

ASSESSMENT OF THE DEMERSAL SHELF ROCKFISH STOCK COMPLEX IN THE SOUTHEAST OUTSIDE SUBDISTRICT OF THE GULF OF ALASKA:

A NEW STATE-SPACE SURPLUS PRODUCTION MODEL



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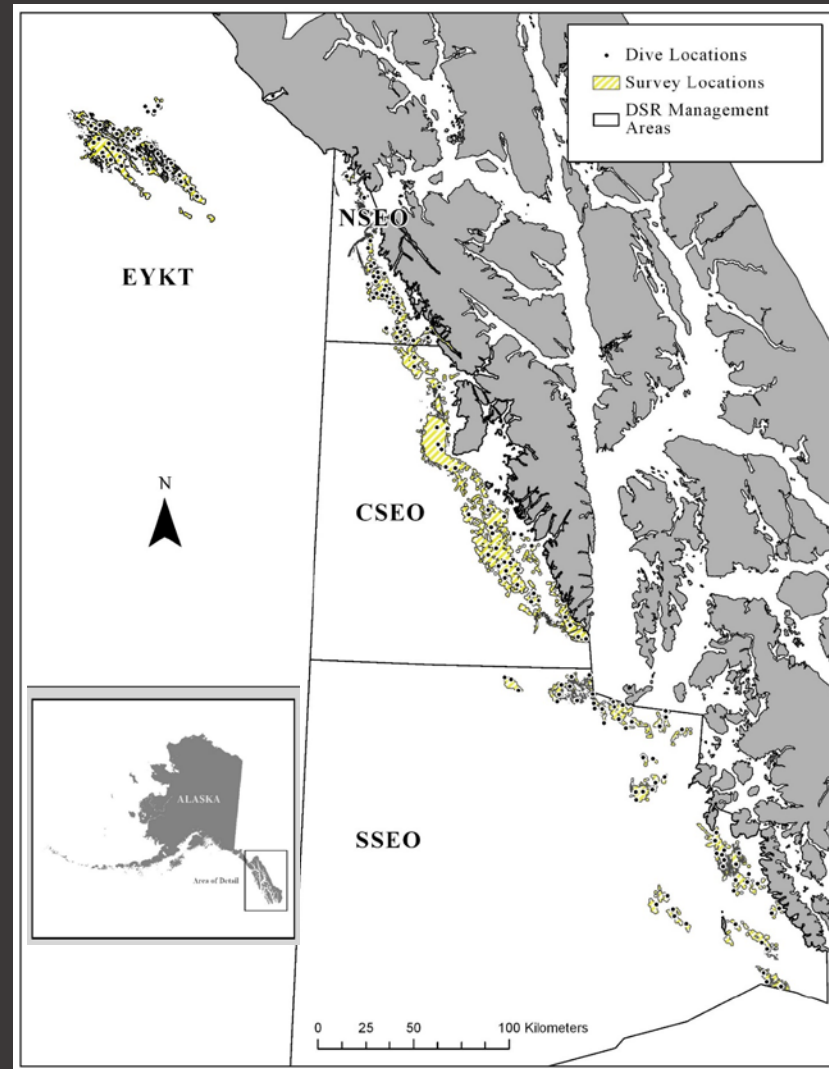
GOA Southeast Alaska Outside (SEO) Demersal Shelf Rockfish (DSR)

- DSR Complex: Yelloweye, quillback, copper, rosethorn, China, canary and tiger
 - Yelloweye: Tier 4
 - Other DSR: Tier 6
- Yelloweye > 95% DSR catch
- Managed by state of Alaska
- Management based on biomass estimates of yelloweye rockfish
- Directed commercial fishing closed since 2020
- Sport fishing restrictions since 2020



Current Management

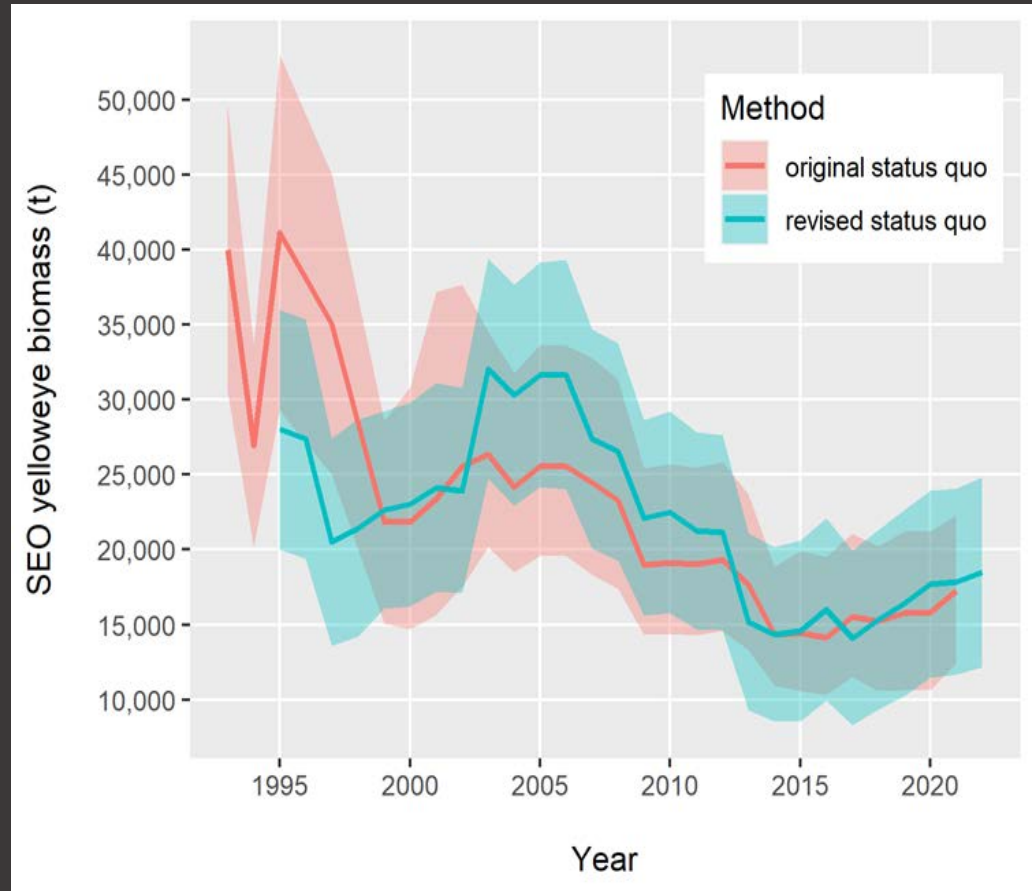
- Submersible/ROV surveys = Yelloweye **density** at management area level (1 area/ year)
- Biomass = Density*Weight*Habitat(km²)
- SEO Biomass = Σ (*most recent density estimates**updated weight data*Habitat)
- Assumed natural mortality M



- $F_{OFL} = M = 0.032$
- $\text{Max } F_{ABC} = M = 0.026$ * Lower 90% Confidence Interval
- $\text{Rec } F_{ABC} = M = 0.02$

Southeast outside (SEO) issues

- High variability at management unit and SEO scale
- Significant uncertainty in harvest reconstruction
 - Unreported discards and bycatch
 - Species ID and changing species assemblages



- Uncertainty in calculations?
- Amount of habitat
- Application of density to areas

SEO DSR Assessment History

- Status-quo methods for over a decade
 - Yearly justification of using lower 90% CI to establish targets
- Age-structured assessment attempted in 2015
 - Issues with fit, stability and uncertainty
 - High sensitivity to M
 - Lack of recruitment signals
- Random effects model in 2013 and 2015
 - Still aimed to use lower 90% CI
 - Greater uncertainty and lower targets than status-quo
 - Models rejected



Why a State-Space Surplus Production Model?

- Age-structured assessments are great!
 - Used for some Pacific rockfish
 - West coast yelloweye ->
 - Sparse and poorly informed data
 - Lack of recruitment signals
 - Sensitivity to steepness of productivity curve
 - Sensitivity to uncertainty in magnitude of catch
 - Similar issues in SEO
- SS-SPM: much simpler
 - Biomass = Biomass yesterday + increase in biomass (production curve) - catch



Why a State-Space Surplus Production Model?

- SS-SPM... they've come a long way!
- Process and observation error
- Bayesian methods
 - Propagate and incorporate uncertainty in data and parameters
 - Minimize assumptions
 - Relatively unbiased and precise
 - Probabilistic population projections and risk analysis
- Better than random effects models
 - Population vs. statistical model
 - Incorporates catch data
 - Biological reference points (MSY , B_{MSY} , F_{MSY})



Why a State-Space Surplus Production Model?

- Applicable to long lived, slow growing animals
 - Minimal process error
- Lack of recruitment signals in yelloweye
 - Simplicity of SPM reflects those dynamics
 - Lack of recruitment signal challenge for ASA
- Lots of uncertainty in catch history of yelloweye
 - Bycatch in halibut and other fisheries
 - Lack of accurate species identification/recording

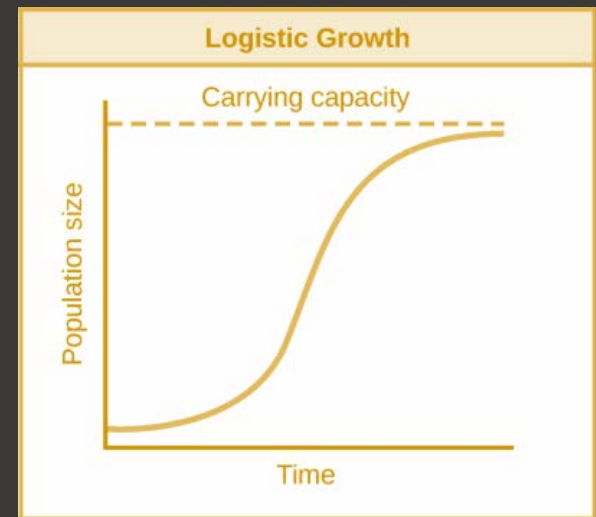


Model	Data	Estimated Parameters	Benefits
Status-quo	Density Estimates Fish weights	None	
Random effects model (REMA)	Biomass est. + CV IPHC survey CPUE + CV	<ul style="list-style-type: none"> • Process error • Additional observation error 	<ul style="list-style-type: none"> • Simple • Increased stability in biomass estimates • More consistent apportionment by area
SS-SPM	Biomass est. + CV IPHC survey CPUE + CV Catch data + CV Discard Estimates + CV	<ul style="list-style-type: none"> • R, K, ϕ, etc. (model parameters) • MSY • B_{MSY} • F_{MSY} 	<ul style="list-style-type: none"> • Increased stability in biomass estimates • More consistent apportionment by area • Population dynamics • Biological reference points • Population projections • Risk analysis • Uses more data

Production Models

Pella-Tomlinson $B_t = B_{t-1} + \frac{r}{p} B_{t-1} \left(1 - \left(B_{t-1}/K \right)^p \right) - C_{t-1}$

- $B_{msy} = B_{40}$ ($p = 0.18815$)
- r = intrinsic rate of increase
- K = carrying capacity/ virgin biomass



Production Models

Pella-Tomlinson
$$B_t = B_{t-1} + \frac{r}{p} B_{t-1} \left(1 - \left(\frac{B_{t-1}}{K} \right)^p \right) - C_{t-1}$$

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- r = intrinsic rate of increase
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Bayesian state-space model

- Accommodates missing data
- Process error: $(model)e^{\varepsilon_t - (\sigma_{proc}^2/2)}$; $\varepsilon_t \sim N(0, \sigma_{proc}^2)$
- Propagate and incorporate uncertainty (observation error)
- Risk analysis with population projections

Production Models

$$\text{Pella-Tomlinson } B_t = B_{t-1} + \frac{r}{p} B_{t-1} \left(1 - \left(B_{t-1}/K \right)^p \right) - C_{t-1}$$

- $B_{MSY} = B_{40}$ ($p = 0.18815$)
- r = intrinsic rate of increase
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Biological Reference Points:

$$MSY = r * K / (p + 1)^{(p+1/p)}$$

$$B_{MSY} = 0.4 * K$$

$$F_{MSY} = MSY / B_{MSY}$$

$$F_{MSY} \approx M$$

$$F_{OFL} = F_{MSY}$$

(shortraker rockfish
SPM; Spencer and
Reuter 2008)

Production Model Data

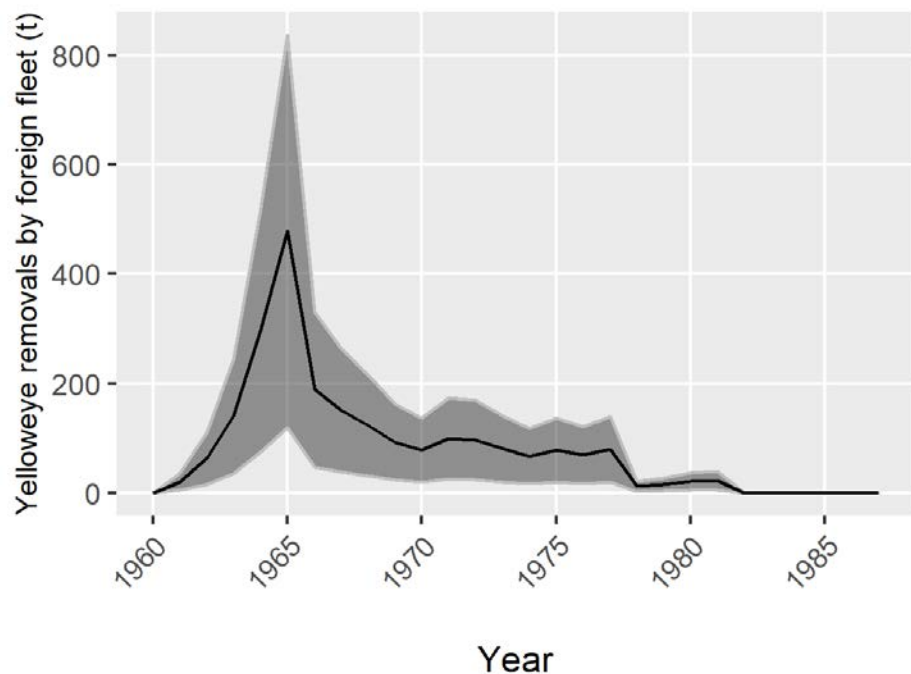
BIOMASS INDICES

- ADF&G Submersible/ROV surveys
 - Sporadic; 1994 to present
 - Management area spatial scale
 - Absolute biomass
- IPHC longline survey CPUE (1998-pres.)
 - Numbers-per-hook
 - Management area spatial scale

Production Model Data

CATCH DATA

- Known Catches (1980-2022)
- Bycatch estimates in halibut fishery (1880 – 2022)
- Estimates of Foreign Fleet removals (1960-1982)



