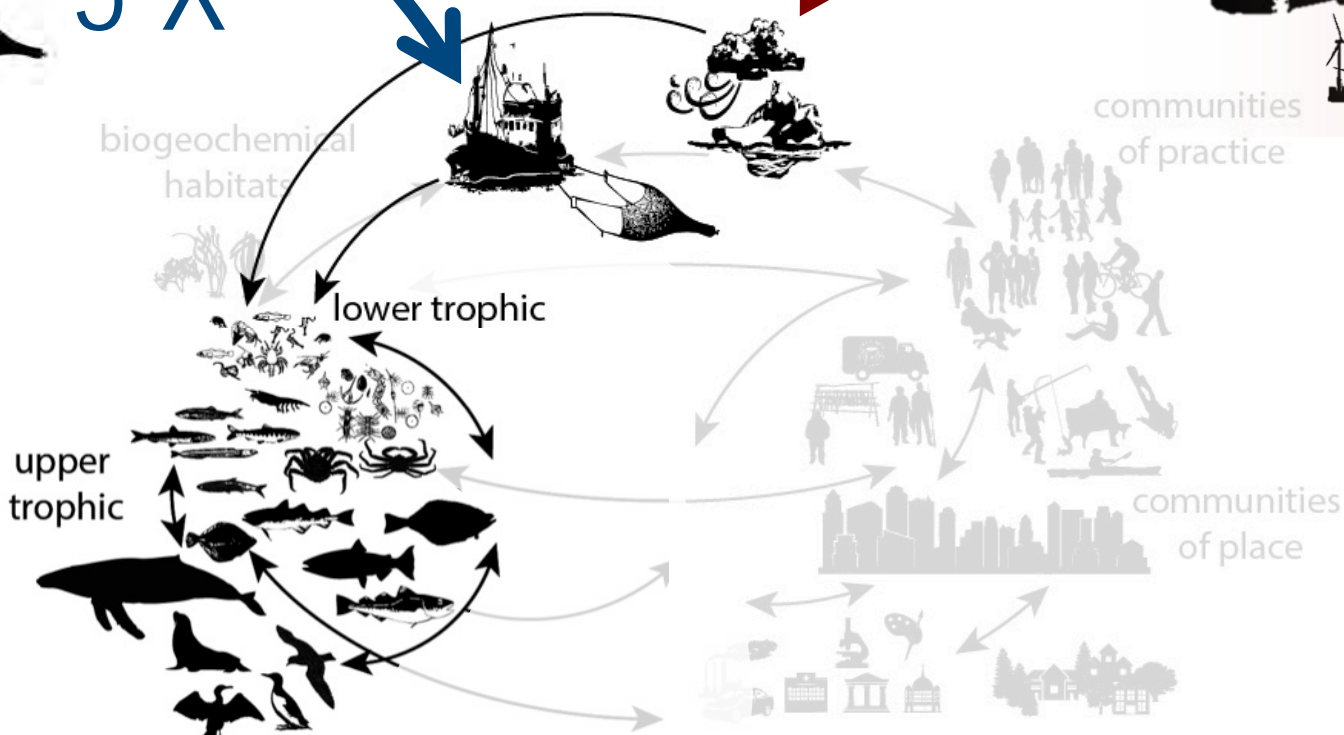


Harvest Scenarios

5 X

interacting pressures

11 X



**Climate-enhanced
Ecosystem
Models**

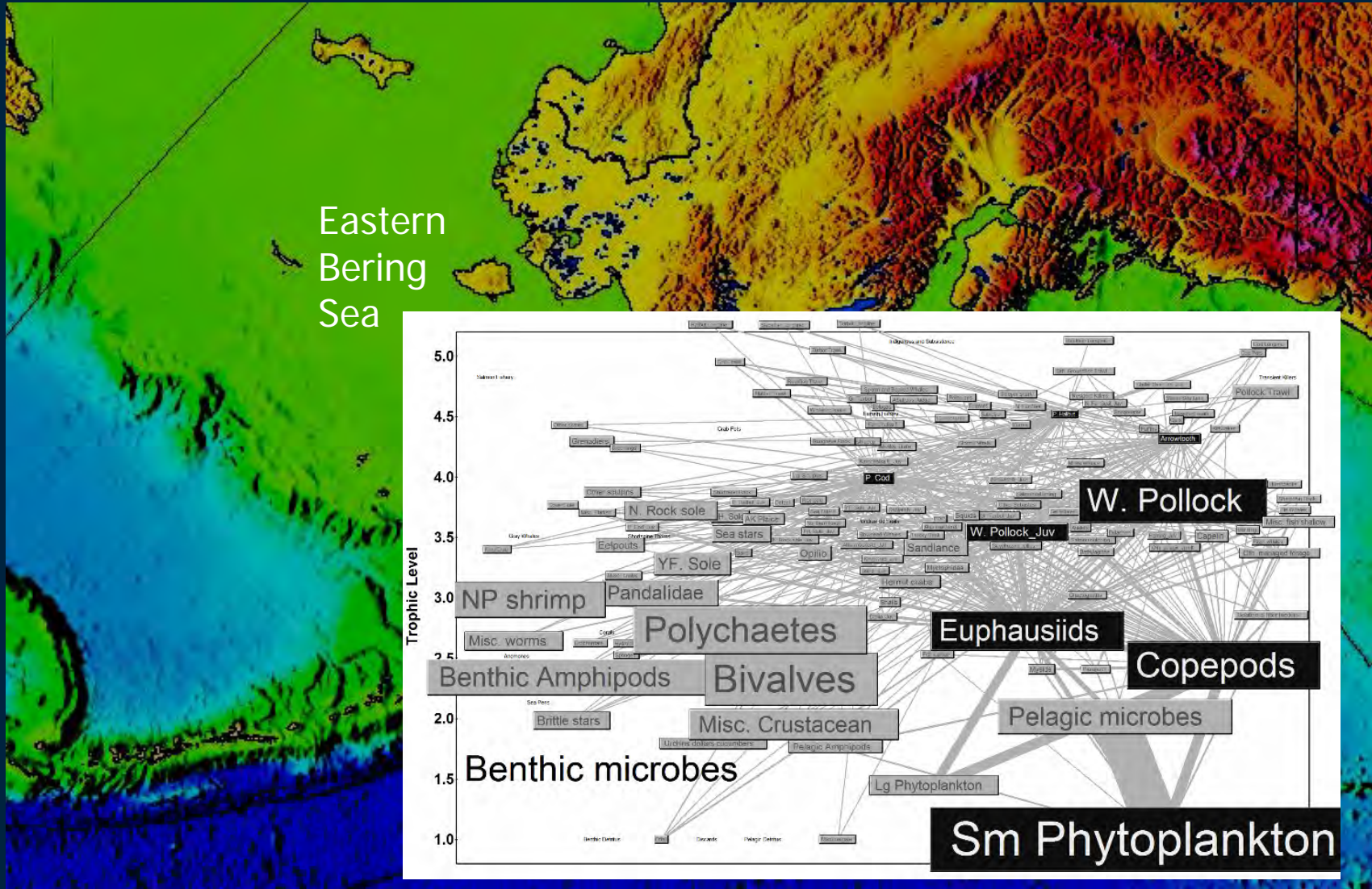
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Ecopath food web model (Aydin et al. 2007)

