Bering Sea climate-enhanced multi-species stock assessment

Nov., 2023

Kirstin K. Holsman Jim Ianelli, Kalei Shotwell, Steve Barbeaux, Kerim Aydin, Grant Adams, Kelly Kearney <u>https://apps-afsc.fisheries.noaa.gov/Plan_Team/2023/EBSmultispp.pdf</u>

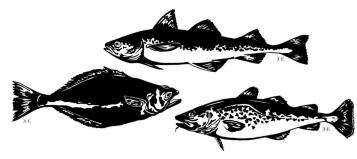


2023 Climate-enhanced multispecies stock assessment for walleye pollock, Pacific cod, and arrowtooth flounder in the eastern Bering Sea

Kirstin K. Holsman, Jim Ianelli, Kalei Shotwell, Steve Barbeaux, Kerim Aydin, Grant Adams, Kelly Kearney

Contents

23 BRP summary table
verview
troduction
ethods
imate informed reference points
esults
imate-informed outlook
scussion
knowledgments
eferences
gures & Tables



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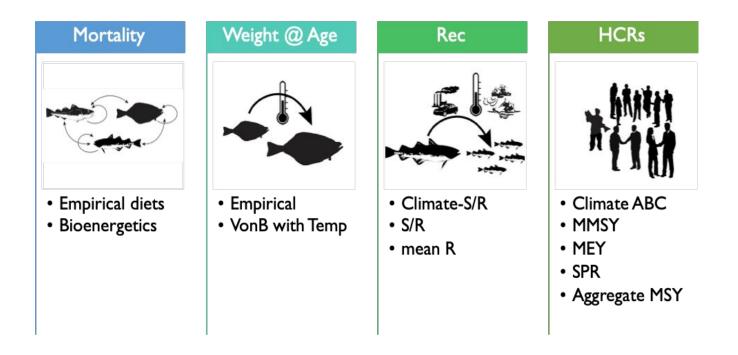
Two models presented each year:

- SSM : without trophic interactions (single-species mode)
- MSM : with trophic interactions (multi-species mode)

Produced annually 2016 - present



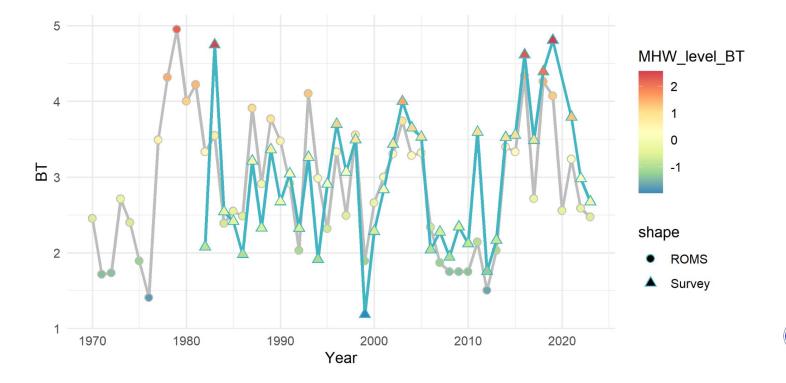
EBS CEATTLE





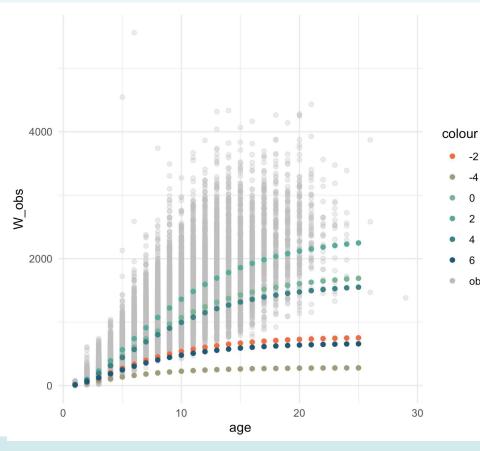
Holsman; CEATTLE

ROMS output https://data.pmel.noaa.gov/aclim/thredds/catalog/files.html





Weight at Age



- Hist: Empirical used when avail; missing yrs have vonBT (currently updating with new TMB version of vonBT())
- Projections: VonBT

