

IOTC-2022-WPTT24(DP)-19



MEMBER OF
BASQUE RESEARCH
& TECHNOLOGY ALLIANCE

www.azti.es

Analysis of recruitment deviates of tropical tuna stock assessments

Options for a new diagnostic for ensembles of models

Merino, G., A. Urtizbera, D. Fu, H. Winker, M. Cardinale, M.V. Lauretta, H. Murua, T. Kitakado, H. Arrizabalagaa, R. Scott, G. Pilling, C. Minte-Vera, H. Xui, A. Laborda, M. Erauskin-Extramianiana, A. Uriarte, J. Santiago

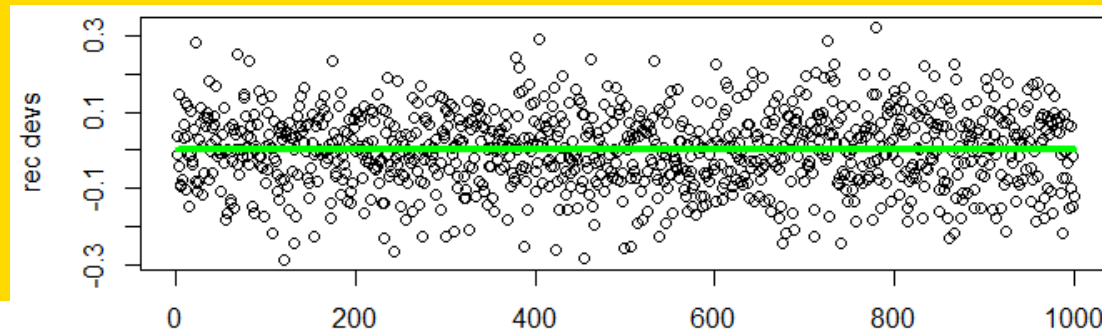
WPTT(DataPrepartory)-

Context in stock assessments (tropical tunas)

- Stocks productivity (life-history) determines response to fishing.
 - Data (C, CPUE, SFD...) vs underlying productivity.
 - Intrinsic factors (life history traits) vs extrinsic factors (fishing).
 - Productivity: Growth (fixed), M (fixed), steepness (fixed), R0 (free).
- Trends in abundance determined by productivity and recruitment deviates allow improving fits to variability of data).

Context in stock assessments (tropical tunas)

- Stocks productivity (life-history) determines response to fishing.
 - Data (C, CPUE, SFD...) vs underlying productivity.
 - Intrinsic factors (life history traits) vs extrinsic factors (fishing).
 - Productivity: Growth (fixed), M (fixed), steepness (fixed), R0 (free).
- Trends in abundance determined by productivity and recruitment deviates allow improving fits to variability of data).
- Ideal rec devs (process error) have no trends and maintain properties through time.



Context in stock assessments (tropical tunas)

- Stocks productivity (life-history) determines response to fishing.
 - Data (C, CPUE, SFD...) vs underlying productivity.
 - Intrinsic factors (life history traits) vs extrinsic factors (fishing).
 - Productivity: Growth (fixed), M (fixed), steepness (fixed), R0 (free).
- Trends in abundance determined by productivity and recruitment deviates allow improving fits to variability of data).
- Ideal rec devs (process error) have no trends and maintain properties through time.
- Tropical tuna SA using ensembles of models (combinations of assumptions, often biological).
- Diagnostics routinely incorporated in SA development (retro, hindcast, ... time consuming)
- Diagnostics often developed for base case only.

Objectives

- Explore trends in recruitment deviates and illustrate their links to hypotheses on productivity.
- Elucidate role of rec devs (variability or response to high catch).
- Develop a quick diagnostic to provide statistical support to hypotheses and assumptions in ensembles of models used to provide management advice.

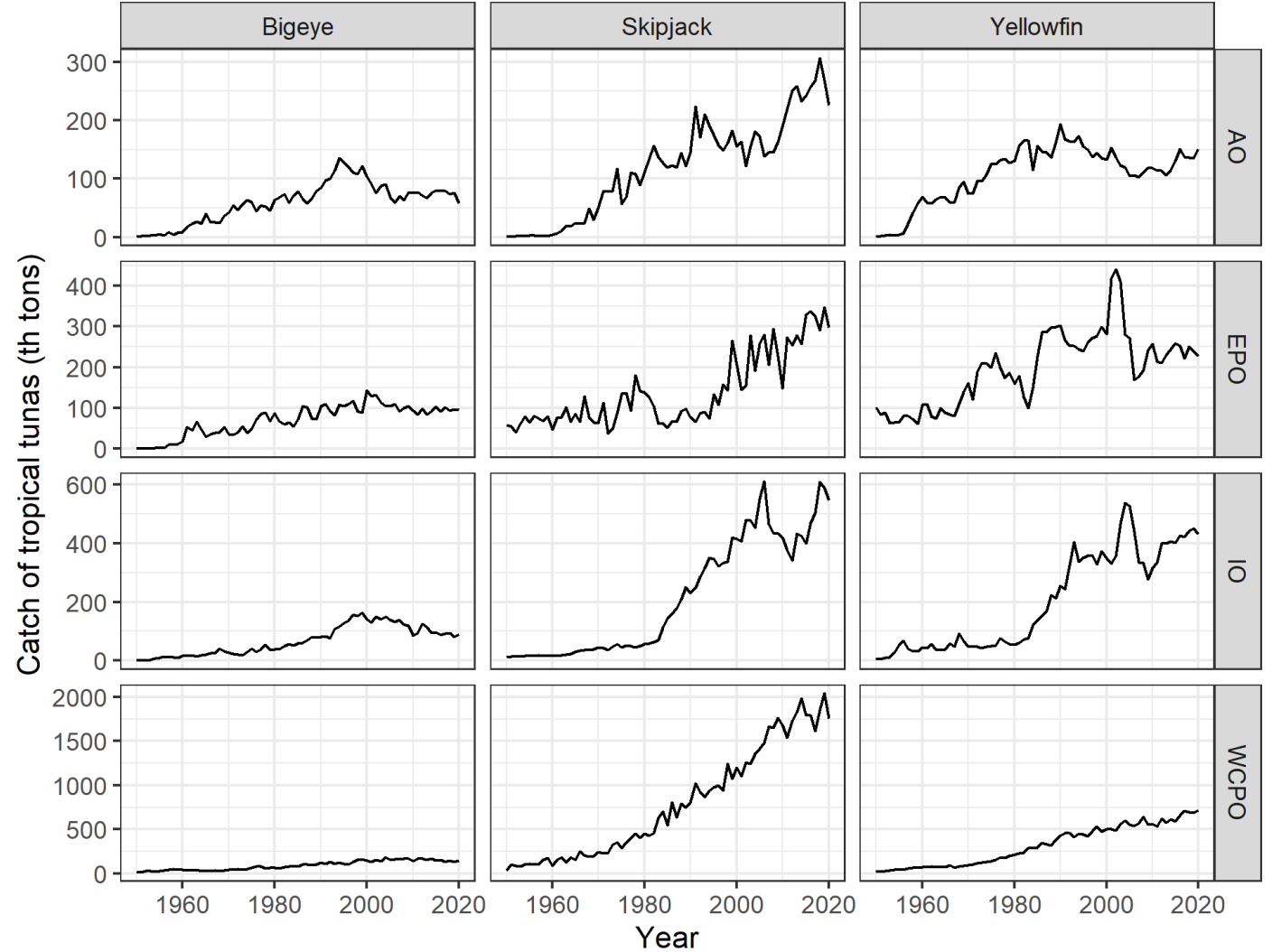
Material and methods

- SS3 and Multifan-CL output from SA of tropical tunas (ICCAT, IOTC, IATTC and WCPFC).
 - Extract recruitment deviates and verify no-trend for each model of ensembles.
 - *No_trend* test from *funtimes* (Lyubichcich et al., 2022), *Student's test*, *p-value (no linear trend)*.
- Experiments on IO yellowfin stock assessment (Fu et al., 2021).
 - Ensemble of Steepness (h, 3), Growth (G, 2), Mortality (M, 2), Piracy (q, 2), Spatial (lo, Sp, 2), Tag (lambda, 2).
 - Run models without rec devs (Deactivate option in control files) and compare output (MSY, R0 and B/BMSY).
 - Produce bias in growth and mortality and carry out SA from simulated data (Dunn et al., 2020).
 - Compare p-value of *no_trend* test with other diagnostics (Carvalho et al., 2021).
 - ASPM, Mohn's rho, MASE and others.

Results

(1) Catch history

- Tropical tuna fisheries developed with LL (~60s) and with PS (~80s).
- Peaks reached (1990-2010, second half).
- Some nearby historical maxima.



Results

(2) Rec devs vs time

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)



Results

(2) Rec devs vs time

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)



Results

(2) Rec devs vs time

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

- Role of rec devs?

Variability vs response to catch



Results

(3) Rec devs vs MSY

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

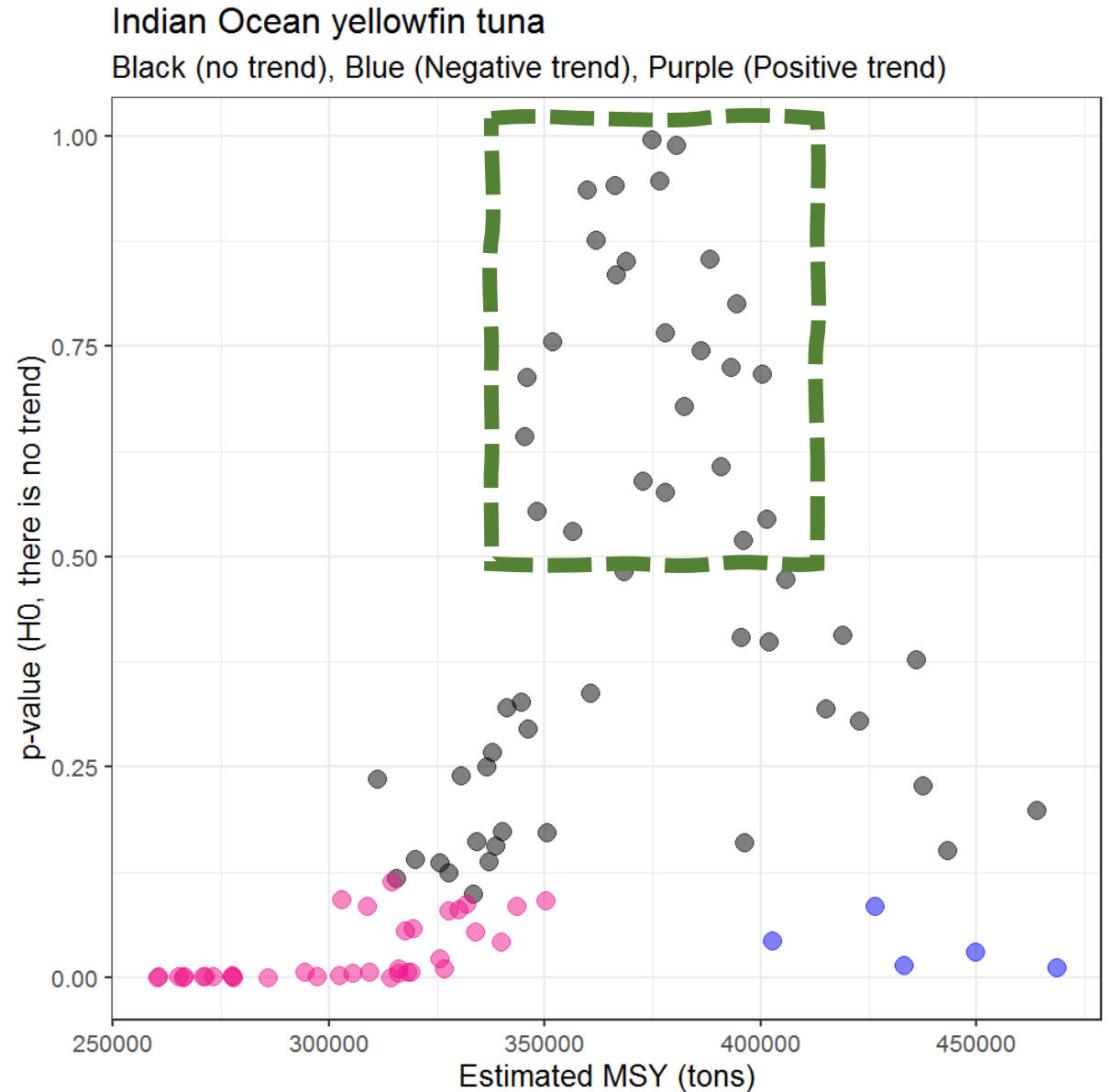
- Role of rec devs?

Variability vs response to catch

Upper range of MSY

Lower range of MSY

Middle range of MSY



- Average [1992-2020] = 382 th tons.
- Average [2000-2020] = 401 th tons.
- Sustainable without rec devs?