Unobserved discard model



- Unreported discards in halibut fishery likely to be large source of historical removals
- Halibut fishery became full retention in 2000 in state waters and 2005 in federal waters
- **Expected bycatch** in halibut fishery modelled using IPHC longline survey (1998-present) = **WCPUE rate**
- Use **WCPUE** to model **unobserved discards**

$$B_t = B_{t-1} + rB_{t-1}\left(1 - \frac{B_{t-1}}{K}\right) - C_{t-1}$$

- **Known catches + unobserved discards**

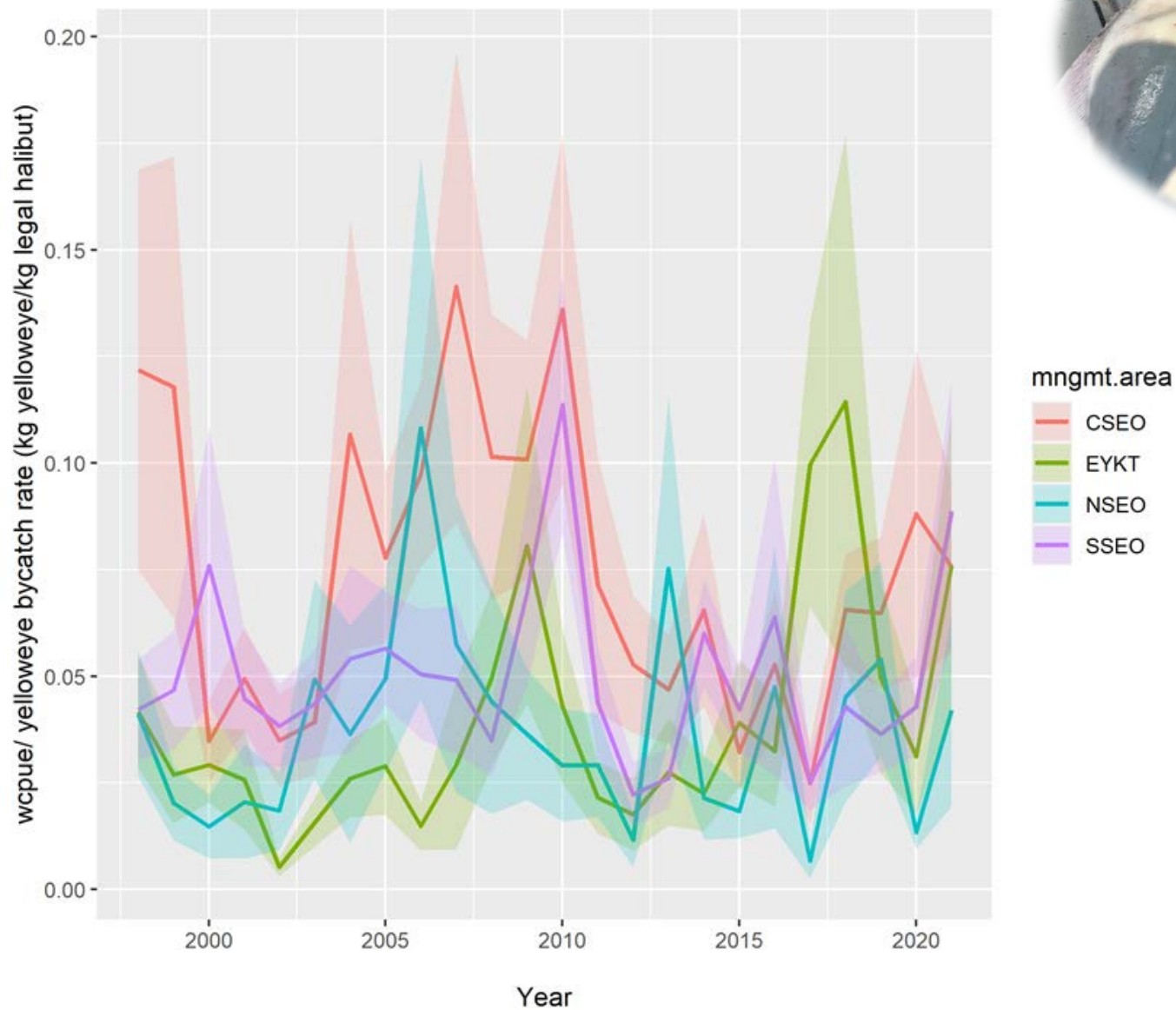


Unobserved discard model



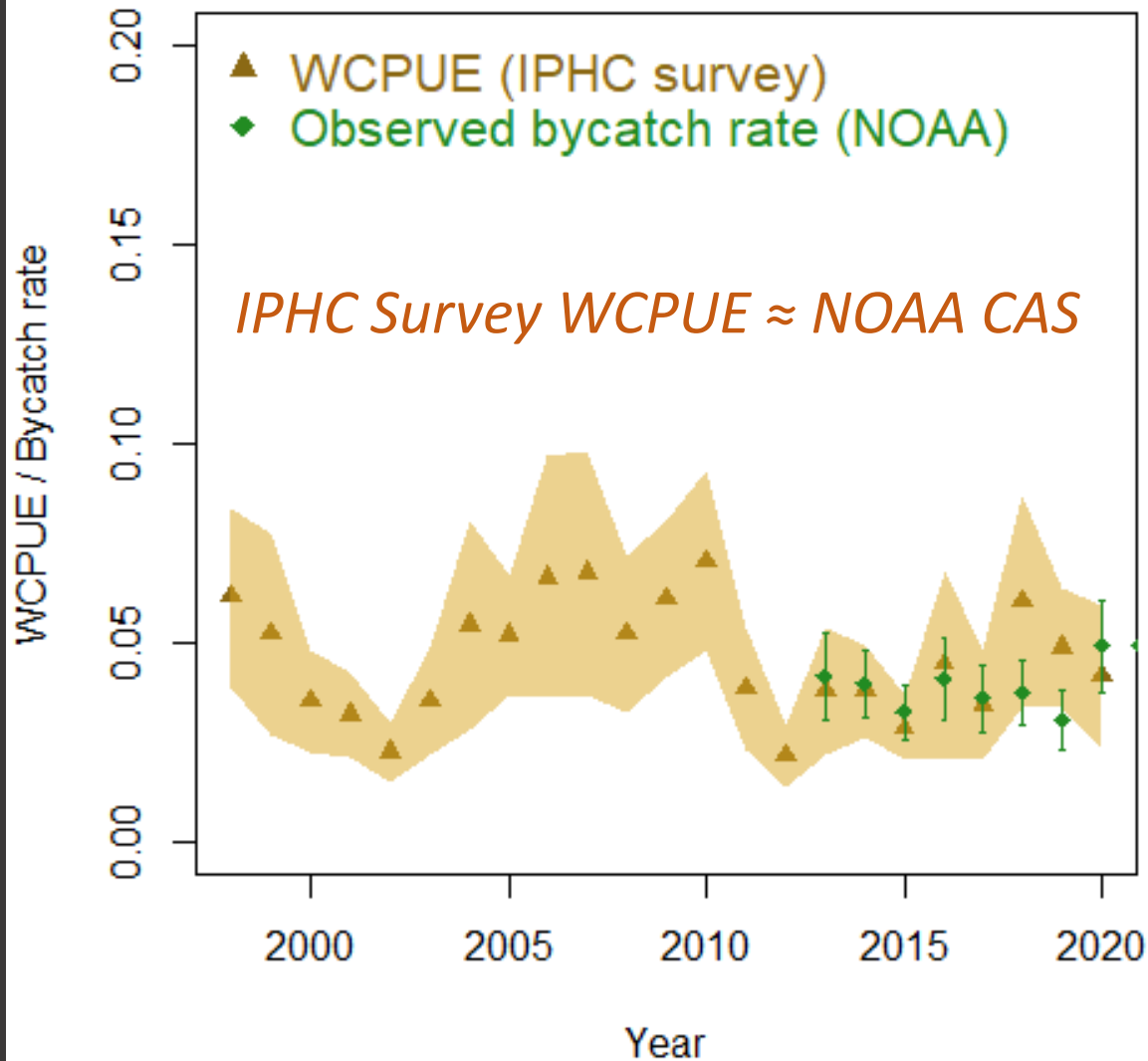
- Total catches: $C_t = \hat{C}_t^K + \hat{D}_t$ Known Catches + Discards
- Known Catches: $\hat{C}_t^K = C_t^K e^{\epsilon_{Ct}}$
- Landed Bycatch: $landBy_t$ (modelled without error)
- **Expected bycatch** fit to IPHC derived estimate : $\widehat{EBy}_t = EBy_t e^{\epsilon_{EByt}}$
 - IPHC longline survey: # yelloweye & kg legal halibut (1998-2021)
 - WCPUE at each survey station = est. kg yelloweye / kg legal halibut
 - WCPUE in management area = mean of stations (cv from bootstrap of stations)
 - $\widehat{EBy}_t = \text{Halibut harvest} * \text{WCPUE}$ (variance propagated)
 - pre-1998: applied long term mean and max cv from 1998-2021 data
- Discards $\hat{D}_t = \max(\widehat{EBy}_t - landBy_t, \min(D_t))$

WCPUE bycatch



WCPUE vs. NOAA CAS

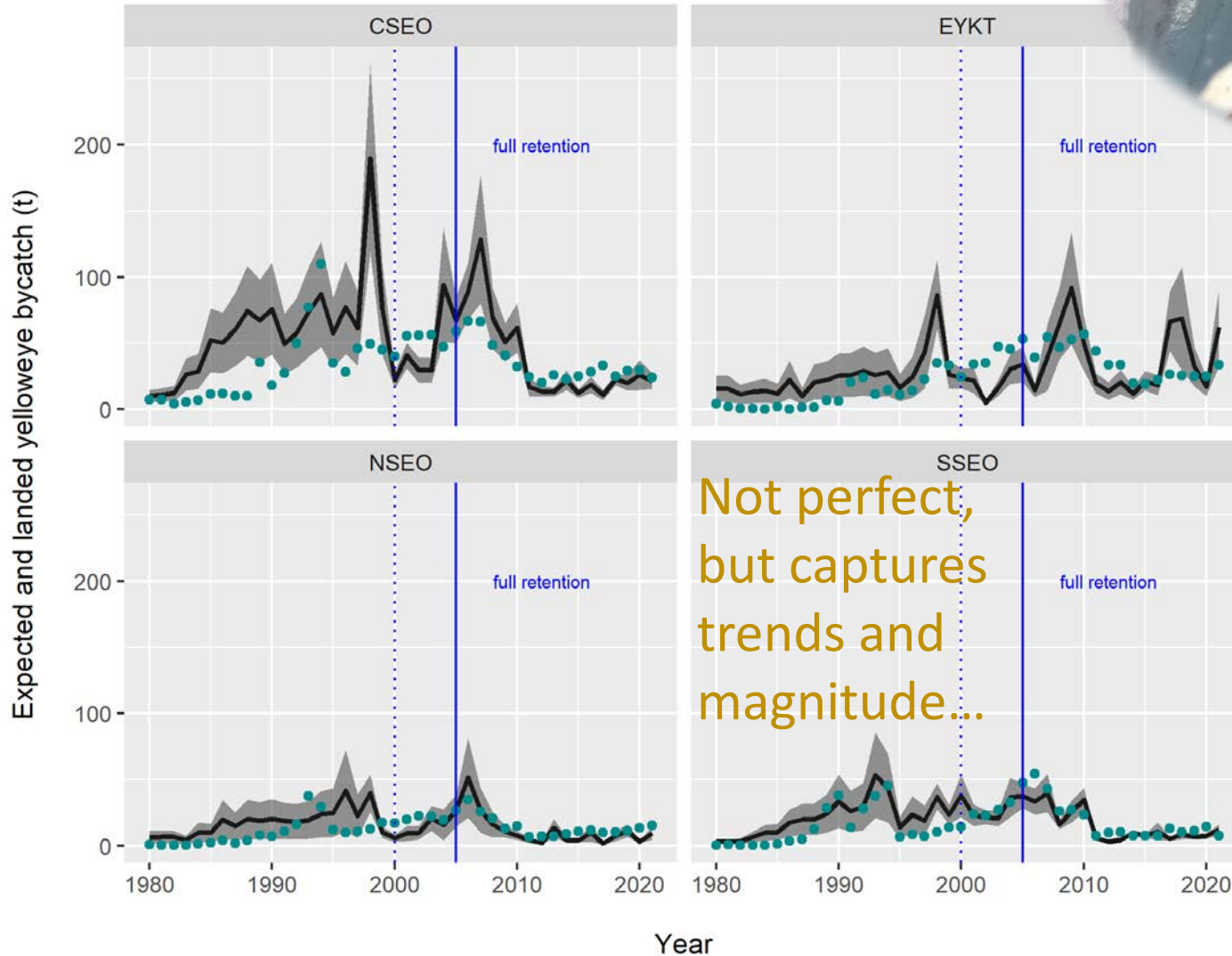
(Catch accounting system)



WCPUE vs. landed bycatch



colour — expected bycatch — landed bycatch



3 Stage Model Strategy



- Different spatial scales to deal with
 - 1980 – now: 4 management areas
 - Pre-1980: SEO level catch data
 - Halibut harvests
 - Foreign removals
 - Stage 1 and 2 used to produce informative priors for Stage 3
- Stage-1: Spatially stratified 1980 – 2022
 - Uninformative priors
 - **Posterior estimates of SEO biomass for Stage-2**
- Stage-2: Unstratified SPM on entire SEO 1880 – 2022
 - Virgin biomass in 1880
 - Uninformative priors
 - **Produce priors on K and ϕ for Stage-3**
- Stage-3: Spatially stratified 1980 – 2022 with original data
 - Informed prior on SEO K and ϕ → Management area K_s and ϕ_s

Production Models

- First year biomass, $B_{1980} = \phi K$ Absolute biomass
- Submersible/ROV surveys, $B_{obs_t} = B_t e^{\epsilon_{S_t}}$
 - $\{\epsilon_{S_t}\} \sim N(0, \sigma_{B_{obs_t}}^2)$; $\sigma_{S_t}^2 = \ln((CV(B_{obs_t}))^2 + 1)$
 - Submersible surveys 1994-2011:
 - $CV(S_t) = \sqrt{CV(B_{obs})^2 + \tau^2}$ Extra variance Less Weight
 - ROV surveys 2012 – 2022
 - $CV(S_t) = \sqrt{CV(B_{obs})^2}$ No extra variance More Weight
- IPHC Survey RPN (CPUE), $I_t = q B_t e^{\epsilon_{I_t}}$ Index
 - $\{\epsilon_{I_t}\} \sim N(0, \sigma_{I_t}^2)$; $\sigma_{I_t}^2 = \ln((CV(I_t))^2 + 1)$
 - $CV(I_t) = \sqrt{CV(B_{obs})^2 + \tau^2}$ Extra variance Less Weight

Production Models

- Halibut fishery changed from derby style to IFQ in 1995
 - Were bycatch rates different?
- Extra variance in pre-IFQ halibut fishery
 - Multiplicative lognormal error:
 - Discards, $D_{s,t} = \widehat{EB}y_{s,t} e^{\varepsilon_{s,t}^D - (\sigma_{derby}^2/2)} - landBy_{s,t}$; $\varepsilon_{s,t}^D \sim N(0, \sigma_{derby}^2)$
 - with $\sigma_{derby}^2 = 0.1$
- **Risk Analysis**: Expected bycatch rate biased **high** or **low** relative to “true” bycatch in pre-IFQ halibut fishery
 - Biased low: $\varepsilon_{s,t}^D \sim N(0.3, \sigma_{derby}^2)$
 - Biased high: $\varepsilon_{s,t}^D \sim N(-0.3, \sigma_{derby}^2)$

Stage-1 priors

- $R \sim \text{beta}(1, 1)$
- $r_s \sim \text{beta}(rB1, rB2) T(0.0001, 0.2)$
 - $rB1 = R * \eta$
 - $rB2 = (1-R) * \eta$
 - $\text{Log}(\eta) \sim \text{logis}(\text{log}(100), 1)$
- $\ln K_s \sim \text{unif}(7, 11.5)$
- $\phi_s \sim \text{beta}(1, 1)$
- $\tau_s \sim \text{unif}(0.01, 1)$
- $\tau_l \sim \text{unif}(0.01, 1)$
- $\ln(q_s) \sim \text{unif}(-10, 20)$
- $\ln(\text{process error variance}) \sim \text{unif}(-10, -3)$

Uninformative

Constrained
Max $\sigma_{\text{proc}} = 0.22$

Stage-2 priors

- $R \sim \text{beta}(1, 1)$
- $\ln K \sim \text{unif}(7, 11.5)$ **Uninformative**
- $B_{1880} = K$
- Two levels of process error:
 - Moderate process error models: $\text{unif}(-10, -3)$, $\max \sigma_{\text{proc}} = 0.22$
 - Minimal process error models: $\text{unif}(-10, -5)$, $\max \sigma_{\text{proc}} = 0.08$
- Run under different assumptions about how true bycatch in halibut fishery related to WCPUE estimates
 - Different priors for Stage-3 and risk analysis

