# Supplementary files: Evaluating the impact of log-normal bias-correction on a state-space stock assessment model

- Chengxue Li<sup>1,2,3\*</sup> Jonathan J. Deroba<sup>1</sup> Timothy J. Miller<sup>1</sup>
- Christopher M. Legault<sup>1</sup> Charles T. Perretti<sup>1</sup>
- <sup>1</sup> Northeast Fisheries Science Center, Woods Hole Laboratory, 166 Water Street, Woods
- 7 Hole, MA 02543 USA
- <sup>8</sup> School of Marine and Atmospheric Sciences, Stony Brook University, Stony Brook, NY
- 9 11794, USA
- <sup>3</sup> Saltwater Inc., 733 N Street, Anchorage, AK 99501 USA
- \*Corresponding author: chengxue.li@noaa.gov

# 12 ORCID:

- 13 Chengxue Li: 0000-0001-7518-7234
- 14 Timothy J. Miller: 0000-0003-1411-1206
- 15 Christopher M. Legault: 0000-0002-0328-1376
- 16 Charles T. Perretti: 0000-0002-4316-3630.

Table S1. Parameters associated with random effects processes used for Georges Bank (GB) yellowtail flounder.

Random Effects Structure	Proc./Obs.	Rec sigma	NAA sigma	Rho (AR1_y)
Rec (iid)	ON & ON	1.07	NA	NA
Rec (iid)	OFF & ON	1.07	NA	NA
Rec (iid)	ON & OFF	1.08	NA	NA
Rec (iid)	OFF & OFF	1.08	NA	NA
Rec (ar1_y)	ON & ON	0.37	NA	0.96
Rec (ar1_y)	OFF & ON	0.37	NA	0.96
Rec (ar1_y)	ON & OFF	0.37	NA	0.96
Rec (ar1_y)	OFF & OFF	0.37	NA	0.96
Rec+NAA (iid)	ON & ON	1.23	0.55	NA
Rec+NAA (iid)	OFF & ON	1.23	0.56	NA
Rec+NAA (iid)	ON & OFF	1.24	0.55	NA
Rec+NAA (iid)	OFF & OFF	1.24	0.56	NA
$Rec+NAA\ (ar1\_y)$	ON & ON	0.55	0.21	0.94
Rec+NAA (ar1_y)	OFF & ON	0.55	0.21	0.94
Rec+NAA (ar1_y)	ON & OFF	0.55	0.21	0.94
Rec+NAA (ar1_y)	OFF & OFF	0.55	0.21	0.94

Table S2. Parameters associated with random effects processes used for Gulf of Maine (GoM) haddock.

Random Effects Structure	Proc./Obs.	Rec sigma	NAA sigma	Rho (AR1_y)
Rec (iid)	ON & ON	1.57	NA	NA
Rec (iid)	OFF & ON	1.57	NA	NA
Rec (iid)	ON & OFF	1.59	NA	NA
Rec (iid)	OFF & OFF	1.59	NA	NA
Rec (ar1_y)	ON & ON	1.16	NA	0.7
Rec (ar1_y)	OFF & ON	1.16	NA	0.7
Rec (ar1_y)	ON & OFF	1.17	NA	0.71
Rec (ar1_y)	OFF & OFF	1.17	NA	0.71
Rec+NAA (iid)	ON & ON	1.60	0.2	NA
Rec+NAA (iid)	OFF & ON	1.60	0.2	NA
Rec+NAA (iid)	ON & OFF	1.62	0.2	NA
Rec+NAA (iid)	OFF & OFF	1.62	0.2	NA
$Rec+NAA~(ar1\_y)$	ON & ON	1.18	0.16	0.6
$Rec+NAA~(ar1\_y)$	OFF & ON	1.18	0.16	0.6
$Rec+NAA~(ar1\_y)$	ON & OFF	1.18	0.17	0.61
Rec+NAA (ar1_y)	OFF & OFF	1.18	0.16	0.61

 ${\it Table S3. Parameters associated with random effects processes used for Atlantic mackerel.}$ 