Results

(3) Rec devs vs MSY

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

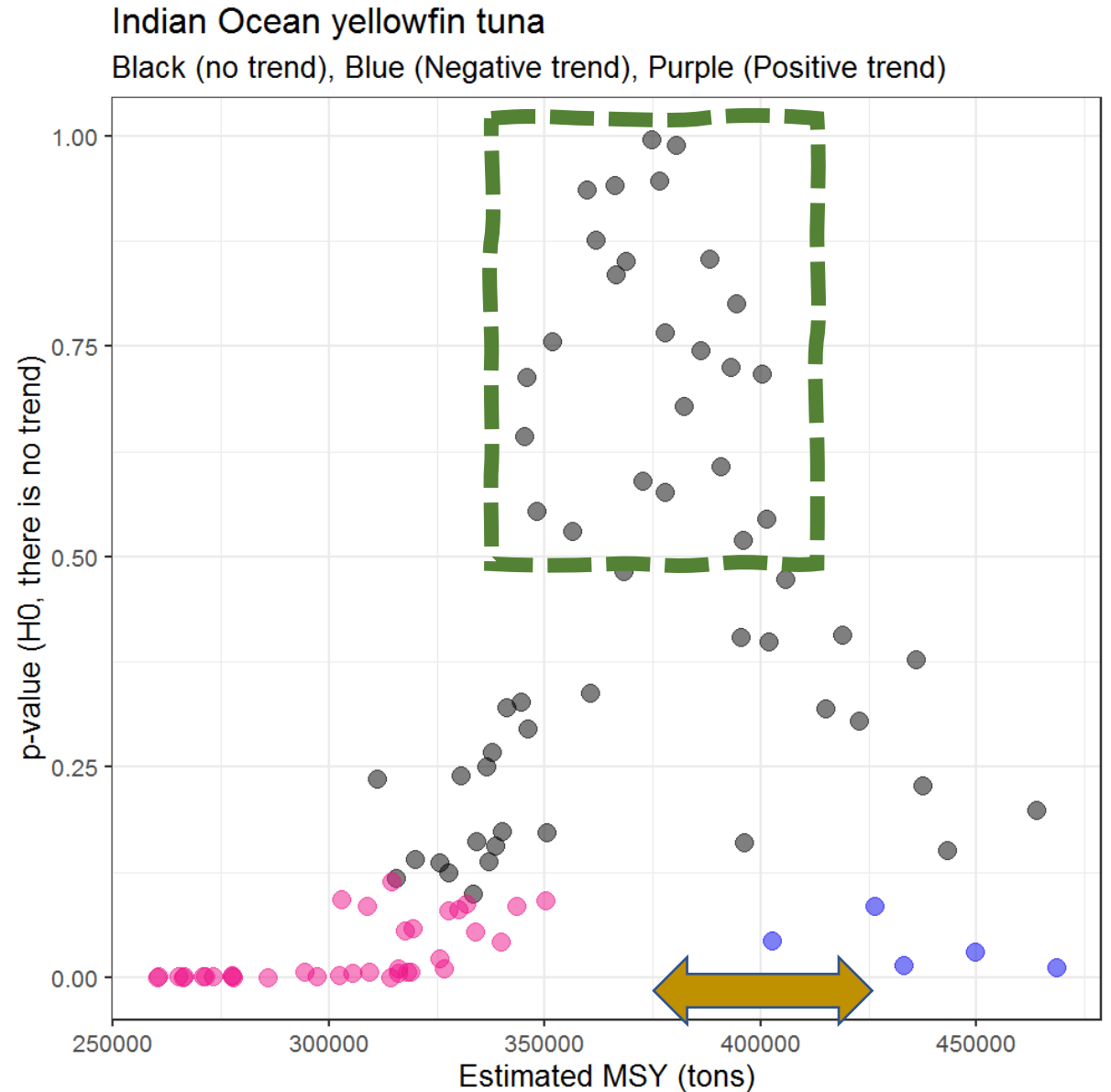
- Role of rec devs?

Variability vs response to catch

Upper range of MSY

Lower range of MSY

Middle range of MSY



Results

(4) Rec devs vs difference with/without devs (MSY)

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

- Role of rec devs?

Variability vs response to catch

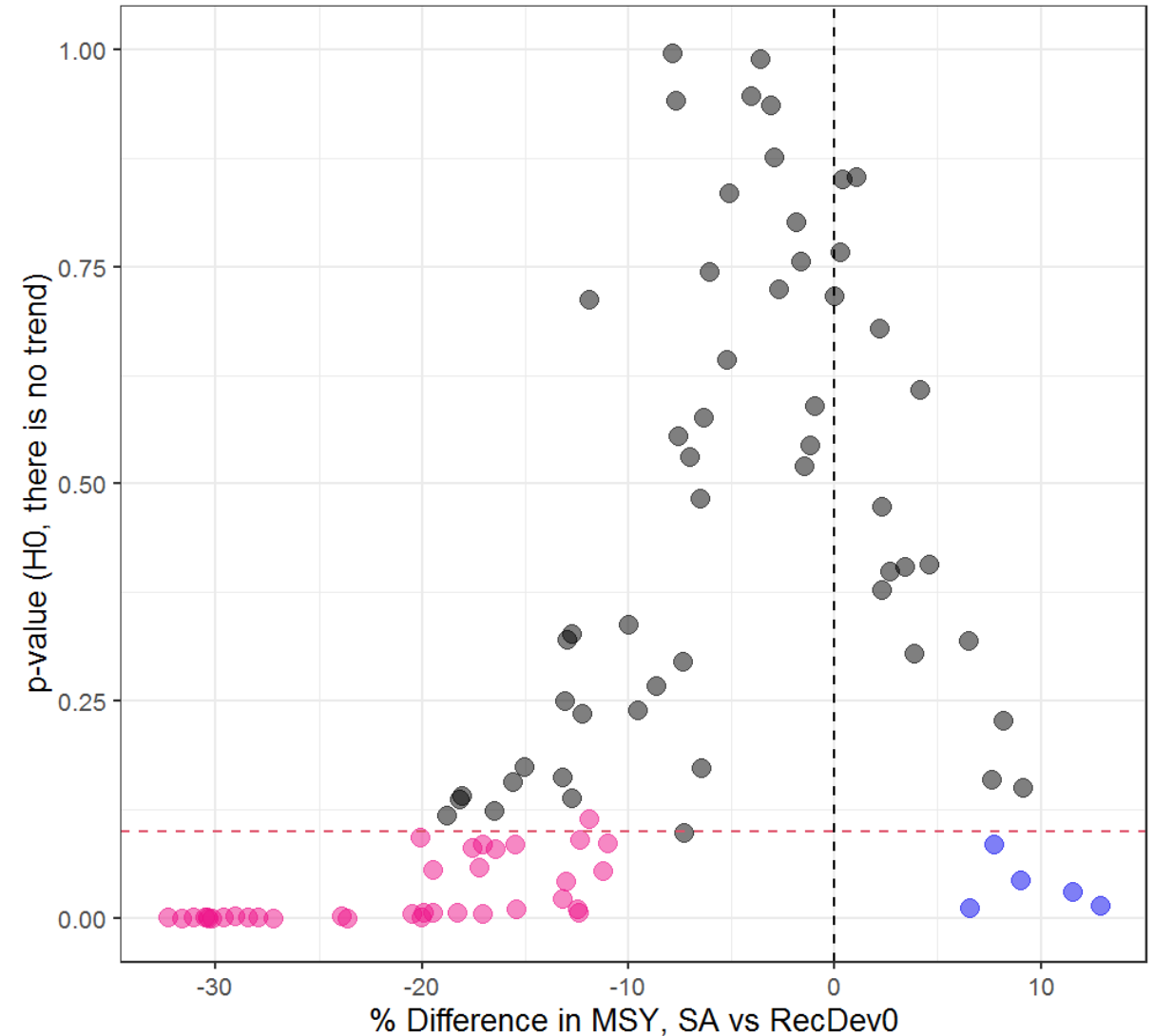
Upper range of MSY \longrightarrow $MSY_{SA} > MSY_{RecDev0}$

Lower range of MSY \longrightarrow $MSY_{SA} < MSY_{RecDev0}$

Middle range of MSY \longrightarrow $MSY_{SA} \sim MSY_{RecDev0}$

Indian Ocean yellowfin tuna (MSY)

Black (no trend), Blue (Negative trend), Purple (Positive trend)





Fixed M, G, h -> increase R0 if it needs to fit data with underlying productivity (RecDev0).
With rec devs these can be used to respond to high catch instead of underlying productivity (SA).

Results

(4) Rec devs vs difference with/without devs (R0)

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

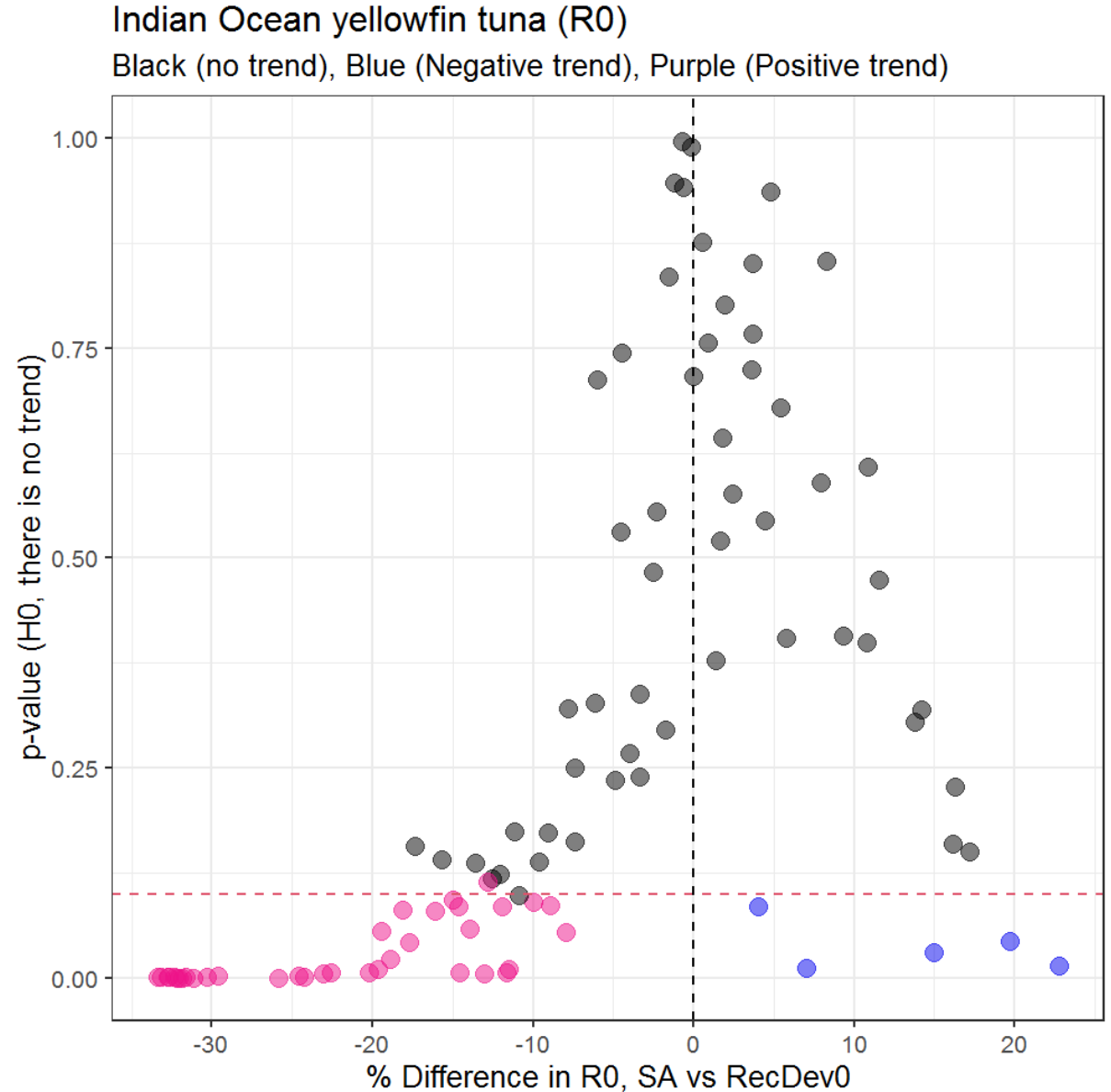
- Role of rec devs?

Variability vs response to catch

Upper range of MSY $\rightarrow R0_{SA} > R0_{RecDev0}$

Lower range of MSY $\rightarrow R0_{SA} < R0_{RecDev0}$

Middle range of MSY $\rightarrow R0_{SA} \sim R0_{RecDev0}$





Fixed M, G, h -> increase R0 if it needs to fit data with underlying productivity (RecDev0).
With rec devs these can be used to respond to high catch instead of underlying productivity (SA).

Results

(4) Rec devs vs difference with/without devs (B/B_{msy})

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

- Role of rec devs?

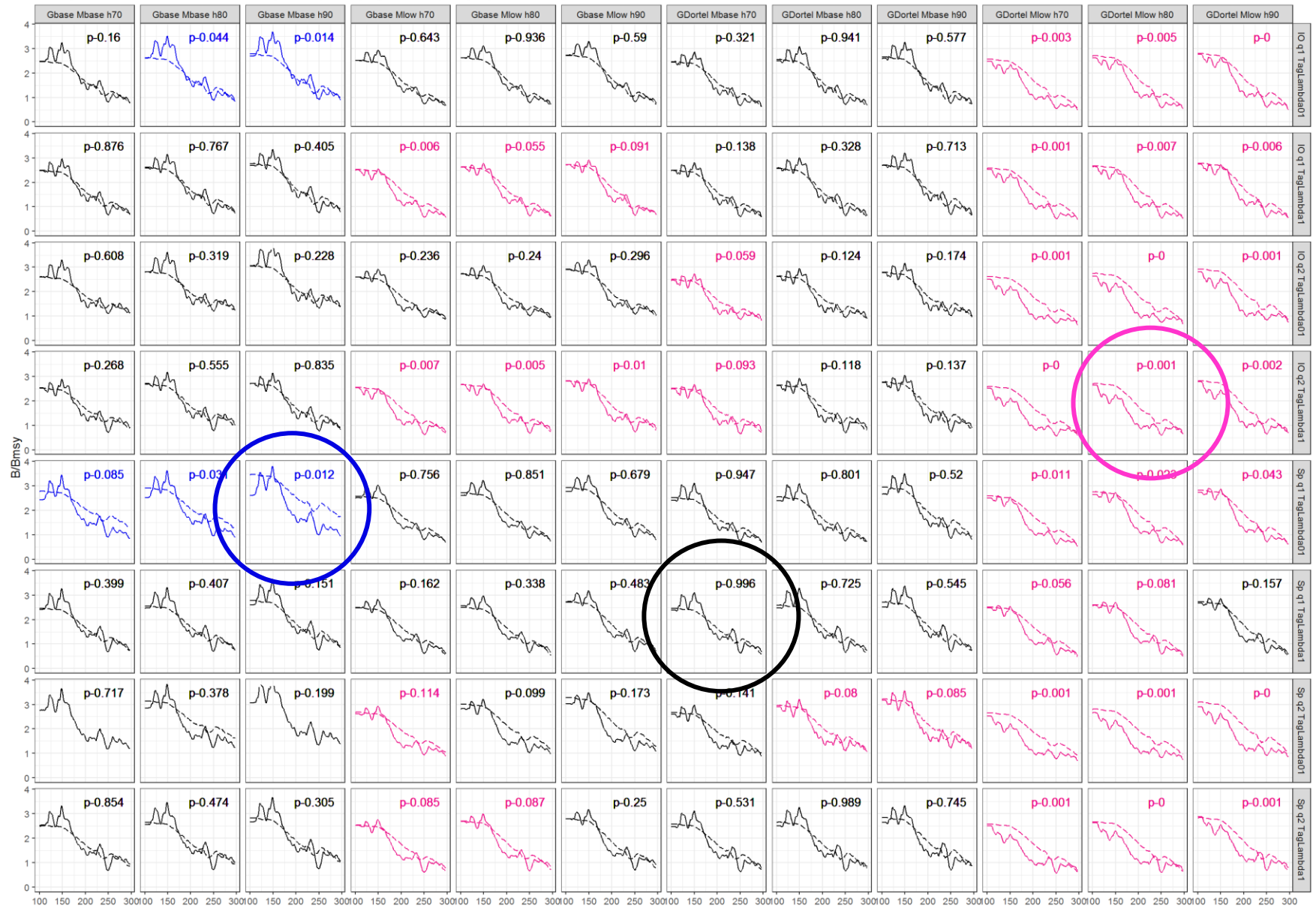
Variability vs response to catch

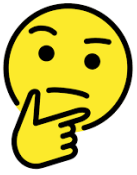
Comparable trends

Comparable status terminal year, very different throughout.