-2 deg

-4 dea

0 deq

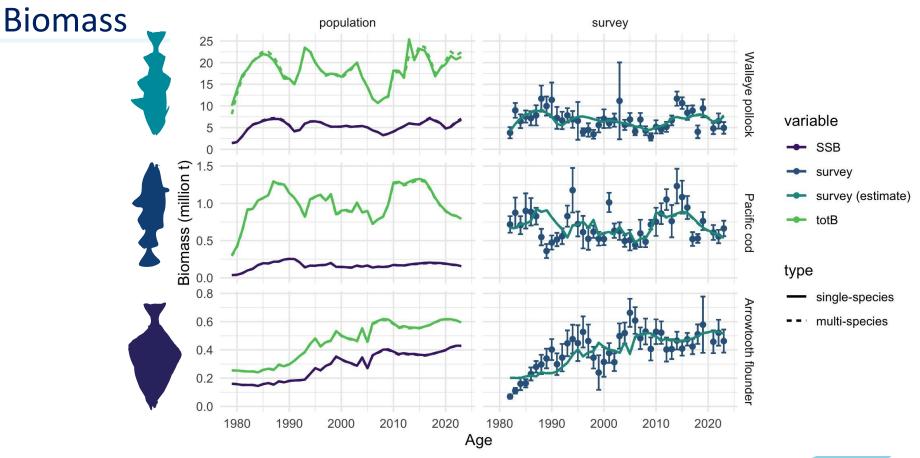
2 deg 4 deg

6 deg

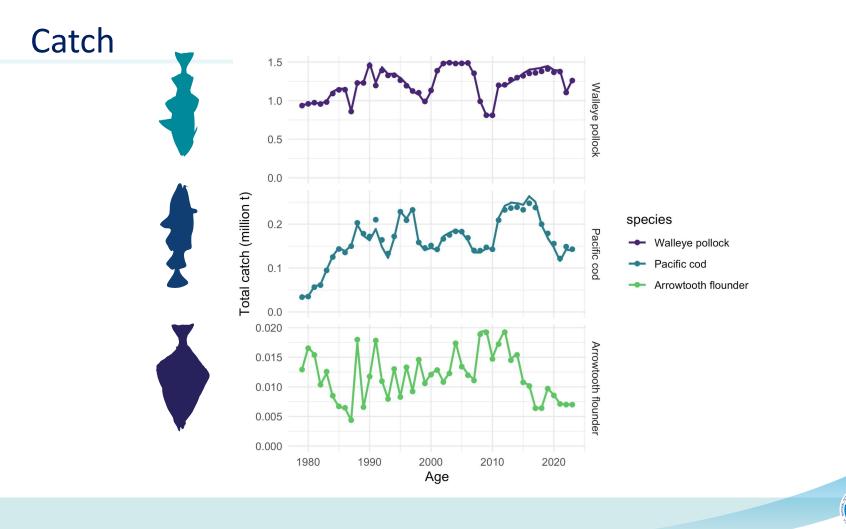
observed

Holsman & Aydin 2015



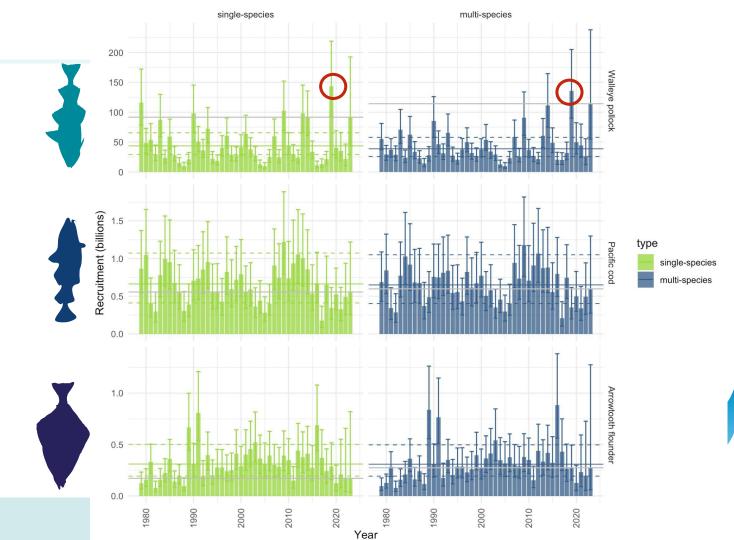


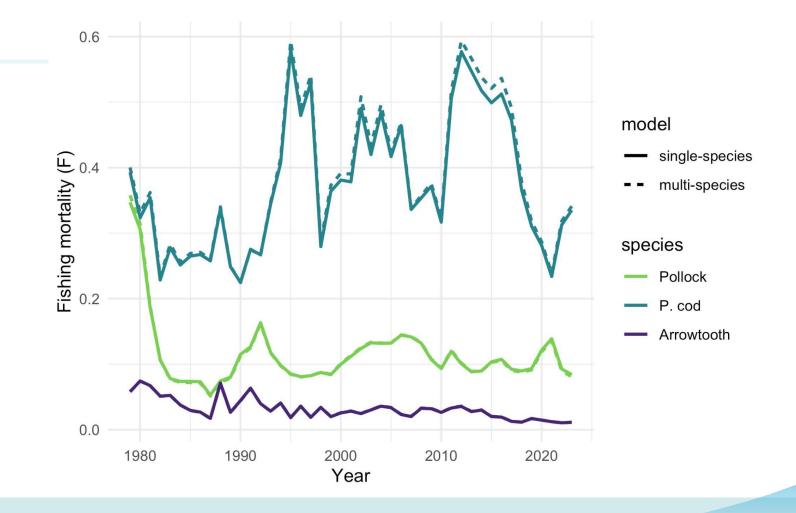






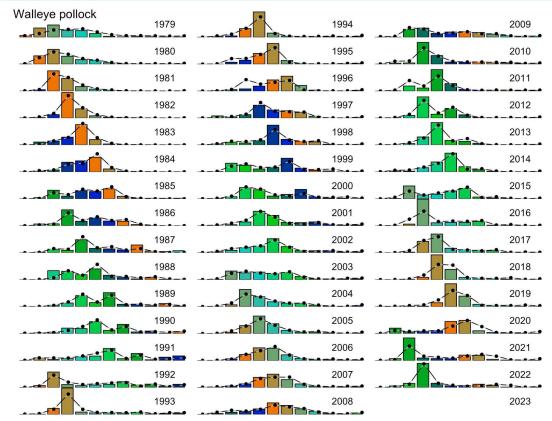
Recruitment







Fishery age comp.

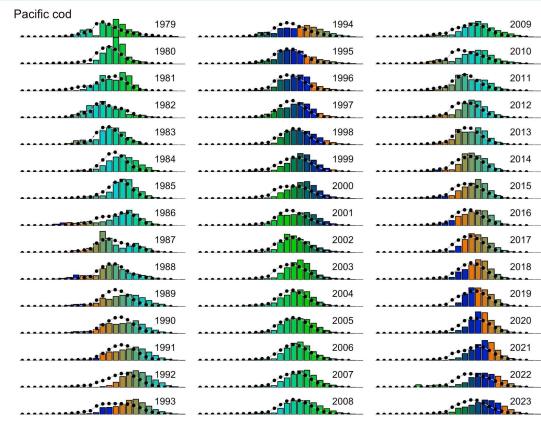




walleye pollock



Fishery length comp.

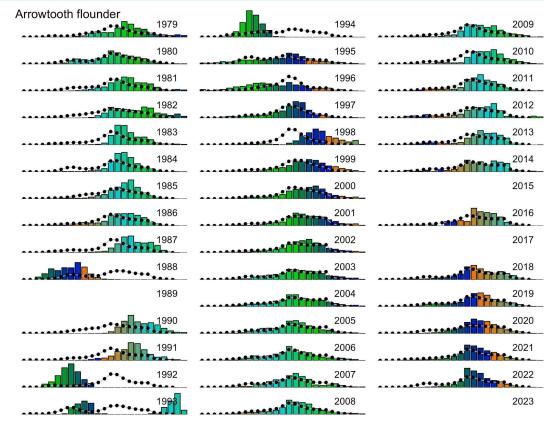




Pacific cod



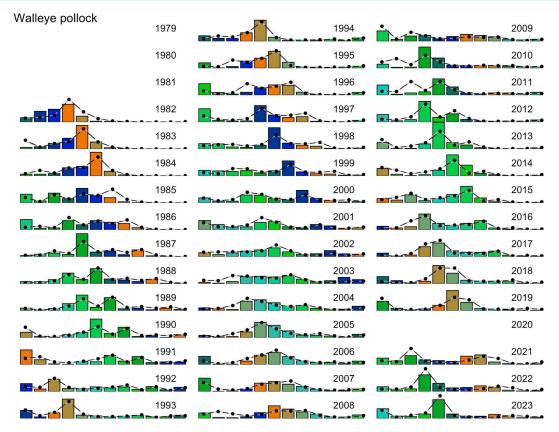
Fishery length comp.

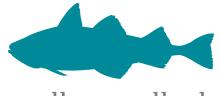






Survey age comp.





walleye pollock



Survey length comp.

Pacific cod	1979		1994		2009
	1980	····	1995		2010
	1981	• • • • • • • • • • • • • • • • • • •	1996		2011
	1982	<u>.</u>	1997		2012
	1983	·	1998		2013
	1984	<u>• • • • • • • • • • • • • • • • • • • </u>	1999		2014
	1985	<u>╸╒╒╻╴╸╸╸╕╕</u> ┑┪┪ <mark>╸</mark>	2000	<u></u>	2015
<u>• # # = •</u> • • • • • • • • • • • • • • • • •	1986		2001	<u>••••</u>	2016
	1987		2002	····	2017
	1988		2003	<u>···</u>	2018
<u>• • • • • • • • • • • • • • • • • • • </u>	1989	· Looker Citter	2004	·	2019
	1990	·▲₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽	2005		2020
***********************	1991	⋒ <mark>₽₽₽⋼∊∊⋼⋒⋽⋽⋳</mark> ∸≐≜⋵∊∊	2006	····	2021
	1992	* *********************	2007	·	2022
	1993		2008		2023



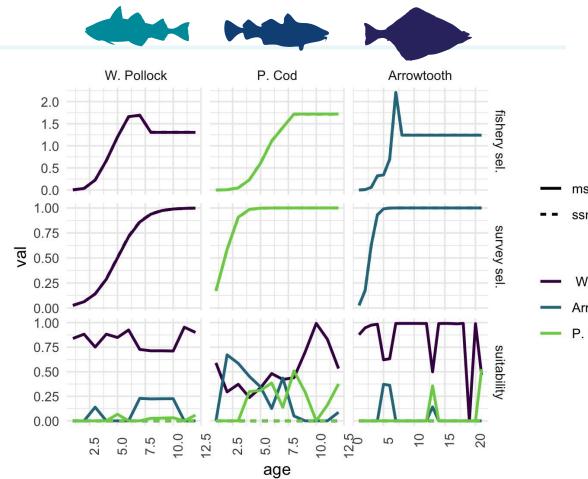
Pacific cod

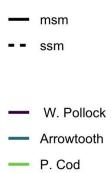


Survey length comp.

