



Photo: Mark Holsman

# ACLIM: The Alaska Climate Integrated Modeling Project

Kirstin Holsman & Stephen Kasperski

ACLIM PIs:

Anne Hollowed<sup>1</sup>, Kirstin Holsman<sup>1</sup>,  
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Hermann<sup>2,3</sup>, Trond Kristiansen<sup>4</sup>, Andre Punt<sup>5</sup>

1. NOAA Fisheries, Alaska Fisheries Science Center
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



**NOAA FISHERIES**

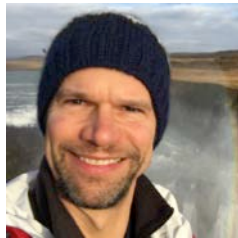
# The ACLIM team



Anne Hollowed



Kirstin Holsman



Alan Haynie



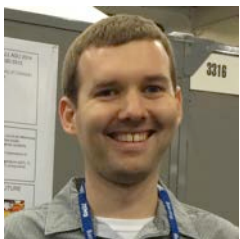
Albert Hermann



Wei Cheng



Andre Punt



Darren Pilcher



Kerim Aydin



Jim Ianelli



Andy Whitehouse



Stephen Kasperski



Cody Szuwalski



Amanda Faig



Jonathan Reum



Michael Dalton



Paul Spencer



Tom Wilderbuer



William Stockhausen



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# Contributors

# YOU!



Photo: Mark Holsman



*our science is only as good  
as the questions we ask*



Photo: Mark Holsman



# Introduction to ACLIM



Photo: Mark Holsman

# Introduction to ACLIM

## Preliminary results



Photo: Mark Holsman

# Introduction to ACLIM

## Preliminary results

## Discussion of fishing scenarios



Photo: Mark Holsman



**Russia**

**Bering  
Strait**

**Alaska**

**Bering  
Sea**

50 km



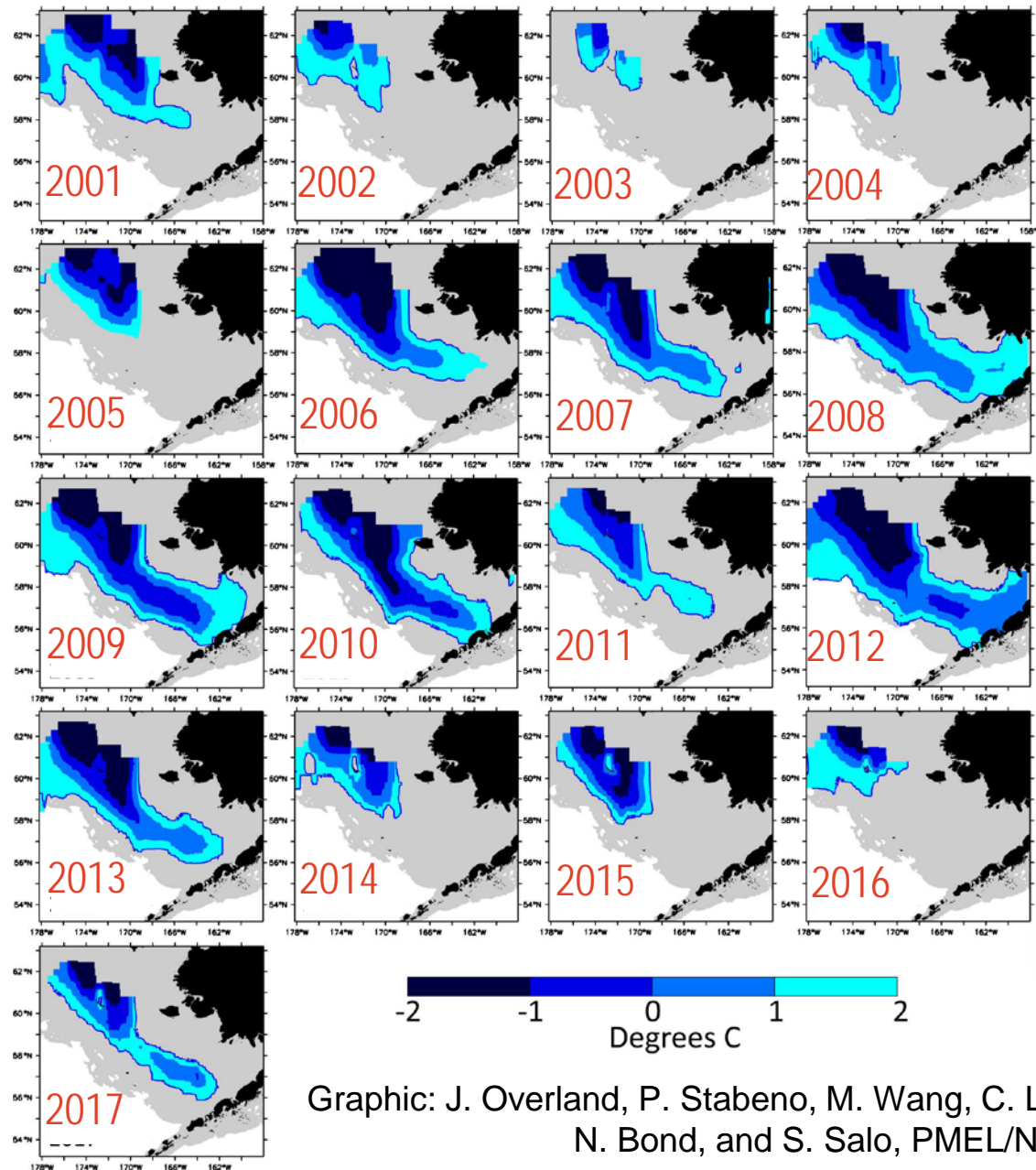
NASA MODIS image by Jesse Allen



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# Bering Sea “Cold Pool” 2001-2017



Graphic: J. Overland, P. Stabeno, M. Wang, C. Ladd,  
N. Bond, and S. Salo, PMEL/NOAA

**MORE ICE**

**MORE FOOD**

**MORE FISH**

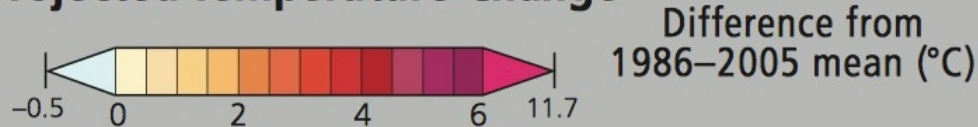
**HIGHER CATCH**



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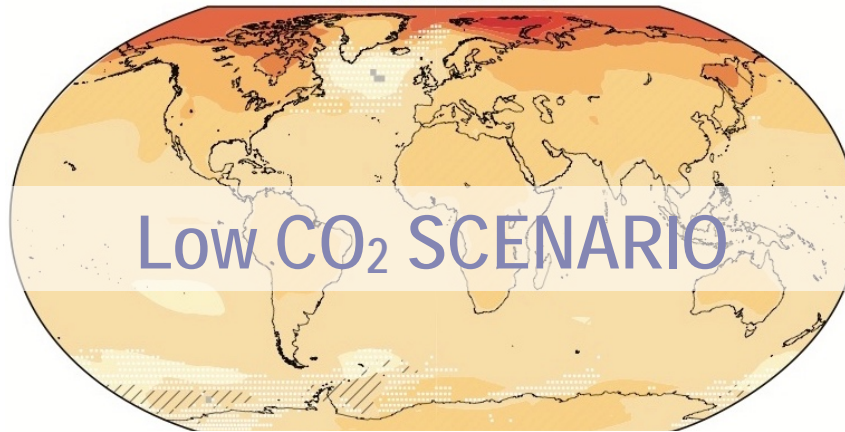
# Intergovernmental Panel on Climate Change (IPCC) 5<sup>th</sup> Assessment Report (2013, 2014)

## Projected Temperature Change

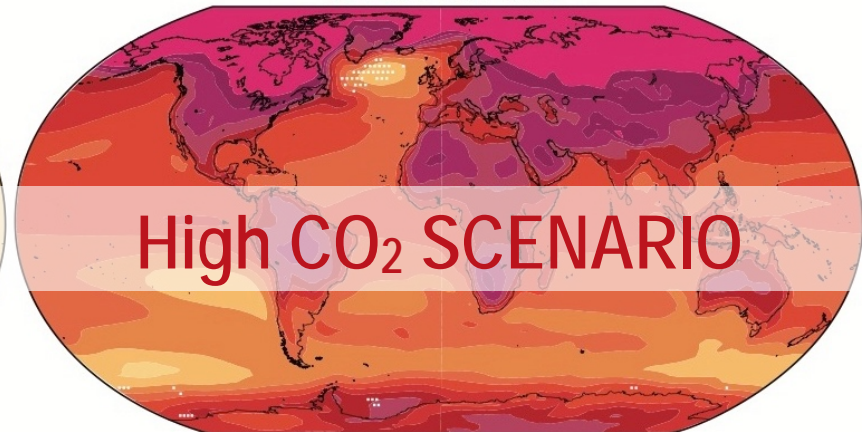


RCP2.6 2081–2100

RCP8.5 2081–2100



"Paris COP21 agreement"



"Business as usual"

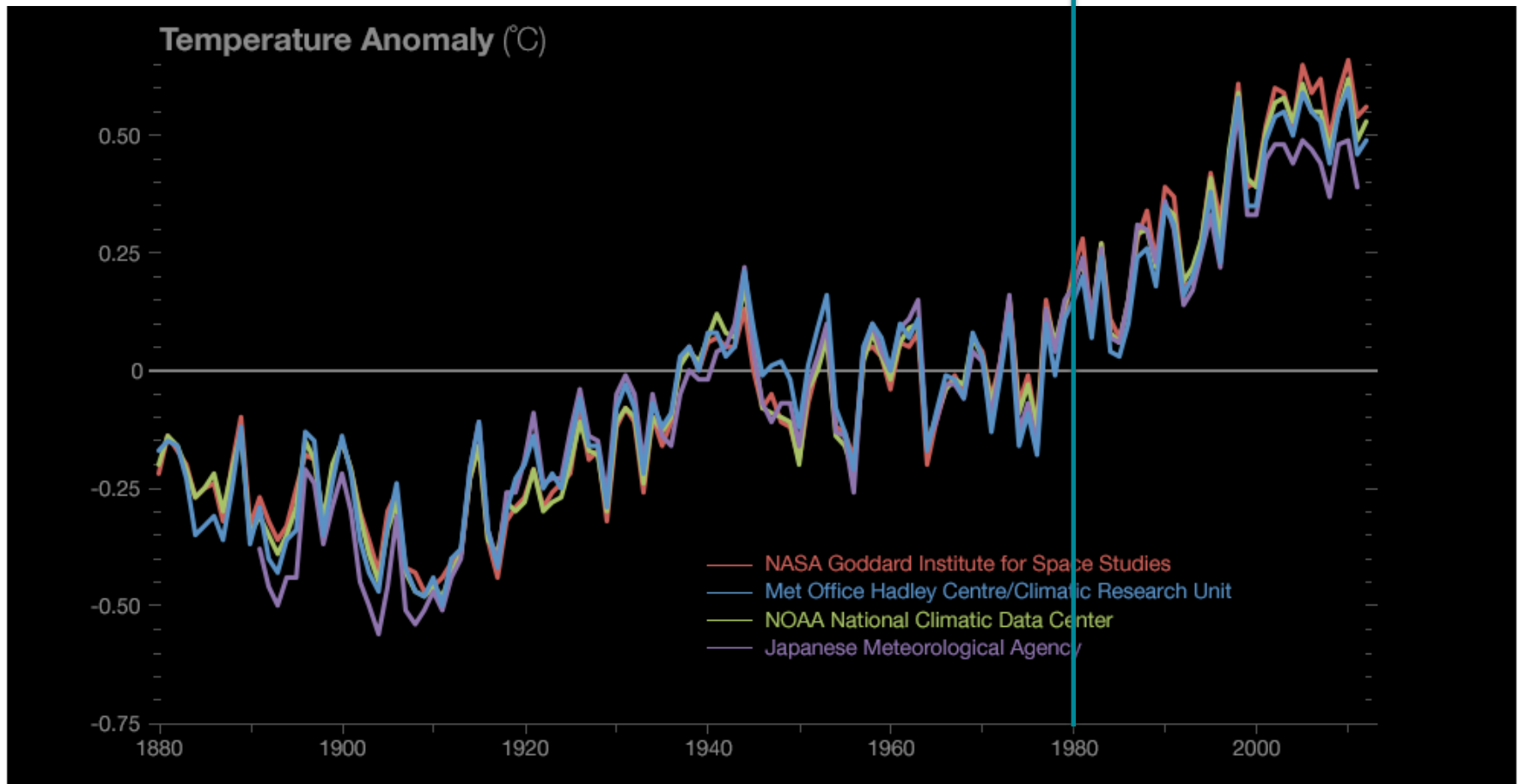
<https://www.ipcc.ch/report/ar5/>



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1980



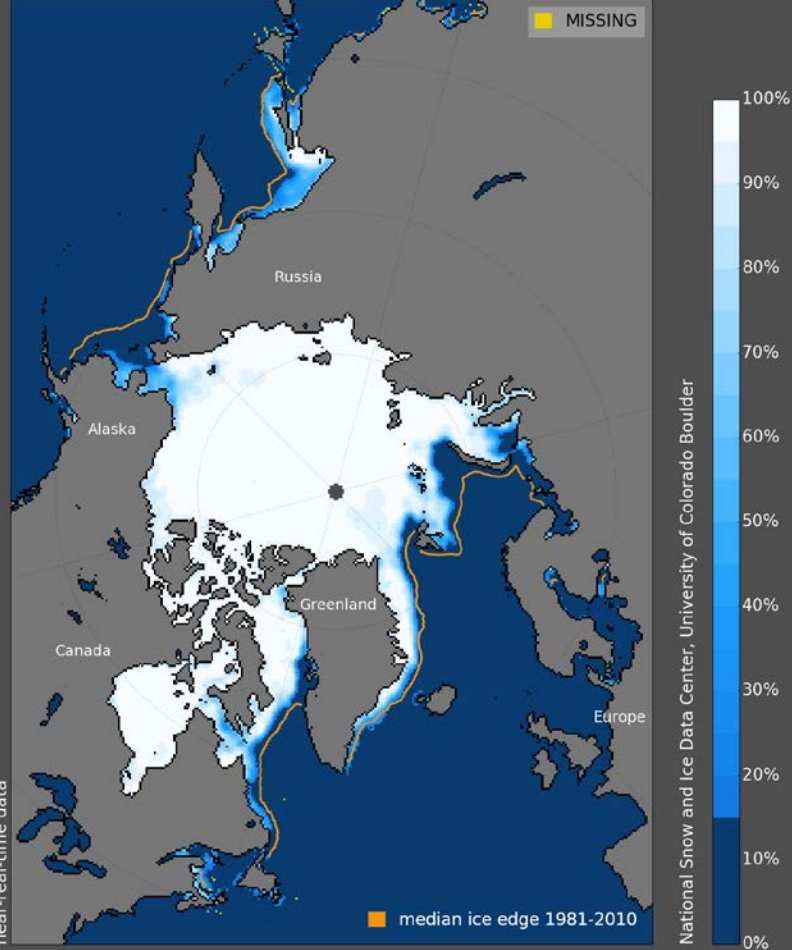
**CLIMATE 365**

[climate365.tumblr.com](http://climate365.tumblr.com) | [go.nasa.gov/climate365](http://go.nasa.gov/climate365)

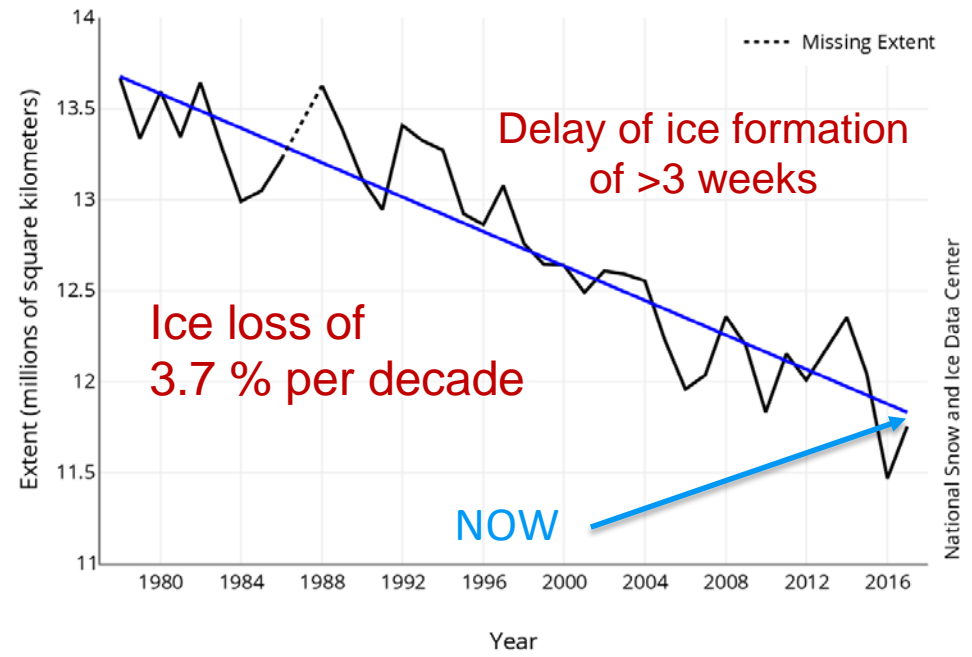


**NOAA FISHERIES**

## Sea Ice Concentration, 07 Jan 2018



## Average Monthly Arctic Sea Ice Extent December 1978 - 2017

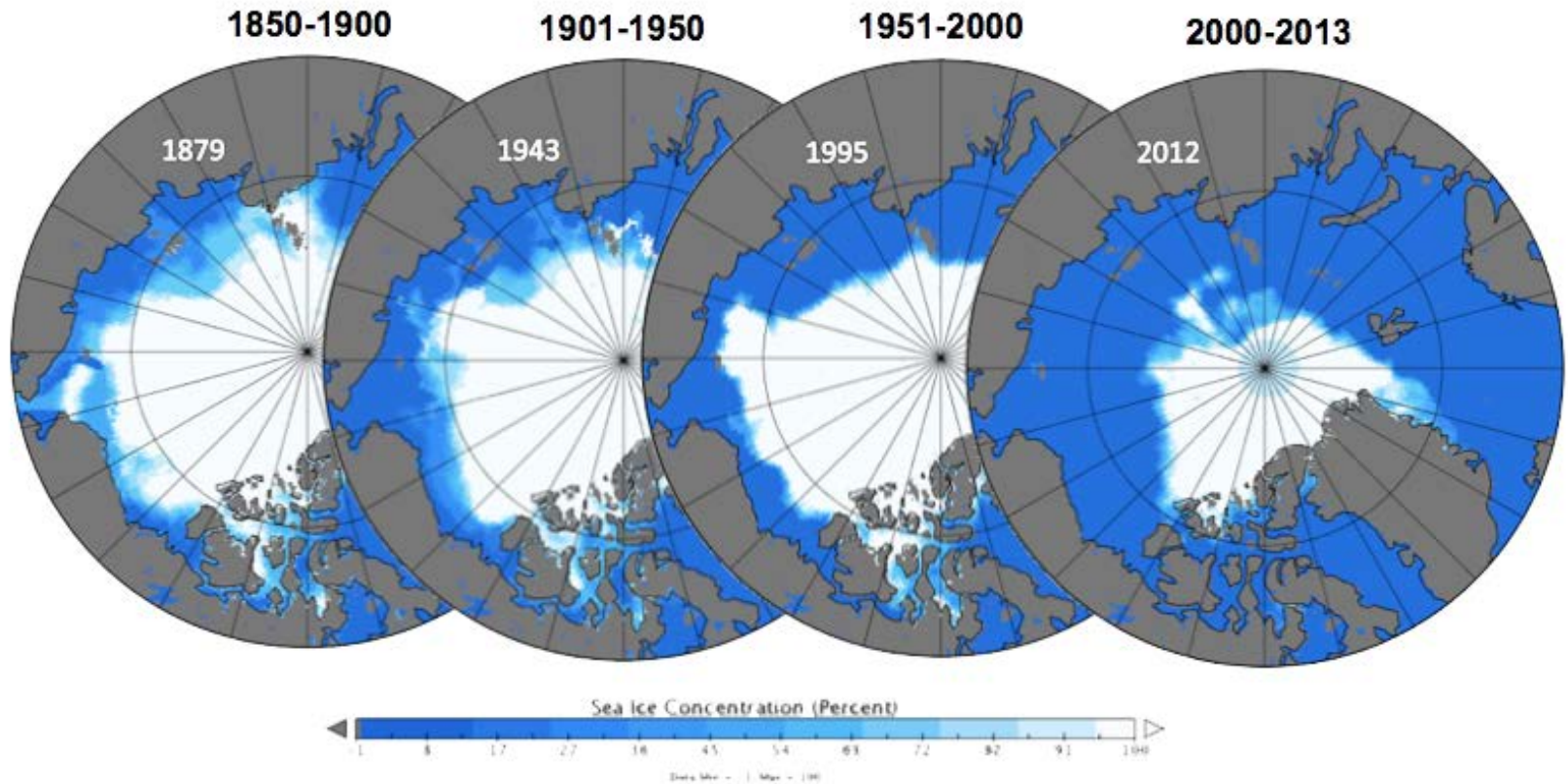


<http://nsidc.org/arcticseaicenews/>



NOAA FISHERIES

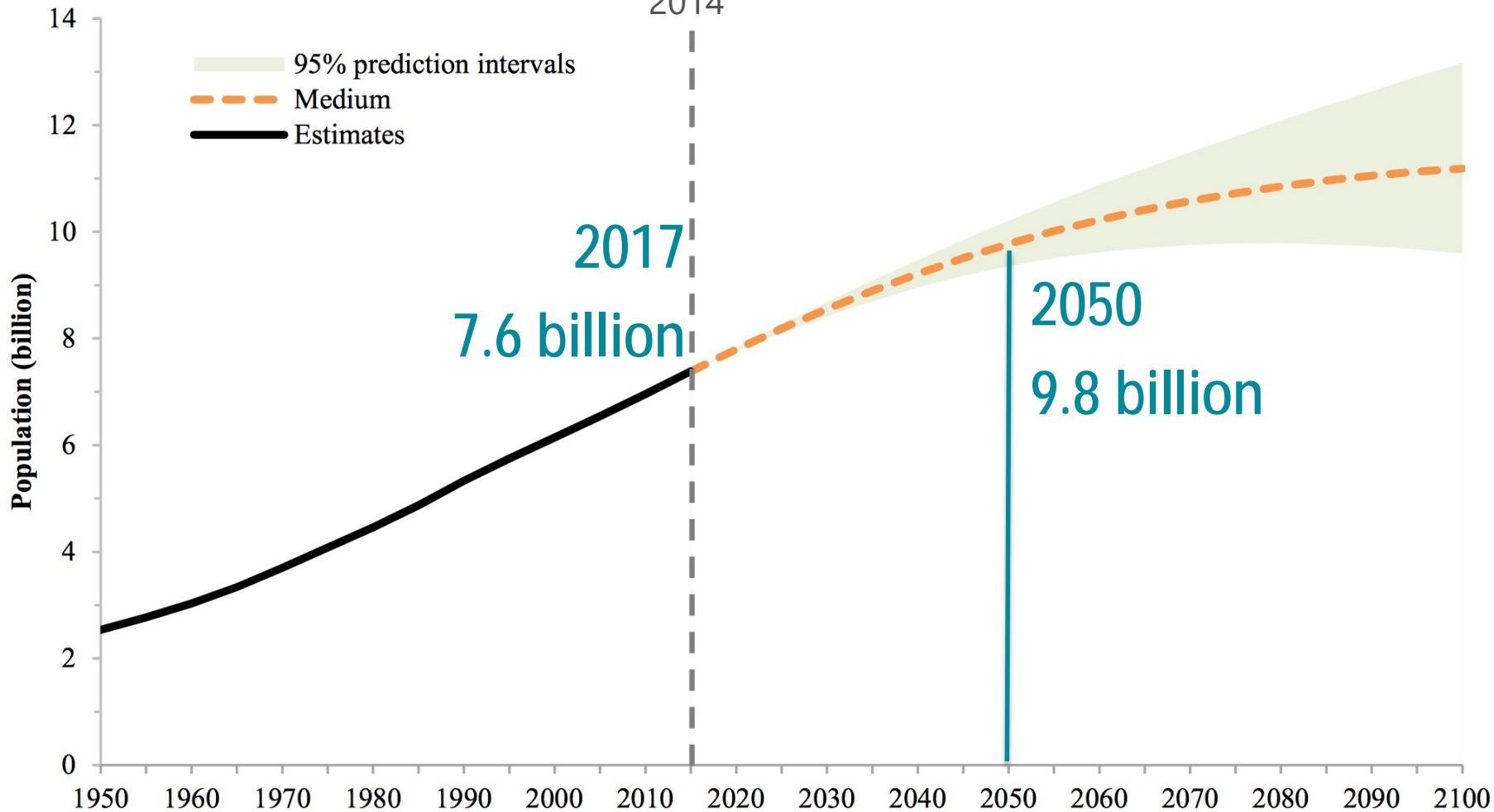
## Lowest September minimum Arctic sea ice extents





# Global Population

"The health of our planet as well as our own health and future food security all hinge on how we treat the blue world,"  
FAO Director-General José Graziano da Silva,  
2014



Source: United Nations, Department of Economic and Social Affairs, Population Division (2017).  
*World Population Prospects: The 2017 Revision*. New York: United Nations.