Larger B/B_{msy} (RecDev0) at the start and throughout.

Indian Ocean yellowfin tuna stock assessment vs RecDev0 (B/B_{msy})
B/B_{msy} for the SA and with RecDev0, Black (no trend), Blue (Negative trend), Purple (Positive trend)





Fixed M, G, h -> increase R0 if it needs to fit data with underlying productivity (RecDev0).
With rec devs these can be used to respond to high catch instead of underlying productivity (SA).

Results

(4) Rec devs vs difference with/without devs (B/B_{msy})

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Evidence of rec dev trends

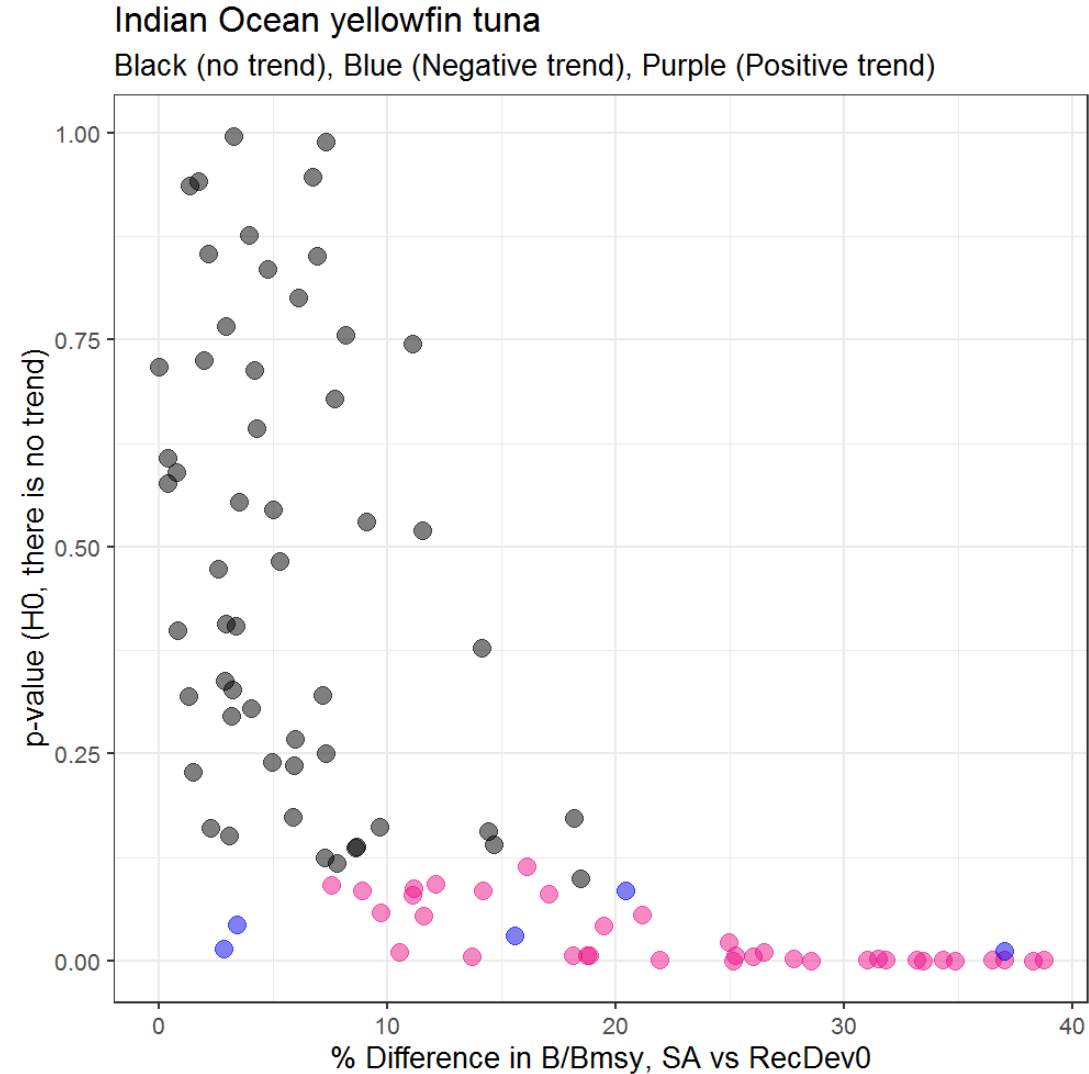
- Role of rec devs?

Variability vs response to catch

Comparable trends

Comparable status terminal year, very different throughout.

Larger B/B_{msy} (RecDev0) ty and throughout.



Results

(5) Rec devs in simulated model (Dunn et al, 2020). Extract data with error from OM using two growth curves (as in OM and Dortel) and a range of biased natural mortality ($M_{050}=M_{50}\%$ lower than M_{100} and $M_{150}=50\%$ larger than M_{100} , $M_{100}=M$ from OM).

Evidence of rec dev trends Bias in assumptions?

- Positive and negative trends with extreme bias only ($\pm 90\%$).

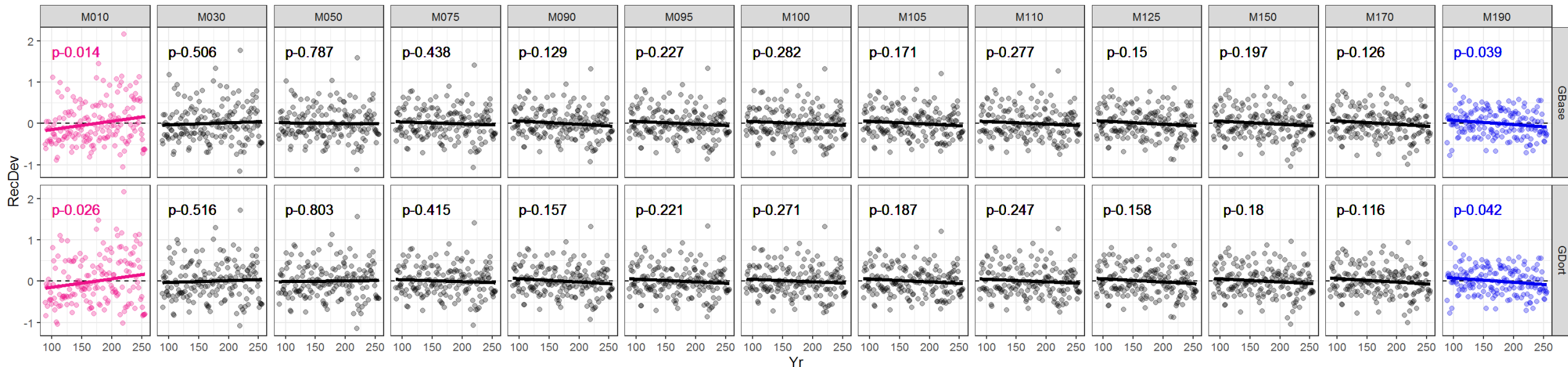
Results

(5) Rec devs in simulated model (Dunn et al, 2020). Extract data with error from OM using two growth curves (as in OM and DorteI) and a range of biased natural mortality (M050=M50% lower than M100 and M150=50% larger than M100, M100=M from OM).

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

Indian Ocean yellowfin tuna (Simulated)

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Evidence of rec dev trends

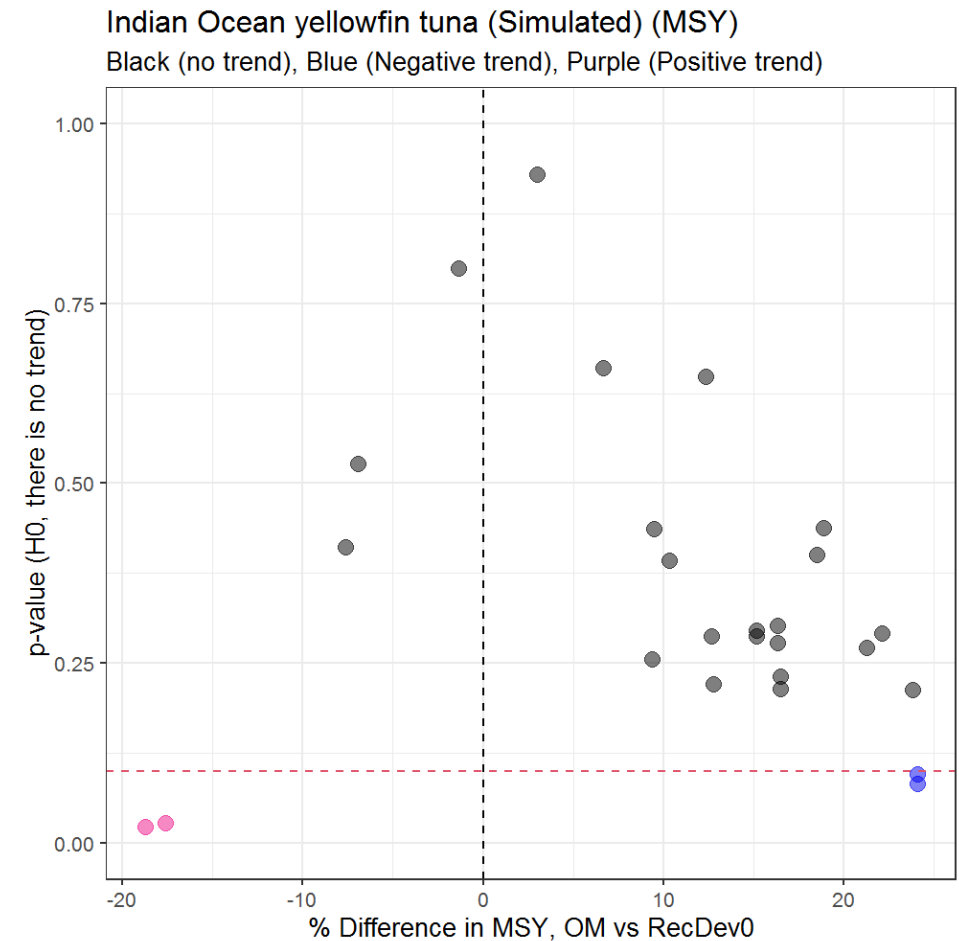
Bias in assumptions?

Results

- **Positive** and **negative** trends with extreme bias only ($\pm 90\%$).
- As expected, lower M \rightarrow lower MSY \rightarrow Increasing trends and likewise higher M.

(5) Rec devs in simulated model (Dunn et al, 2020).

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)



Evidence of rec dev trends

Bias in assumptions? Incompatibility of assumptions and data conflict?

Results

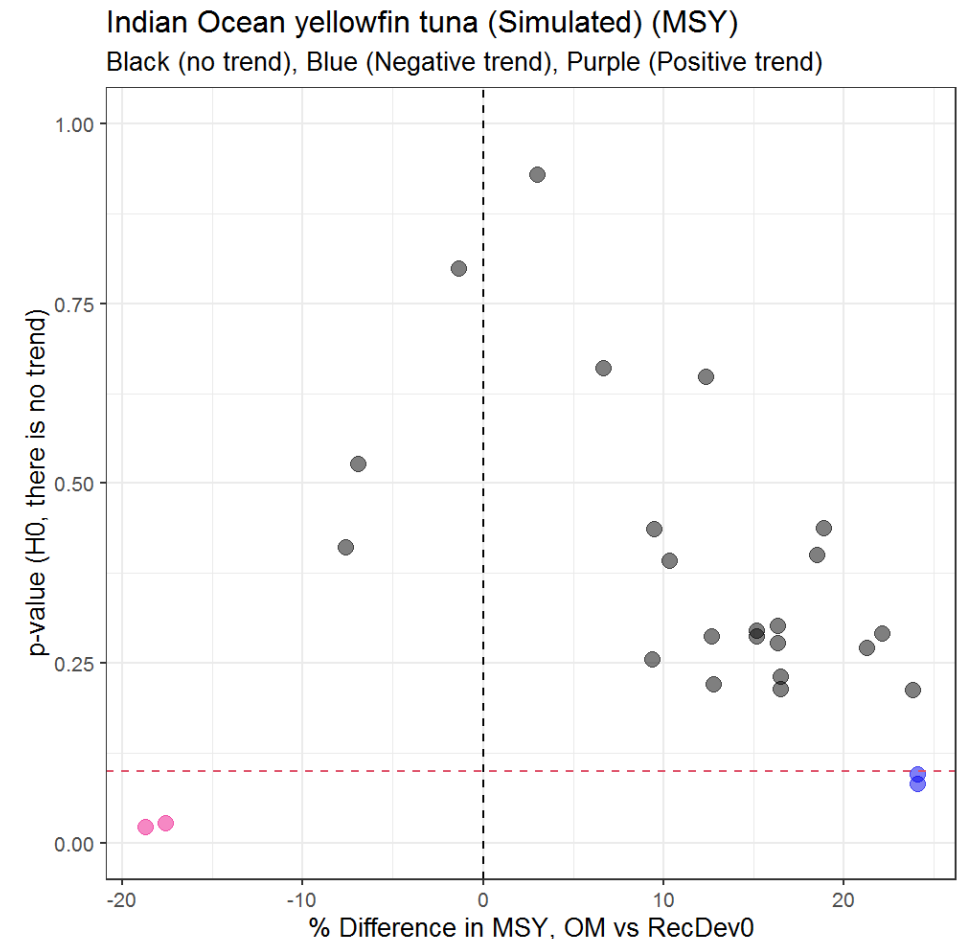
- **Positive** and **negative** trends with extreme bias only ($\pm 90\%$).
- As expected, lower M \rightarrow lower MSY \rightarrow Increasing trends and likewise higher M.