Random Effects Structure	Proc./Obs.	Rec sigma	NAA sigma	Rho (AR1_y)
Rec (iid)	ON & ON	1.11	NA	NA
Rec (iid)	OFF & ON	1.11	NA	NA
Rec (iid)	ON & OFF	1.11	NA	NA
Rec (iid)	OFF & OFF	1.11	NA	NA
Rec (ar1_y)	ON & ON	1.00	NA	0.46
Rec (ar1_y)	OFF & ON	1.00	NA	0.46
Rec (ar1_y)	ON & OFF	1.01	NA	0.46
Rec (ar1_y)	OFF & OFF	1.01	NA	0.46
Rec+NAA (iid)	ON & ON	1.02	0.28	NA
Rec+NAA (iid)	OFF & ON	1.02	0.28	NA
Rec+NAA (iid)	ON & OFF	1.02	0.28	NA
Rec+NAA (iid)	OFF & OFF	1.02	0.28	NA
$Rec+NAA (ar1\_y)$	ON & ON	0.89	0.32	0.49
Rec+NAA (ar1_y)	OFF & ON	0.89	0.32	0.49
Rec+NAA (ar1_y)	ON & OFF	0.90	0.32	0.48
Rec+NAA (ar1_y)	OFF & OFF	0.90	0.32	0.48

Table S4. Convergence rates of misspecified models across different stocks.

OM	EM	Convergence Rate	Stock	Random Effects Structure
BC-OFF	BC-ON	1.00	Flounder	Rec (IID)
BC-ON	BC-OFF	1.00	Flounder	Rec (IID)
BC-ON	BC-OFF	1.00	Flounder	Rec (AR1y)
BC-OFF	BC-ON	1.00	Flounder	Rec (AR1y)
BC-OFF	BC-ON	1.00	Flounder	Rec+NAA (IID)
BC-ON	BC-OFF	1.00	Flounder	Rec+NAA (IID)
BC-OFF	BC-ON	1.00	Flounder	Rec+NAA (AR1y)
BC-ON	BC-OFF	0.98	Flounder	Rec+NAA (AR1y)
BC-OFF	BC-ON	1.00	Haddock	Rec (IID)
BC-ON	BC-OFF	1.00	Haddock	Rec (IID)
BC-OFF	BC-ON	1.00	Haddock	Rec (AR1y)
BC-ON	BC-OFF	1.00	Haddock	Rec (AR1y)
BC-OFF	BC-ON	0.98	Haddock	Rec+NAA (IID)
BC-ON	BC-OFF	0.96	Haddock	Rec+NAA (IID)
BC-OFF	BC-ON	0.98	Haddock	Rec+NAA (AR1y)
BC-ON	BC-OFF	0.90	Haddock	Rec+NAA (AR1y)
BC-OFF	BC-ON	1.00	Mackerel	Rec (IID)
BC-ON	BC-OFF	1.00	Mackerel	Rec (IID)
BC-OFF	BC-ON	0.98	Mackerel	Rec (AR1y)
BC-ON	BC-OFF	1.00	Mackerel	Rec (AR1y)
BC-OFF	BC-ON	1.00	Mackerel	Rec+NAA (IID)
BC-ON	BC-OFF	1.00	Mackerel	Rec+NAA (IID)
BC-OFF	BC-ON	1.00	Mackerel	Rec+NAA (AR1y)
BC-ON	BC-OFF	0.96	Mackerel	Rec+NAA (AR1y)

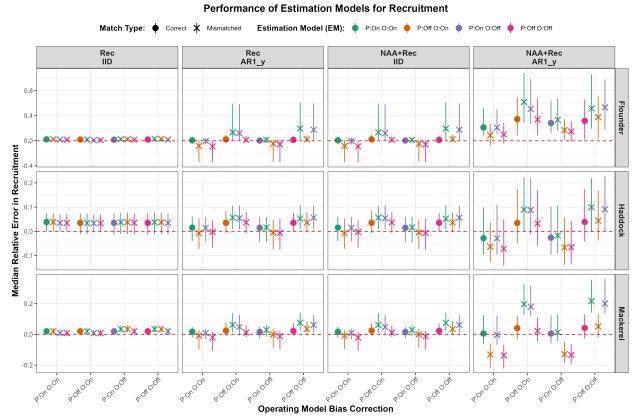


Fig. S1. Median relative error of recruitment calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

