

Using MSMt to evaluate climate and trophic impacts on recommended harvest rates of groundfish in the Bering Sea

Kirstin Holsman
kirstin.holsman@noaa.gov
UW JISAO / NOAA AFSC

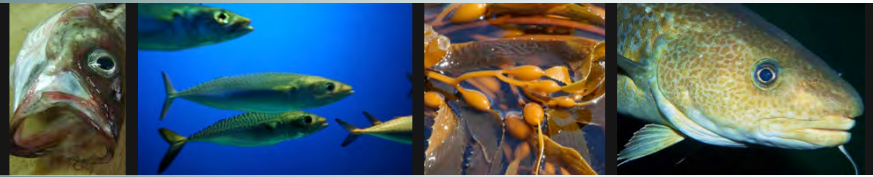
Collaborators:

Anne Hollowed
Kerim Aydin
André Punt
Ingrid Spies
Al Hermann

Jim Ianelli
Ivonne Ortiz
Paul Spencer
Nick Bond
Georgina Gibbson



EBS & Climate



Introduction

MSMt: Methods

MSMt: Estimation

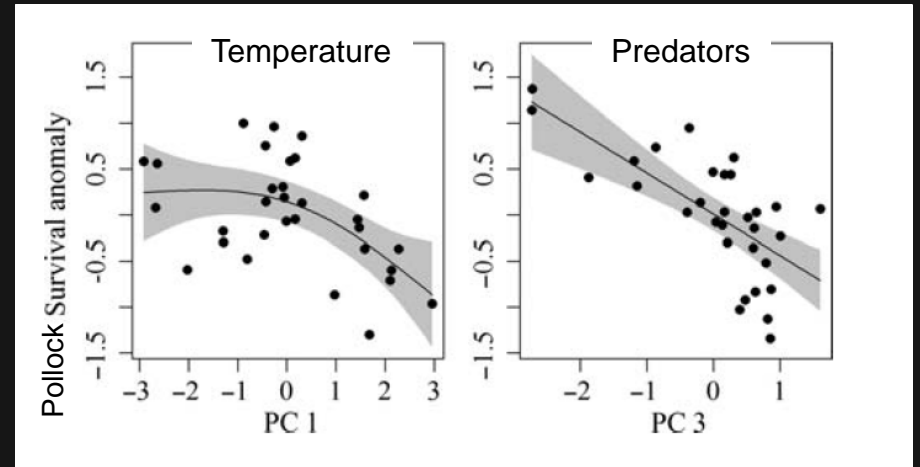
MSMt: BRPs

MSMt: R/S

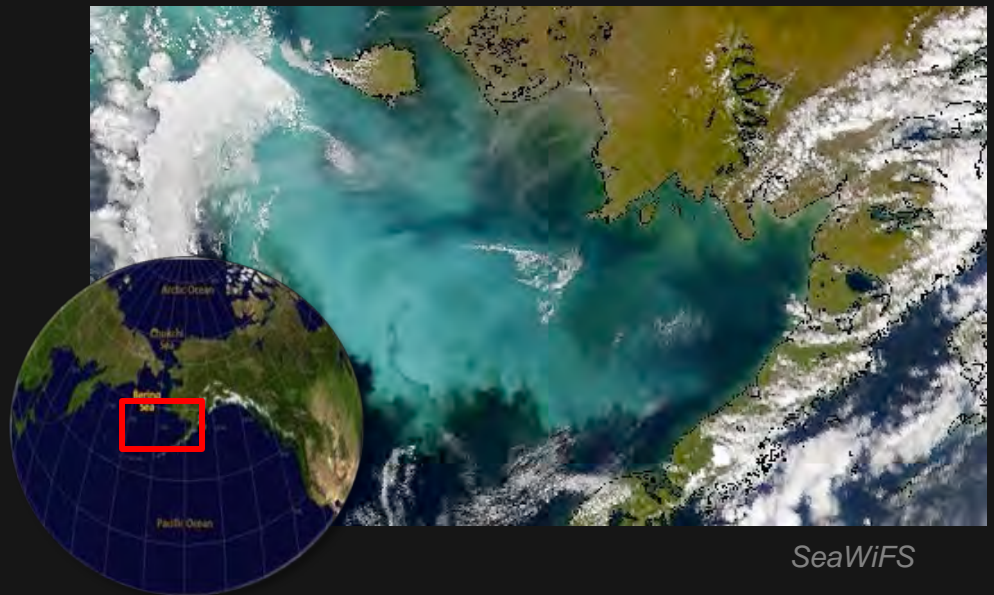
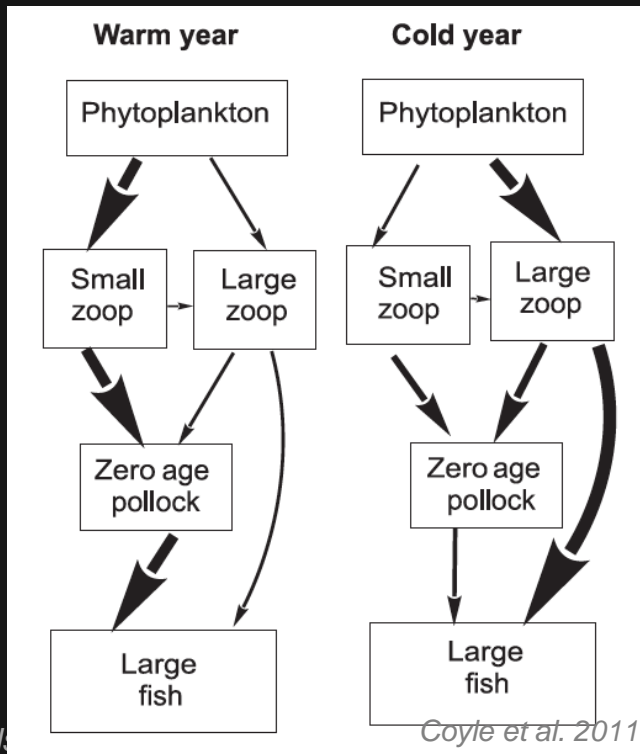
MSMt: Projections

Recruitment & survival decline with increasing Temp
(Mueter et al. 2011, Coyle et al. 2011)

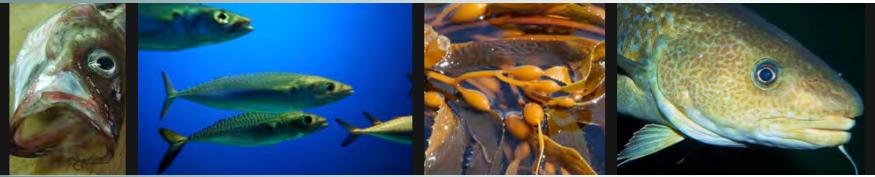
Predation is stronger in warm years (Coyle et al. 2011)



Mueter et al. 2011



EBS & Climate



Introduction

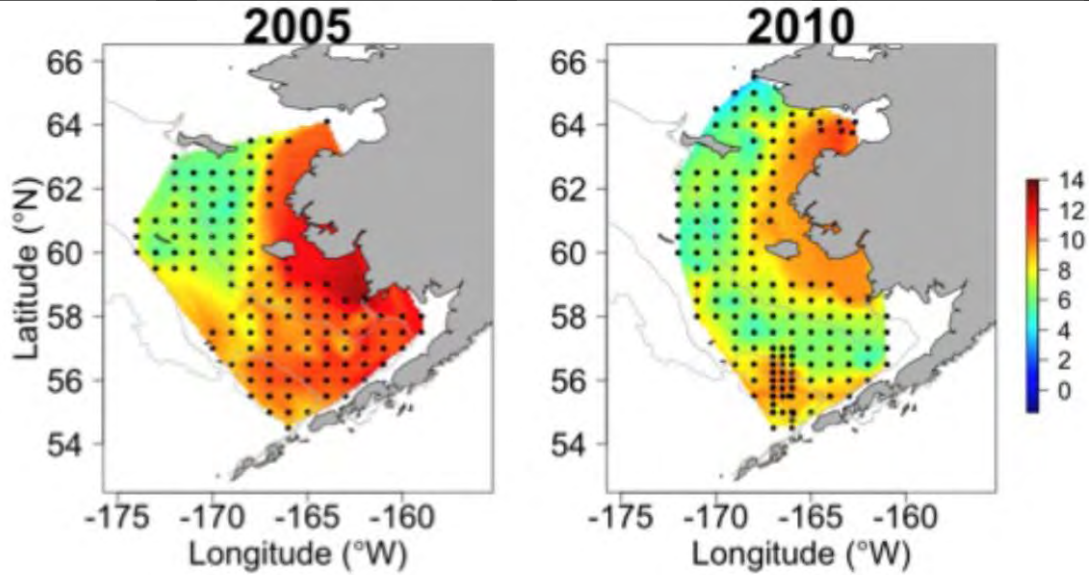
MSMt: Methods

MSMt: Estimation

MSMt: BRPs

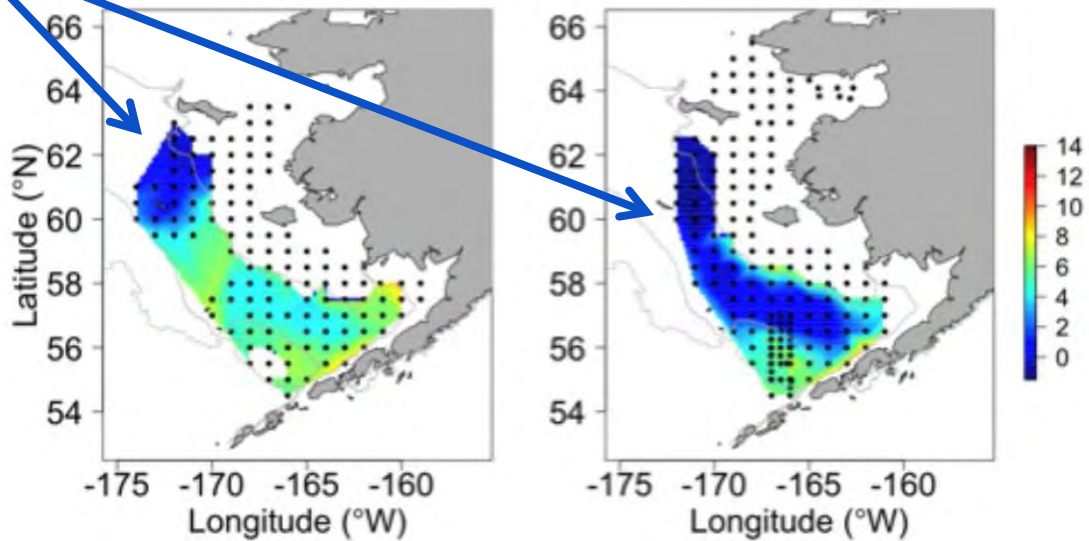
MSMt: R/S

MSMt: Projections



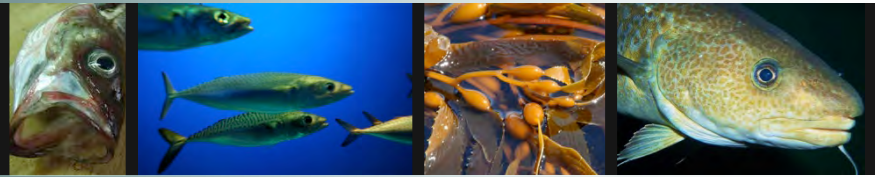
SST

“Cold Pool”



Bottom T

EBS & Climate



Introduction

MSMt: Methods

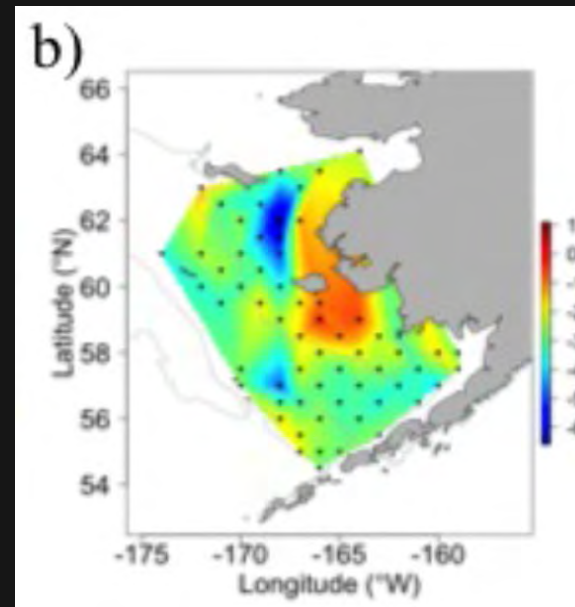
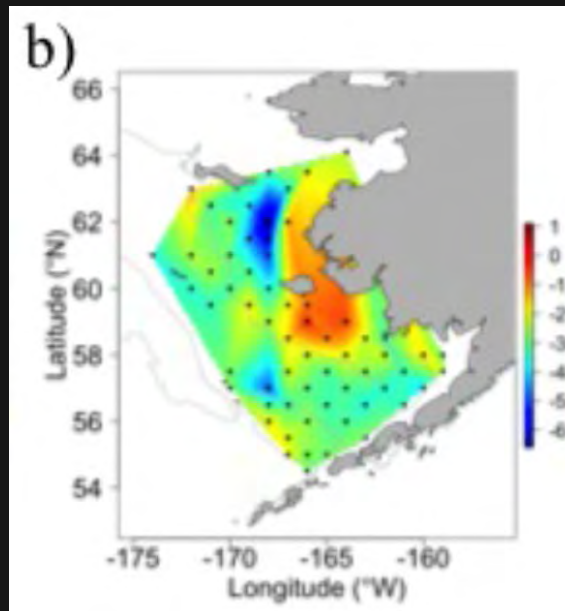
MSMt: Estimation

MSMt: BRPs

MSMt: R/S

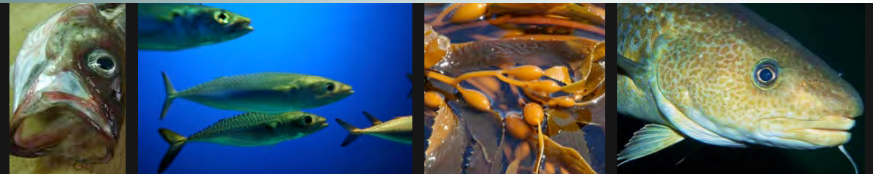
MSMt: Projections

Log Zooplankton Biomass (g WW) WARM (2005) COOL (2010)



Siddon et al. (2013). *Spatial match-mismatch between juvenile fish and prey explains recruitment variability across contrasting climate conditions in the eastern Bering Sea.* PLoS ONE.

EBS & Climate Change



Introduction

MSMt: Methods

MSMt: Estimation

MSMt: BRPs

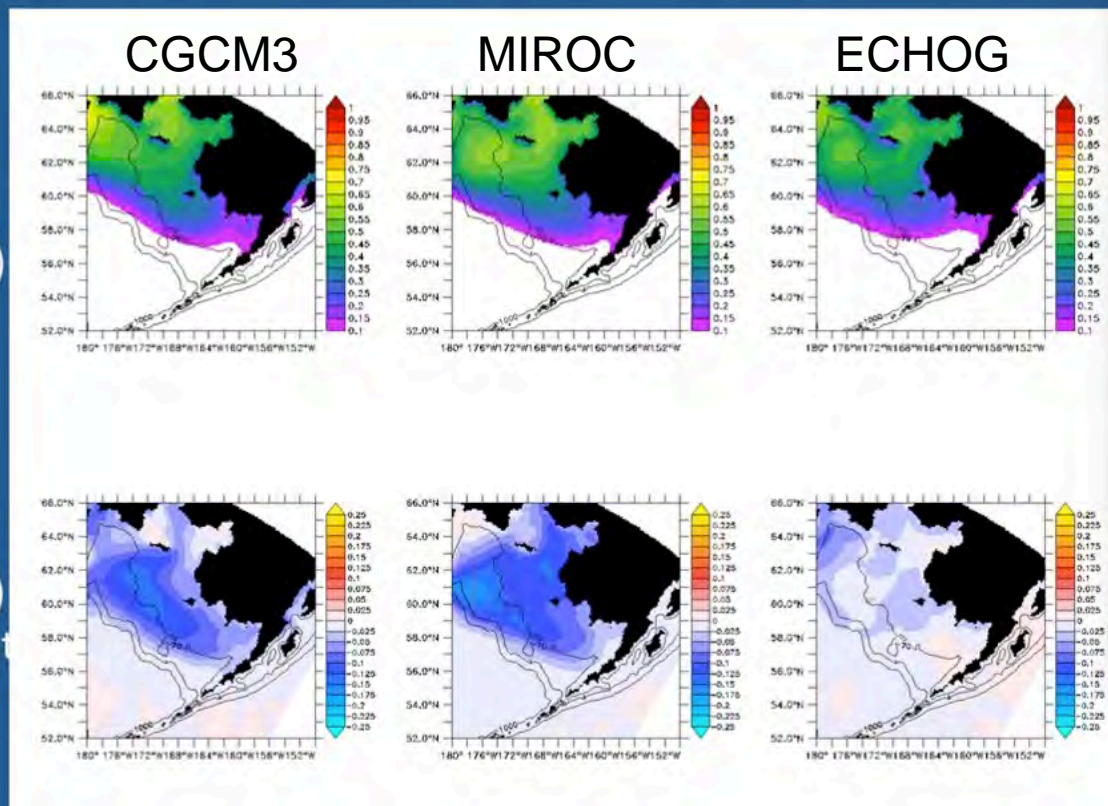
MSMt: R/S

MSMt: Projections

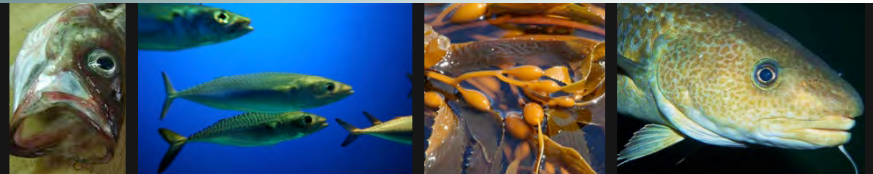
Ice coverage (fraction)

“Present”
(2003-2012)

“Future”
(2031-2040)
w.r.t. present



EBS & Climate Change



Introduction

MSMt: Methods

MSMt: Estimation

MSMt: BRPs

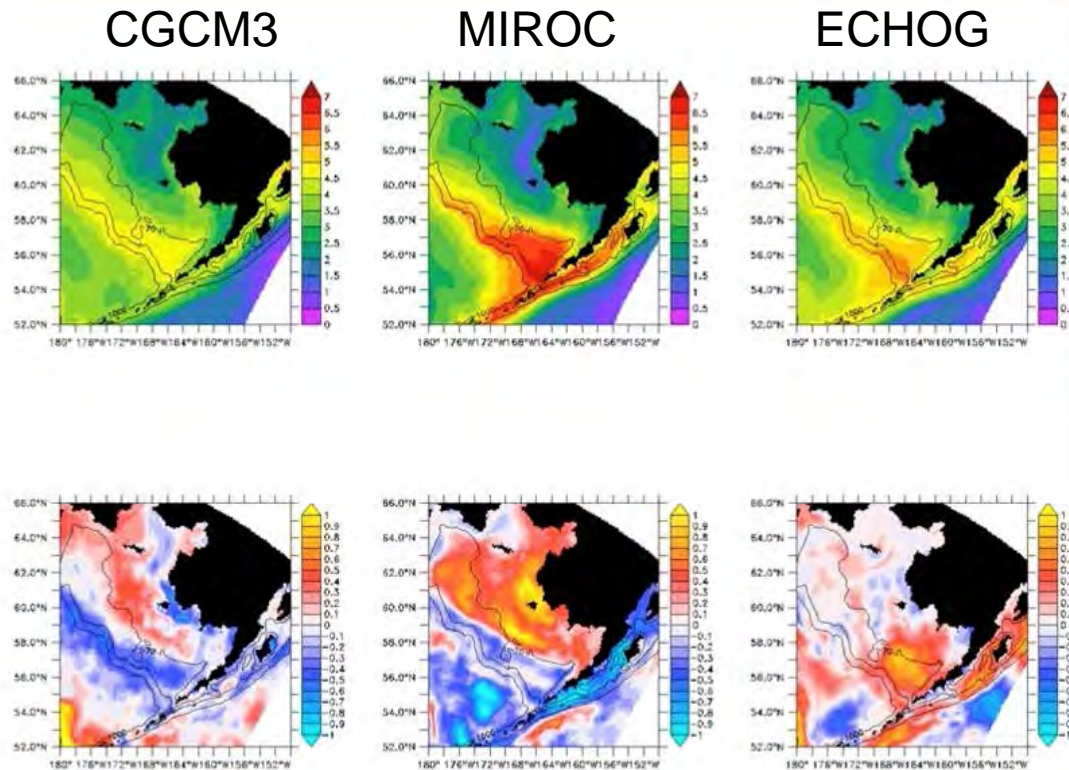
MSMt: R/S

MSMt: Projections

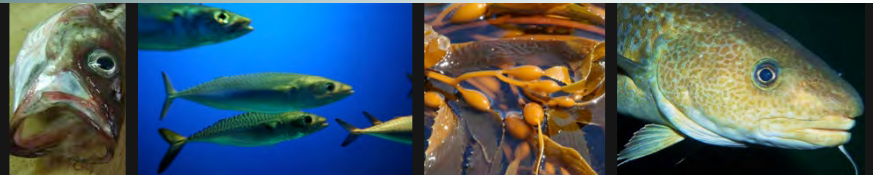
Large Crustacean Zooplankton (mgC m^{-3})

“Present”
(2003-2012)

“Future”
(2031-2040)
w.r.t. present



EBS & Climate Change



Introduction

MSMt: Methods

MSMt: Estimation

MSMt: BRPs

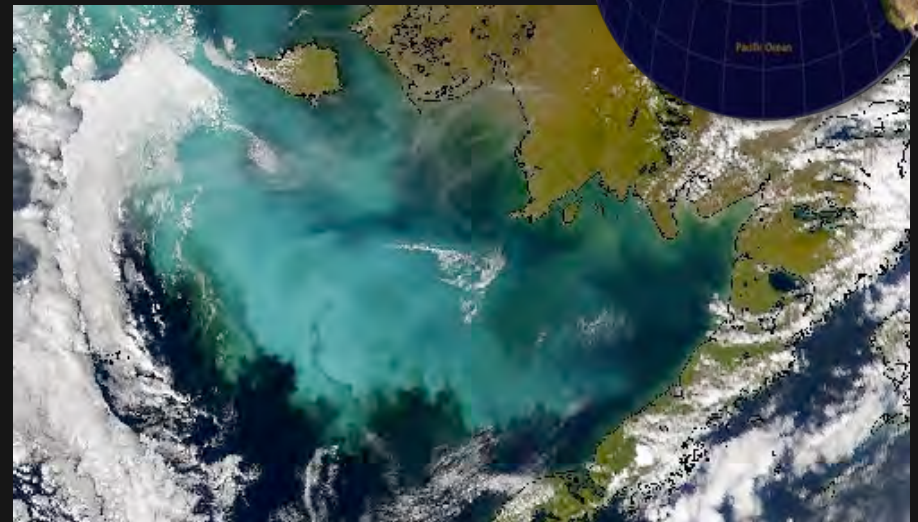
MSMt: R/S

MSMt: Projections

What is the range of effects of climate change on biomass, production, & recommended harvest rates?