(5) Rec devs in simulated model (Dunn et al, 2020).

- Black (no trend, $p > 0.1$)
- Blue (decreasing, $p < 0.1$)
- Purple (increasing, $p < 0.1$)

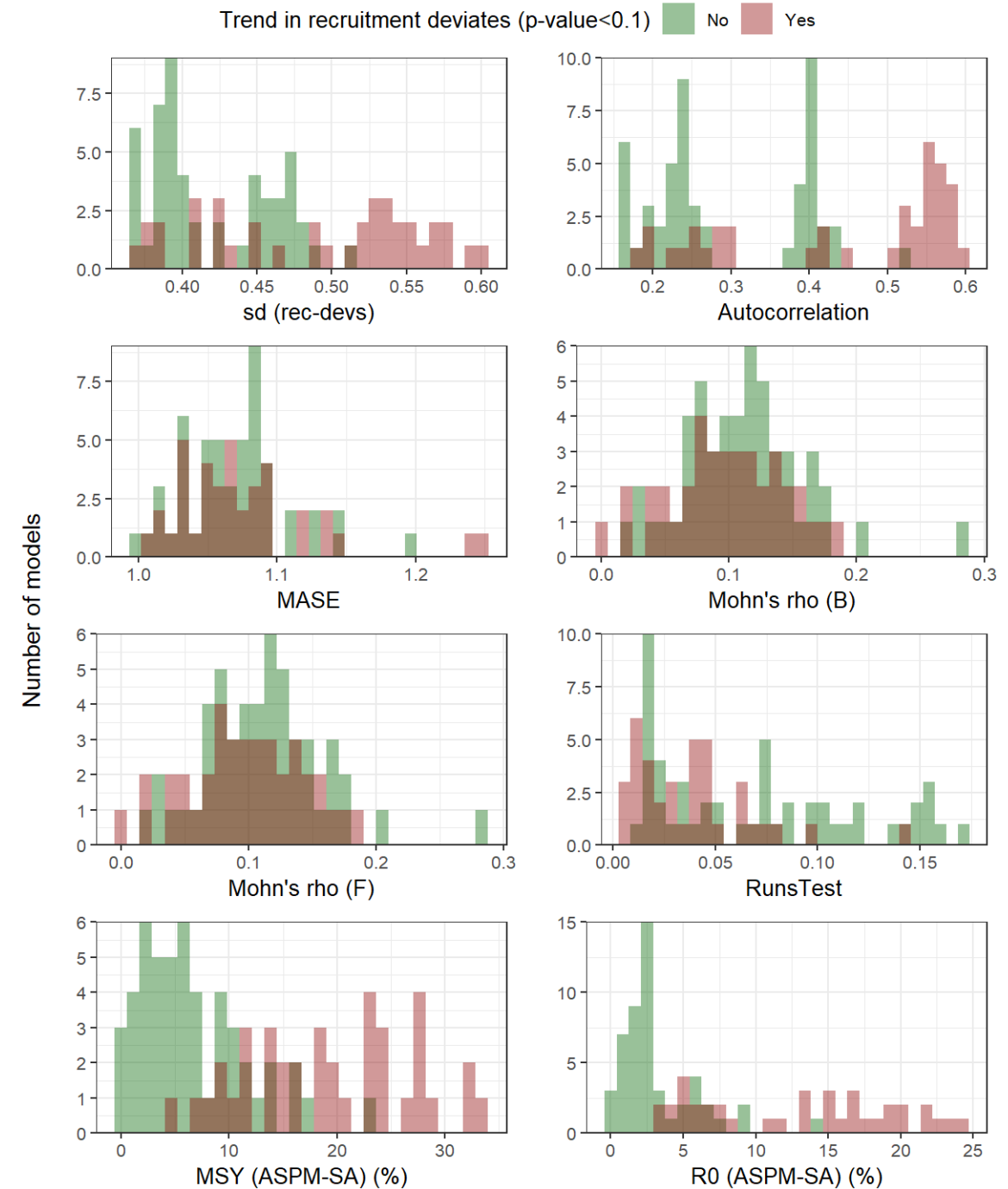
Why only in extreme bias?

- Good consistency between catch, CPUE, Tags and SFD in OM \neq SA.
- IO yft SA disaggregated and trends in regional distribution also identified which suggests additional problems that do not affect the OM.



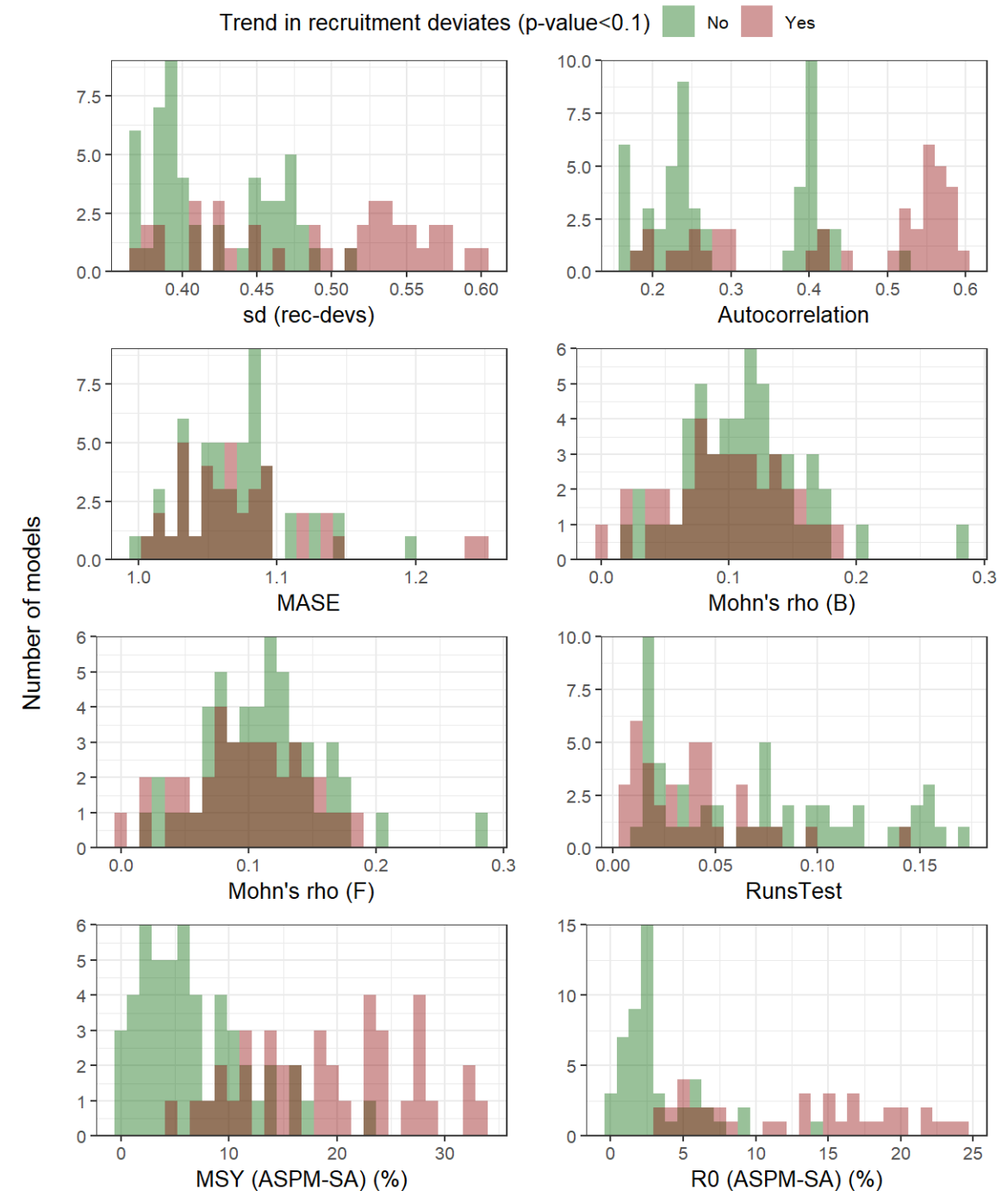
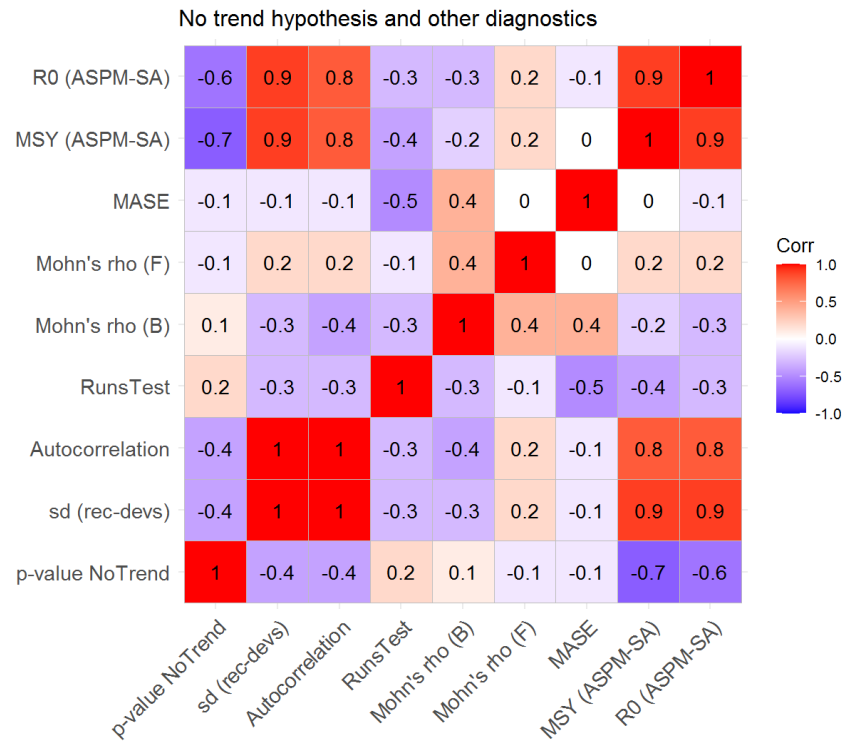
Results