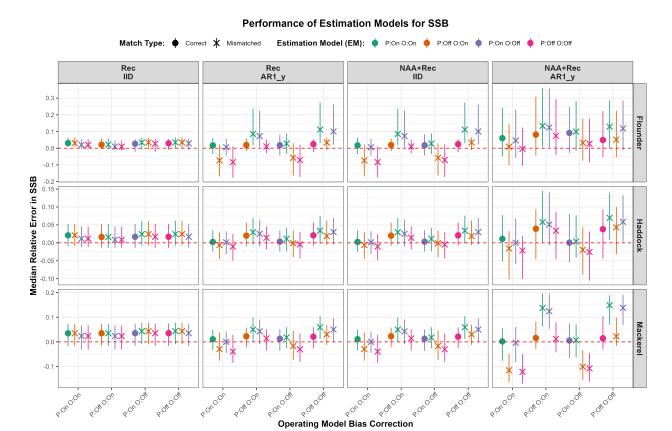


Fig. S2. Median relative error of SSB calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

# Median Relative Error of NAA (Age > 1)

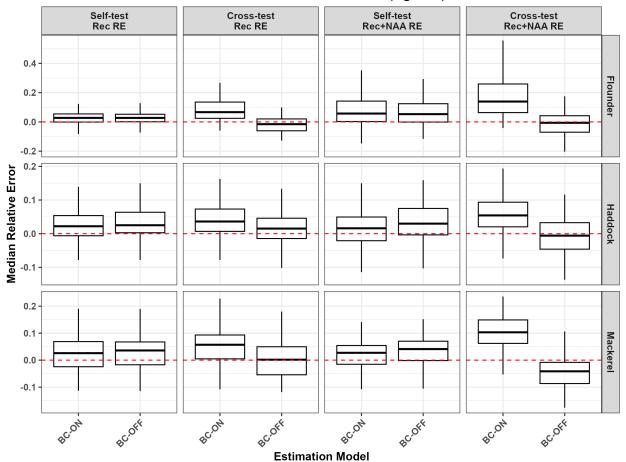


Fig. S3. Median relative error of NAA calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

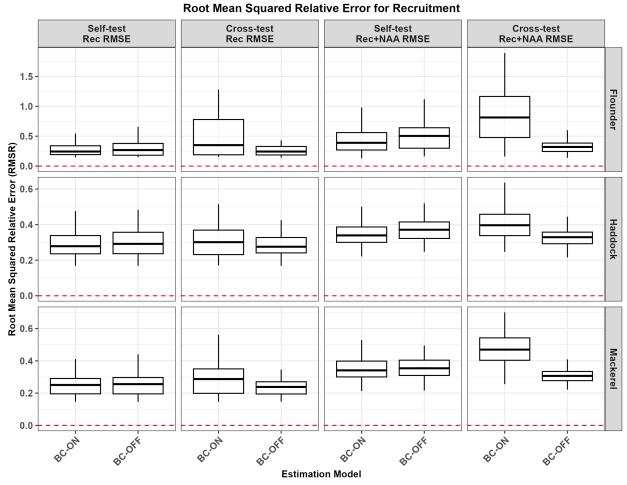


Fig. S4. Root mean squared relative error (RMSR) of recruitment calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

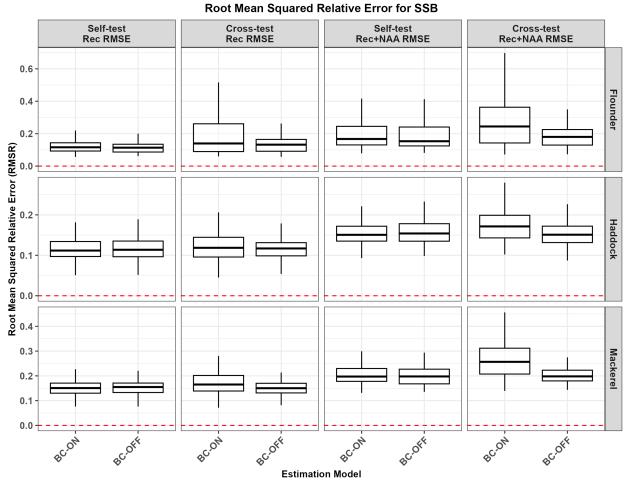


Fig. S5. Root mean squared relative error (RMSR) of SSB calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