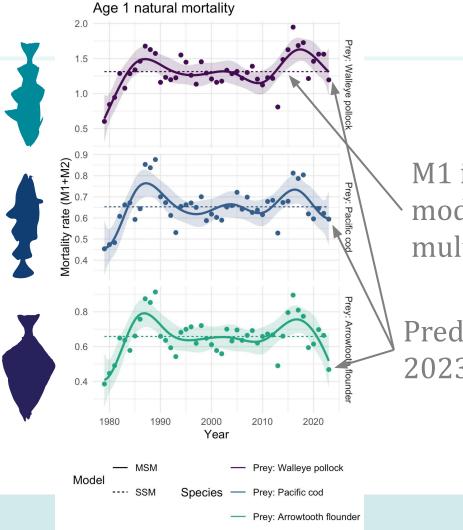








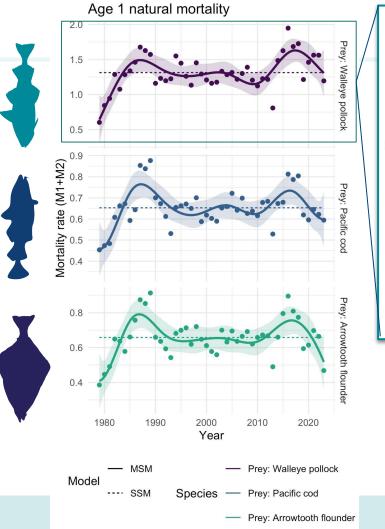


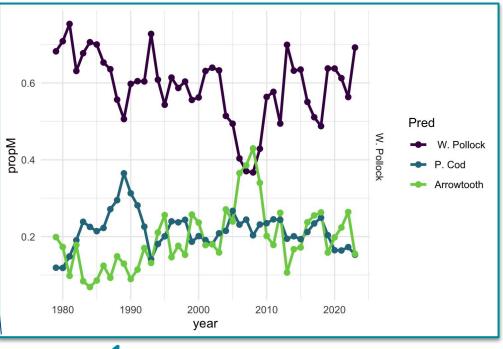


M1 in single species (CEATTLE) model = avg(M1+M2) from multispecies model

Predation mortality decreased in 2023



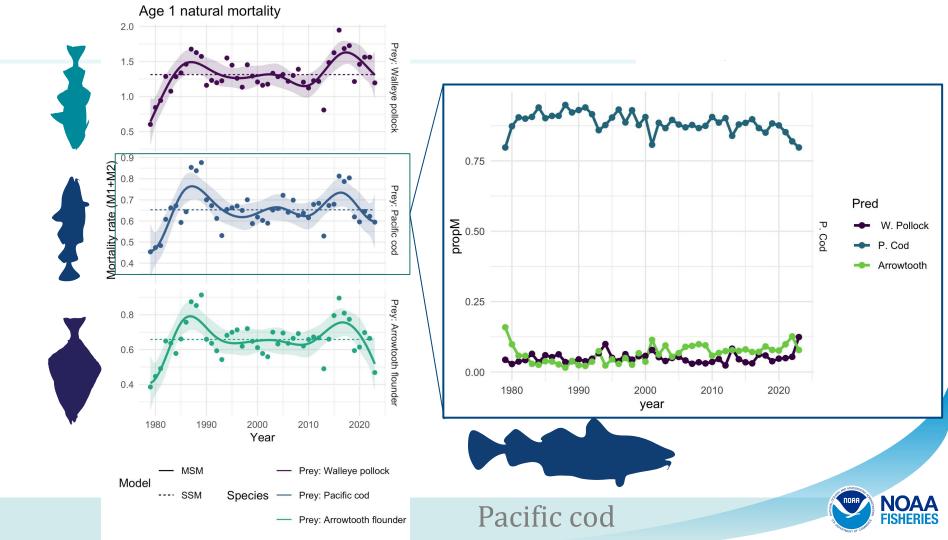


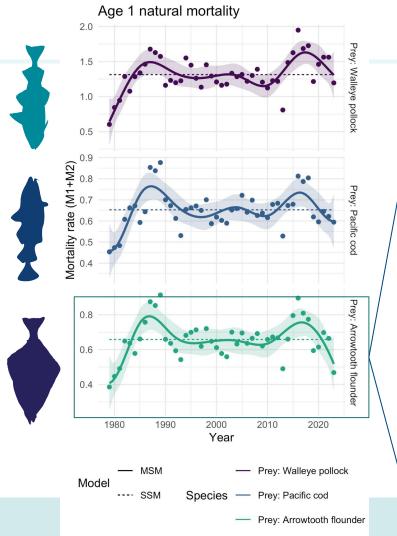


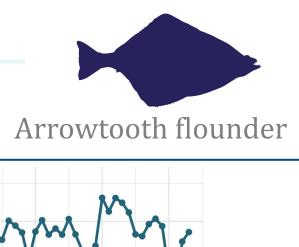


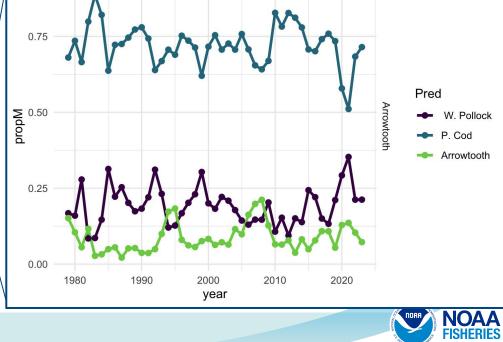
walleye pollock







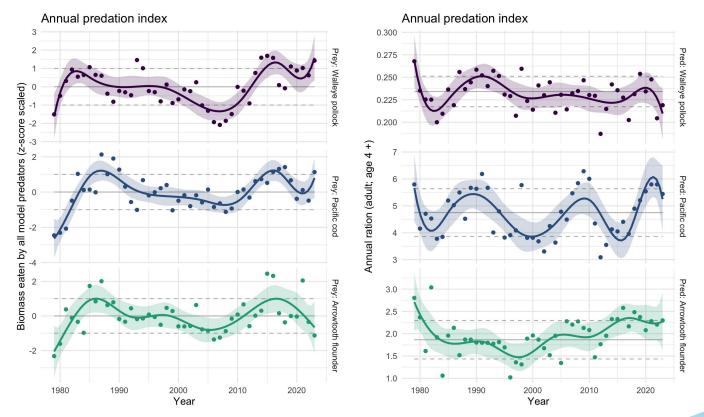




ESPs

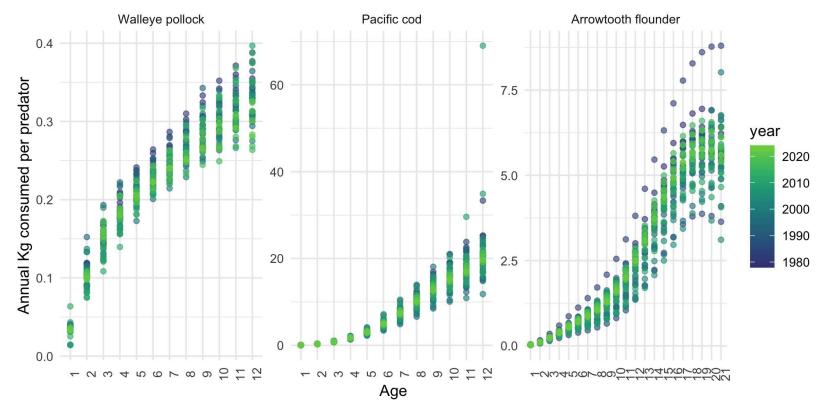
Use this if: need index of mortality for plk, pcod, or atf