(6) Consistency with other diagnostics



Results

(6) Consistency with other diagnostics

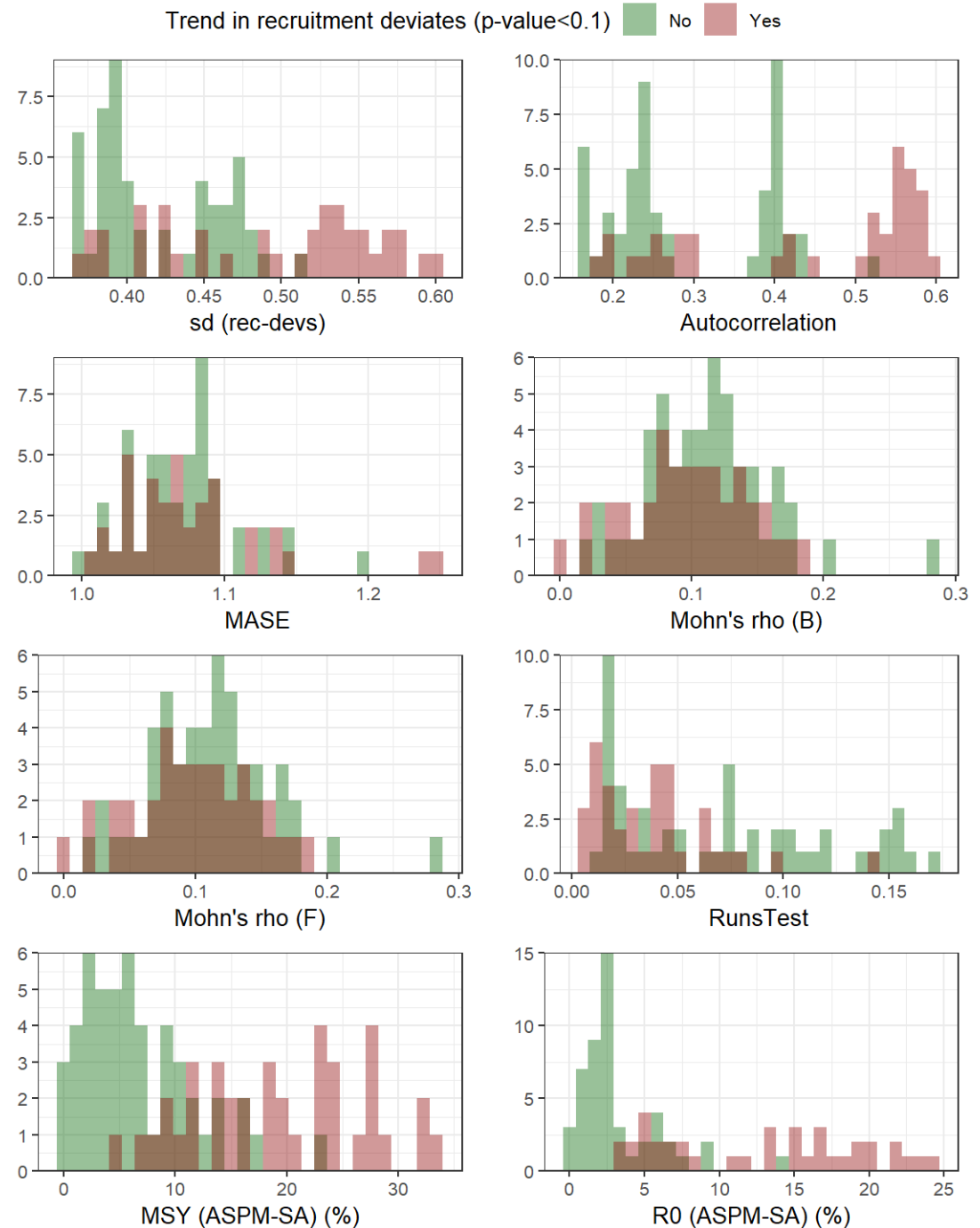
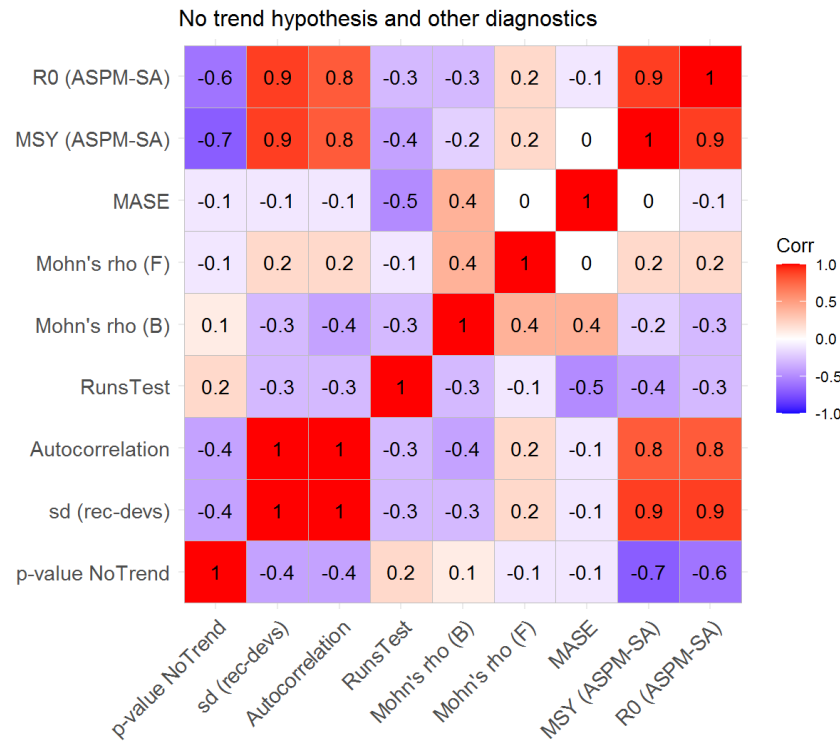


- How to use diagnostics to assign plausibility to models in ensembles (Maunder, 2020).
- Some diagnostics are time consuming, the p-value of the no-trend for rec devs is estimated in seconds.

Results



(6) Consistency with other diagnostics



Management implications

- Plausibility of models when advice developed from ensembles of models (Maunder et al 2020):

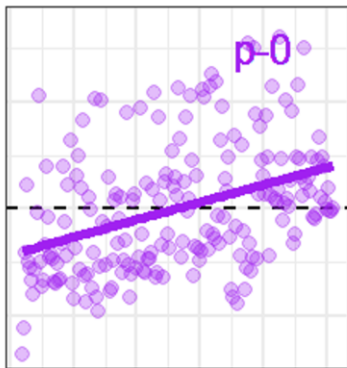
Management implications

- Plausibility of models when advice developed from ensembles of models (Maunder et al 2020):
 - ✓ Statistical support to assumptions (combinations of hypotheses and not individual factors)
 - ✓ Compatibility of assumptions and data.

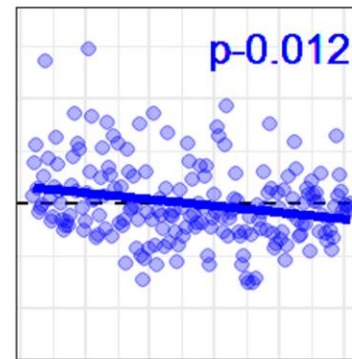
Management implications

- Plausibility of models when advice developed from ensembles of models (Maunder et al 2020):
 - ✓ Statistical support to assumptions (combinations of hypotheses and not individual factors)
 - ✓ Compatibility of assumptions and data.
- Catch advice -> Projections with rec deviates to reduce uncertainty.

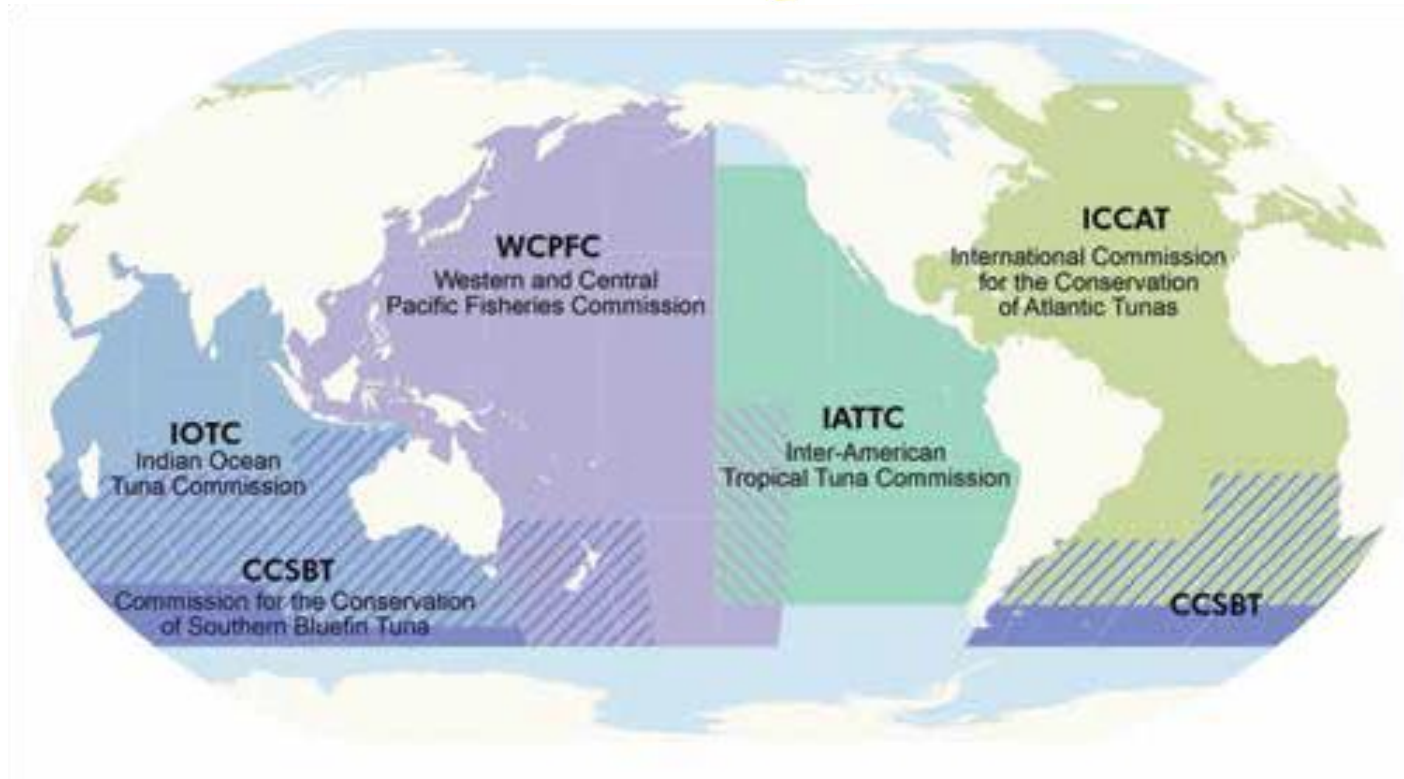
Increasing, $p < 0.1 \rightarrow$ Collapse



Decreasing, $p < 0.1 \rightarrow$ Boom



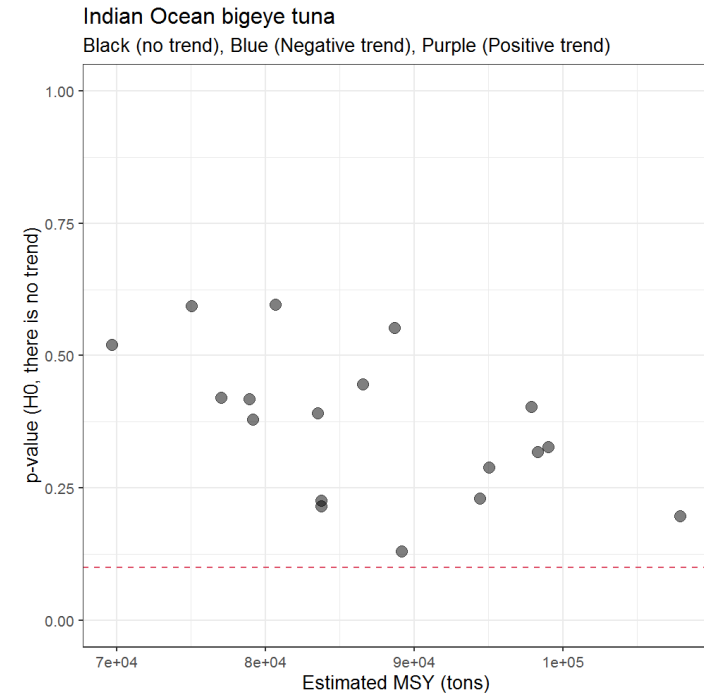
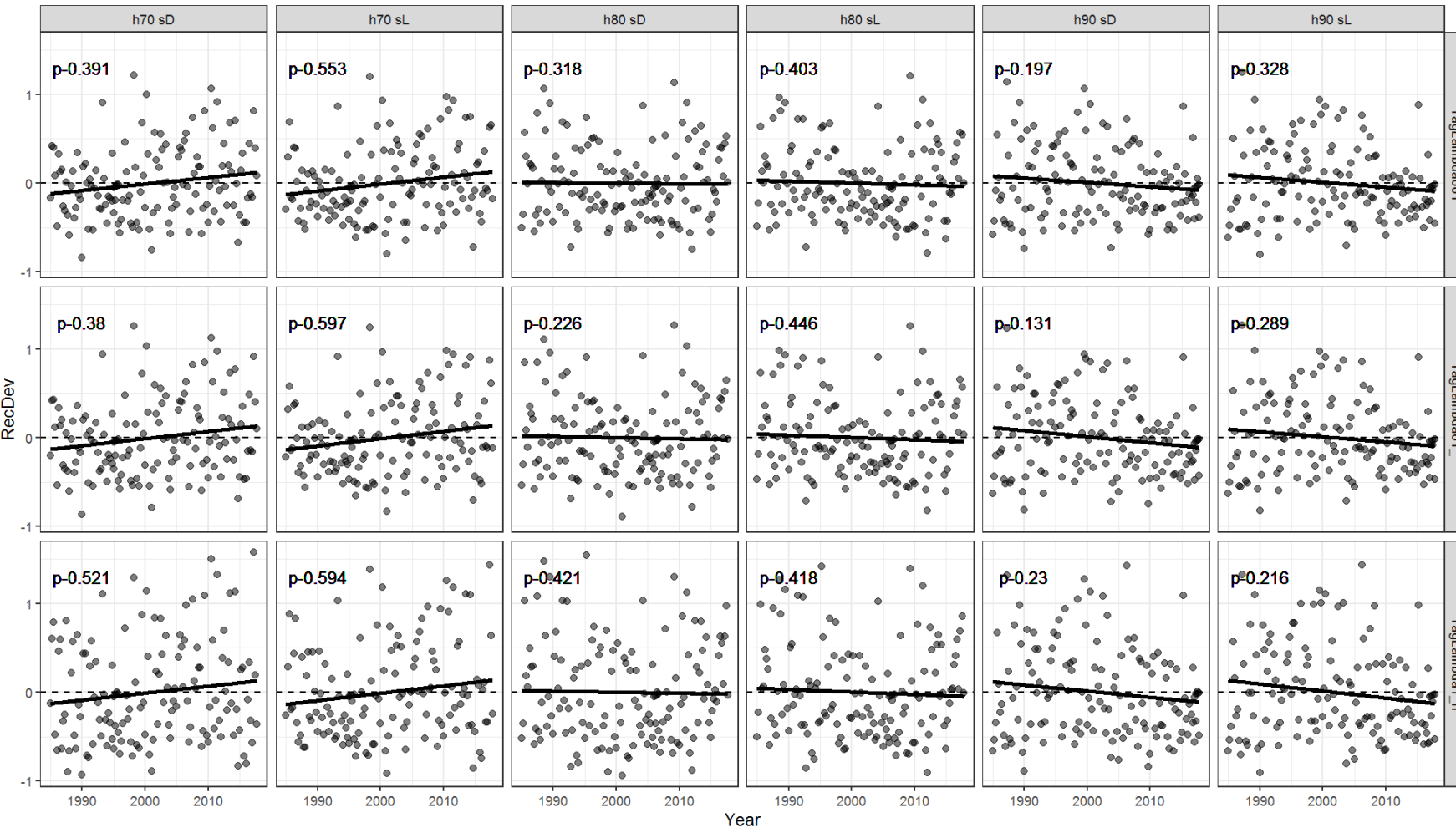
Results (Other tropical tunas' SA)



IO Bigeye

Indian Ocean bigeye tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)