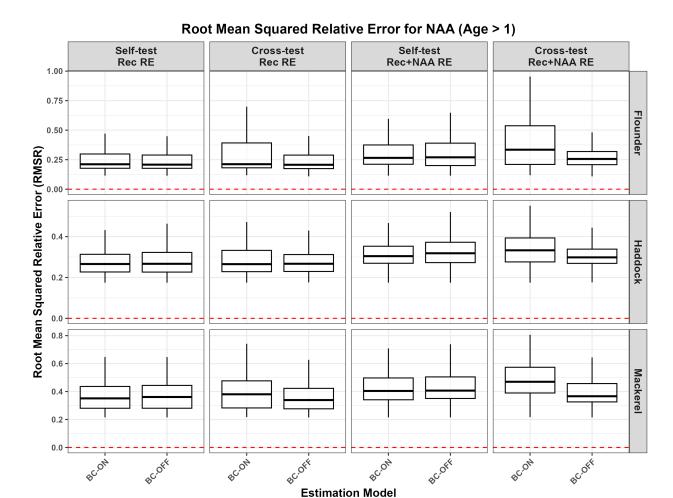


Fig. S6. Root mean squared relative error (RMSR) of NAA calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

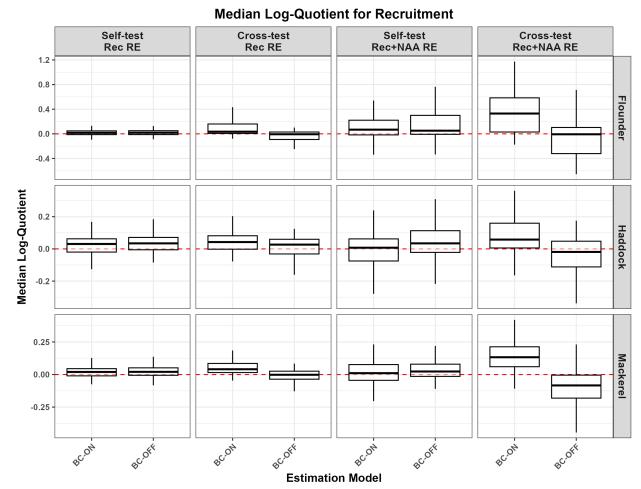


Fig. S7. Median log-quotient (MdLQ) of recruitment calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

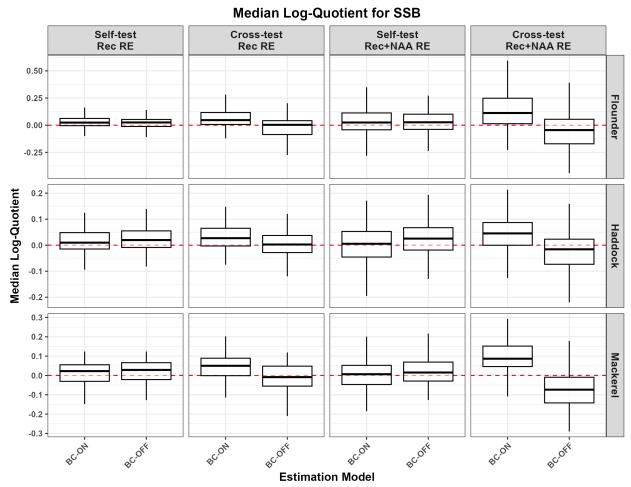


Fig. S8. Median log-quotient (MdLQ) of SSB calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

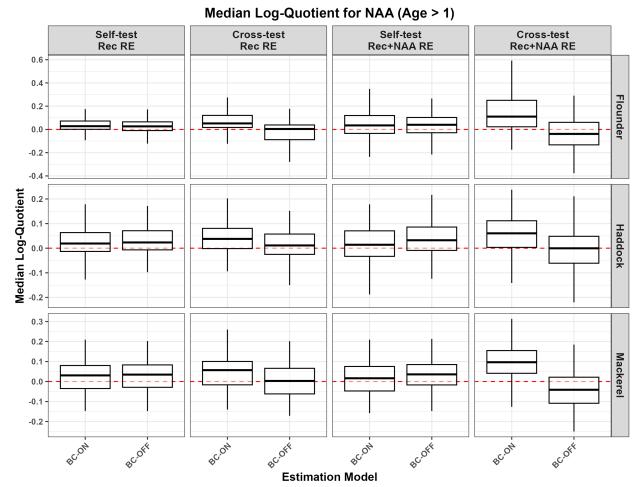


Fig. S9. Median log-quotient (MdLQ) of NAA calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