Stage-3 priors

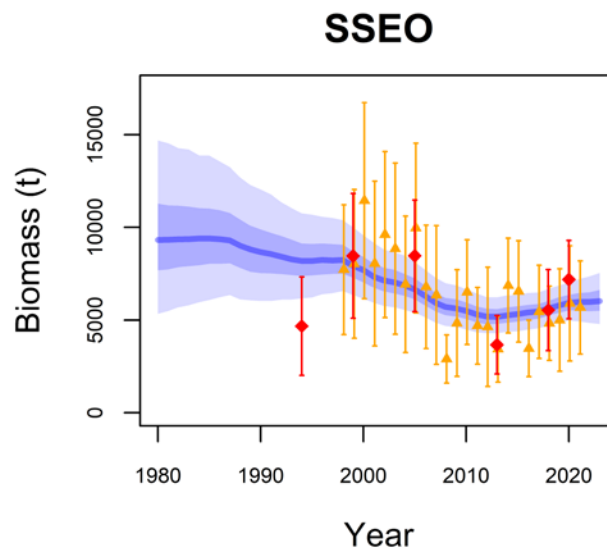
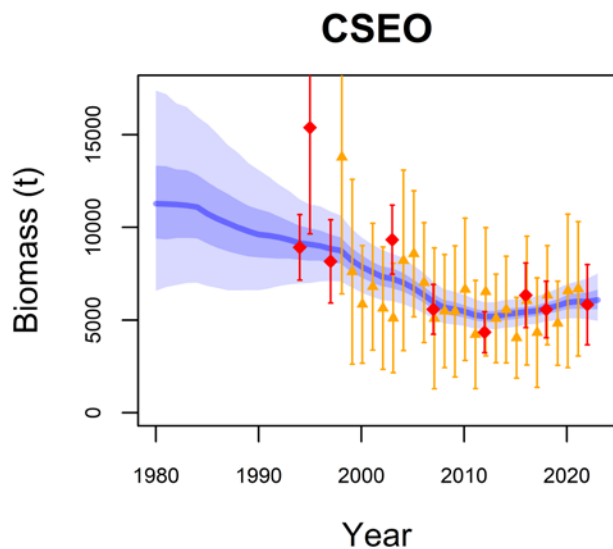
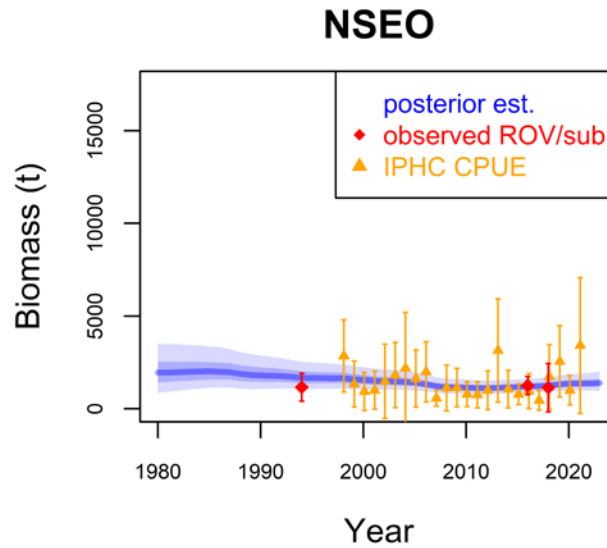
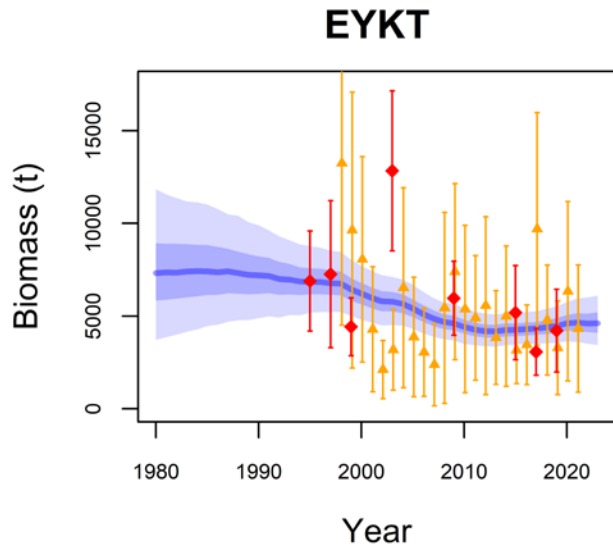
- $R \sim \text{beta}(1, 1)$ + Informed priors from Leslie matrix projection
- $r_s \sim \text{beta}(rB1, rB2) T(0.0001, 0.2)$
 - $rB1 = R * \eta$
 - $rB2 = (1-R) * \eta$
 - $\text{Log}(\eta) \sim \text{logis}(\text{log}(100), 1)$
- $K \sim \text{Inorm}(X, X)$ ← Hyper priors from Stage-2; varies with derby bias and process error
- $K_s = K * pi_s$
 - $pi_s \sim \text{Dirichlet}(1, 1, 1, 1)$
- $\phi \sim \text{norm}(X, X)$ ←
- $\phi_s \sim \text{norm}(\phi, \text{invtau})$
 - $\text{invtau} \sim \text{gamma}(1, 1)$
- $\tau_s \sim \text{unif}(0.01, 1)$; $\tau_1 \sim \text{unif}(0.01, 1)$
- $\ln(q_s) \sim \text{unif}(-10, 20)$
- $\ln(\text{process error variance}) \sim \text{unif}(-10, -3)$ OR $\text{unif}(-10, -5)$

Production Models

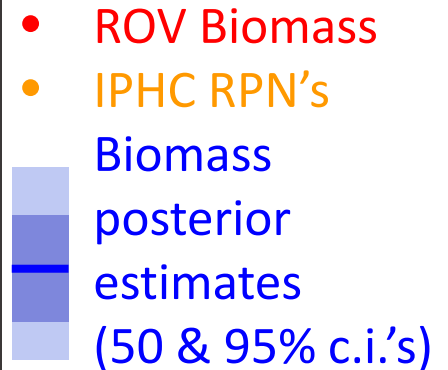
Run in jags; 3 Chaines

- Stage-1: 500k burnin, 900k chain, thinned every 900
- Stage-2: 640k burnin, 960k chain, thinned every 960
- Stage-3: 500k burnin, 1m chain, thinned every 1000
- Goodness-of-fit:
 - Posterior predictive checks $P \sim 0.5$
 - Systematic discrepancies between observed and predicted
- Convergence checks
 - Gelman-Rubin statistics < 1.01
 - Traceplots
 - Autocorrelation plots

Stage-1 (Goal: SEO biomass for Stage-2)



- IPHC CPUE ~ Biomass ests.
- A lot of uncertainty
- Minor convergence issues – no effect on posteriors

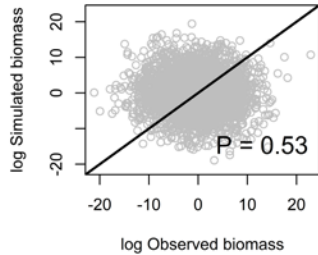
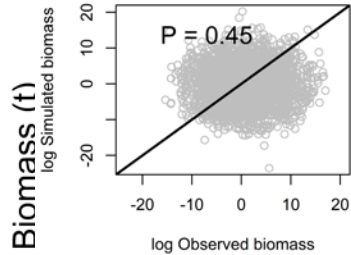


Stage-1 (Goal: SEO biomass for Stage-2)

Posterior predictive check for submersible/ROV biomass

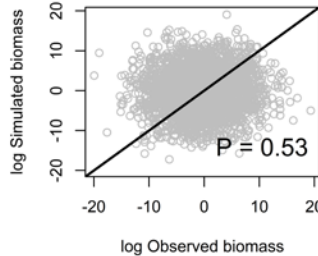
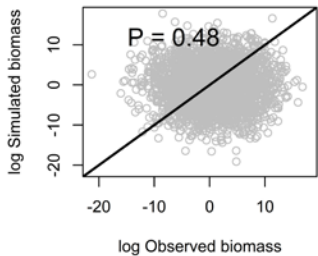
EYKT

NSEO



CSEO

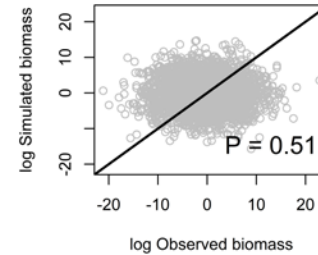
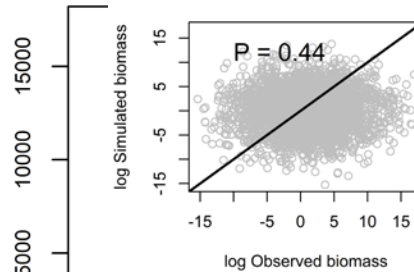
SSEO



Posterior predictive check for IPHC CPUE

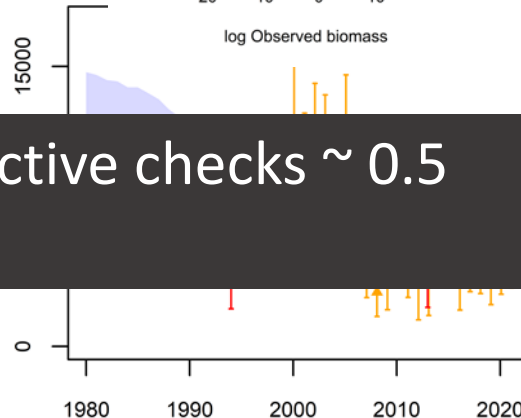
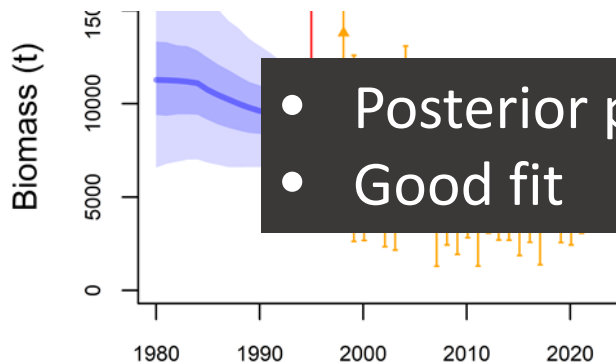
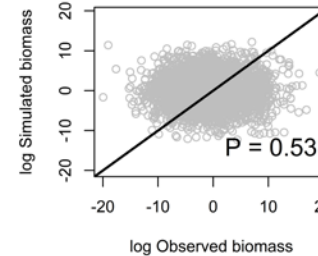
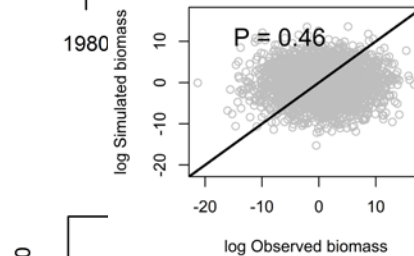
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NSEO