Improve management **foresight** in a changing climate



# Project changes in Bering Sea ocean conditions and fish populations

*Physical, biological, & socioeconomic change;  
now - 2100*





# Project changes in Bering Sea ocean conditions and fish populations

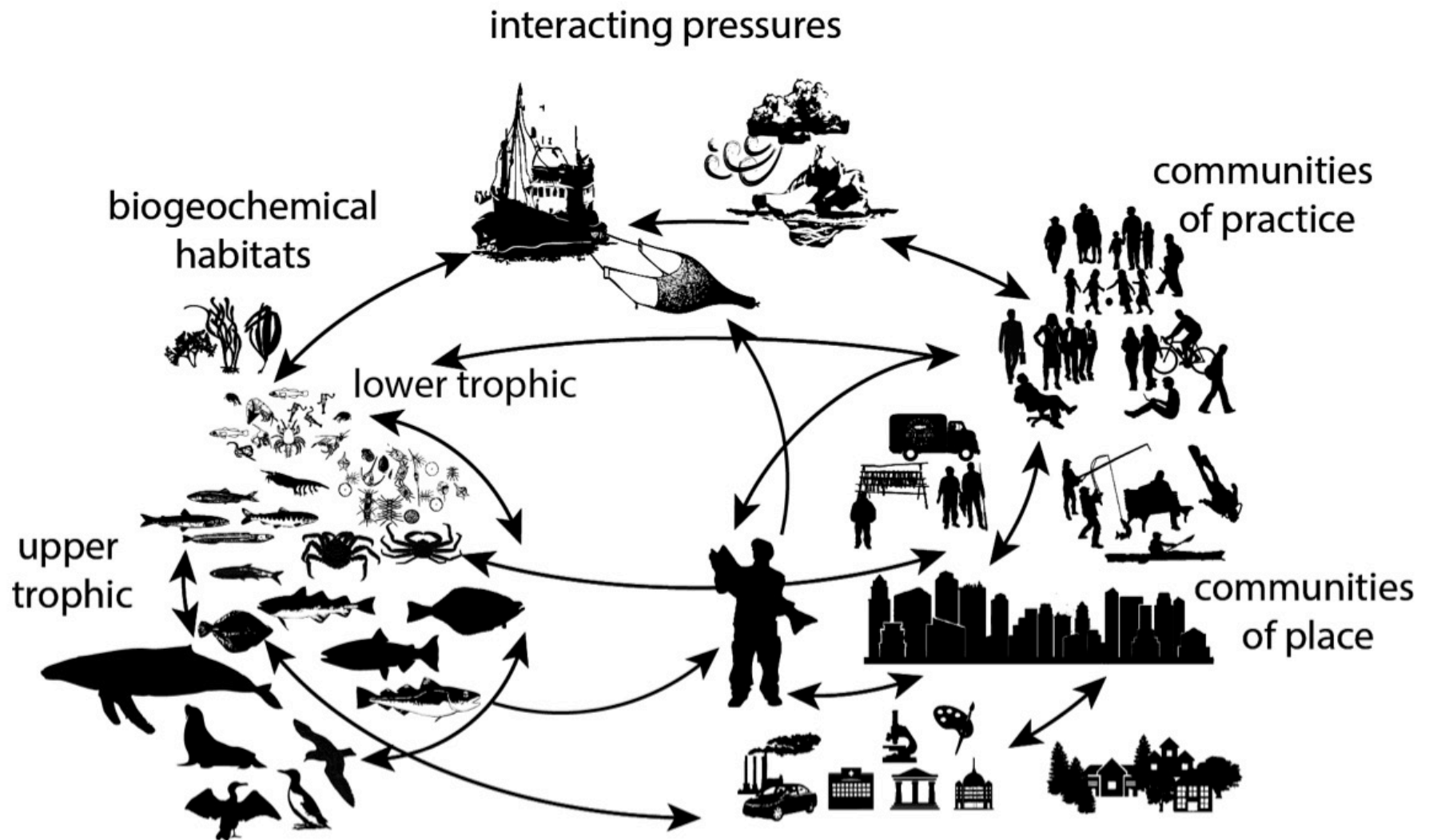
*Physical, biological, & socioeconomic change;  
now - 2100*

**Evaluate how management can adapt to minimize  
negative impacts of future changes**

*gradual change & sudden shocks;  
test existing & new tools; estimate risk*

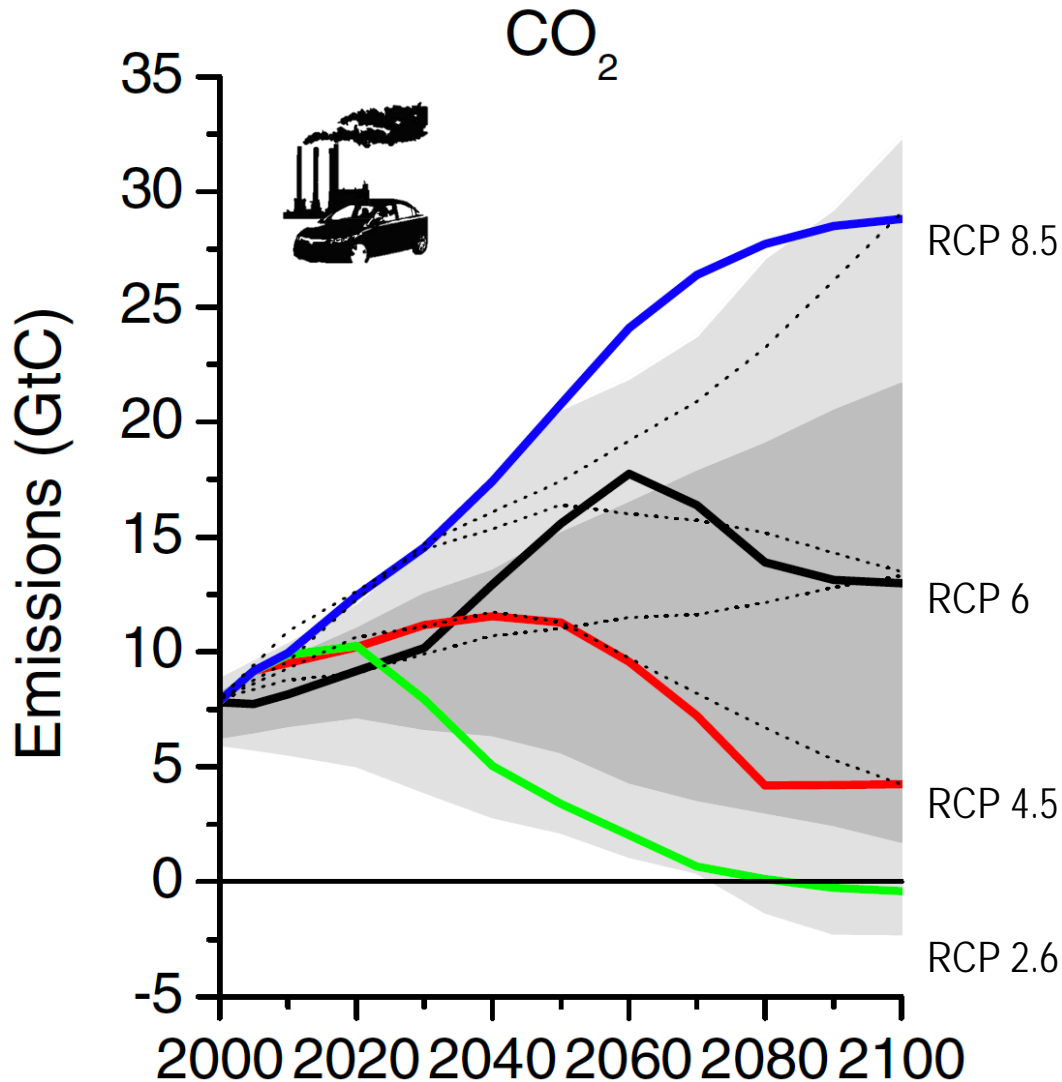


# ACLIM utilizes a fully integrated approach





# Carbon Emission Scenarios



*“plausible descriptions of how the future may evolve with respect to a range of variables”*

*van Vuuren et al. 2011*

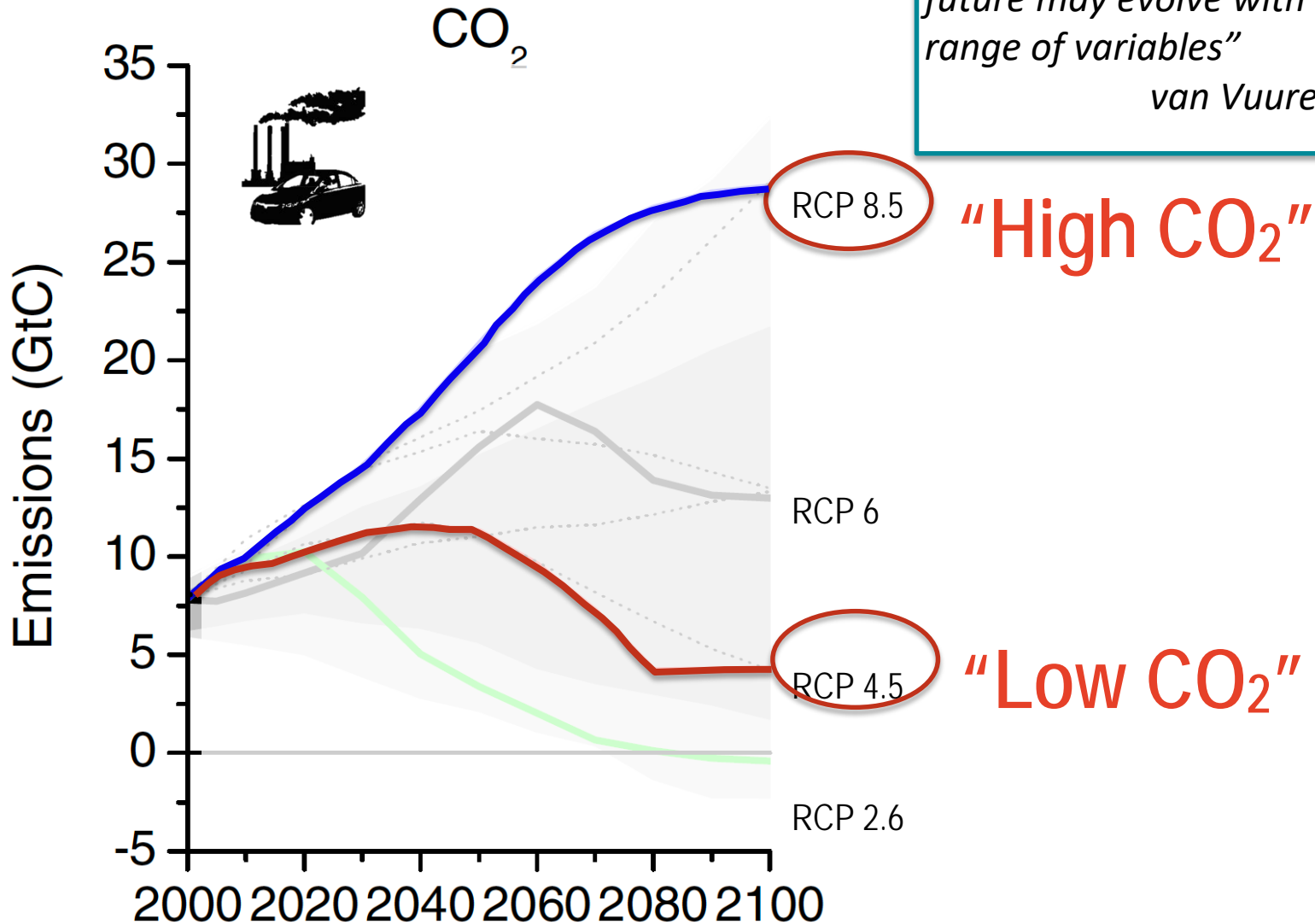
**“High reliance on fossil fuels”**

**“Significant global reduction in carbon use”**

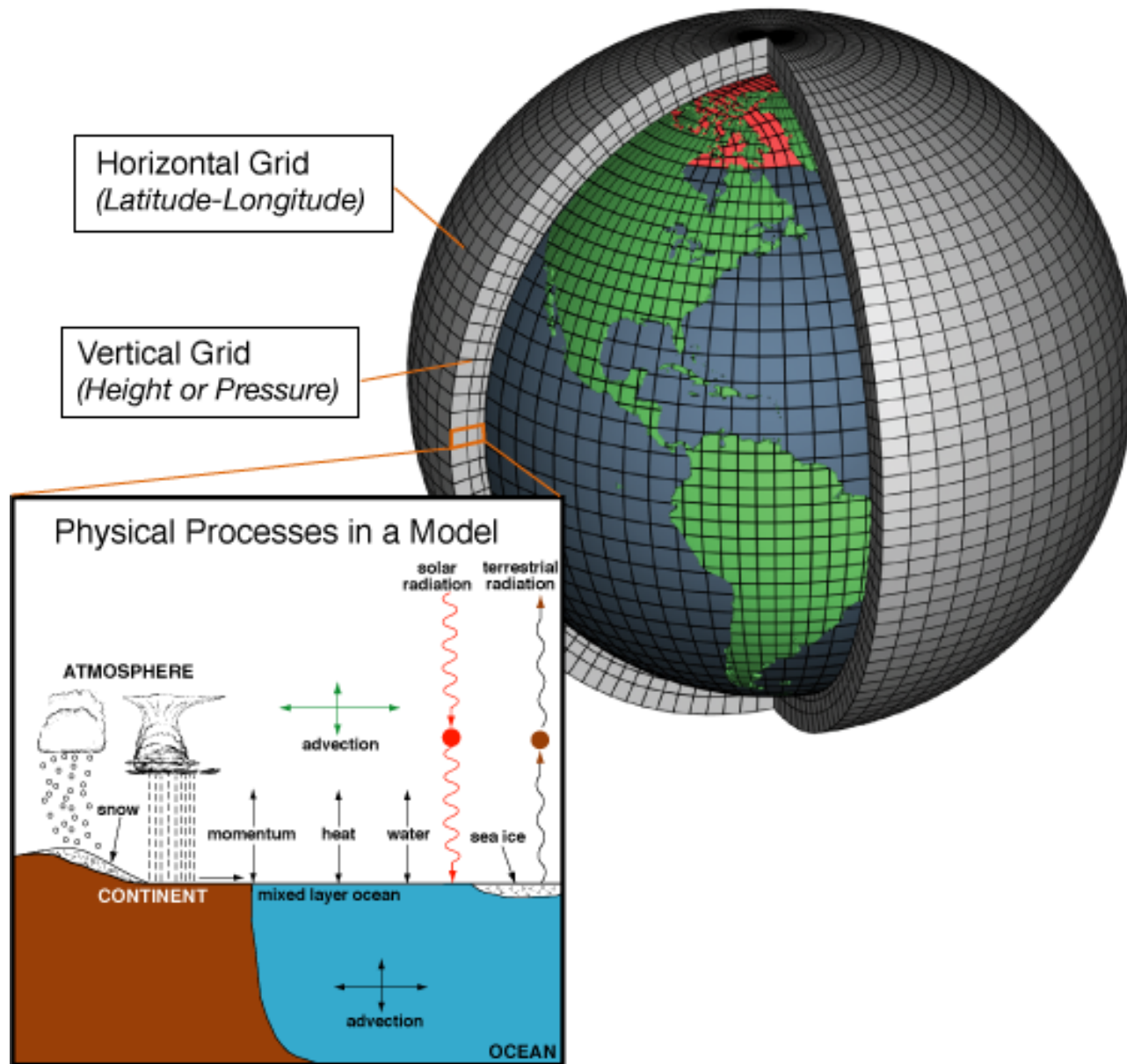
# Carbon Emission Scenarios

*“plausible descriptions of how the future may evolve with respect to a range of variables”*

*van Vuuren et al. 2011*







Source: GFDL



NOAA FISHERIES



## ACLIM

### Alaska Climate Integrated Modeling Project

Anne Hollowed (AFSC, SSMA/REFM)  
Kirstin Holsman (AFSC, REEM/REFM)  
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André Punt (UW SAFS)  
Jonathan Reum (UW SAFS)  
Amanda Faig (UW SAFS)

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

### Global Climate Models (x 7)

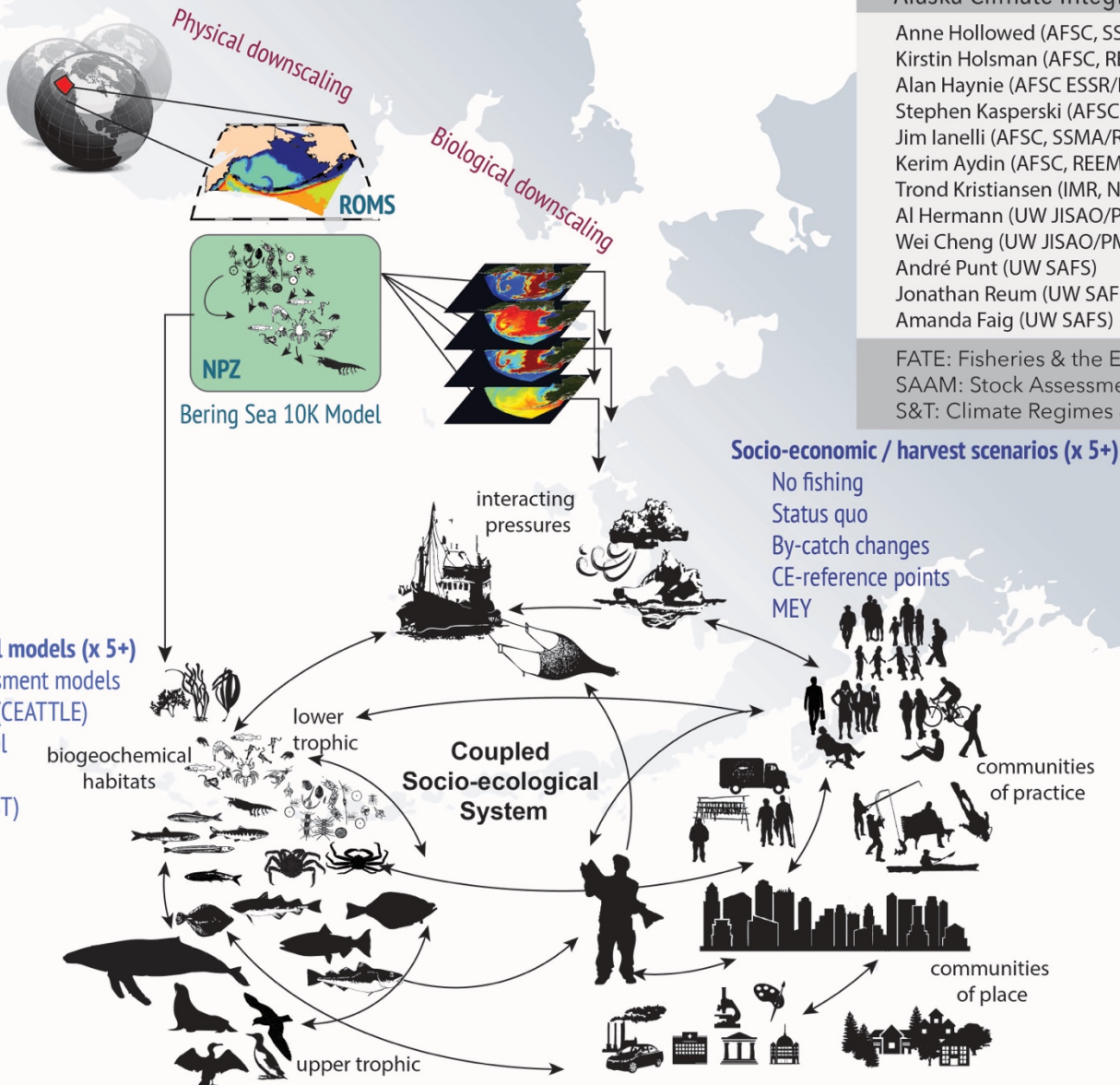
ECHO-G  
MIROC3.2 med res.  
CGCM3-t47  
CCSM4-NCAR-PO  
MIROCESM-C-PO  
GFDL-ESM2M\*-PO  
GFDL-ESM2M\*-PON

### Projection Scenarios (x3)

AR4 A1B  
AR5 RCP 4.5  
AR5 RCP 8.5

### Climate Enhanced Biological models (x 5+)

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



### Socio-economic / harvest scenarios (x 5+)

No fishing  
Status quo  
By-catch changes  
CE-reference points  
MEY





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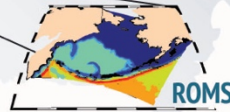
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GFDL-ESM2M\*-PON

### Projection Scenarios (x3)

AR4 A1B  
AR5 RCP 4.5  
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Physical downscaling