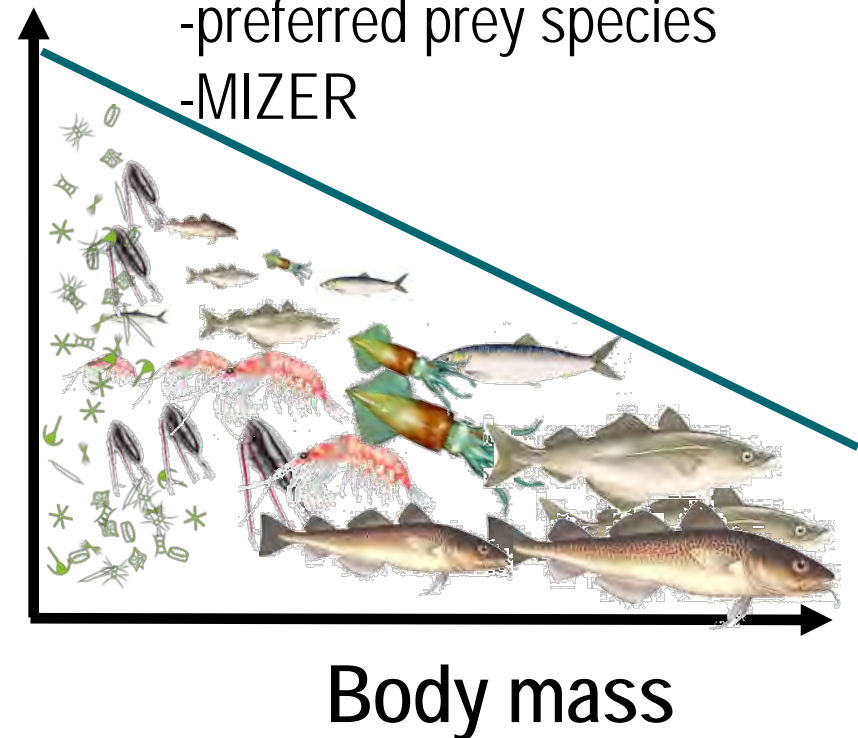
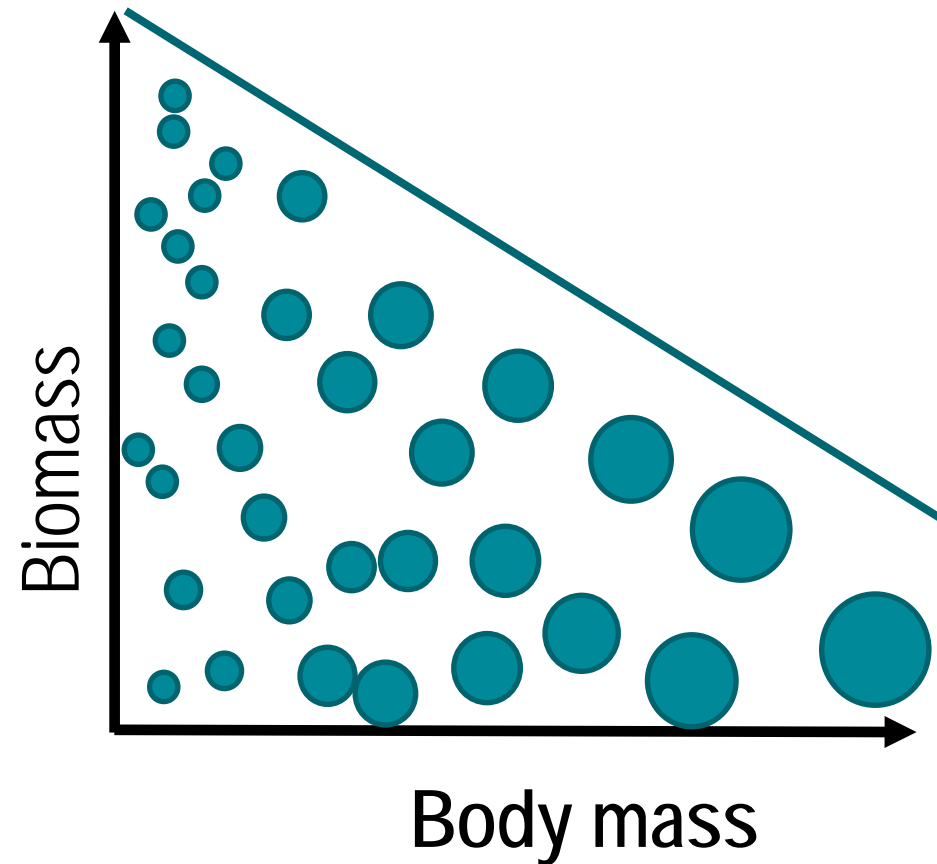


