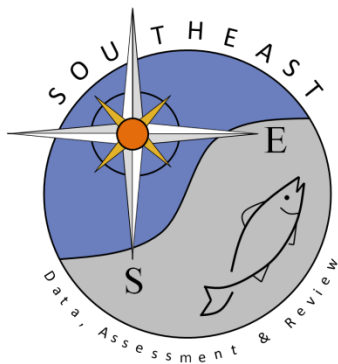


Exploratory data analysis and qualitative evaluation of the Stephens and MacCall  
subsetting method following increased management regulations in the South Atlantic  
headboat fishery

Eric Fitzpatrick

SEDAR82-DW07

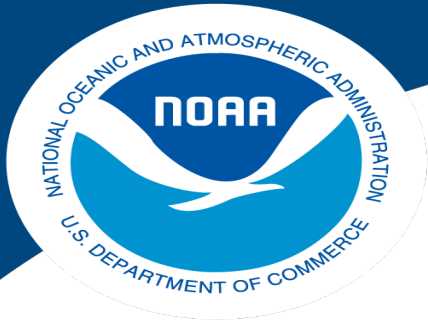
Received: 8/25/22



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**FISHERIES**

## Project summary:

Exploratory data analysis and qualitative evaluation of the Stephens and MacCall subsetting method following increased management regulations in the South Atlantic headboat fishery

February 2022

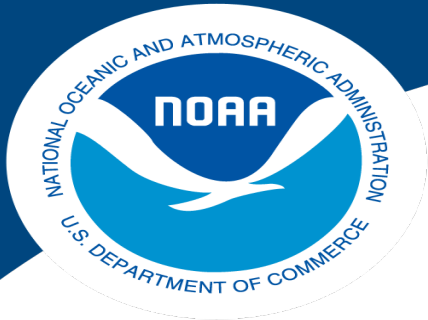


## OBJECTIVE:

Develop additional exploratory data analysis to examine potential shifts in fishing behavior by investigating how/if Stephens and MacCall subsetting results is changing over time

## EXPECTATIONS:

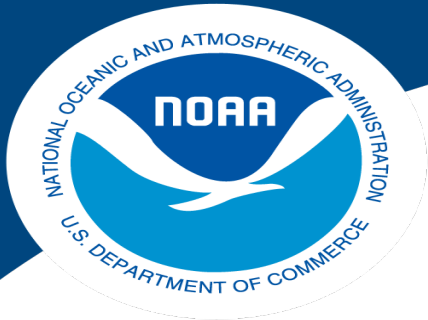
- Identifying a 'smoking gun' is unlikely.
- Determining utility and use of an index or truncating an index requires building a body of evidence.
- This analysis attempts to add to this body of evidence to facilitate future discussions in the SEDAR process



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## STATUS QUO

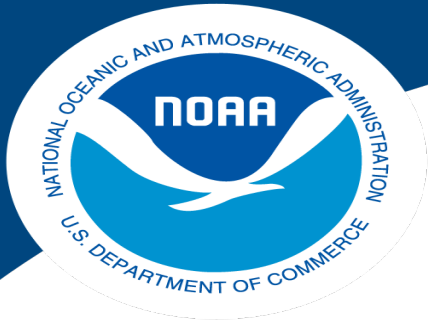
- In recent years there has been increased scrutiny in the SEDAR review process and the SSC regarding fishery dependent indices and additional exploration and investigations has become the rule and not the exception.
- A fishery dependent index from Southeast Regional Headboat survey is frequently developed in the SEDAR process for most assessed stocks.
- The current practice is to assume that the methods used (Stephens and MacCall along with dGLM) are producing an index that represents trends in abundance and that if this assumption is thought to be violated then evidence should be provided to refute this assumption.
- Current practice in the South Atlantic is to remove species from the Stephens and MacCall subsetting procedure that have become restricted due to management regulations (red porgy, red snapper, etc.).
  - Is this method enough now that a majority of the snapper-grouper species are under restrictive management or should the index be truncated?



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## Management Regulations

- 2009
  - 1 gag/trip
  - 3 fish aggregate bag limit
  - ACLs
  - vermilion snapper 5 fish/person)
- 2010
  - Spawning season closure (Jan 1- Apr 30)
  - Red snapper closure
  - BSB ACLs
- 2011
  - Red Grouper ACLs
- 2012
  - BSB 5 fish/person/day



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## Detloff 2021

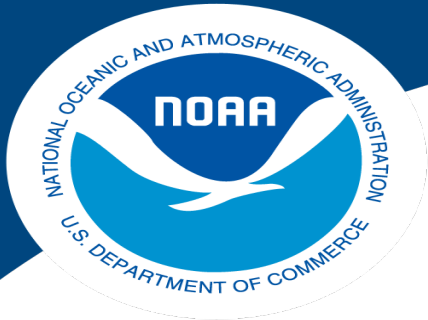
- Improvement- Weighting alternative opposed to subjective classification cutoff
- Have management regulations fundamentally changed the fishing behavior and the species reported enough to make Stephens and MacCall an undesirable approach during these heavily managed time periods?

## Thorson (2016)

“However, many jurisdictions do not analyze fishery catch rates due to concerns that these data confound changes in fishing behavior (adjustments in fishing location or gear operation) with trends in abundance.”

## Branch (2006)

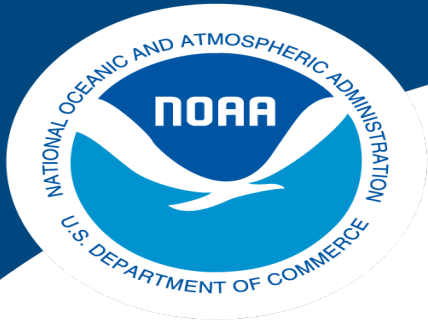
“In conclusion, either hyperstability or hyperdepletion should be suspected in every fishery because of the interaction between fleet dynamics and the spatial distribution of the resource. At a minimum, fisheries managers and scientists need to standardize CPUE data, to split CPUE series when technology or fleet behavior changes, and to treat the resulting series with a healthy dose of skepticism.”



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- METHODS:
  - **Cluster analysis**: Apply methods and lessons learned from the Headboat analysis from SEDAR 41 (**identify spatial and temporal blocks**)
    - isoMDS-Kruskal's Non-metric multidimensional scaling
      - This method avoids making apriori assumptions about time blocks and area specific cutoffs
    - **Identify metrics** (temporal shifts, proportion positive, vessels in fleet, mean catch rates, management regulations) to examine shifts in species composition by time blocks and region identified by the isoMDS methods
  - Once time blocks and regions are identified, **develop indices of abundance** after applying Stephens and MacCall to these time blocks and regions to determine if **Stephens and MacCall has become less effective at identifying effective effort** (either due to management regulations or an overall decrease in presence/absence of the top suite of species in the snapper grouper complex)
  - (Preliminary- Learn and apply machine learning techniques (**RandomForest** in R) as an alternative approach to Stephens and MacCall to examine shifts in important species through time
  - **Is Stephens and MacCall identifying effective effort consistently?**

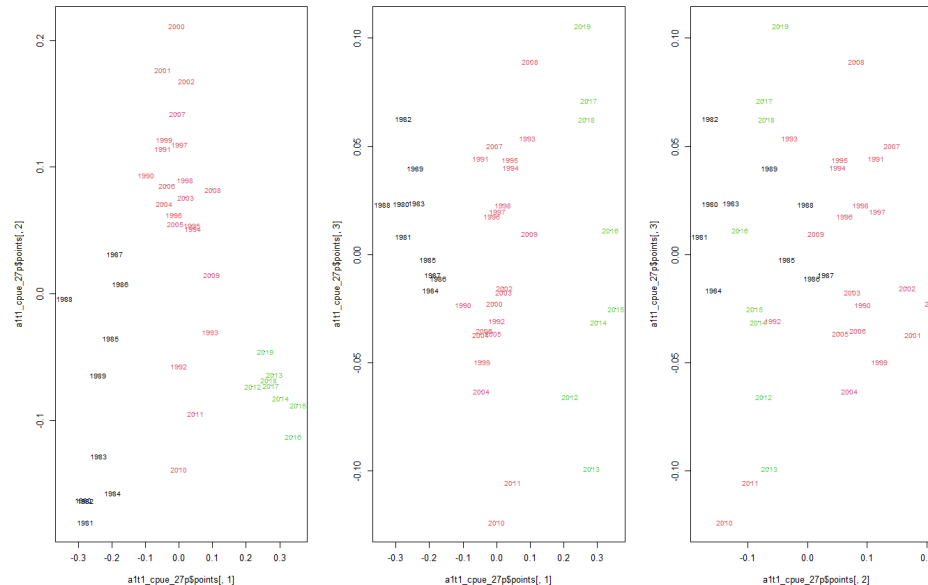




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## Current tasks

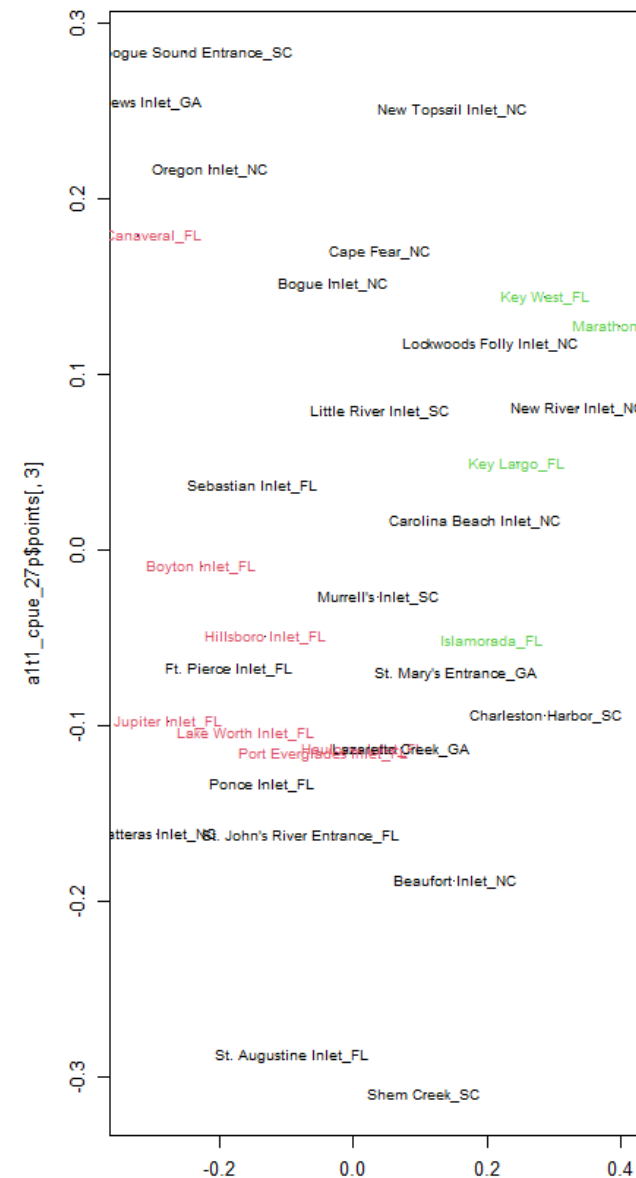
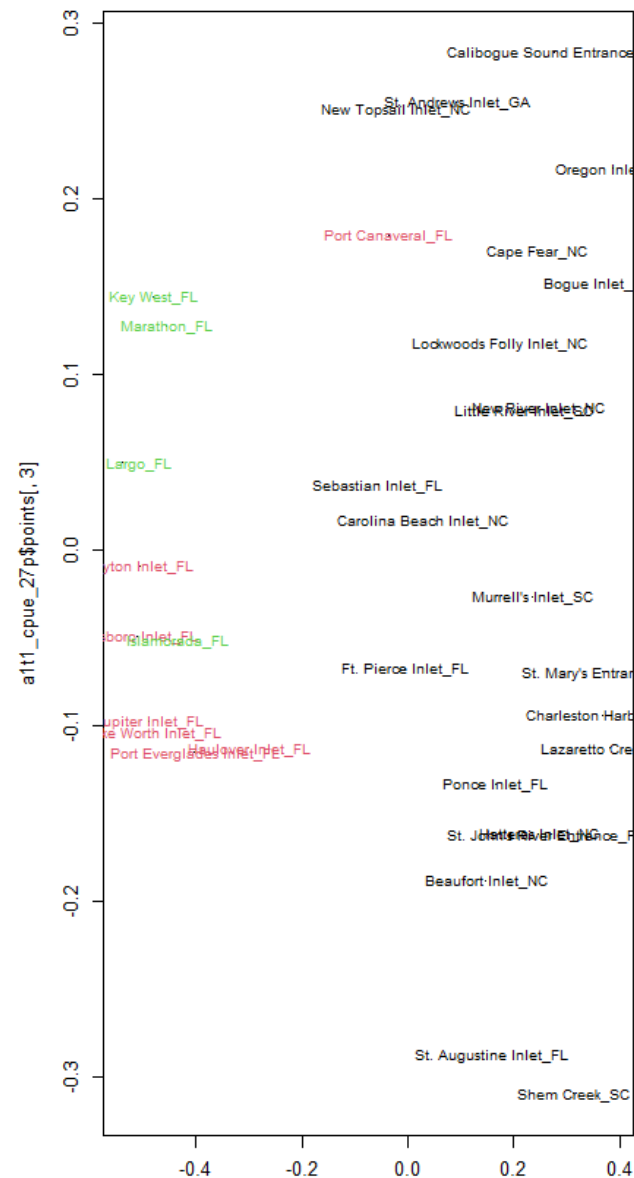
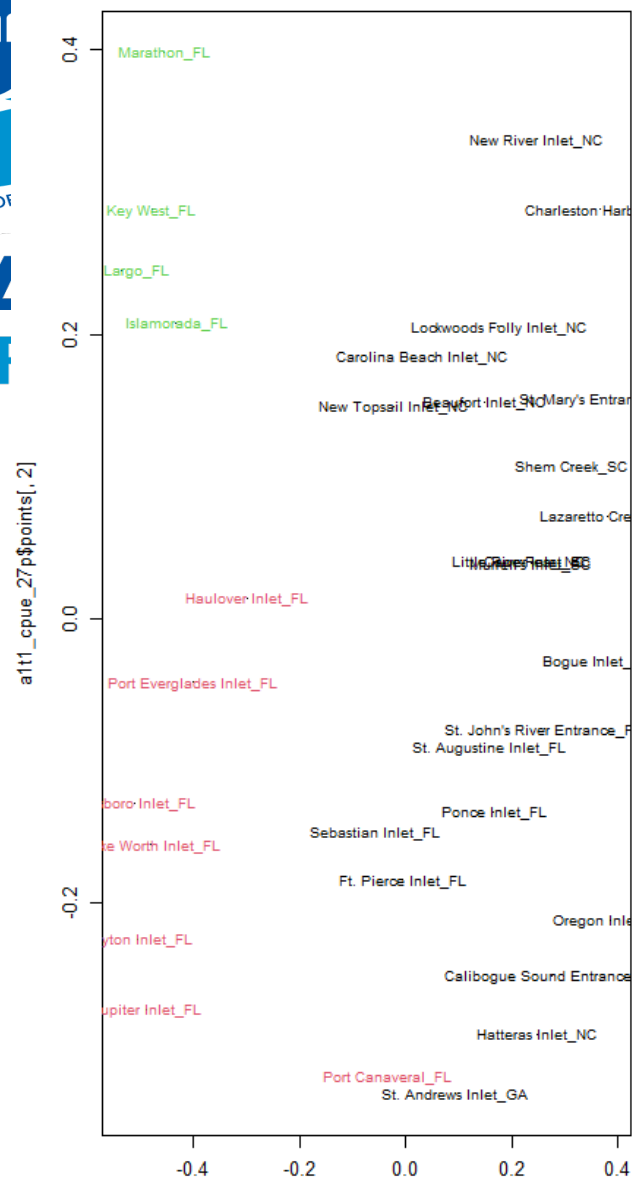
- isoMDS-Kruskal's Non-metric multidimensional scaling
  - **Example: examine annual shifts in CPUE of the top 8 species**
  - Examine annual shifts in CPUE of the top 25 species to test if the added species changes the results of the temporal shift noted above
  - Run isoMDS by port to determine appropriate spatial resolution
  - Run isoMDS by year and port to determine appropriate temporal resolution
- Random Forest
  - Apply a new technique, primarily to learn a new approach, but also to examine an alternative approach to determine variable importance (species)