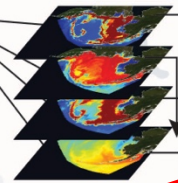


ROMS



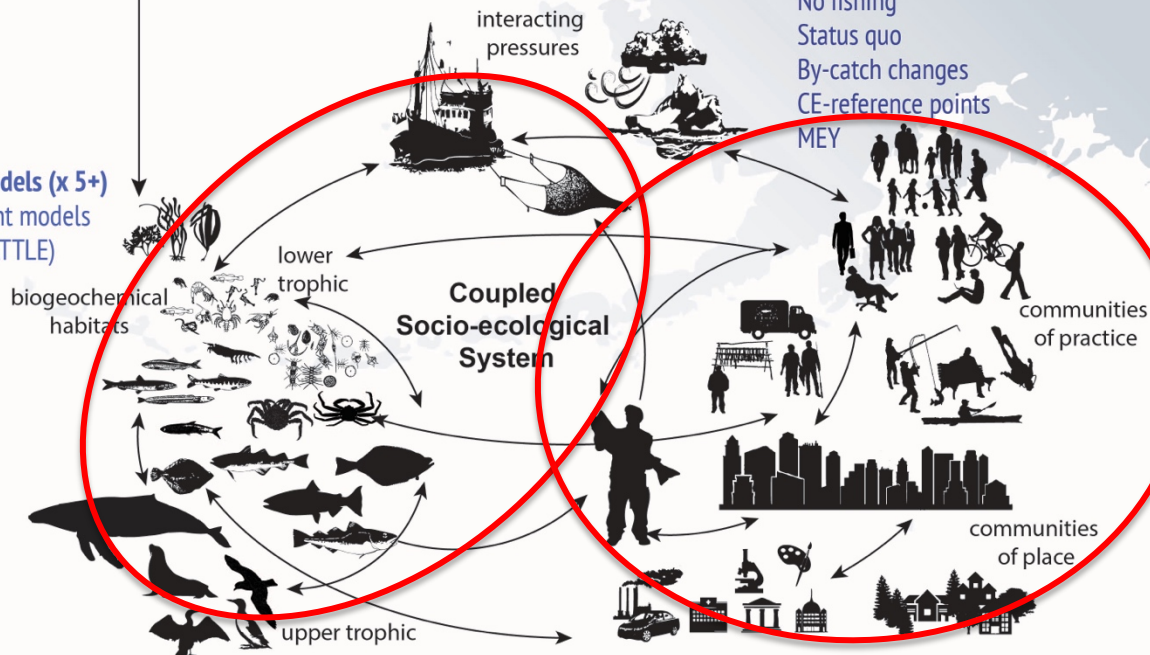
Bering Sea 10K Model

Biological downscaling



### Climate Enhanced Biological models (x 5+)

CE- single species assessment models  
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CE- Size spectrum model  
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End-to-End model (FEAST)



### Socio-economic / harvest scenarios (x 5+)

No fishing  
Status quo  
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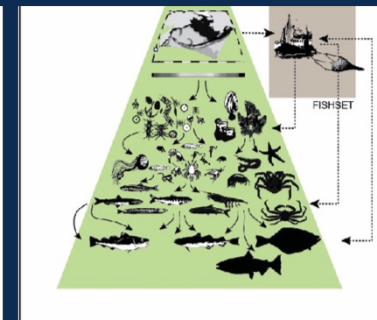
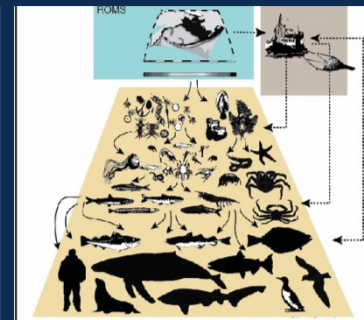
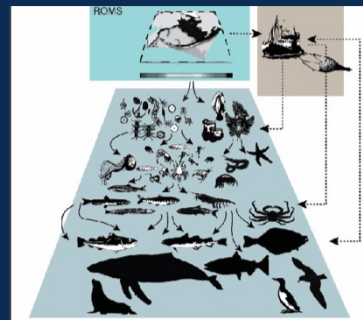
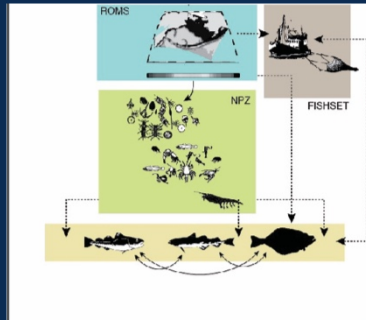
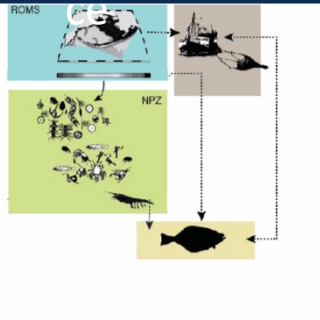
CE-SSM

CE-MSM

CE-EwE

CE-MIZER

FEAST



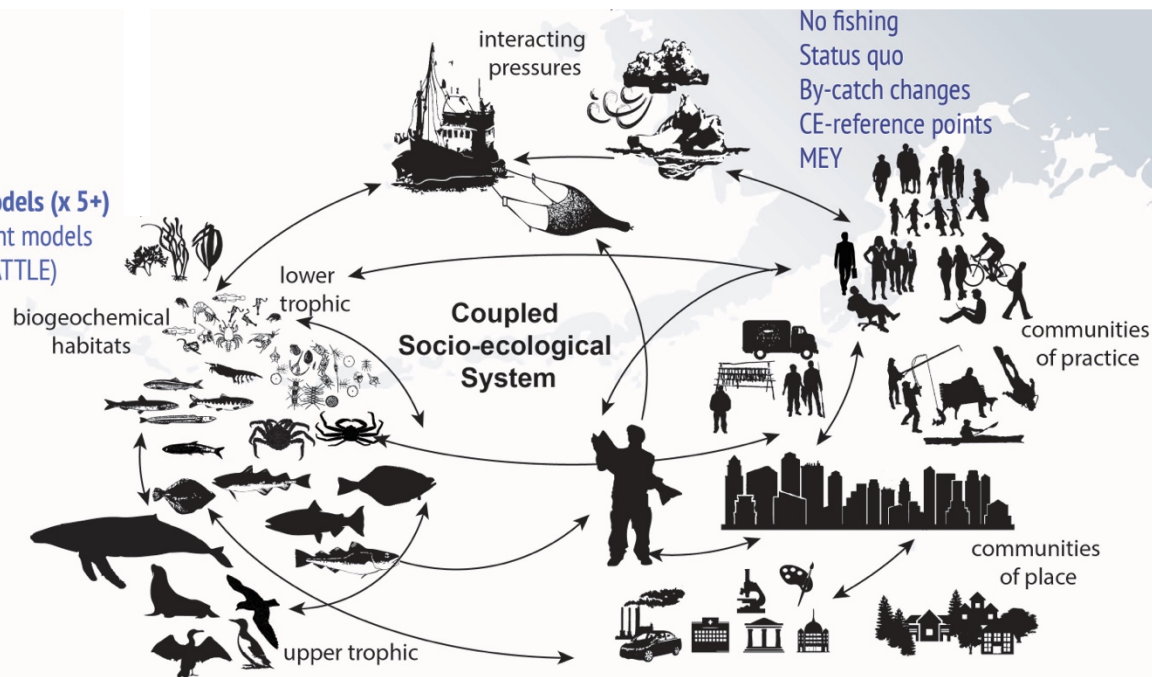
Fast  
Statistical  
Implicit ecosystem noise



Slow  
High resolution  
Explicit ecosystem interactions

# Climate Enhanced Biological models (x 5+)

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



# Preliminary Results

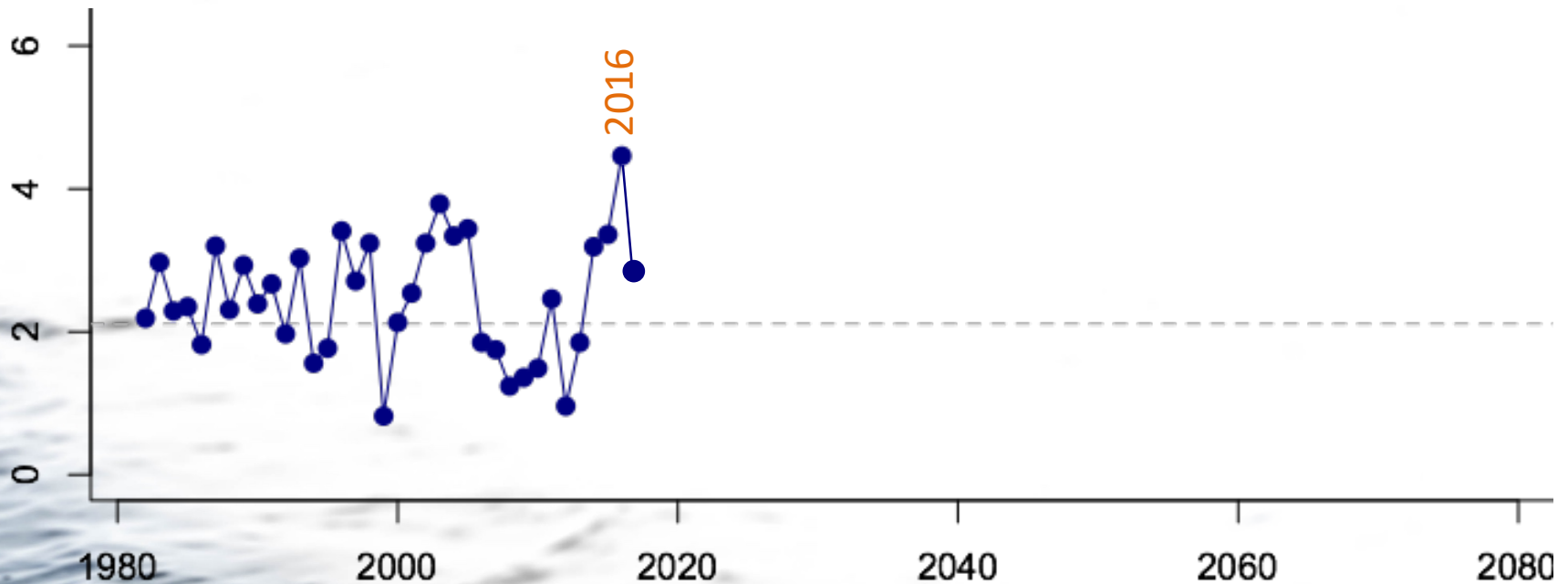
*(physical projections)*



Photo: Mark Holsman

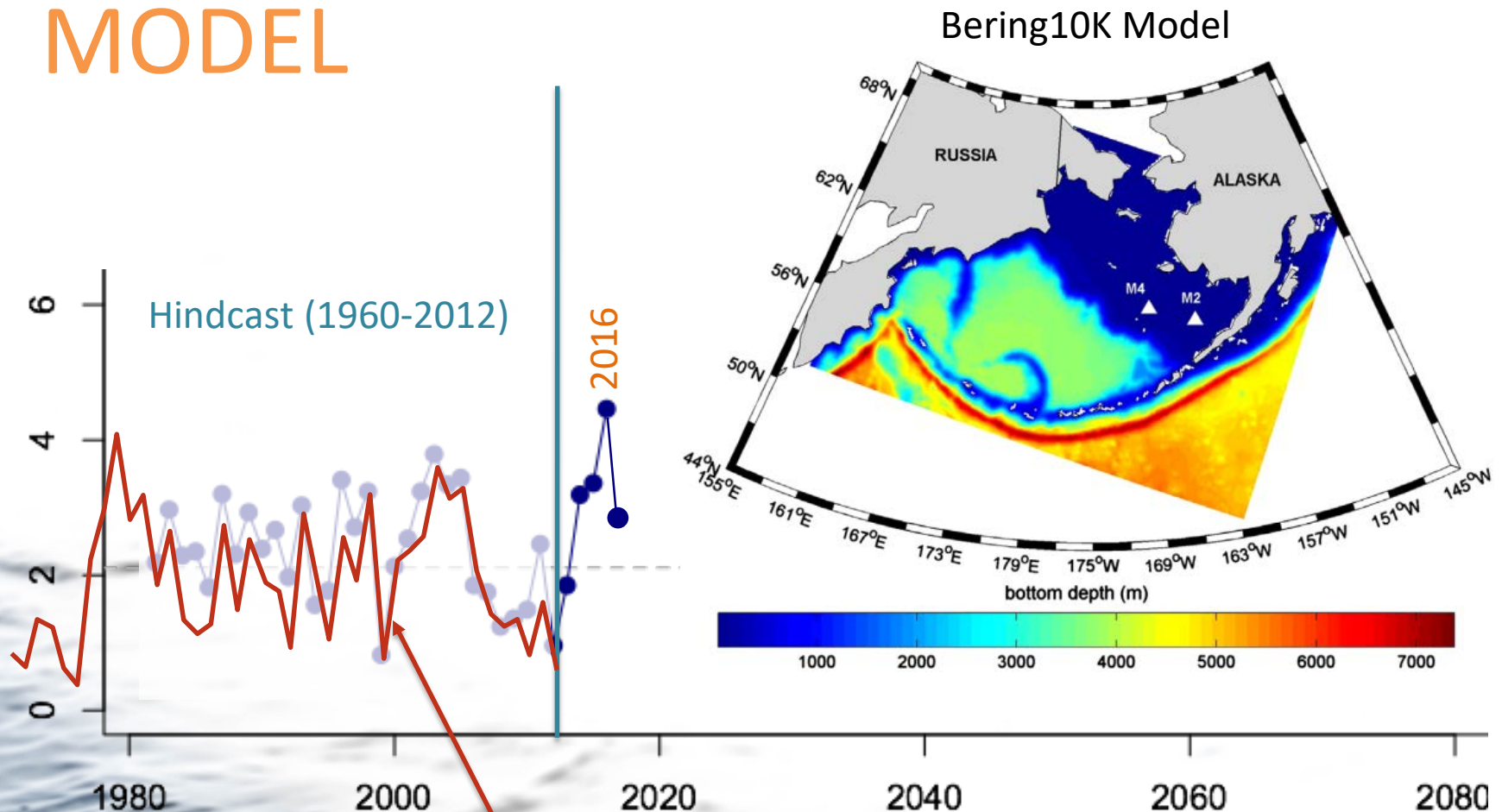
# Summer Bottom Temperature (°C)

## OBSERVED





# Summer Bottom Temperature ( $^{\circ}\text{C}$ ) MODEL

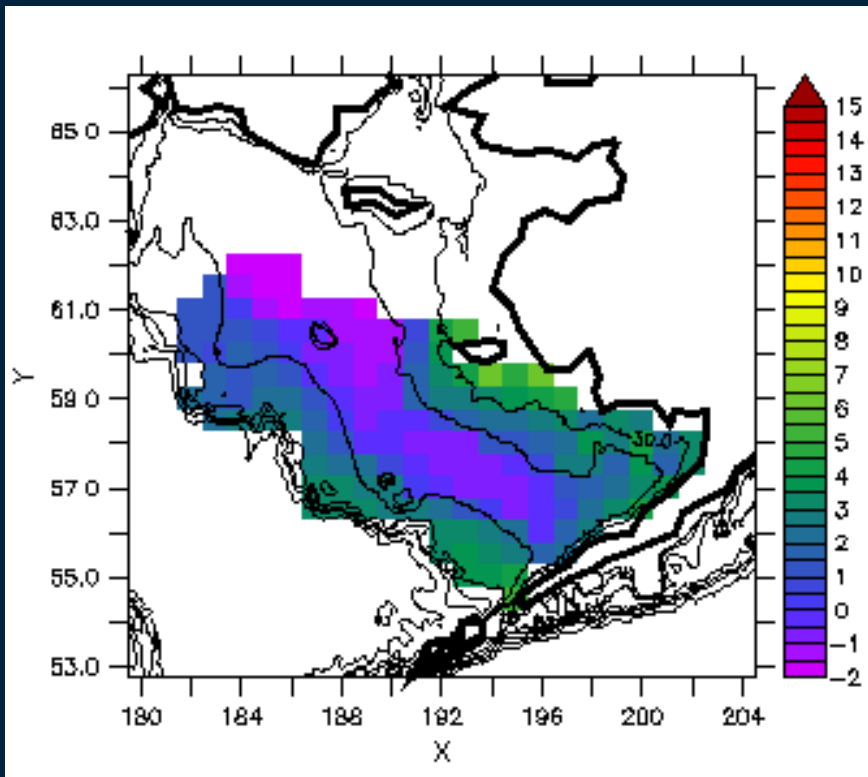


Model Reproduced Bottom Temp.

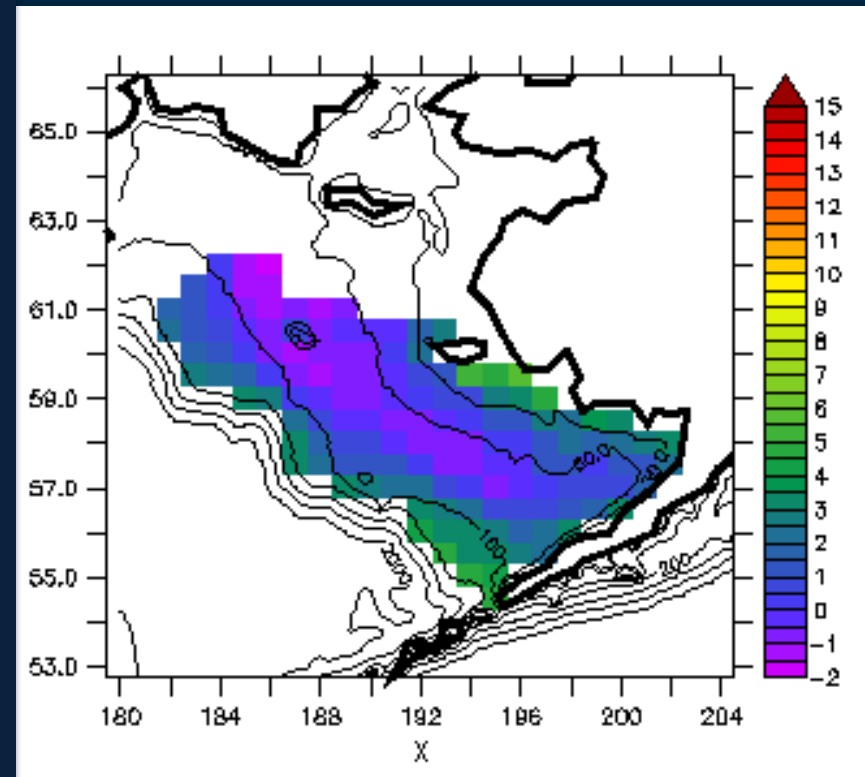
# "Bering10K" Regional Oceanography Model