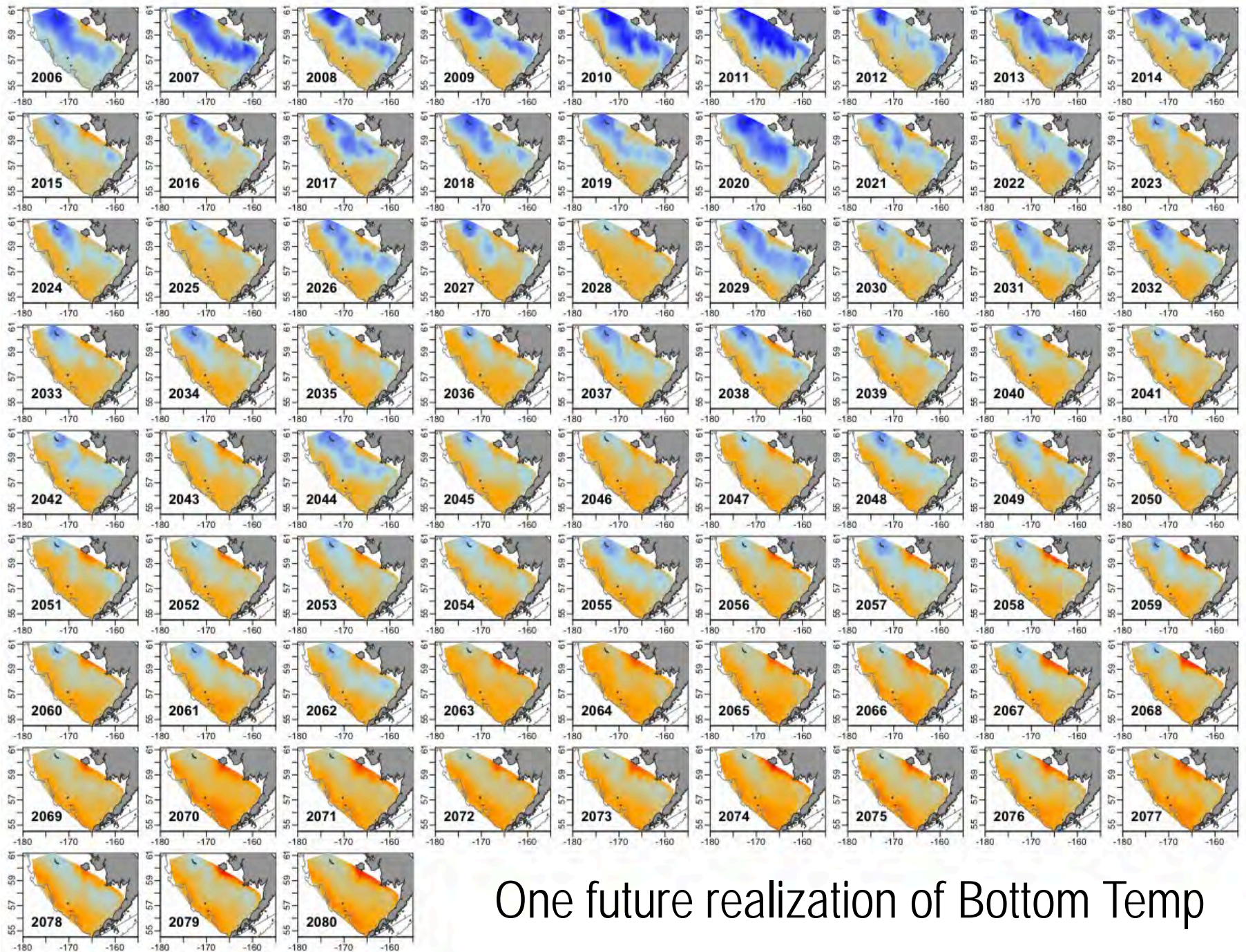
Size-spectrum model (Dr. Reum)