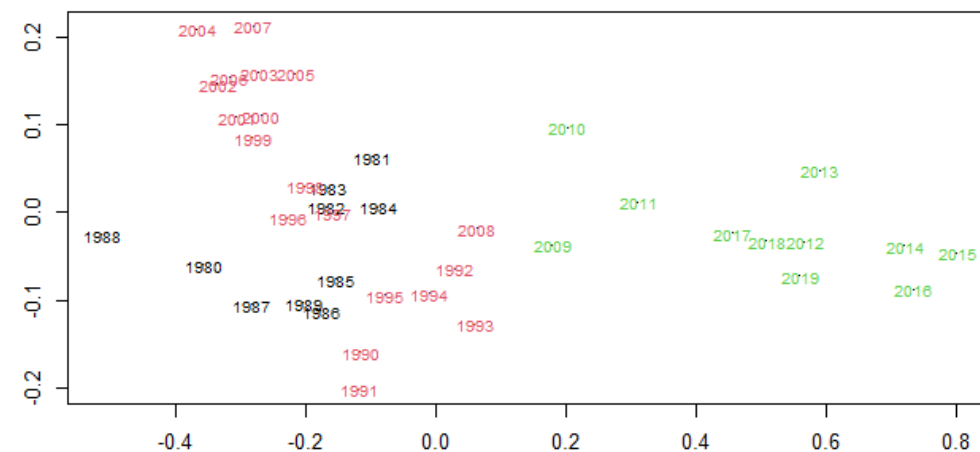
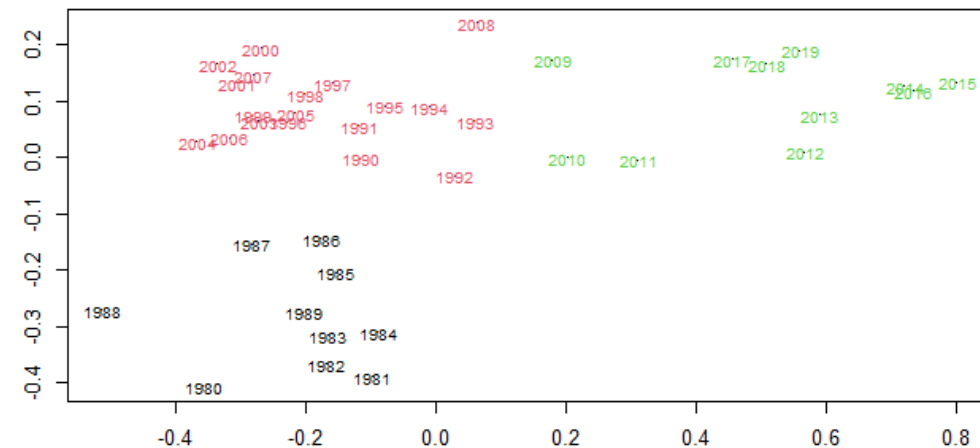
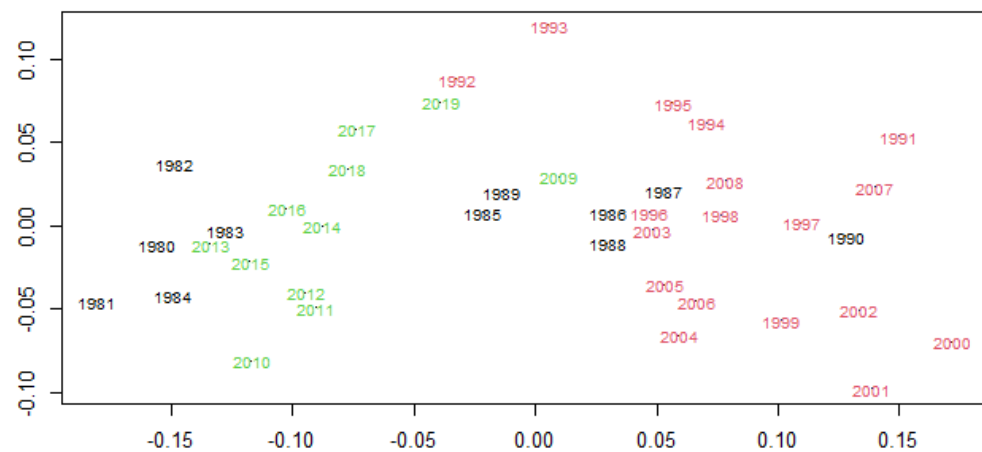
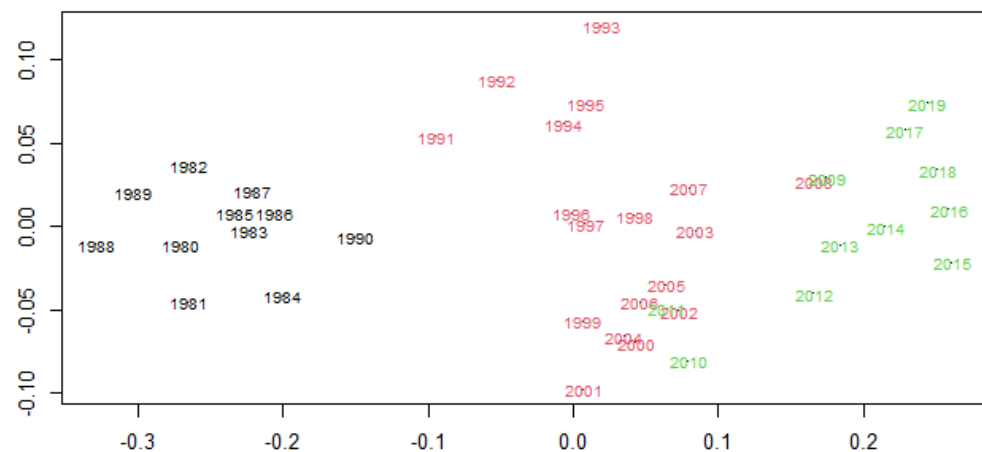
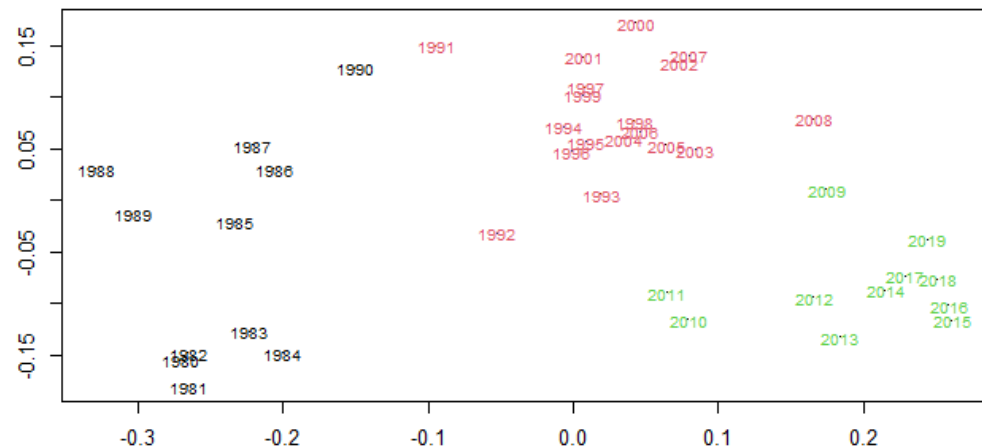


## 3-D plot



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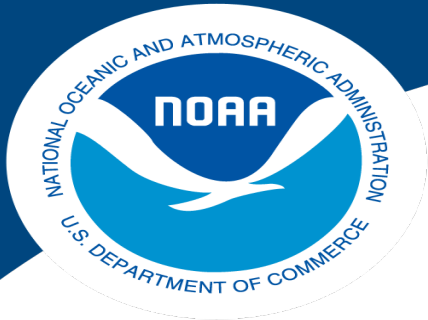






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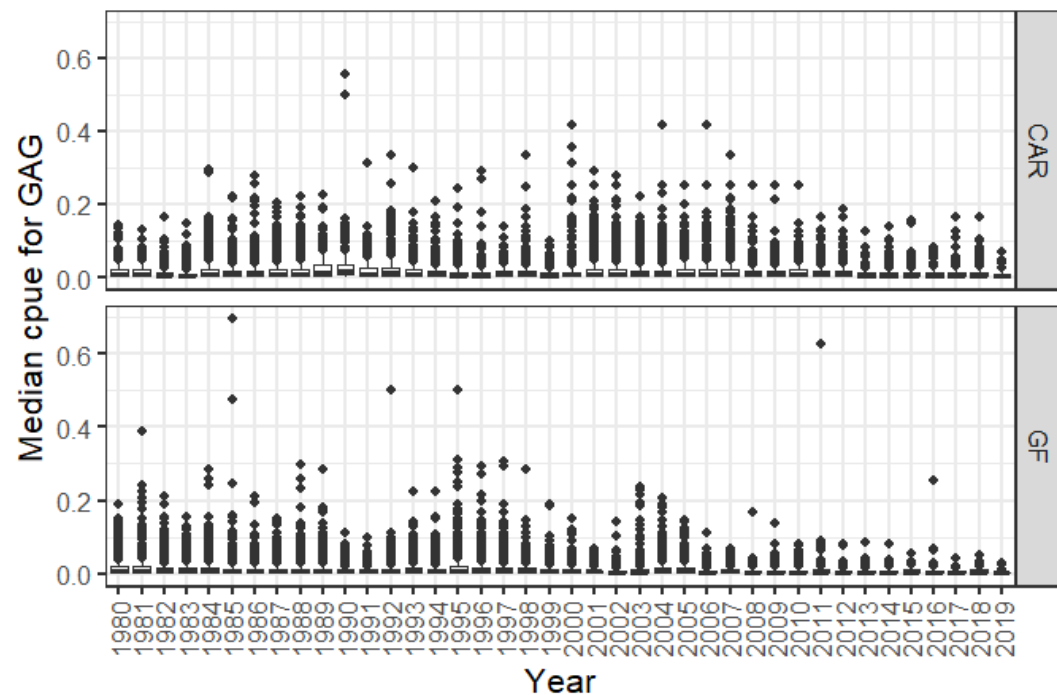
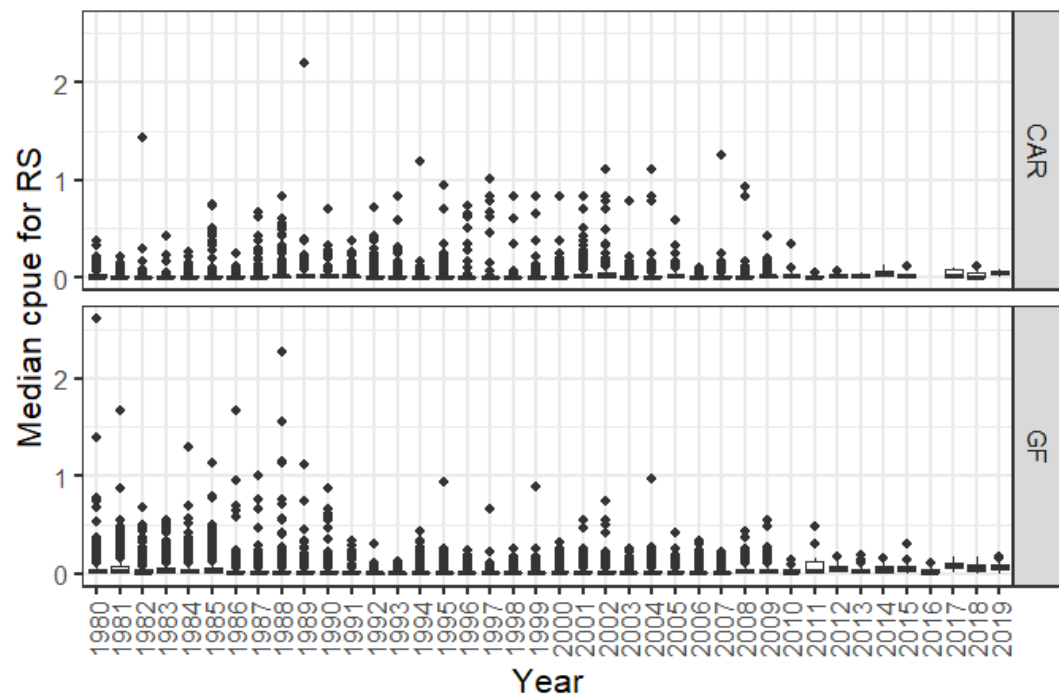
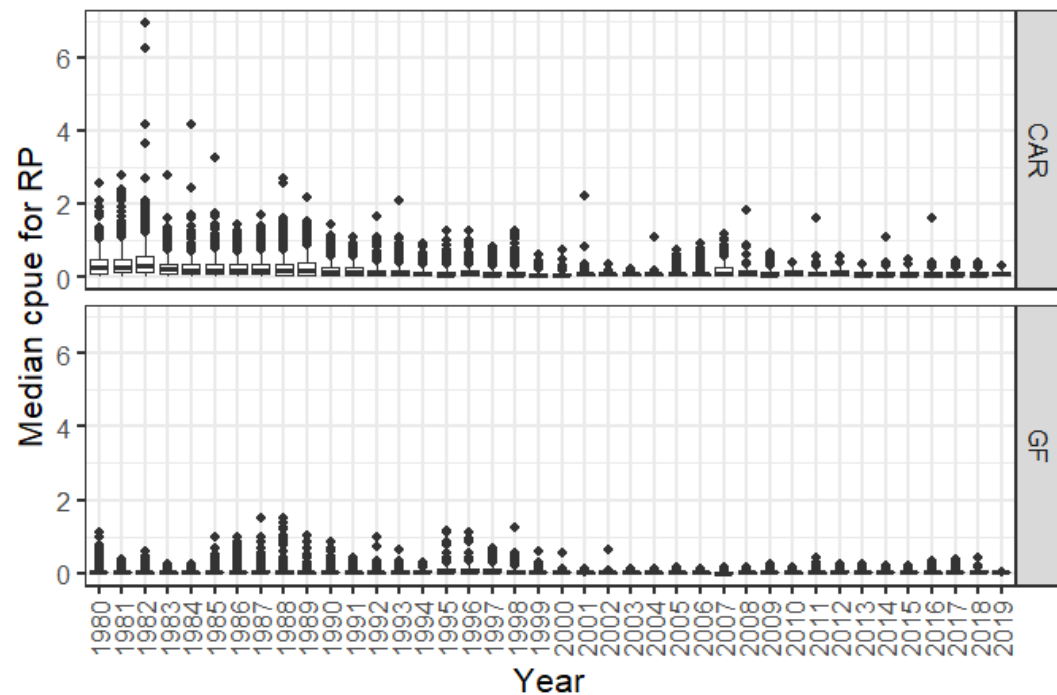
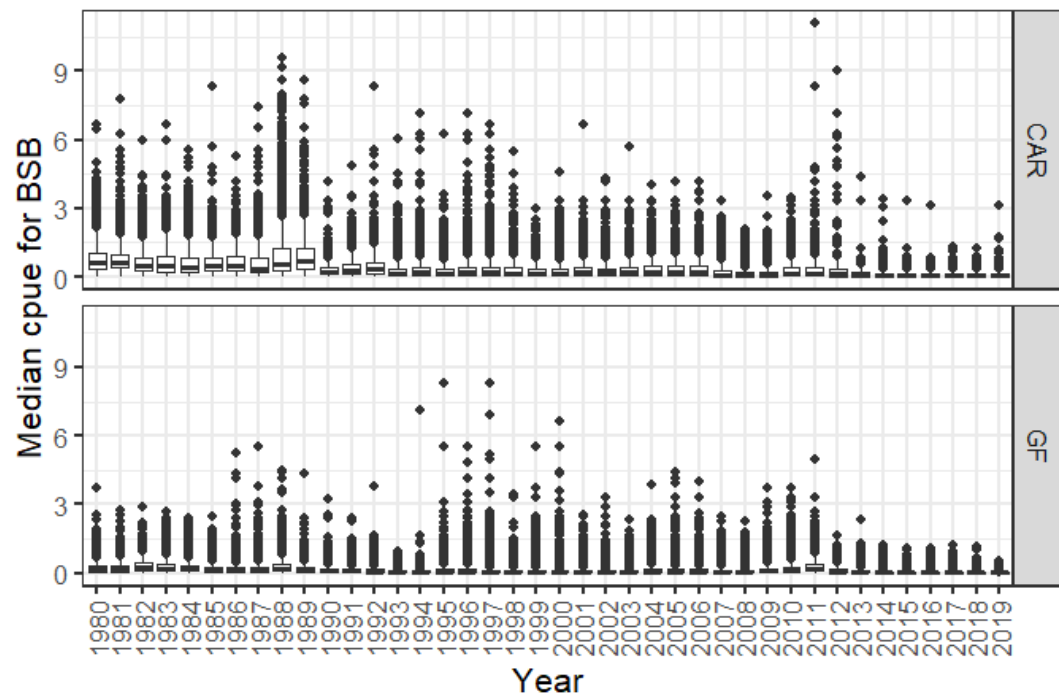
[A graphical summary of your random forest](#)