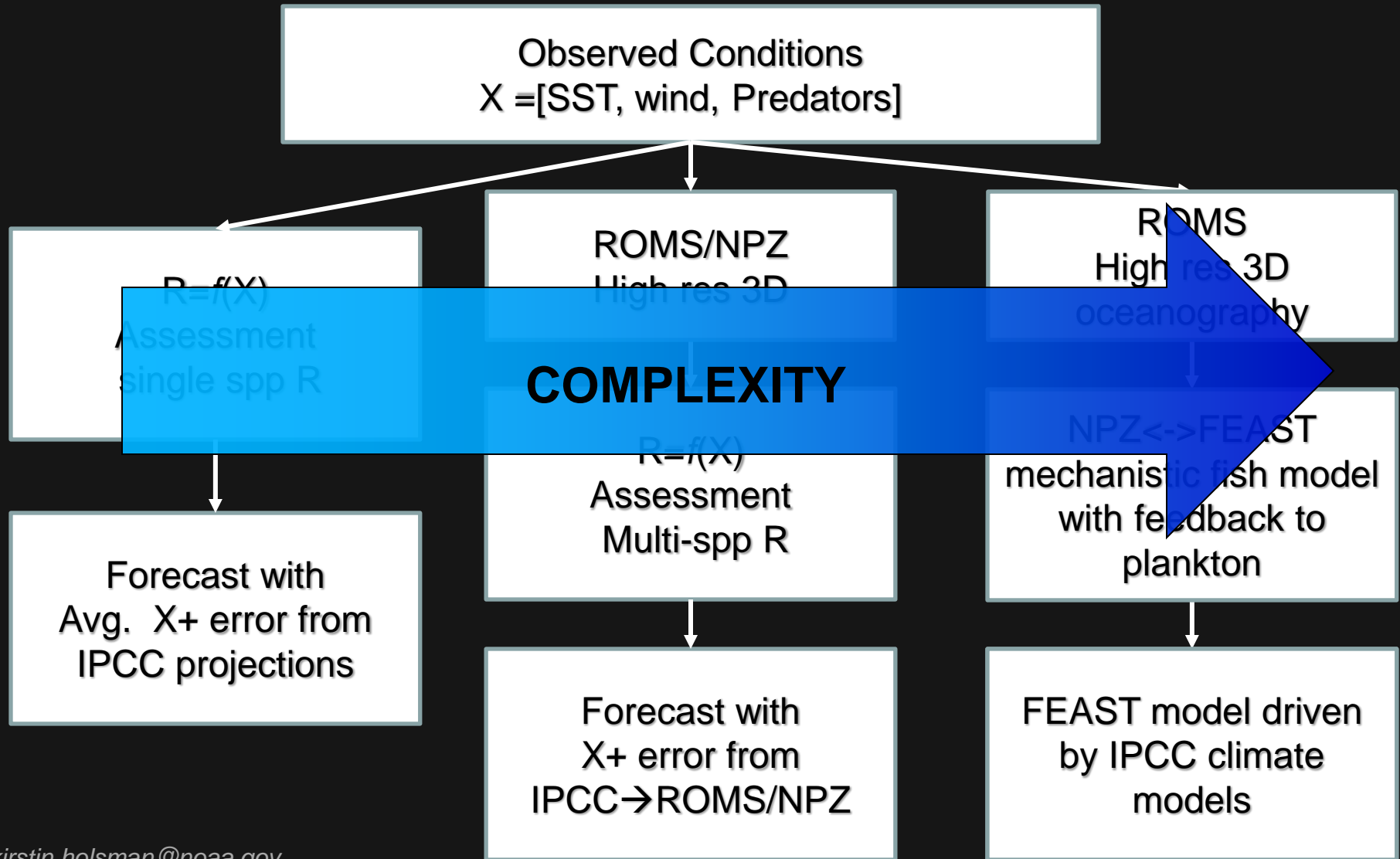
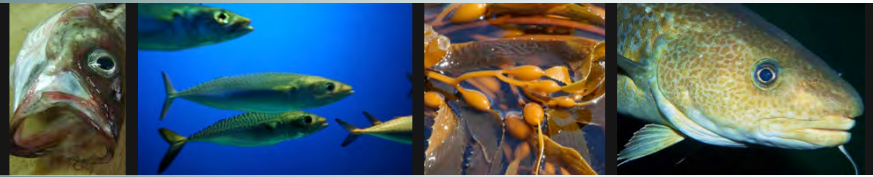


Are current assessment models robust to climate driven changes? (if not, why not)?

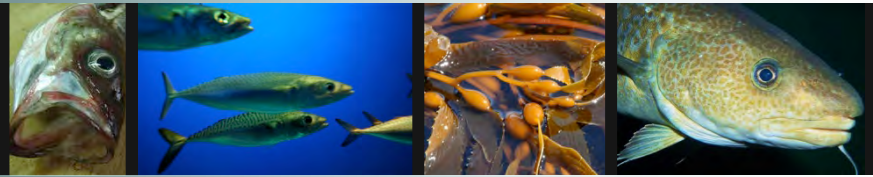


SeaWiFS

CC Analysis



CC Analysis



Observed Conditions
 $X = [\text{SST, wind, Predators}]$

$R=f(X)$
Assessment
single spp R

Forecast with
Avg. $X+$ error from
IPCC projections

ROMS/NPZ
High res 3D

$R=f(X)$
Assessment
Multi-spp R

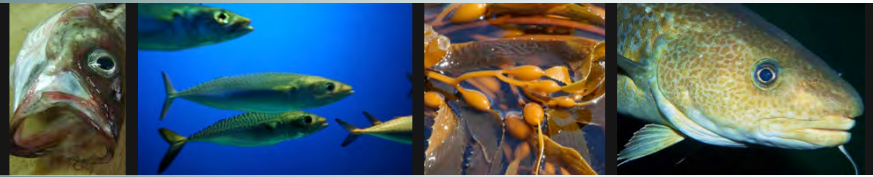
Forecast with
 $X+$ error from
IPCC \rightarrow ROMS/NPZ

ROMS
High res 3D
oceanography

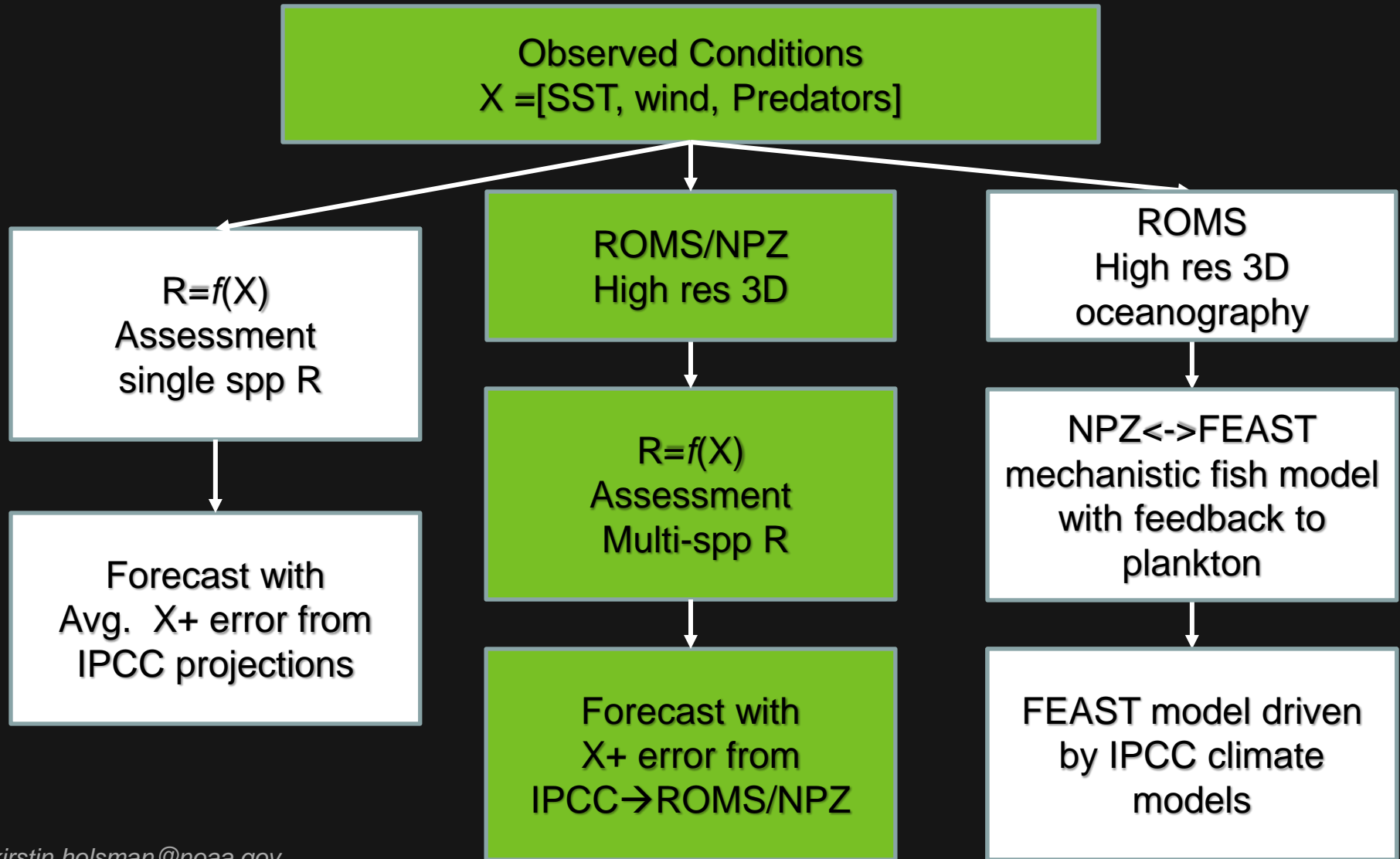
NPZ \leftrightarrow FEAST
mechanistic fish model
with feedback to
plankton

FEAST model driven
by IPCC climate
models

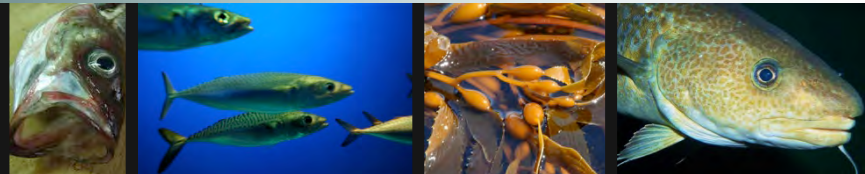
CC Analysis



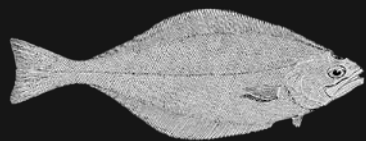
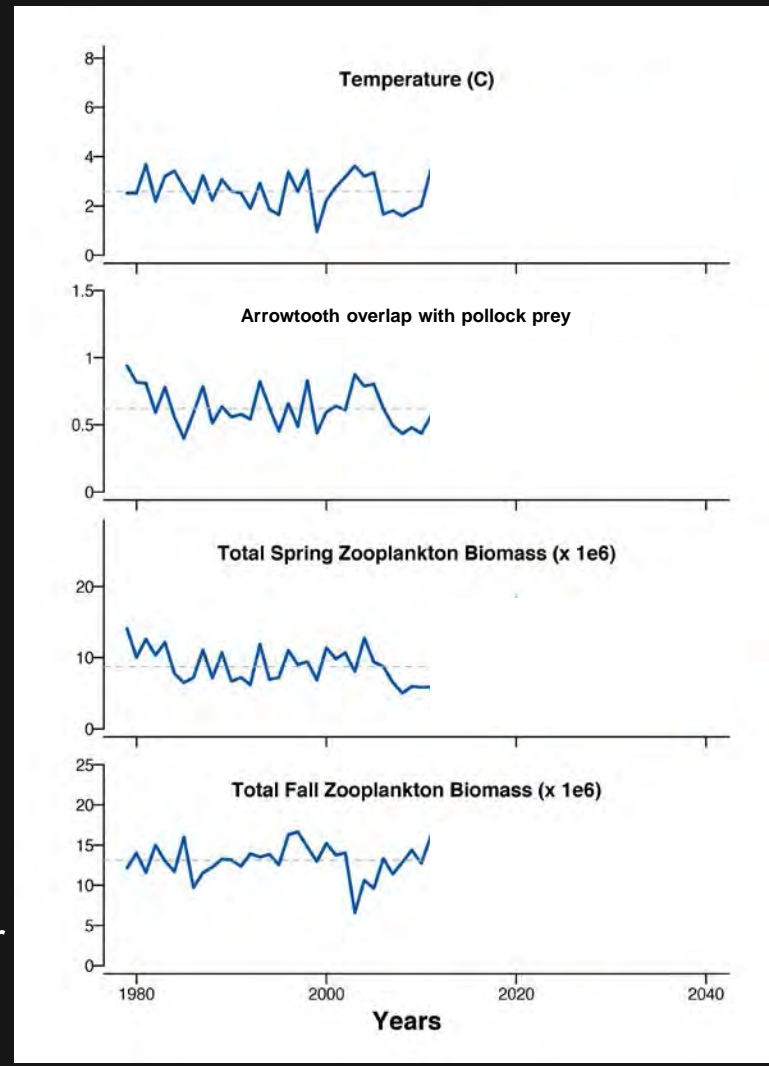
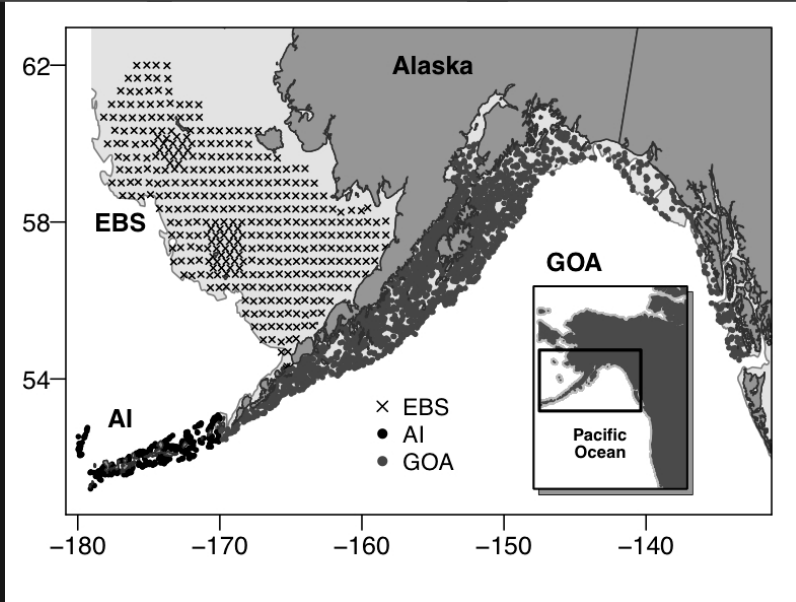
Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections



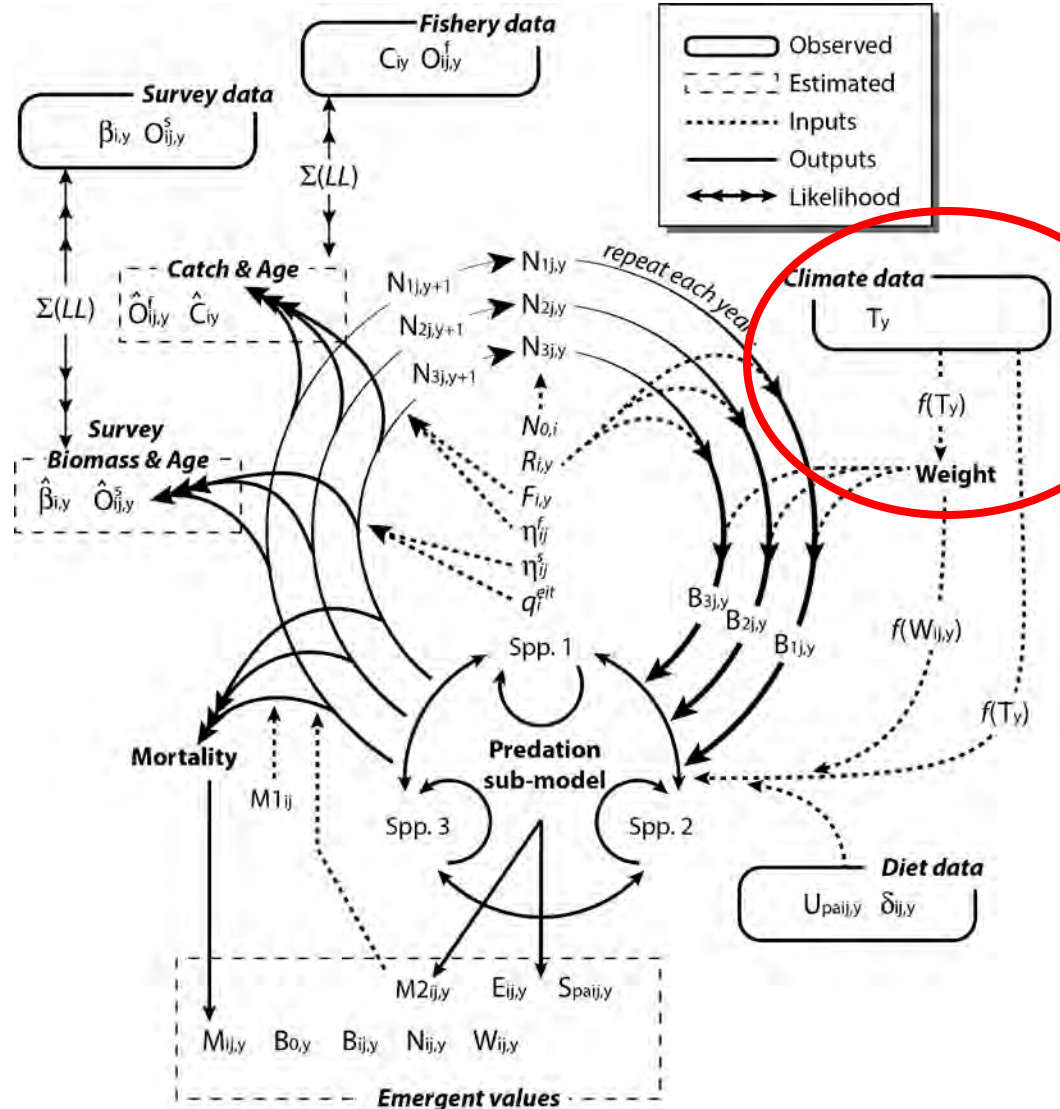
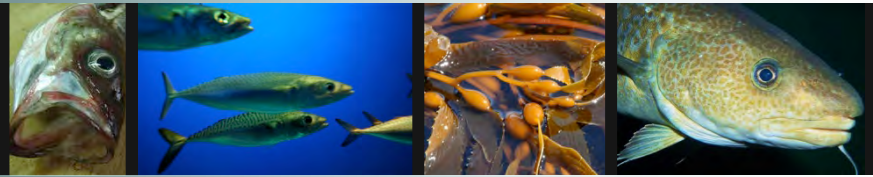
MSMt Approach



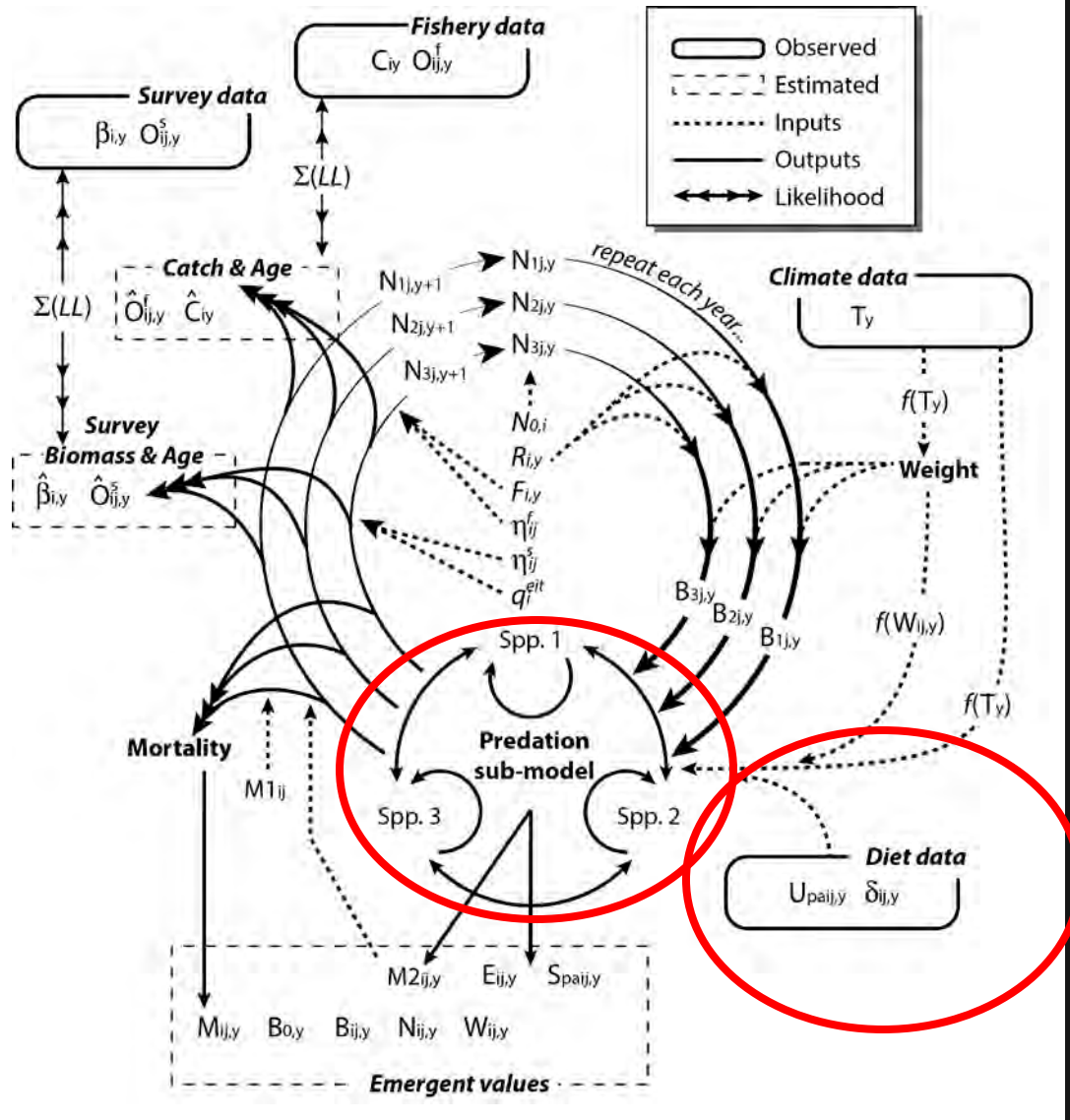
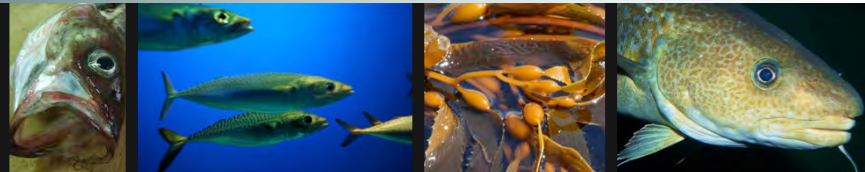
Introduction > **MSMt: Methods** > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections



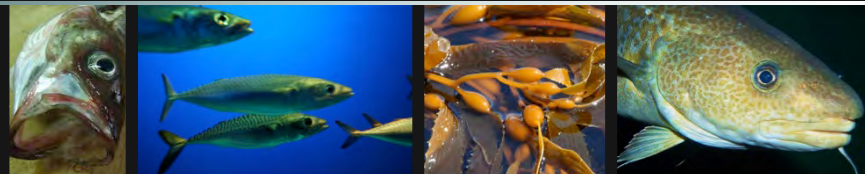
MSMt Weight at Age



MSMt Pred. mort (M2)



MSMt Pred. mort (M2)



Recruitment	$N_{i1,y} = R_{i,y} = R_{0,i} e^{\tau_{i,y}}$	$\tau_{i,y} \sim N(0, \sigma^2)$	T1.1
Initial abundance	$N_{ij,1} = \begin{cases} R_{0,i} e^{(-j M1_{ij})} N_{0,ij} & y = 1 \quad 1 < j \leq A_i \\ R_{0,i} e^{(-j M1_{i,A_i})} N_{0,i,A_i} / (1 - e^{(-j M1_{i,A_i})}) & y = 1 \quad j > A_i \end{cases}$		T1.2
Numbers at age	$N_{i,j+1,y+1} = N_{i,j,y} e^{-Z_{i,j,y}}$	$1 \leq y \leq n_y \quad 1 \leq j < A_i$	T1.3
	$N_{i,A_i,y+1} = N_{i,A_i-1,y} e^{-Z_{i,A_i-1,y}} + N_{i,A_i,y} e^{-Z_{i,A_i,y}}$	$1 \leq y \leq n_y \quad j > A_i$	T1.3
Catch	$C_{i,j,y} = \frac{F_{i,j,y}}{Z_{i,j,y}} (1 - e^{-Z_{i,j,y}}) N_{i,j,y}$		T1.4
Total yield (kg)	$Y_{i,y} = \sum_i \left(\frac{F_{i,j,y}}{Z_{i,j,y}} (1 - e^{-Z_{i,j,y}}) N_{i,j,y} W_{i,j,y} \right)$		T1.5
Biomass at age (kg)	$B_{i,j,y} = N_{i,j,y} W_{i,j,y}$		T1.6
Spawning biomass at age (kg)	$SSB_{i,j,y} = B_{i,j,y} \rho_{ij}$		T1.7
Total mortality at age	$Z_{i,j,y} = M1_{ij} + M2_{i,j,y} + F_{i,j,y}$		T1.8
Fishing mortality at age	$F_{i,j,y} = F_{0,i} e^{\epsilon_{i,y}} S_{1j}^f$	$\epsilon_{i,y} \sim N(0, \sigma_{\epsilon,i}^2)$	T1.9
Weight at age (kg)	$W_{i,j,y} = \log(W_{\infty,i,y}) + \left(\frac{1}{(1 - d_{i,y})} \right) \log(1 - e^{(-K_i(1-d_{i,y})(j-t_{0,i}))})$		T1.10a

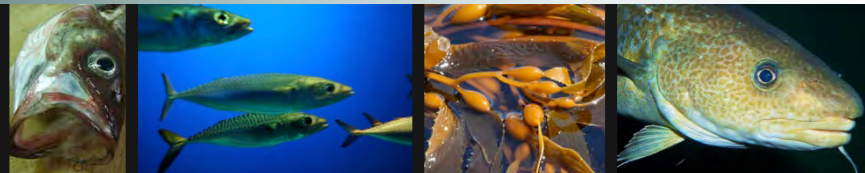
Residual
Natural Mortality

Predation
Natural Mortality

$$Z_{i,j,y} = M1_{ij} + M2_{i,j,y} + F_{i,j,y}$$

Fishery age composition	$O_{i,j,y}^f = \frac{C_{i,j,y}}{\sum_j C_{i,j,y}}$	T1.13
BT survey age composition	$O_{i,j,y}^s = \frac{N_{i,j,y} e^{0.5(-Z_{i,j,y})} S_{1j}^s q_{1j}^s}{\sum_j (N_{i,j,y} e^{0.5(-Z_{i,j,y})} S_{1j}^s q_{1j}^s)}$	T1.14
EIT survey age composition	$O_{i,j,y}^{eit} = \frac{N_{i,j,y} e^{0.5(-Z_{i,j,y})} S_{1j}^{eit} q_{1j}^{eit}}{\sum_j (N_{i,j,y} e^{0.5(-Z_{i,j,y})} S_{1j}^{eit} q_{1j}^{eit})}$	T1.15

MSMt Pred. mort (M2)



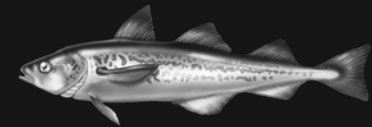
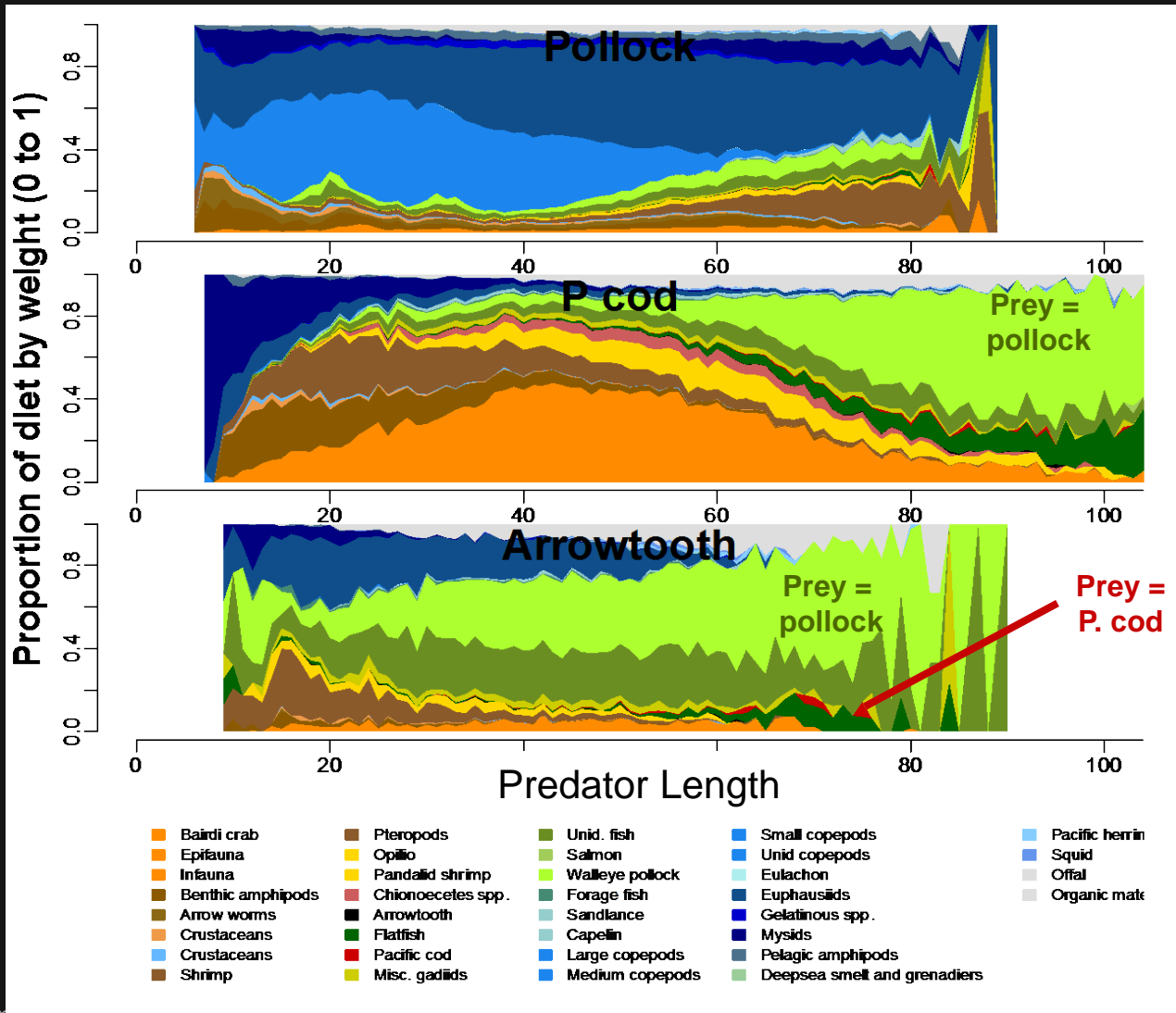
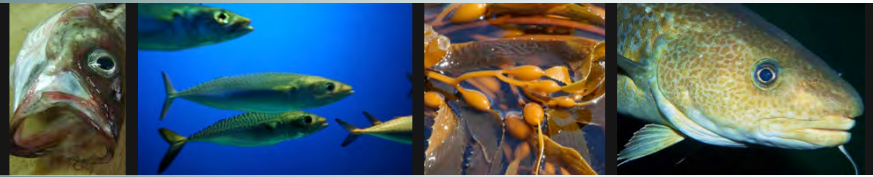
Definition	Equation	
Predation morality	$M2_{ij,y} = \sum_{pa} \left(\frac{N_{pa,y} \delta_{pa,y} \bar{S}_{paij}}{\sum_{ij} (\bar{S}_{paij} B_{ij,y}) + B_p^{other} (1 - \sum_{ij} (\bar{S}_{paij}))} \right)$	T2.1
Predator-prey suitability	$n_y \sum_y \left(\sum_{ij} \left(\frac{U_{paij}}{B_{ij,y}} \right) + \frac{1 + \sum_{ij} U_{paij}}{B_p^{other}} \right)$	T2.2
Mean gravimetric diet proportion	$\sum_{ij} U_{paij}$	T2.3
Individual specific ration (kg kg ⁻¹ yr ⁻¹)	$\delta_{pa,y} = \hat{\phi}_{p,y} \alpha_{\delta} W_{pa,y}^{(1+\beta_{\delta})} f(T_y)_p$	T2.4
Temperature scaling algorithm	$f(T_y) = V^X e^{(X(1-V))}$	T2.5
	$Z = \ln(Q_p^c) (T_p^{cm} - T_p^{co})$	T2.5a
	$Y = \ln(Q_p^c) (T_p^{cm} - T_p^{co} + 2)$	T2.5b
		T2.5c
		T2.5d

Age-specific prey selectivity

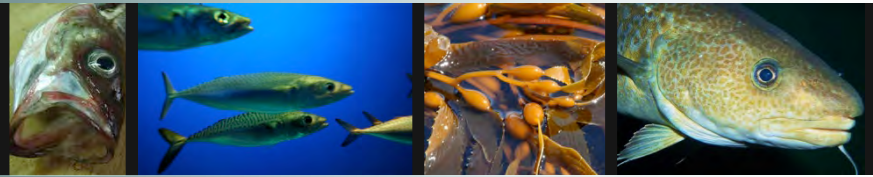
Size-specific annual ration

Temperature specific

MSMt Pred. mort (M2)

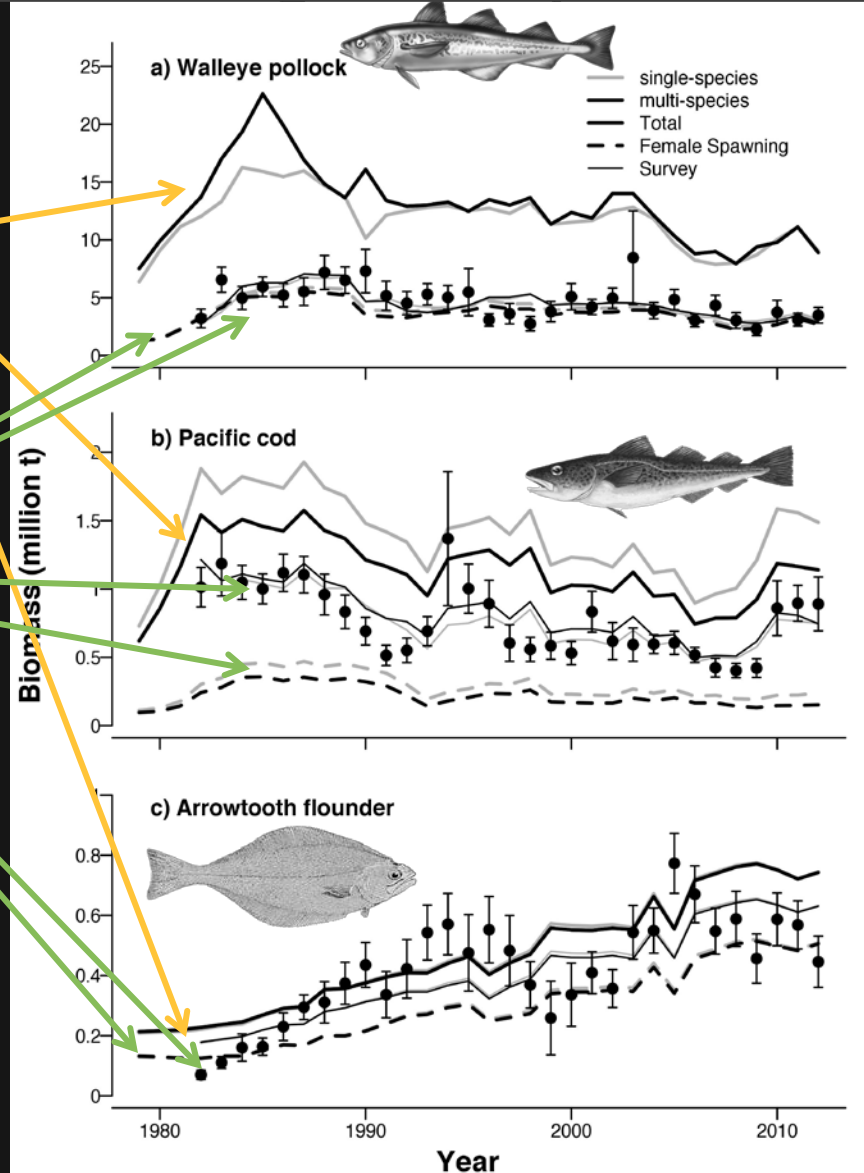


MSMt Estimation

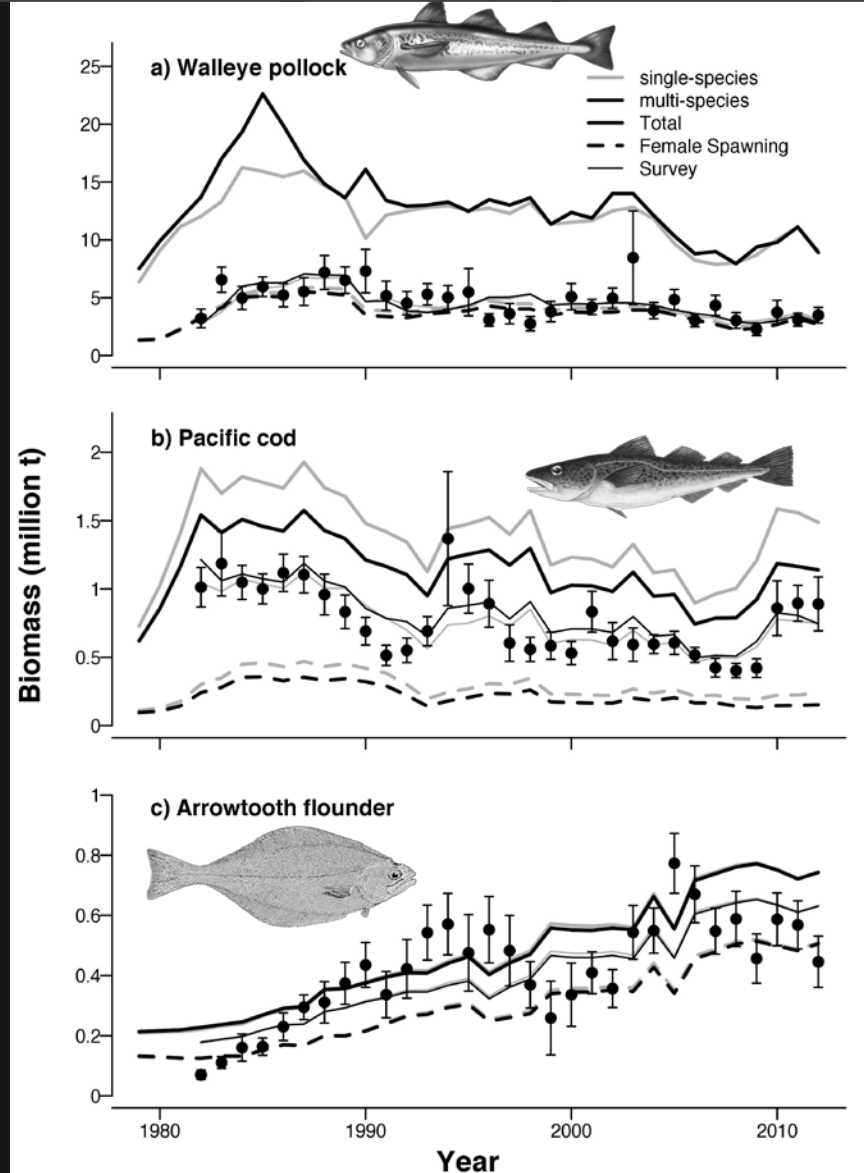
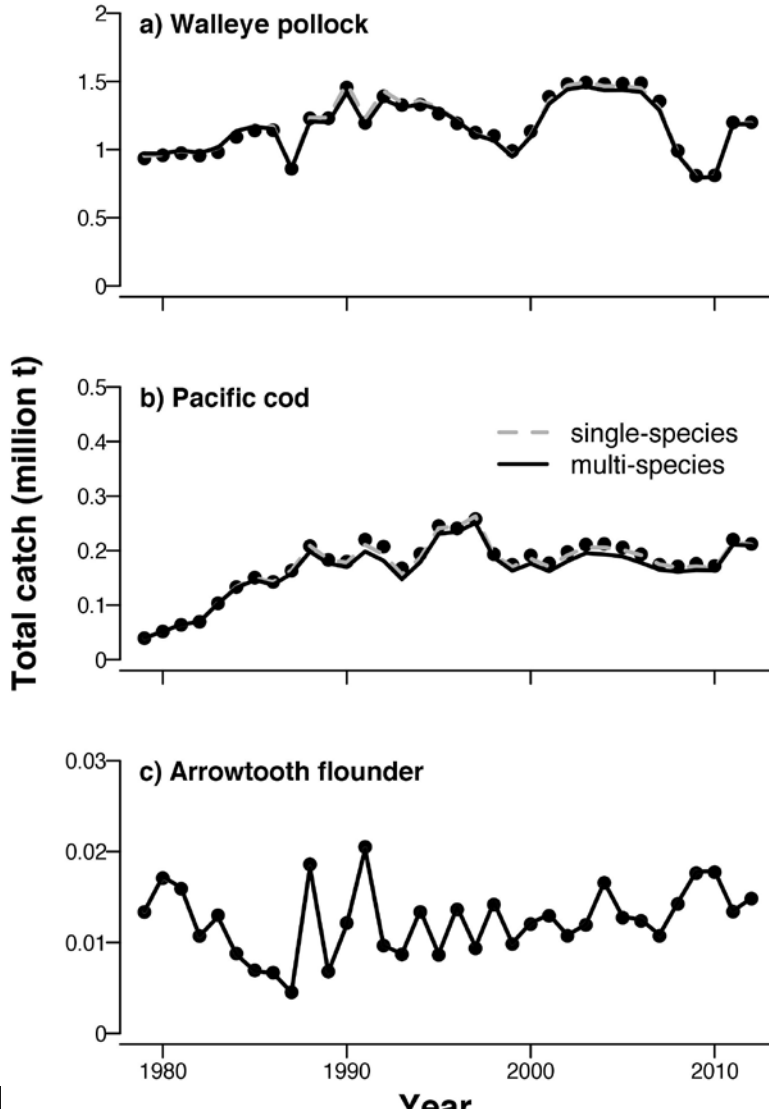
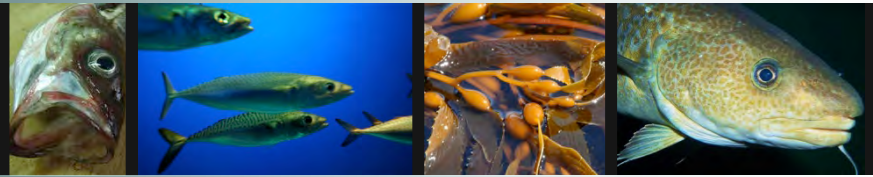