Use this if: need index of plk, pcod, atf eating other prey





Annual estimates of prey consumed per fish



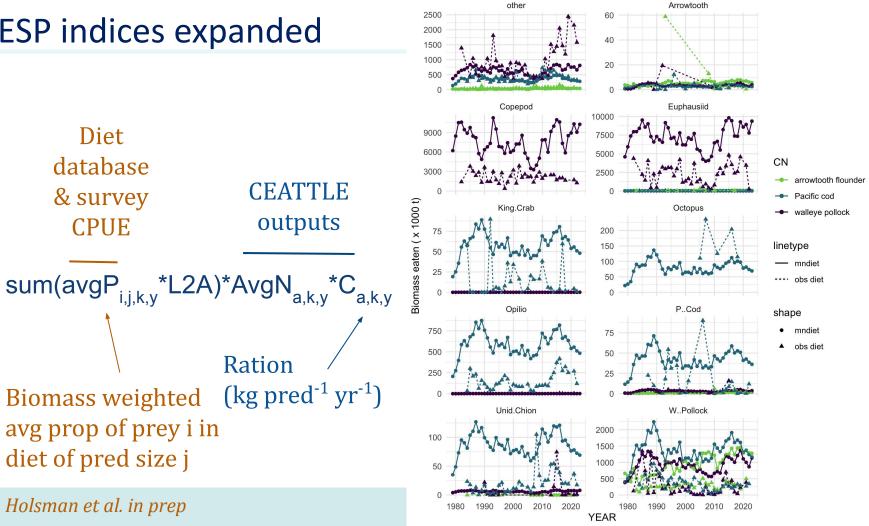




Data from food habits lab

NOAA FISHERIES

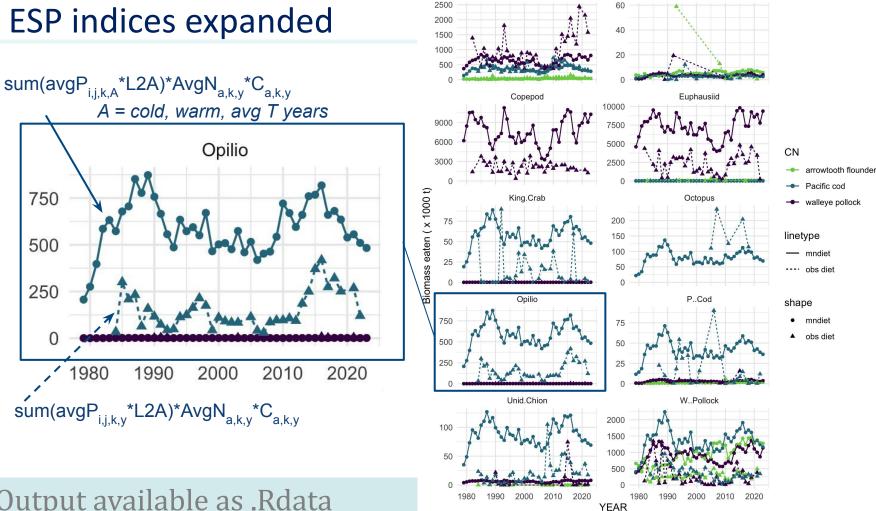
ESP indices expanded



DAA

HERIES

ESP indices expanded



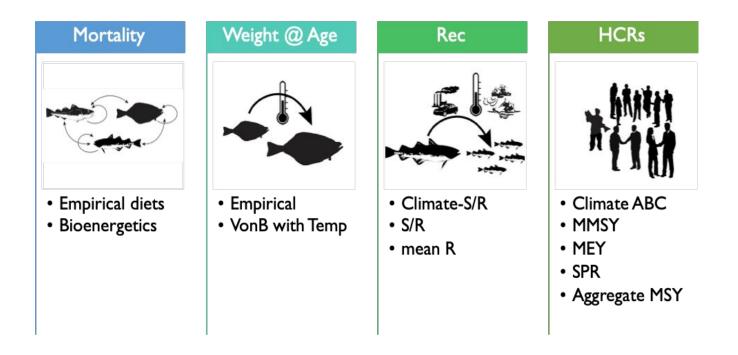
other

Arrowtooth

OAA HERIES

Output available as .Rdata

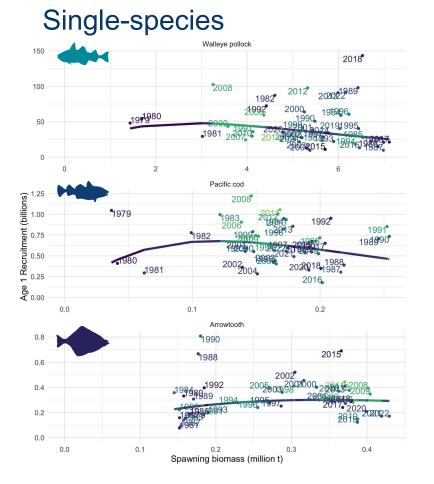
EBS CEATTLE





Holsman; CEATTLE

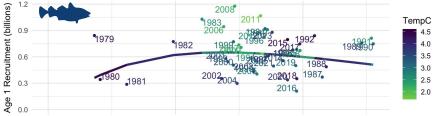
Recruitment (note: scales vary)

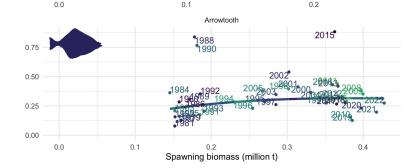


Multispecies



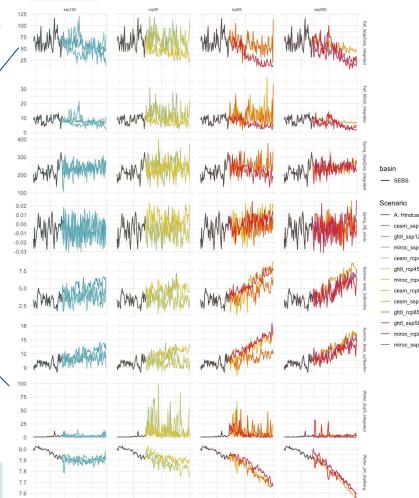






Recruitment covariates

CEATTLE Indices, delta corrected to the operational hindcast assessment covariates



Hindcas

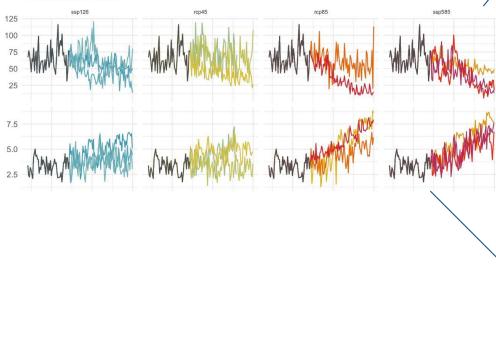
gfdl ssp1

miroc rer

cesm rcp8 cesm ssr

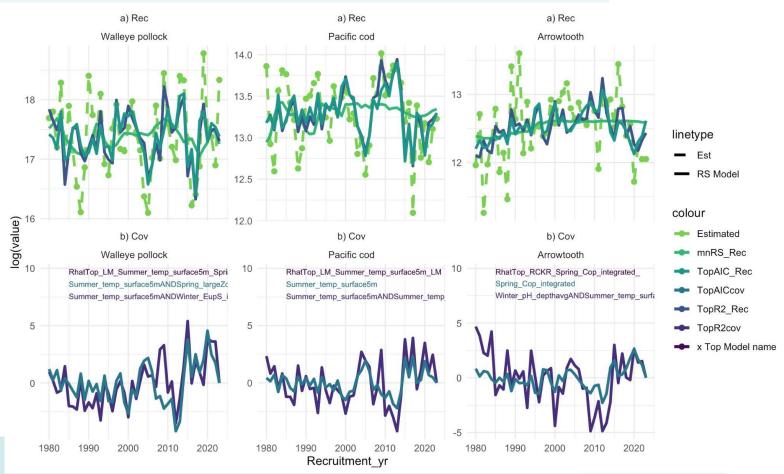
miroc rcpl

CEATTLE Indices, delta corrected to the operational hindcast assessment covariates