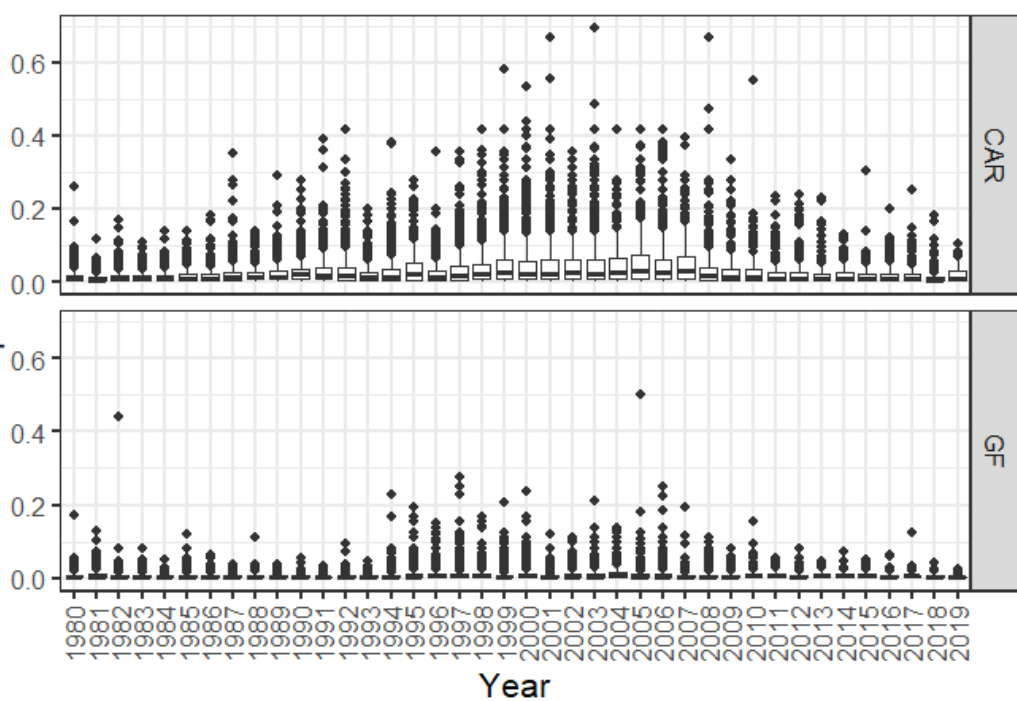
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**FISHERIES**

## Exploratory data analysis

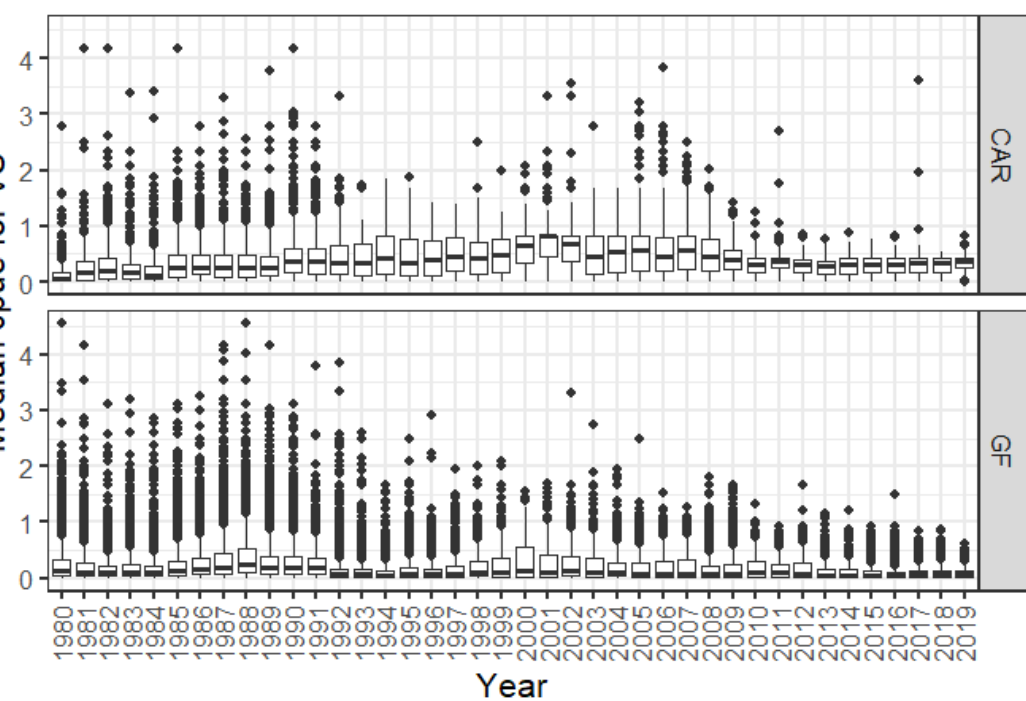
- Catch rates by year, species and region
- Proportion positive by year, species and region
- Number of vessels with positive trips by year, species and region