Total biomass differed between models

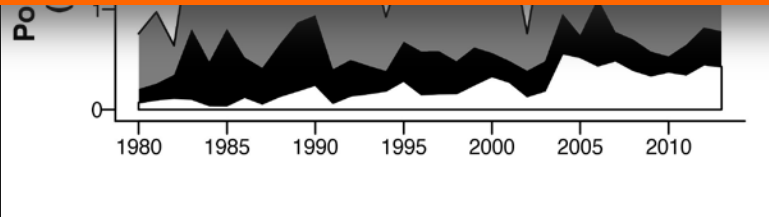
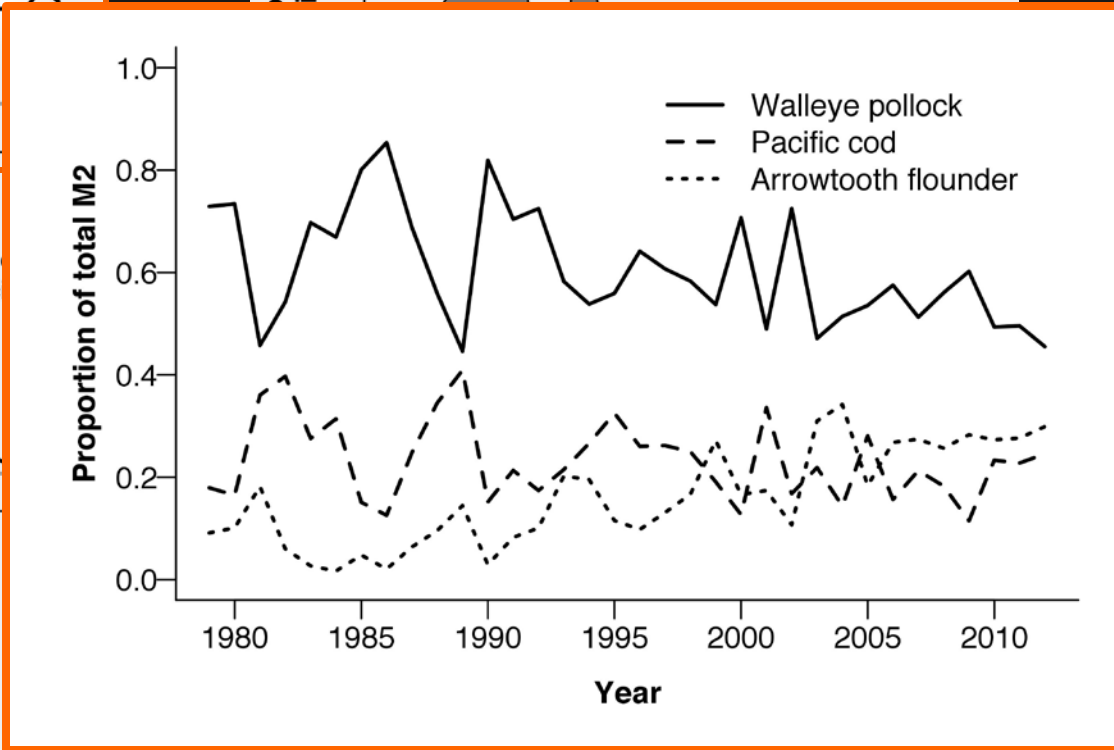
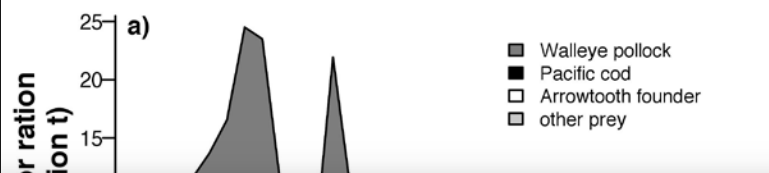
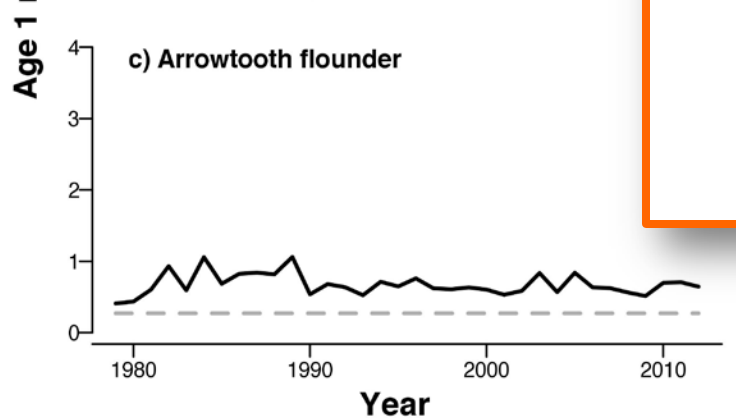
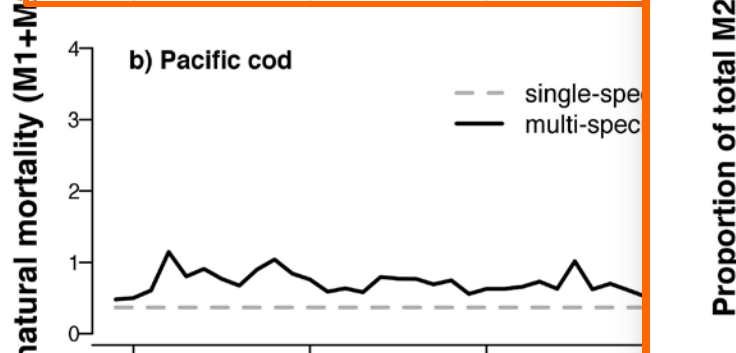
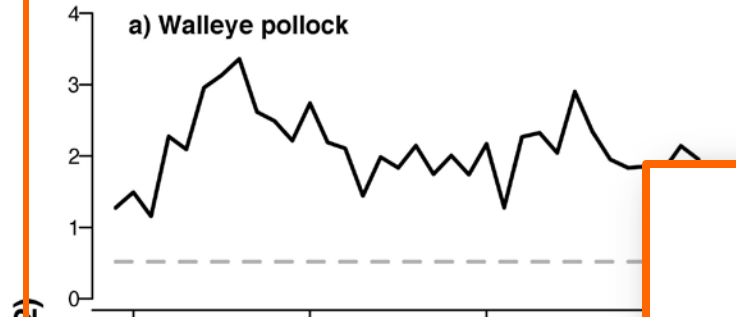
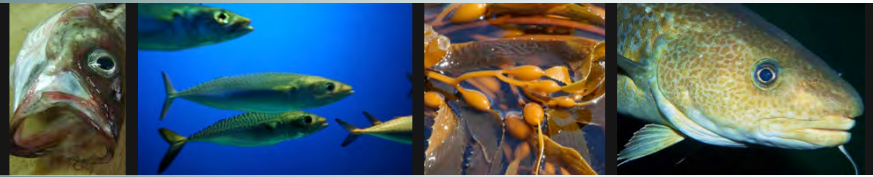
Female spawning and survey biomass estimates were similar