Bottom T. (°C) Summer 2009

**DATA**



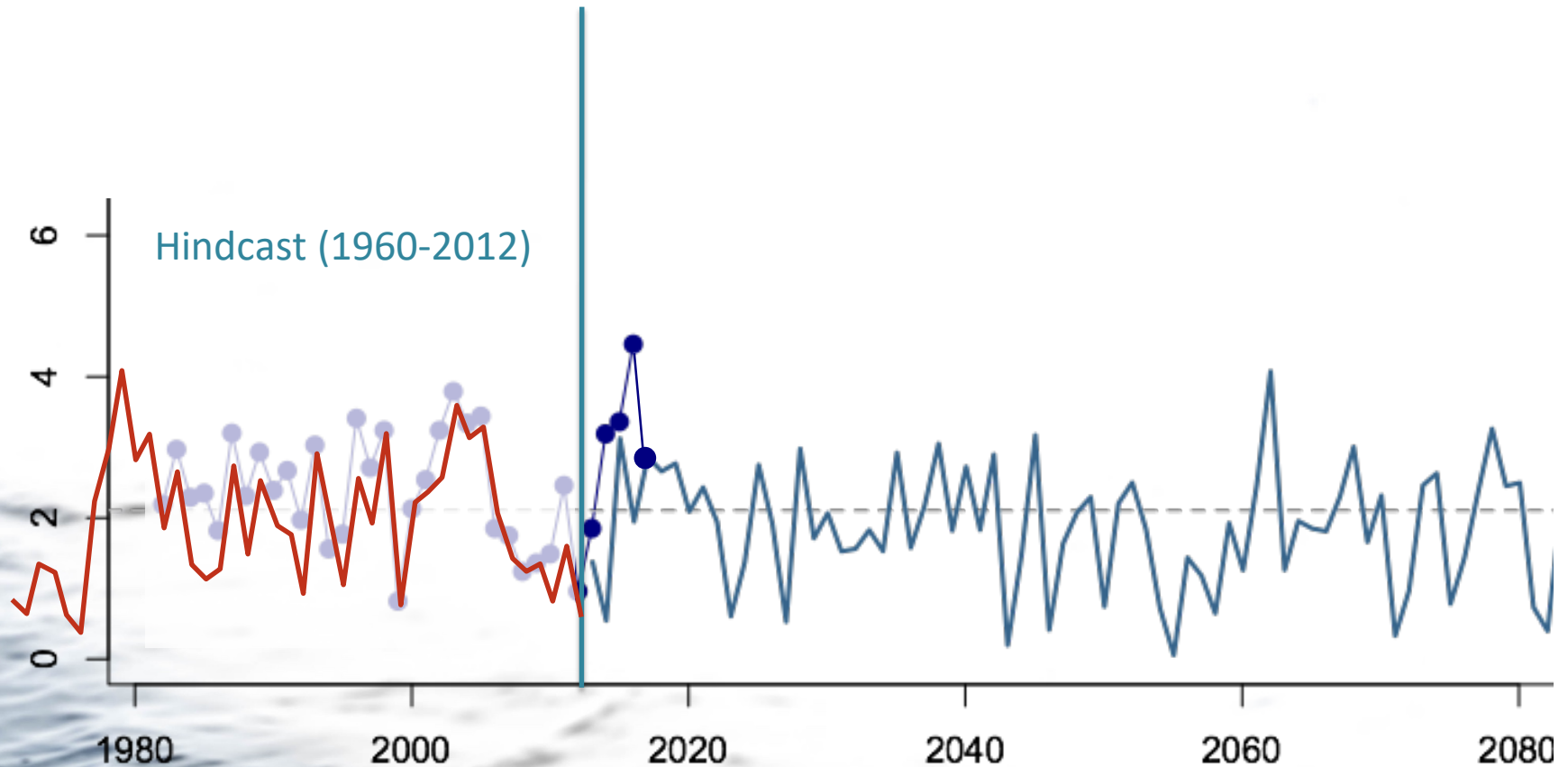
**MODEL**



# Summer Bottom Temperature (°C)

## MODEL

*Draft results; please do not reproduce*

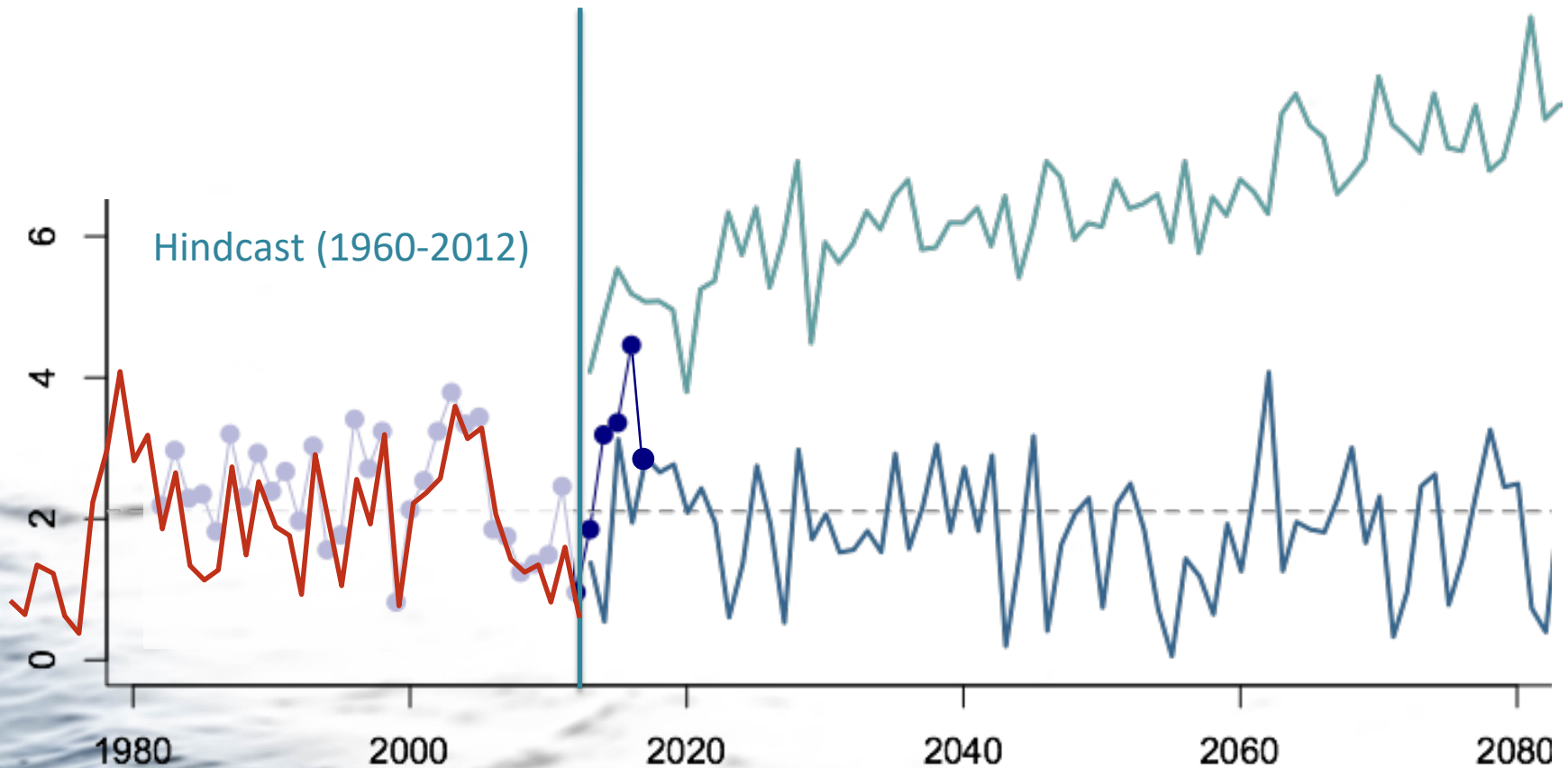




# Summer Bottom Temperature (°C)

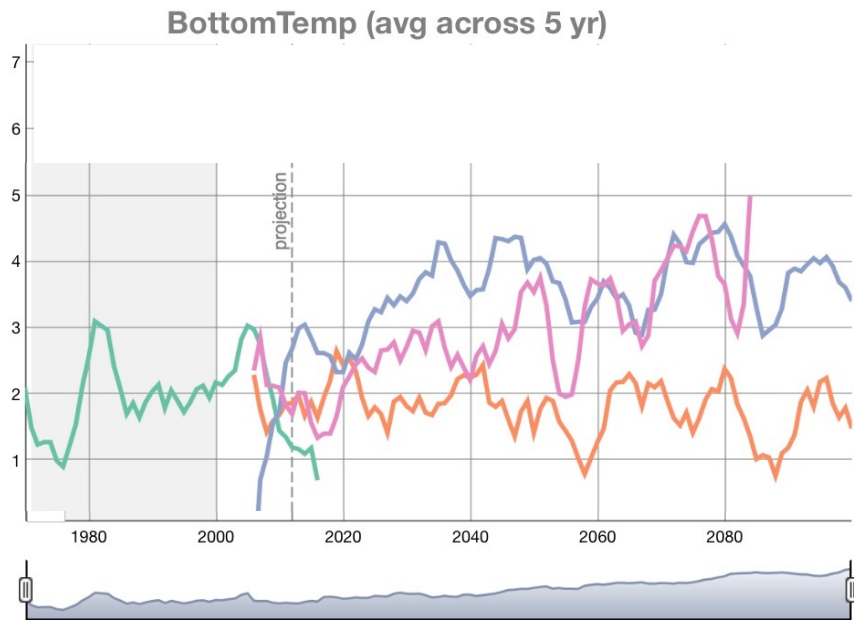
## MODEL

*Draft results; please do not reproduce*

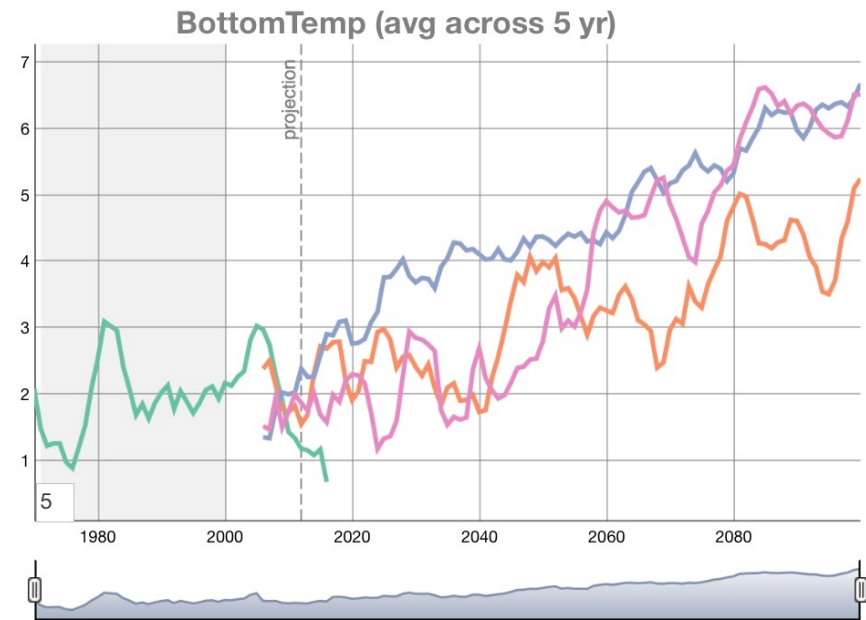


# Bottom Temperature (°C)

## Low CO<sub>2</sub> Scenario (RCP 4.5)



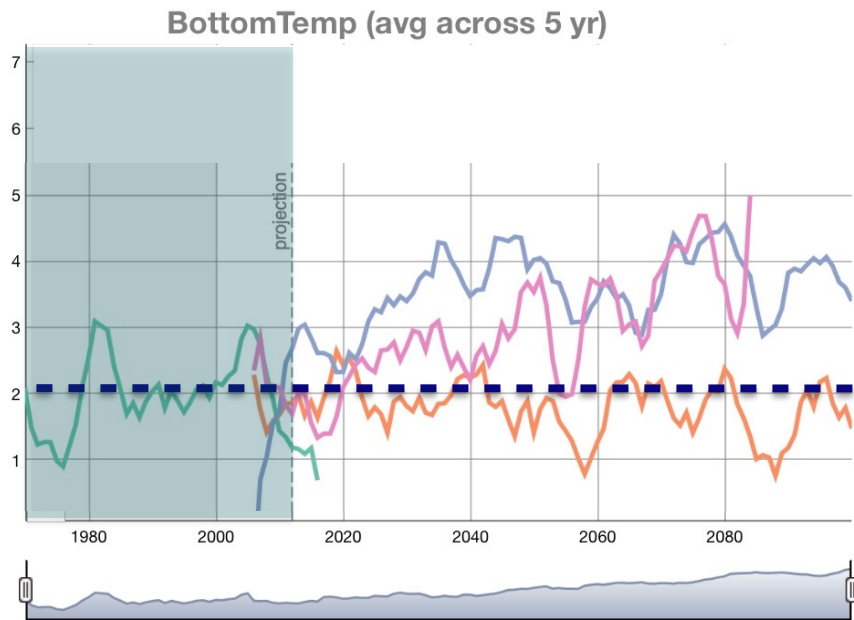
## High CO<sub>2</sub> Scenario (RCP 8.5)



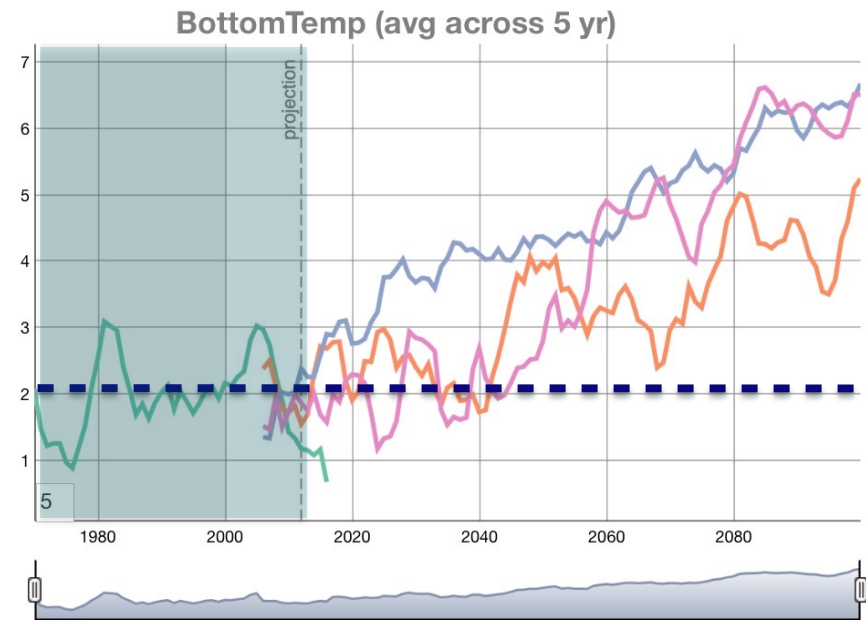
*Holsman et al. in prep; draft results, please do not cite or copy*

# Bottom Temperature (°C)

## Low CO<sub>2</sub> Scenario (RCP 4.5)



## High CO<sub>2</sub> Scenario (RCP 8.5)

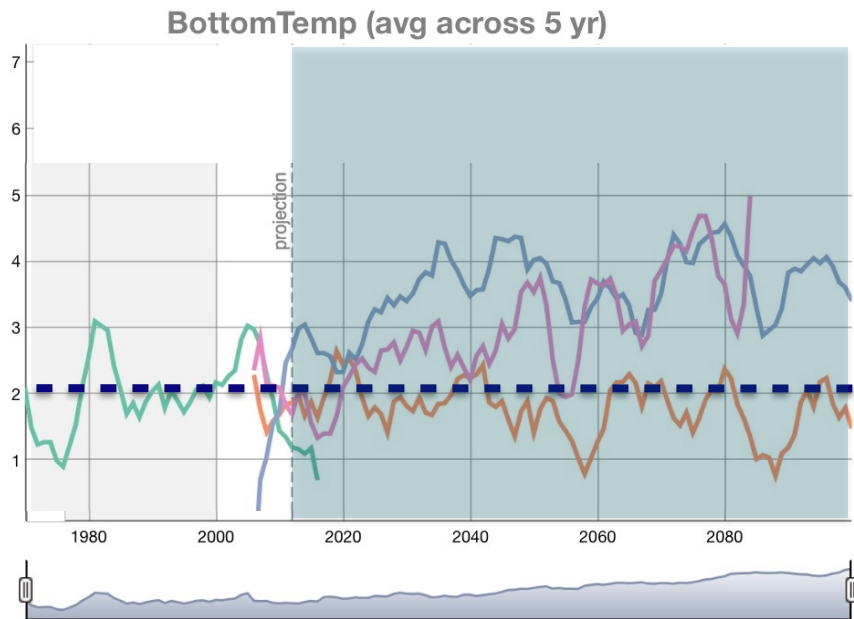


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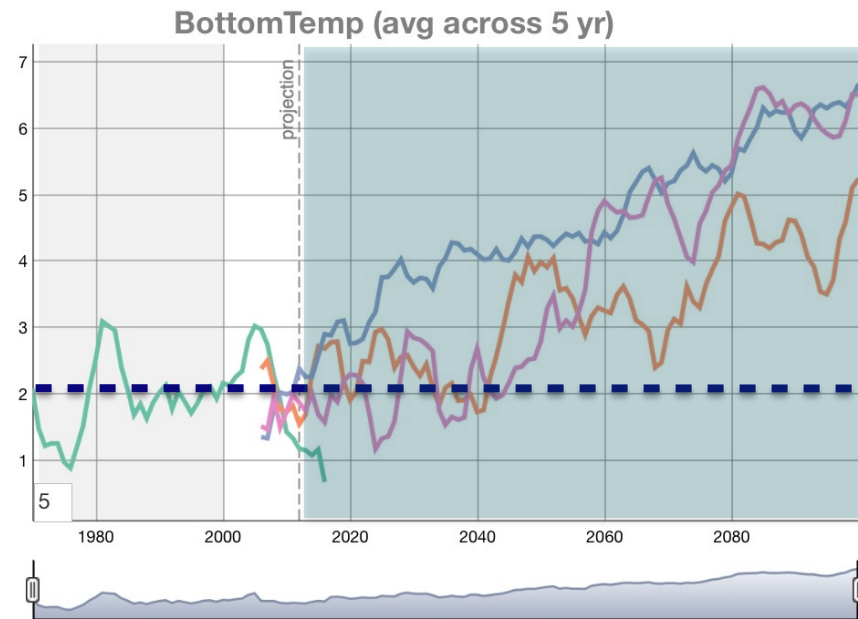


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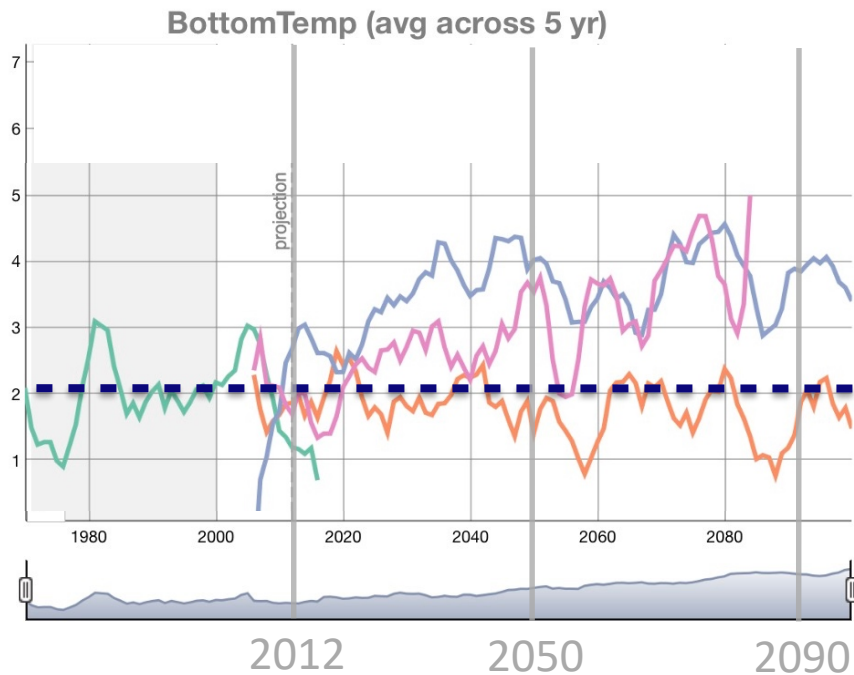
## High CO<sub>2</sub> Scenario (RCP 8.5)



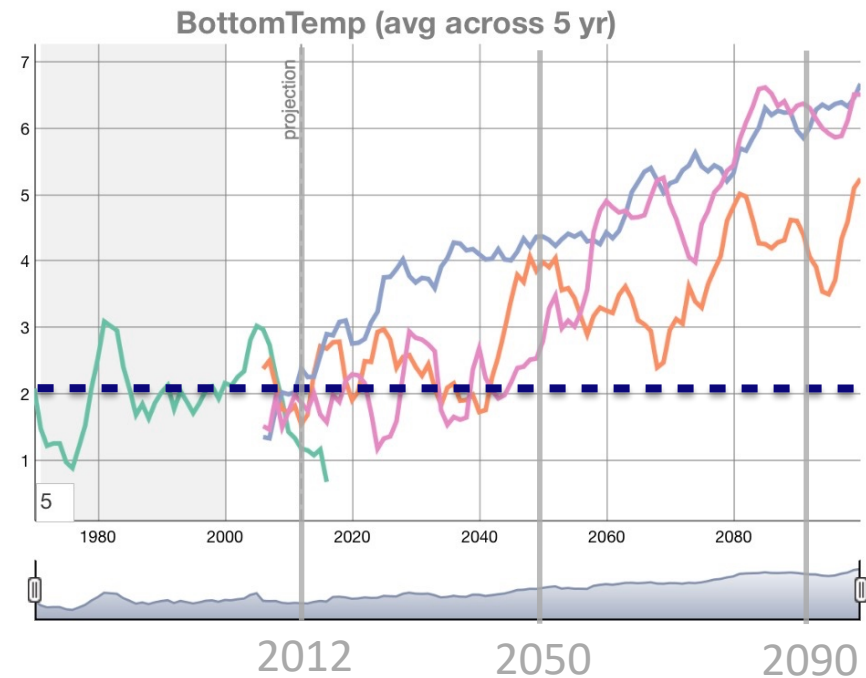
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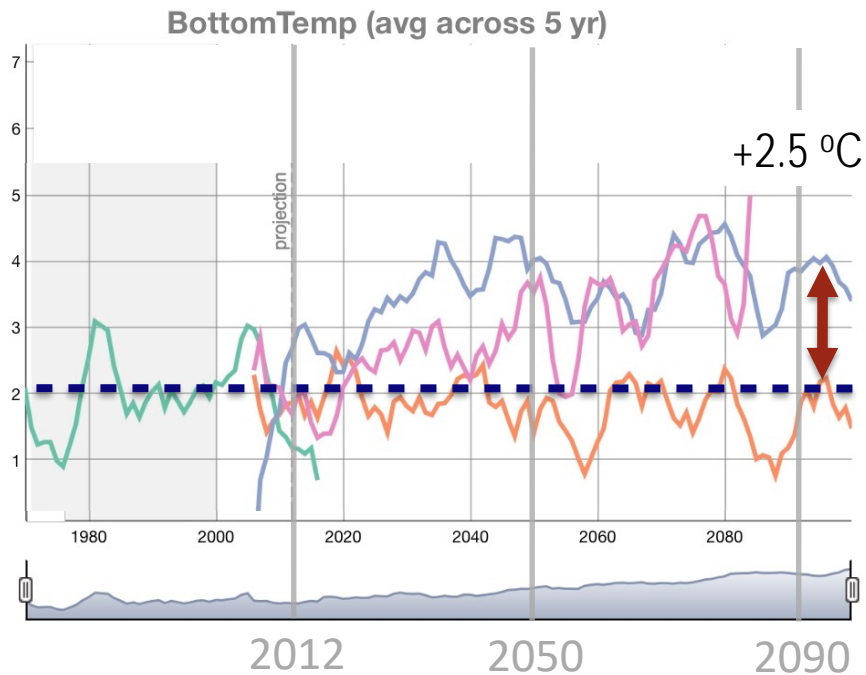
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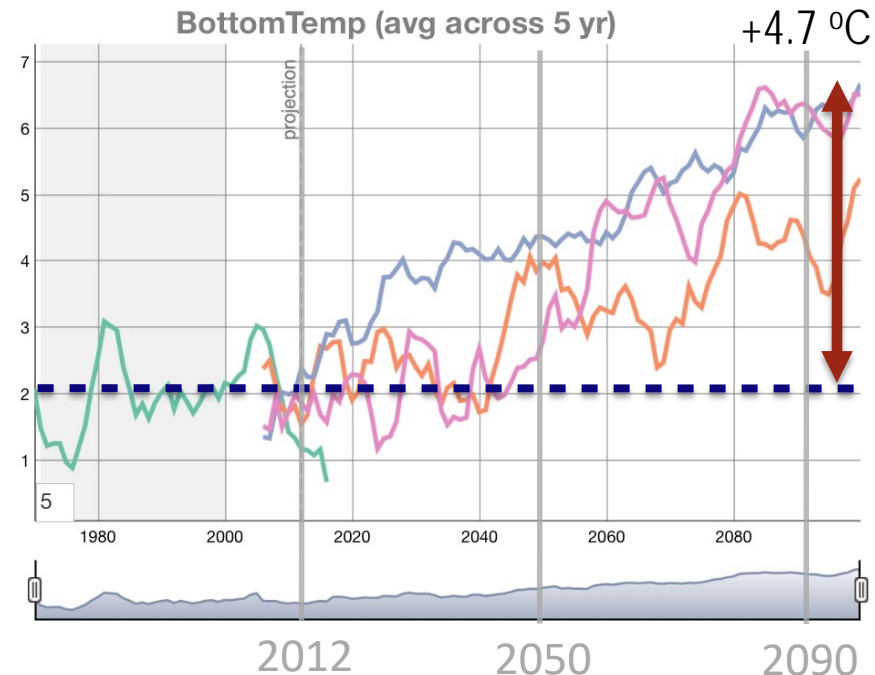
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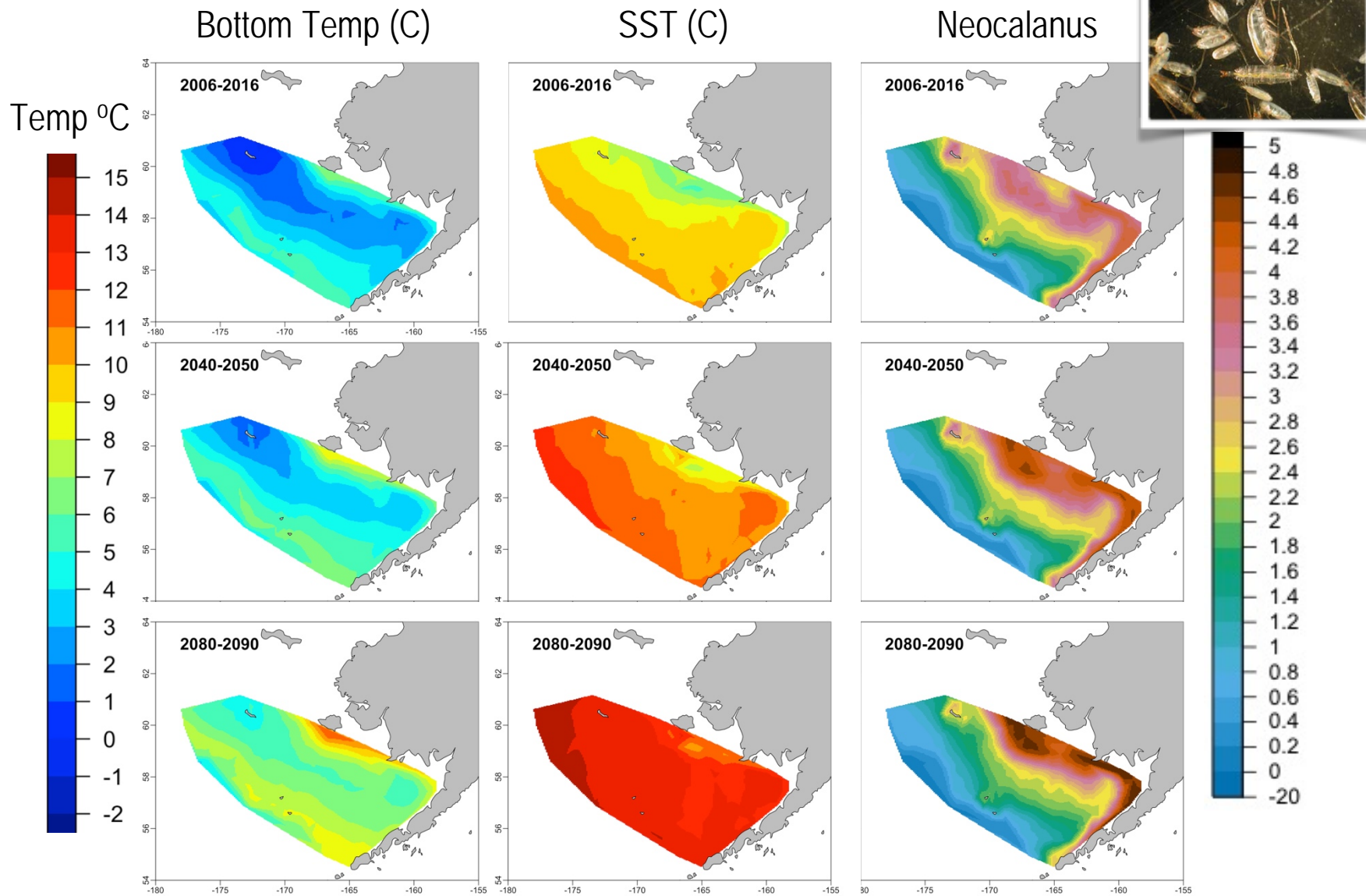
## High CO<sub>2</sub> Scenario (RCP 8.5)