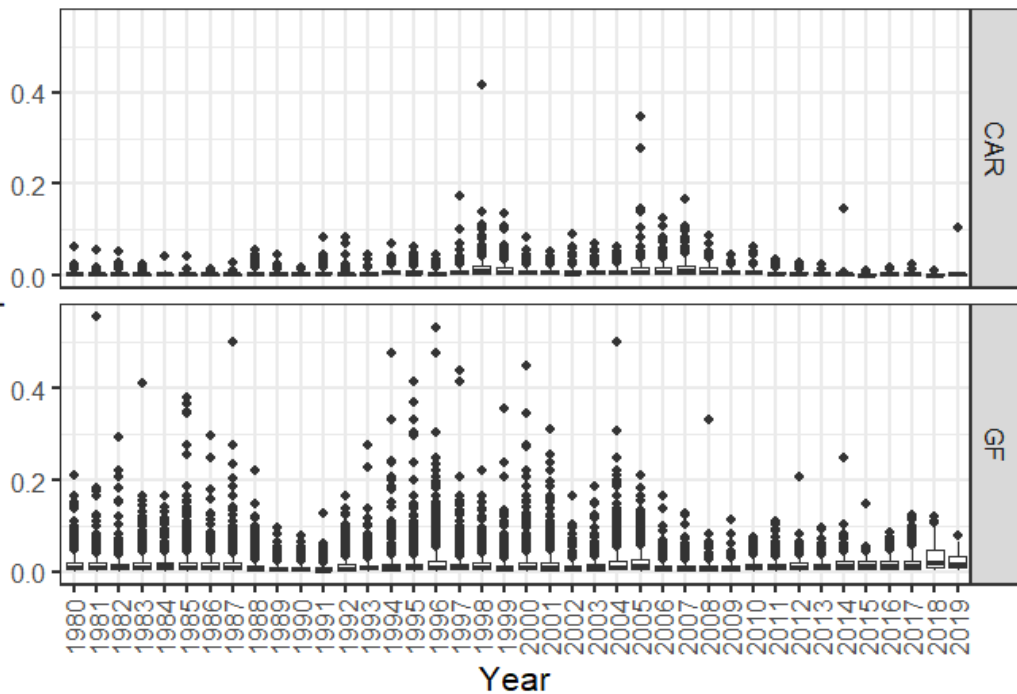
Median cpue for SCAMP



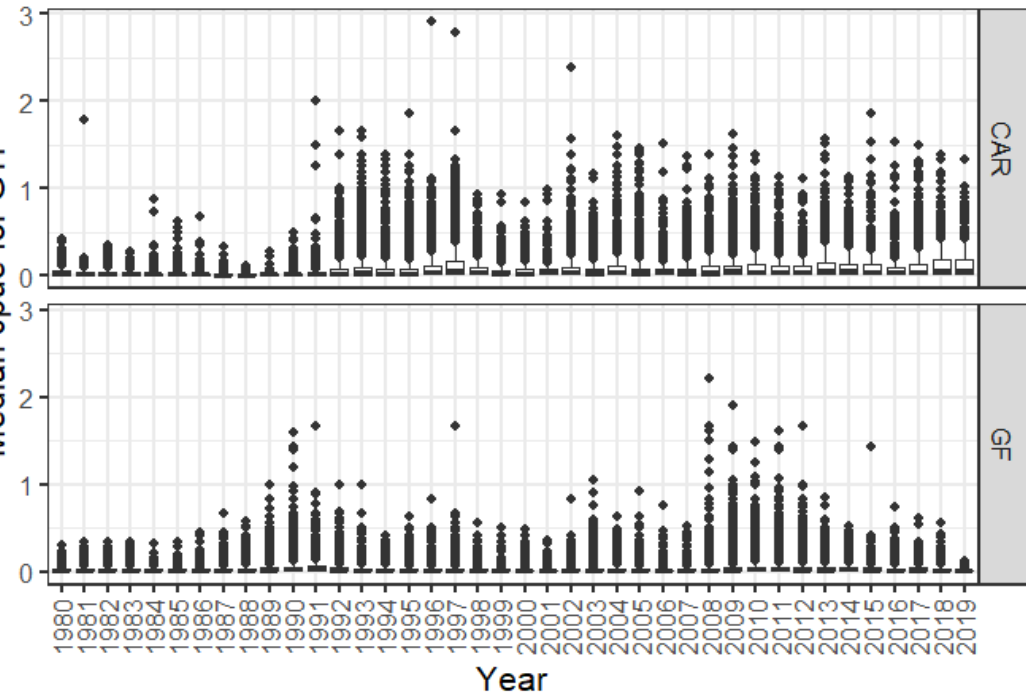
Median cpue for VS



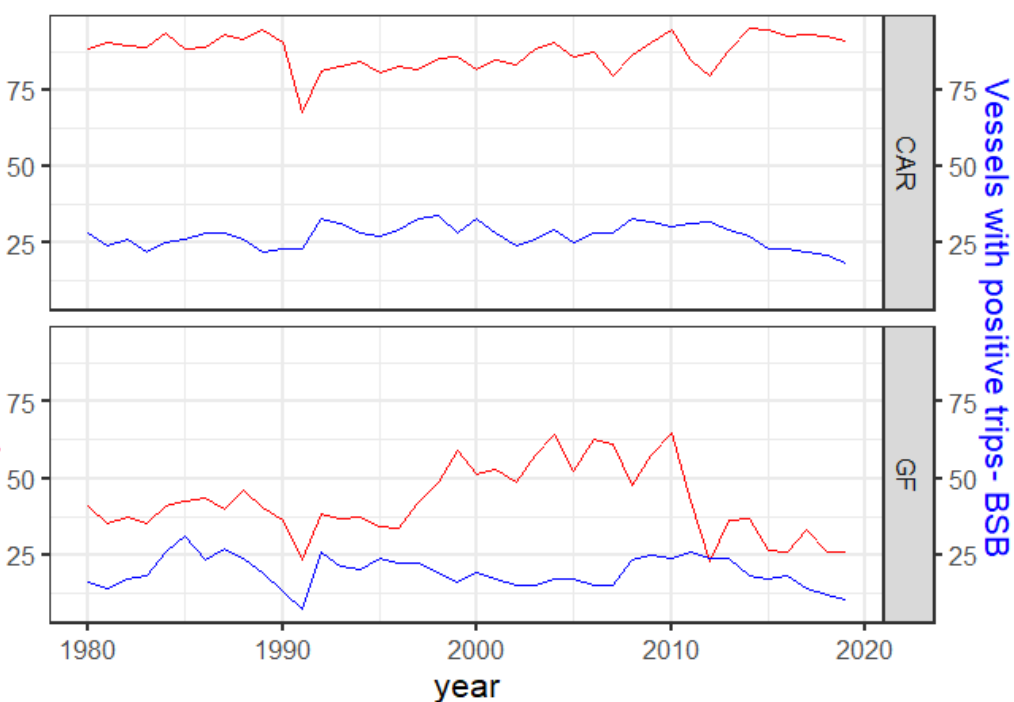
Median cpue for RG



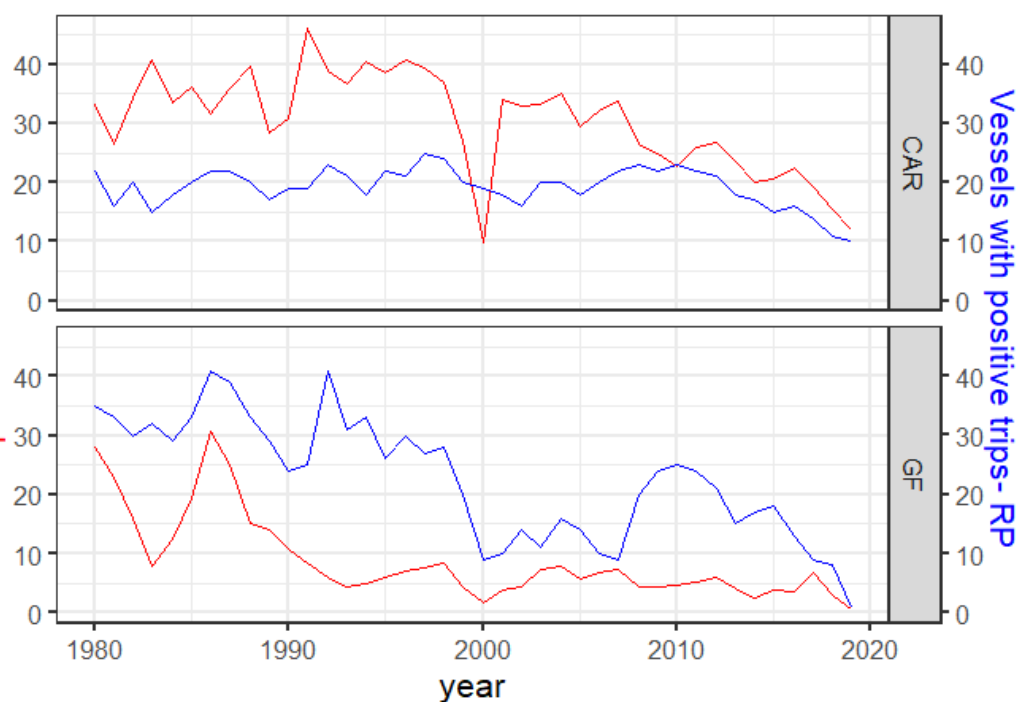
Median cpue for GTF



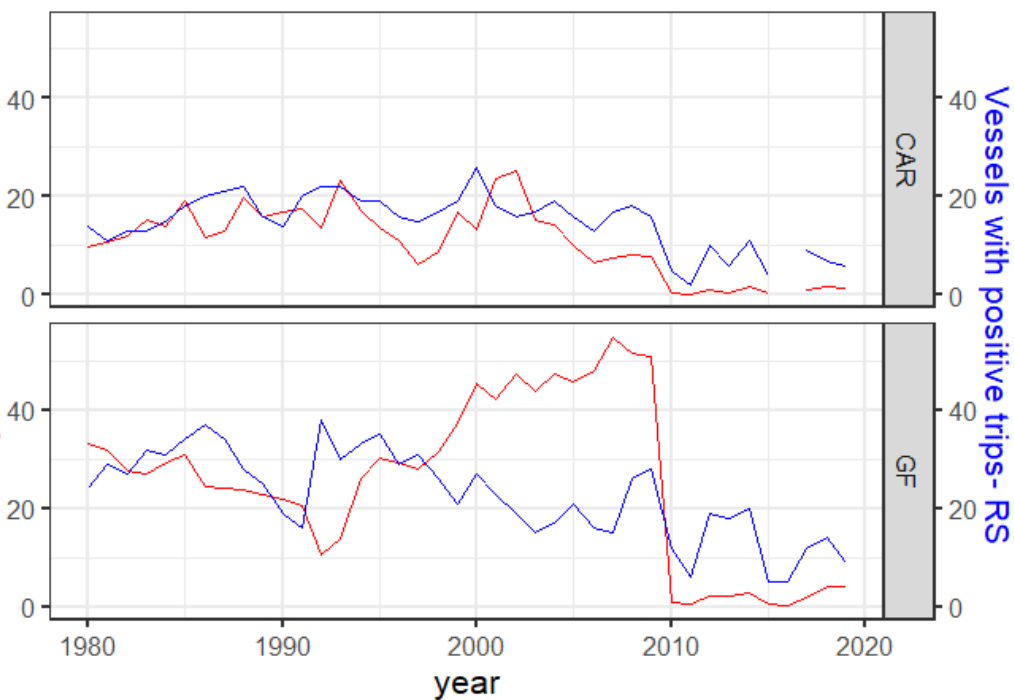
Proportion Positive-BSB



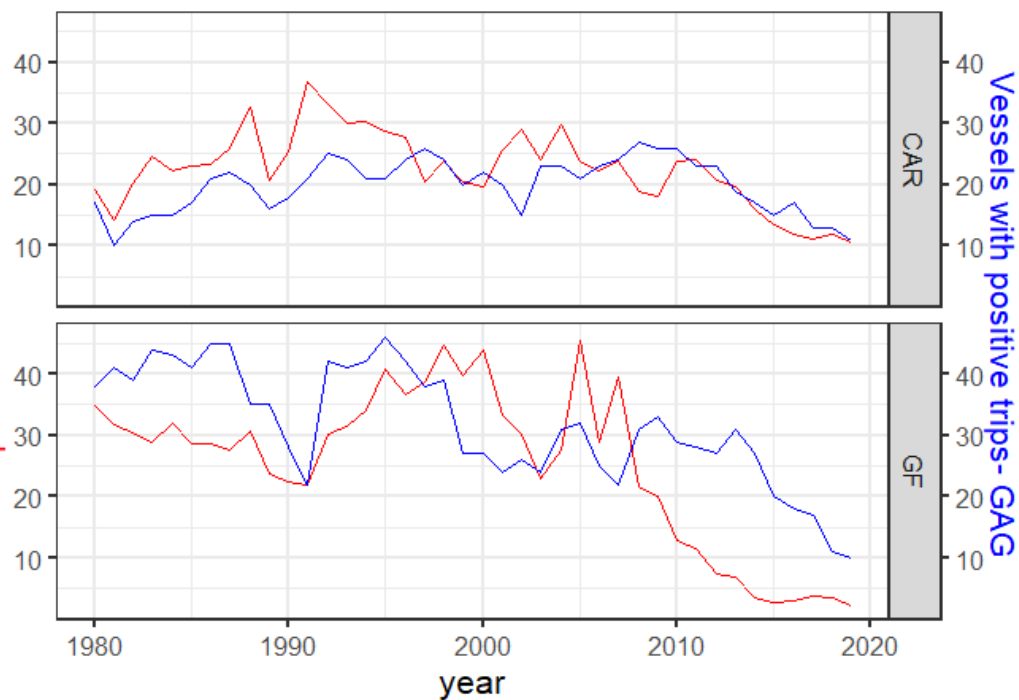
Proportion Positive-RP



Proportion Positive-RS

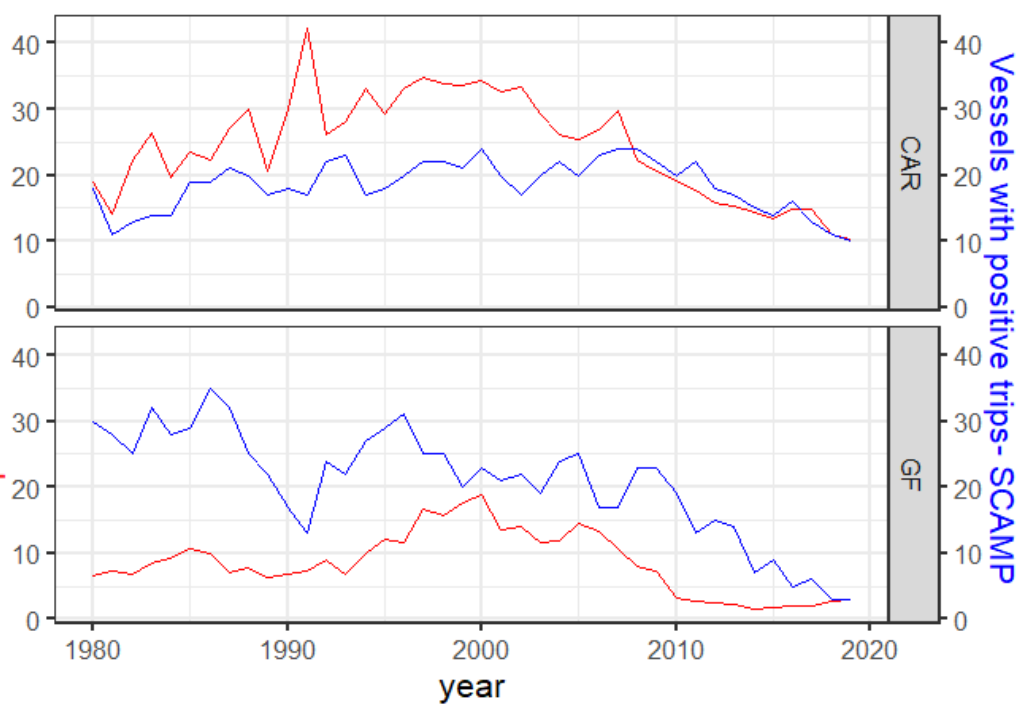


Proportion Positive-GAG

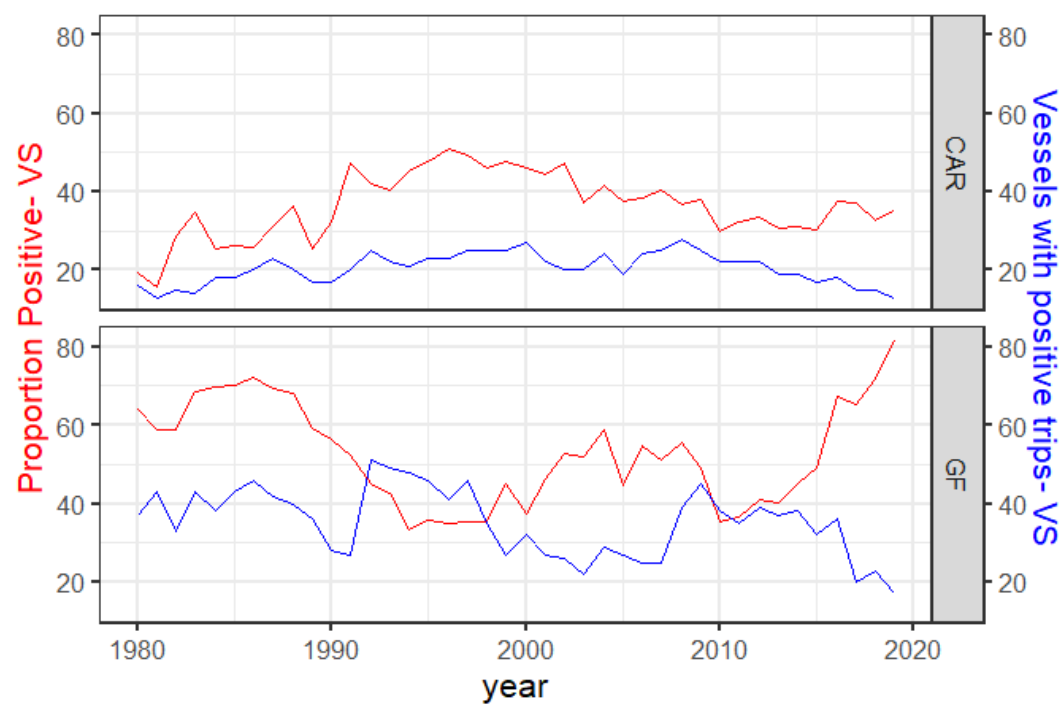




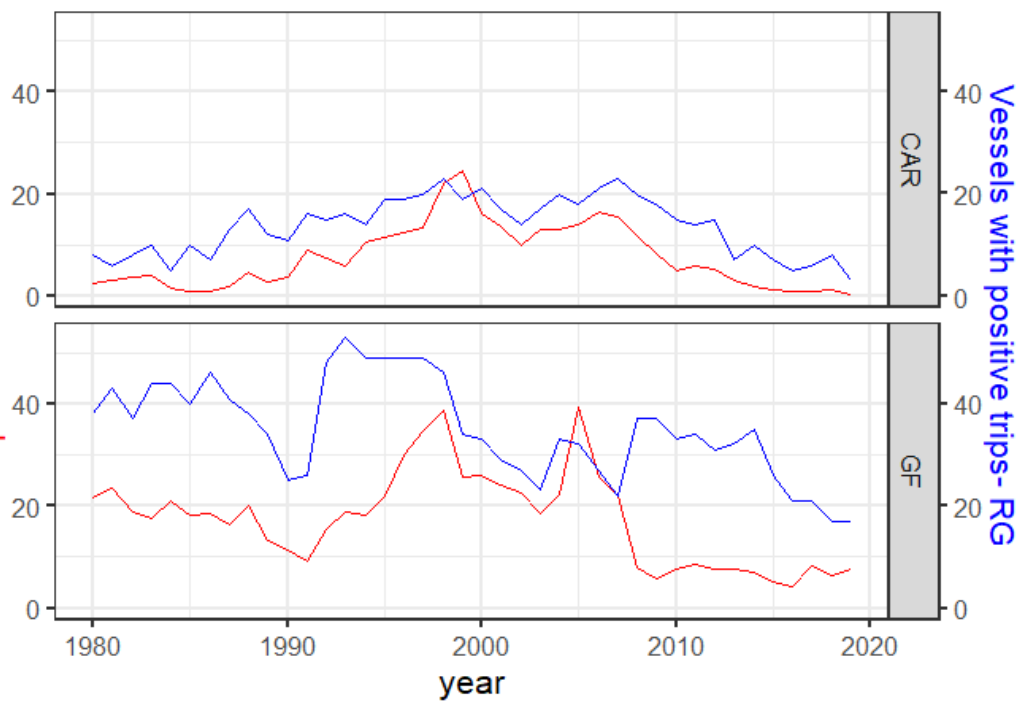
Proportion Positive- SCAMP



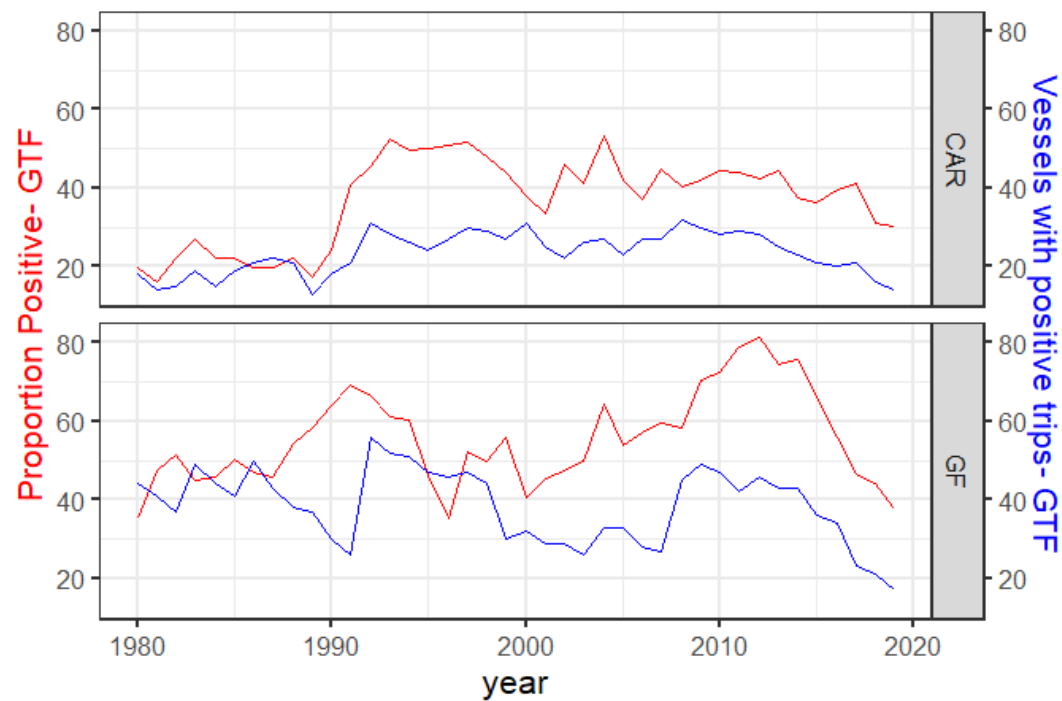
Proportion Positive- VS

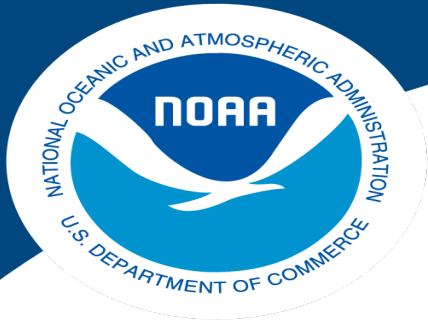


Proportion Positive- RG



Proportion Positive- GTF

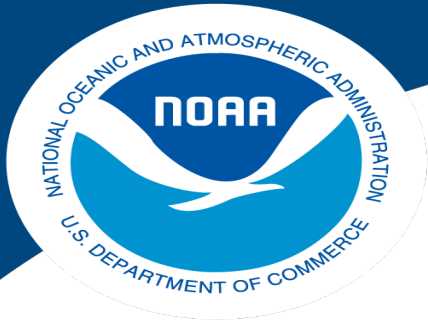




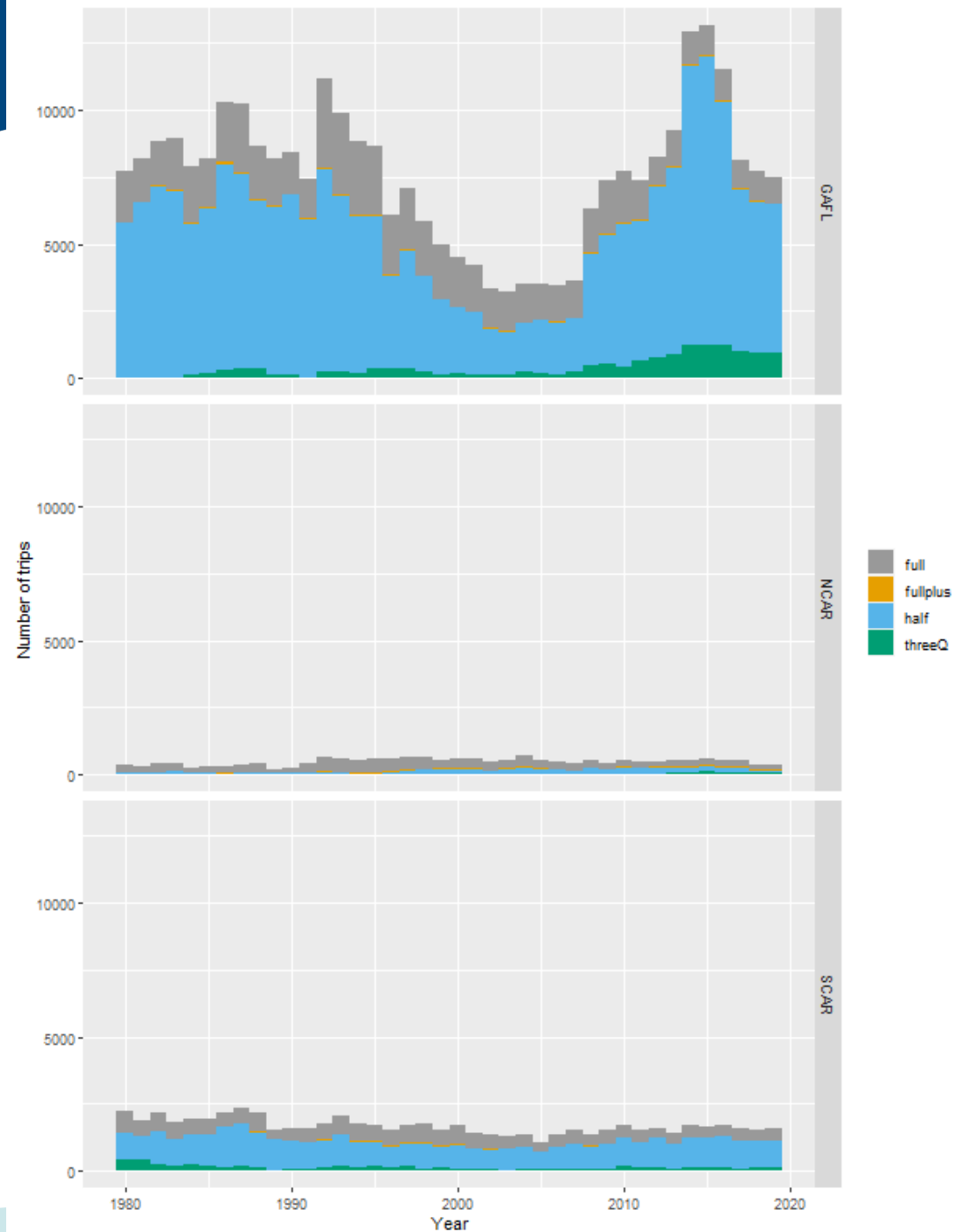
**NOAA**  
**FISHERIES**

## GAG EXAMPLE

- Trips by year and region
- Positive gag trips
- Outliers
- Stephens and MacCall by time block
- Trips retained
- Proportion of zero trips retained by year (effective effort)
- Positive only versus S&M input
- dGLM diagnostics
- Index results