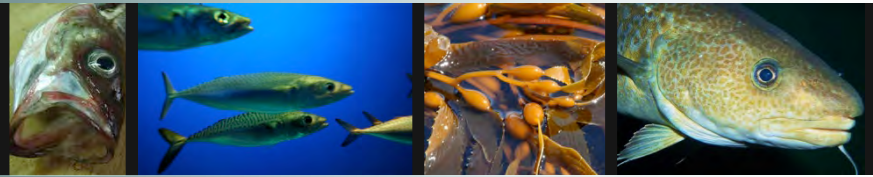
MSMt Estimation



MSMt Estimation



MSMt Estimation

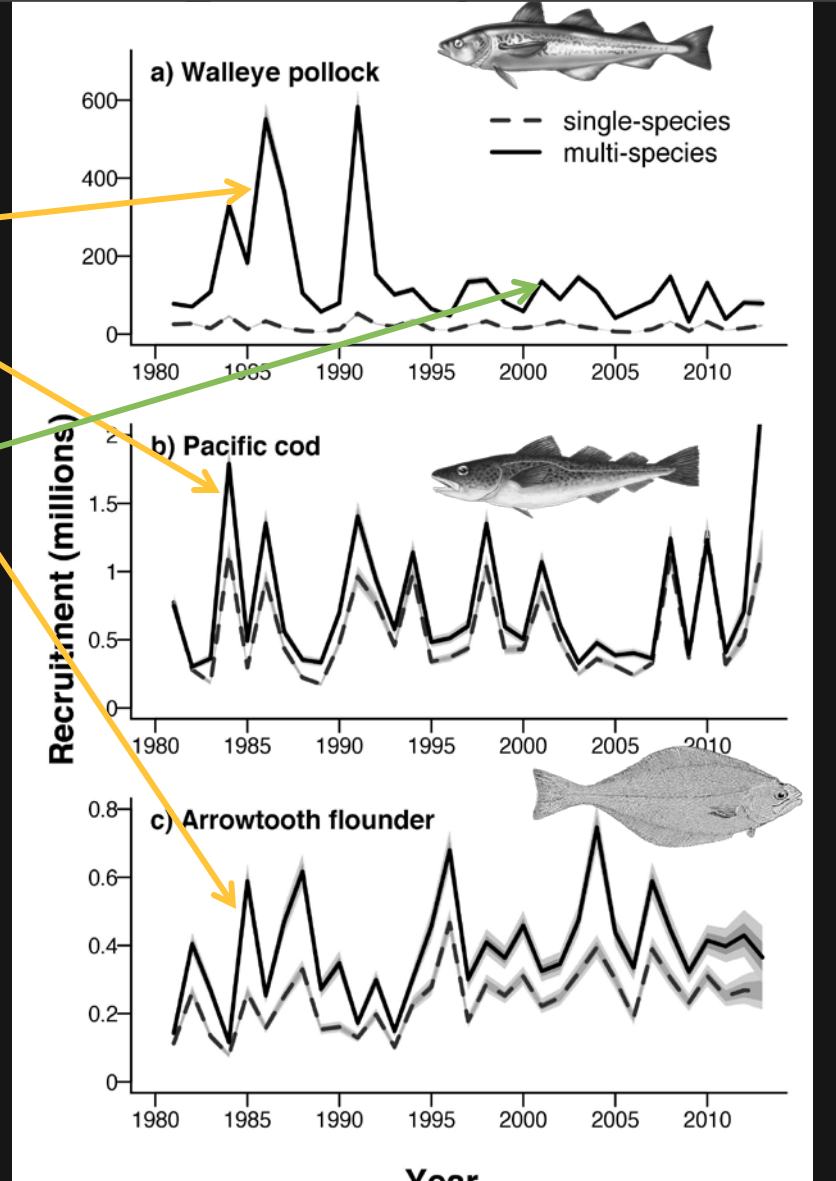


Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections

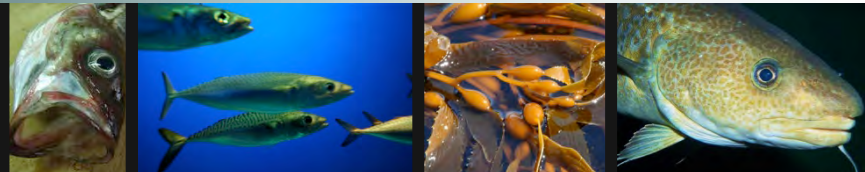
**MSMt Recruitment
(M2 effect)**



**Peaks in recruitment
(Temp. effect)**



Biological Ref. Points



Introduction

MSMt: Methods

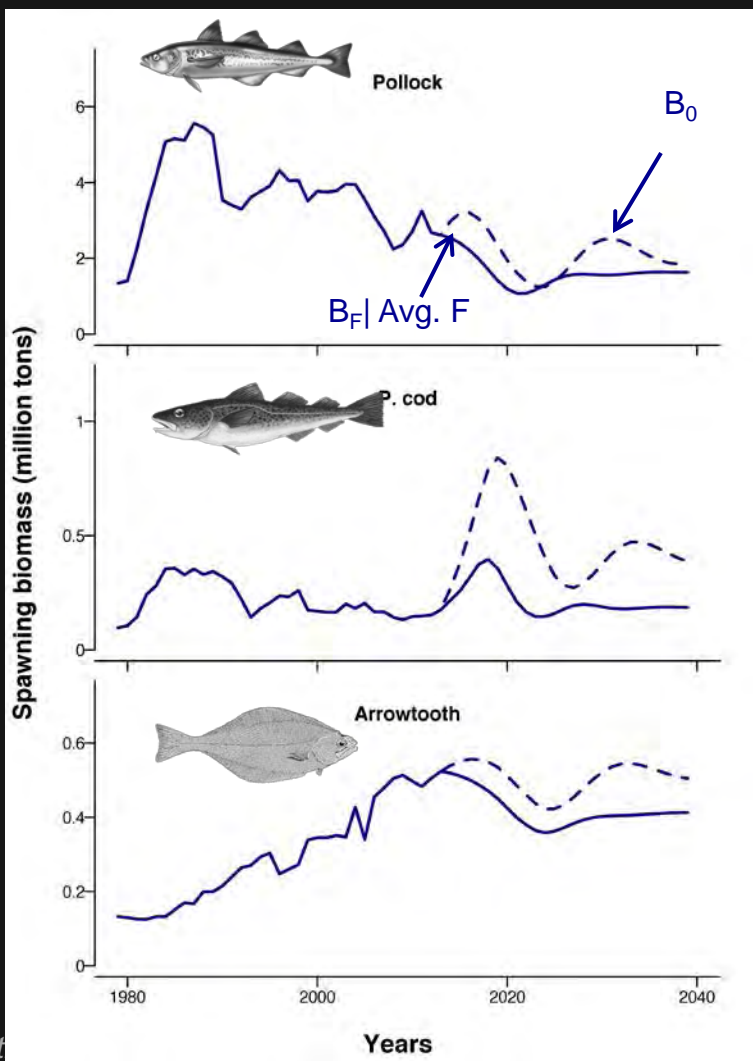
MSMt: Estimation

MSMt: BRPs

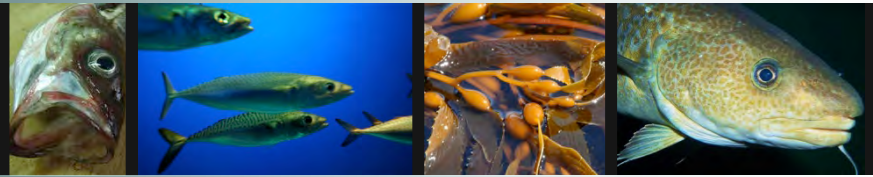
MSMt: R/S

MSMt: Projections

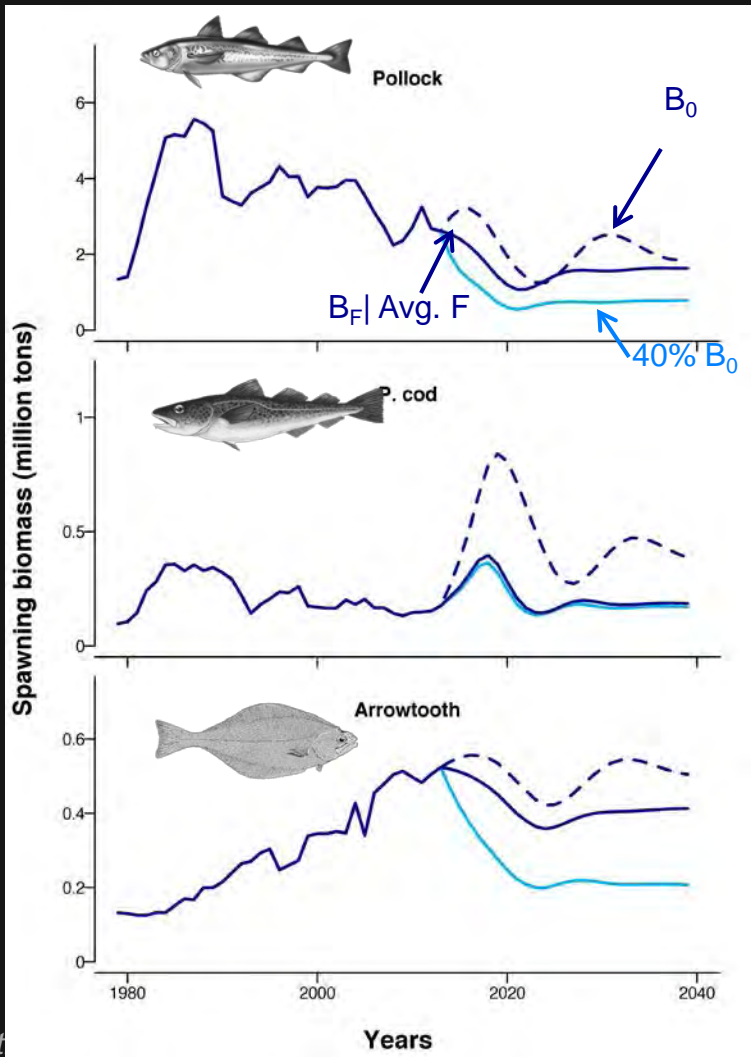
Multi-Species Model



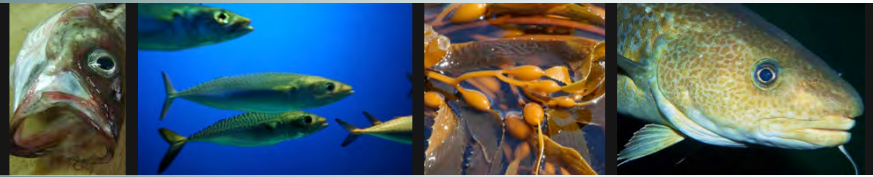
Biological Ref. Points



Multi-Species Model



Biological Ref. Points



Introduction

MSMt: Methods

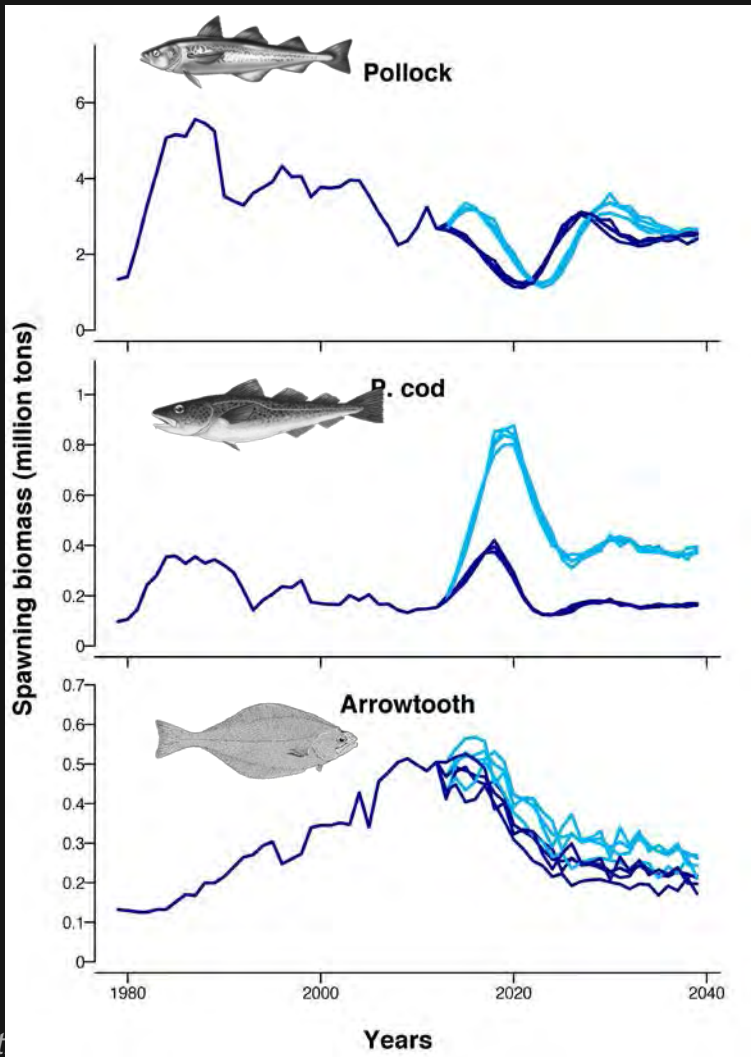
MSMt: Estimation

MSMt: BRPs

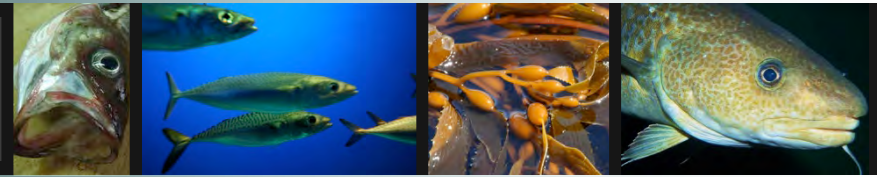
MSMt: R/S

MSMt: Projections

Multi-Species Model



Biological Ref. Points



Introduction

MSMt: Methods

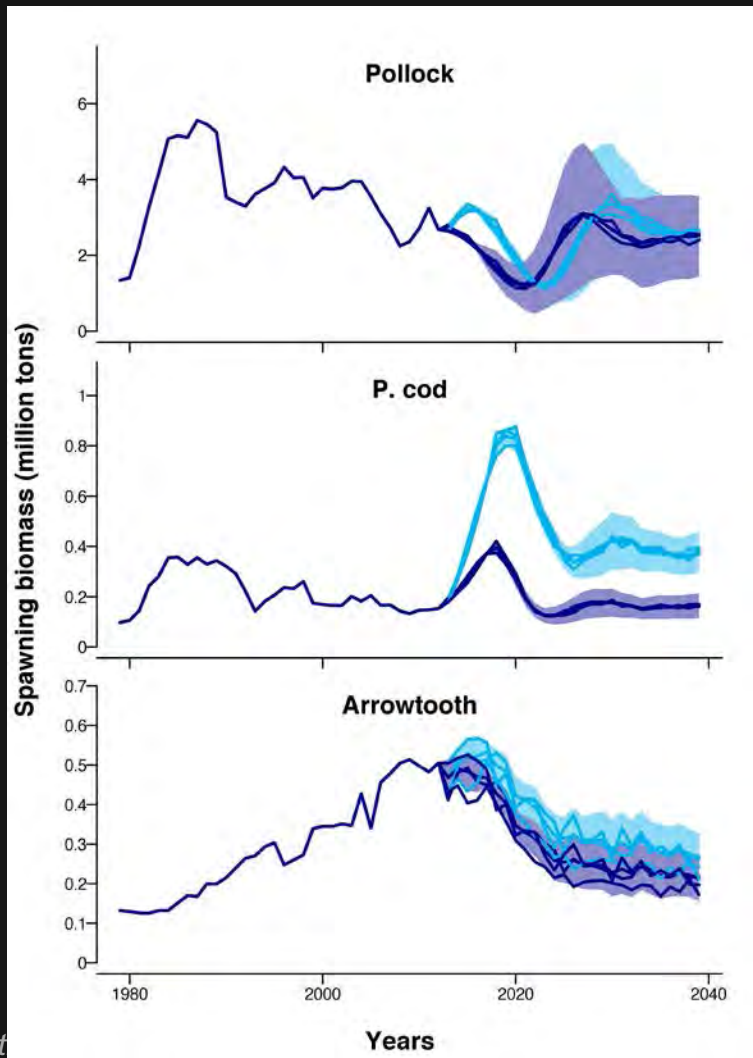
MSMt: Estimation

MSMt: BRPs

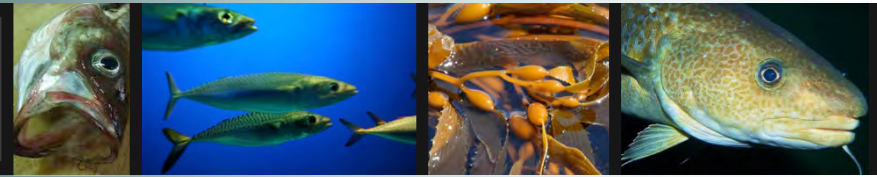
MSMt: R/S

MSMt: Projections

Multi-Species Model



Biological Ref. Points



Introduction

MSMt: Methods

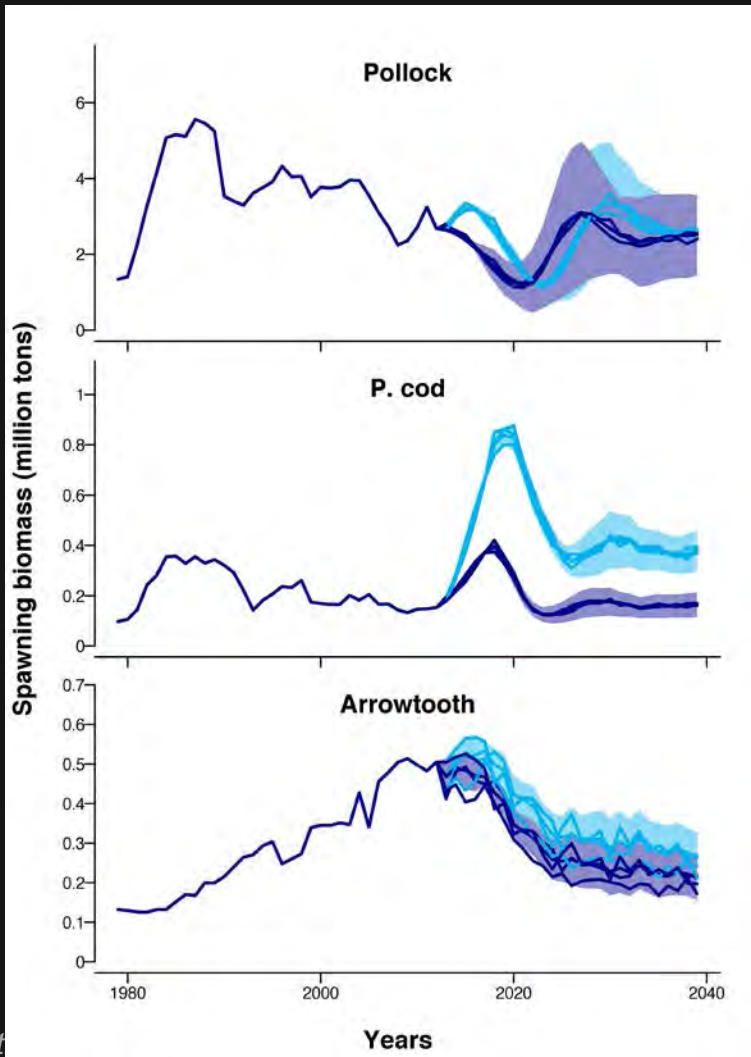
MSMt: Estimation

MSMt: BRPs

MSMt: R/S

MSMt: Projections

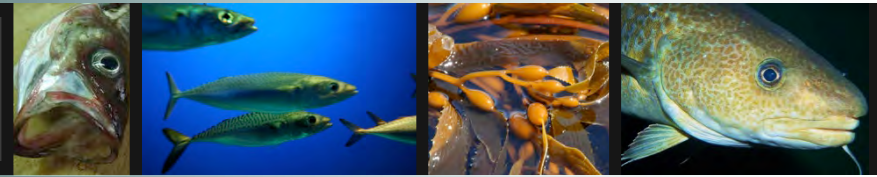
Multi-Species Model



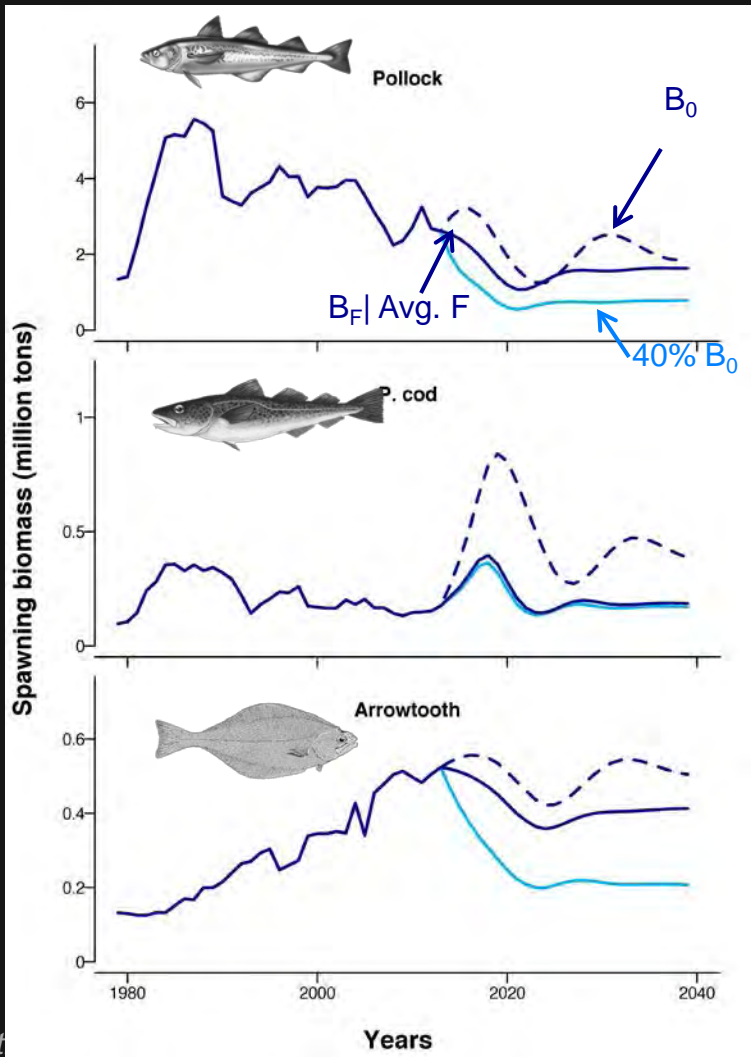
Variation in projected ABC:

1. Temp. effects on Wt & M2

Biological Ref. Points



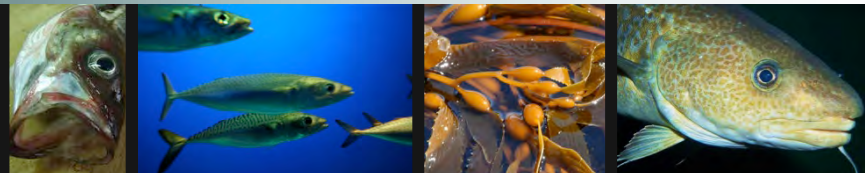
Multi-Species Model



Variation in projected ABC:

1. Temp. effects on W_t & M_2
2. Control rule effects on B_0

Biological Ref. Points



Introduction

MSMt: Methods

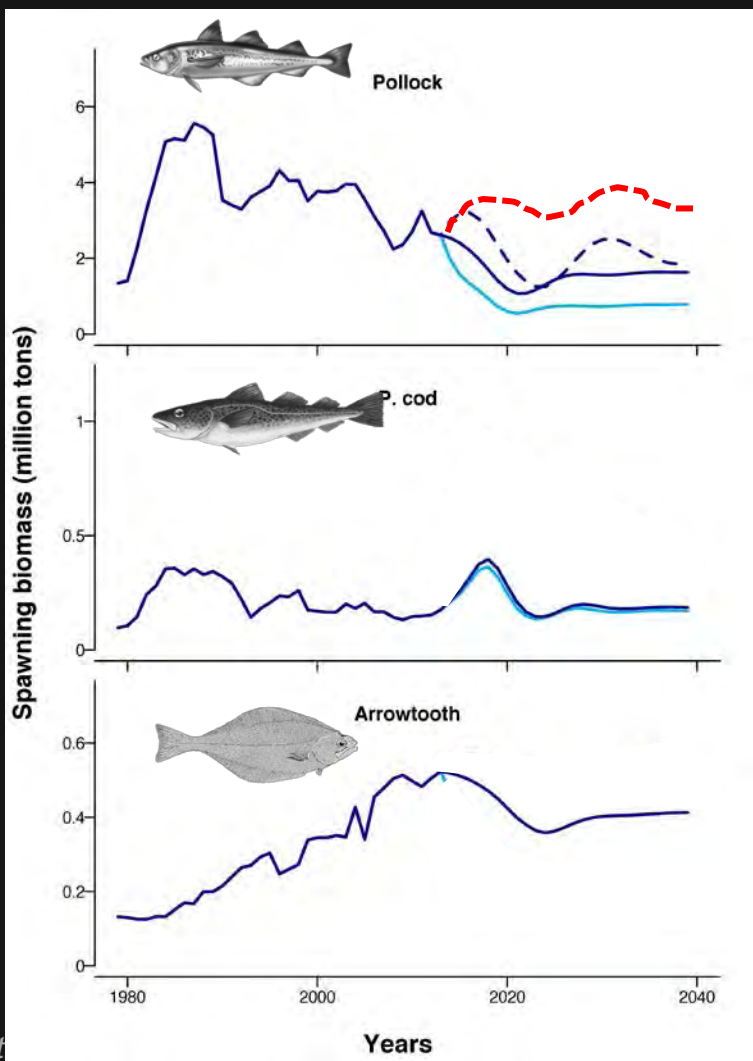
MSMt: Estimation

MSMt: BRPs

MSMt: R/S

MSMt: Projections

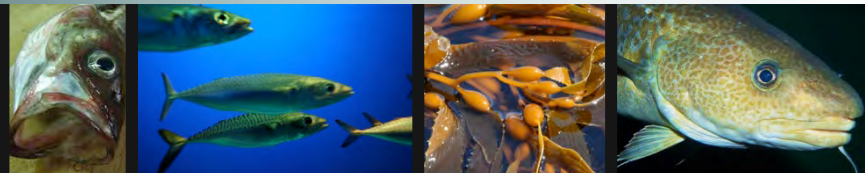
Multi-Species Model



Variation in projected ABC:

1. Temp. effects on W_t & M_2
2. Control rule effects on B_0

Biological Ref. Points



Introduction

MSMt: Methods

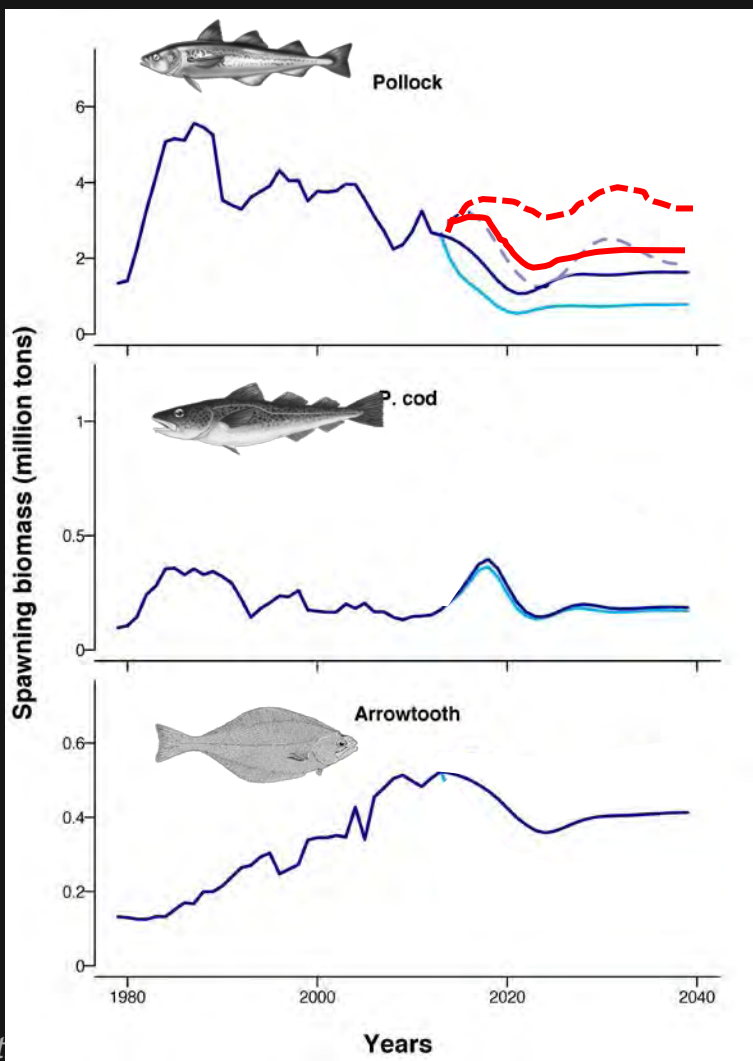
MSMt: Estimation

MSMt: BRPs

MSMt: R/S

MSMt: Projections

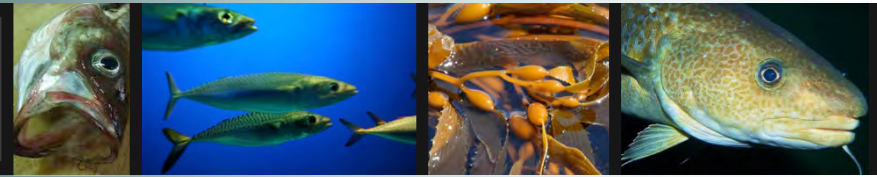
Multi-Species Model



Variation in projected ABC:

1. Temp. effects on W_t & M_2
2. Control rule effects on B_0

Biological Ref. Points



Introduction

MSMt: Methods

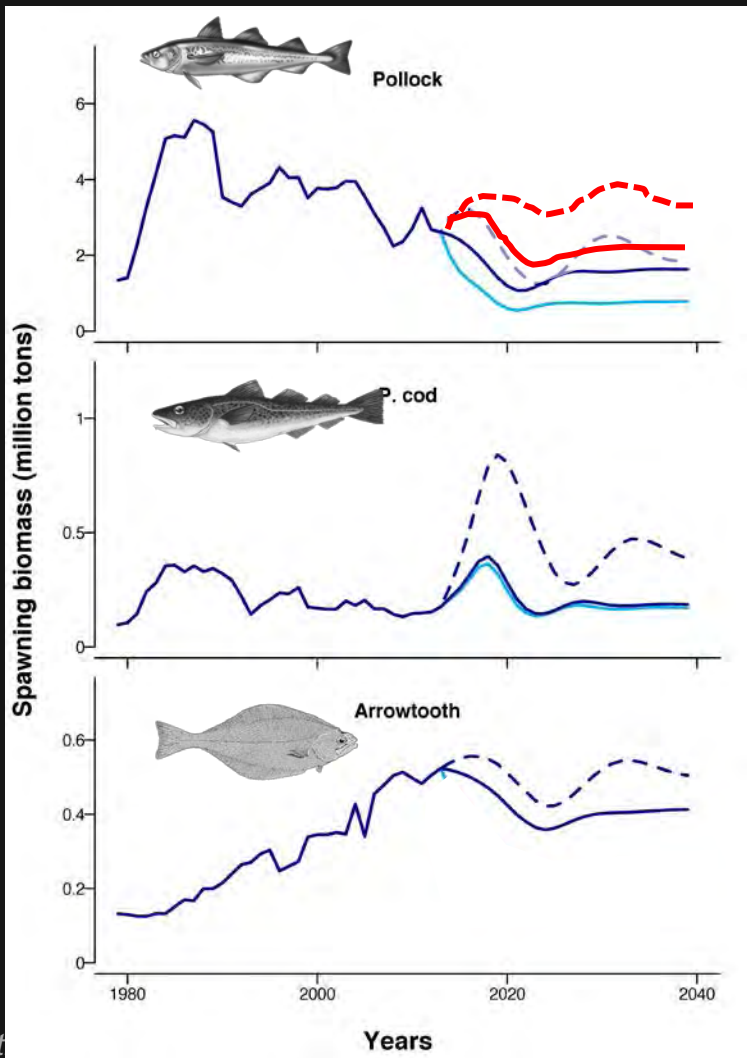
MSMt: Estimation

MSMt: BRPs

MSMt: R/S

MSMt: Projections

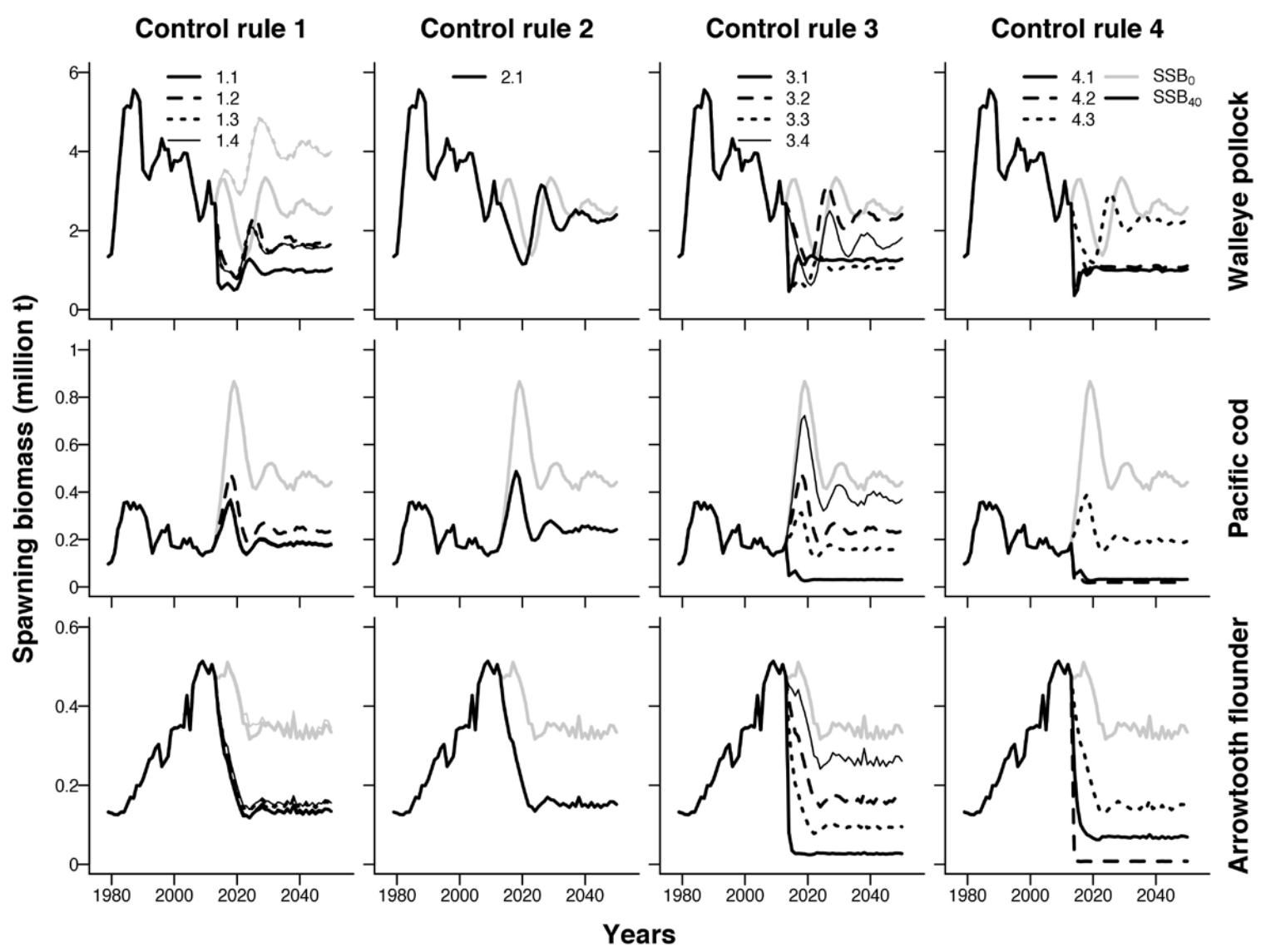
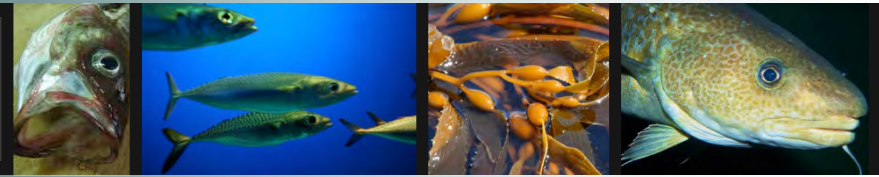
Multi-Species Model



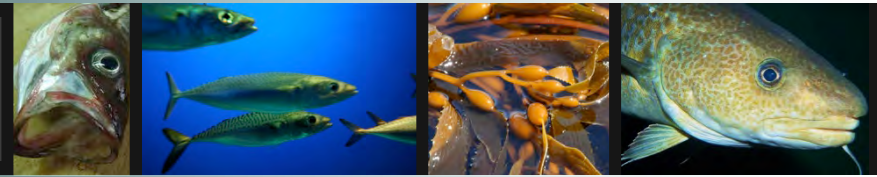
Variation in projected ABC:

1. Temp. effects on W_t & M_2
2. Control rule effects on B_0

Biological Ref. Points



Biological Ref. Points



Introduction

MSMt: Methods

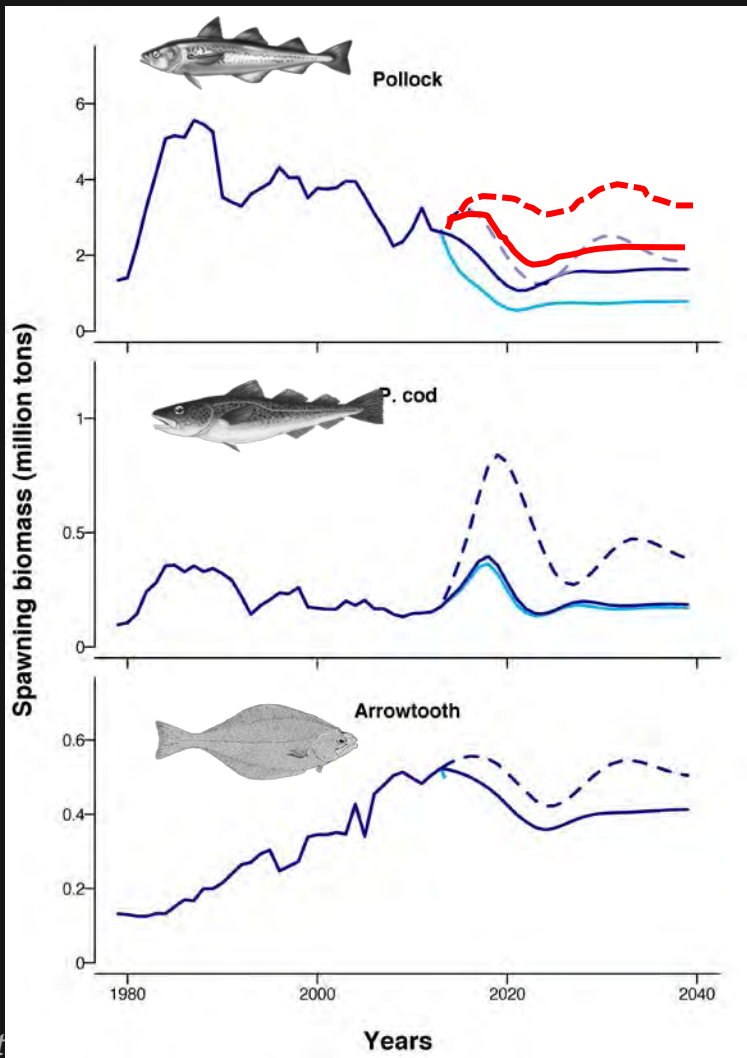
MSMt: Estimation

MSMt: BRPs

MSMt: R/S

MSMt: Projections

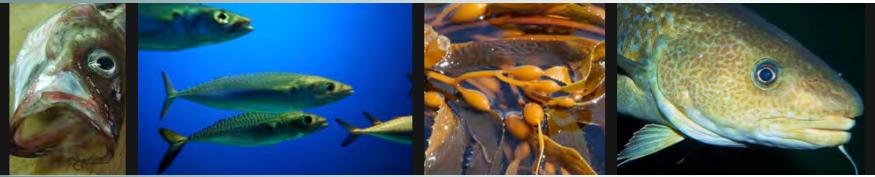
Multi-Species Model



Variation in projected ABC:

1. Temp. effects on W_t & M_2
2. Control rule effects on B_0
3. R/S function

MSMt Multispecies



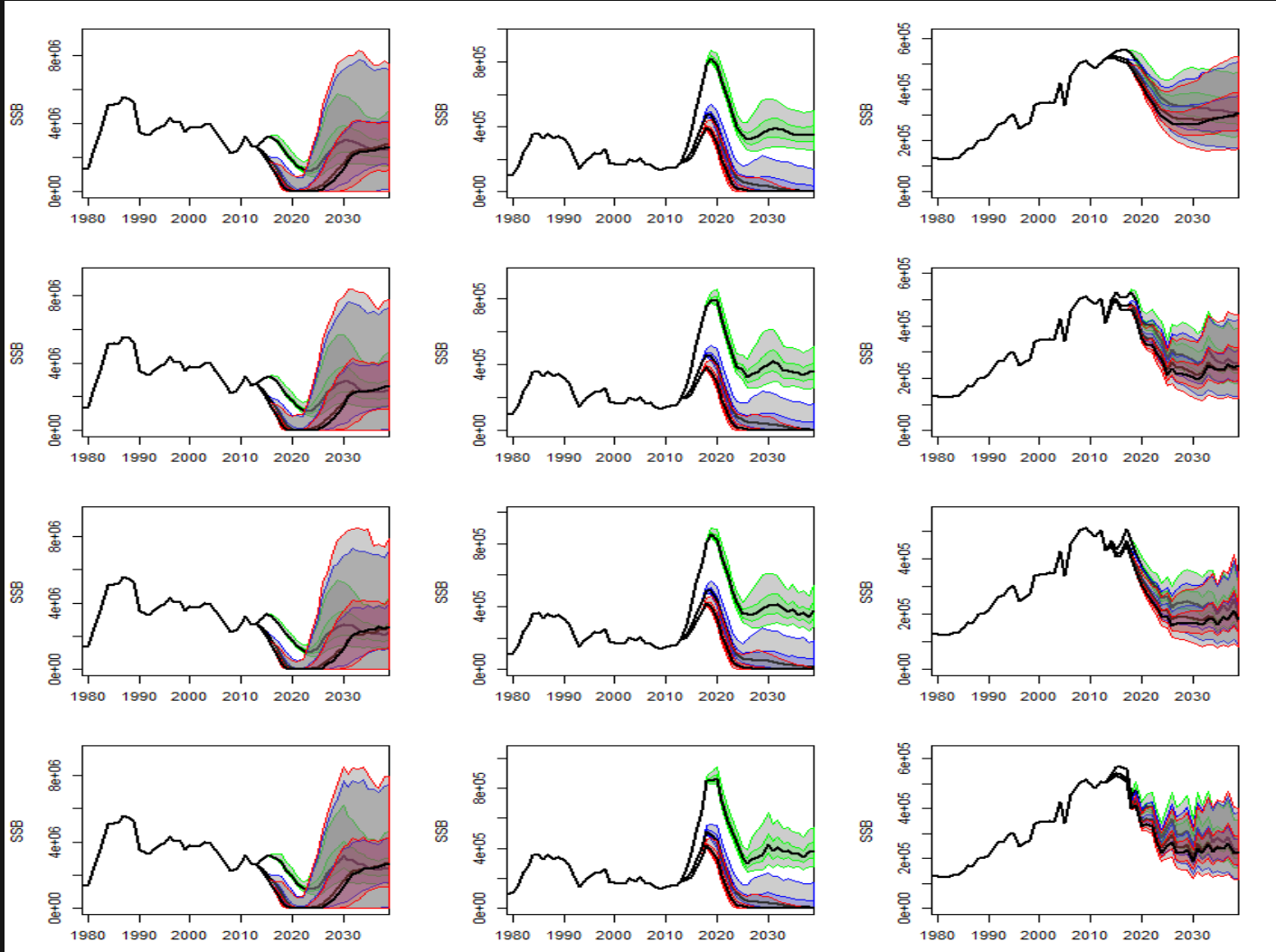
Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections

Pollock

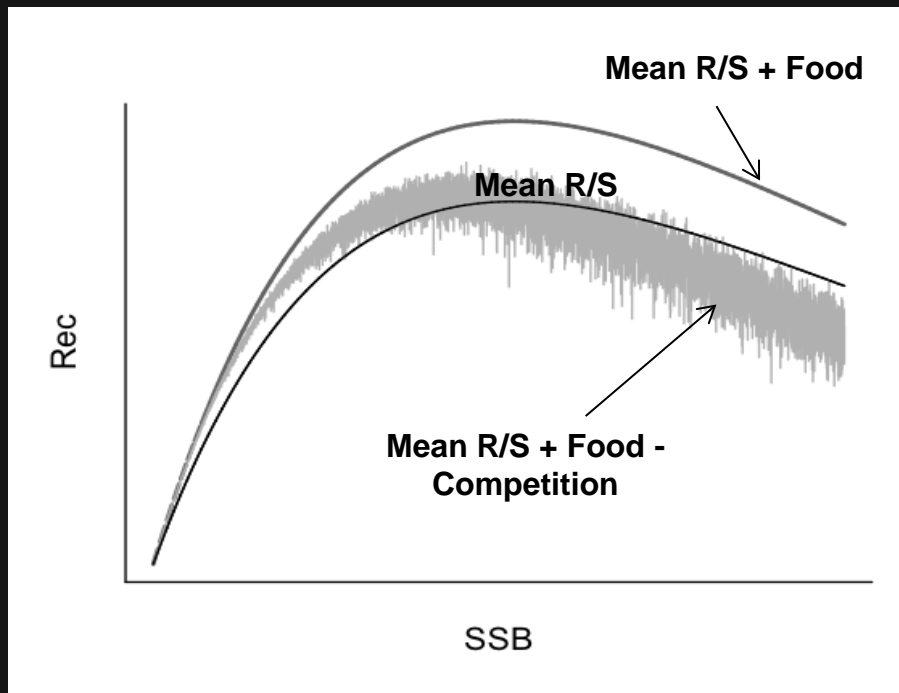
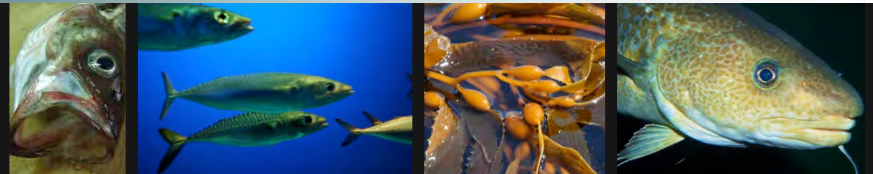
P. cod

Arrowtooth

Avg Temp

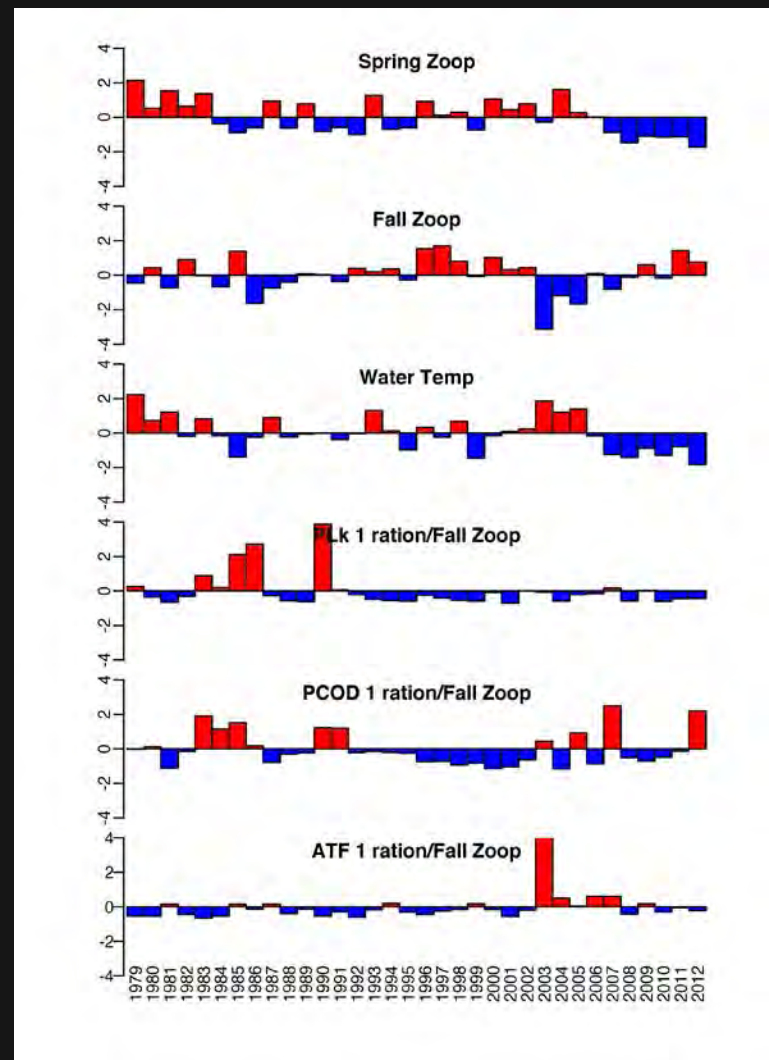


Recruitment estimation

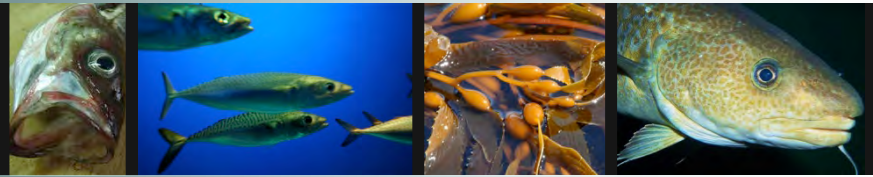


$$\log(R_{p,v}^{fut}) = \log(\alpha_{R,p} \cdot SSB_{p,v-1}) - \beta_{R,p} \cdot SSB_{p,v-1} + \beta_{Z,p}^{spr} \cdot Z_v^{spr} - \beta_{Z,p}^{fall} \cdot \left(\frac{\delta_{p1,v}^{fut}}{Z_v^{fall}} \right)$$

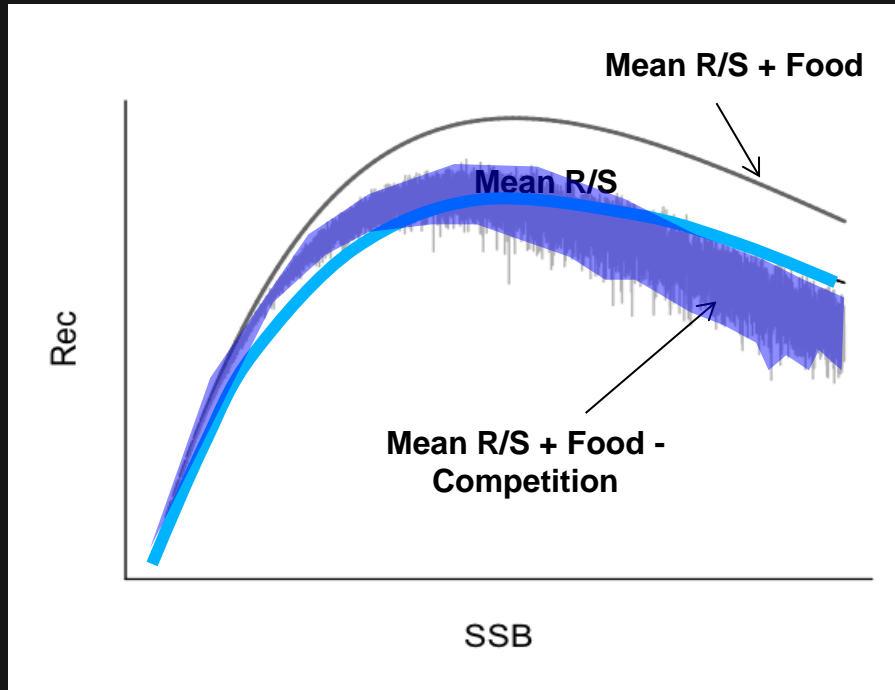
Future recruitment



Recruitment projection

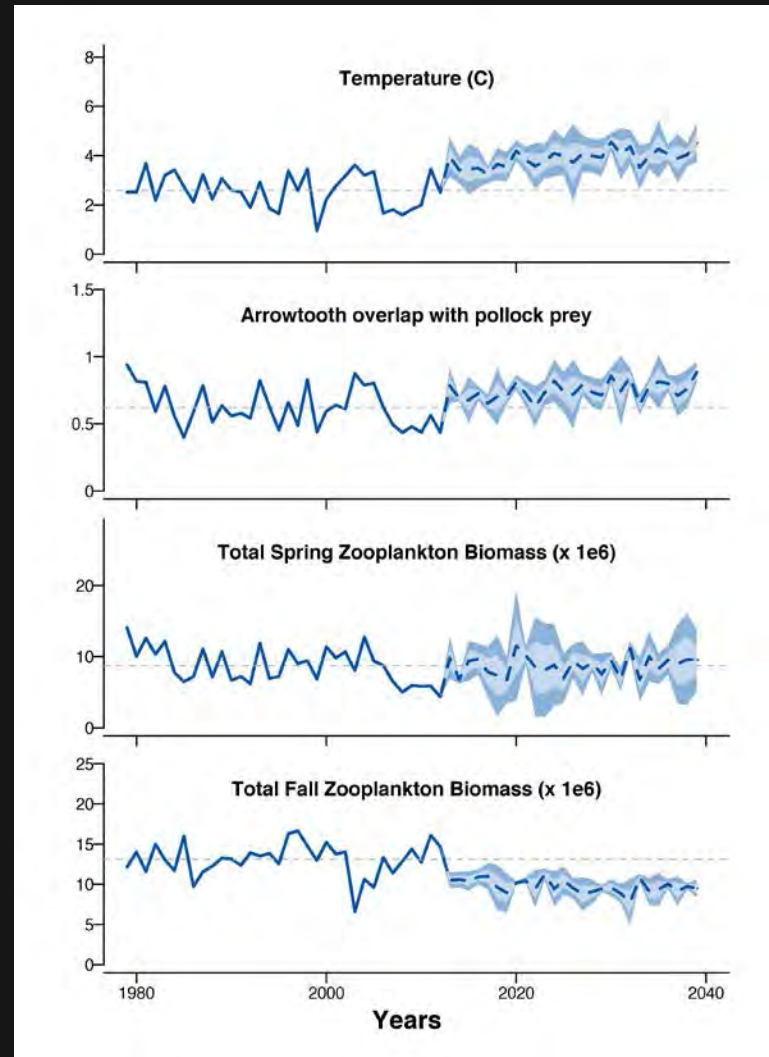


Environmental covariates

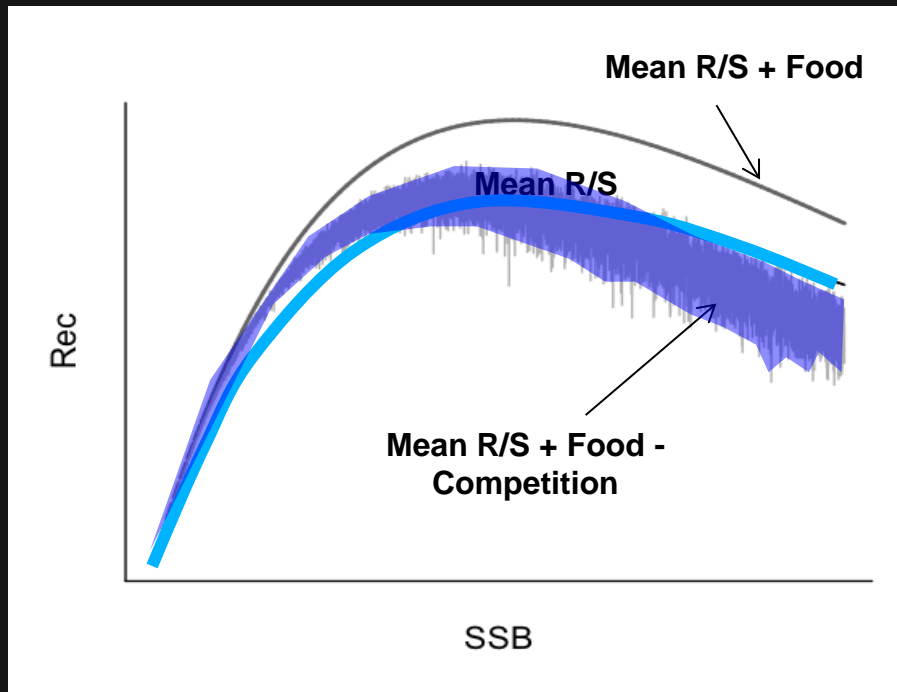
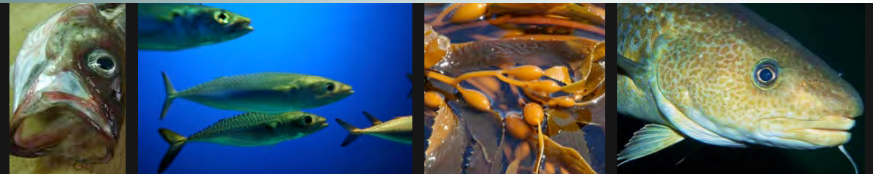


$$\log(R_{p,v}^{fut}) = \log(\alpha_{R,p} \cdot SSB_{p,v-1}) - \beta_{R,p} \cdot SSB_{p,v-1} + \beta_{Z,p}^{spr} \cdot Z_v^{spr} - \beta_{Z,p}^{fall} \cdot Z_v^{fall} \cdot \left(\frac{\delta_{p1,v}^{fut}}{Z_v^{fall}} \right)$$