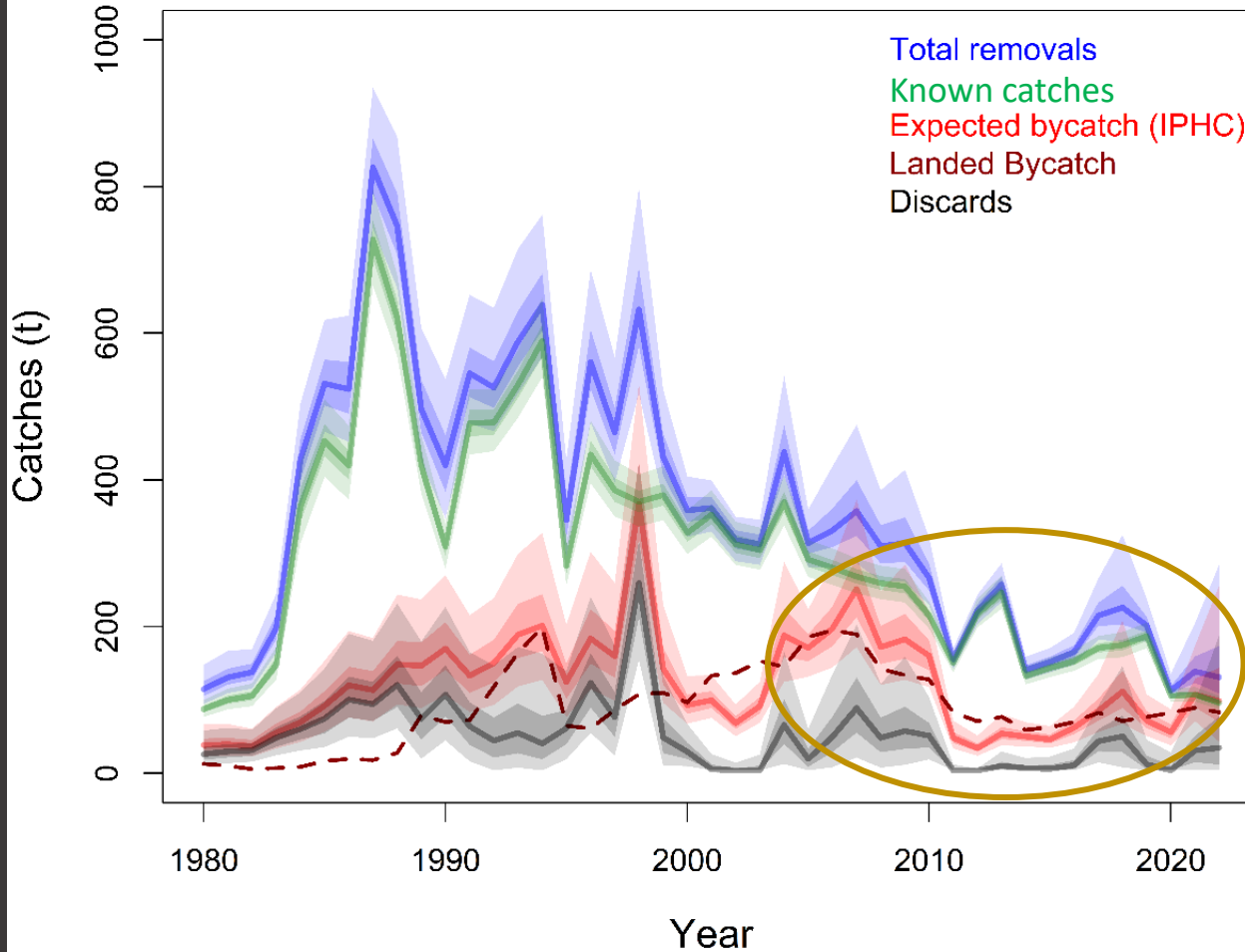
CSEO

SSEO

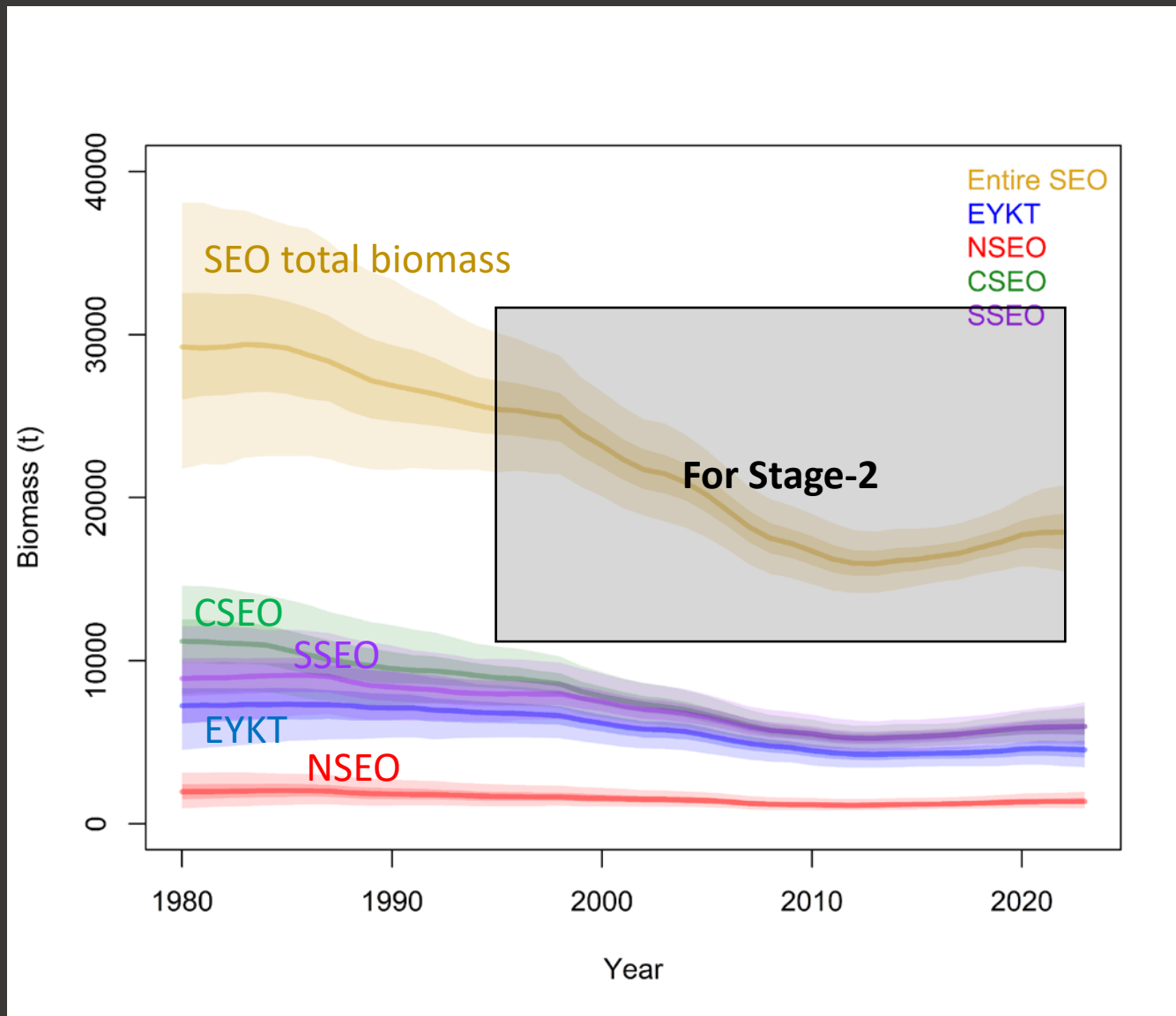


- Posterior predictive checks ~ 0.5
- Good fit

Stage-1 (Goal: SEO biomass for Stage-2)

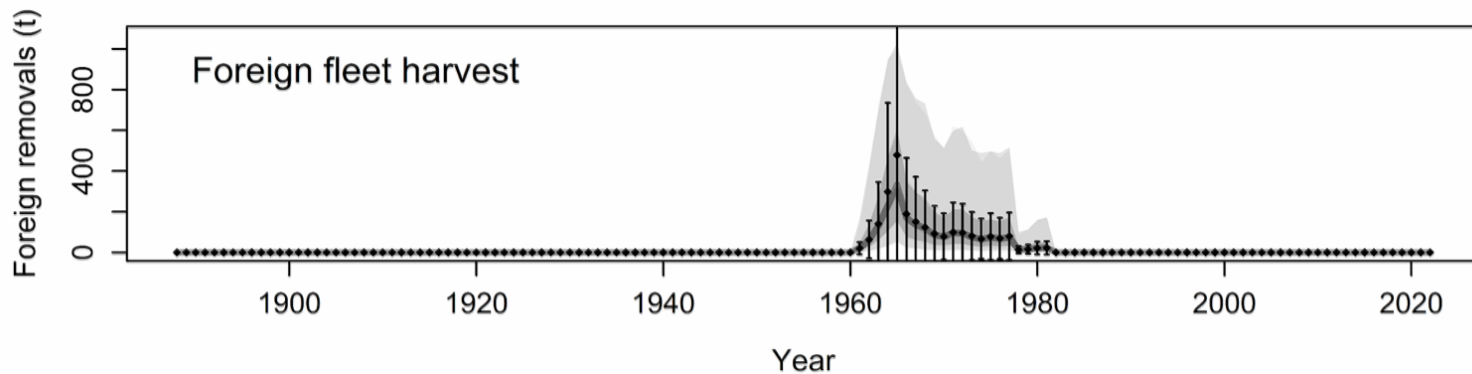
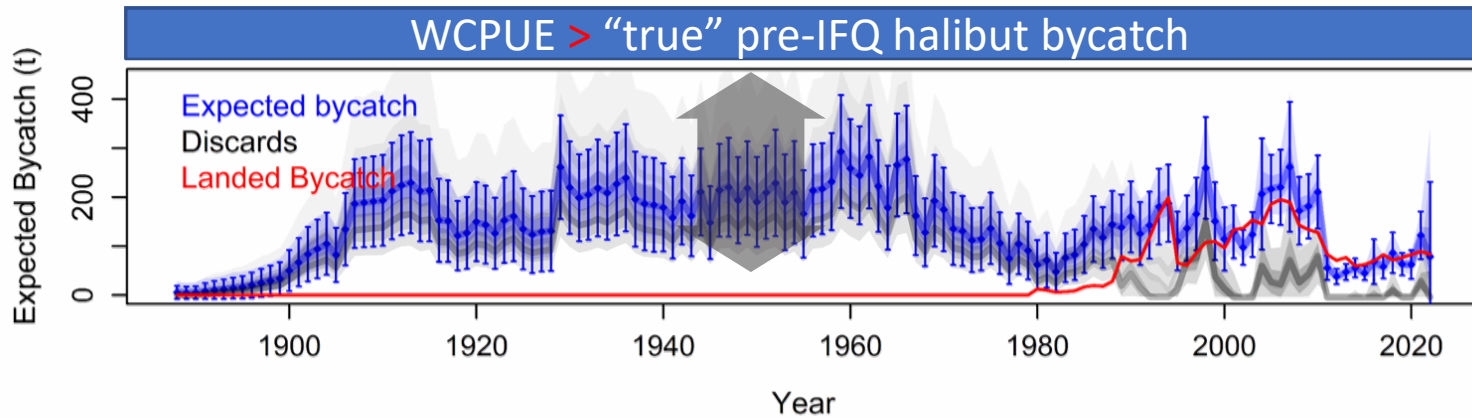
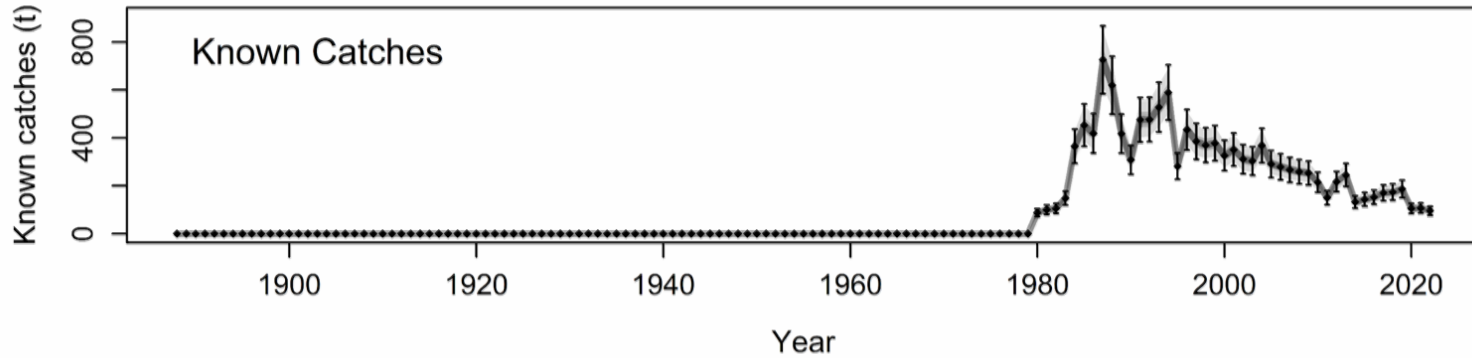


Stage-1 (Goal: SEO biomass for Stage-2)



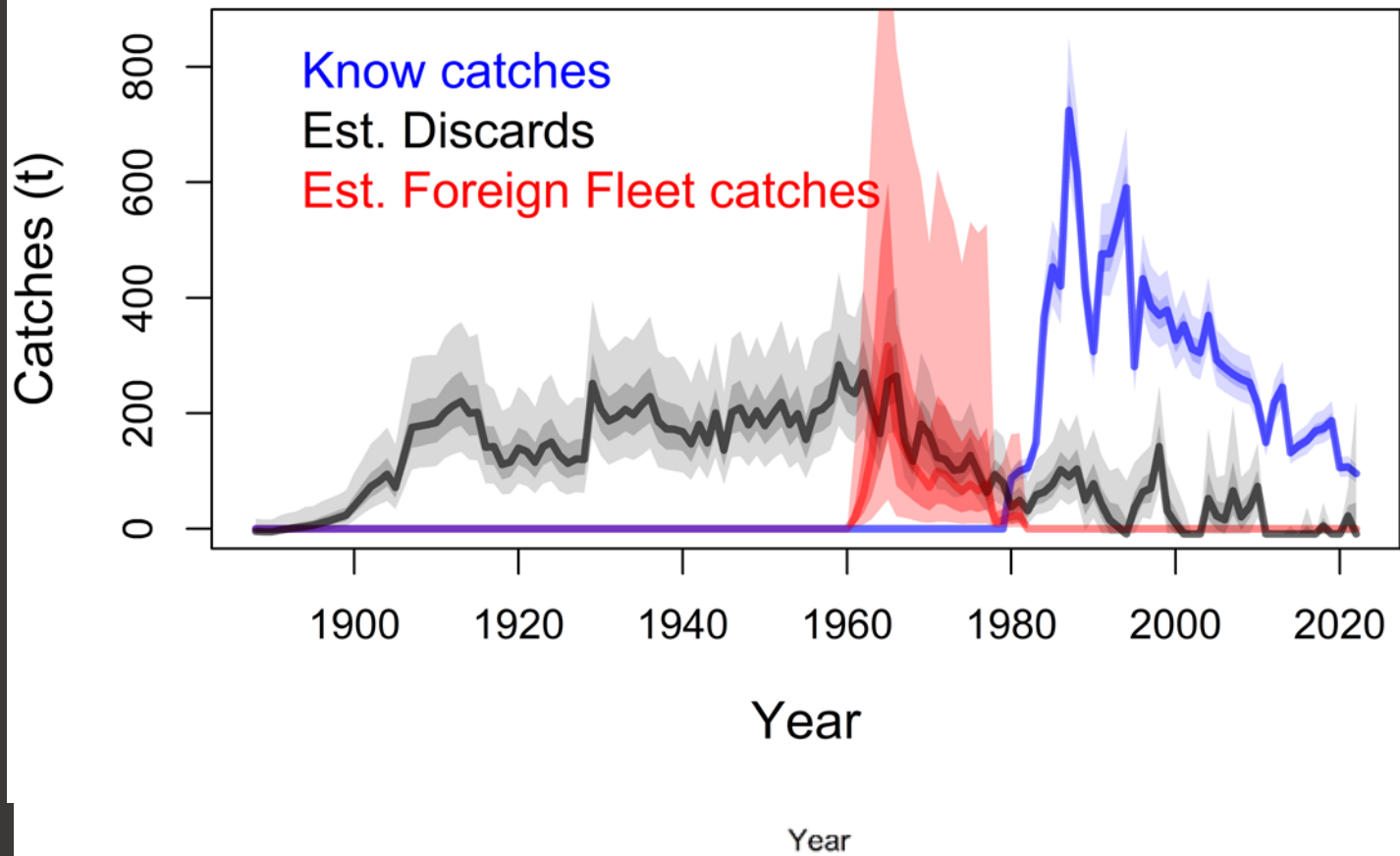
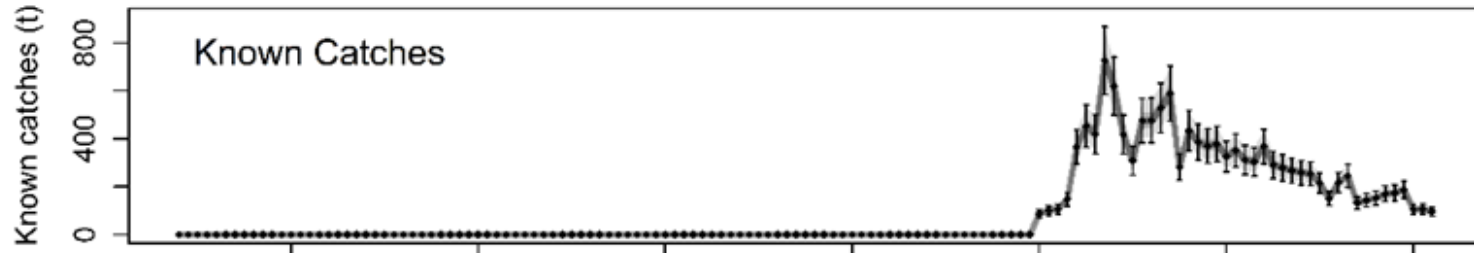
- From Management Area biomass to SEO biomass

Catch Data Fit



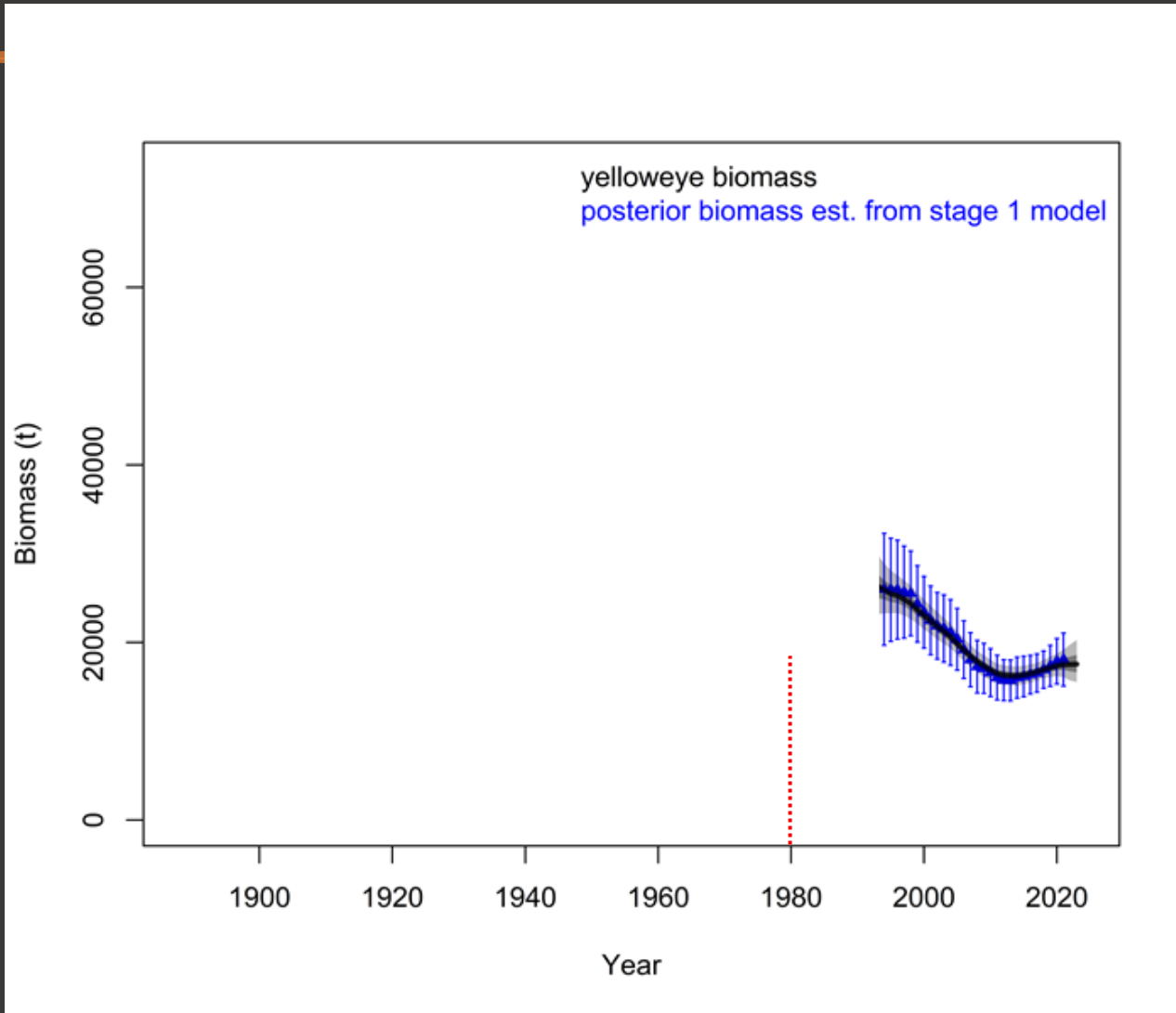
B)