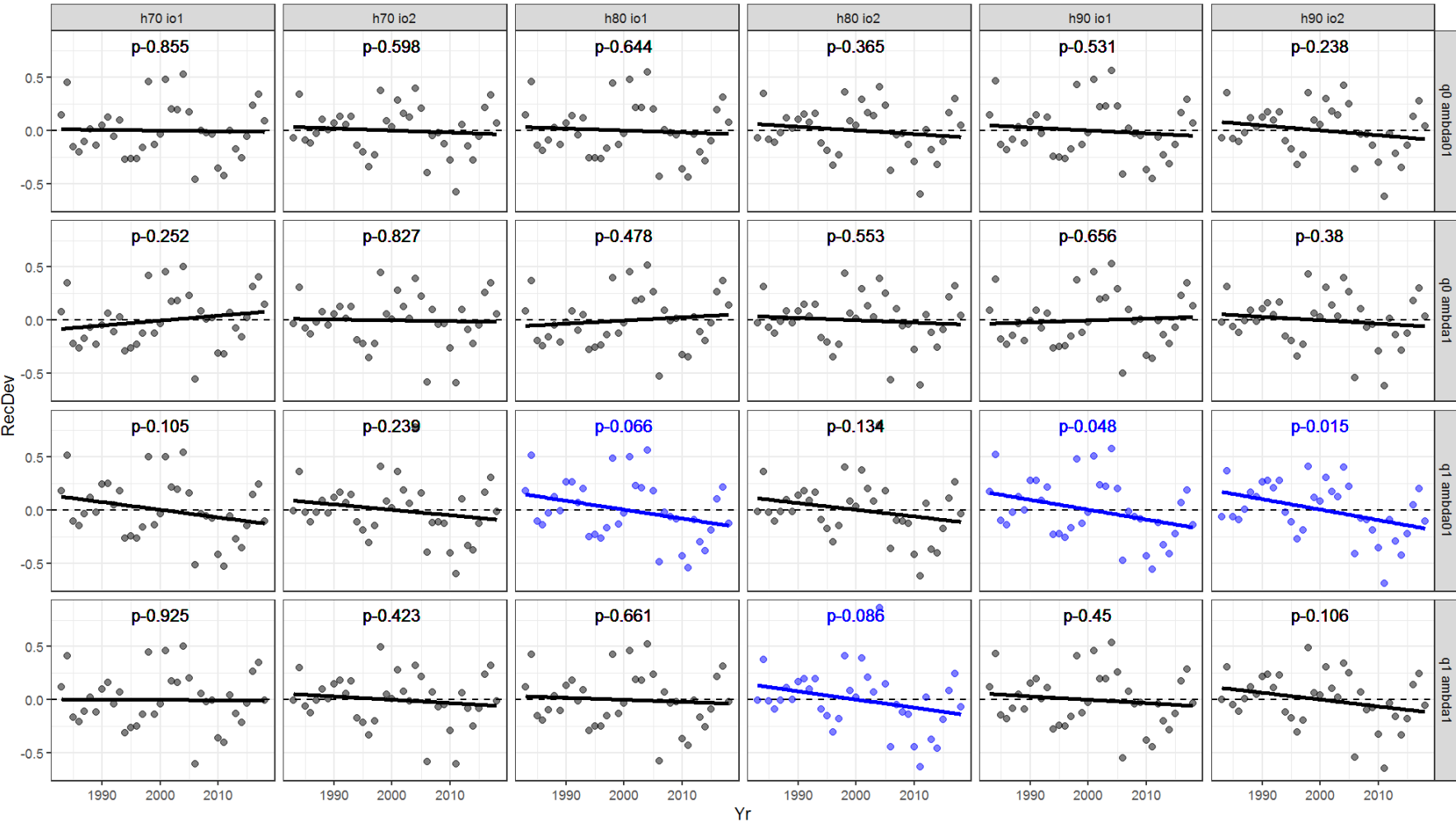


Results (Other tropical tunas' SA)

IO Skipjack

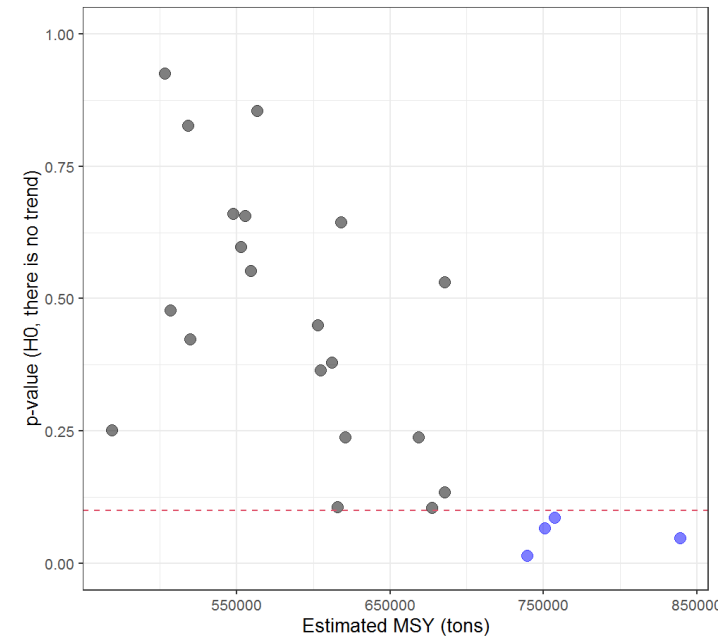
Indian Ocean skipjack tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Indian Ocean skipjack tuna

Black (no trend), Blue (Negative trend), Purple (Positive trend)



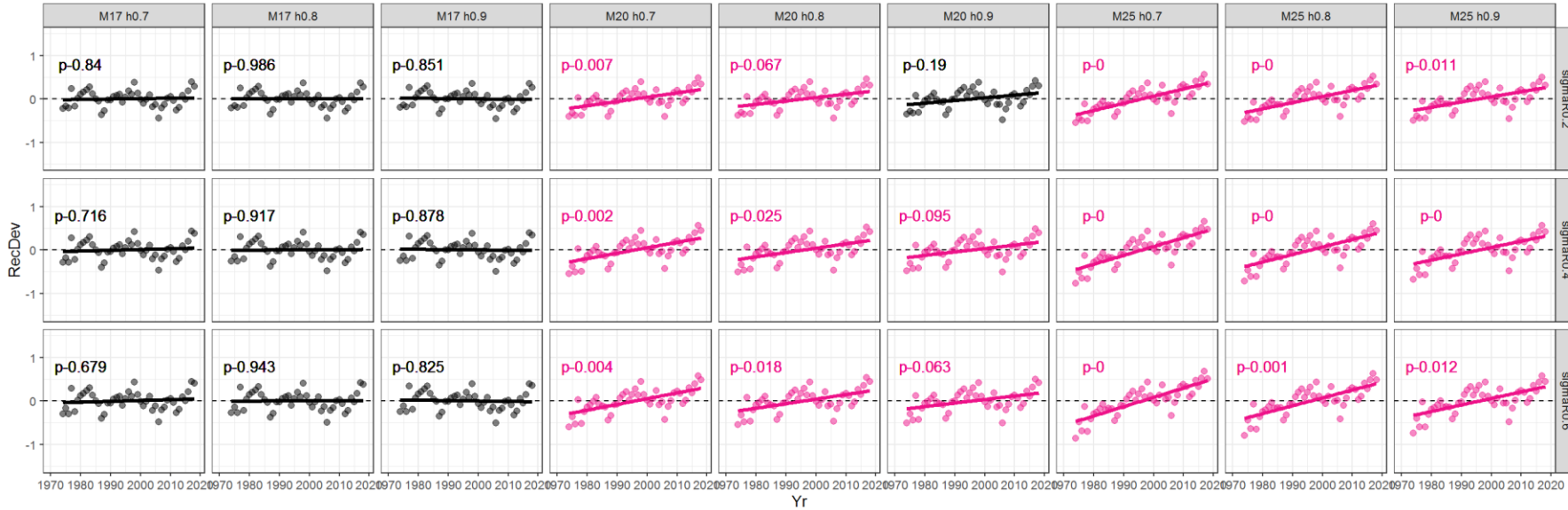
Results (Other tropical tunas' SA)



AO Bigeye

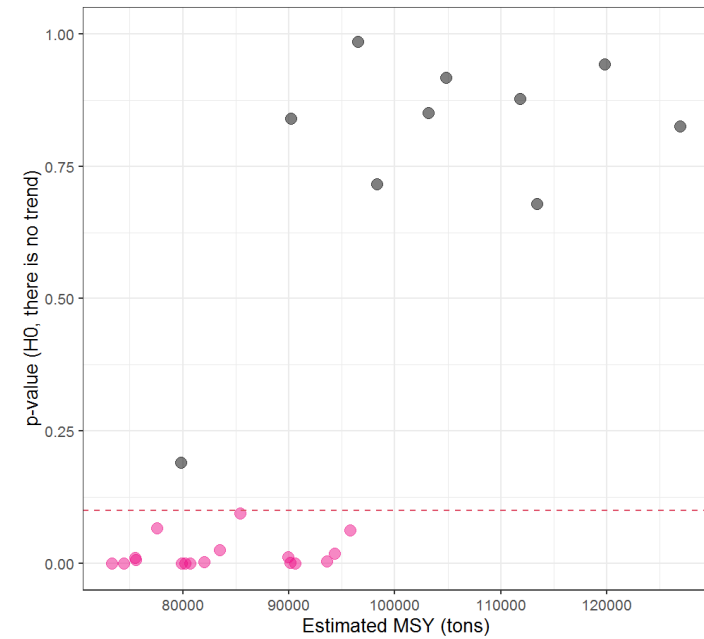
Atlantic Ocean bigeye tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Atlantic Ocean bigeye tuna

Black (no trend), Blue (Negative trend), Purple (Positive trend)



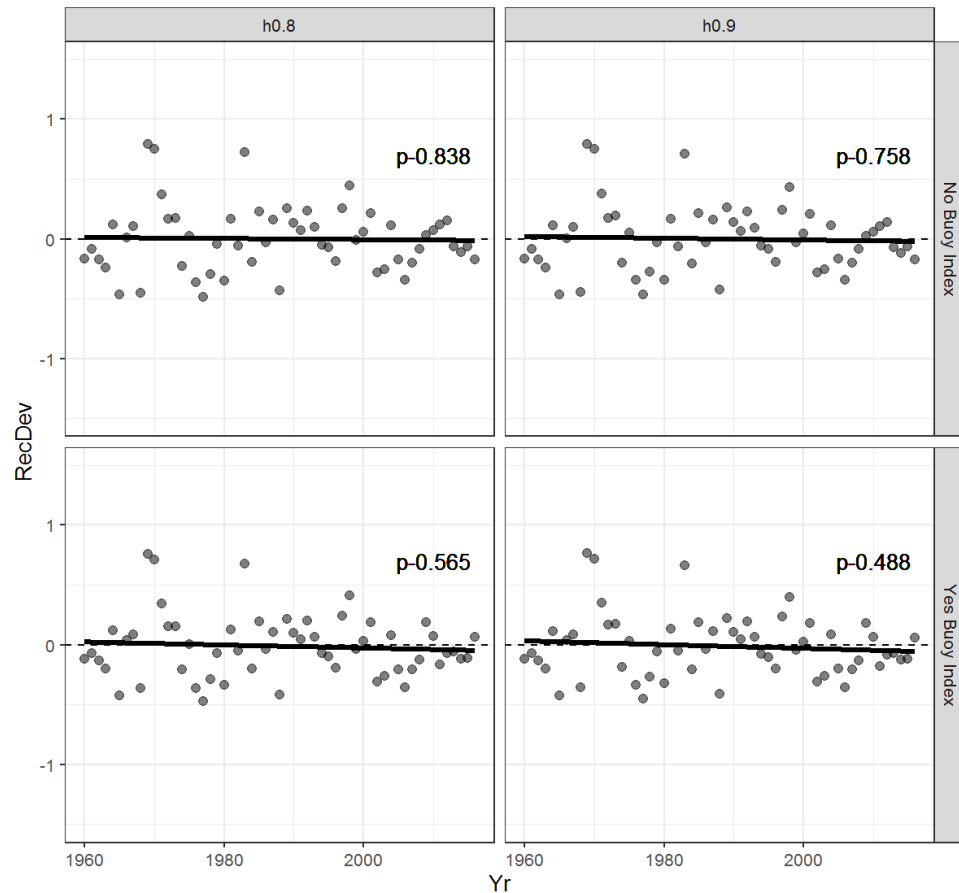
Results (Other tropical tunas' SA)



AO Yellowfin

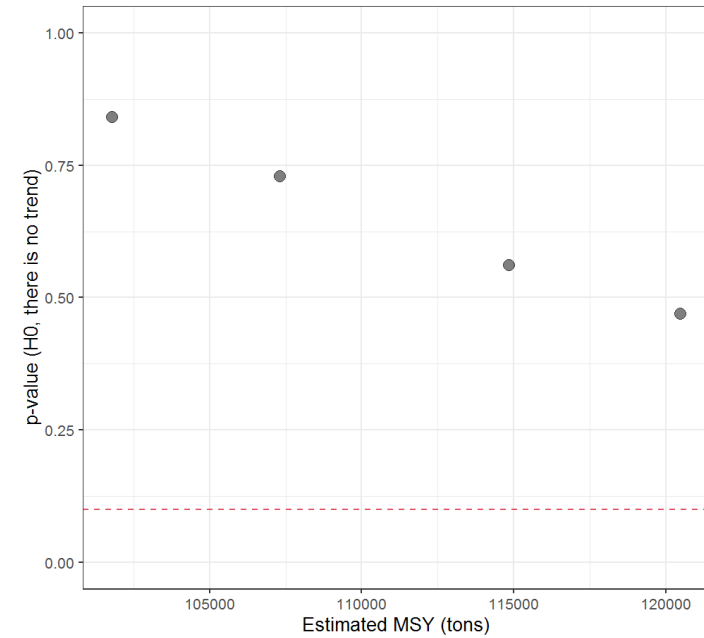
Atlantic Ocean yellowfin tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Atlantic Ocean yellowfin tuna

Black (no trend), Blue (Negative trend), Purple (Positive trend)