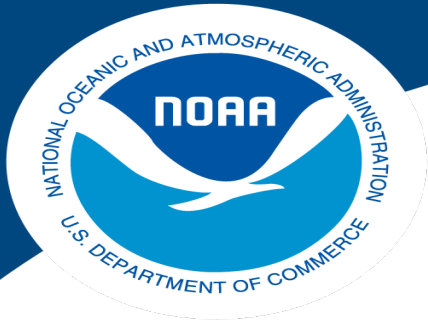


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FISHERIES**

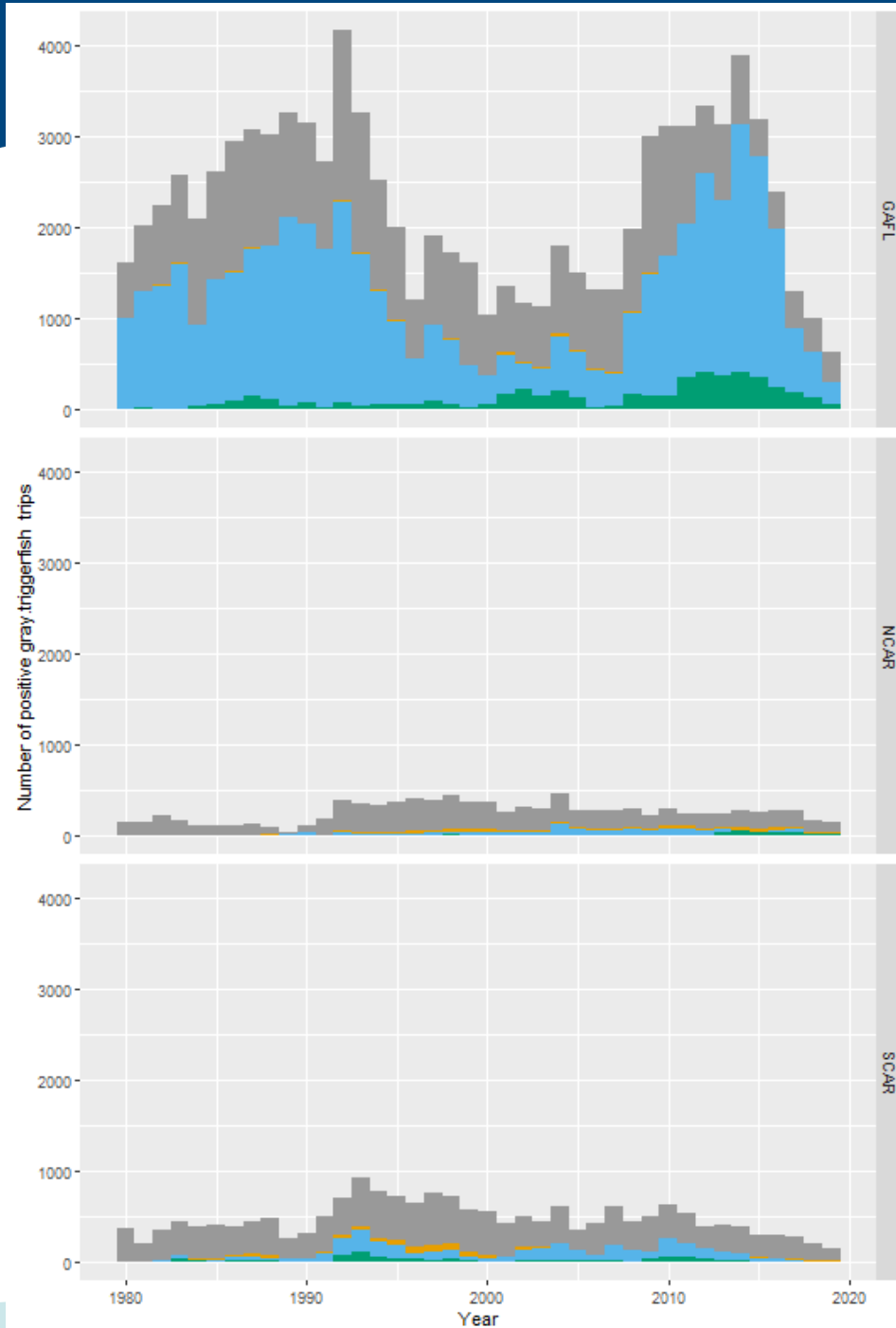


## GTF EXAMPLE

- Trips by year and region
- Positive gag trips
- Outliers
- Stephens and MacCall by time block
- Trips retained
- Proportion of zero trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- Index results

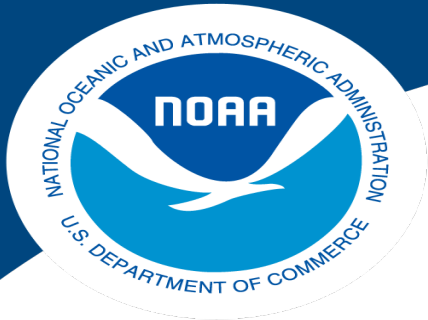


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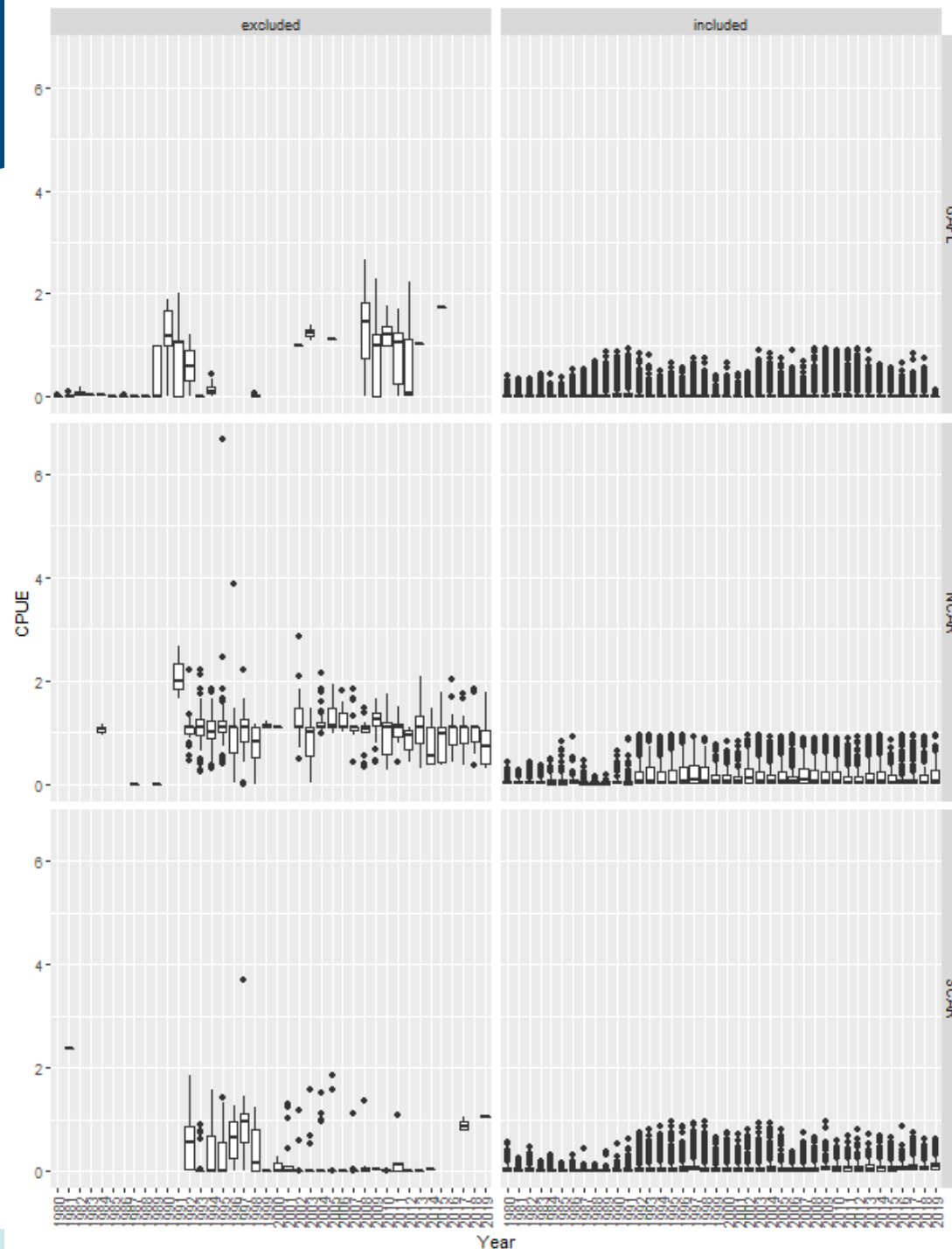


### GTF EXAMPLE

- Trips by year and region
- Positive gag trips
- Outliers
- Stephens and MacCall by time block
- Trips retained
- Proportion of zero trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- Index results

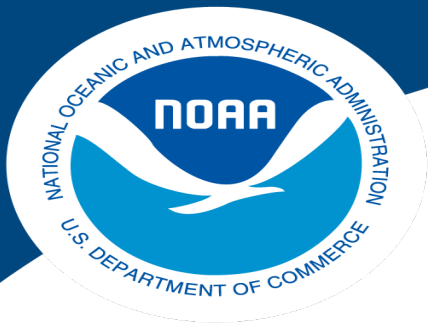


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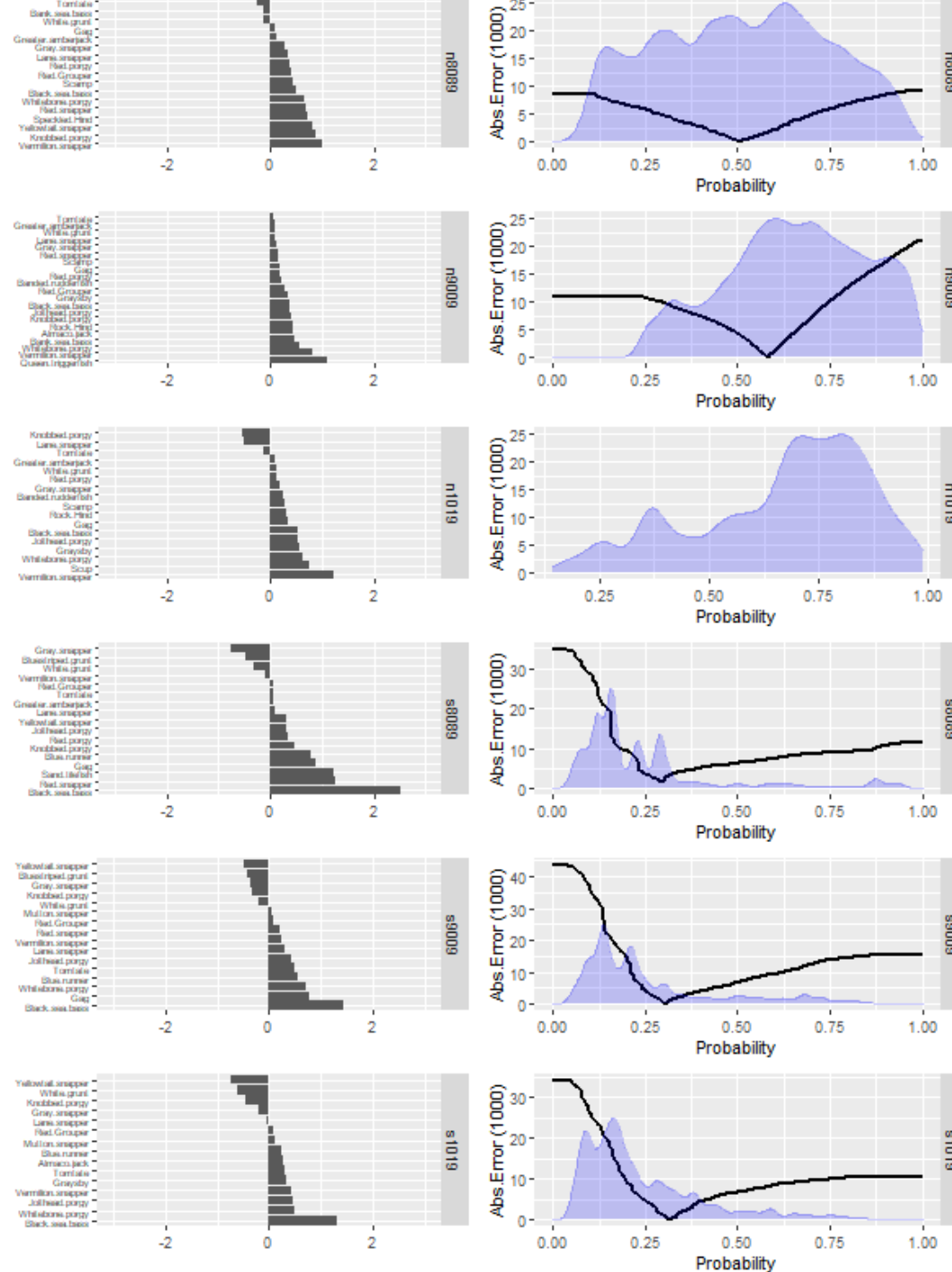


### GTF EXAMPLE

- Trips by year and region
- Positive gag trips
- Outliers (top 0.5%)
- Stephens and MacCall by time block
- Trips retained
- Proportion of zero trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- Index results

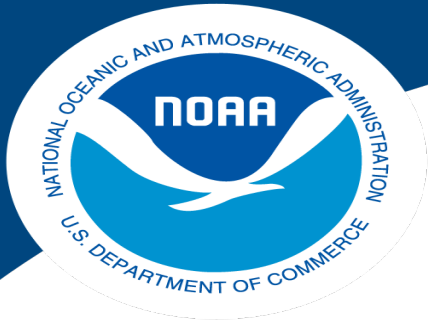


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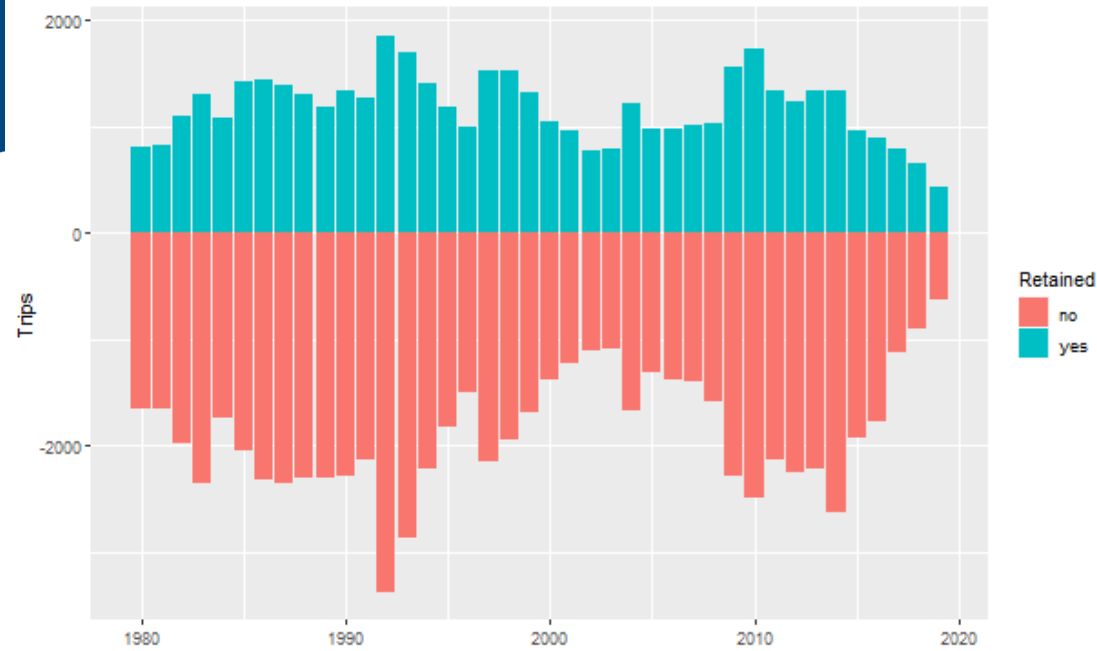
## GTF EXAMPLE

- Trips by year and region
- Positive gag trips
- Outliers
- **Stephens and MacCall by time block**
- Trips retained
- Proportion of zero trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- Index results