Particles that eat,
grow and reproduce

Species level attributes

- Maximum size
- Minimum size
- Size at maturation
- preferred prey size
- preferred prey species
- MIZER





One future realization of Bottom Temp

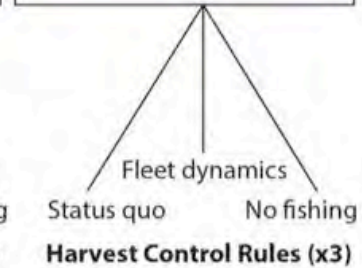
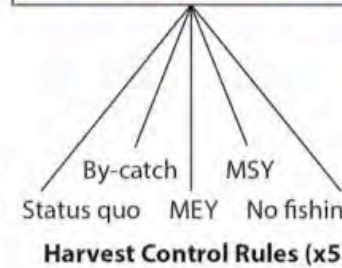
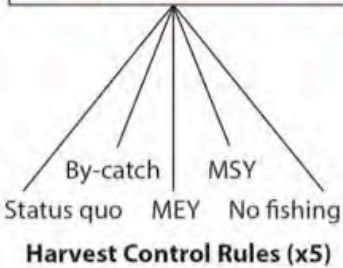
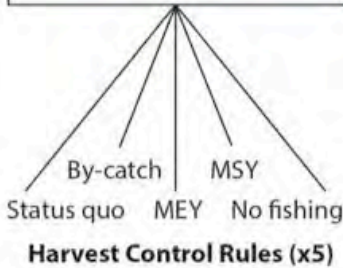
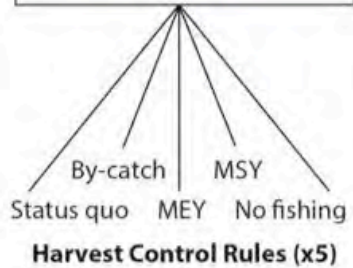
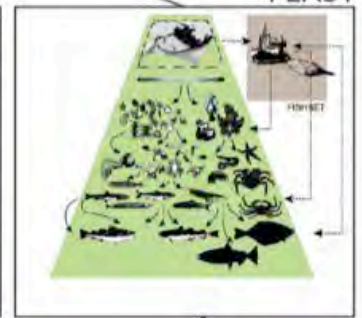
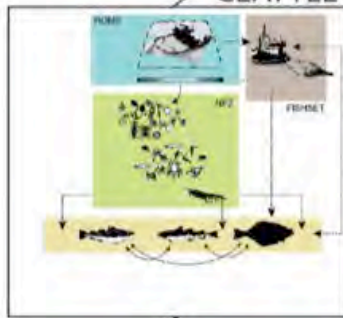
CE-Single Species