Catch Data Fit

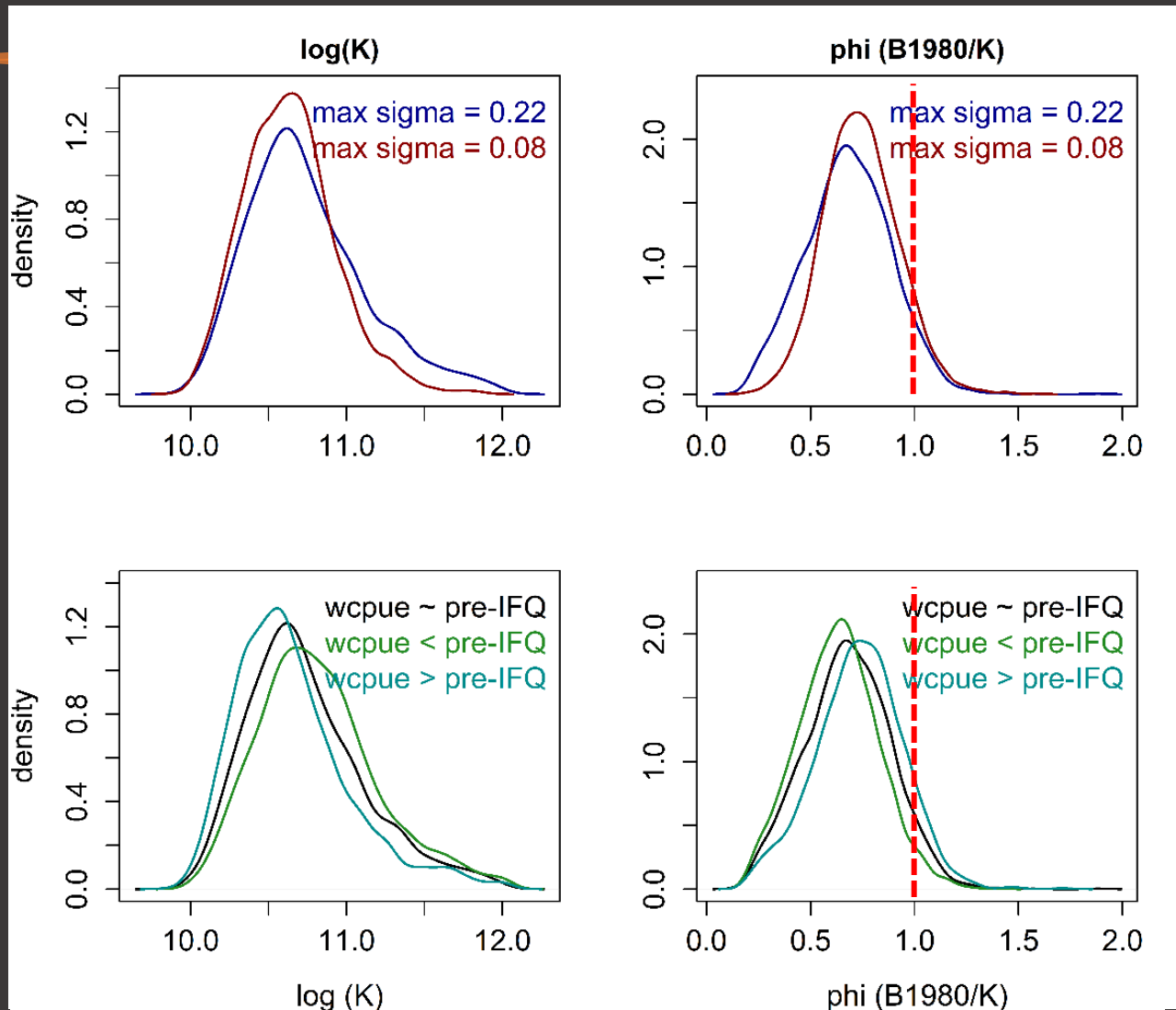


B)

Stage-2 (Goal: priors of K and f for Stage-3)

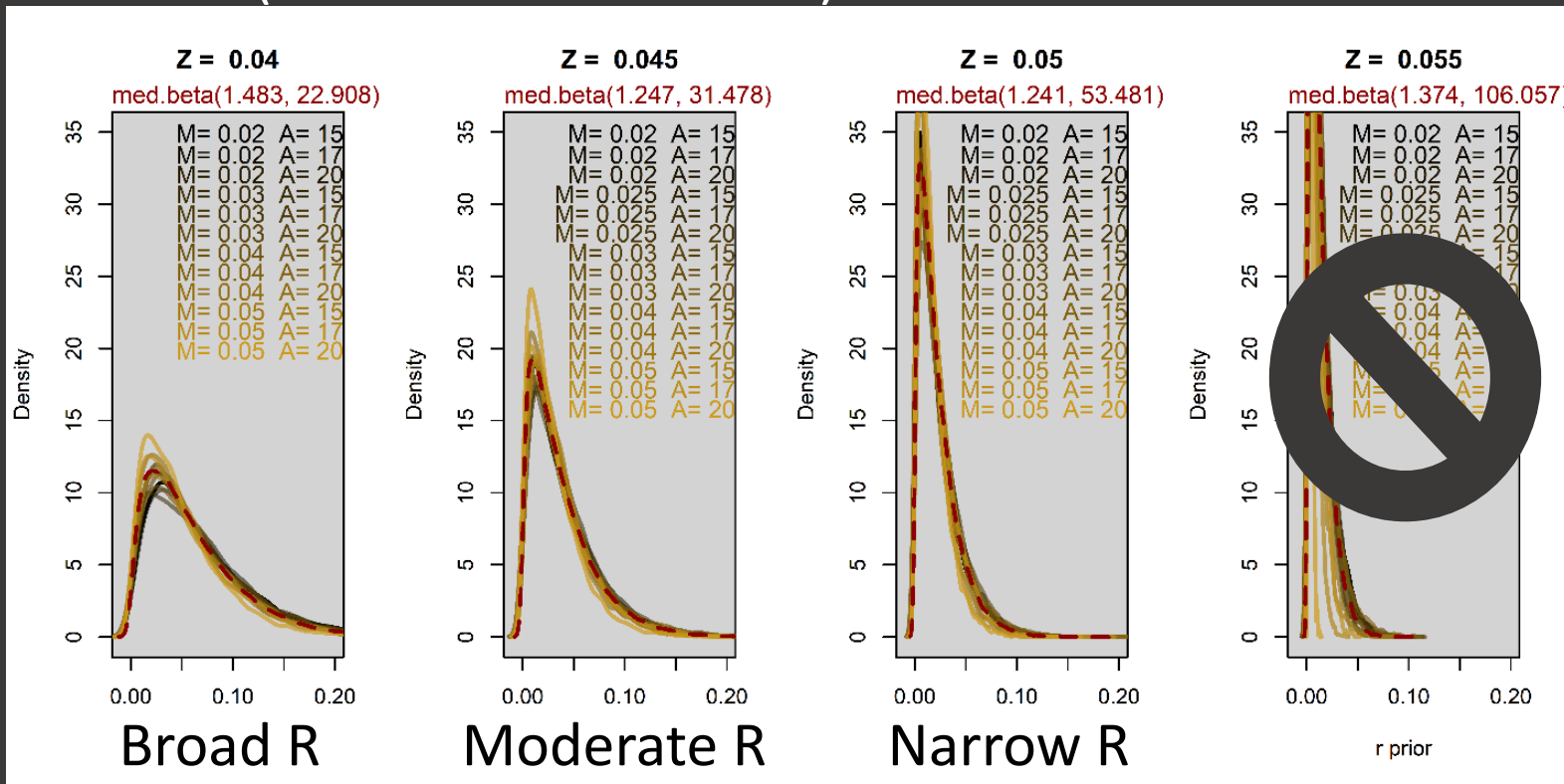


Stage-2 results: K and ϕ priors



Stage-3: some new R priors

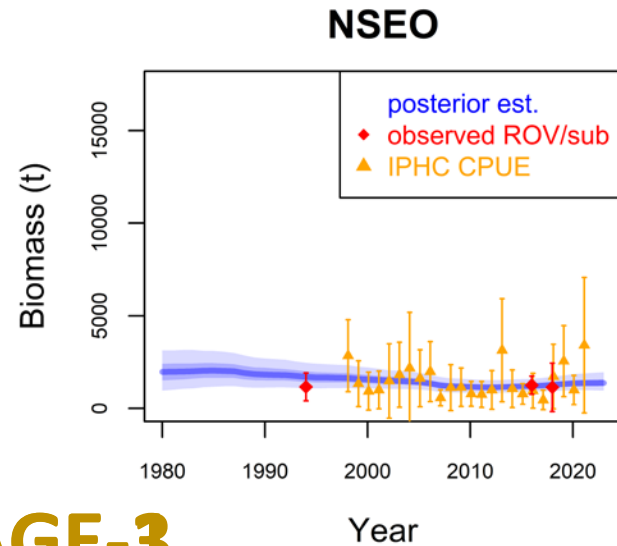
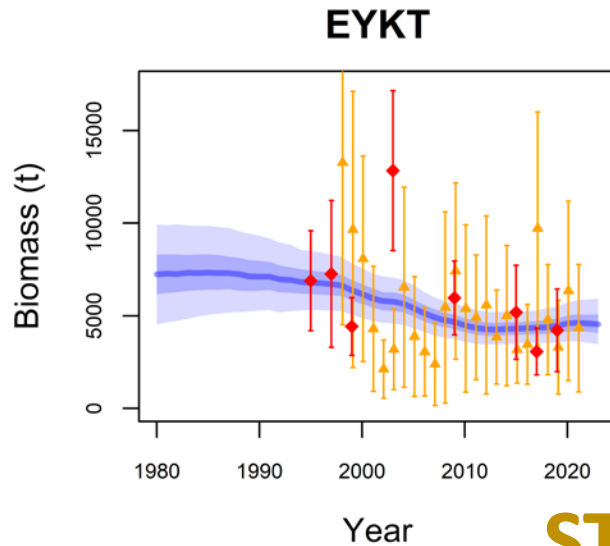
Informed Priors for R: projected Leslie matrix using Bayesian methods (McAllister et al. 2001)



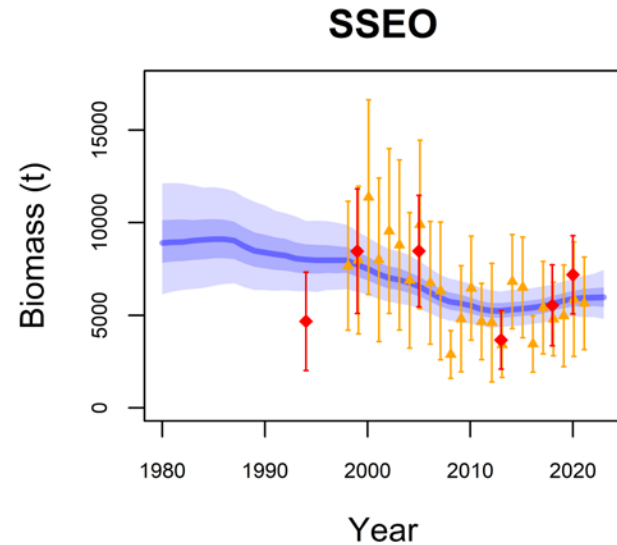
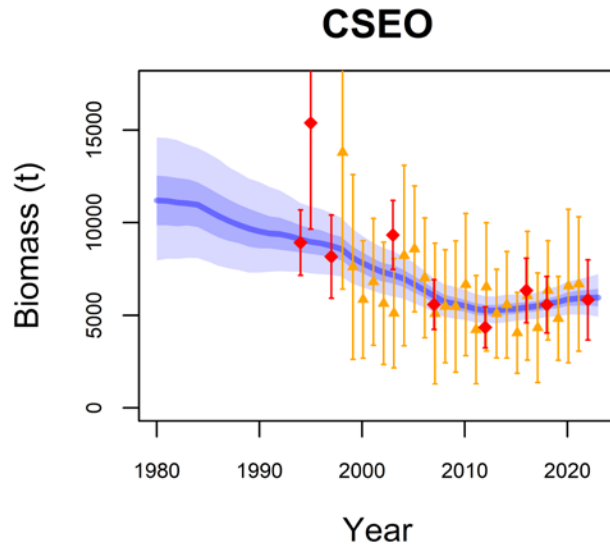
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et al. (2017)

Stage-3 Results

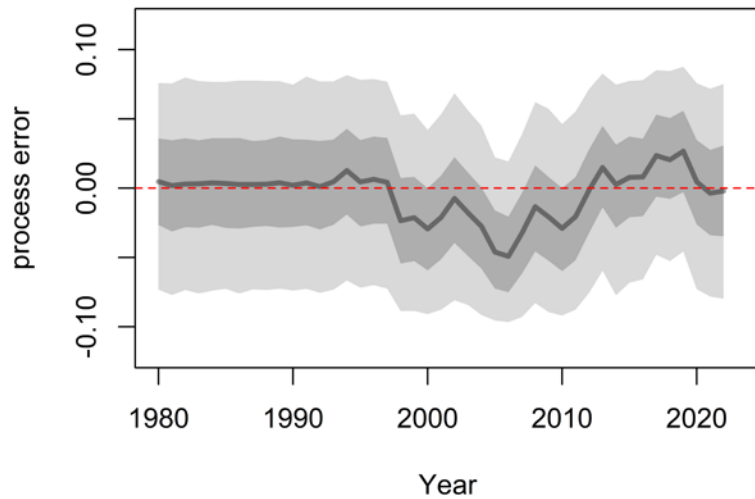


STAGE-3

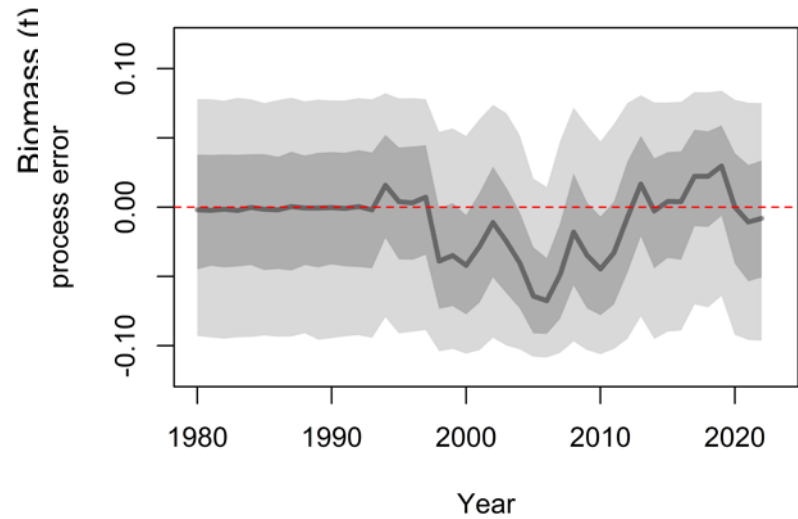


Stage-3 Results

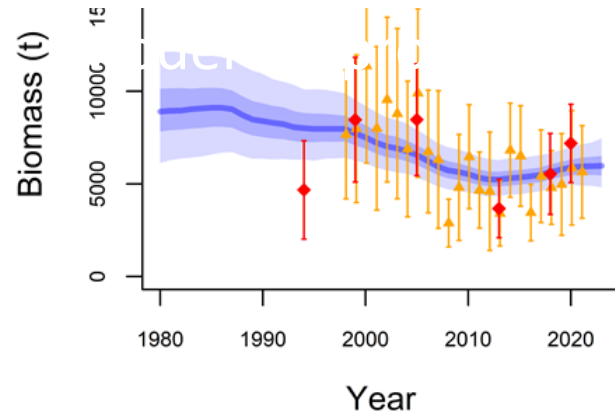
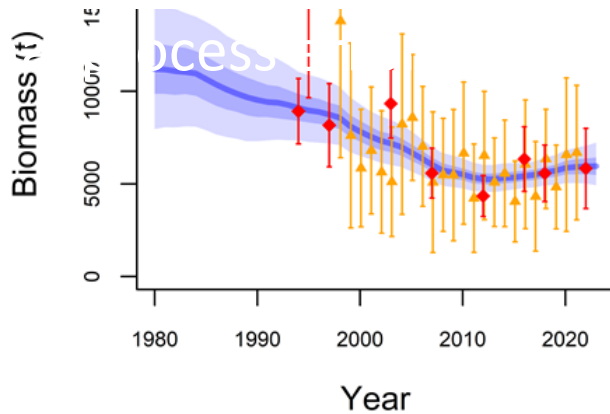
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NSEO