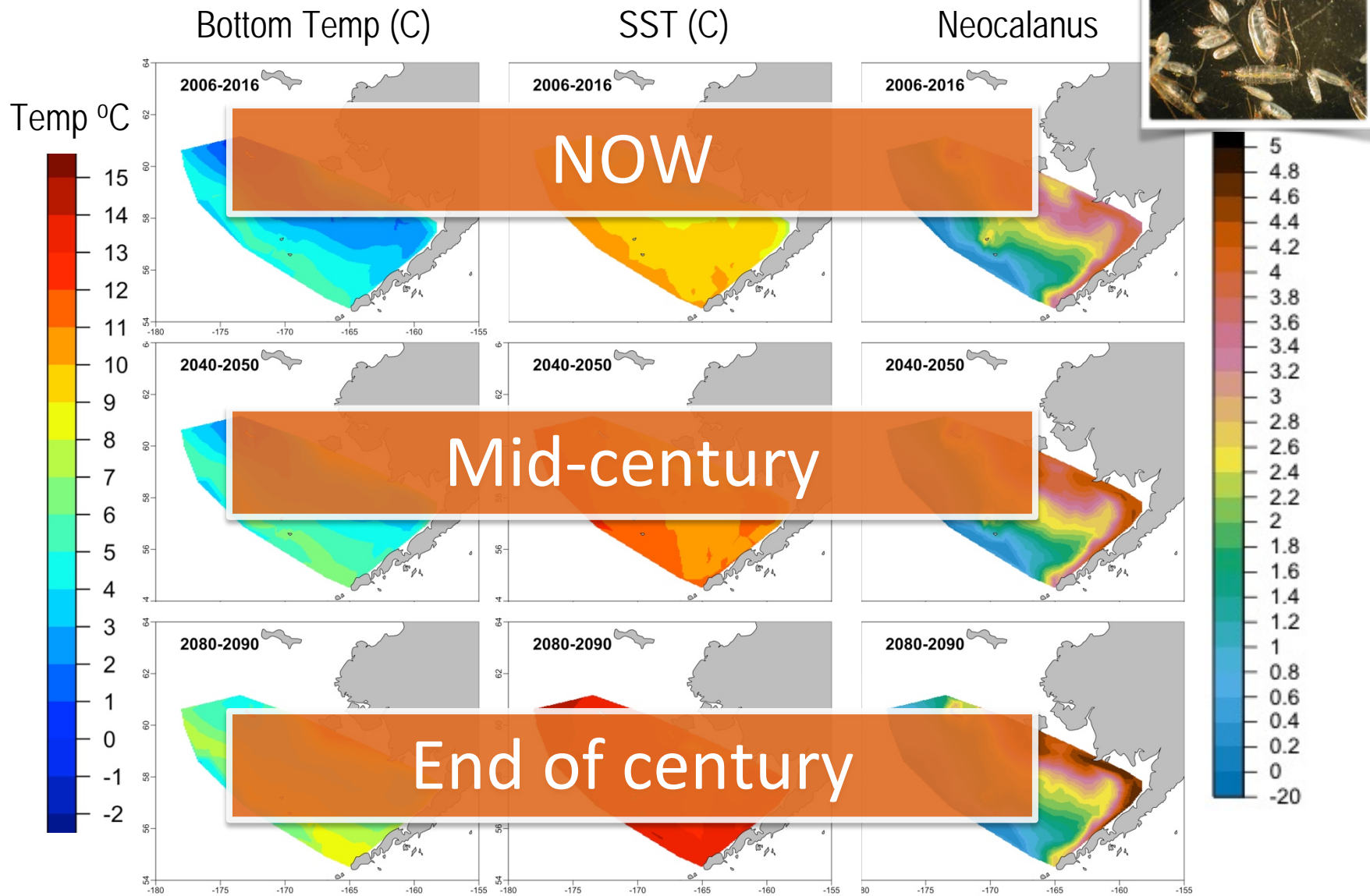
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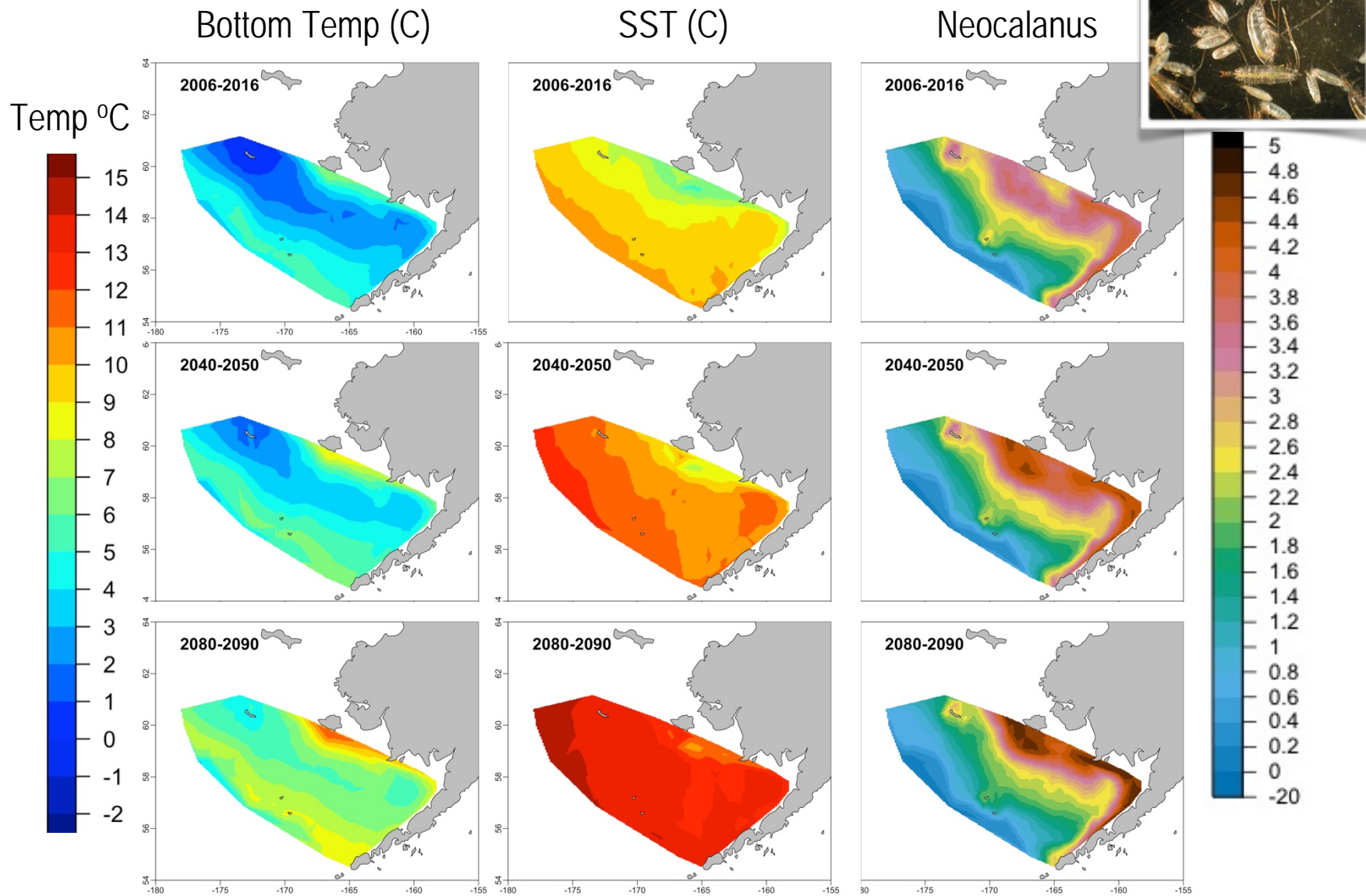
# Average of all "warm" scenarios (ESM RCP 8.5)



# Average of all "warm" scenarios (ESM RCP 8.5)

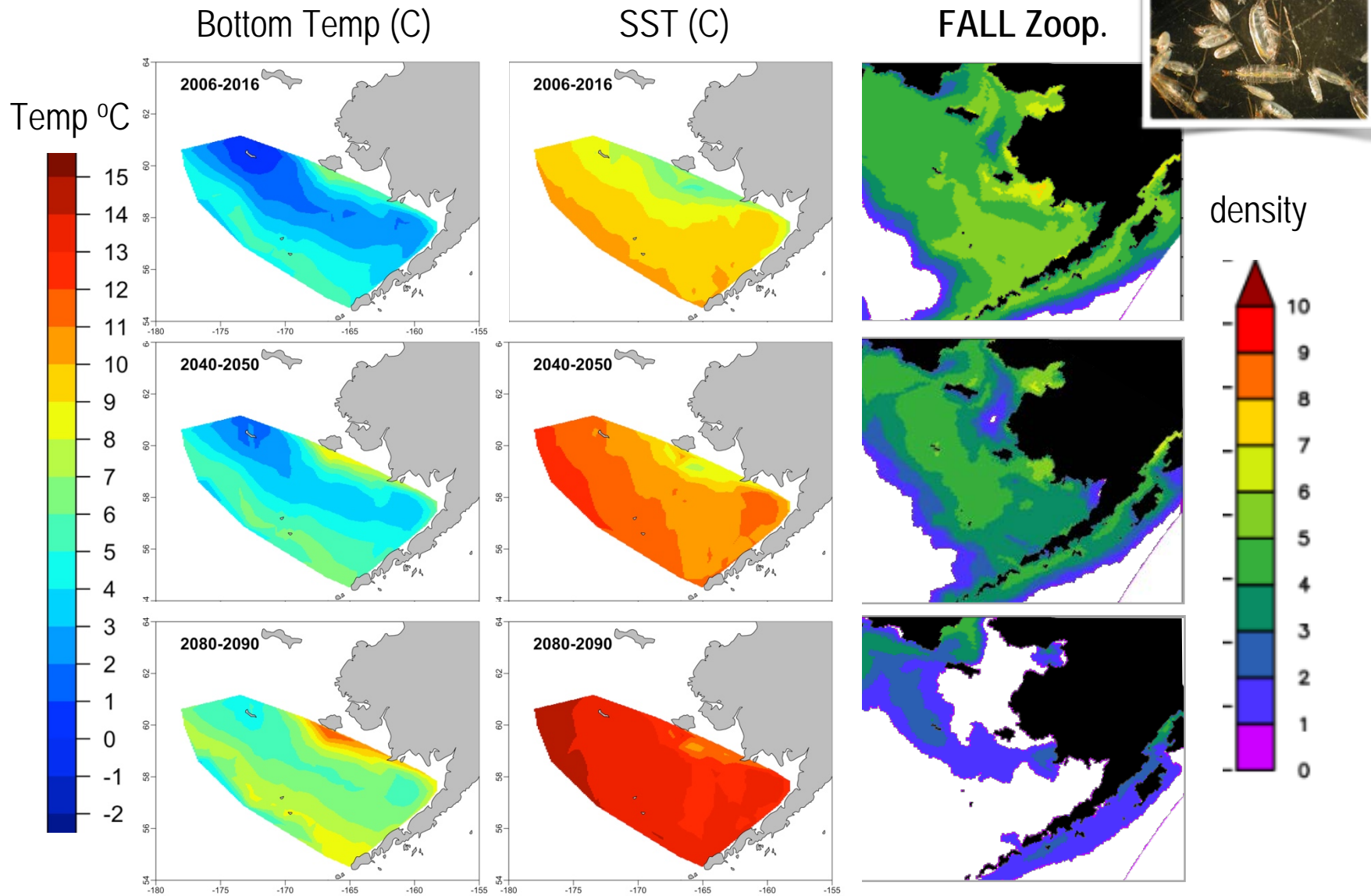


# Average of all "warm" scenarios (ESM RCP 8.5)





# Average of all "High CO<sub>2</sub>" scenarios (ESM RCP 8.5)



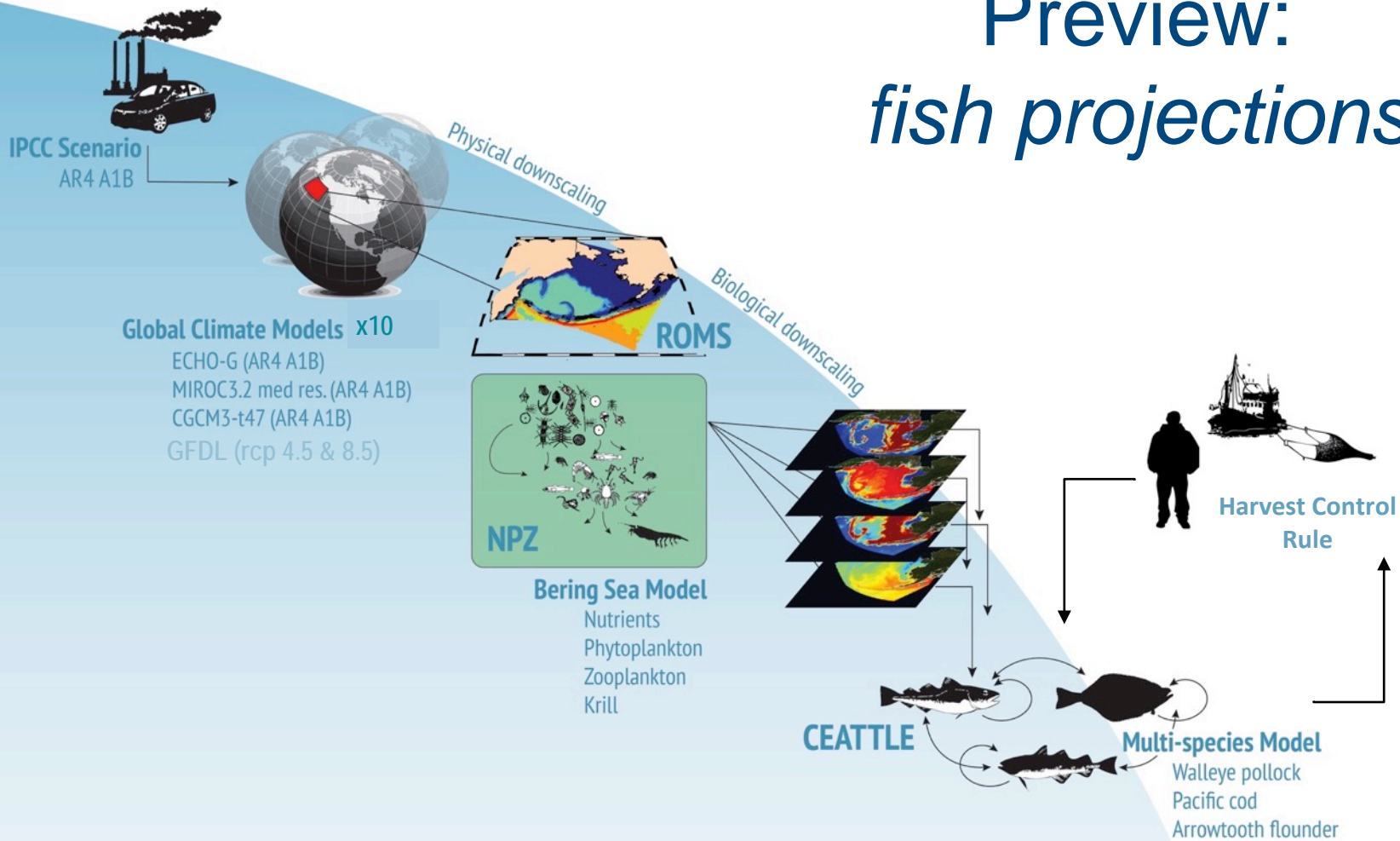
# Preliminary Results

*(fish projections)*

*No fishing & "Status quo"  
assuming we don't adjust our management but the climate changes*

Photo: Mark Holsman

# Preview: *fish projections*



Holsman et al. in prep

Climate-specific Harvest &  
Population Projections

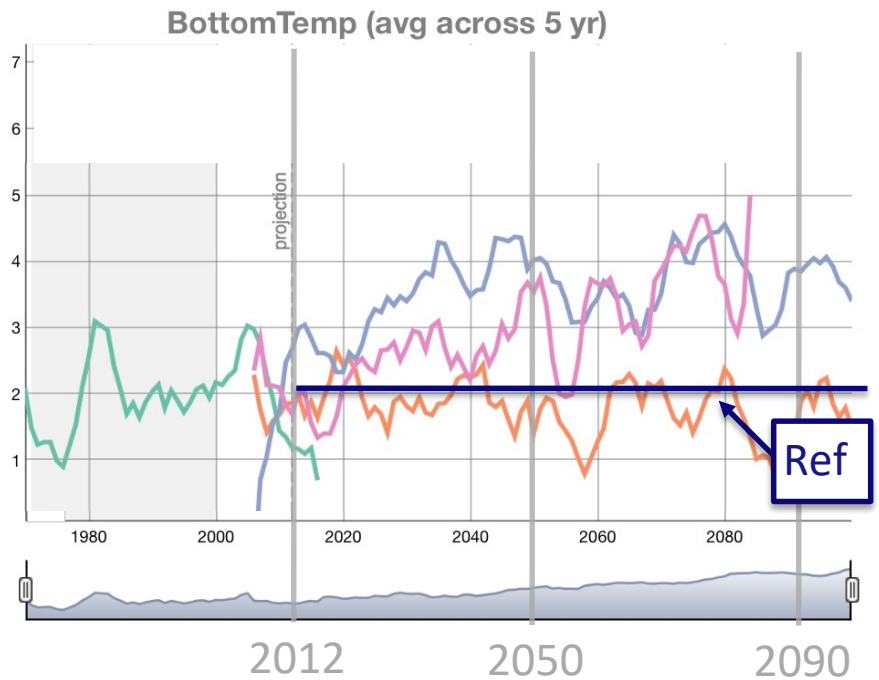


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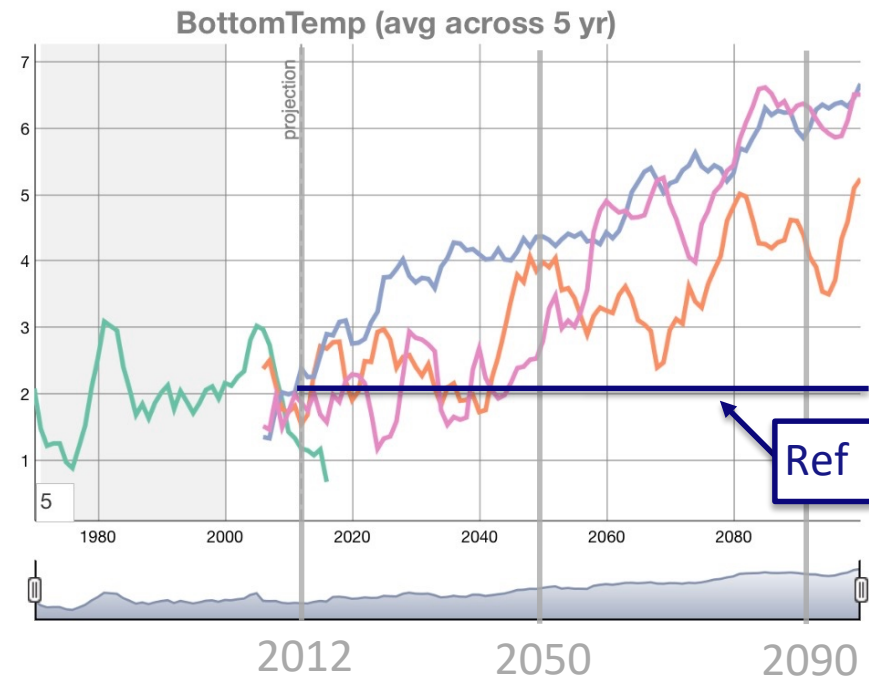


# Bottom Temperature (°C)

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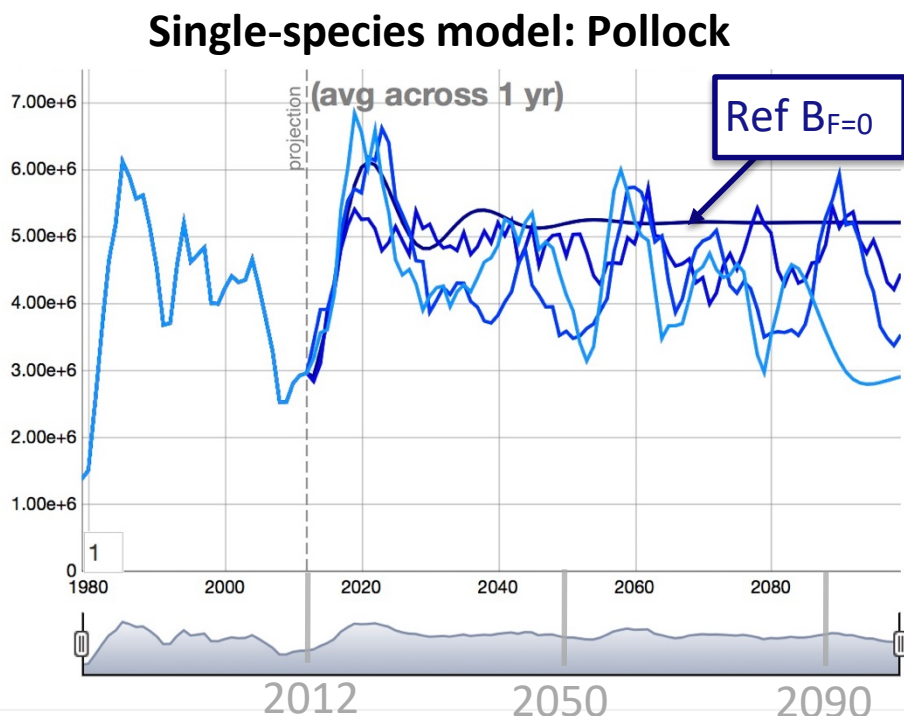
## High CO<sub>2</sub> Scenario (RCP 8.5)



