## Eastern Bering Sea snow crab

May 16, 2024
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Crab Plan Team

## Outline

- No new models; need input on conceptual framework
- Model description and rationale
- Probability of terminal molt
- BSFRF data
- Management currency
- SBPR calculations
- Maturity definitions
- Climate driven stock projections
- Rebuilding prospects



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## SSC comments and responses

(Public comment) expressed a lack of understanding as well as lack of confidence in the stock assessment modeling. It was suggested that preparing a simple stock assessment narrative that documents recent history on model development for stakeholders could improve comprehension and buy-in. The SSC understands that assessment methods are technical and complex and agrees that more effort is needed

A description of the model, recent changes, and rationale for those changes are included below.

## SSC comments and responses


#### Abstract

         has declined.


The idea of retaining some percentage of the reproductively important population is conceptually satisfying and relatively intuitive. The reproductively important part of the population (i.e. management currency) and appropriate percentage to be retained (i.e. reference points) need to be identified. SBPR analyses are performed below for different definitions of mature male biomass and at different percentages of unfished biomass as target to explore this question.

## SSC comments and responses

The SSC strongly supports the plans of the CPT to evaluate other metrics for reproductive output. The CPT may want to consider a multi-attribute measure of reproductive output. For example, both percent reduction in mature male biomass and percent reduction in large males could be evaluated as a function of fishing mortality.

Reproductive output appears to be strongly influenced by environmental conditions. Appendix 1 explores the implications of environmentally driven recruitment dynamics and receding ice in the Bering Sea. Short-term projections hold some possibility for rebuilding if conditions align; long-term projections suggest large-scale declines of mature male abundance in the eastern Bering Sea.

## SSC comments and responses

The SSC requests a yield analysis be done for snow crab, including the relationship between fishing mortality and catch, MMB, functional maturity, and the proportion of large males in the population. The stock production curve, i.e., yield as a function of MMB, should also be developed.

These were performed for a range of steepnesses and definitions of mature male biomass. Morphometrically mature male biomass could not be depleted to $35 \%$ of unfished levels over a wide range of steepnesses. Defining mature male biomass closer to the sizes impacted by the fishery (e.g. 95-100 mm carapace width) resulted in maximin solutions for SBPR ${ }_{\mathrm{xx}}$ closer to $\mathbf{3 5 \%}$ of unfished biomass. See below for further analyses.

## SSC comments and responses

consider greater use of the modeling structure to diagnose problems in how the data are being interpreted as opposed to more generally viewing resulting models as potential options for management. Sensitivity and other exploratory approaches using the model should be conducted and presented diagnostically to inform a smaller set of self-consistent models for management considerations.

I think the SSC is asking me to delineate research vs. operational models more carefully and I will do my best.

## SSC comments and responses

One idea for statistical exploration regarding the shape of the within-model empirical smoothed estimate of selectivity would be to examine to what extent the spatial distribution of differences in availability of small and large crab (or males and females) would be sufficient to explain the anomalous shape of the survey selectivity curve.

I'm not clear what is 'anomalous' about the shape of the selectivity curve-the shape makes some intuitive sense to me. Very small crab would be poorly selected (they go under and through the gear), a range of medium sized crab would have similar selectivity higher than small crab (harder to go under and through the gear, but still possible) and then selectivity would increase to nearly one for the largest sized crab (the biggest crab do not escape the gear). This seems more reasonable than the historically used logistic curve that had the same selectivity for crab 50-150 mm carapace width. The SSC may also be referring to the small 'hump' at smaller sizes in the BSFRF data. Differences in aggregation behavior by size and maturity state could be related to this phenomenon.

## SSC comments and responses

The SSC still requests an analysis of the probability of maturing/terminal molt which treats years as random effects. A hierarchical fit to molt data might be better than annual independent GAMs.

I don't think I have explained this part of the assessment appropriately based on this comment and endeavor to do so more completely below. Reading Richar and Foy (2022; reference below) might also be helpful.

## SSC comments and responses

The SSC would like to better understand the sampling design for molt data and is concerned about the weighting of the spatial samples in the analyzing; weighting should be based on abundance if the sampling rate differs by area (which it would, unless abundance were uniform and/or the targets were in direct proportion to abundance). Hierarchical fit to molt data might be better than annual independent GAMs.

