

Deep learning and surplus production models for multivariate autoregressive modelling and simulation of the jack mackerel fishery associated with environmental conditions

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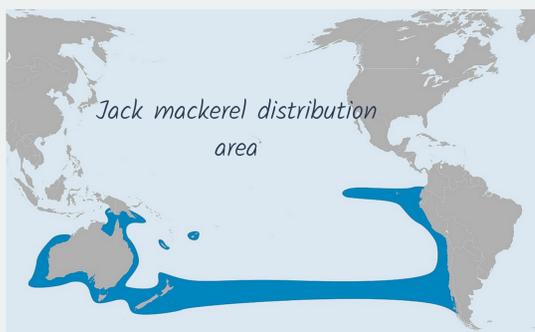
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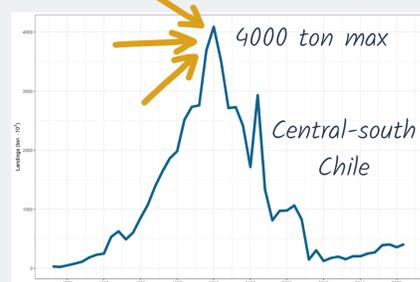
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Background



- Maximum of 4,955,186 t in 1995
- Drastical decrease to 353,120 t by 2013
- Increase to 814,512 by 2021



- SPRFMO records catches from 16 countries since 1970

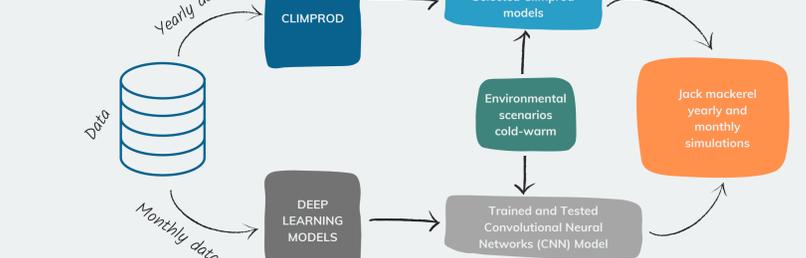
Our approach

Data:

Variables from 1973-2021

- Chilean central-south catches (C);
- Catch per standard unit of effort (CPUE) as abundance index of industrial purse-seine fleet off central-southern Chile;
- Standard fishing effort (E=C/CPUE); and
- NOAA satellite SST between 32°-42°S-71°-80°W.

General outline



Results

CLIMPROD yearly predictions

Model considerations

- 5 significant age classes
- recruitment at 2 years
- environment affecting abundance between 0-2 years

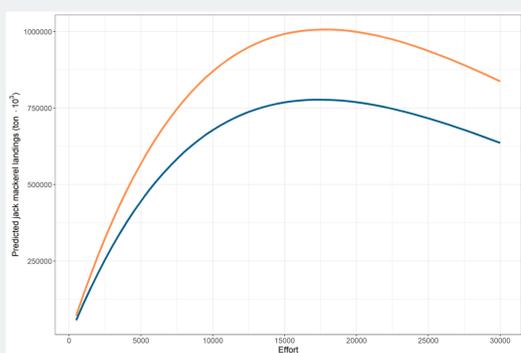
$$CPUE = (a SST^b + d E)^{\frac{1}{c-1}}$$

Model's Performance

$$R^2 = 0.90 (p < 0.001)$$

$$R^2_{jackknife} = 0.86$$

$$T_{jackknife} = 'good'$$



Warmer period
(SST 2018-2021)
1007036 t

Colder Period
(SST 1999-2014)
777500 t

Estimated MSY Projections

Results

Monthly CNN predictions

Model's Performance

$$\text{Mean } R^2 = 0.842$$

$$\text{Sd } R^2 = 0.073$$

Monthly projections



Yearly sum of monthly projections

Warmer period
(SST 2018-2021)
Mean: 1165582 t
Sd: 147741 t



Colder Period
(SST 1999-2014)
Mean: 504848 t
Sd: 179556 t

Conclusions

Lessons learned

- Both models consider the environment .
- Conventional models consider Yearly MSY projections
- Deep learning approach models monthly fishery time-series dynamic extending to monthly MSY projections.
- Helpful to managers and gives insight on the possible effects of the environment on the fishery.

Future work

- Complex models can be integrated: age-structured, growth models, fishing effort scenarios, new DL structures.
- More fisheries and fisheries data, with spatial component.
- Forecast models for ecosystemic changes, to quantify abundance-fishery dynamic, such as climate change and long-term environmental changes.



Acknowledgements

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