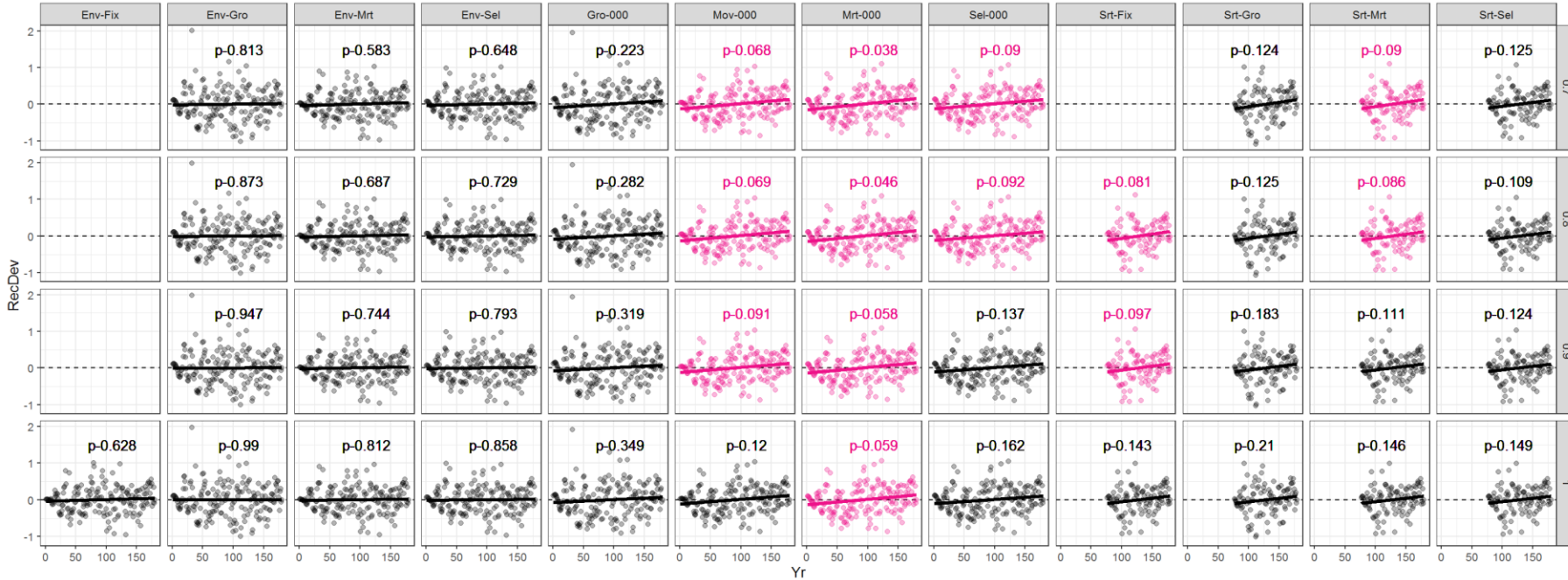
Results (Other tropical tunas' SA)



EPO Bigeye

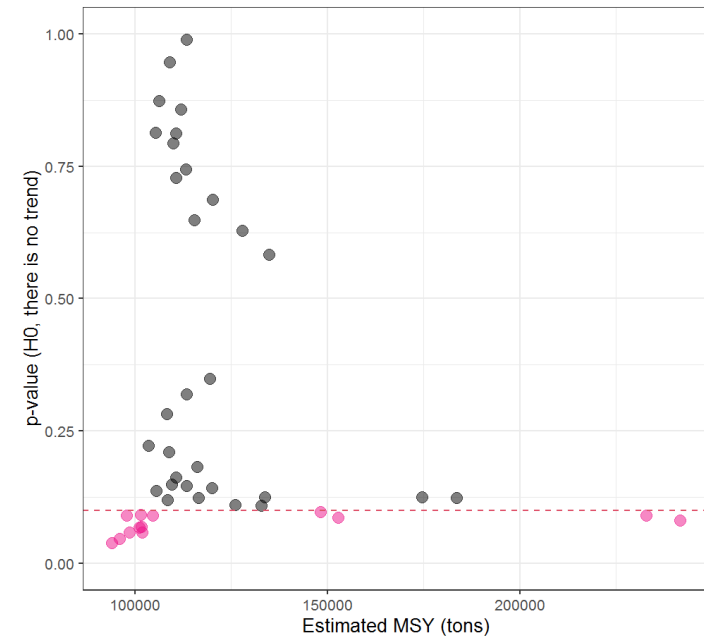
Eastern Pacific bigeye tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Eastern Pacific bigeye tuna

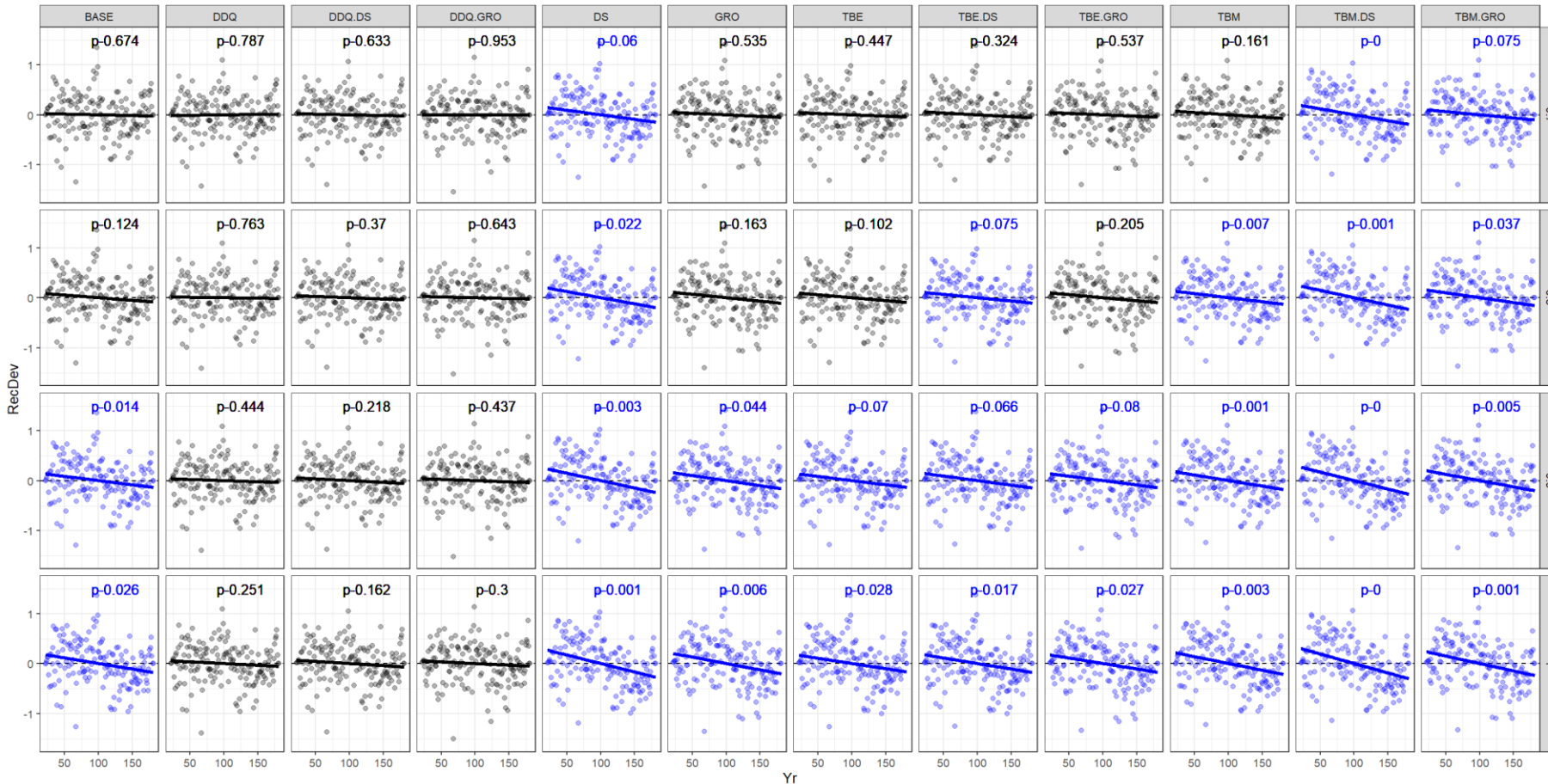
Black (no trend), Blue (Negative trend), Purple (Positive trend)



EPO Yellowfin

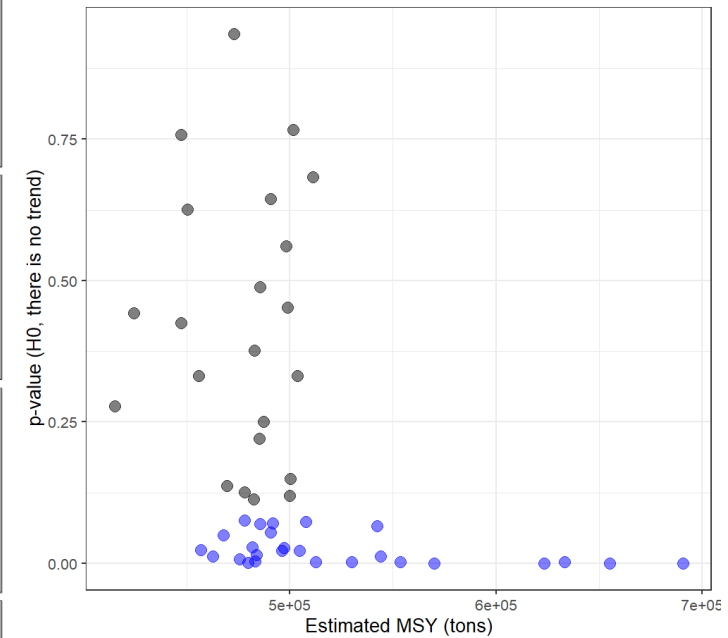
East Pacific Ocean yellowfin tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



East Pacific Ocean yellowfin tuna

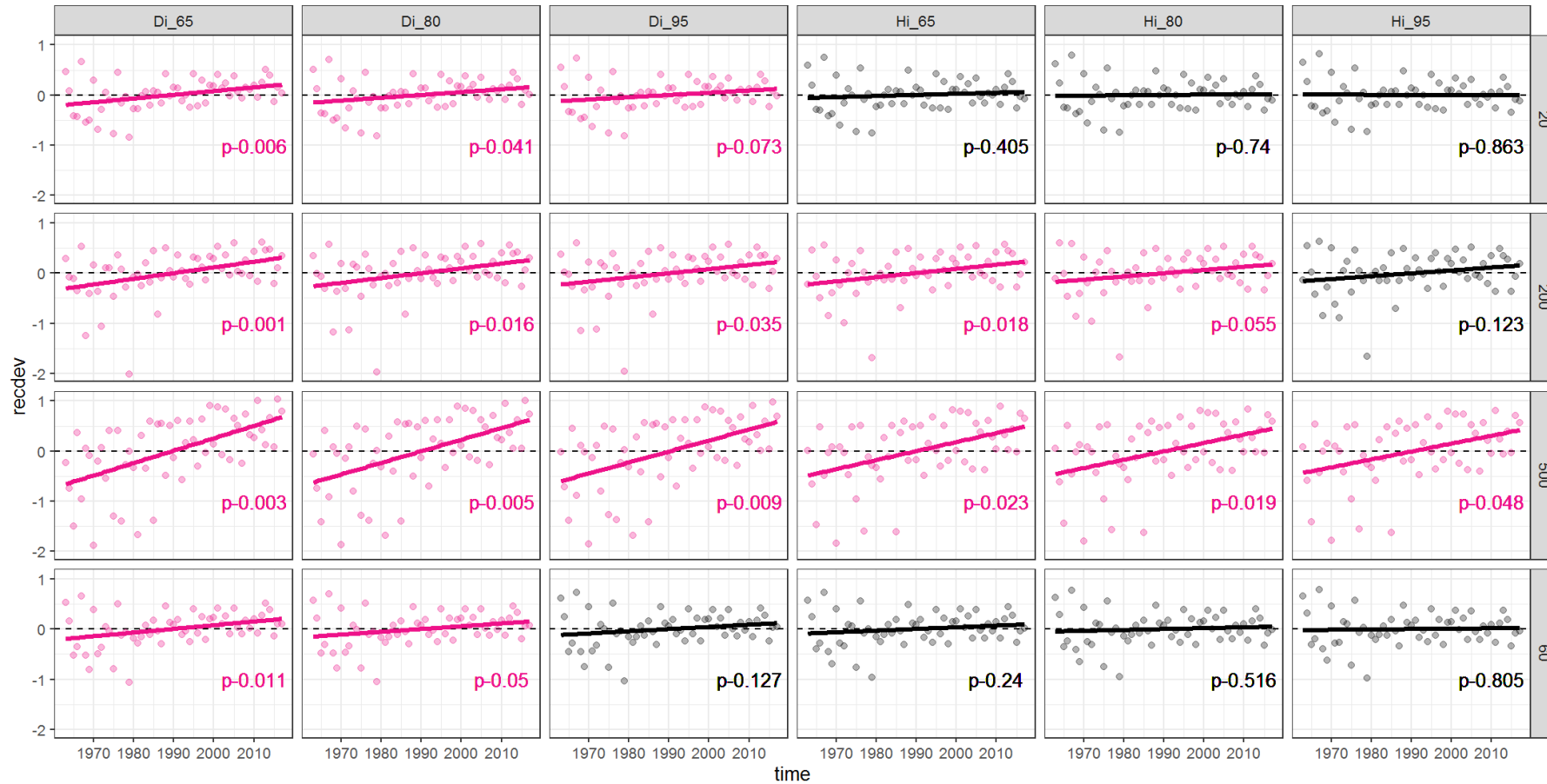
Black (no trend), Blue (Negative trend), Purple (Positive trend)