Sampling design and methodology for analysis of the chelae data to determine the probability of having undergone terminal molt at size by year is documented in Richar, J and Foy, R (2022) A novel morphometry-based method for assessing maturity in male tanner crab, Chionoecetes bairdi. FACETS. https://doi.org/10.1139/facets-2021-006

## SSC comments and responses

Figure 23 on page 73 of the SAFE report shows the decline in CPUE over a season by statistical area and year. This represents a kind of depletion experiment, suggesting that total mortality ( $Z$ ) could be estimated from the linear parameters representing each line. This might help determine spatial patterns in $F$, indicate the natural bounds for $F$ and $M$, and assist in determining stock status.

This will be explored at a later date.

## SSC comments and responses

Providing a clear crab specification narrative would help the SSC and the public navigate the tiers, models, and justifications for both. In addition, it would be helpful to clearly identify models that are being explored for diagnostic purposes as opposed to models that are directly relevant for use in decision making. Public testimony indicated that help and financial support for developing such a narrative might be available.

I will attempt to delineate research vs. operational models more effectively in September.

## SSC comments and responses (added from Mike)

A Tier 4 calculation was also provided using survey estimates of industry preferred biomass (>101 carapace width). Since the model was considered suitable for providing management advice, the CPT focused on options that used model estimated reference points, rather than the Tier 4 survey calculation. The SSC had previously requested the Tier 4 approach using survey biomass as a "fallback option" when the model has insurmountable problems and cannot be used for management, as well as a way to provide context for Tier 3 estimates. The authors used the terminal year survey MMB decremented for natural mortality instead of using the REMA model on male survey biomass. The SSC noted that this number was on a different scale than was requested and noted that the MMB used was much smaller than the model estimated MMB. The SSC requests for future years that the authors bring forward the Tier 4 estimate using vulnerable male survey biomass and the REMA model, and do not correct for natural mortality, as, for example, in the 2023 Tanner crab assessment (see also General Crab Comments).
I think this is a bad idea. I've shown in the past using morphometric MMB in a calculation like this could result in OFLs that exceed the number of commercially exploitable crab in the water. The fishery also occurs consistently several months after the survey, so not applying a simple calculation of natural mortality could result in a much larger exploitation rate than assumed. Further, applying REMA to the data might make sense for patchily distributed crab, but snow crab are observed at hundreds of stations. Presumably the reason for not using the assessment is that the model output is not believable. In this case, 'believe the survey' is a reasonable standby. The 2019 survey is a good example where we should have 'believed the survey' and REMA would have prevented us from doing that.

## Stock assessment

## Goal: Model how the population changes

$$
\operatorname{Biomass}(\mathrm{t}+1)=\operatorname{Biomass}(\mathrm{t})+\operatorname{Additions}(\mathrm{t})-\operatorname{Removals}(\mathrm{t})
$$

Additions:

- Births
- Immigration
- Somatic growth

Removals:

- Natural deaths
- Fishing deaths
- Emmigration

$$
\begin{align*}
& s_{\text {i, utr }}=\left(1+\exp \left(-\frac{\log (19)\left(\bar{L}_{i}-L_{\text {50dit }}\right)}{L_{\text {g5,dtr }}-L_{\text {soditr }}}\right)\right)^{-1} \tag{A.6}
\end{align*}
$$

$$
\begin{align*}
& S_{\text {Lsurv }}=q *\left(1+\exp \left(-\frac{\log (19)\left(\bar{U}_{1}-L_{50 \text { gupp }}\right)}{L_{\text {gr,surv }}-L_{50,5 y v}}\right)\right)^{-1}  \tag{AS}\\
& I_{a, t, r, l}=\sum_{x} N_{a_{x}, t, m, l} \text { move }_{l_{s, s}} \operatorname{Prop}_{a_{x, t}}  \tag{A.9}\\
& P_{2}=\gamma_{w} \sum_{l} \sum_{a}\left(\ln \left(\eta_{l, a}\right)-\ln \left(\eta_{l-1, a}\right)\right)^{2}  \tag{A.28}\\
& \hat{C}_{y, a, l}^{\text {tot }}=\sum_{m} s_{l, d i r} N_{a, m, y, l} e^{-m i l d p t t_{y}^{*} M}\left(1-e^{\left.-F_{a, t, l}\right)}\right.  \tag{A.10}\\
& \hat{c}_{\text {ya,l }}^{\text {ret }}=\hat{c}_{\text {y,a,l }}^{\text {tot }} S_{l, d t e c}  \tag{A.11}\\
& P_{l}=\frac{1}{\left(1+\exp \left(\frac{\log (19)\left(L_{\text {50, moult }}-\bar{L}_{l}\right)}{L_{95, \text { mault }}-L_{50, \text { moult }}}\right)\right)} \tag{A.12}
\end{align*}
$$