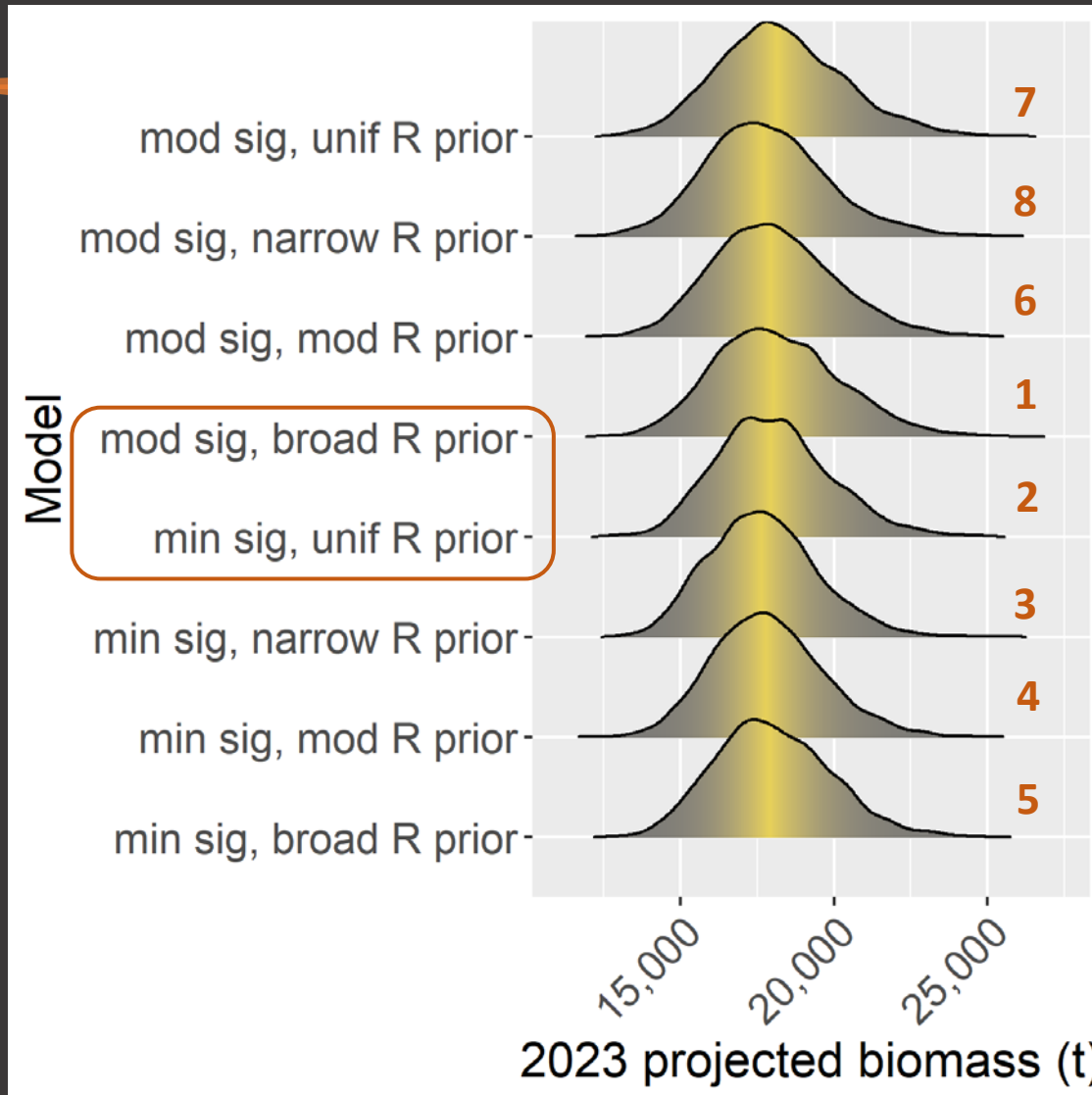


Mini



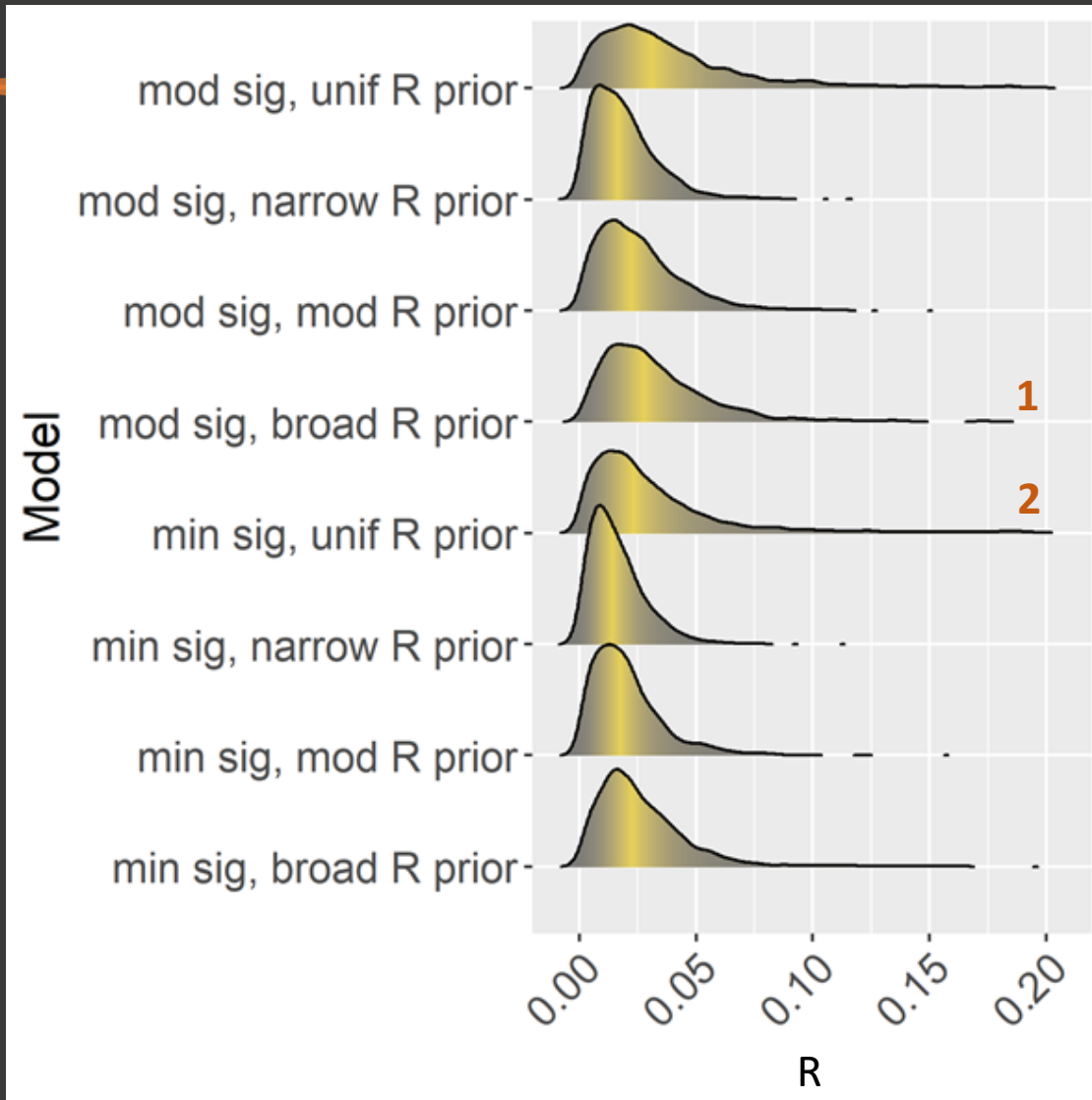
for model

Stage-3 Results

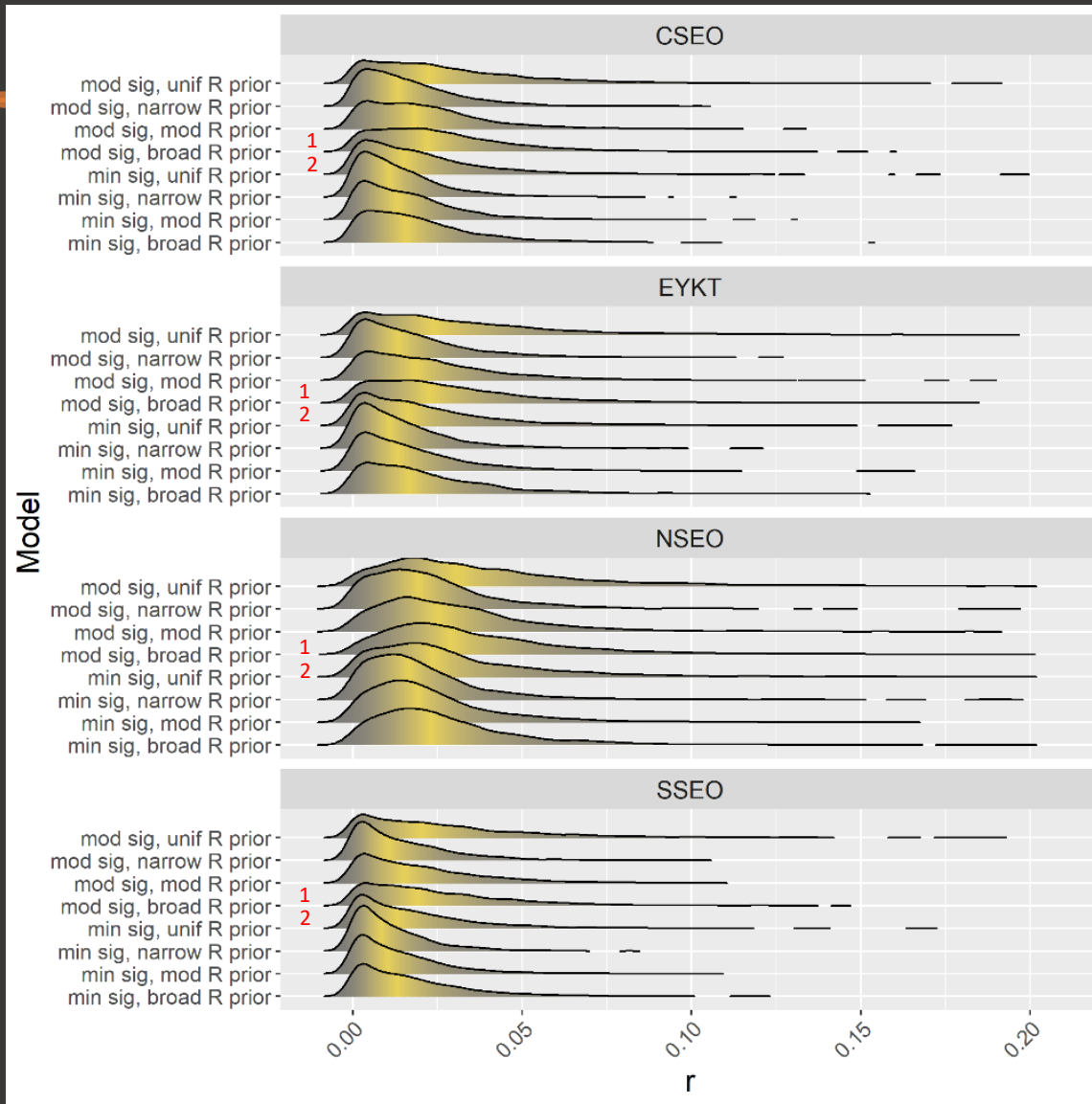


DIC rankings:

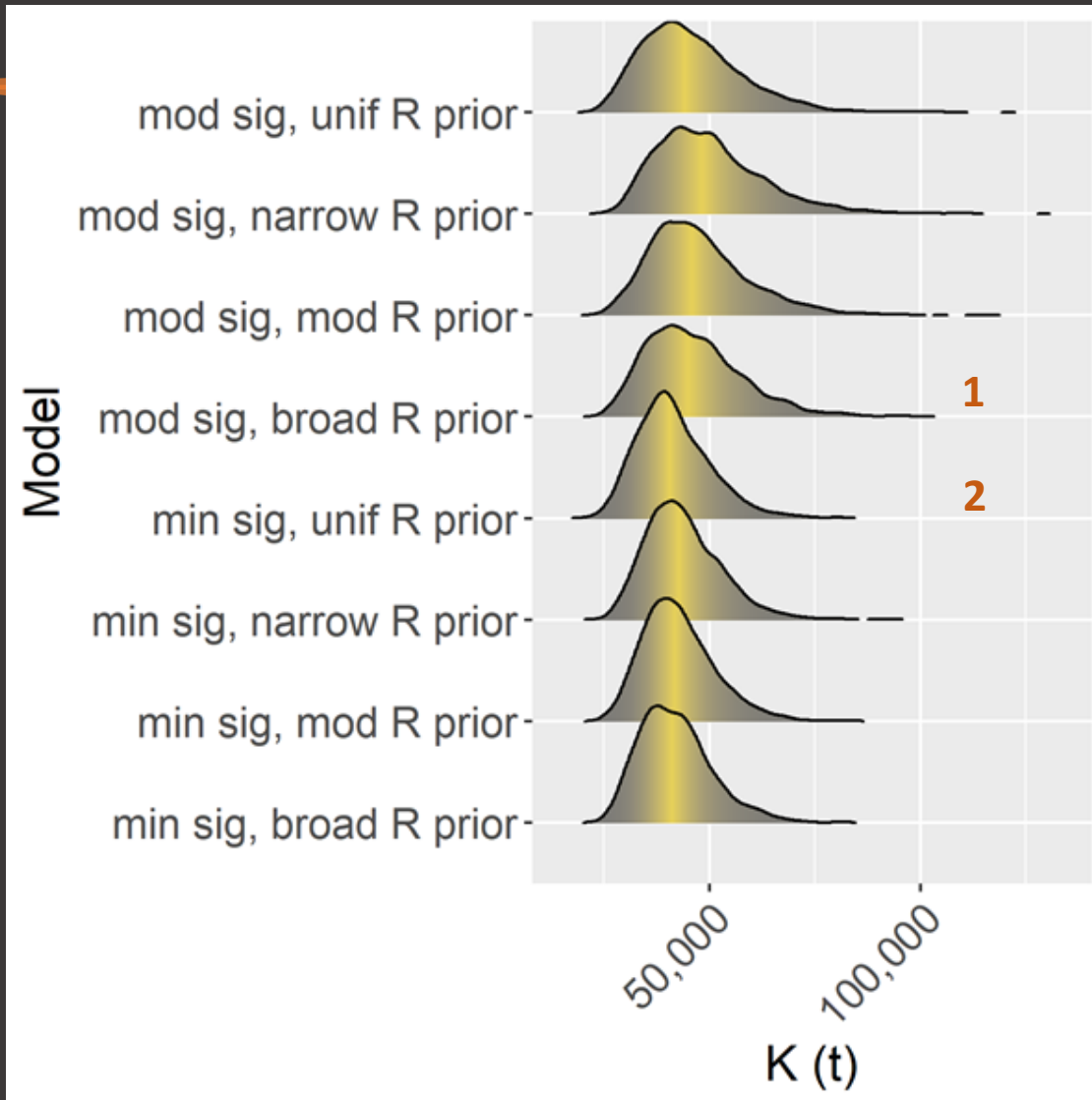
Stage-3 Results



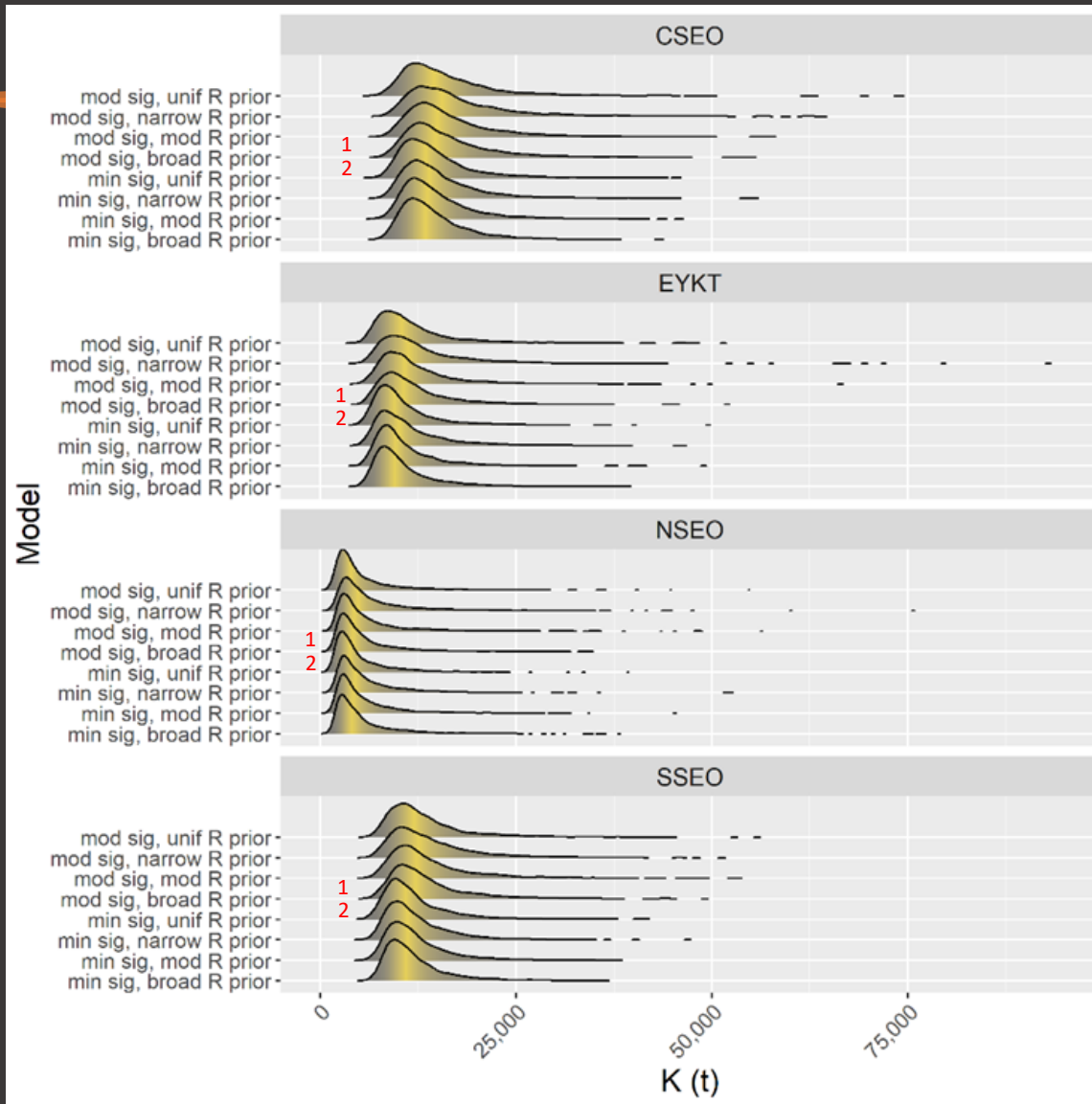
Stage-3 Results



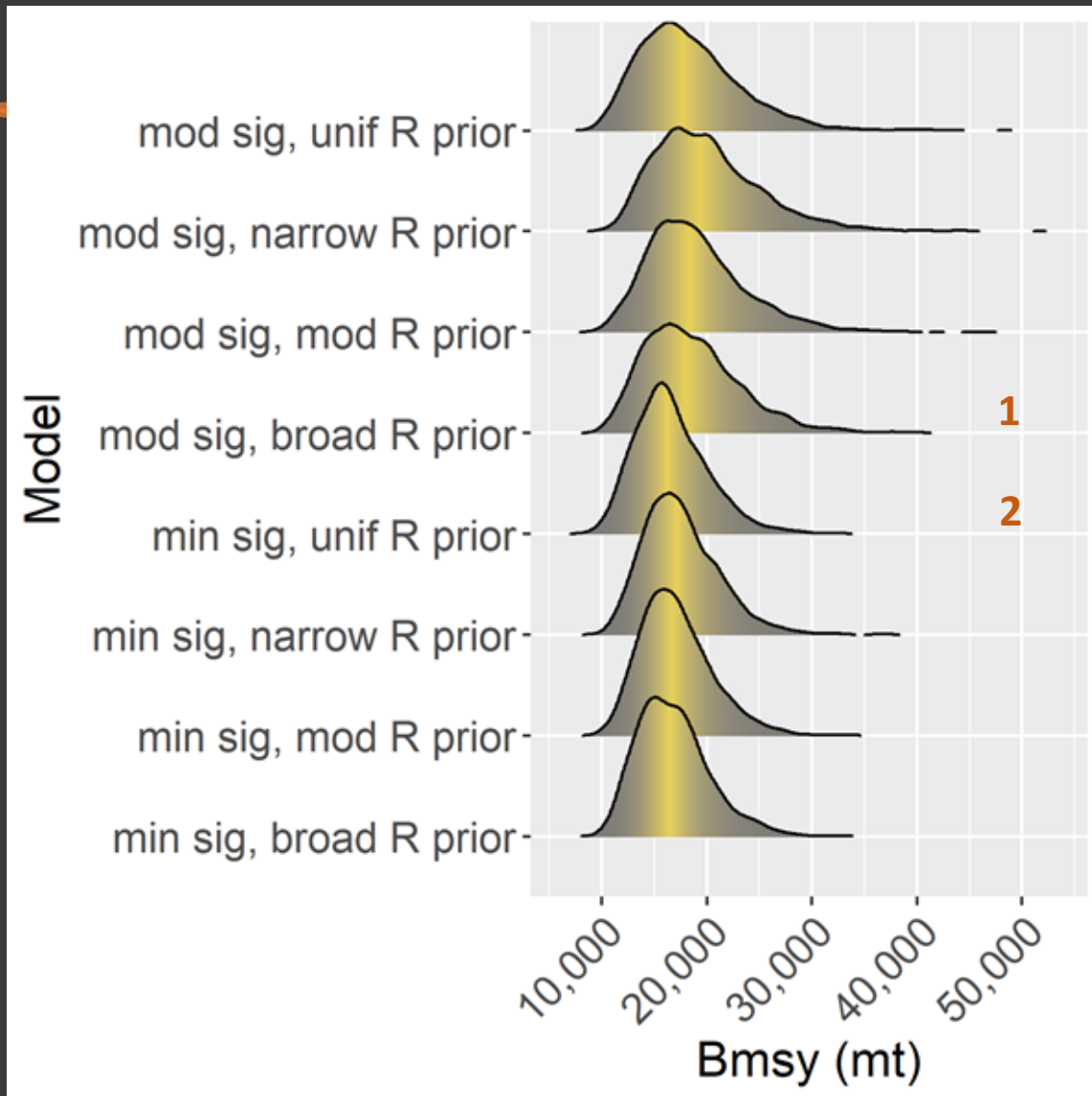
Stage-3 Results



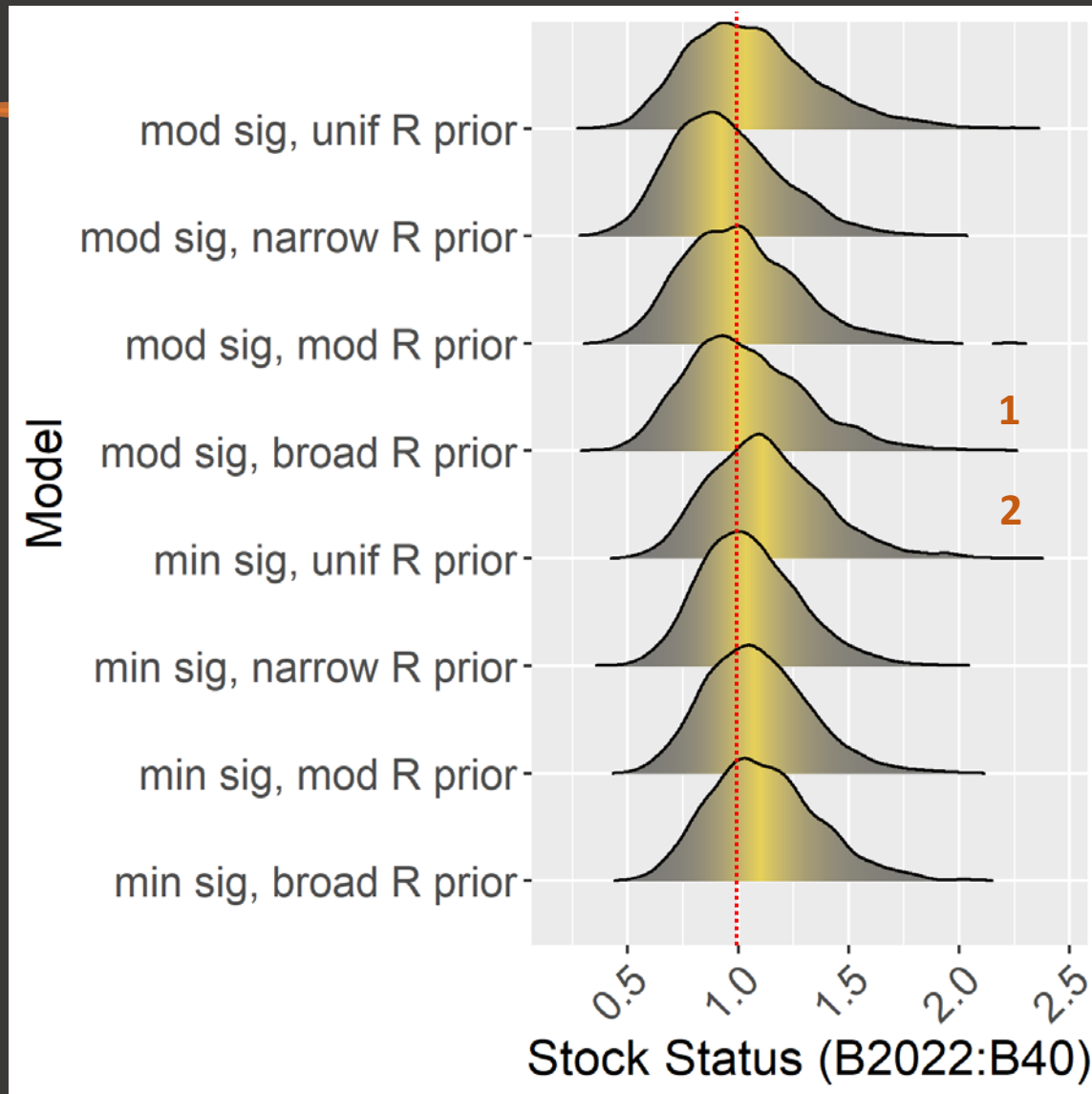
Stage-3 Results



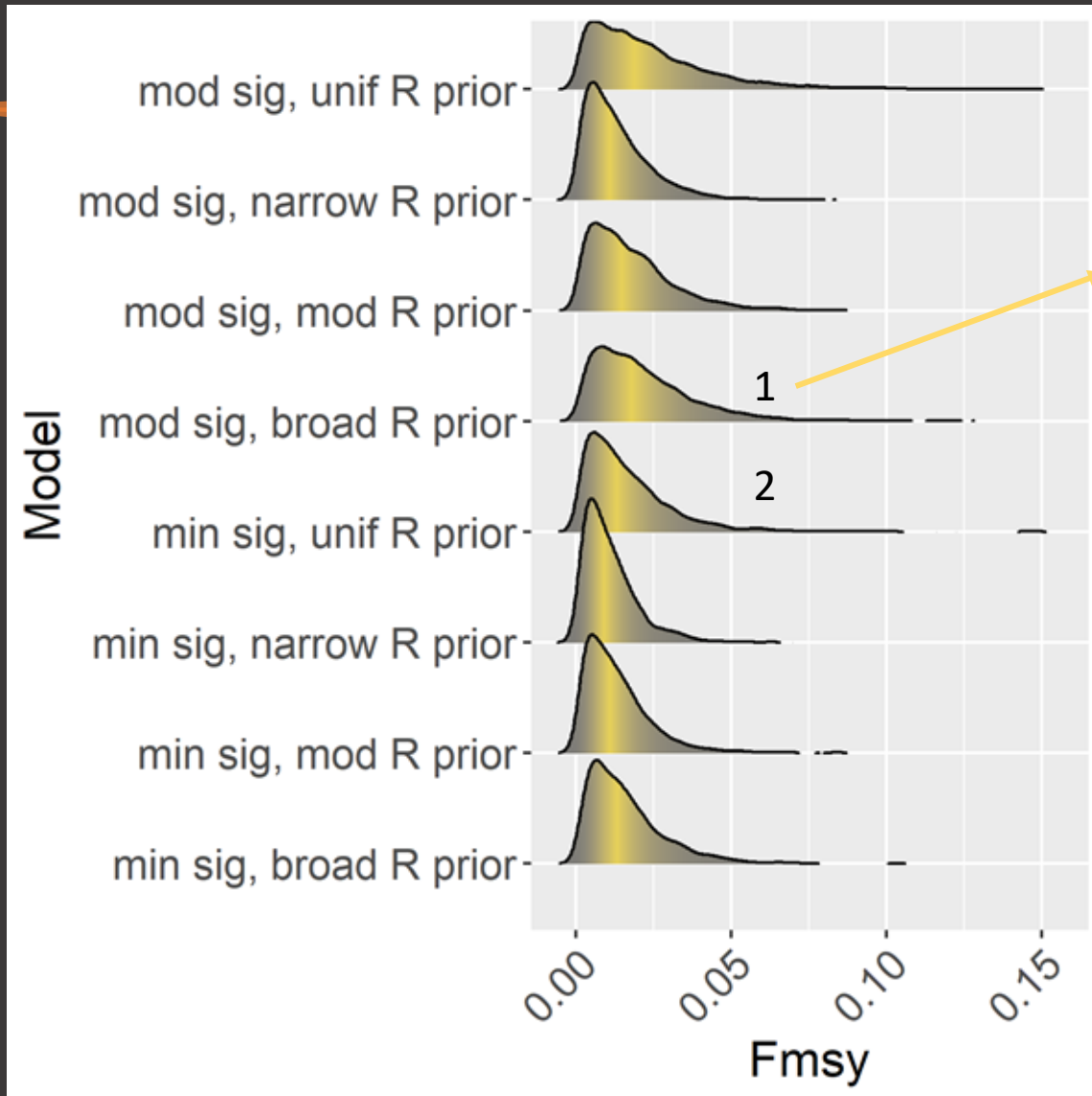
Stage-3 Results: B_{MSY} (B_{40})