CE- Multispecies

CE- EWE

CE- Size spectrum

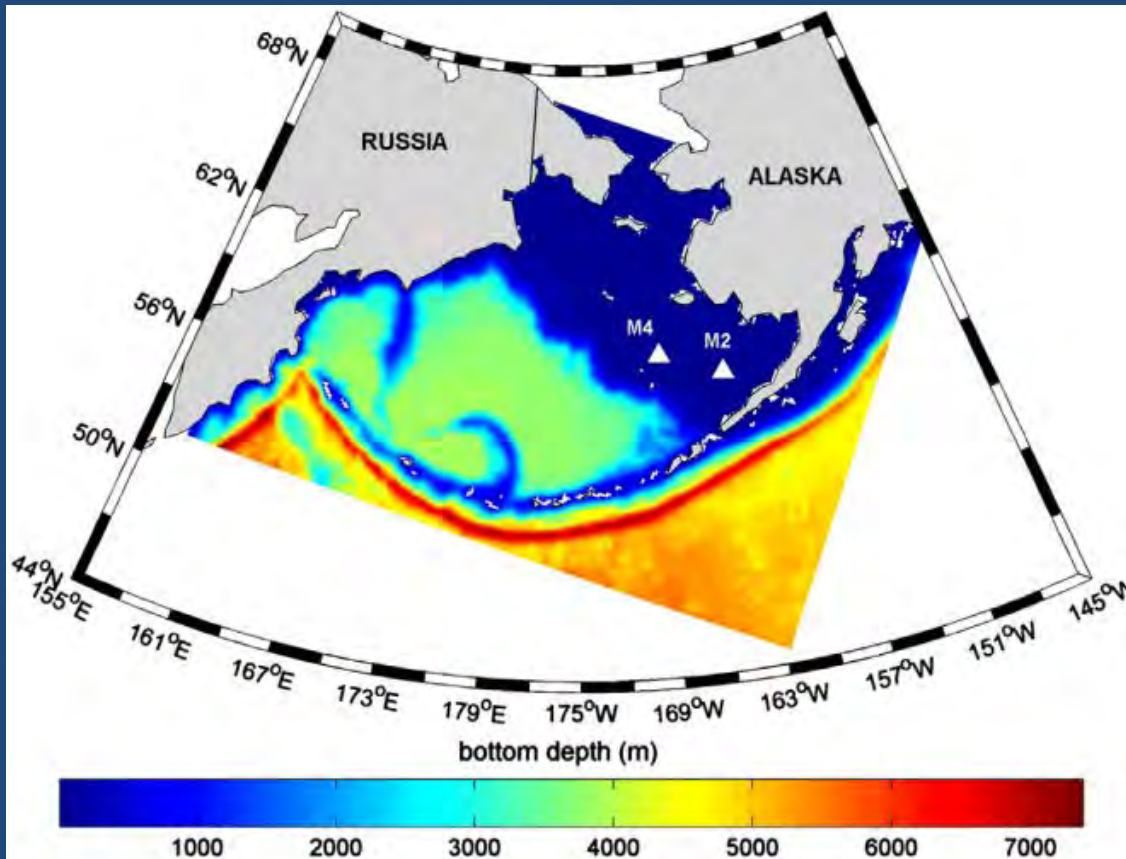
FEAST



multiple non-linear pressures

multiple non-linear interacting pressures

Bering10K model



- Descendent of NEP5 (Danielson et al. 2012)
- 10 layers, 10-km grid
Includes ice and tides
- CCSM bulk flux
- Details in Hermann et al. (DSR2, 2013, 2016)

Challenges

- GCM selection
- Computing capacity limitations
- Data-sharing/Translating model outputs
- Models based on current ecological understanding
- Evolution of models to incorporate nascent science



Successes

- Strong integrated research program at AFSC
- Right mix of people and tools
- Engagement with council & stakeholders is iterative
- Long-term analyses can inform short-term forecasts



ICE

NITRATE

AMMONIUM

ICE ALGAE

Bering10K-NPZ Model
(Gibson and Spitz, 2011)