ACLIM indices

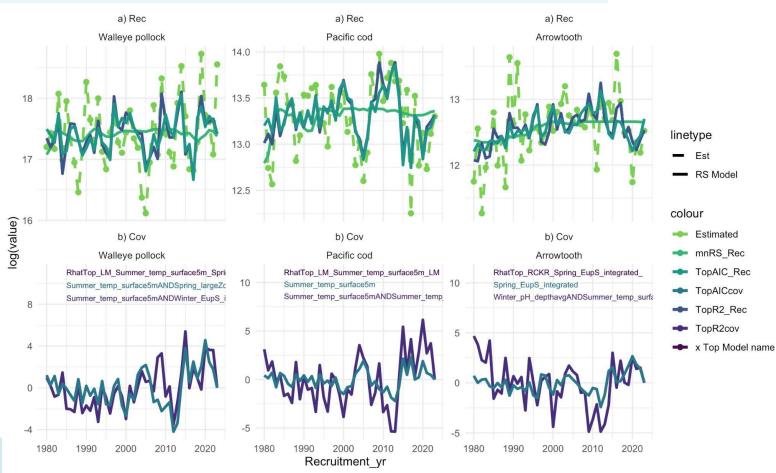
Single species model



NOAA

FISHERIES

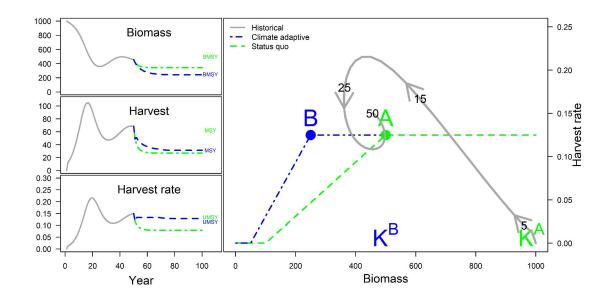
Multispecies model





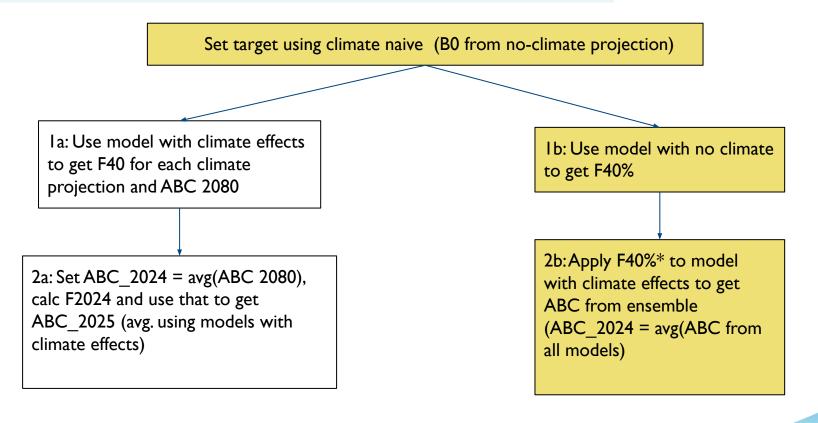
Adapting reference points to reflect changes in productivity

- MSA directs reference points to reflect current and probable future environmental conditions
- Changing reference points for stocks undergoing climate-related productivity shifts can result in counter-intuitive management actions:
 - Declining stocks fished harder
 - Flourishing stocks fished more conservatively



Szuwalski et al. 2023

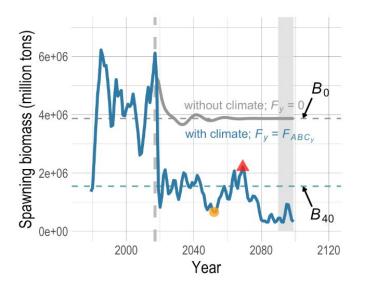
Climate informed BRPs





Climate informed biological reference points

A) Biological reference points



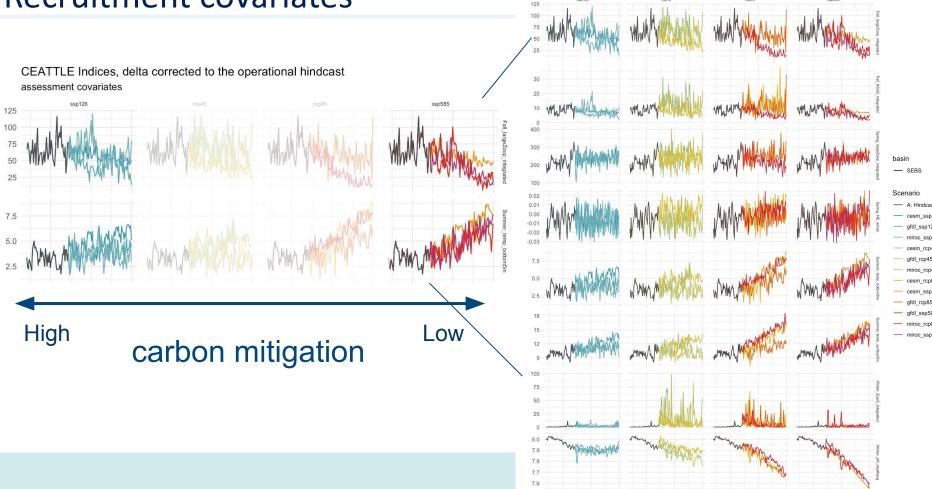
Holsman, K. K. et al. Climate-informed multispecies assessment model methods for determining biological references points and Acceptable Biological Catch. *Protoc. Exch.* https://doi.org/10.21203/rs.3.pex-1084/v1 (2020).



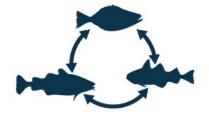
Recruitment covariates

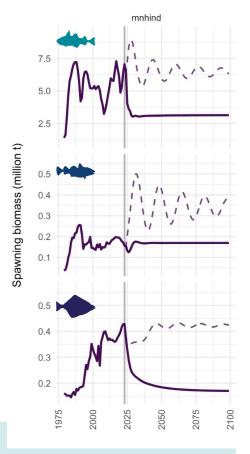
CEATTLE Indices, delta corrected to the operational hindcast assessment covariates

isn126



Biomass (multispecies)



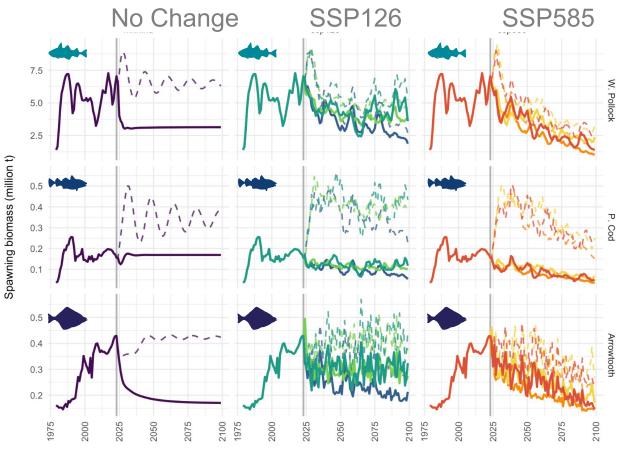


Project to 2099 such that F that results in $B_{2095-2099} \sim 0.4 B_{100\%}$ AND $B_y > 0.35 B_{100\%}$

Pollock & P. cod first, then arrowtooth

(Holsman et al. 2016)

Biomass (multispecies)



type_sim2 Assumes no climate — CI-cesm_ssp126 adaptation

- (in fish, fishery or
 - fisheries
 - management)

fished

unfished
 fished

- CN-mnhind

CI-gfdl_ssp126

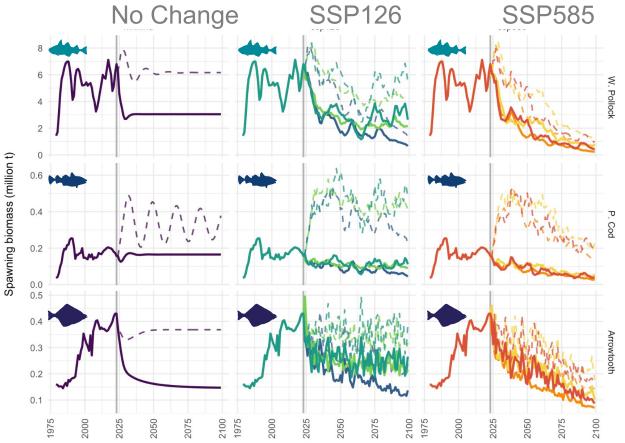
CI-gfdl_ssp585

CI-miroc_ssp585

CI-miroc ssp126



Biomass (Single species)



type_sim2 Assumes no climate

- CI-cesm_ssp126
- CI-cesm_ssp585
- CI-gfdl_ssp126
- CI-gfdl_ssp585
- CI-miroc_ssp126
- CI-miroc_ssp585
- CN-mnhind