Stage-3 Results: Stock Status $B_{2022}: B_{40}$

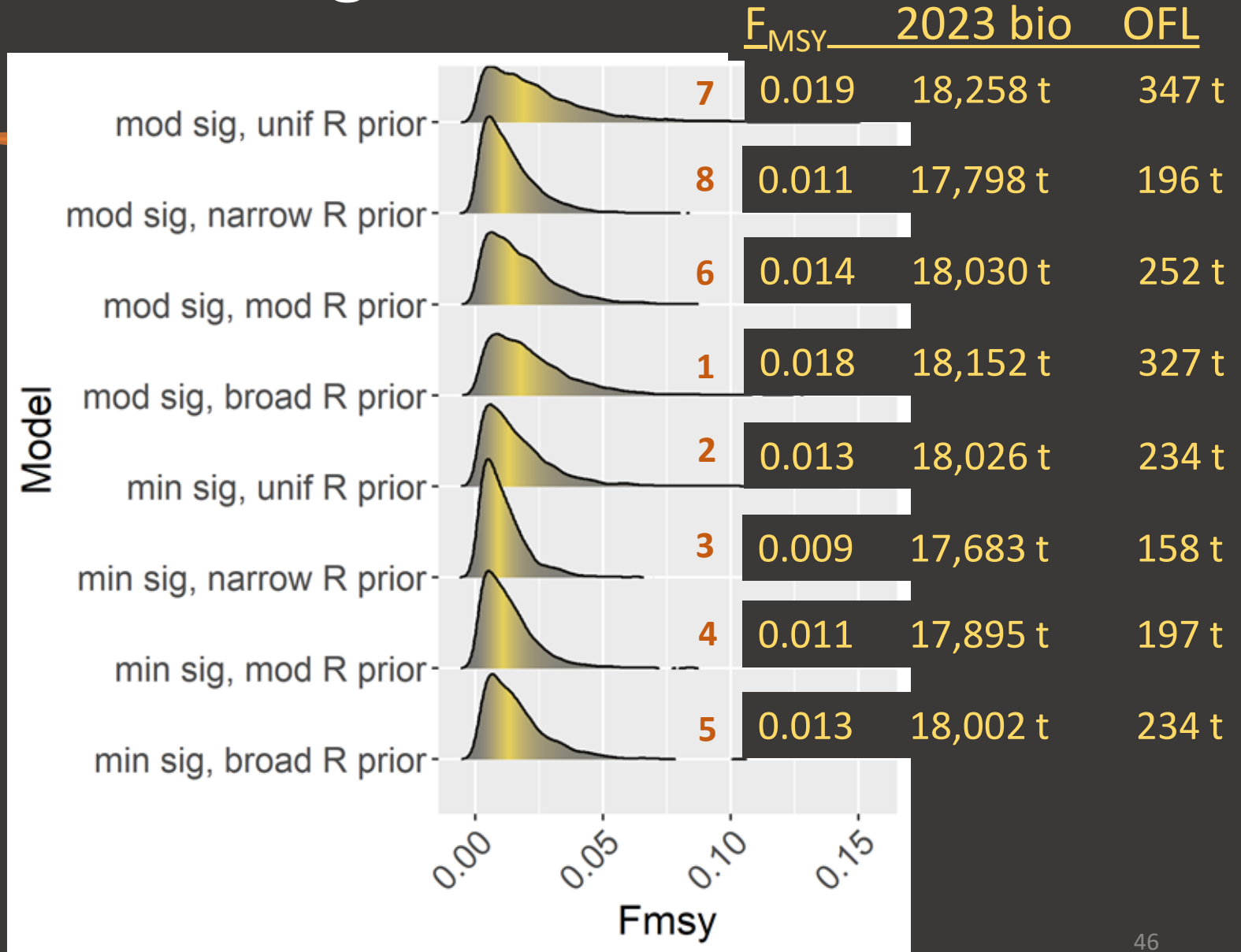


Stage-3 Results: F_{MSY}

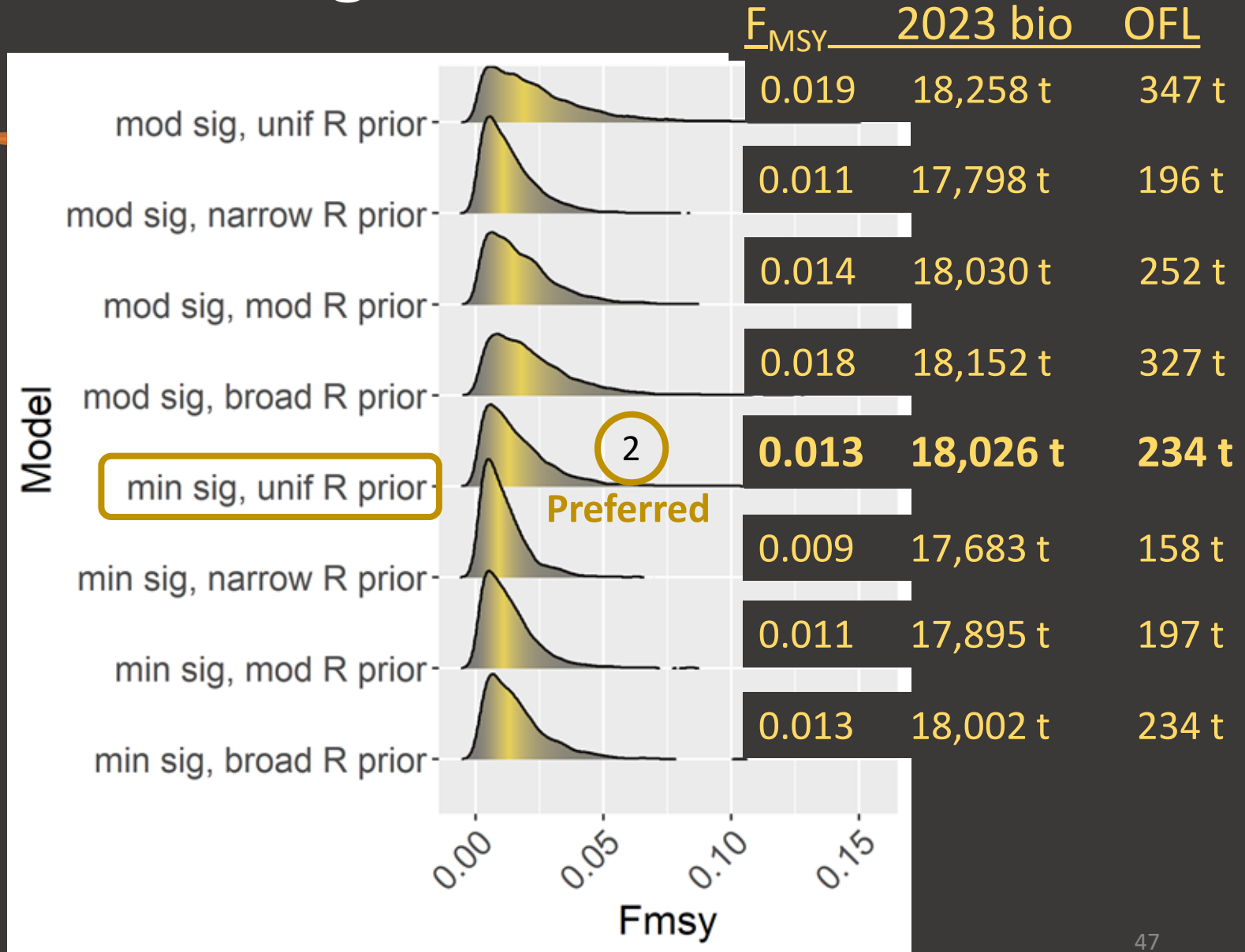


- Higher F_{msy} with model 1
- But, model 1 also showed lower stock status
- Ultimately, lots of overlap in posterior distributions

Stage-3 Results

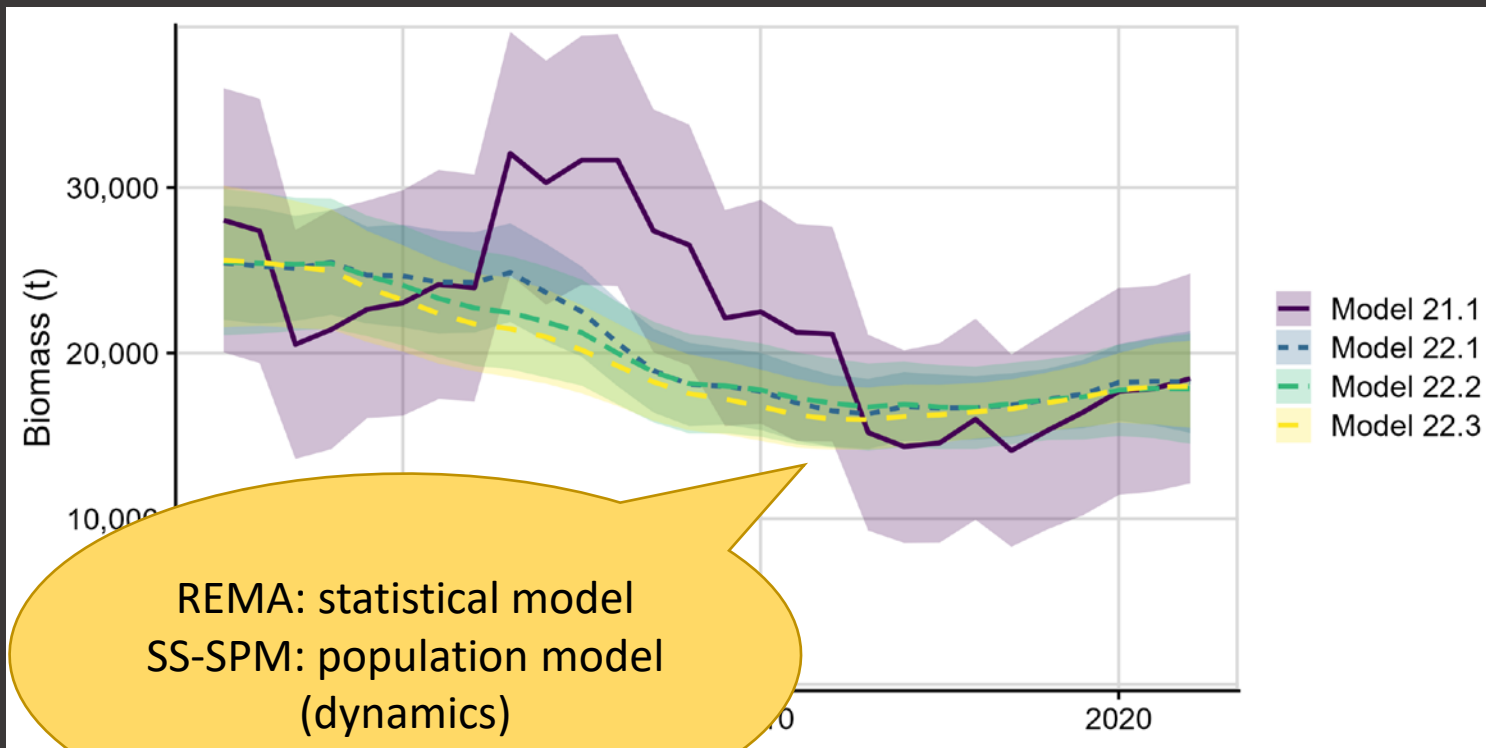


Stage-3 Results



Stage-3 Results: Model Comparisons

SEO Biomass



Status quo
Random effect
Random effect
Surplus
production

Risk Analysis

- Population projected forward using posterior estimates of r , K , ϕ , etc.
 - i.e., each Bayesian iteration that comprises the posterior projected forward (3000 iterations in total)
 - Includes alternate states of nature regarding bycatch rates in pre-IFQ halibut fishery
- F_{MSY} from median of posterior distribution (skew)
 - $F_{OFL} = F_{MSY}$
 - $\text{Max } F_{ABC} = 0.75 * F_{OFL}$ ← SPM used for shortraker rockfish in 2008
 - Recommended F_{ABC} of 10 and 25% reductions from max F_{ABC}
 - Status-quo method for setting F_{ABC} ($0.02 * \text{biomass low } 90\% \text{ CI}$)
 - Harvests set specific to management area (spatially explicit)
- Fixed harvest for 50-year projection
 - **Metric: Probability that population is over B_{40} in 50 years**

Risk Analysis

	Last Year: [*]		Status-quo (Model 21.1)	
	As estimated or recommended this year for:		mean	lower 90% CI
Quantity	2021	2022	2023	2023
<i>M</i> (natural mortality)	0.02	0.02	0.02	0.02
Tier	4	4	4	4
Yelloweye Biomass (t)	12,388		18,471	12,135
$F_{OFL} = F_{35\%}$	0.032	0.032	0.032	0.032
$max F_{ABC}$	0.026	0.026	0.026	0.026
F_{ABC}	0.020	0.020	0.020	0.020
DSR OFL (t)	422	422	591	388
DSR max ABC (t)	342	342	480	316
Recommended ABC (t)	268	268	369	243
Status	As determined this year for:			
	2020	2021		
Overfishing	No	n/a		



Big reductions from status-quo

^{*}Lower 90% CI rejected by SSC in 2022

Risk Table*

*No, not *that* risk table...

	Management Area	Pre-IFQ bycatch rate relative to WCPUE est.			Overall Probability
		30% lower	same	30% higher	
Pre-IFQ Probability:	DIC	0.2	0.4	0.4	1.0
Probability B_{2022} is above B_{msy}/B_{40}	EYKT	76%	71%	63%	68.5%
	NSEO	47%	44%	34%	40.6%
	CSEO	68%	63%	52%	59.5%
	SSEO	86%	83%	76%	80.5%
	All SEO	74%	65%	48%	59.9%

Today

Future

Conclusions



- A lot of uncertainty, but an honest accounting ...
 - Risk analysis encompasses that uncertainty
- Improving discard model?
 - No perfect way to handle this issue
 - More refined estimates based on halibut fleet behavior
 - Spatial profile
 - Depth profile
 - Derby vs. IFQ fisheries
 - Is more refined approach possible for historical bycatch?
 - Incorporate uncertainty in assessment...

Conclusions



- Population in the vicinity of B_{40}
- Uncertainty in F_{MSY} but estimates well below 0.02 applied in status-quo methods
 - Why so much lower than M values in the literature and usually applied to establish OFL and ABC (0.03-0.06)?
- Future model development:
 - Simulations
 - $B_{MSY} = B_{50}$ (Schaefer), or estimated in the model
 - Is biomass being over or underestimated?
 - Censoring early biomass data
 - Lack of belly cam before 1995
 - Imprecise transect lengths in pre-2003 submersible surveys

Conclusions



- Not as informed as an age-structured assessment
 - Explicitly incorporates uncertainty in catch data
 - Lack of recruitment signals in yelloweye suggests SPM capturing population dynamics
- Incorporates more data than status-quo and random effect models
 - Biological reference points for management decisions
 - Risk analysis
- If age-structured assessment developed SS-SPM can help
 - Inform catch history
 - Provide baseline estimates of stock status
 - Source of contrast to ASA



Questions and feedback?

- *If accepted*, ADF&G solicits advice on setting OFL and ABC
- How does SS-SPM fit into Tier rules?



End

ASSESSMENT OF THE DEMERSAL SHELF ROCKFISH STOCK COMPLEX IN THE SOUTHEAST OUTSIDE SUBDISTRICT OF THE GULF OF ALASKA:

A NEW STATE-SPACE SURPLUS PRODUCTION MODEL

September 2022

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