# Median Symmetric Signed Percentage Bias of Recruitment

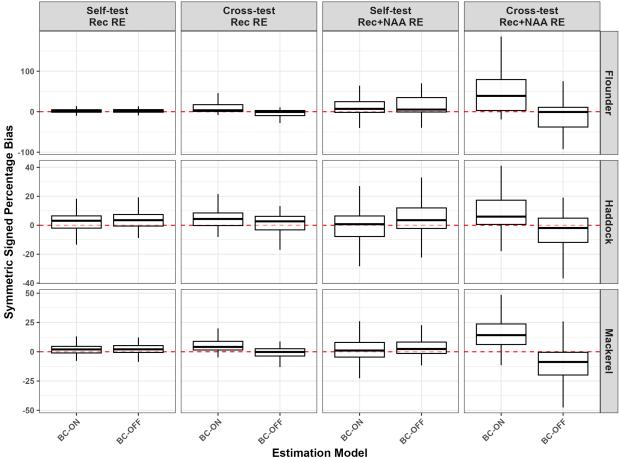


Fig. S10. Median symmetric signed percentage bias (SSPB) of recruitment calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

# Median Symmetric Signed Percentage Bias of SSB

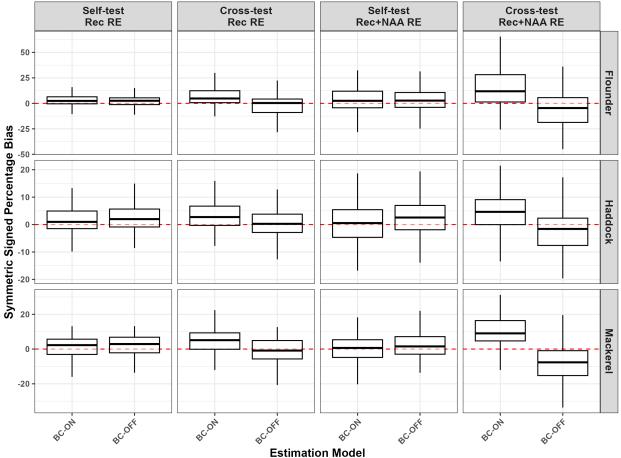


Fig. S11. Median symmetric signed percentage bias (SSPB) of SSB calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

# Median Symmetric Signed Percentage Bias of NAA (Age > 1) Self-test Rec RE Rec RE Rec+NAA RE Self-test Rec+NAA RE Tomore Tomore

# Fig. S12. Median symmetric signed percentage bias (SSPB) of NAA calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

**Estimation Model** 

&C.OFF

BC-OFF

BC.ON

&C.OFK

BC.ON

BC.OFF

-20

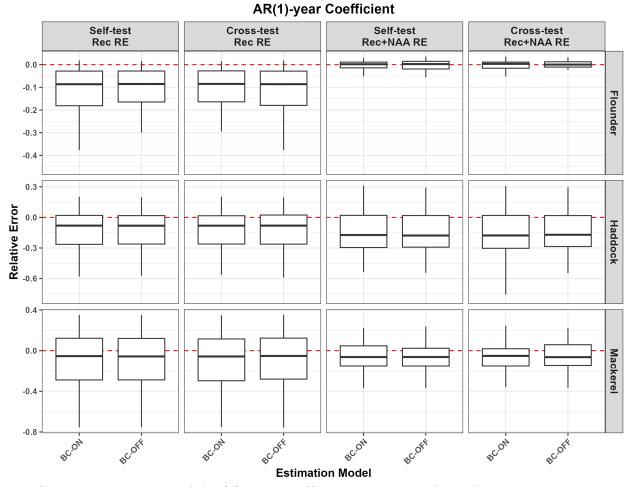


Fig. S13. Relative error of AR(1)-year coefficient calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