NITRATE

AMMONIUM

Excretion/
Respiration

SMALL
PHYTOPLANKTON

LARGE
PHYTOPLANKTON

IRON

OCEAN

MICROZOOPLANKTON

Mortality
Predation
Egestion
Molting



SMALL COPEPODS

LARGE COPEPODS

Fast sinking
DETRITUS

Slow sinking
DETRITUS

EUPHAUSIIDS

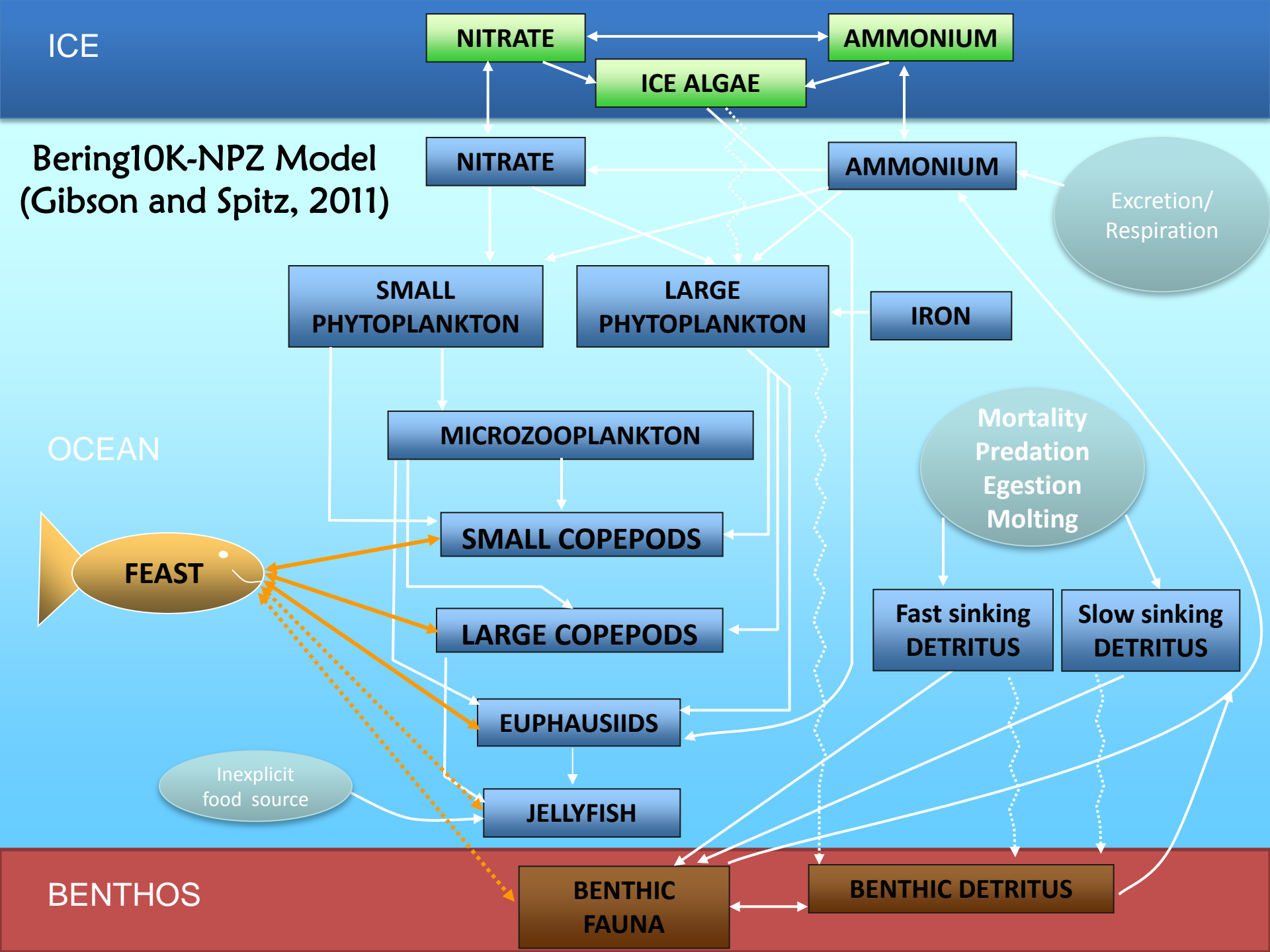
Inexplicit
food source

JELLYFISH

BENTHOS

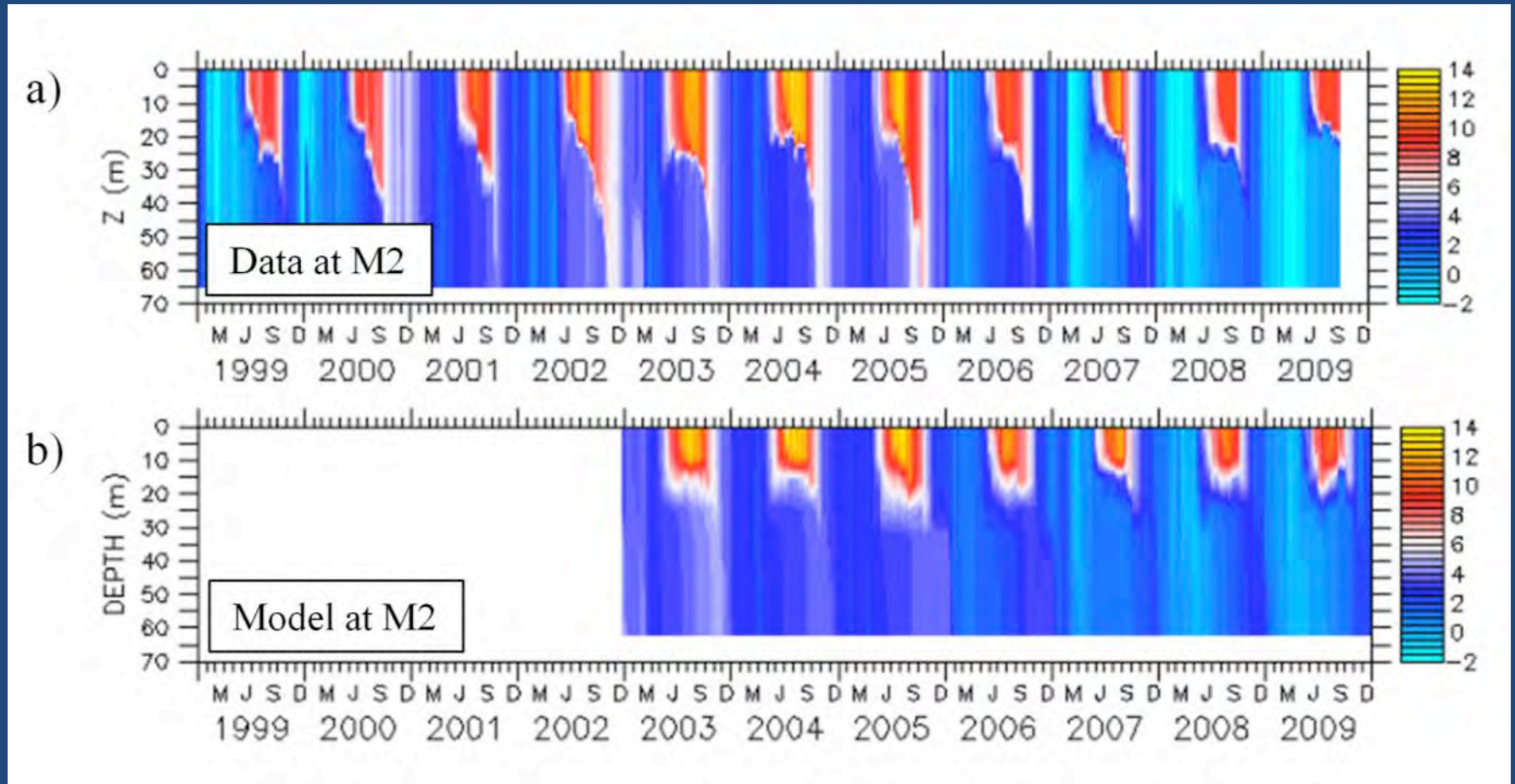
BENTHIC
FAUNA

BENTHIC
DETRITUS



Bering10K validation:

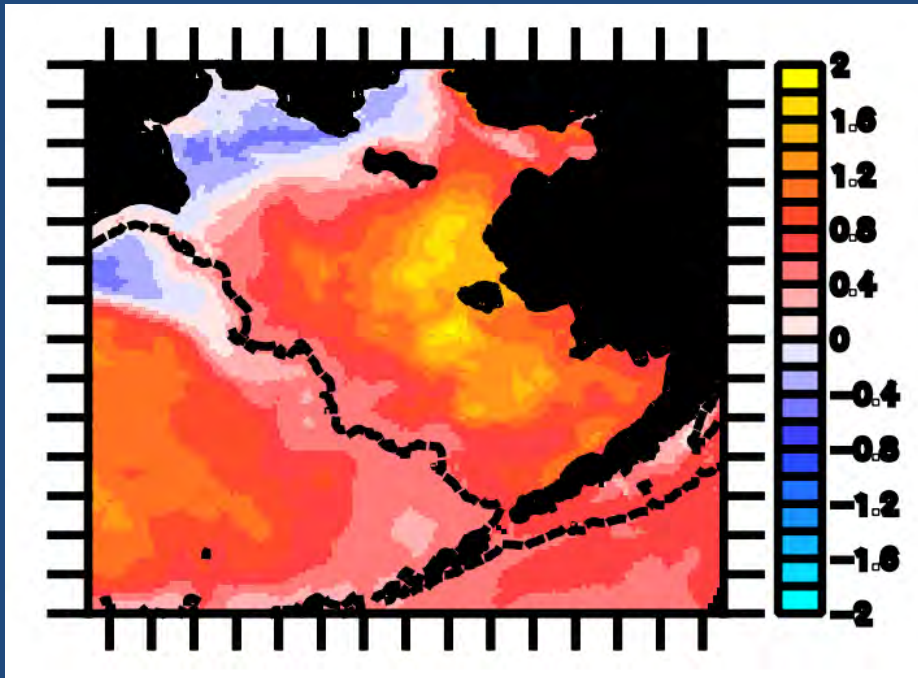
Modeled/Observed mid-shelf temperatures (deg C)