Natural mortality occurs (estimated by sex and maturity state + events)
Mature N At length



Growth occurs
After growth previously immature animals are allocated to immature or mature size bins based on a probability of having undergone terminal molt.


Recruitment occurs and is primarily allocated to the first three size bins.


| Process | Data |
| :--- | :--- |
| Recruitment | Survey abundance + <br> size composition |
| Natural <br> mortality | Longevity + survey <br> data |
| Growth | Growth increment |
| Maturity | Chelae height |
| Fishing <br> mortality | Observer data |
| Fishery <br> selectivity | Observer data |
| Survey <br> selectivity | BSFRF |



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| Survey <br> selectivity |  |

Comparison of all cutlines derived using altered upper bounds


| Process | Data |
| :---: | :---: |
| Recruitment | Survey abundance + size composition |
| Natural mortality | $\begin{aligned} & \text { Longevity + survey } \\ & \text { data } \end{aligned}$ |
| Growth | Growth increment |
| Maturity | (Chelae height) |
| Fishing mortality | Observer data |
| Fishery selectivity | Observer data |
| Survey selectivity | BSFRF |





| Process | Historical assumptions | Updated assumptions |
| :---: | :---: | :---: |
| Recruits | Equal sex ratio | Unequal sex ratios |
| Natural mortality | Constant with strong priors | Strong priors and time-block in 20182019 |
| Growth | Piece-wise | Linear |
| Maturity | Single estimated ogive | Input yearly observations |
| Fishing mortality | Freely estimated | GMACS changed form |
| Fishery selectivity | Freely estimated | GMACS changed form |
| Survey selectivity | Logistic, BSFRF as survey | Non-parametric, BSFRF as priors |

## Rationale

Retrospective patterns

Lack of survey fit

Model instability

Reproducibility

Reproducibility

| Process | Historical <br> assumptions | Updated <br> assumptions |
| :--- | :--- | :--- |
| Recruits | Equal sex ratio | Unequal sex ratios |

2022 Survey selectivity


2023 Survey selectivity

- 2022
- Logistic survey selectivity
- 2023
- Non-parametric survey selectivity (priors shared between sexes)




## Maturity

- Colored lines are the yearly probability of having undergone terminal molt
- Black line is the estimated probability of having undergone terminal molt


## 2023 Assessment



- Gold line (23.1):
- Estimate probability of having undergone terminal molt + logistic survey selectivity
- Green line (23.2):
- Specify probability of maturing, retain logistic survey selectivity
- Blue line (23.3a):
- Specify probability of maturing, nonparametric survey selectivity

| Model | MMB | B35 | F35 | FOFL | OFL | M | avg_rec | Status |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 23.1 | 56.41 | 189.24 | 1.60 | 0.30 | 8.58 | 0.29 | 169.90 | 0.30 |
| 23.2 | 135.43 | 132.46 | 71.89 | 30.14 | 37.10 | 0.29 | 222.75 | 1.02 |
| $23.3 a$ | 92.39 | 155.91 | 53.25 | 14.96 | 15.44 | 0.29 | 141.66 | 0.59 |

## Preparing assessment data (MMB)



Index of immature animals not fit

Immature size composition data are fit


- MMB time series to which the models are fit are the same
- The distributions of the underlying population of numbers of mature males at size is drastically different

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- The distributions of the underlying population of numbers of mature males at size is drastically different

- Inability of the model to estimate maturation well suggests there is an issue elsewhere in the model.
- Inability to estimate this process inspite of these data being 'baked in' to the data prep process is a problem.
- We have encountered this before, but the large F35\% resulting kept us from pursuing this.
- The SSC supported the idea 'build from biology first'.