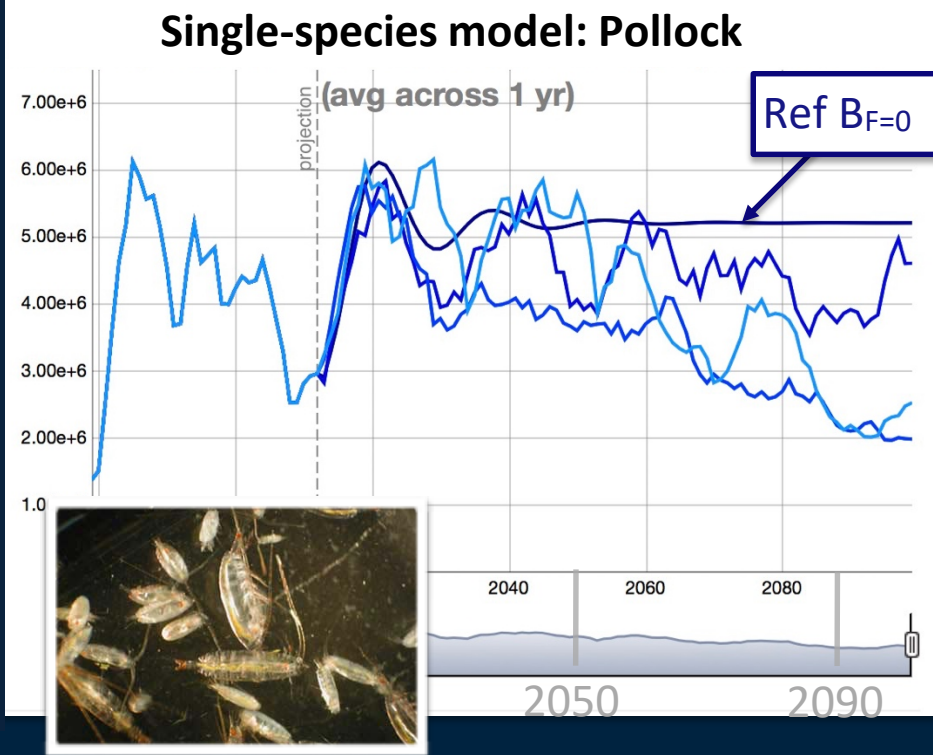
*Holsman et al. in prep; draft results, please do not cite or copy*

# Unfished Spawning Biomass ( $F=0$ )

## Low CO<sub>2</sub> Scenario (RCP 4.5)



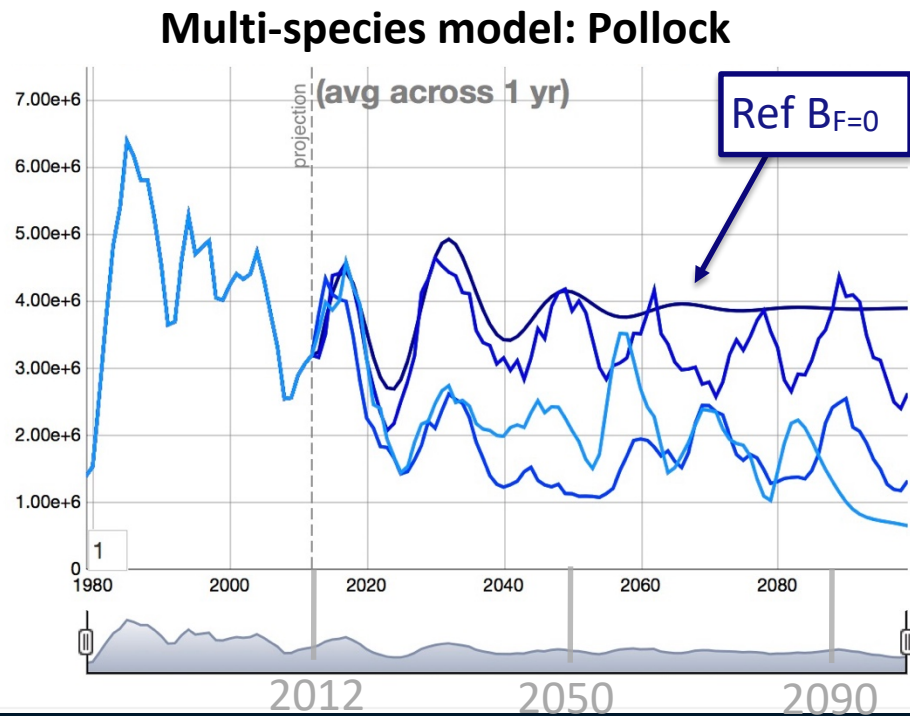
## High CO<sub>2</sub> Scenario (RCP 8.5)



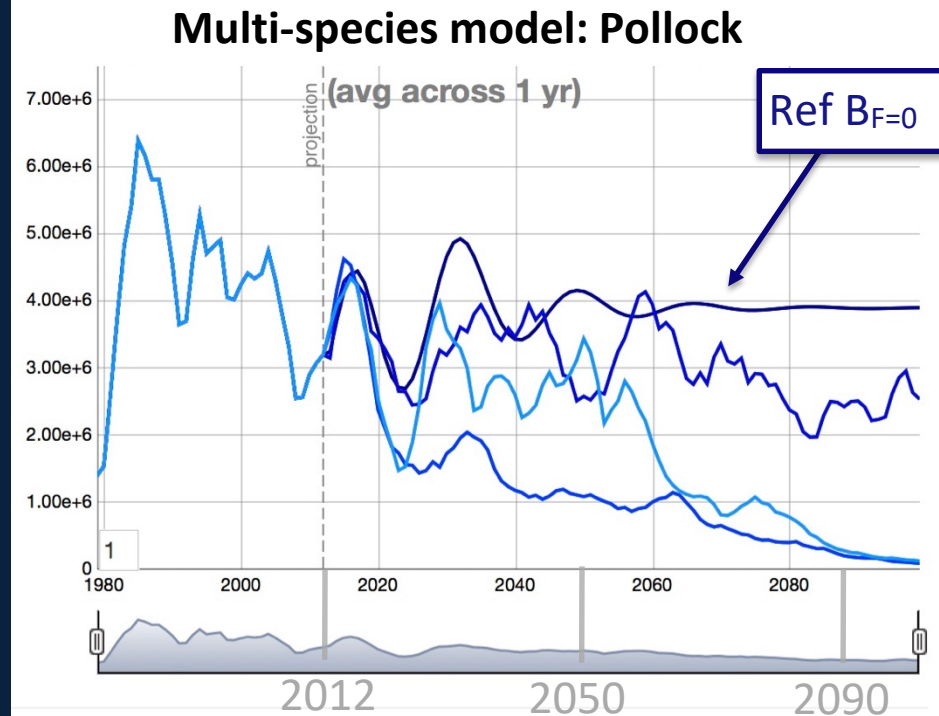
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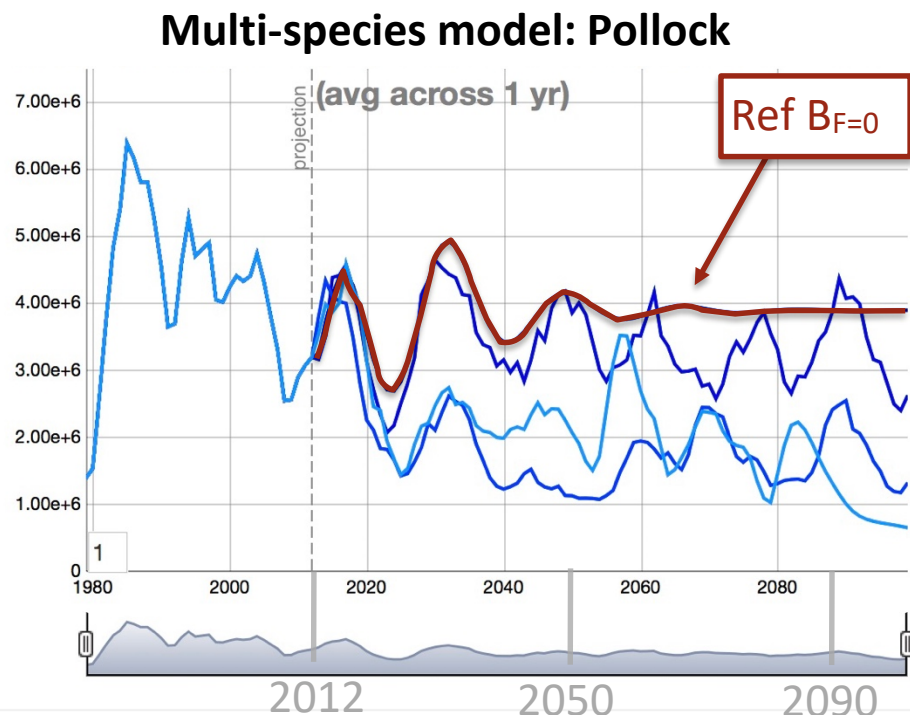


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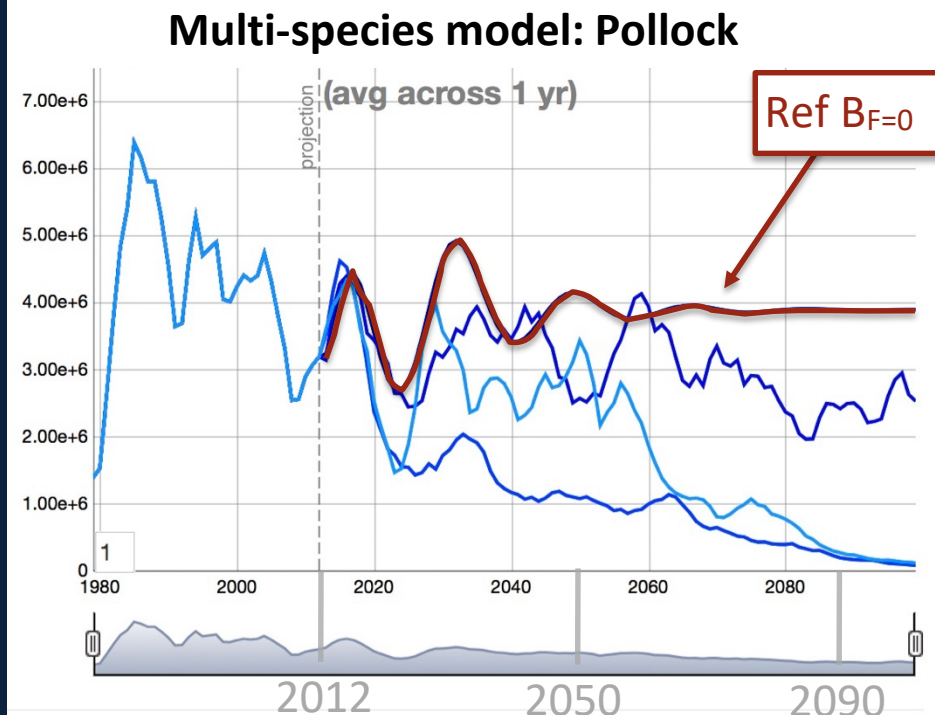


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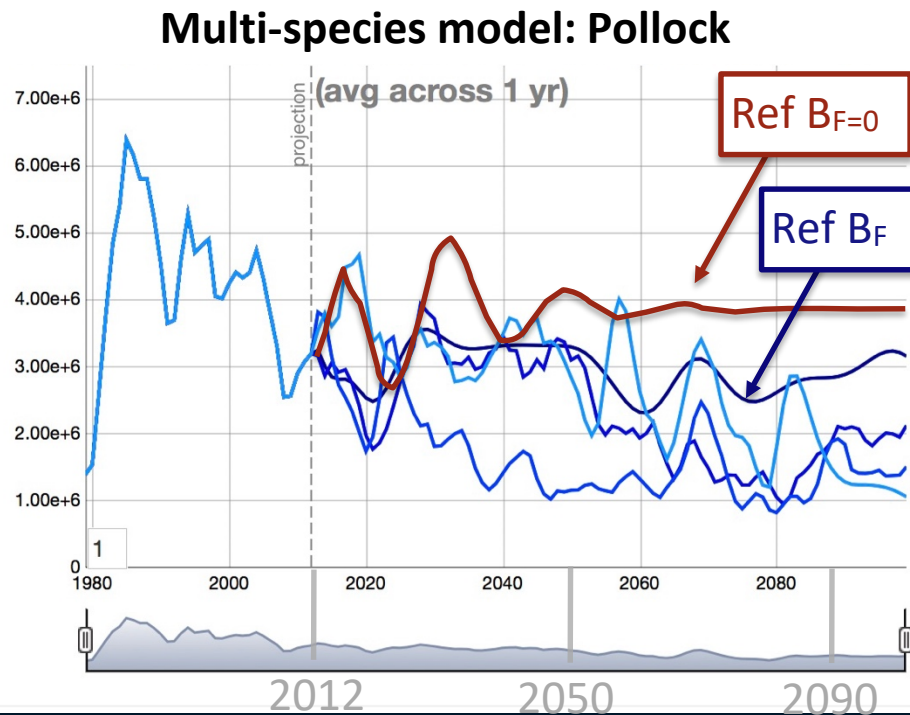
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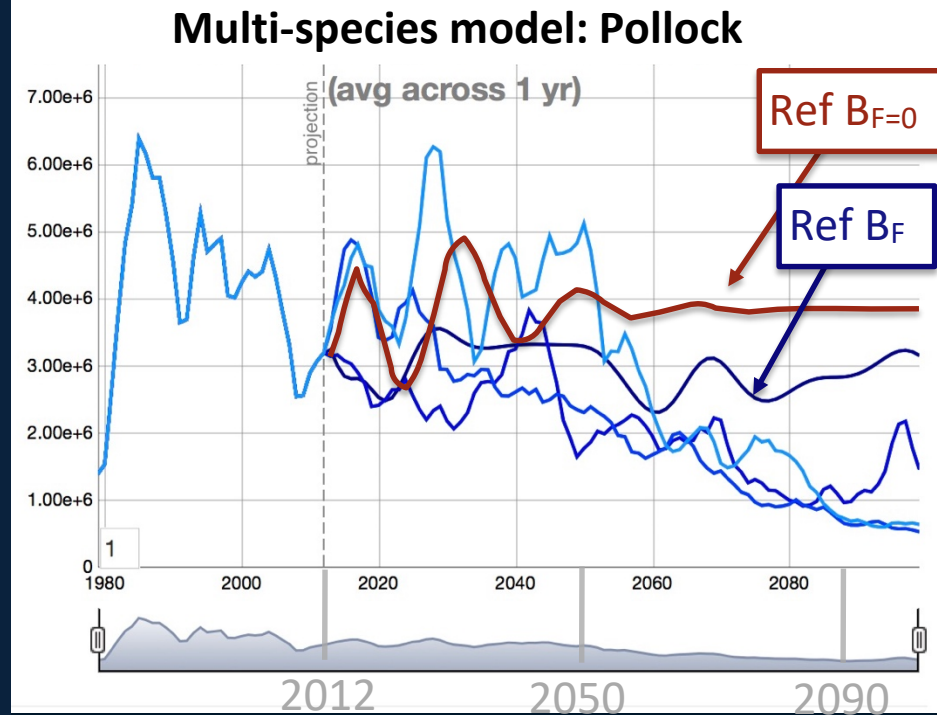
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# Fished Spawning Biomass

## Low CO<sub>2</sub> Scenario (RCP 4.5)



## High CO<sub>2</sub> Scenario (RCP 8.5)



*Holsman et al. in prep; draft results, please do not cite or copy*

## Single-species model

	Low CO <sub>2</sub>	High CO <sub>2</sub>
B <sub>F=0</sub>	-33%	-42%
B <sub>F</sub>	-30%	-35%

## Multi-species model

	Low CO <sub>2</sub>	High CO <sub>2</sub>
B <sub>F=0</sub>	-64%	-76%
B <sub>F</sub>	-54%	-72%

“Climate only”

“Climate + Fishery  
Management”

# Preliminary Results

*“Status quo”*

*assuming we don't adjust our management but the climate changes*





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Stephen Kasperski (AFSC ESSR/REFM)  
Jim Ianelli (AFSC, SSMA/REFM)  
Kerim Aydin (AFSC, REEM/REFM)  
Trond Kristiansen (IMR, Norway)  
Al Hermann (UW JISAO/PMEL)  
Wei Cheng (UW JISAO/PMEL)  
André Punt (UW SAFS)  
Jonathan Reum (UW SAFS)  
Amanda Faig (UW SAFS)

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

### Global Climate Models (x 7)

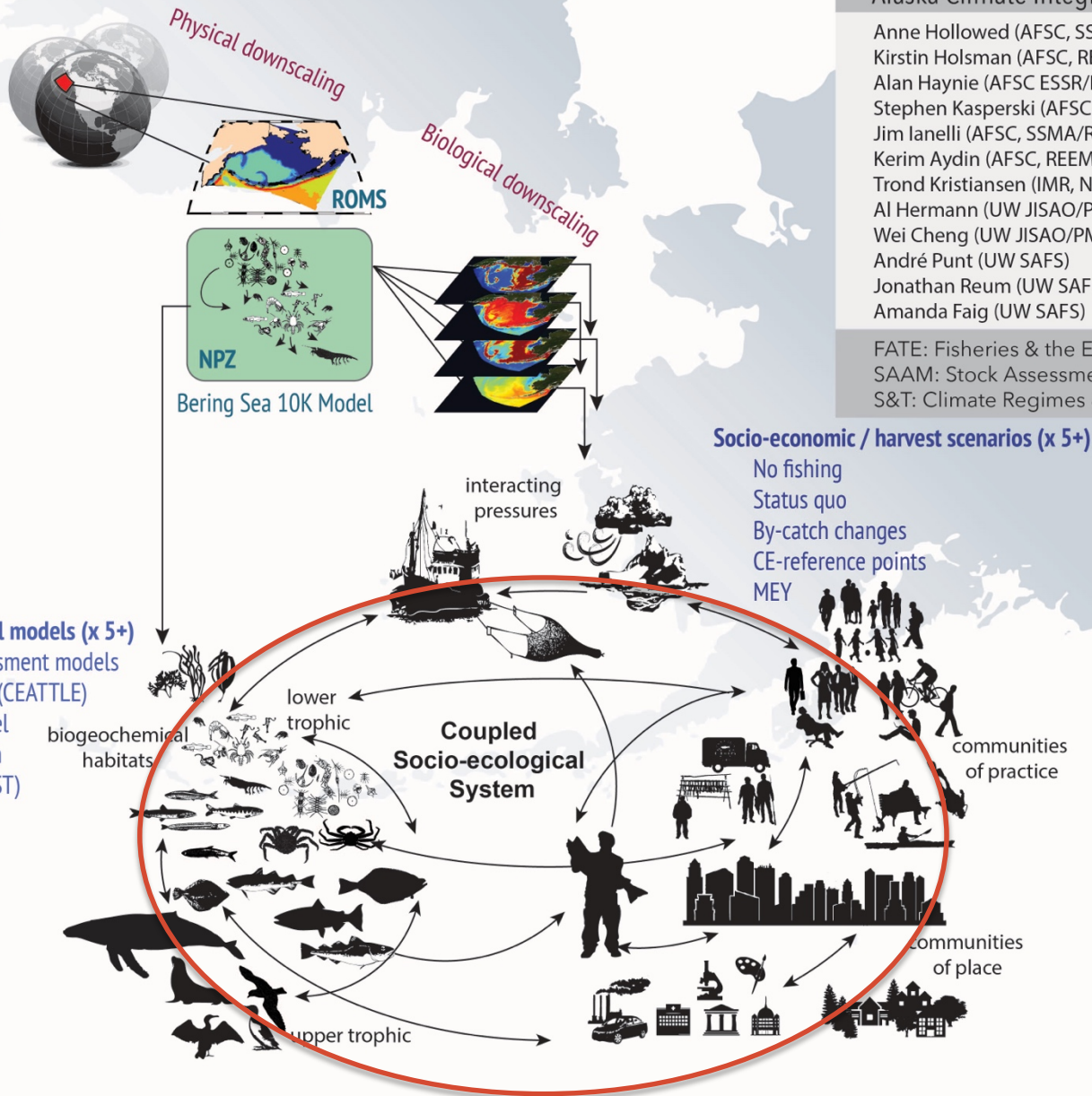
ECHO-G  
MIROC3.2 med res.  
CGCM3-t47  
CCSM4-NCAR-PO  
MIROCESM-C-PO  
GFDL-ESM2M\*-PO  
GFDL-ESM2M\*-PON

### Projection Scenarios (x3)

AR4 A1B  
AR5 RCP 4.5  
AR5 RCP 8.5

### Climate Enhanced Biological models (x 5+)

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



# The Human Connection





# Improving Management Foresight





# Improving Management Foresight

- We need to be ready for **feasible** outcomes as well as the most likely scenarios.
- We will use the ACLIM tools to consider a wide range of possibilities to help anticipate future challenges.



# Improving Management Foresight

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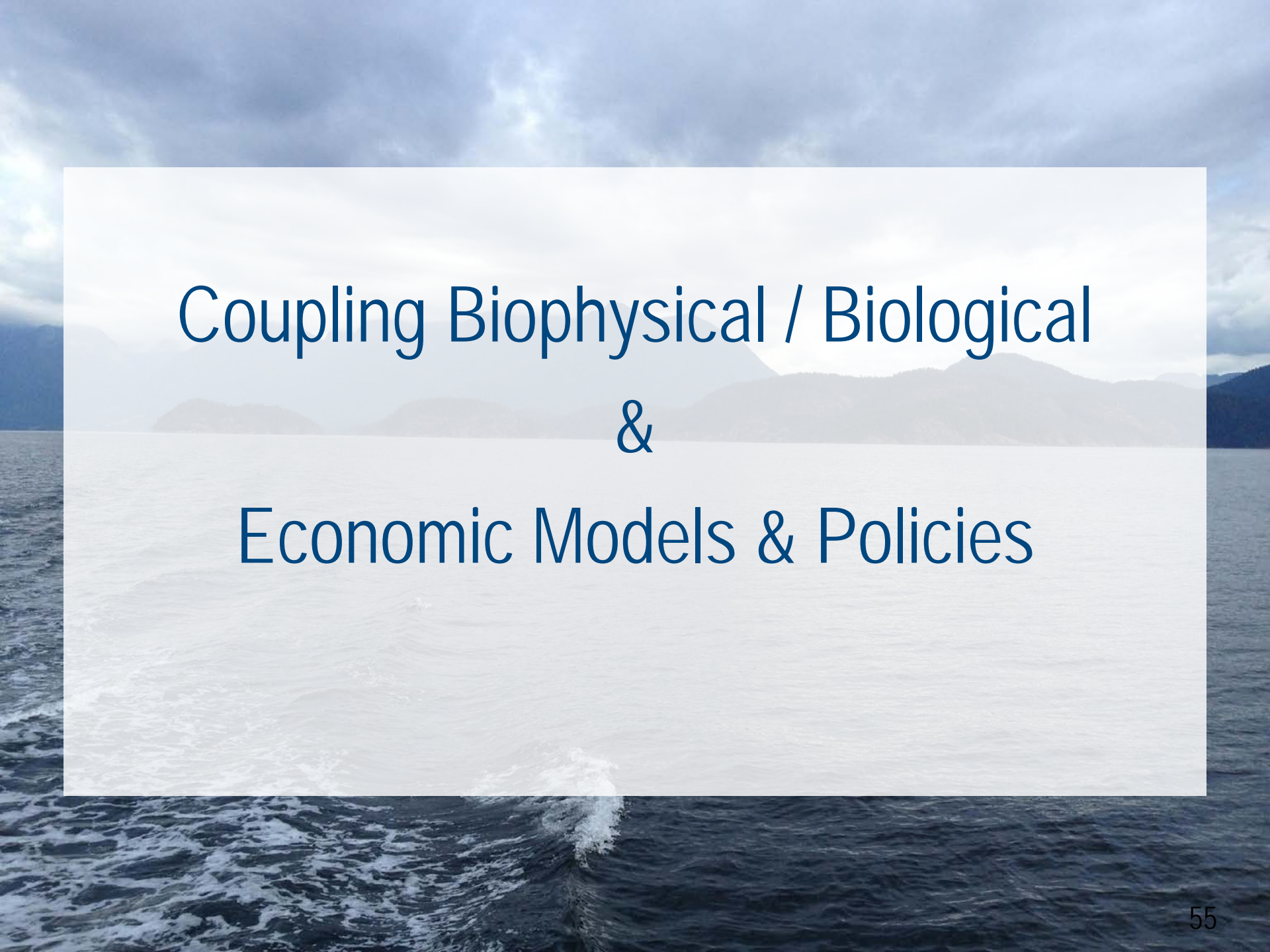
# Overview – “Socioecon-ACLIM”

- Coupling biological and economic models
- Fishery mechanisms
- Management tools



# Overview – “Socioecon-ACLIM”

- Coupling biological and economic models
- Fishery mechanisms
- Management tools
- Help! We need your input!