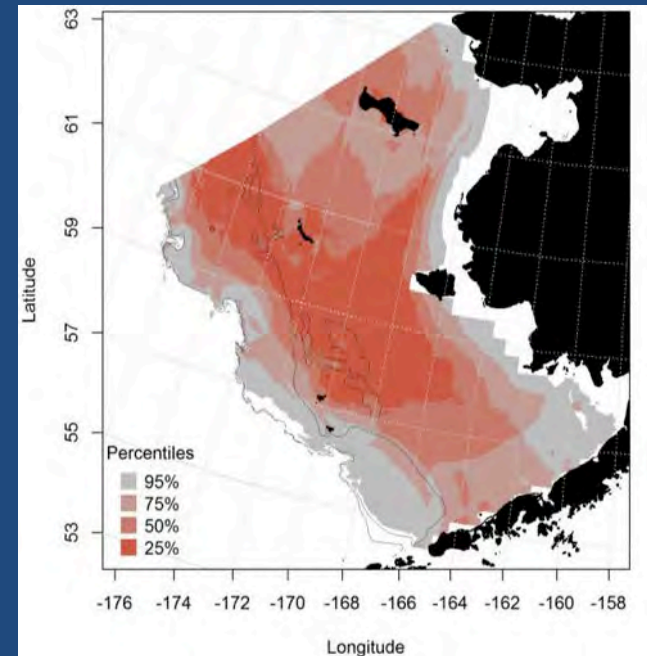
Bering Sea vulnerability analysis:

Compare present time variance and mean anticipated change with present fish distribution

Summer Bottom Temp anticipated change



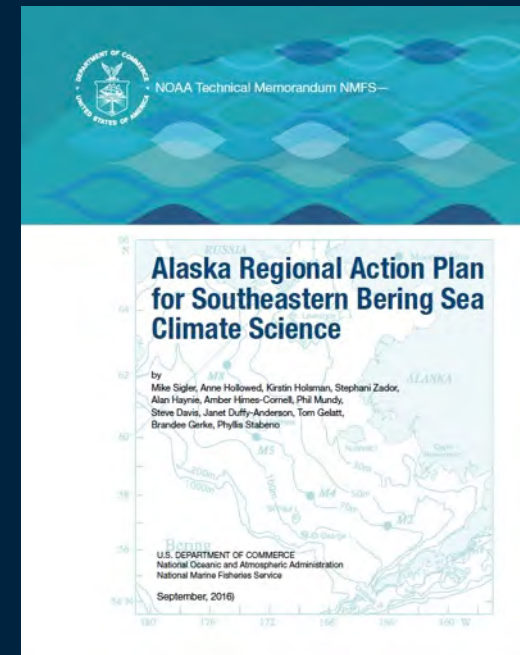
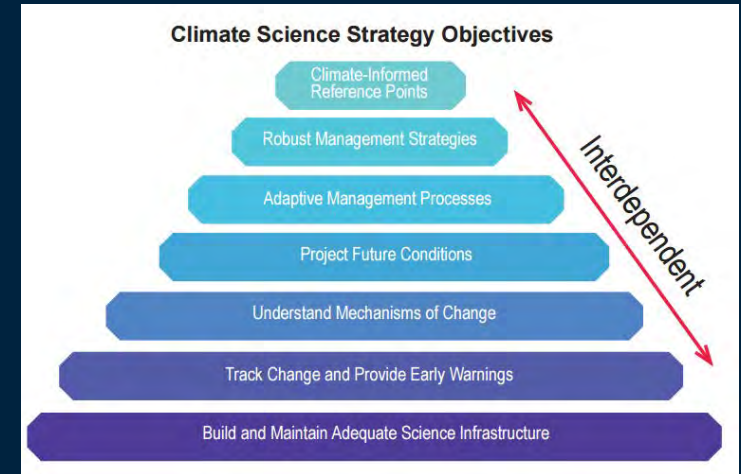
Walleye pollock Essential Fish Habitat



ACLIM Purpose and Need

National and international climate impact assessments 2020-2022

- Scientific advancement, regional feedback
- Operationalization of national climate-ecosystem projection enterprise
- Testing management strategies for climate Informed decision making - NPFMC FEP



<http://www.st.nmfs.noaa.gov/ecosystems/climate/national-climate-strategy>

The Bering Sea (Alaska)

world's most extensive eelgrass beds

450 species of fish and shellfish

35 million birds

25 species of marine mammals.

40% of the total US commercial catch of fish and shellfish

world's largest sockeye salmon fishery

75% of the subsistence harvest for 55,000 Alaskans

**Long history of integrated ecosystem research programs- Most recently
the Bering Sea Project (NPRB, NSF, NOAA): 90 investigators, \$52 M**

Closing Remarks

- Integrated modeling teams seeking to quantify implications of different climate and management scenarios.
- Addresses multiple sources of uncertainty
- Projections vary considerably between GCMs
- Phase II: RTAP proposal to rapidly uptake AR6 model results to align IPCC WG 1 & 2
- Coordinated research teams within NMFS SCs and internationally through ICES & PICES - SICCMME.