Future recruitment

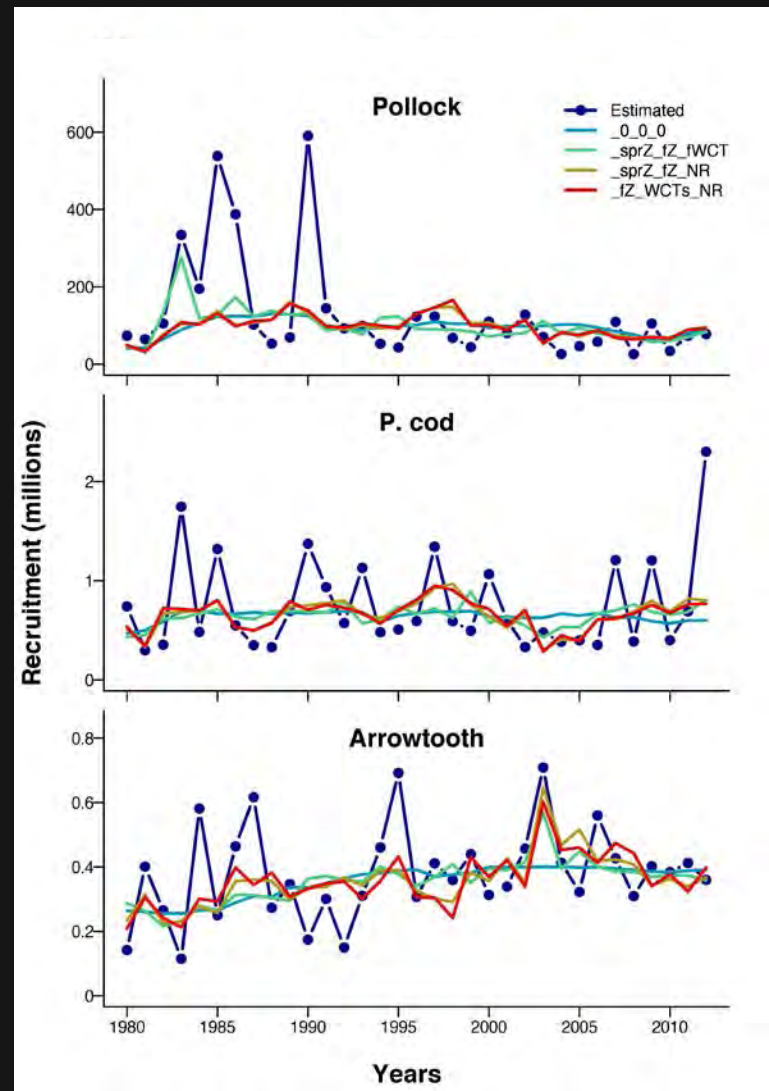


Recruitment projection

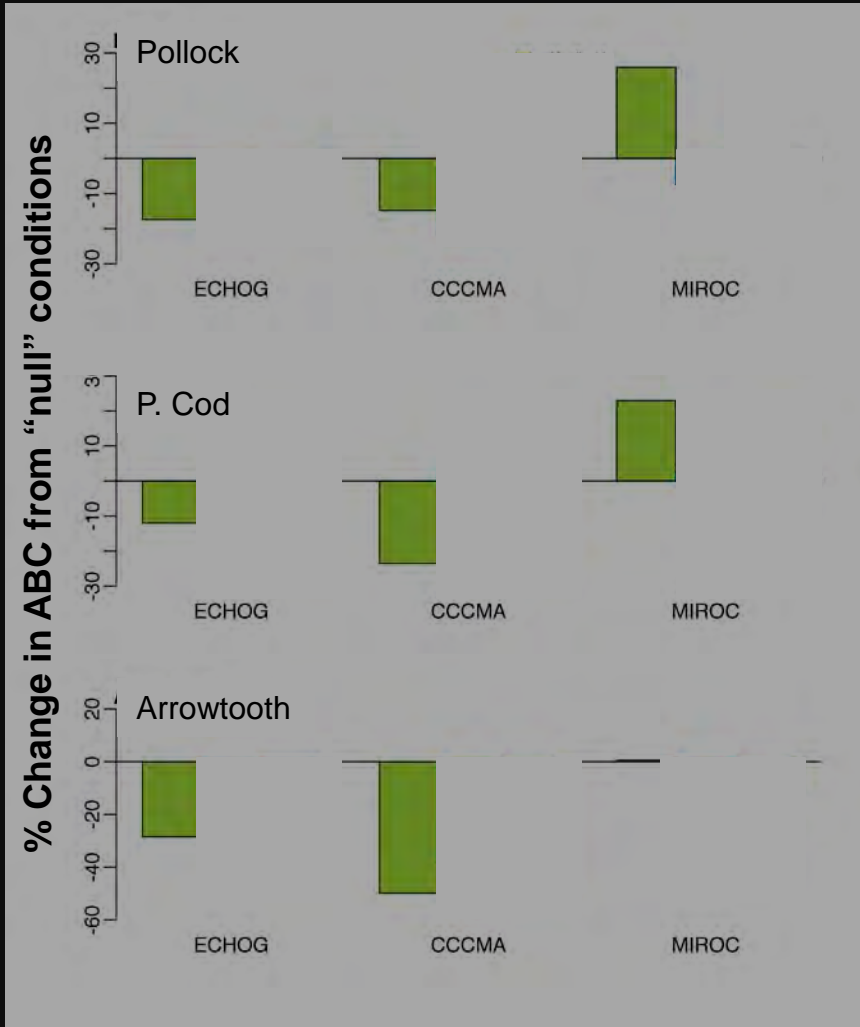
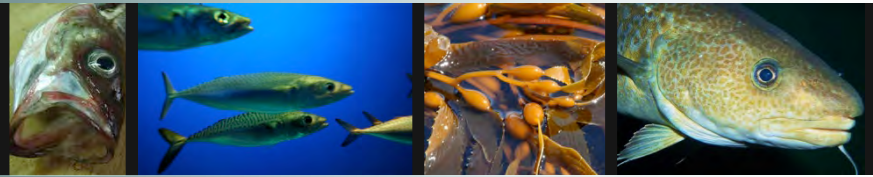


$$\log(R_{p,v}^{fut}) = \log(\alpha_{R,p} \cdot SSB_{p,v-1}) - \beta_{R,p} \cdot SSB_{p,v-1} + \beta_{Z,p}^{spr} \cdot Z_v^{spr} - \beta_{Z,p}^{fall} \cdot \left(\frac{\delta_{p1,v}^{fut}}{Z_v^{fall}} \right)$$

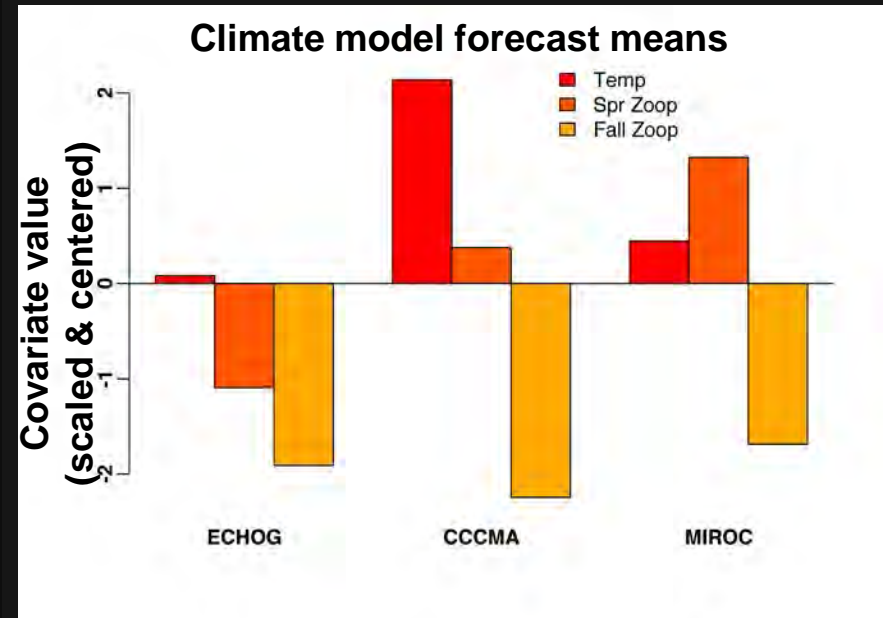
Future recruitment



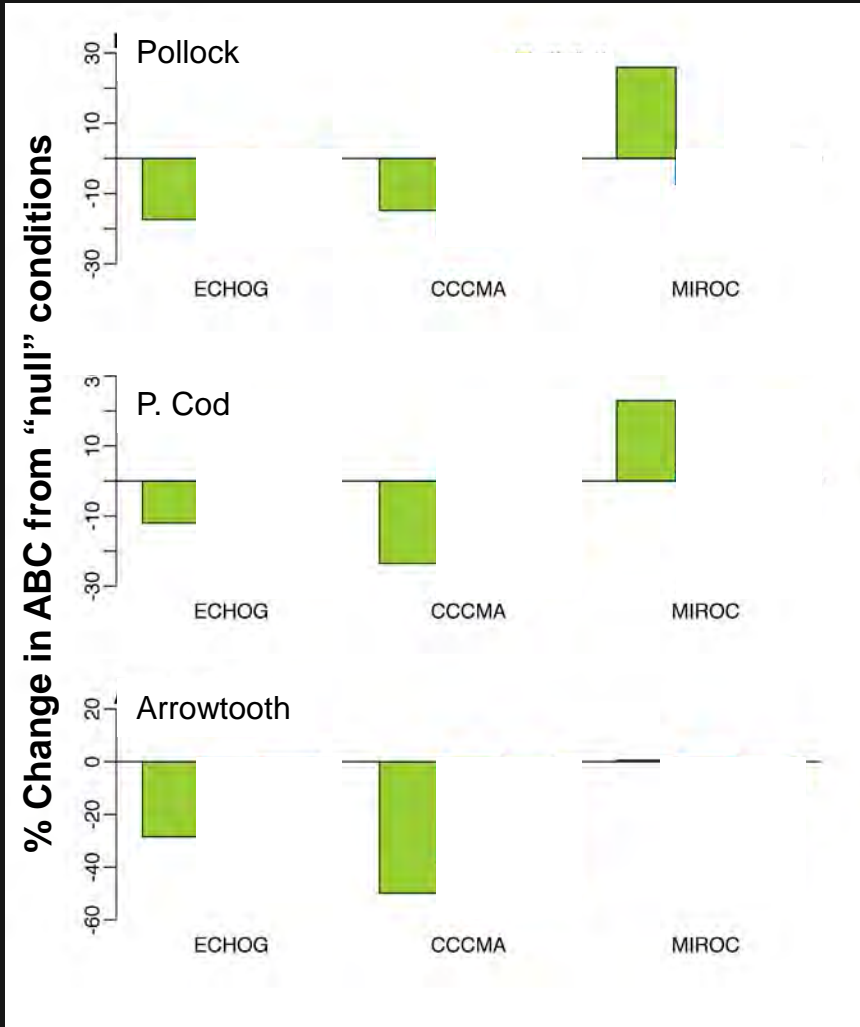
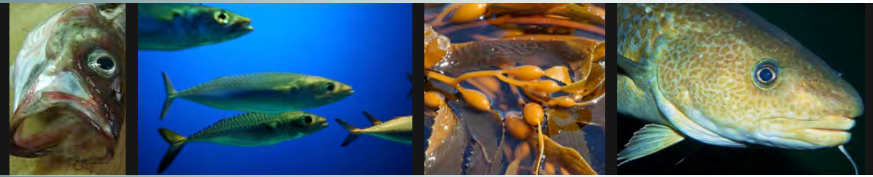
MSMt Projections



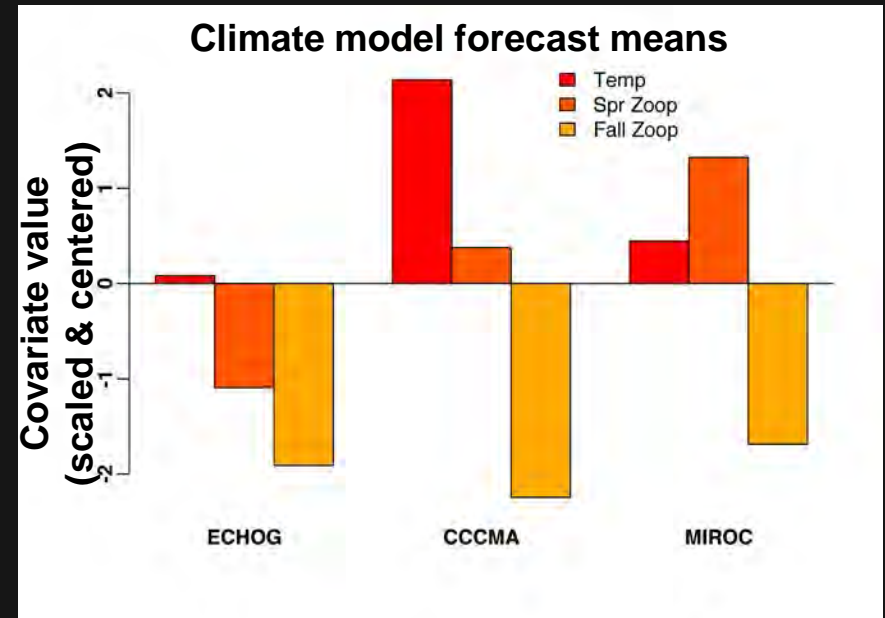
Bottom-up only (single species with covariates)



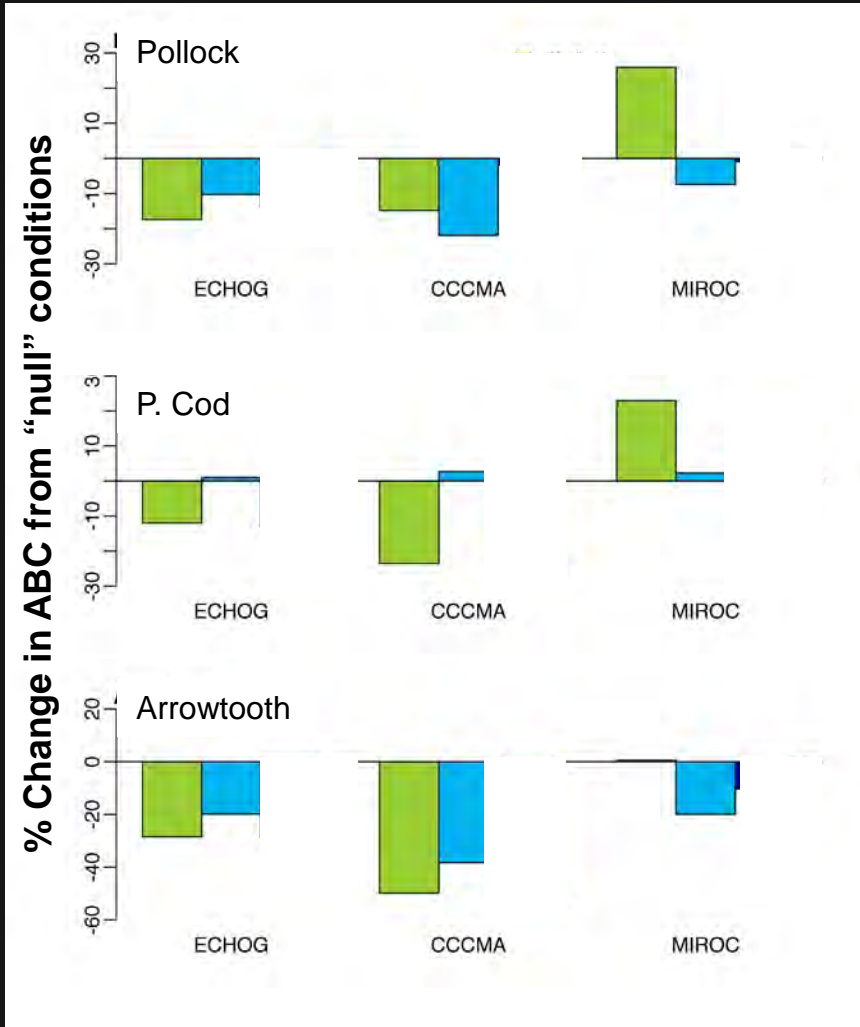
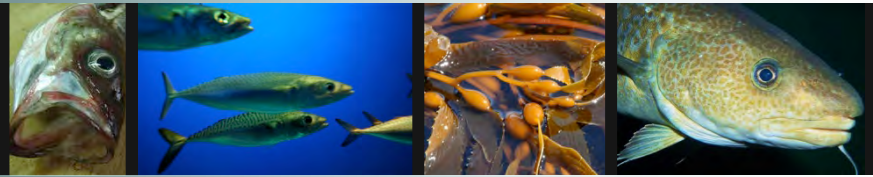
MSMt Projections



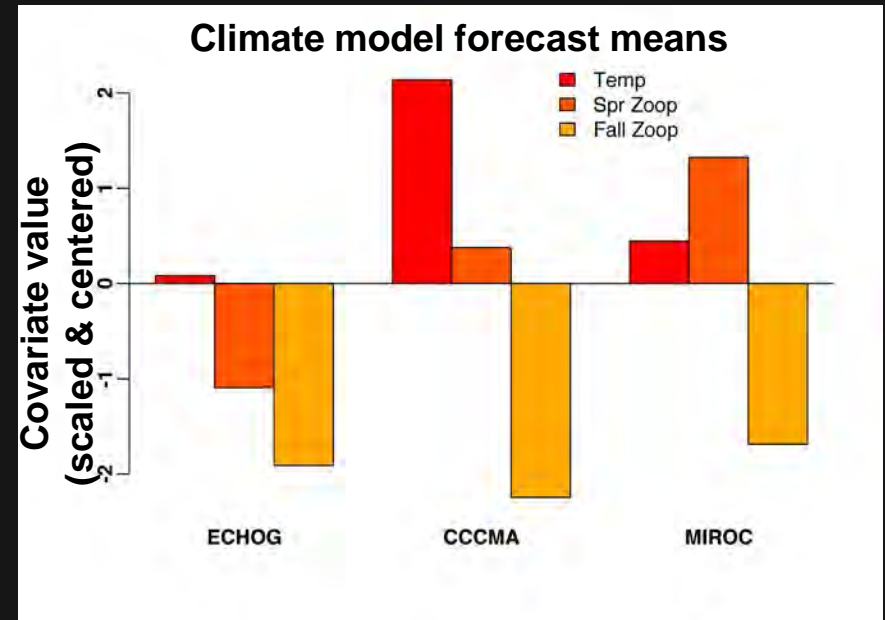
■ Bottom-up only (single species with covariates)



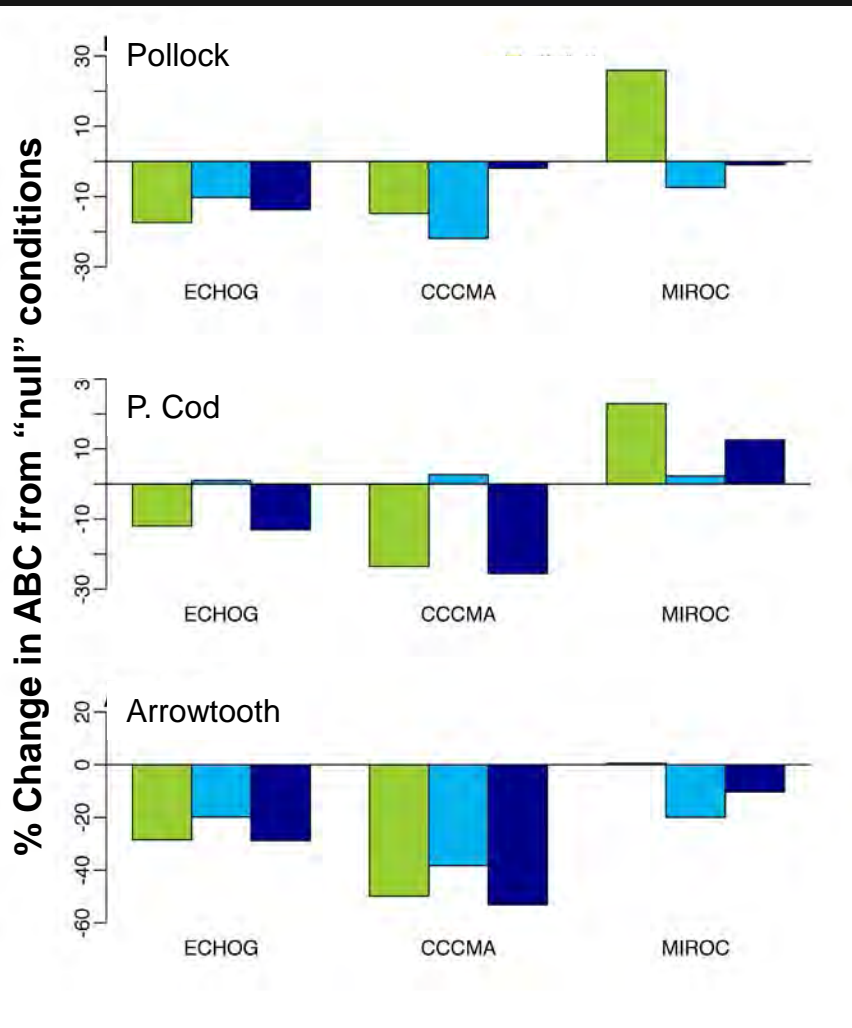
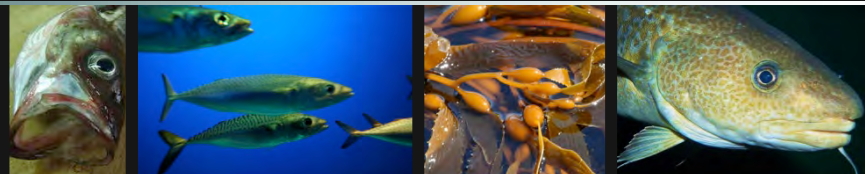
MSMt Projections



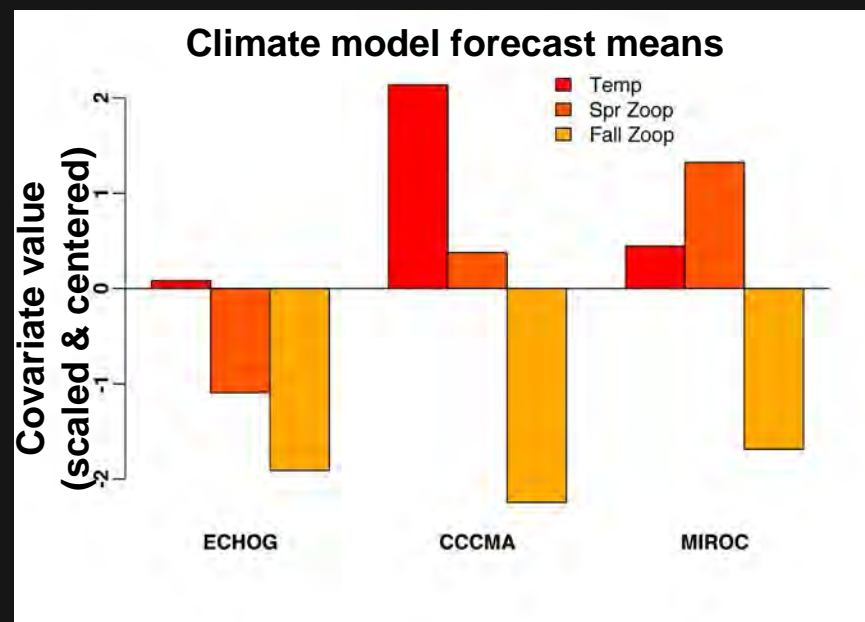
- Bottom-up only (single species with covariates)
- Top-down only (multi-species without covariates)



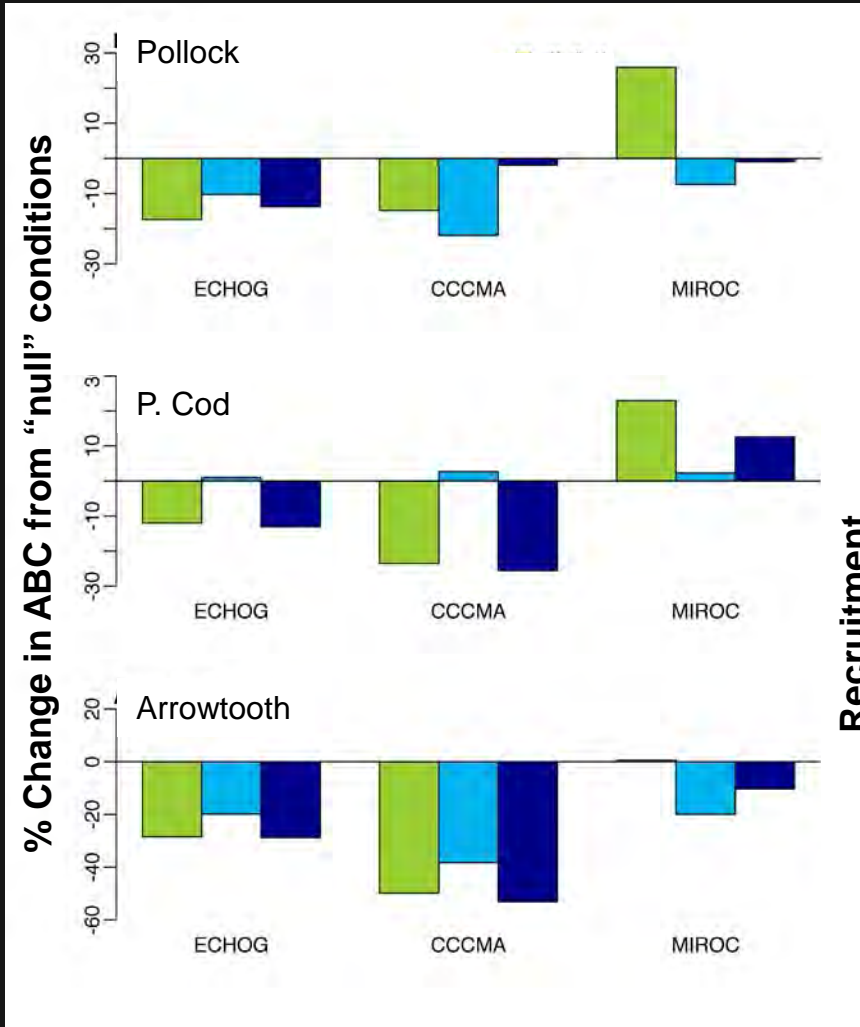
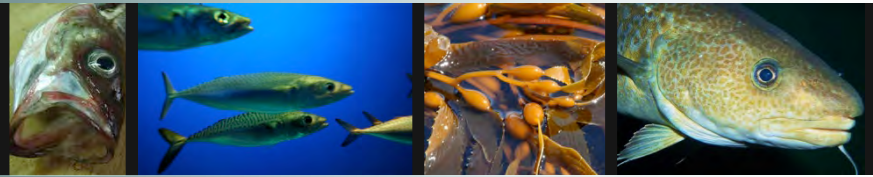
MSMt Projections



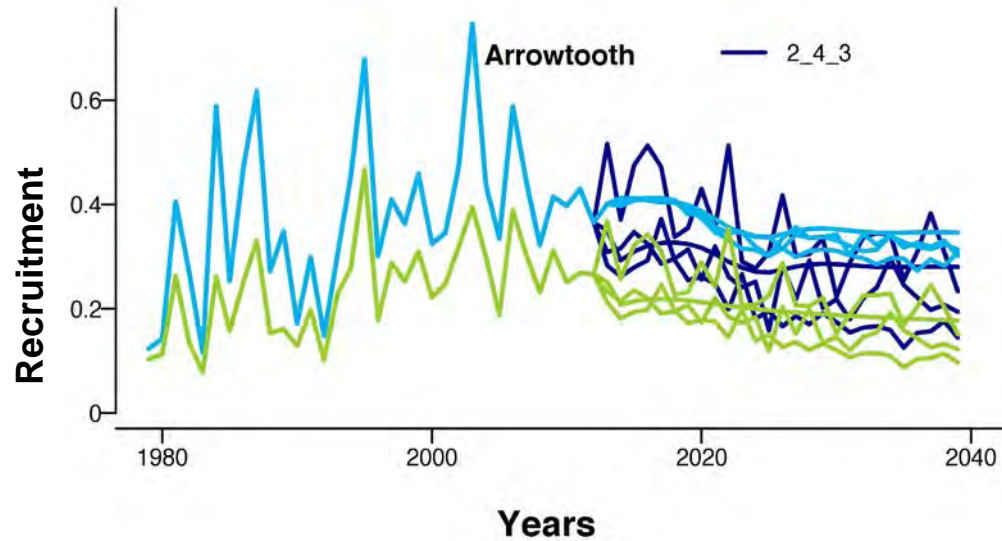
- Bottom-up only (single species with covariates)
- Top-down only (multi-species without covariates)
- Top-down & bottom-up (multi-species with cov.)