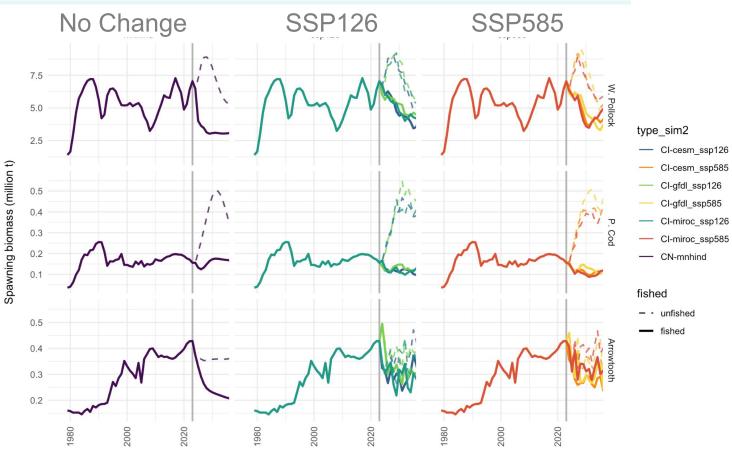
unfished

fished

fished

- adaptation (in fish, fishery or fisheries
- management)

Biomass





2023 Climate informed targets & reference points

	Walleye		Pacific	Arrowtooth		
Quantity	pollock		cod		flounder	
	SSM	MSM	SSM	MSM	SSM	MSM
2023 M (age 1)	1.313	1.195	0.653	0.594	0.658	0.468
2023 Average $3+M$	0.306	0.306	0.38	0.38	0.227	0.227
Projected (age 3+) B_{2024} (t)	$15,\!860,\!694$	$16,\!265,\!727$	$679,\!301$	686,562	566, 160	569,909
SSB_{2023} (t)	6,790,160	7,044,480	$157,\!340$	155, 597	429,700	428,256
% change in SSB (t) from 2022	10.3	10.3	-9.2	-9.0	0.1	0.2
Projected SSB_{2024} (t)	6,239,390	6,475,040	156,408	$155,\!652$	374,227	373,806
Projected SSB_{2025} (t)	5,828,060	$5,\!819,\!550$	$128,\!478$	123,214	351,317	348,509
*Projected $SSB_{0,2100}$ (t)	6,164,698	6,504,694	322,907	372,244	368,306	426,212
*Projected $SSB_{target,2100}$ (t)	3,044,850	3,136,376	164,934	169,131	147,286	170,536
**Target 2100 B/B_0	0.494	0.482	0.511	0.454	0.4	0.4
$F_{target,2100}$	0.345	0.547	0.443	0.481	0.08	0.086
$F_{ABC,2024}$	0.134	0.192	0.498	0.566	0.033	0.042
ABC_{2024}	2,054,020	2,965,510	188,498	205,756	17,411	21,741
ABC_{2025}	$1,\!853,\!370$	2,521,900	156,934	$165,\!274$	16,533	20,573



Climate informed BRPs and ABC evaluations

Climate-informed outlook

Probability of near-term (+ 1-2 yr) biomass decline or increase

- Relative to 2023 levels, the model projects SSB of pollock will decline in 2024 (projected based on 2023 catch) followed by a decline in SSB in 2025 (projected with F_{ABC}). For Pacific cod the model projects a decline (slightly) in SSB in both 2024 and 2025.
- Ensemble projections using climate-enhanced recruitment models and projected future warming scenarios (including high (ssp126), moderate(RCP45), and low (ssp585) carbon mitigation scenarios, as well as a persistence scenario and assuming 2023 catch for 2024 and F_{ABC} for 2025) estimate a °5% probability that pollock SSB will remain between 89-93% of 2023 SSB in 2024 and will be bet \Rightarrow en 81-84% of 2023 SSB levels in 2025.
- Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that Pacific cod SSB will continue to decline to between 96-102% of 2023 SSB in 2024 and between 78-82% of 2023 SSB levels in 2025.
- Ensemble projections using climate-enhanced recruitment models based on long-term projections stimate a 95% chance that arrowtooth SSB will be between 84 and 98% of 2023 SSB in 2024 and will be between 76 and 86% of 2023 SSB levels in 2025.



Climate informed BRPs and ABC evaluations

Climate-informed outlook

Probability of near-term (+ 1-2 yr) biomass decline or increase

- Relative to 2023 levels, the model projects SSB of pollock will decline in 2024 (projected based on 2023 catch) followed by a decline in SSB in 2025 (projected with F_{ABC}). For Pacific cod the model projects a decline (slightly) in SSB in both 2024 and 2025.
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Multispecies assessment

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Contents

2023 BRP summary table	
Overview	
Introduction	
Methods	
Climate informed reference points	
Results	
Climate-informed outlook	
Discussion	
Acknowledgments	
References	
Figures & Tables	2



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Climate-informed outlook

Probability of near-term (+ 1-2 yr) biomass decline or increase

 Relative to 2023 levels, the model projects SSB of pollock will decline in 2024 (projected based on 2023 catch) followed by a decline in SSB in 2025 (projected with F_{ABC}). For Pacific cod the model projects

Use climate informed model to characterize risk in +1 & +2 years

2024 and between 78-82% of 2023 SSB levels in 2025.

Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that arrowtooth SSB will be between 84 and 98% of 2023 SSB in 2024 and will be between 76 and 86% of 2023 SSB levels in 2025.

Low warming scenarios (SSP126): probability of long-term $\left(2033,\,2050,\,2080\right)$ biomass decline or increase

 Trends in biomass and recruitment under high carbon mitigation (low warming; SSP126) scenarios are very similar to near-present day. Note that projections assume no adaptation by the species, fishery, or

Use climate informed model to characterize risk in 10 + years with low warming

Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that arrowtooth SSB will be between 62-74% of 2023 SSB in 2033, between 63-68% of 2023 SSB levels in 2050, and between 59-66% of 2023 SSB levels in 2080.

High warming scenarios (SSP585): probability of long-term (2033, 2050, 2080) biomass decline or increase

• Trends in biomass and recruitment under low carbon mitigation (high warming; SSP585) scenarios

Use climate informed model to characterize risk in 10 + years with high warming

and 69% of 2023 SSB levels in 2050, and between 37 and 42% of 2023 SSB levels in 2080.

Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that arrowtooth SSB will be between 64 and 74% of 2023 SSB in 2033, between 58 and 61% of 2023 SSB levels in 2050, and between 40 and 43% of 2023 SSB is in 2080.



https://apps-afsc.fisheries.noaa.gov/Plan_Team/2022/EBSmultispp.pdf

Climate informed BRPs and ABC evaluations

Low warming scenarios (SSP126): probability of long-term (2033, 2050, 2080) biomass decline or increase

- Trends in biomass and recruitment under high carbon mitigation (low warming; SSP126) scenarios are very similar to near-present day. *Note that projections assume no adaptation by the species, fishery, or fishery management.* See figures 22 and 23 for more information.
- Ensemble projections using climate-enhanced recruitment models and projected future warming scenarios and assuming F_{ABC} for 2025 2100) estimate a 95% chance that pollock SSB will be between 59-63% of 2023 SSB in 2033, between 57-61% of 2023 SSB levels in 2050, and between 48-55% of 2023 SSB levels in 2080.
- Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that Pacific cod SSB will be between 71-79% of 2023 SSB in 2033, between 73-79% of 2023 SSB levels in 2050, and between 62-69% of 2023 SSB levels in 2080.
- Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that arrowtooth SSB will be between 62-74% of 2023 SSB in 2033, between 63-68% of 2023 SSB levels in 2050, and between 59-66% of 2023 SSB levels in 2080.