# Coupling Biophysical / Biological & Economic Models & Policies



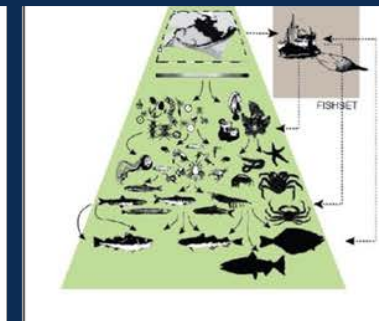
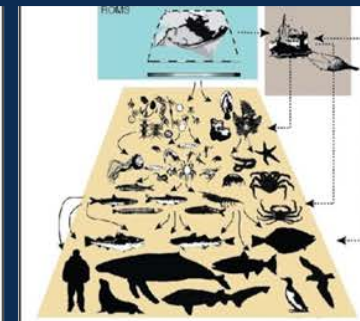
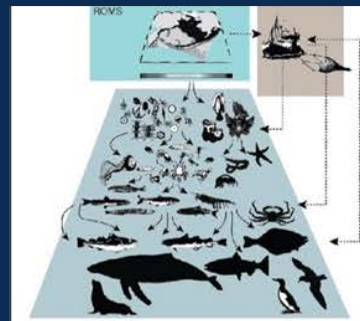
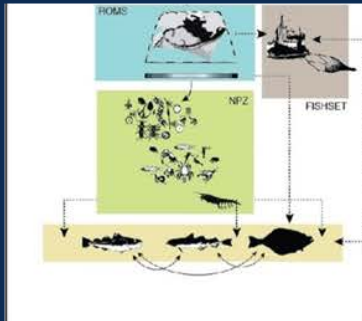
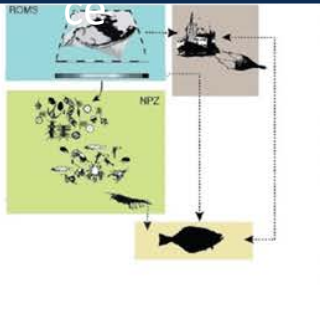
CE-SSM

CE-MSM

CE-EwE

CE-MIZER

FEAST



Fast  
Statistical  
Implicit ecosystem noise



Slow  
High resolution  
Explicit ecosystem interactions

ACLIM  
utilizes  
economic  
models of  
different  
complexity

- Status quo
- Effort response to abundance
- Spatial models of fleets responding to shifts in fish distributions.
- Maximum economic yield (MEY)
- Community impact analyses



NOAA FISHERIES



# Status Quo Management under the Ecosystem Cap

- For each species,  $TAC \leq ABC$
- The sum of all TACs  $\leq 2$  MMT
- In 2017,  $\text{Sum}(ABCs) = \sim 4$  MMT

The Council chooses TAC reduction for each species below its ABC so the BSAI  $TAC < 2$  million MT

# Biomass – TAC - Catch Model for Projections

## 1. Use ABC to predict TAC

- Observe past Council decisions
- Model relationship between Council & ABC
- Impose 2 Million metric ton cap



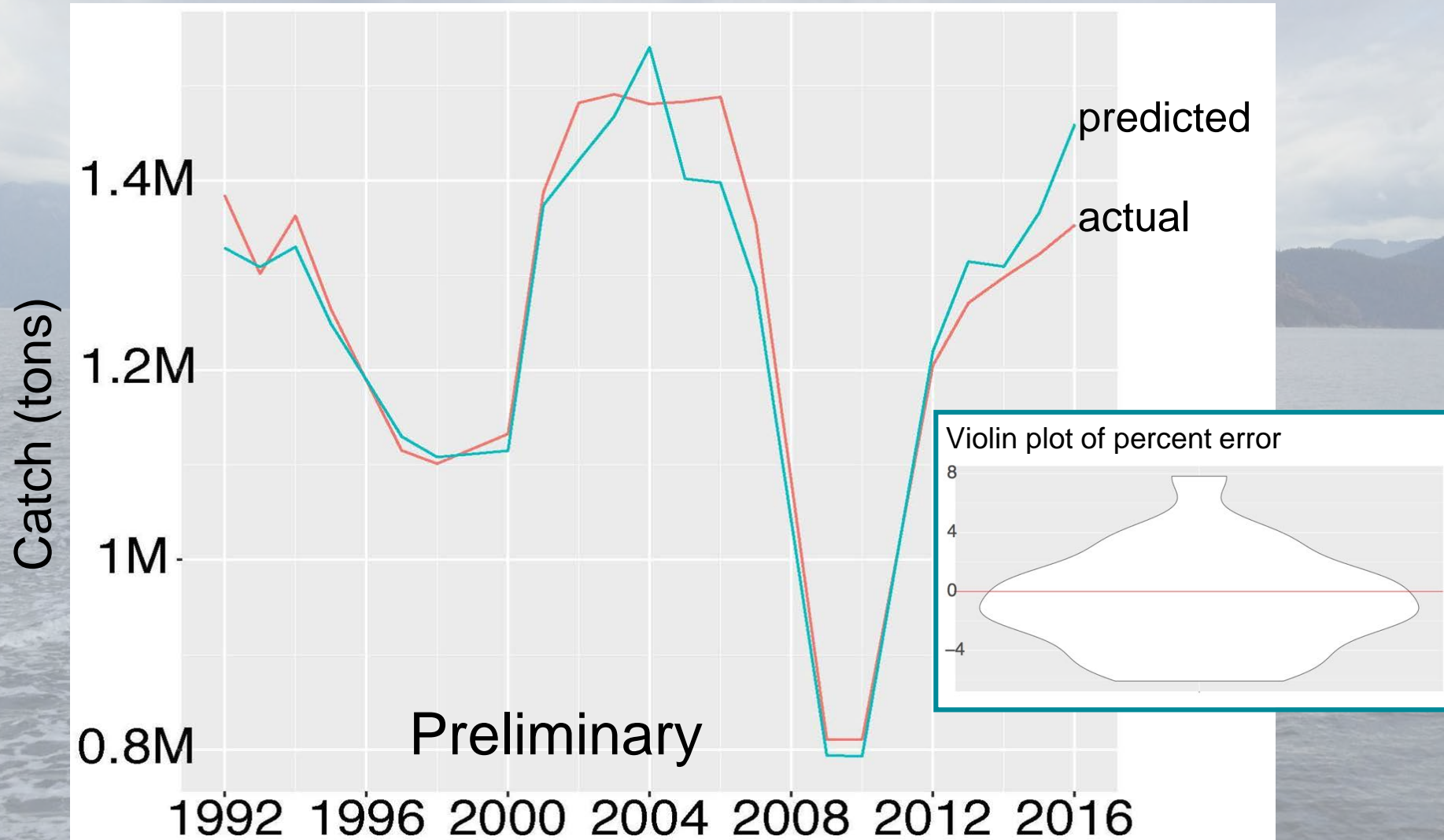
Amanda Faig

## 2. Use TAC prediction to predict Catch

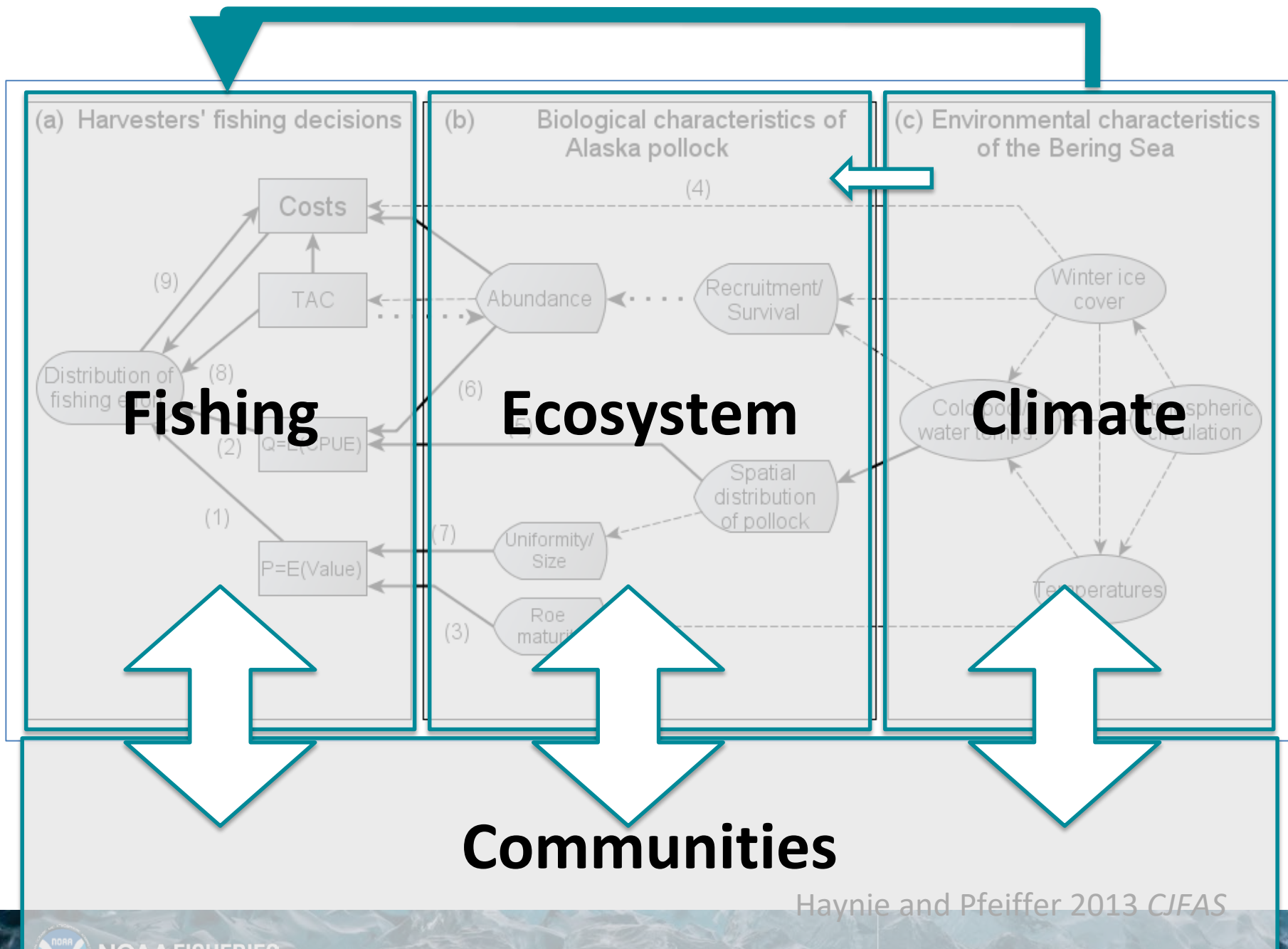
- Model catch based on past fishery outcomes, weighted to recent behavior.
- Limit catch to not exceed ABC

# Bering Sea Pollock, historical evaluation

BS Pollock catch, predicted from ABC



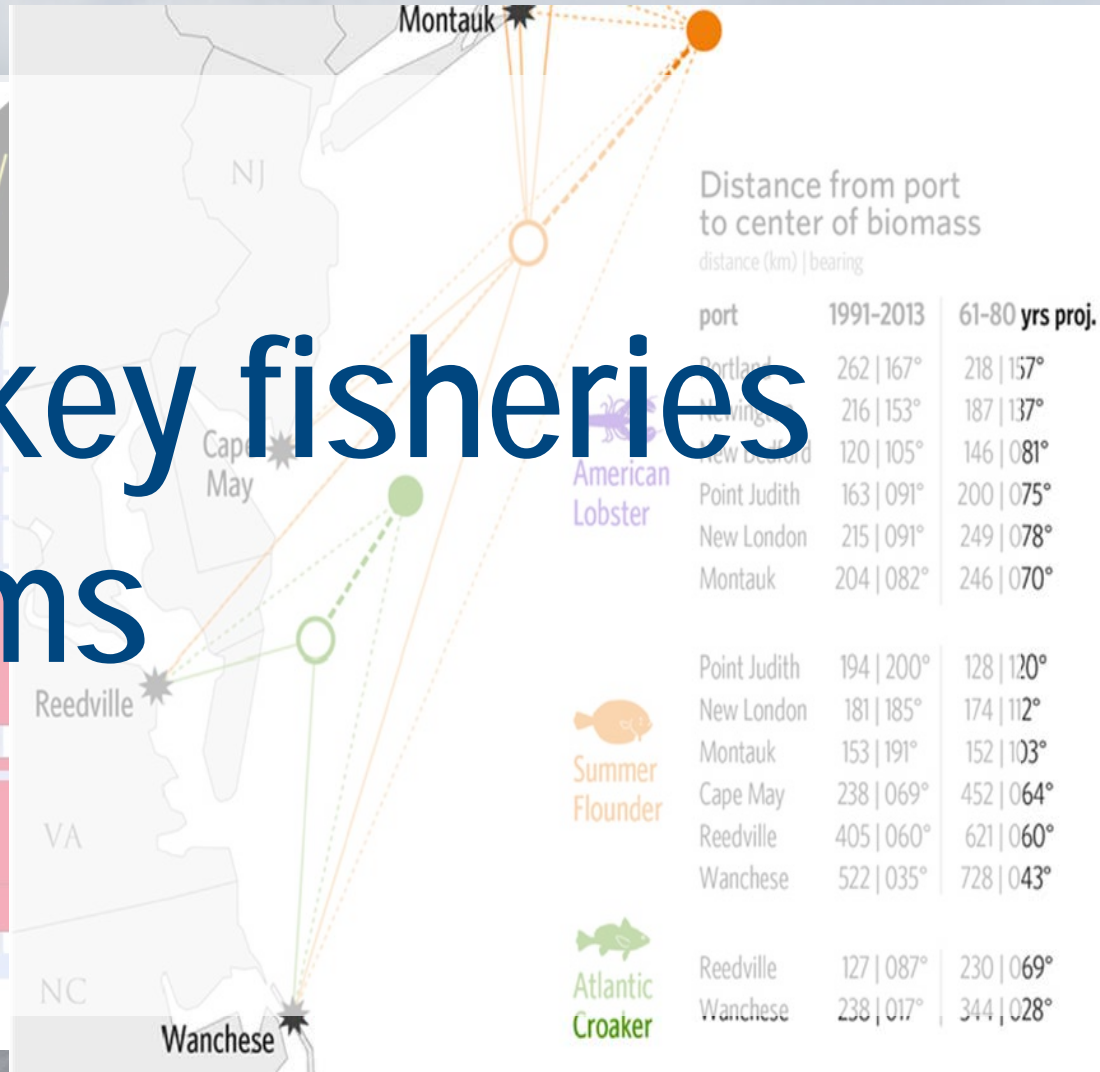




Haynie and Pfeiffer 2013 *CJFAS*

# Translating global changes to fisheries changes

## Focus on key fisheries mechanisms



# **Fishery Mechanisms**

Fish prices

Relative price of  
premium fish

Number of species  
fished

Costs

Priority on  
conservation

Protection of fishing  
communities

Can we simplify these further?



# Fishery Mechanisms

Fish prices

Relative price of premium fish

Number of species fished

Costs

Priority on conservation

Protection of fishing communities

Can we simplify these further?

- Net Trip Revenue
- Skill in selective harvesting
- Flexibility of fishing opportunities

# Characterize expected impacts & uncertainty

- Catch
- Revenue
  - Average returns
  - Variability
  - Fleet & community distribution

# Consider Feasible Management Tools

- New technology
- Catch shares
- Dynamic / fixed area closures
- Bycatch reduction incentives
- Revised harvest control rules
- Other suggestions?
- Tools of the future!



# Future process

- Understand possible changes
- Council & stakeholders consider outcomes they most want to avoid or achieve - develop thresholds
- Evaluate policies based on Council & stakeholder preferences.



# The goal of ACLIM is constant improvement

- These models use the best available knowledge about the ecosystem
- As we learn more, the models and projections will be updated.



# Take-home Messages

- The Bering Sea is likely to change
- ACLIM tools will evolve & improve
- Continued excellent and responsive management will be essential.



# Our questions for you:

- What are we missing?
- What are the biggest challenges to management and fishery adaptation?
- How can we best share results with the Council & other stakeholders?

# Thanks!

NPRB & BSIERP Team  
ACLIM Team  
AFSC

*"Behind these numbers lies, of course, an infinity of movements and of destinies."*

– von Bertalanffy 1938

*...and of people!*

## Funding:

- Fisheries & the Environment (FATE)
- Stock Assessment Analytical Methods (SAAM)
- Climate Regimes & Ecosystem Productivity (CREP)
- Economics and Human Dimensions Program
- NOAA Integrated Ecosystem Assessment Program (IEA)
- NOAA Research Transition Acceleration Program (RTAP)





kirstin.holsman@noaa.gov  
stephen.kasperski@noaa.gov







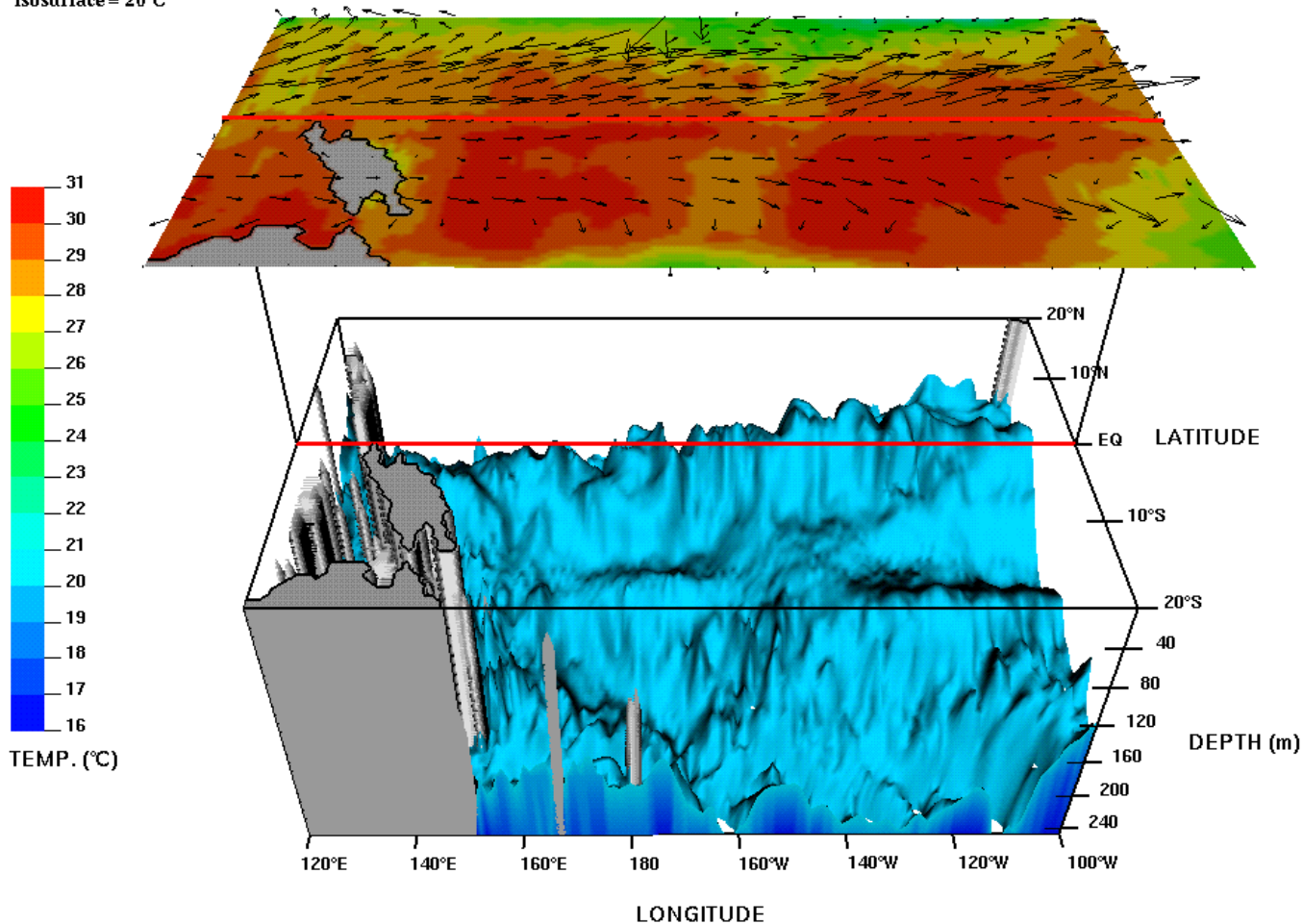
EXTRA Slides follow



**NOAA FISHERIES**

January 1983

Isosurface = 20°C



Source GFDL:

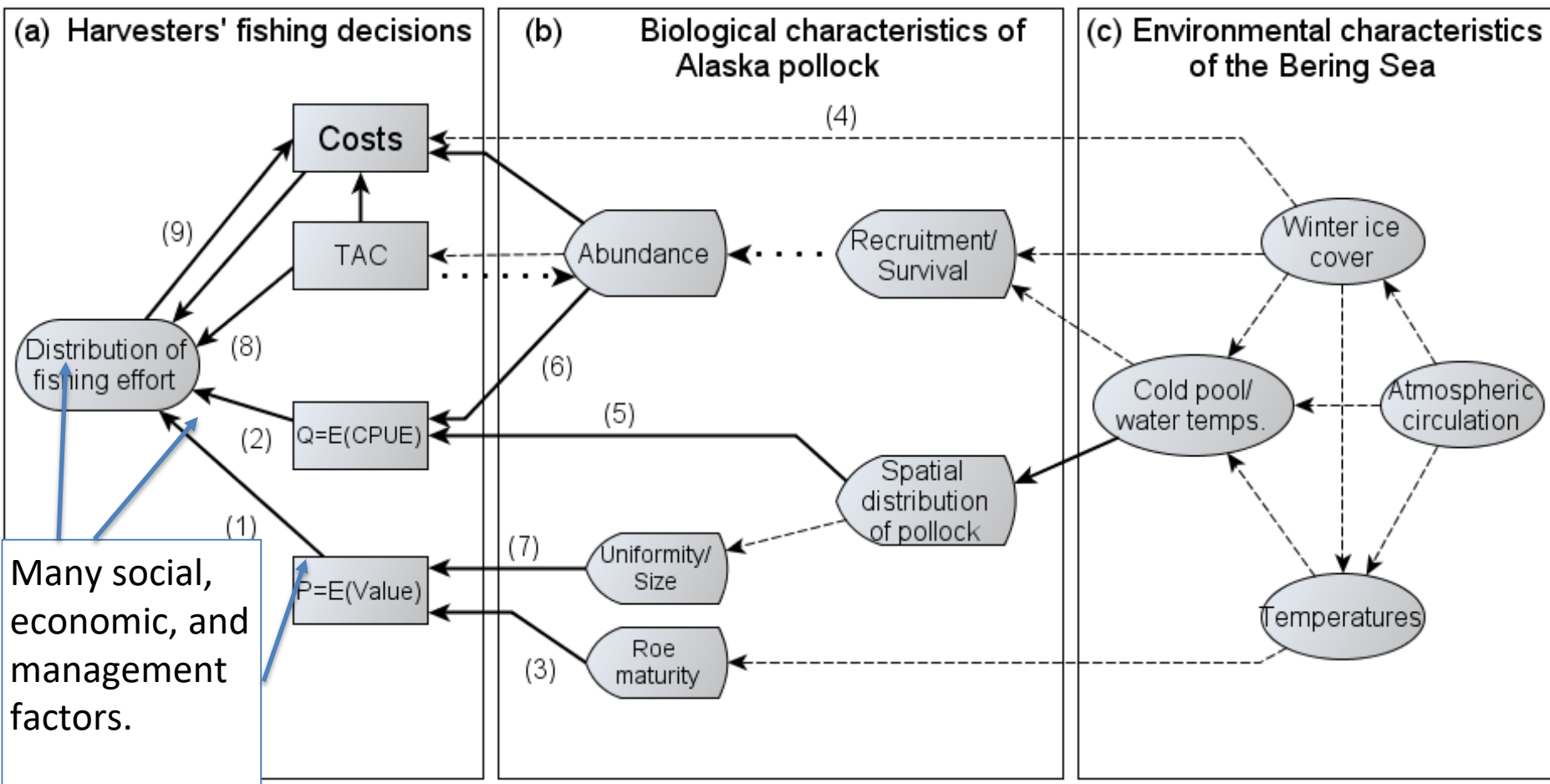
Modeled ocean temperature and surface current distribution over the tropical Pacific Ocean region obtained from a GFDL coupled ocean-atmosphere model used to predict El Nino/Southern Oscillation (ENSO).