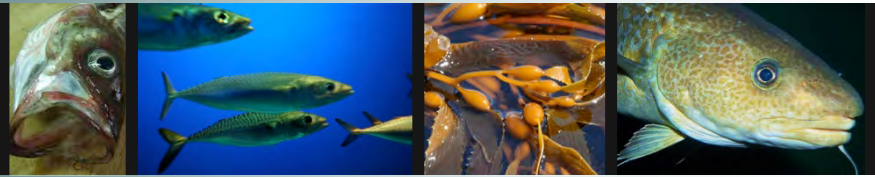
MSMt Projections



- Bottom-up only (single species with covariates)
- Top-down only (multi-species without covariates)
- Top-down & bottom-up (multi-species with cov.)



MSMt Single species



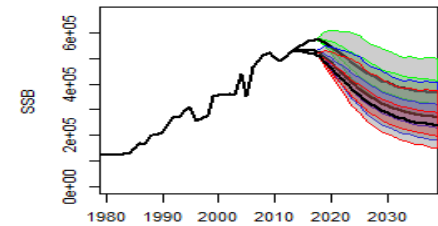
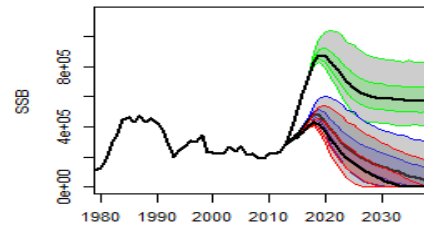
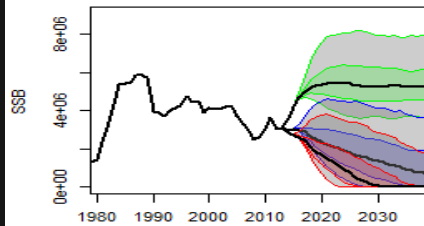
Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections

Pollock

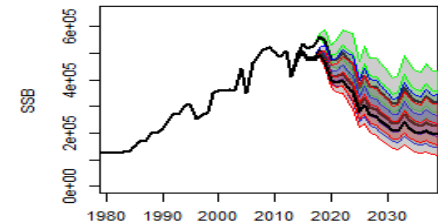
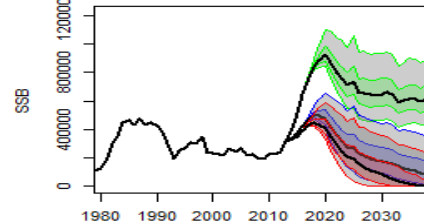
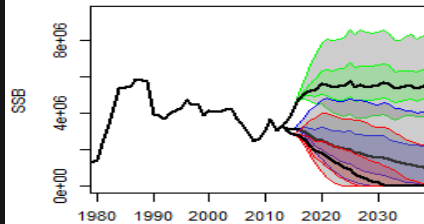
P. cod

Arrowtooth

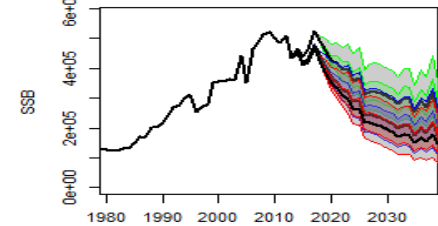
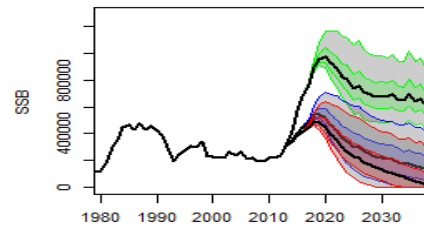
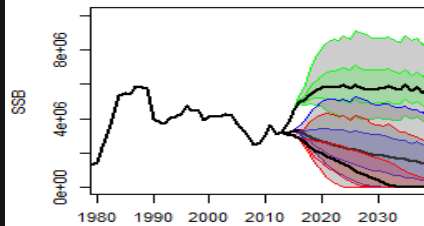
Avg Temp



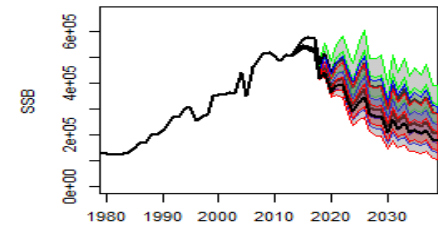
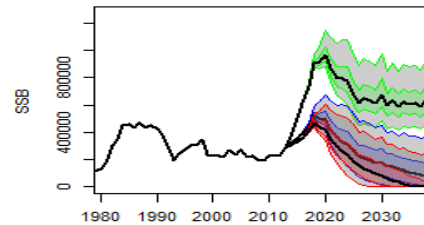
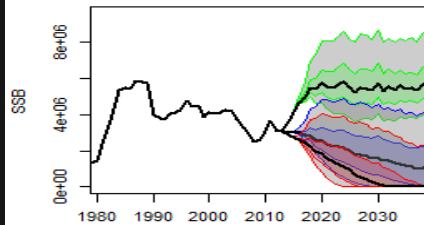
ECHOG



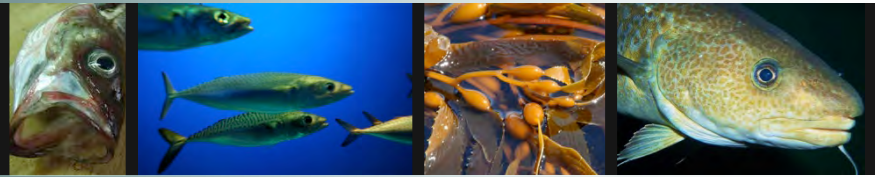
CCMA



MIROC



MSMt Multispecies



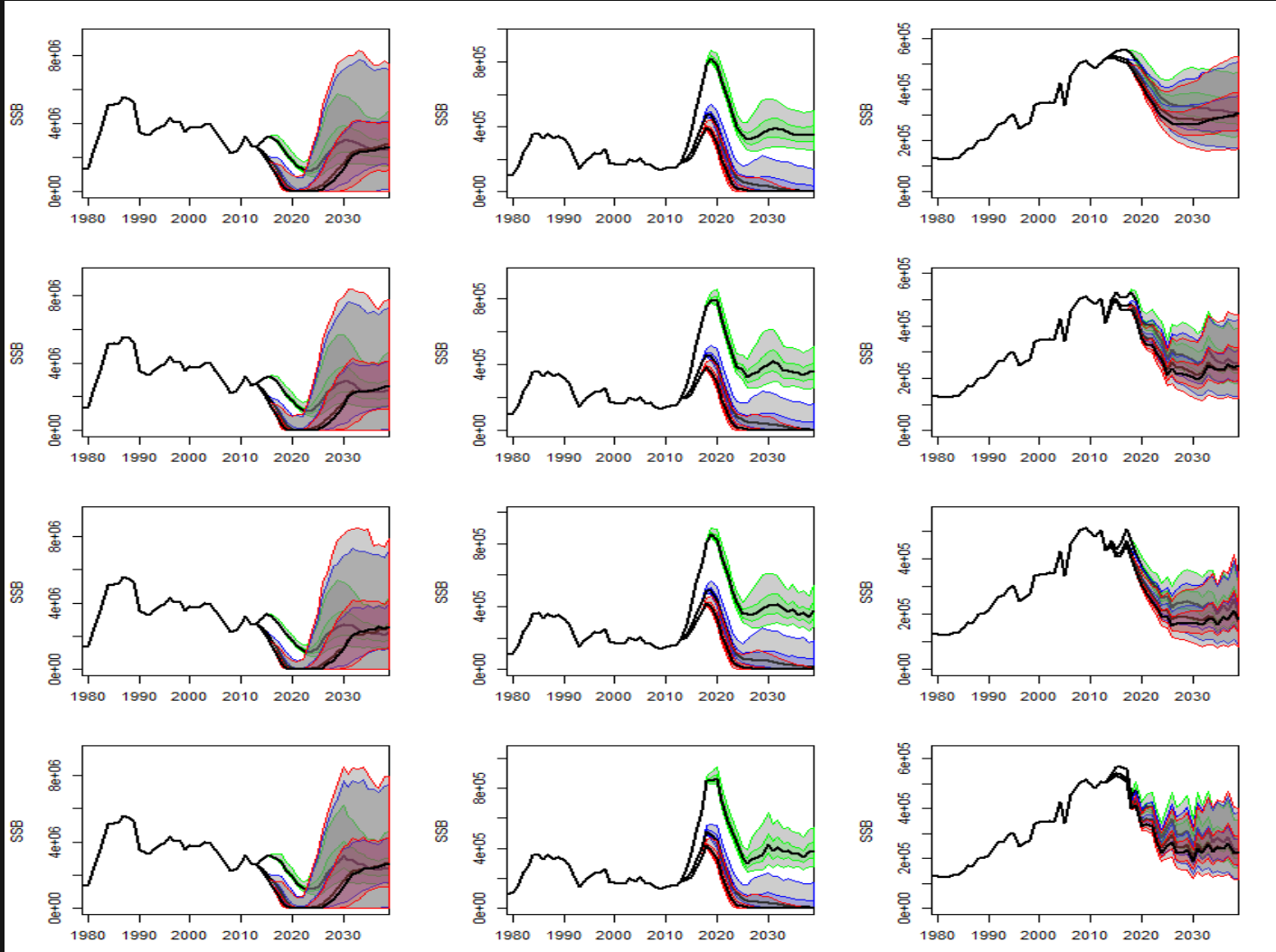
Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections

Pollock

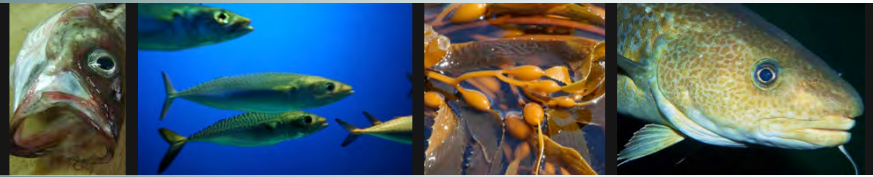
P. cod

Arrowtooth

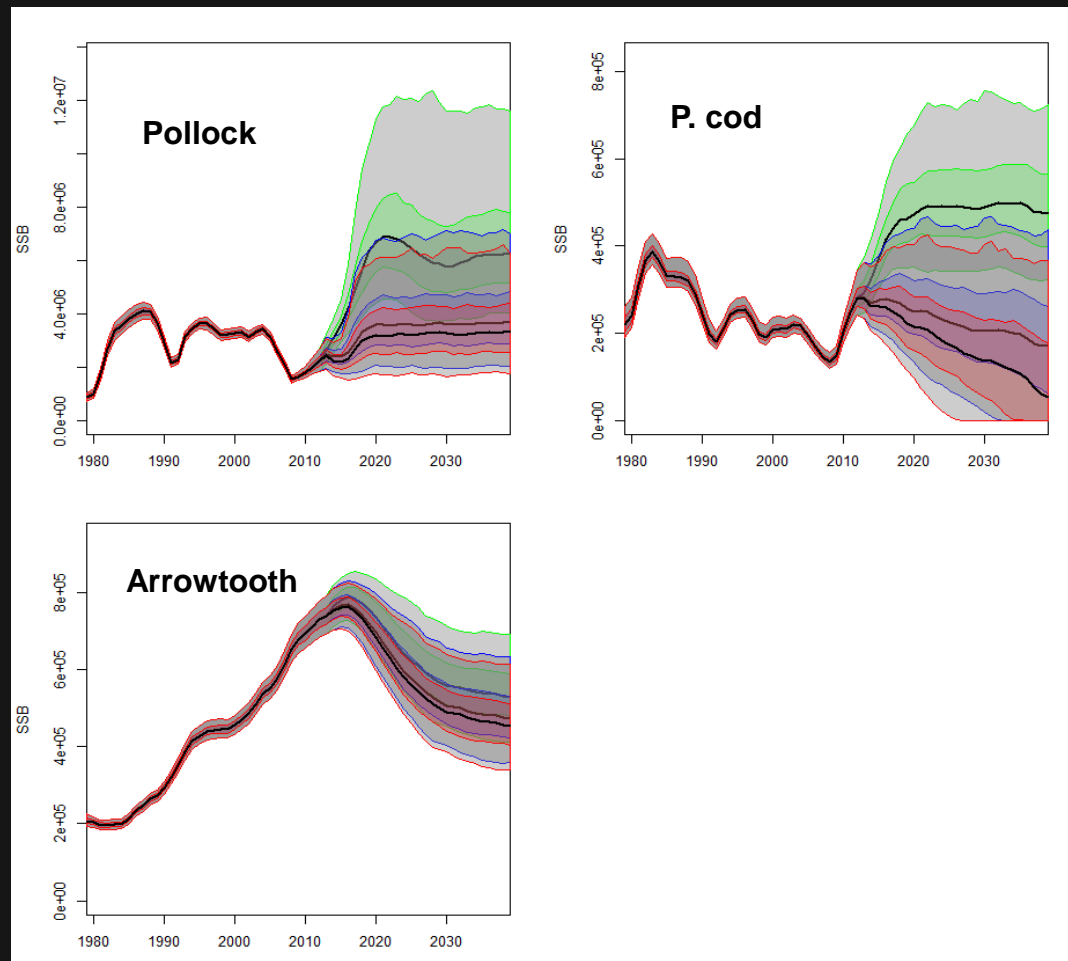
Avg Temp



Single species models

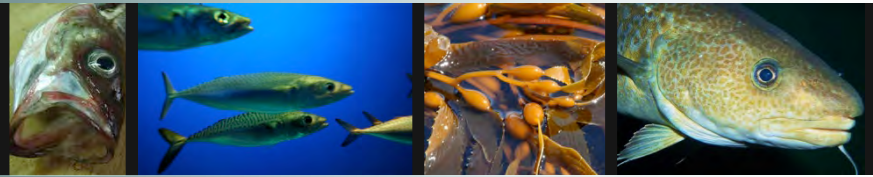


Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections



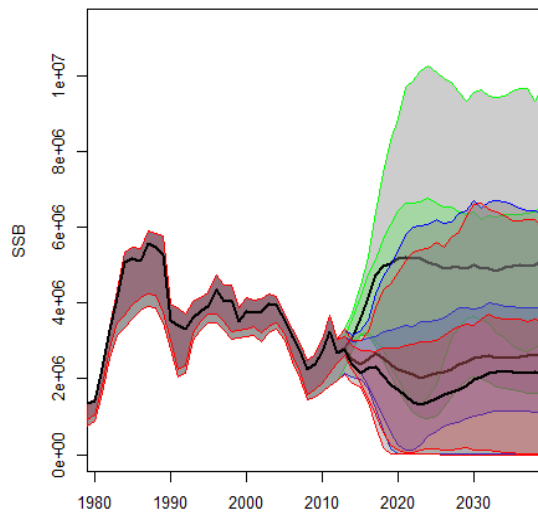
From Ianelli et al. *submitted*

Blended forecasts

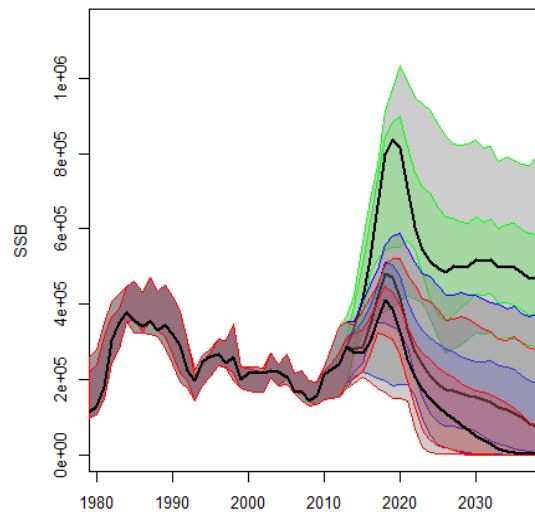


Introduction > MSMt: Methods > MSMt: Estimation > MSMt: BRPs > MSMt: R/S > MSMt: Projections

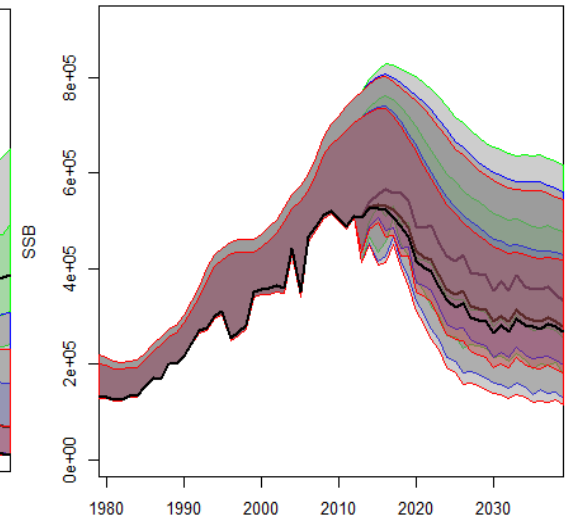
Pollock



P. cod

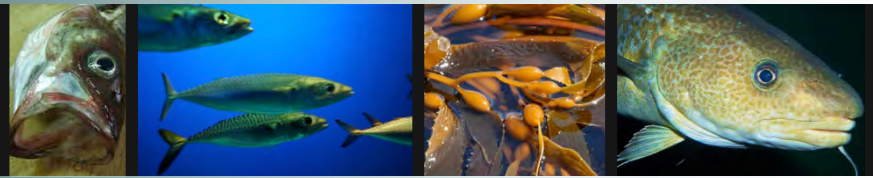


Arrowtooth



From Ianelli et al. *submitted*

Thanks!



“Behind these numbers lies, of course, an infinity of movements and of destinies.”

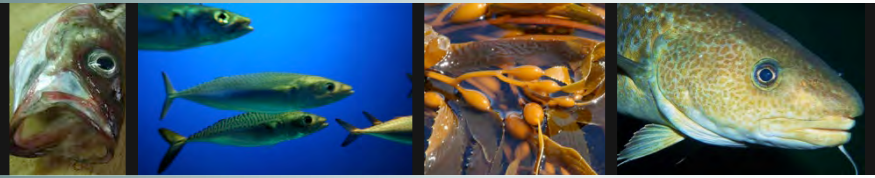
– von Bertalanffy 1938

...and of people!

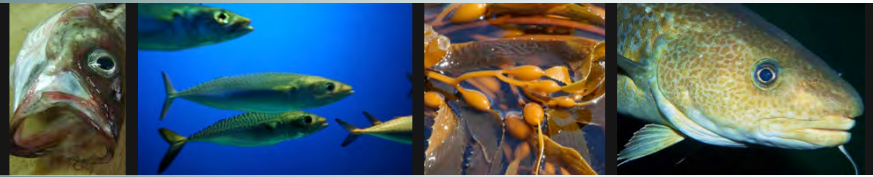


Kerim Aydin, Jim Ianelli, Brain Knoth,
Troy Buckley, Matt Baker, William
Stockhausen, Sarah Gaichas,
P.Sean McDonald, Ivonne Ortiz,
Stephanie Zador, Al Hermann,
Ivonne Ortiz, André Punt, Nick Bond,
Paul Spencer, Ingrid Spies

SPAM MUSUBI



CONCLUSIONS



Preliminary results!

- Climate projections of upper trophic level response should include bottom-up and top-down dynamics
- ABC of pollock may only slightly decline (?)
(2 of 3 models suggest no change over current conditions)
- ABC for P. cod may decline 10-20%
- ABC for arrowtooth may decline 30-50%
- Fisheries lose out: all ABCs declined under future climate conditions (except cod in the MIROC)