## If we use this model, what do we do for reference points?

# Groundfish Exploitation Rates Based on Life History Parameters 

William G. Clark

International Pacific Halibut Commission, Seattle, WA 98145-2009, USA
Clark, W. G. 1991. Groundfish exploitation rates based on life history parameters. Can. J. Fish. Aquat. Sci. 48 734-750.

- Spawning biomass per recruit proxies used for crab came from Clark, 1991.
- These were based on a groundfish life history in which maturity was equal to fishery selectivity.

Relative scale


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- Spawning biomass per recruit proxies used for crab came from Clark, 1991.
- These were based on a groundfish life history in which maturity was equal to fishery selectivity.
- Equilibrium yield at relative biomass was calculated for a range of recruitment dynamics.
- Maximin yield was identified as the

Relative yield
 relative SBPR that maximized the minimum yield.

# Reproduce Clark 1991 with crab model 

# An evaluation of stock-recruitment proxies and environmental change points for implementing the US Sustainable Fisheries Act 

André E. Punt ${ }^{a} \bigcirc \square$, Cody S. Szuwalski ${ }^{\text {a }}$, William Stockhausen ${ }^{\text {b }}$

Show more $\vee$
"the assumption $F_{\mathrm{MSY}}=F_{35 \%}$ is generally reasonable, but that the stock and recruitment data do not generally support the current $B_{\text {MSY }}$ values"

- Are reference points based on targets of $35 \%$ unfished yield appropriate with new models?
research model
- What would the impact on status and OFLs be of using different definitions of maturity?


## GMACS

- What would the impact on status and OFLs be of using different SBPR percentages be for morphometric maturity as currency?

GMACS

## Research model description

## Used for ease of manipulation

## Key differences include:

- only considers male crab
- excludes the bycatch fishery
- specifies the size transition matrix
- fits to an index of immature abundance
- Weightings somewhat different (e.g. lower for size composition data)

| Data component in GMACS | Years | Fit in RM? | Inform RM? |
| :---: | :---: | :---: | :---: |
| Retained male crab pot fishery size frequency by shell condition | 1982-2022 | X | X |
| Discarded Males and female crab pot fishery size frequency | 1992-2022 | X | X |
| Trawl fishery bycatch size frequencies by sex | 1991-2022 |  |  |
| Survey size frequencies by, maturity, sex and shell condition | $\begin{aligned} & 1982-2019 \\ & 2021-2023 \end{aligned}$ | X | X |
| Retained catch estimates | 1982-2022 | X | X |
| Discard catch estimates from crab pot fishery | 1992-2022 | X | X |
| Trawl bycatch estimates | 1993-2022 |  |  |
| Total survey abundance estimates and coefficients of variation | $\begin{aligned} & 1982-2019, \\ & 2021-2023 \end{aligned}$ | X | X |
| 2009 study area biomass estimates, CVs, and size frequency for BSFRF and NMFS tows | 2009 |  | X |
| 2010 study area biomass estimates, CVs, and size frequency for BSFRF and NMFS tows | 2010 |  | X |
| Growth increment data | $\begin{gathered} 2003,2016- \\ 18 \end{gathered}$ |  | X |

## Research model description

- Male only
- 30-135 mm CW
- Growth and maturity input
- Fit to:
- survey abundance and size compositions by maturity state
- Retained and discarded abundance and size composition
- Survey selectivity experimental priors
- Estimates:
- Annual recruitment, natural mortality, and fishing mortality estimated
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- Similar to Szuwalski et al., 2023, but incorporates the fishery and a larger range of sizes

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## Population dynamics model

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## SBPR yield curves

- SR relationship defined in terms of steepness
- Specify a fishing mortality
- Project to equilibrium
- Record biomass and yield
- Normalize curves



## SBPR yield curves

Morphometrically mature

- Maximin yield ~ SBPR55\%
- Large range of steepnesses that cannot be depleted to B35\%



## SBPR yield curves

Morphometrically mature

- Maximin yield ~ SBPR55\%
- Large range of steepnesses that cannot be depleted to B35\%
95 mm carapace width
- Maximin yield ~ SBPR28\%



## SBPR yield curves

Morphometrically mature

- Maximin yield ~ SBPR55\%
- Large range of steepnesses that cannot be depleted to B35\%
95 mm carapace width
- Maximin yield ~ SBPR28\%