Cooler future

Climate informed BRPs and ABC evaluations

High warming scenarios (SSP585): probability of long-term (2033, 2050, 2080) biomass decline or increase

- Trends in biomass and recruitment under low carbon mitigation (high warming; SSP585) scenarios are markedly different than historical or present day productivity. Note that projections assume no adaptation by the species, fishery, or fishery management.
- Ensemble projections using climate-enhanced recruitment models and projected future warming scenarios and assuming F_{ABC} for 2025 2100) estimate a 95% chance that pollock SSB will be between 57 and 64% of 2023 SSB in 2033, between 50 and 55% of 2023 SSB levels in 2050, and between 29 and 34% of 2023 SSB levels in 2080.
- Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that Pacific cod SSB will be between 65 and 75% of 2023 SSB in 2033, between 64 and 69% of 2023 SSB levels in 2050, and between 37 and 42% of 2023 SSB levels in 2080.
- Ensemble projections using climate-enhanced recruitment models based on long-term projections estimate a 95% chance that arrowtooth SSB will be between 64 and 74% of 2023 SSB in 2033, between 58 and 61% of 2023 SSB levels in 2050, and between 40 and 43% of 2023 SSB levels in 2080.



Warmer future



- I. Revist likelihood weighting
- 2. Update weight at age (Holsman et al. in prep)
- 3. Add in pred/prey overlap (Goodman et al. in prep)
- 4. Transition to TMB via merging CEATTLE and Rceattle
- 5. NSF conditioned ABC (2024)
- 6. Include ACLIM MSE results and CI features
- 7. Share output via AKFIN



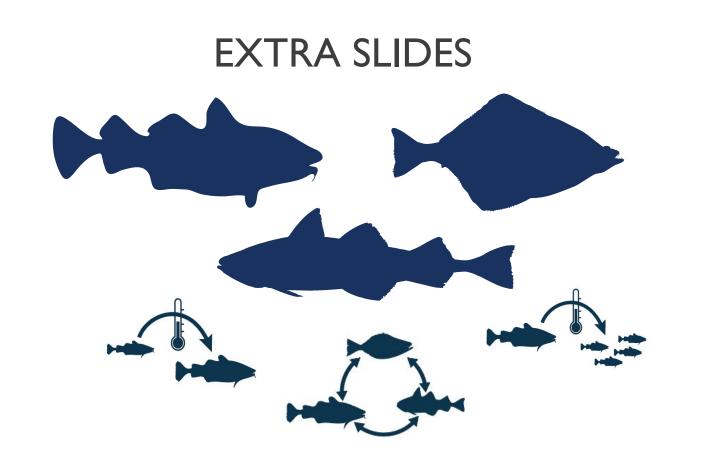
CEATTLE workflow features



- R and shell scripts used to run the model through projections:
 - Regular output includes ESR contribution (R markdown)
 - ESP indices (produced annually)
 - Assessment written in Rmarkdown using Rdata outputs <u>https://apps-afsc.fisheries.noaa.gov/Plan_Team/2023/EBSmultispp.pdf</u>
- Github repositories (* private)
 - *CEATTLE (ADMB): <u>https://github.com/kholsman/CEATTLE</u>
 - *futR() : recruitment fitting model in TMB: <u>https://github.com/kholsman/futR</u>
 - * vonBT(): temp. varying vonB model in TMB: <u>https://github.com/kholsman/vonBT</u>
 - Rceattle (G. Adams; R/TMB):

https://github.com/grantdadams/Rceattle







Incorporating predation interactions in a statistical catch-at-age model for a predator-prey system in the eastern Bering Sea

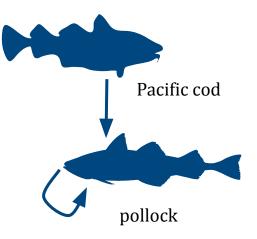
1865

Jesús Jurado-Molina, Patricia A. Livingston, and James N. Ianelli

Abstract: Virtual population analysis and the statistical catch-at-age methods are common stock assessment models used for management advice. The difference between them is the statistical assumptions allowing the fitting of parameters by considering how errors enter into the models and the data sources for the estimation. Fishery managers are being asked to consider multispecies interactions in their decisions. One option to achieve this goal is the multispecies virtual population analysis (MSVPA); however, its lack of statistical assumptions does not allow the use of tools used in single-species stock assessment. We chose to use a two-species system, walleye pollock (*Theragra chalcogramma*) and Pacific cod (*Gadus macrocephalus*), to incorporate the predation equations from MSVPA into an age-structured multispecies statistical model (MSM). Results suggest that both models produced similar estimates of suitability coefficients and predation mortalities. The adult population estimates from the single-species stock assessment and MSM were also comparable. MSM provides a measure of parameter uncertainty, which is not available with the MSVPA technologies. MSM is an important advancement in providing advice to fisheries managers because it incorporates the standard tools such as Bayesian methods and decision analysis into a multispecies context, helping to establish useful scenarios for management in the Bering Sea.

$\mathsf{MSVPA} \to \mathsf{Statistical} \ \mathsf{MSM}$

Jurado-Molina et al. 2005 doi: 10.1139/F05-110







A comparison of fisheries biological reference points estimated from temperature-specific multi-species and single-species climate-enhanced stock assessment models

Kirstin K. Holsman^{a,*}, James Ianelli^a, Kerim Aydin^a, André E. Punt^b, Elizabeth A. Moffitt^{b,1}

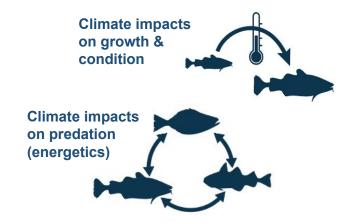
^a Alaska Fisheries Science Center, National Marine Fisheries Service, NOAA, 7600 Sand Point Way N.E., Building 4, Seattle, Washington 98115, USA
^b University of Washington School of Aquatic and Fisheries Sciences, 1122 NE Boat St., Seattle, WA 98105, USA

"CEATTLE"

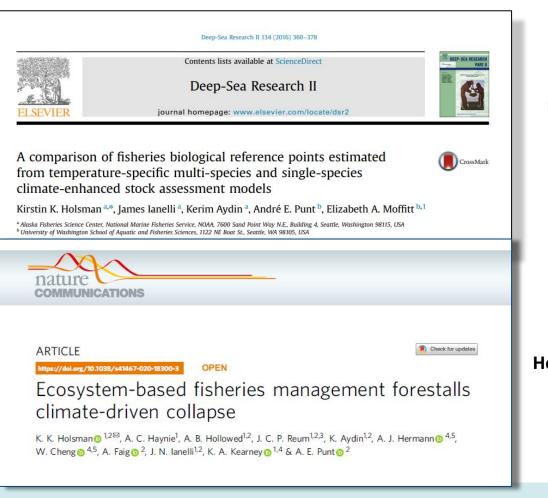
<u>Climate Enhanced Age-structured</u> model with <u>Temperature-specific</u> <u>Trophic Linkages and Energetics</u>

Holsman et al. 2016

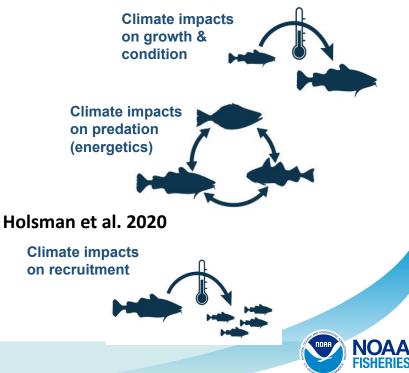
CrossMark







Holsman et al. 2016



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Rceattle

https://github.com/grantdadams/Rceattle

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

An ensemble approach to understand predation mortality for groundfish in the Gulf of Alaska

Grant D. Adams^{a,*}, Kirstin K. Holsman^{a,b}, Steven J. Barbeaux^b, Martin W. Dorn^b, James N. Ianelli^b, Ingrid Spies^b, Ian J. Stewart^c, André E. Punt^a