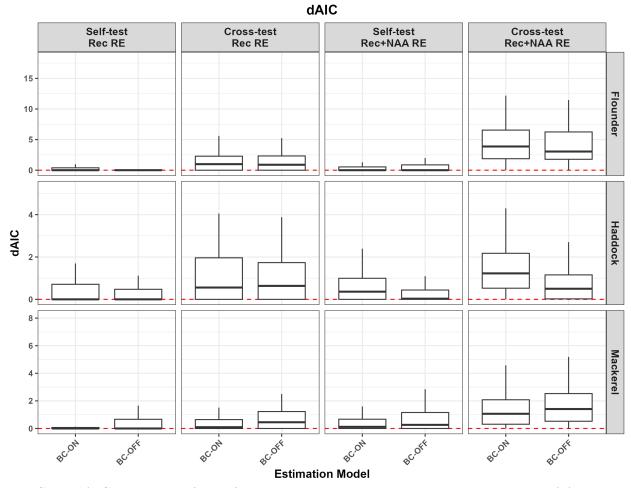


Fig. S14. dAIC calculated for self-tests and cross-tests. "Rec RE" and "Rec+NAA RE" in the top facet indicate operating models (OMs) with only recruitment random effects and both recruitment and NAA random effects, respectively.

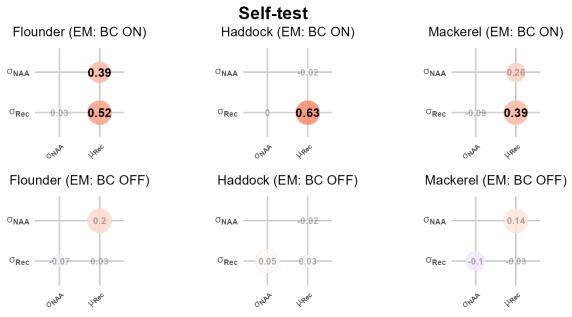


Fig. S15. Correlation plot for the OM with both recruitment and NAA treated as IID random effects. The correlations were calculated from self-tests, where the EM had the same bias correction as the operating model (OM). Correlations in **bold** indicate statistically significant values (p-value < 0.05).

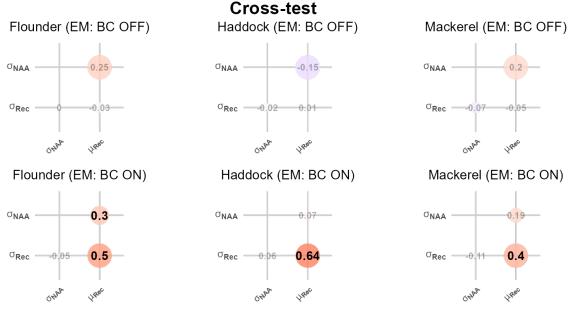


Fig. S16. Correlation plot for the OM with both recruitment and NAA treated as IID random effects. The correlations were calculated from cross-tests, where the EM had a different bias correction than the operating model (OM). Correlations in **bold** indicate statistically significant values (p-value < 0.05).

### Cross-test Recruitment Low Observation Error (CV = 0.05)

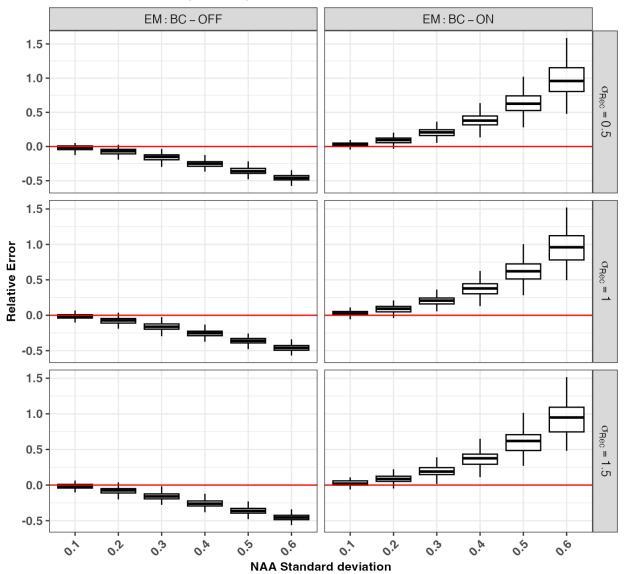


Fig. S17. Relative errors of recruitment estimates summarized from 50 realizations for each scenario. Two operating models (OMs) (with bias correction applied or omitted for both processes and observations) for Gulf of Maine (GoM) haddock with both recruitment and NAA IID random effects (see Table S2) were used to conduct simulation-estimation experiments. The study evaluated the effects of recruitment variability ( $\sigma_{Rec} = 0.5, 1, 1.5$ ) and NAA variability ( $\sigma_{NAA} = 0.1, 0.2, ... 0.6$ ) in a factorial design through self-tests and cross-tests. To isolate the impact of observation error, the coefficient of variation (CV) for observations was set to 0.05.