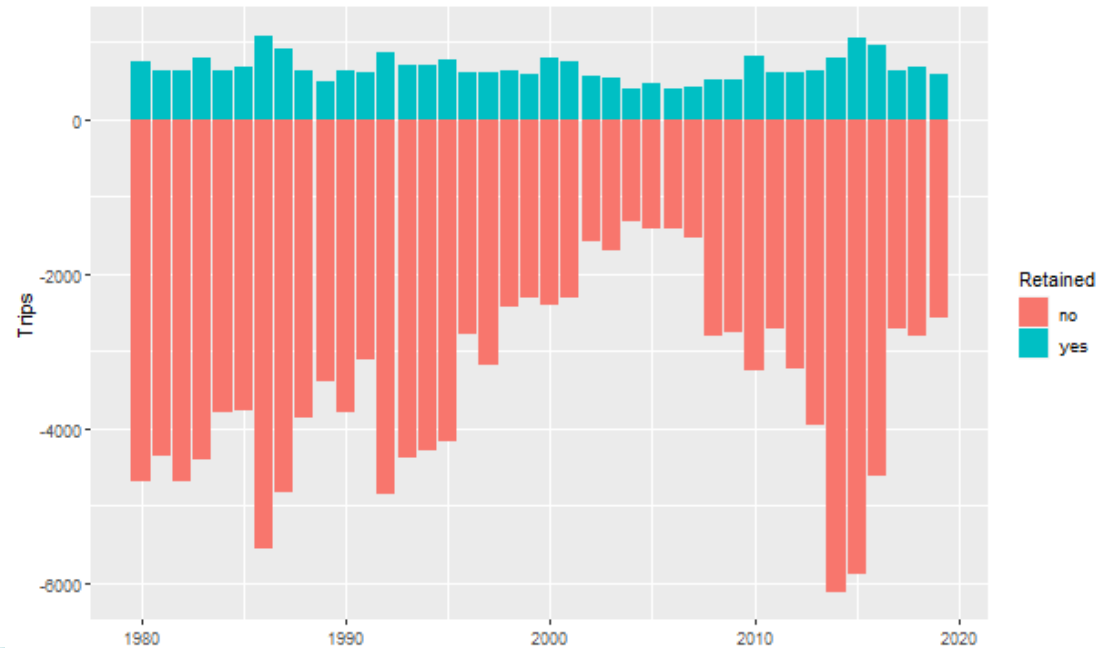


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Positive gray.triggerfish trips retained



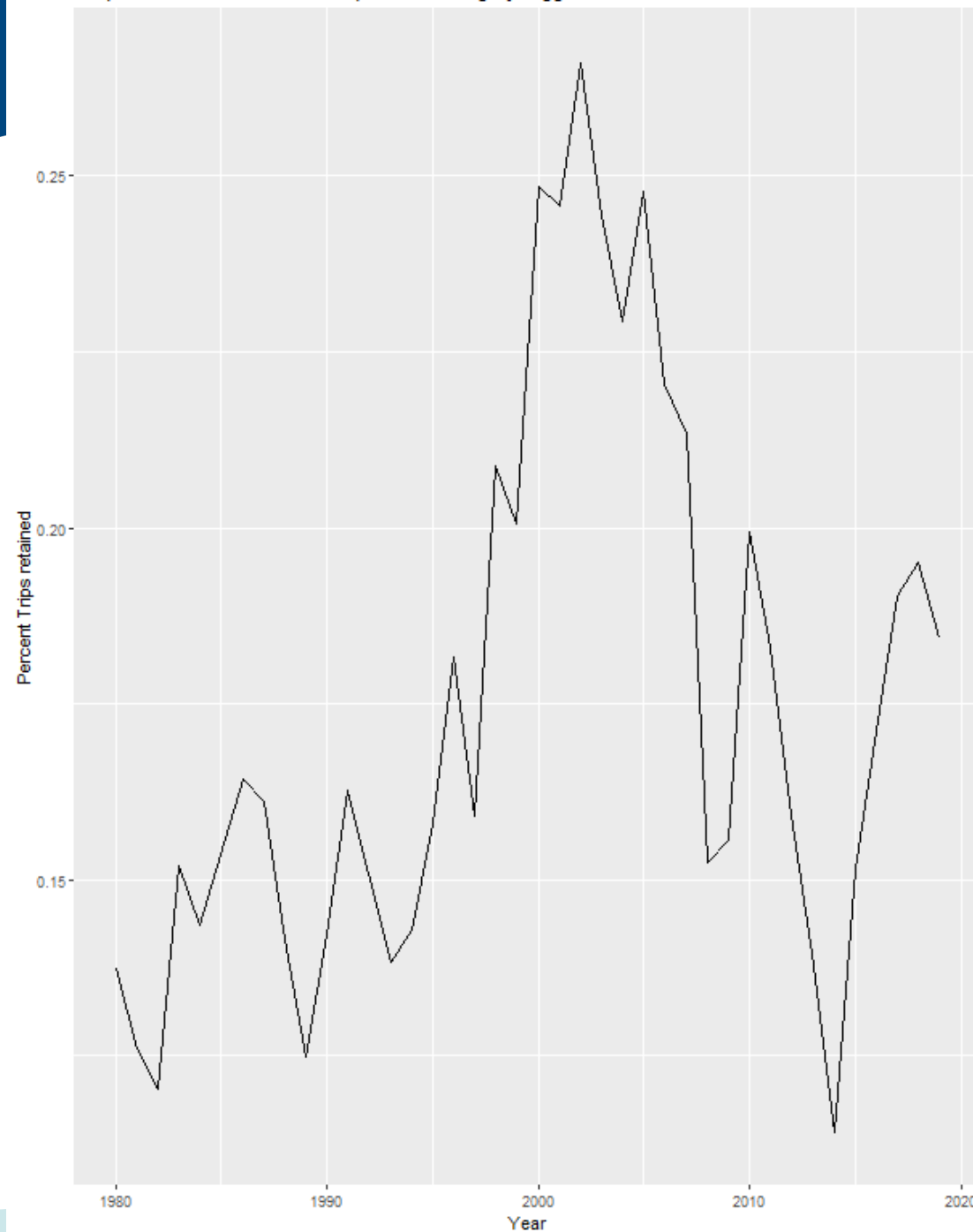
Zero gray.triggerfish trips retained



#### GTF EXAMPLE

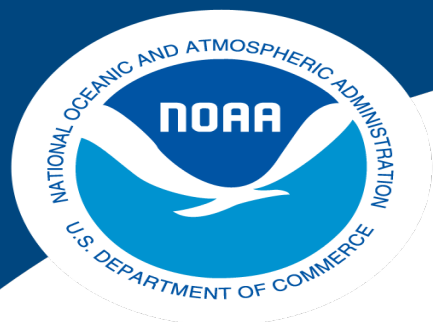
- Trips by year and region
- Positive gag trips
- Outliers
- Stephens and MacCall by time block
- **Trips retained**
- Proportion of zero trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- Index results

Stephens and MacCall zero trips retained - gray triggerfish



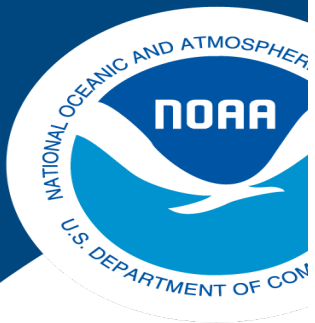
#### GTF EXAMPLE

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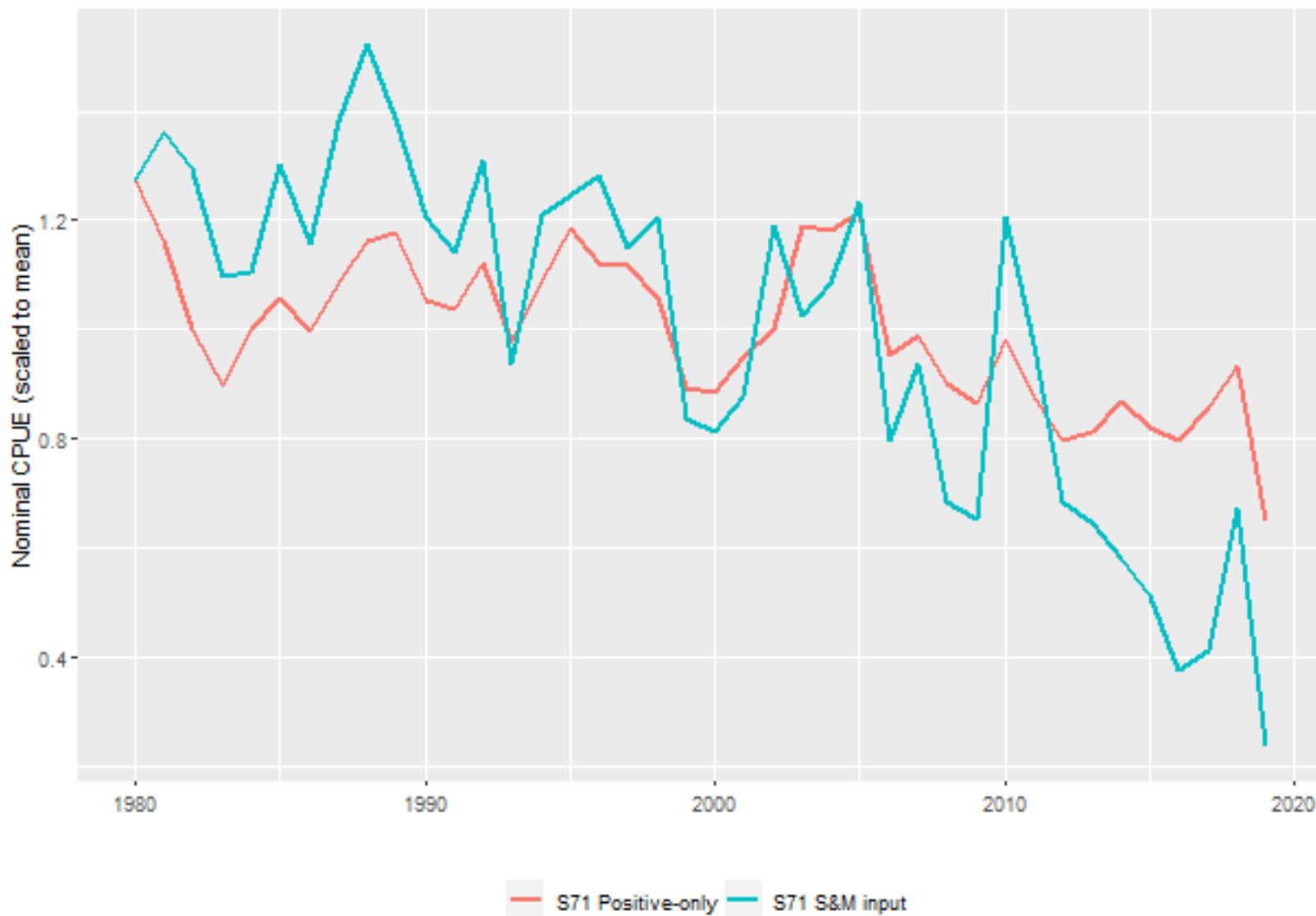


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**FISHERIES**



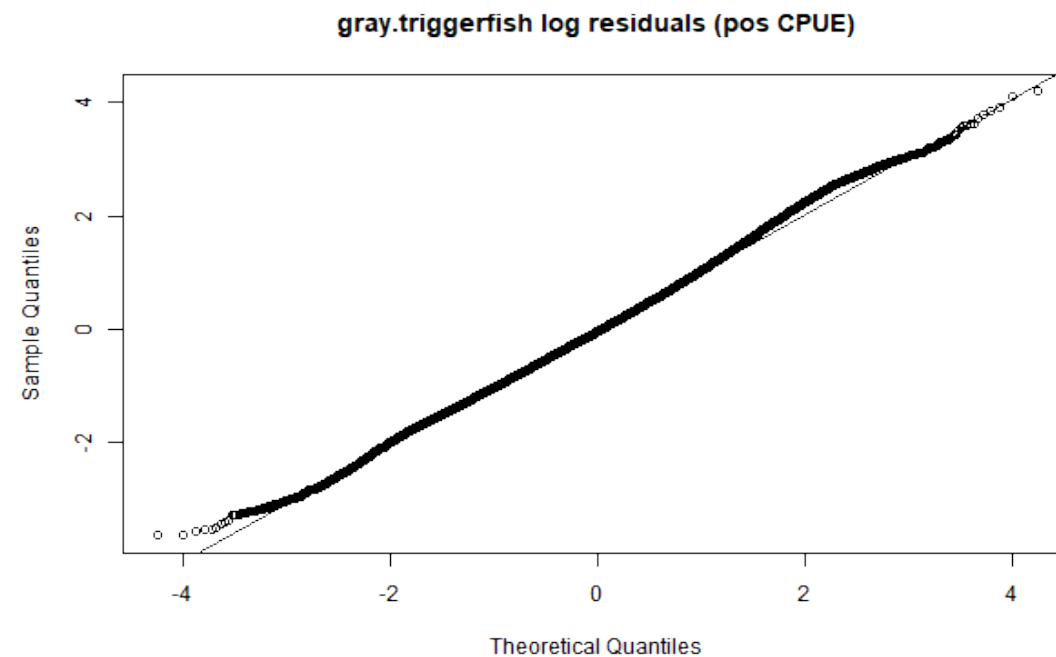
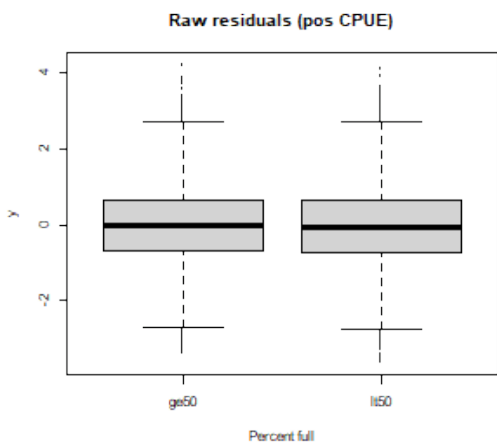
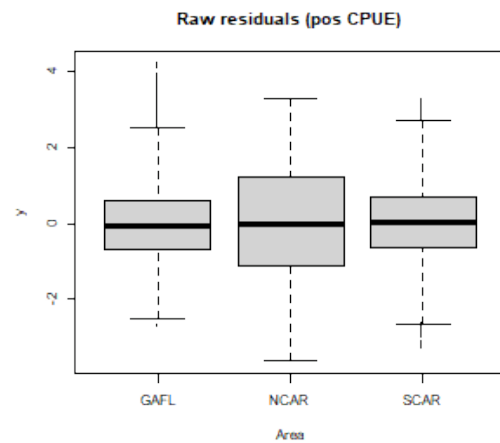
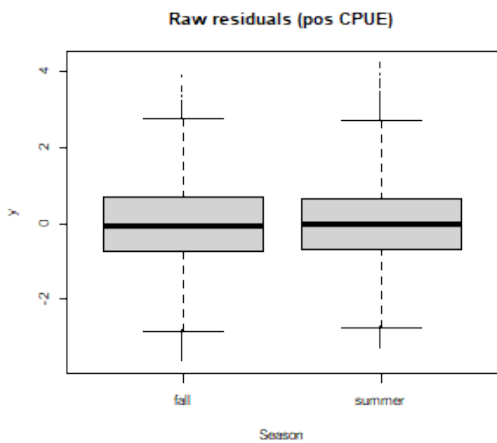
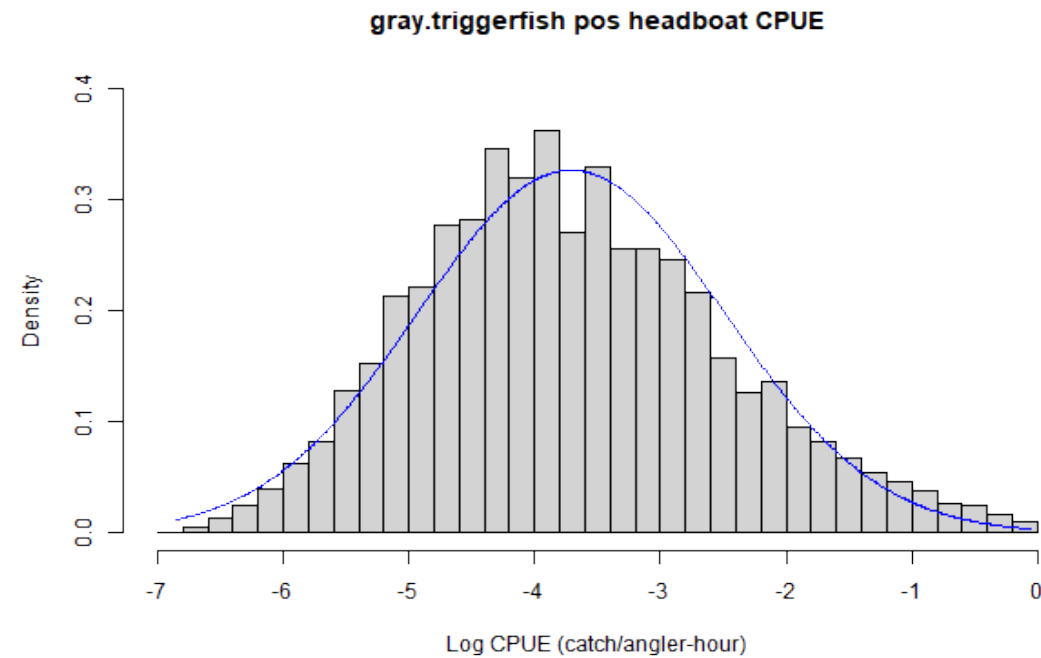
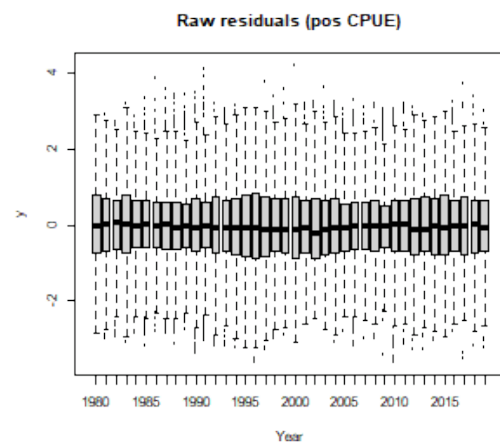
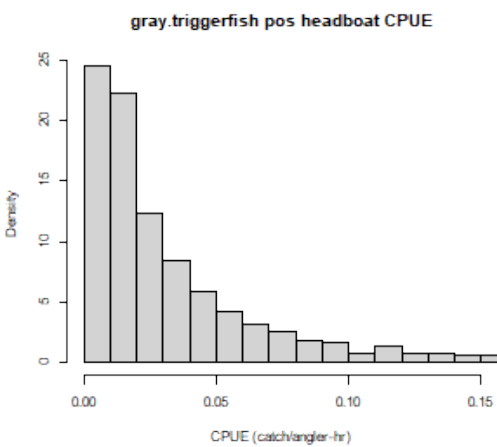