NOAA FISHERIES

Fishery Mechanisms	Why this might increase	Why this might decrease
Fish prices	Driven by consumer demand, income and/or scarcity	Driven by fishing and aquaculture demand or smaller populations
Change in relative price of premium fish	Concentrated wealth interacting with scarcity	Increased value of protein for humans or input to aquaculture
Number of species fished	Markets may develop for other species; invasives or changes	Environmental change may lead to the decline of some species
Fishing and processing costs	Increased fuel costs or carbon tax. Land or labor costs may increase.	Improved or more selective fishing or processing technology
Priority on conservation	Change in demand or strength of conservation measures	Change in weak stock policies; change in the Endangered Species Act
Change in protection of fishing communities	Additional concern about preserving the distribution of fishing opportunities	Change in number of people in remote areas; more large fishing vessels.





## Single-species model

	Low CO <sub>2</sub>	High CO <sub>2</sub>
B <sub>F=0</sub>	-33% (+/- 13%)	-42% (+/- 27%)
B <sub>F</sub>	-30% (+/- 5%)	-35% (+/- 13%)

## Multi-species model

	Low CO <sub>2</sub>	High CO <sub>2</sub>
B <sub>F=0</sub>	-63.5% (+/- 23%)	-76% (+/- 36%)
B <sub>F</sub>	-54% (+/- 13%)	-72% (+/- 16%)

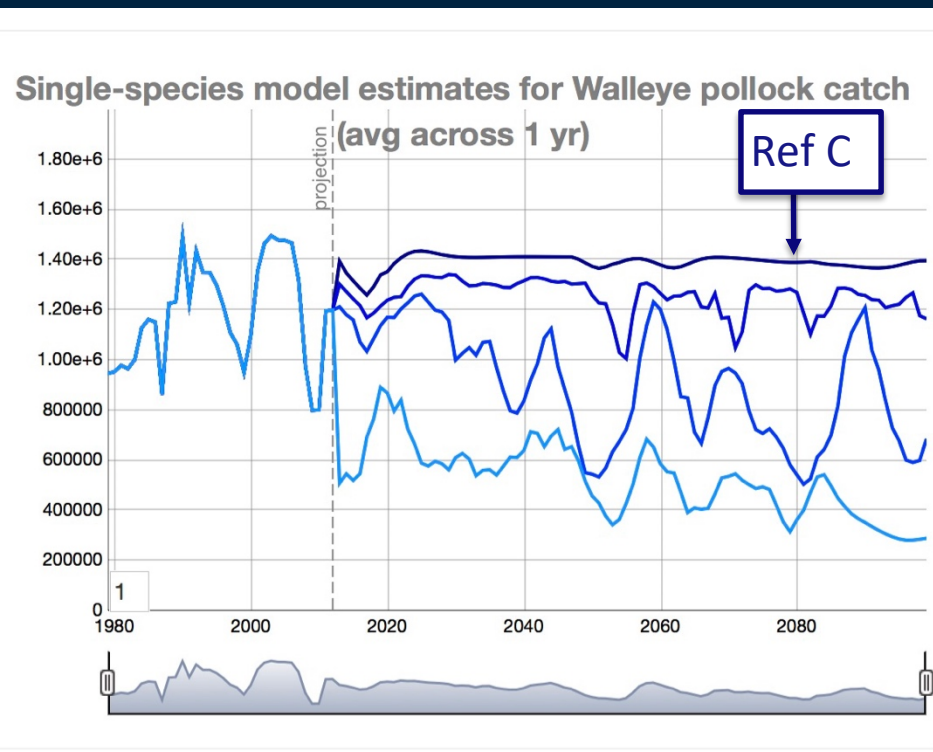
# Preliminary Results

*"Status quo"*

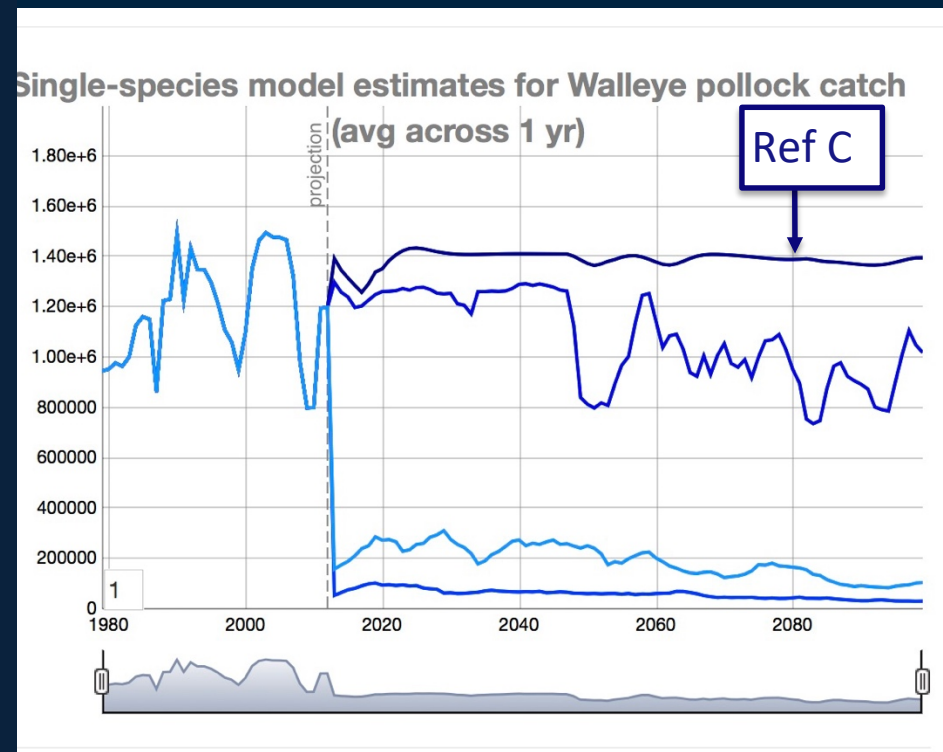
*assuming we don't adjust our management but the climate changes*

# Projected catch (t)

## Low CO<sub>2</sub> Scenario (RCP 4.5)



## High CO<sub>2</sub> Scenario (RCP 8.5)



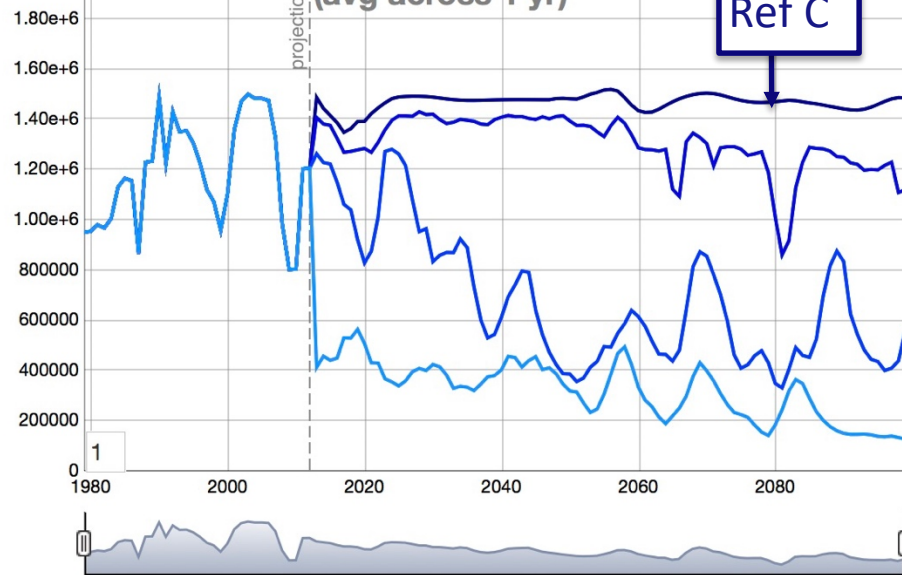
*Holsman et al. in prep; draft results, please do not cite or copy*



# Projected catch (t)

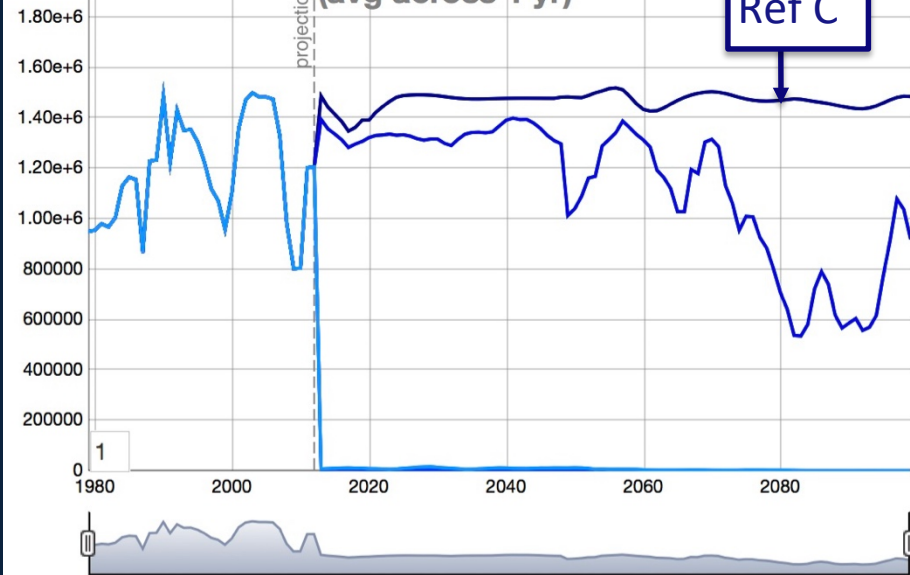
## Low CO<sub>2</sub> Scenario (RCP 4.5)

Multi-species model estimates for Walleye pollock catch  
(avg across 1 yr)



## High CO<sub>2</sub> Scenario (RCP 8.5)

Multi-species model estimates for Walleye pollock catch  
(avg across 1 yr)

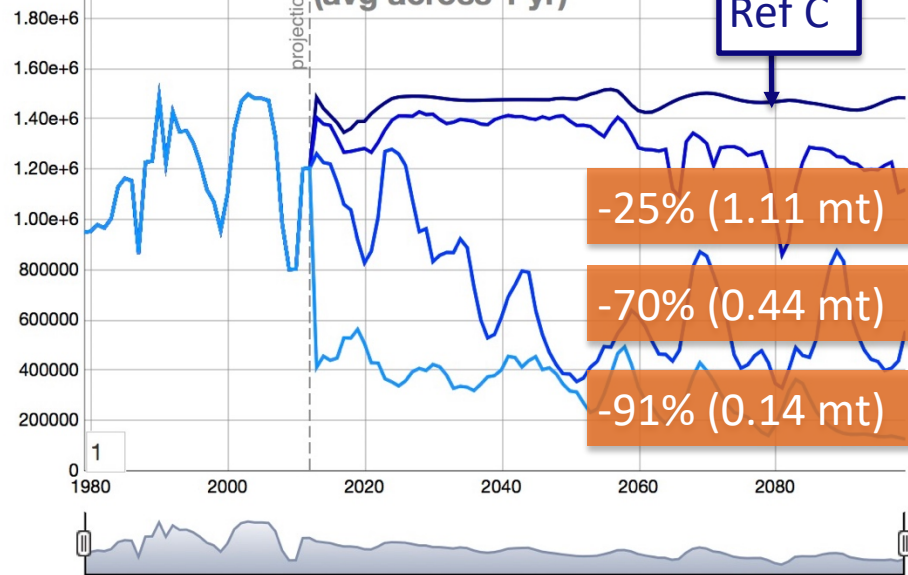


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# Projected catch (t)

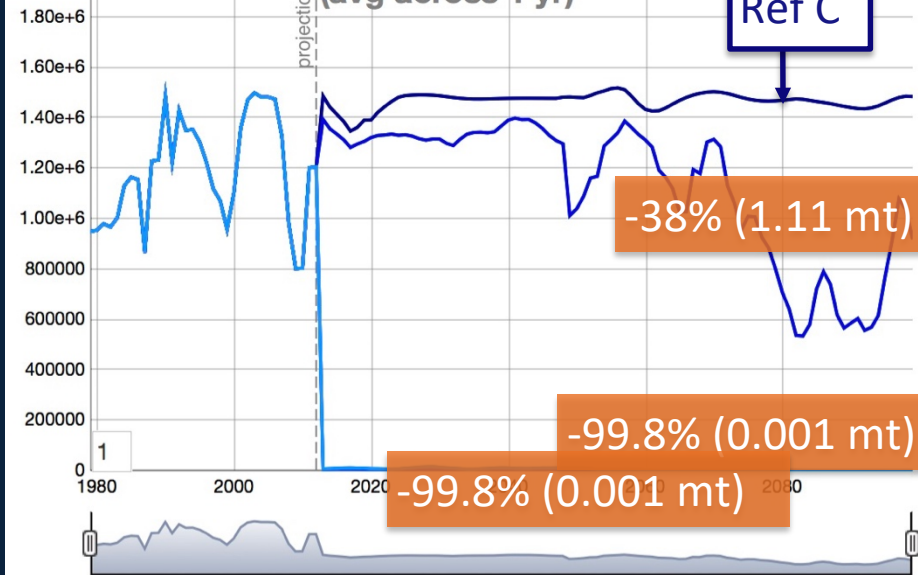
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Multi-species model estimates for Walleye pollock catch  
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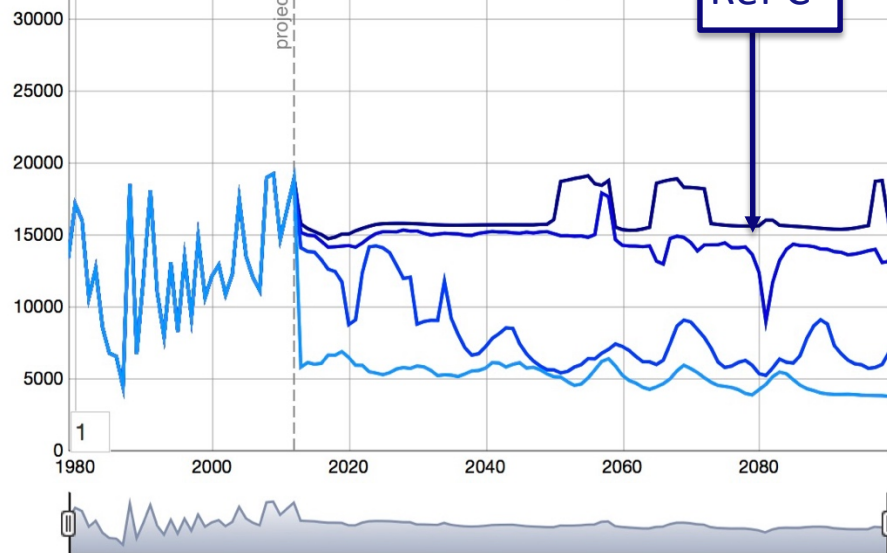


*Holsman et al. in prep; draft results, please do not cite or copy*

# Projected catch (t)

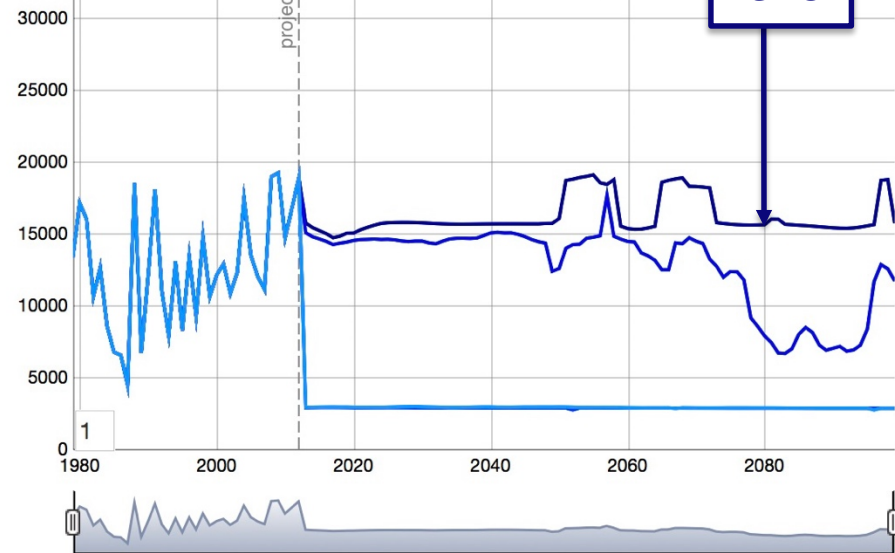
## Low CO<sub>2</sub> Scenario (RCP 4.5)

Multi-species model estimates for Arrowtooth flounder catch (avg across 1 yr)



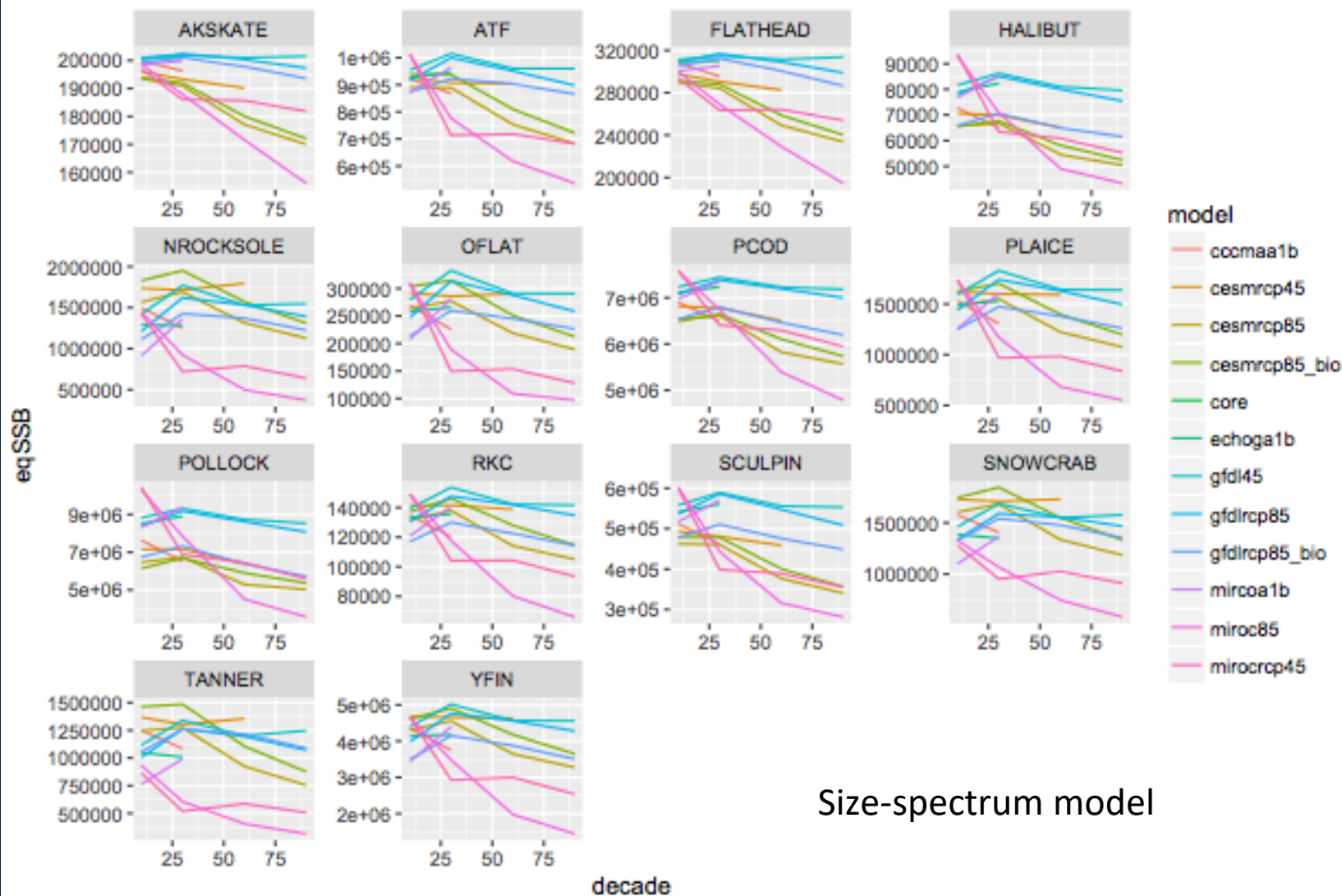
## High CO<sub>2</sub> Scenario (RCP 8.5)

Multi-species model estimates for Arrowtooth flounder catch (avg across 1 yr)



*Holsman et al. in prep; draft results, please do not cite or copy*





Size-spectrum model