100 mm carapace width

- Maximin yield ~ SBPR29\%


How would different definitions of maturity impact status and OFLs?



| Maturity | MMB | B35 | F35 | FOFL | OFL | M | avg_rec | Status |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Morphometric | 128.51 | 165.03 | 305.86 | 167.34 | 41.78 | 0.29 | 155.67 | 0.78 |
| 85 mm | 51.27 | 103.91 | 8.29 | 2.57 | 8.90 | 0.29 | 155.67 | 0.49 |
| 90 mm | 34.83 | 92.12 | 4.31 | 0.93 | 4.59 | 0.29 | 155.67 | 0.38 |
| 95 mm | 20.96 | 80.44 | 2.48 | 0.00 | 0.06 | 0.29 | 155.67 | 0.26 |
| 100 mm | 11.76 | 67.97 | 1.59 | 0.00 | 0.06 | 0.29 | 155.67 | 0.17 |
| 105 mm | 7.32 | 54.14 | 1.12 | 0.00 | 0.06 | 0.29 | 155.67 | 0.14 |

- Increasing the size at maturity decreases F35\% and status
- Once the size is >=95mm carapace width, the fishery would have been closed in 2023 at the federal level

How would using different SBPR percentages impact status and OFLs while using morphometric maturity as currency?

## SBPR\% modification

- Target F and status decrease as the percentage of unfished biomass as target increases
- The fishery would have been closed in 2023 at >=85\%.


| SBPR\% | MMB | B target | F target | FOFL | OFL | M | avg_rec | Status |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $35 \%$ | 128.51 | 165.03 | 305.86 | 167.34 | 41.78 | 0.29 | 155.67 | 0.78 |
| $45 \%$ | 128.51 | 212.18 | 67.12 | 26.90 | 24.06 | 0.29 | 155.67 | 0.61 |
| $55 \%$ | 128.51 | 259.34 | 14.32 | 4.41 | 11.63 | 0.29 | 155.67 | 0.50 |
| $65 \%$ | 128.51 | 306.49 | 3.12 | 0.76 | 3.94 | 0.29 | 155.67 | 0.42 |
| $75 \%$ | 128.51 | 353.64 | 0.92 | 0.18 | 1.14 | 0.29 | 155.67 | 0.36 |
| $85 \%$ | 128.51 | 400.79 | 0.30 | 0.00 | 0.06 | 0.29 | 155.67 | 0.32 |

## What I would do?

## Complex model

- Model: 23.3a
- Specify probability of terminally molting
- BSFRF as priors
- Currency of management: 95 or 100 mm
- SBPR reference points based on the model and currency chosen (rerun this with GMACS)

Simple model

- Survey estimate of 95 or 100 mm male crab
- Decrement by M to time of fishery

- Apply some exploitation rate (e.g. M)


## What I would do?

## Rationale

- Under uncertainty in reproductive dynamics, focus management on the portion of the stock for which management levers exist
- Reference points should reflect the dire circumstances of exploitable biomass
- Discrepancies between State and Federal catch advice is confusing



## Projections under a changing climate

## Population dynamics model

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- Arctic Oscillation
- Ice cover
- AO + Ice cover
- Average
- Density
- Density + ice cover



## What happens next?

- Density dependence and environmental covariates explain variability in mortality, recruitment and maturity better than no covariates.


Density vs. probability of terminally molting


## What happens next?

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- Impacts of changes in ice are strong for mortality and recruitment



## What happens next?

- Density dependence and environmental covariates explain variability in mortality, recruitment and maturity better than no covariates.
- Impacts of changes in ice are strong for mortality and recruitment
- Density dependence in mortality allows for a short window for rebound, after which the population declines



## What happens next?

- Density dependence and environmental covariates explain variability in mortality, recruitment and maturity better than no covariates.
- Impacts of changes in ice are strong for mortality and recruitment
- Density dependence in mortality allows for a short window for stronger rebound, after which the population declines


## If you believe the projection, what do you do?

- Strategic
- Change reference points?
- Thresholds in HCRs?
- Impacts of quotas and allocation of booming stocks
- Tactical
- Harvest ahead of heatwave or implement closures?
- Does this have any use when thinking about size at retention?