^a School of Aquatic and Fishery Sciences, University of Washington, Seattle, WA, USA ^b Resource Ecology and Fisheries Management Division, Alaska Fisheries Science Center, Seattle, WA, USA ^c International Pacific Halibut Commission, Seattle, WA, USA

ARTICLE INFO

ABSTRACT

Handled by: Mark Nicholas Maunder

Keywords: Stock assessment Ecosystem-based fisheries management Natural mortality Multi-species State-space Climate change

There is increasing consensus of the need for ecosystem-based fisheries management (EBFM), which accounts for trophic interactions and environmental conditions when managing exploited marine resources. Continued development and testing of analytical tools that are expected to address EBFM needs are essential for guiding the management of fisheries resources in achieving and balancing multiple social, economic, and conservation objectives. To address these needs, we present and compare alternative climate-informed multi-species statistical catch-at-age models to account for spatio-temporal differences in stock distributions, with application to four groundfish species (walleve pollock Gadus chalcogrammus, Pacific cod Gadus macrocephalus, arrowtooth flounder Atheresthes stomias, and Pacific halibut Hippoglossus stenolepis) in the Gulf of Alaska, USA. We integrate across 1 11 . 11



Grant Adams

grantdadams

Unfollow

I am a PhD student at the University of Washington School of Aquatic and **Fisheries Science**.

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CEATTLE Applications

Operational advice:

- o Appendix to BSAI pollock assessment (2016 to now)
- o M2 index for EBS ecosystem status report (2016 to now)
- o M2 index for ESP (2020 to now)

ACLIM/Bering Sea:

- o 2010-2015 BSIERP MSE
- o 2016- now ACLIM climate MSE
- o 2019- 2023 Lenfest NFS
- o Lenfest ocean wealth

Bering Seasons

o Forecasts under 9mo

GOA

- o G. Adams (UW) : 3 and 4 species model for GOA (Adams et al, in review)
- o G. Adams (UW) : M2 index for GOA Ecosystem Status Report (2021-now)
- o Climate MSE underway for GOA

Hake (S. Wassermann)



Holsman, K. K. et al. Climate-informed multispecies assessment model methods for determining biological references points and Acceptable Biological Catch. *Protoc. Exch.* https://doi.org/10.21203/rs.3.pex-1084/v1 (2020).



Model Summary

CEATTLE (Holsman et al. 2016)

- NEBS+EBS
- Age or Length based
- Multi- or single-species
- ADMB
- Climate (energetics) effects on
 - Growth
 - Mortality (if in MSM)
 - Recruitment
- Used to derive climate-inform. ABC
- Pollock, Pcod, ATF
- Operational 2016 now (annually)
- Climate naive targets; climate informed reference points

Rceattle (Adams et al. 2022)

- GOA
- Age or Length based
- Multi- or single-species
- TMB
- Random effects
- Data weighting
- Climate (energetics) effects on
 - Growth*
 - Mortality (if in MSM)
 - Recruitment
- Used in EBS, GOA, and Cali Current (hake)
- Pollock, Pcod, ATF, Halibut, and Hake



Discussion : Climate informed BRPs

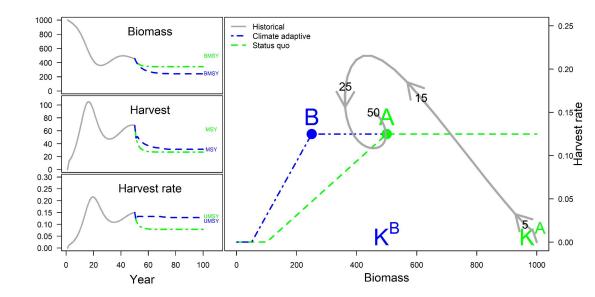
Set B0 and B40 target using climate informed models

NO!



Adapting reference points to reflect changes in productivity

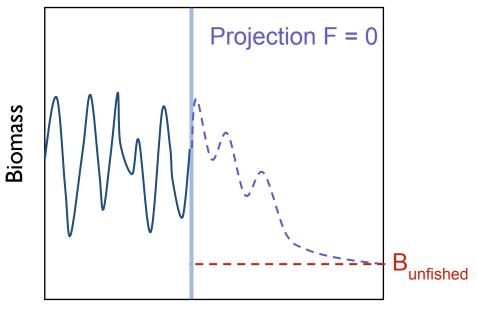
- MSA directs reference points to reflect current and probable future environmental conditions
- Changing reference points for stocks undergoing climate-related productivity shifts can result in counter-intuitive management actions:
 - Declining stocks could be fished harder
 - Flourishing stocks could be fished more conservatively



Szuwalski et al. 2023

First: Set Target / reference points

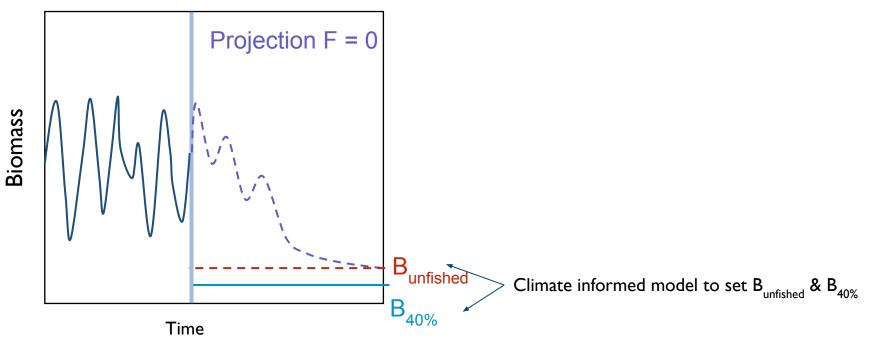
Climate informed B0 / Dynamic B0



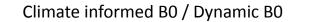
Time

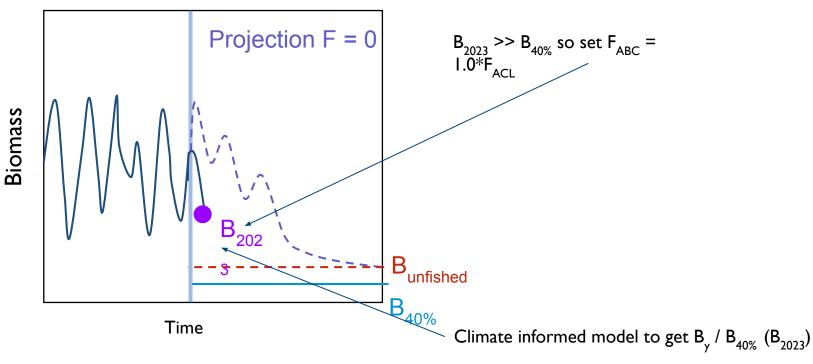
First: Set Target / reference points





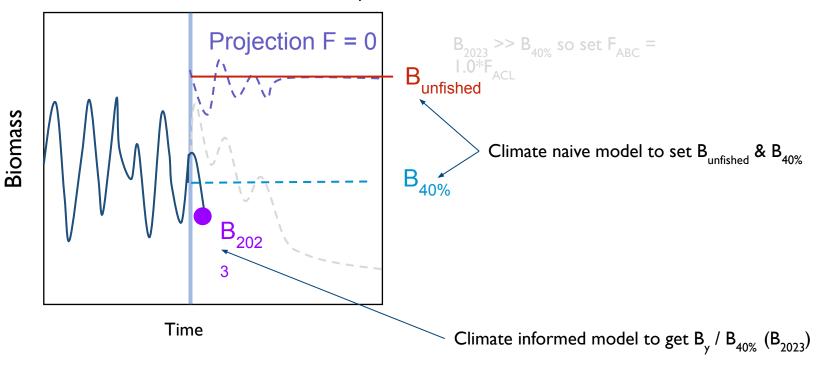
First: Set Target / reference points





"hybrid" climate- naive & climate informed approach

Climate naive B0 + climate informed By



"hybrid" climate- naive & climate informed approach