## Cross-test SSB Low Observation Error (CV = 0.05)

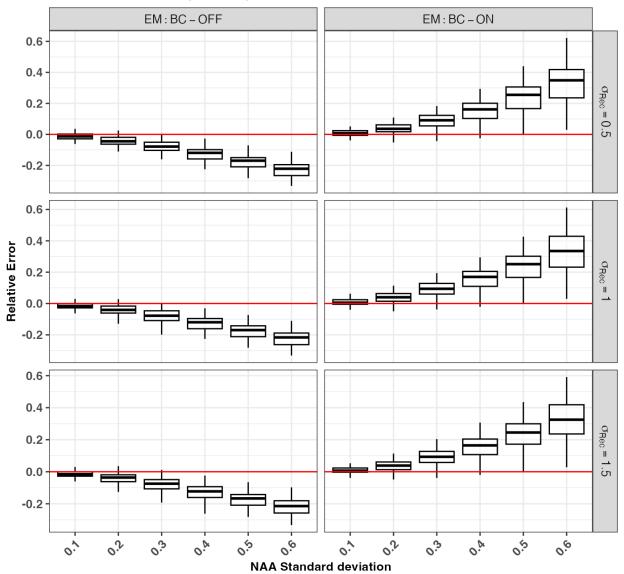


Fig. S18. Relative errors of SSB estimates summarized from 50 realizations for each scenario. Two operating models (OMs) (with bias correction applied or omitted for both processes and observations) for Gulf of Maine (GoM) haddock with both recruitment and NAA IID random effects (see Table S2) were used to conduct simulation-estimation experiments. The study evaluated the effects of recruitment variability ( $\sigma_{Rec} = 0.5, 1, 1.5$ ) and NAA variability ( $\sigma_{NAA} = 0.1, 0.2, ... 0.6$ ) in a factorial design through self-tests and cross-tests. To isolate the impact of observation error, the coefficient of variation (CV) for observations was set to 0.05.

# **Median Recruitment (Intermediate Years)**

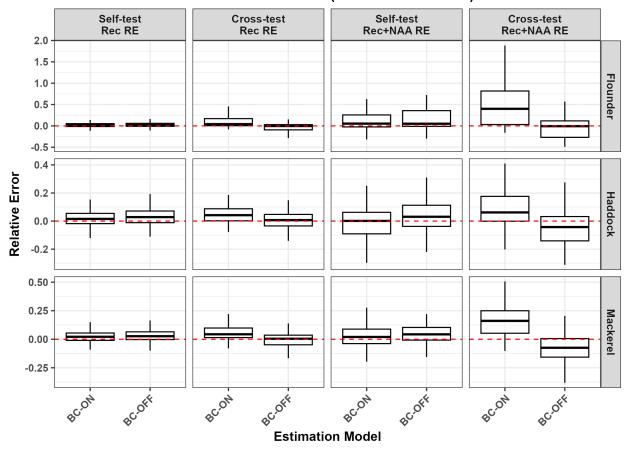


Fig. S19. Median relative error of recruitment in the intermediate period (with first and last 10 years of estimates removed).

# Median SSB (Intermediate Years)

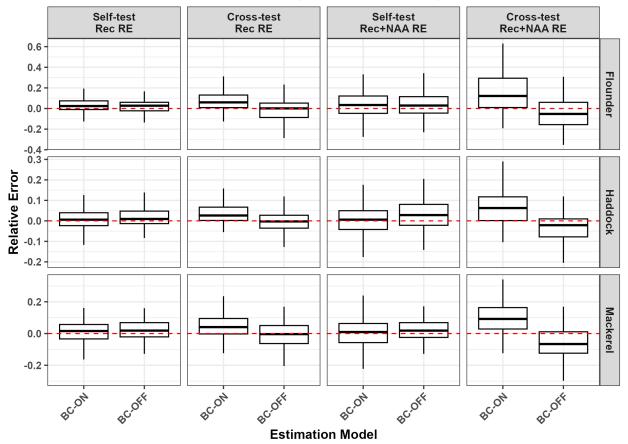


Fig. S20. Median relative error of SSB in the intermediate period (with first and last 10 years of estimates removed).