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**FISHERY**



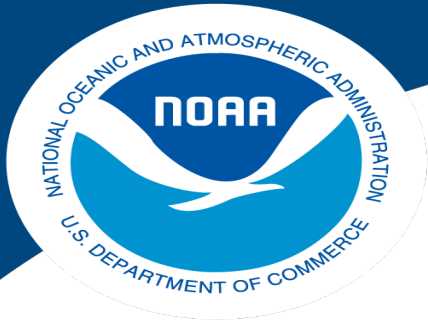
#### GTF EXAMPLE

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- Trips retained
- Proportion of trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- Index results

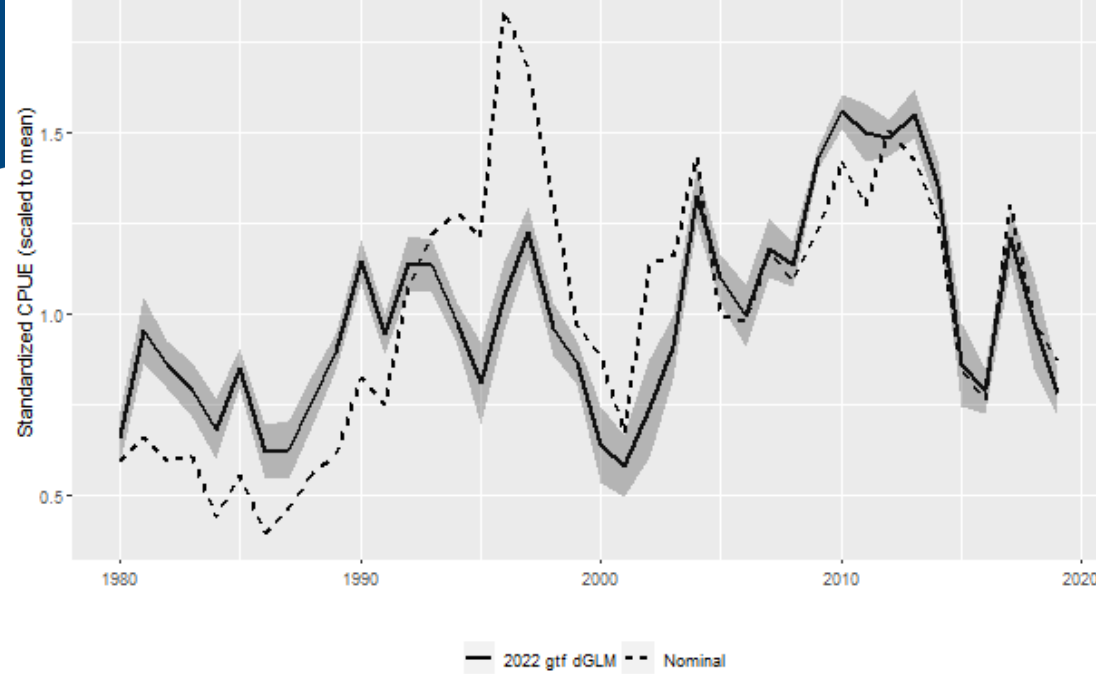


## EXAMPLE

Trips by year and region  
Positive gag trips  
Outliers  
Stephens and MacCall by time block  
Trips retained  
Proportion of trips retained by year  
Positive only versus S&M input  
dGLM diagnostics  
Index results



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FISHERIES**



GRAY.TRIGGERFISH

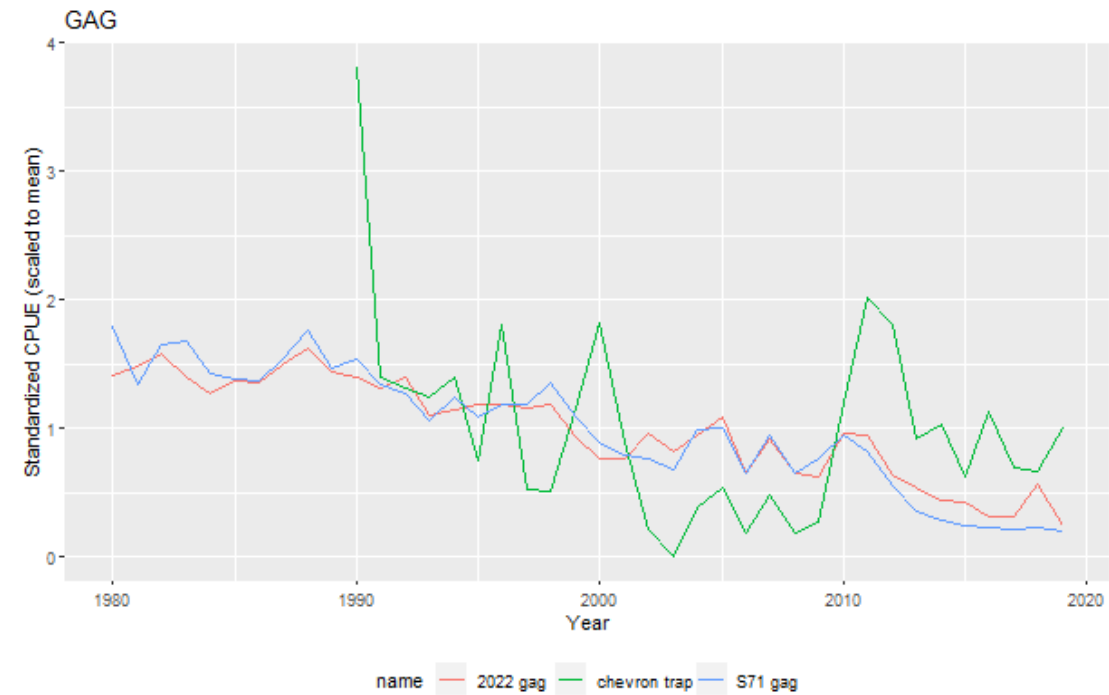
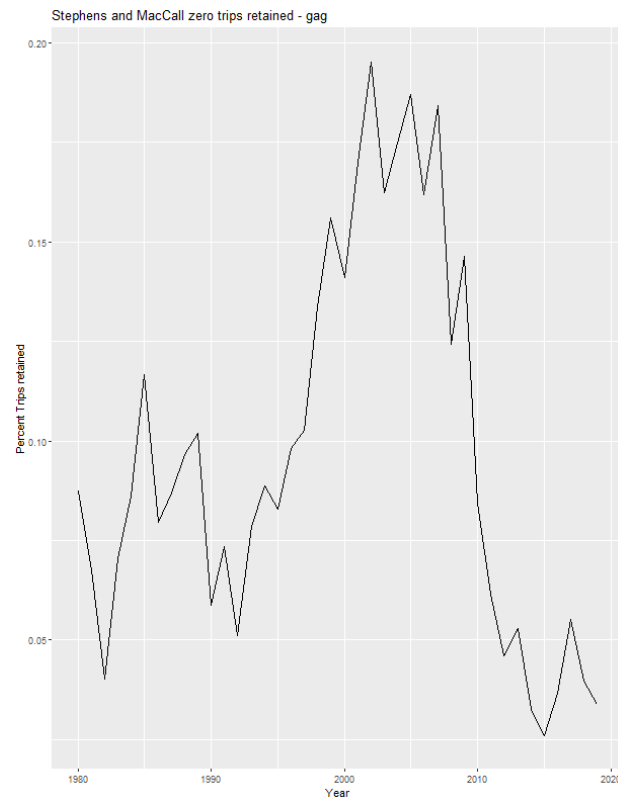
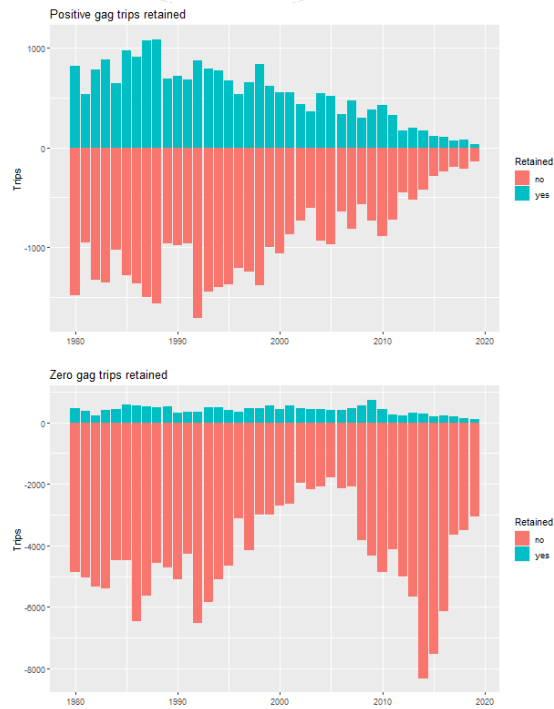


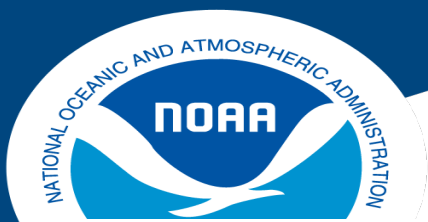
## GTF EXAMPLE

- Trips by year and region
- Positive gag trips
- Outliers
- Stephens and MacCall by time block
- Trips retained
- Proportion of trips retained by year
- Positive only versus S&M input
- dGLM diagnostics
- **Index results**

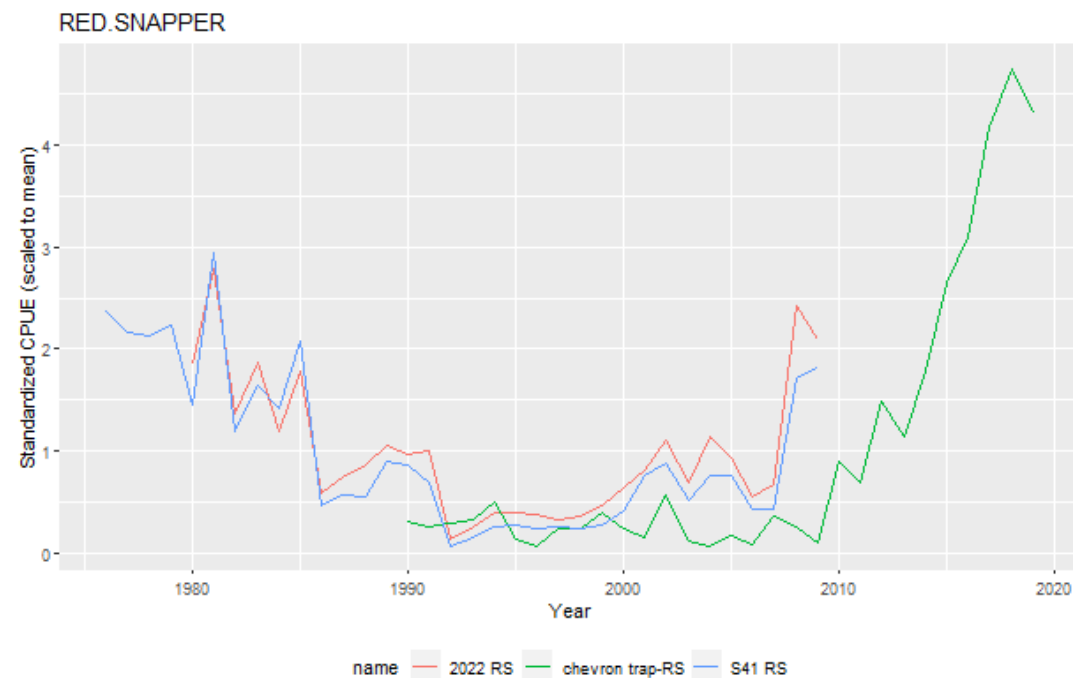
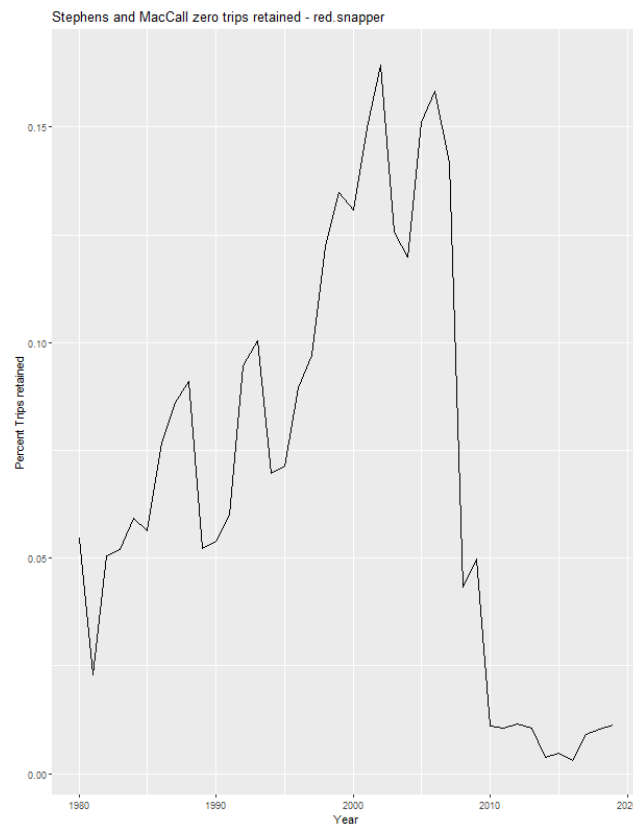


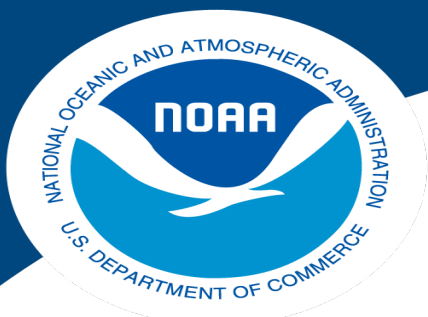
# GAG



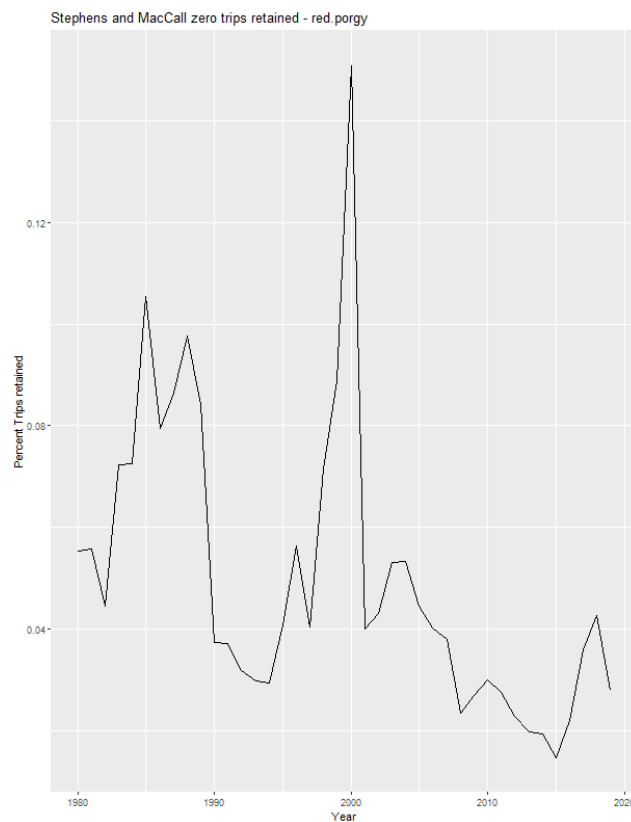
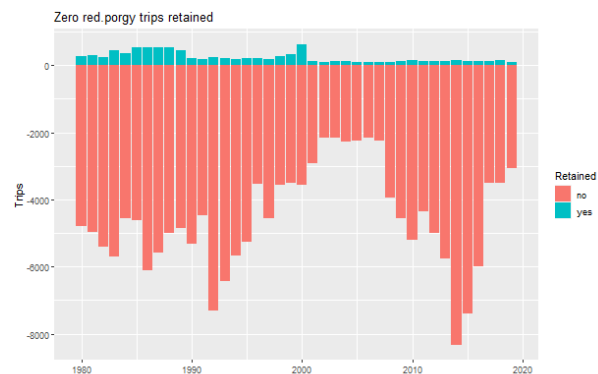
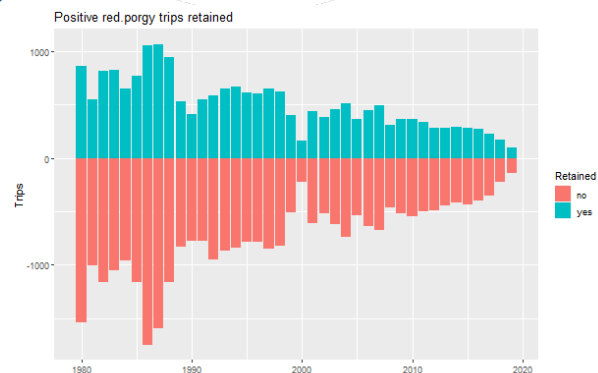