WCPO Bigeye

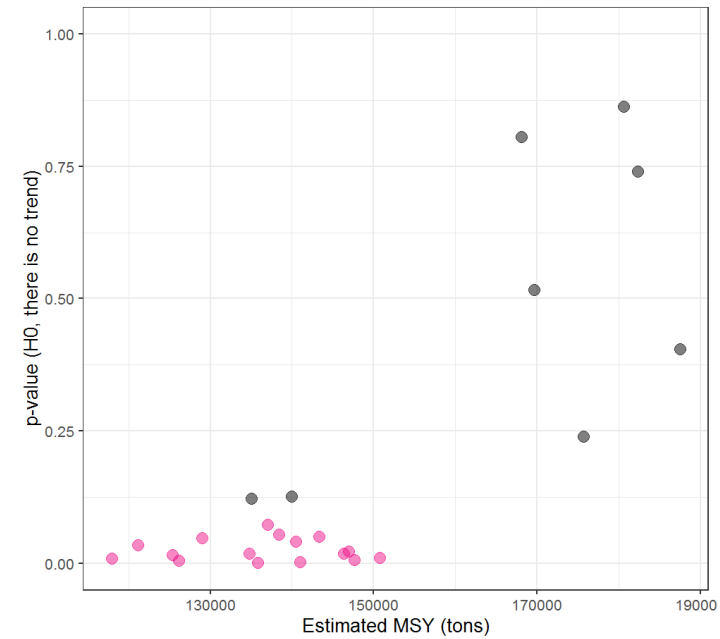
Western Central Pacific Ocean bigeye tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Western Central Pacific Ocean bigeye tuna

Black (no trend), Blue (Negative trend), Purple (Positive trend)

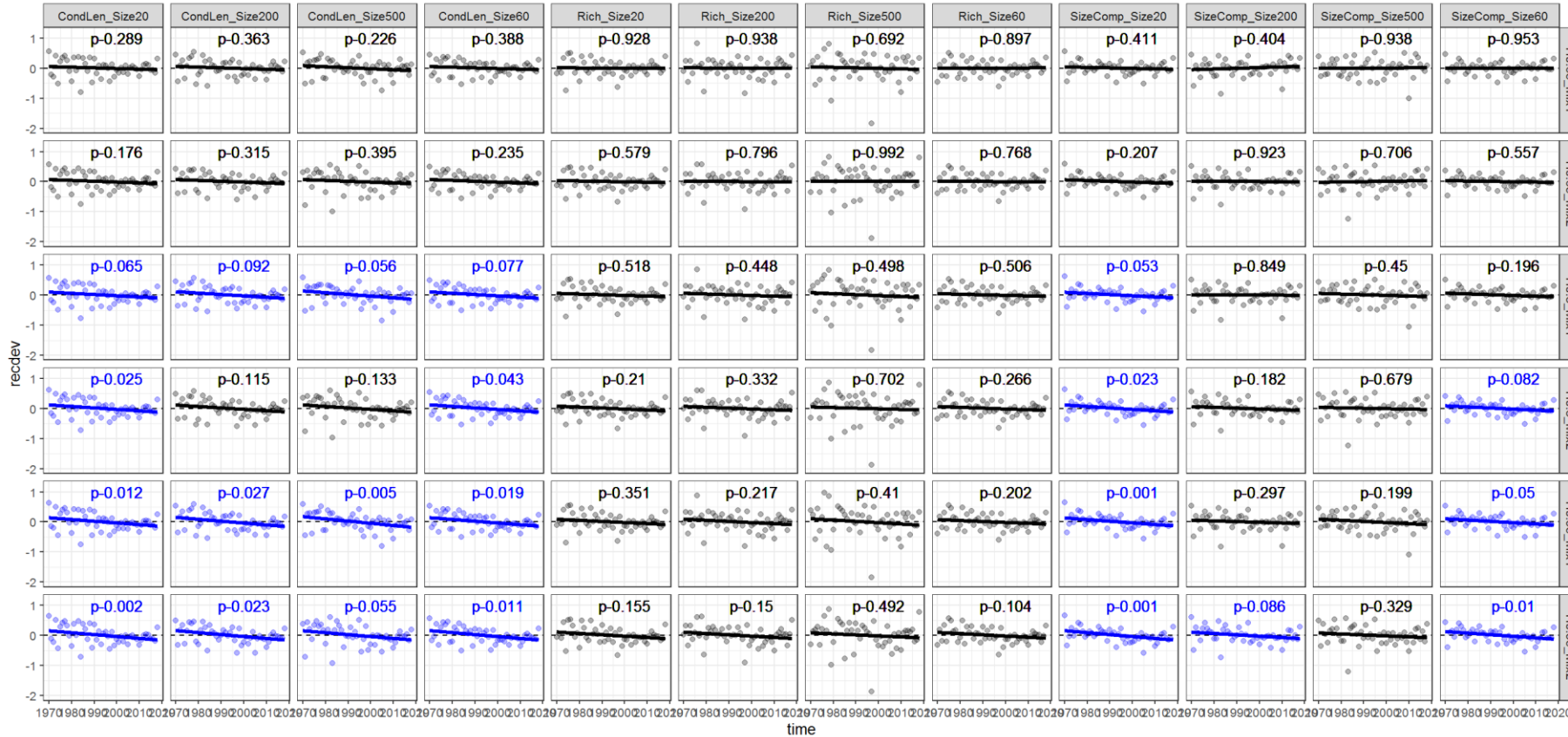


Results (Other tropical tunas' SA)

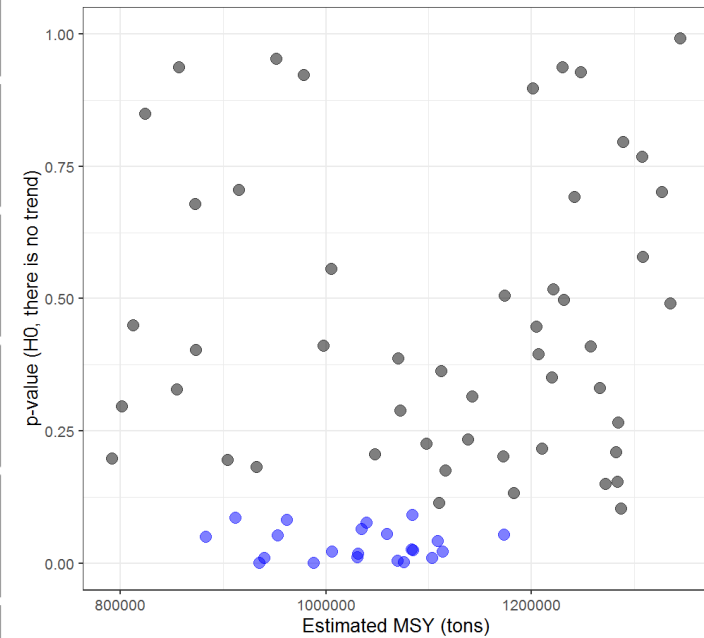
WCPO Yellowfin

Western Central Pacific Ocean yellowfin tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



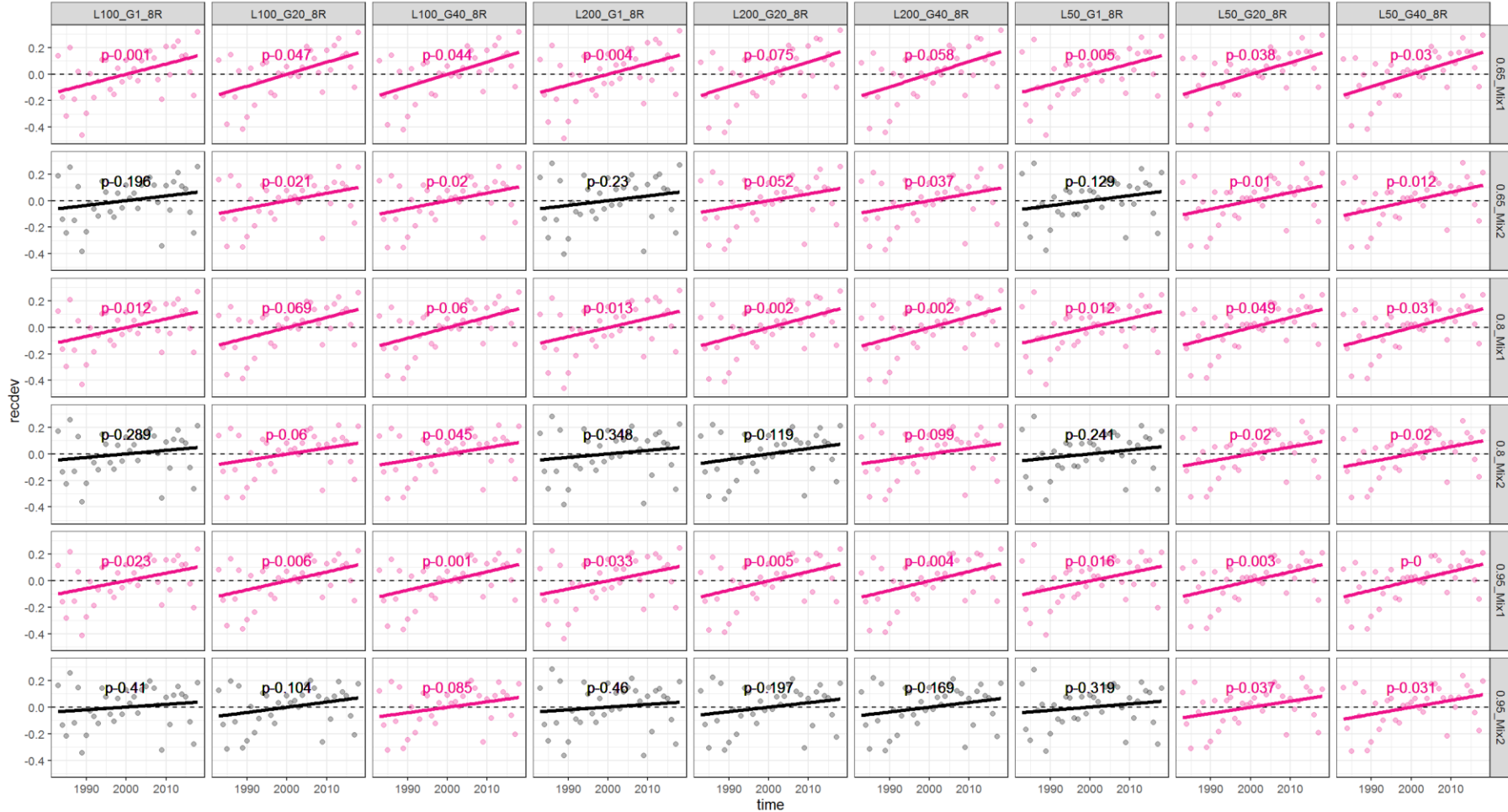
Western Central Pacific Ocean yellowfin tuna
Black (no trend), Blue (Negative trend), Purple (Positive trend)



WCPO Skipjack

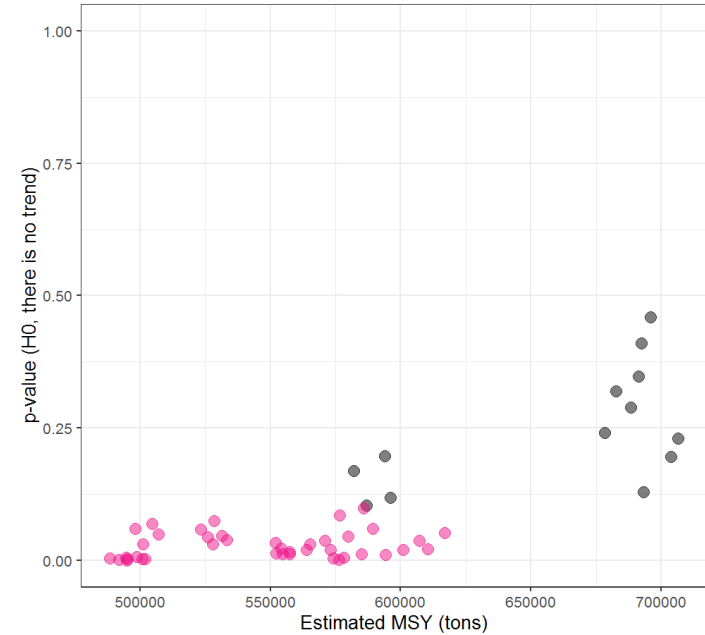
Western Central Pacific Ocean skipjack tuna

Recruitment deviates in time, Black (no trend), Blue (Negative trend), Purple (Positive trend)



Western Central Pacific Ocean skipjack tuna

Black (no trend), Blue (Negative trend), Purple (Positive trend)



Discussion

- Assessments of tropical tunas contain trends in recruitment deviates.
- Trends associated with large/low values of estimated productivity and differences with assumptions run without rec devs.
- When recruitment deviates increase, these can compensate biomass in periods of large catch. When this happens, process error is not random (\sim variability) but part of response to fishing.
- Trends in process error can also be due to misspecification of parameters and data conflict.
- Projections for K2SM should include recent recruitment deviates (reduce uncertainty).
- If evidence of changes on underlying productivity (e.g. climate change), reference points updated in all models (or as factors) but in a large ensemble context...
- p-value of no-trend useful when using large ensembles of models (ICCAT/IOTC) together with other diags.
- Models with a low p-value for no-trend (threshold 0.1 arbitrary) should be analysed (re-configured) before selection for ensemble to develop management advice.
- For Joint Tuna RFMO, harmonize specifications of rec devs (phases, role, constrains...).

Thanks!

Discussion

- Assessments of tropical tunas contain trends in recruitment deviates.
- Trends associated with large/low values of estimated productivity and differences with assumptions run without rec devs.
- When recruitment deviates increase, these can compensate biomass in periods of large catch. When this happens, process error is not random (\sim variability) but part of response to fishing.
- Trends in process error can also be due to misspecification of parameters and data conflict.
- Projections for K2SM should include recent recruitment deviates (reduce uncertainty).
- If evidence of changes on underlying productivity (e.g. climate change), reference points updated in all models (or as factors) but in a large ensemble context...
- p-value of no-trend useful when using large ensembles of models (ICCAT/IOTC) together with other diags.
- Models with a low p-value for no-trend (threshold 0.1 arbitrary) should be analysed (re-configured) before selection for ensemble to develop management advice.
- For Joint Tuna RFMO, harmonize specifications of rec devs (phases, role, constrains...).