# Red Snapper



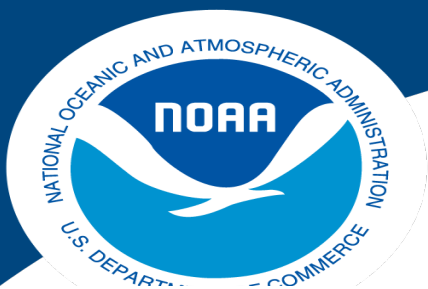


# Red Porgy

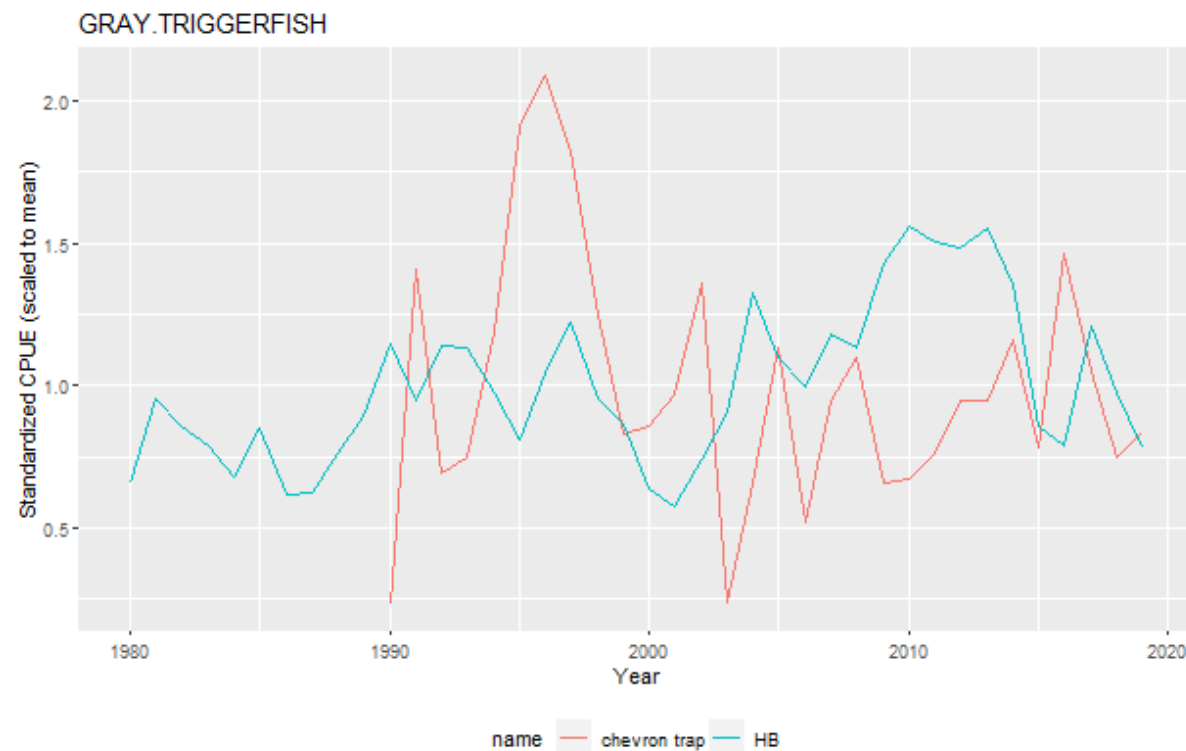
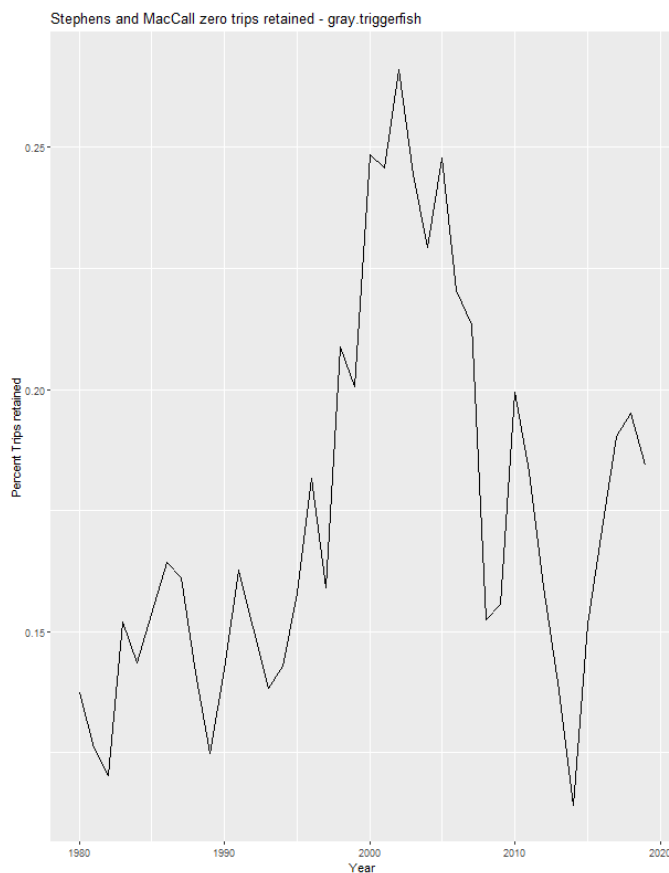
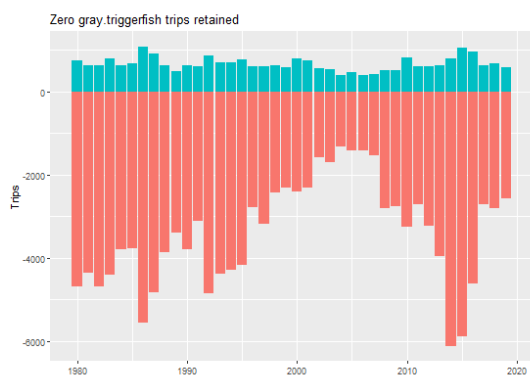
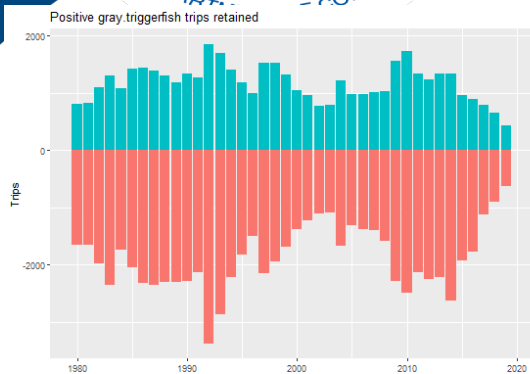


RED.PORGY





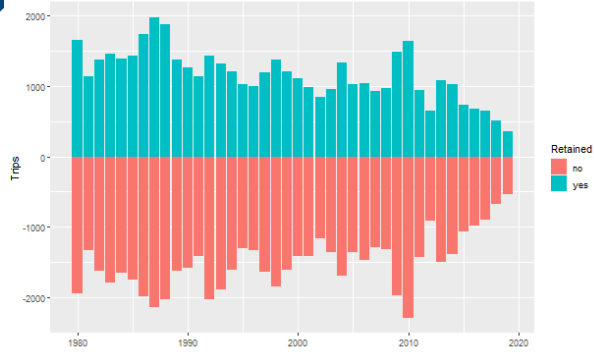
# Gray triggerfish



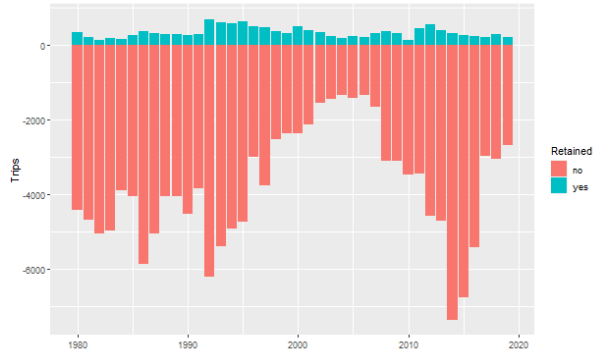


# Black sea bass

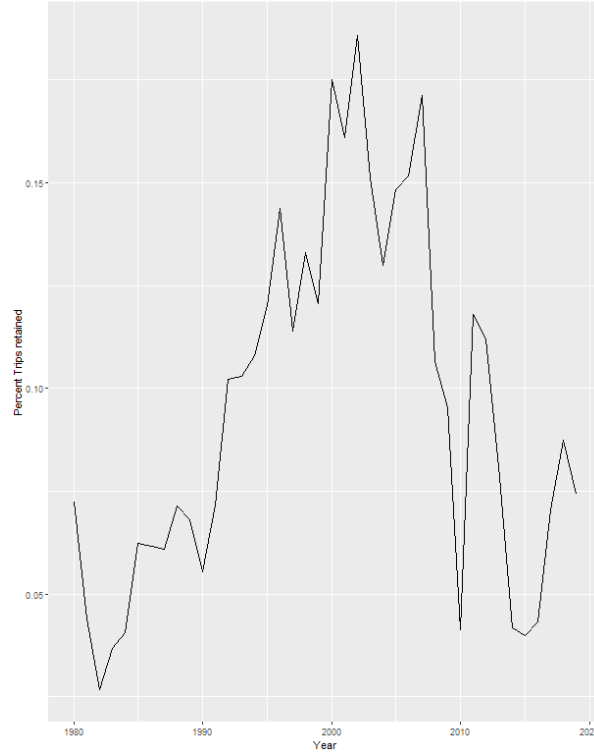
Positive black sea bass trips retained



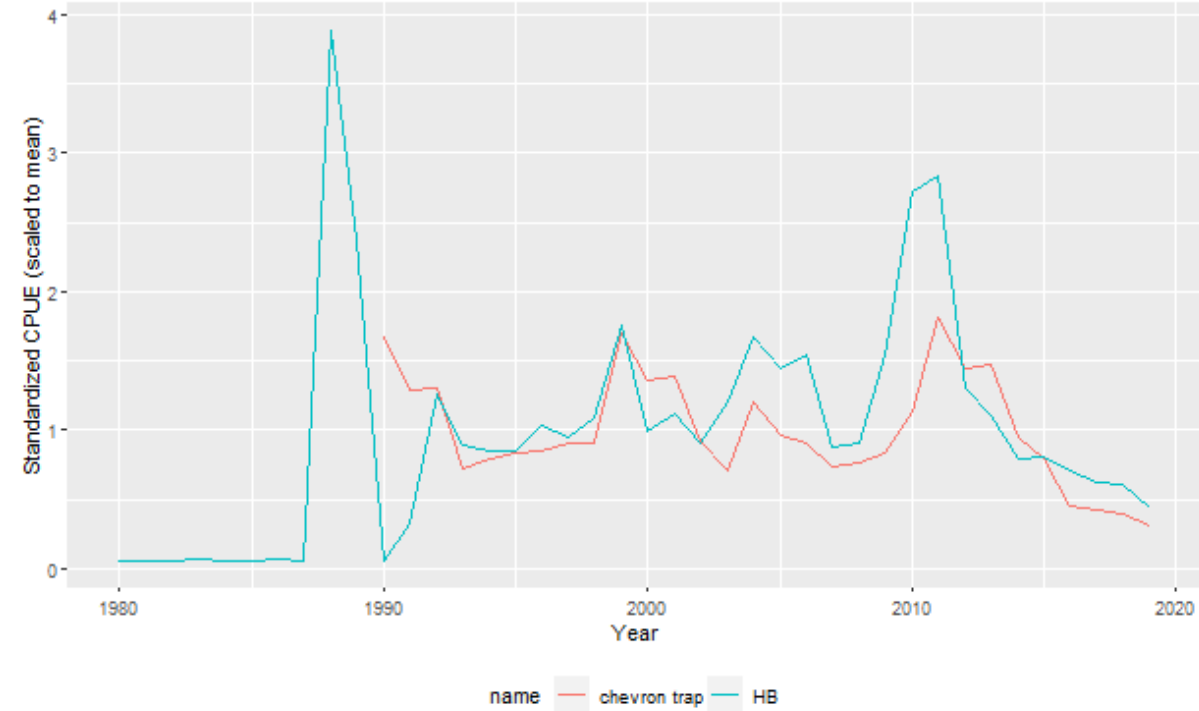
Zero black sea bass trips retained



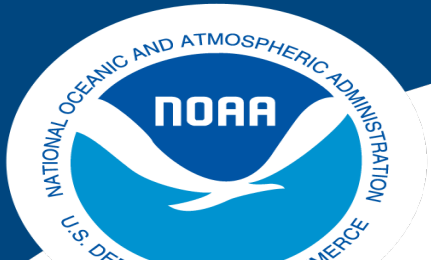
Stephens and MacCall zero trips retained - black sea bass



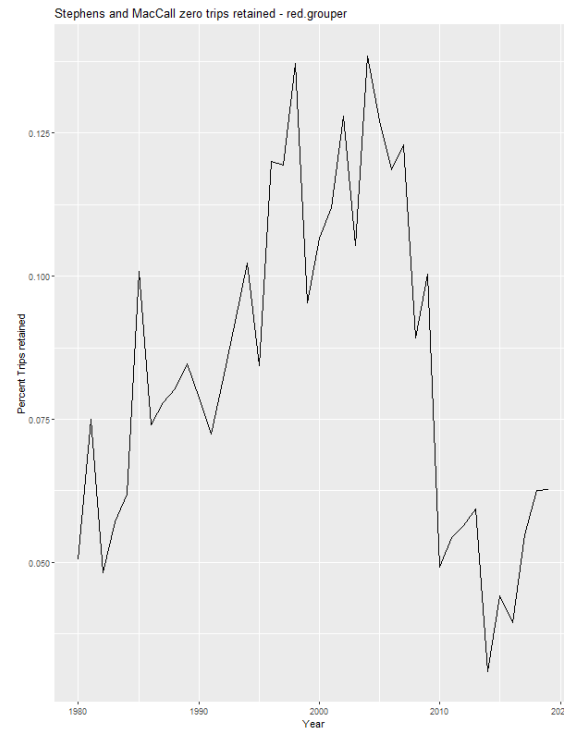
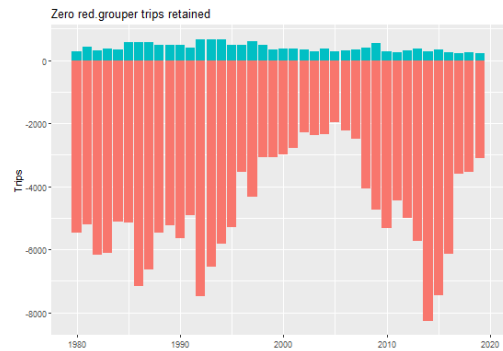
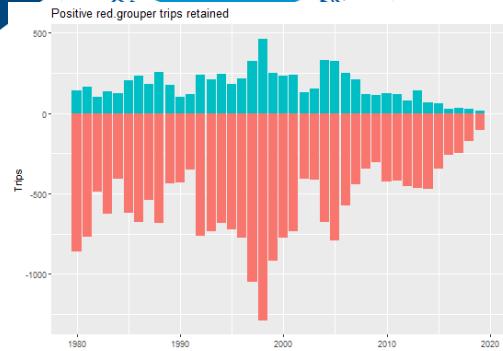
BLACK SEA BASS

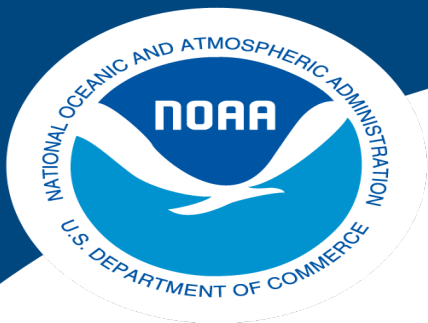




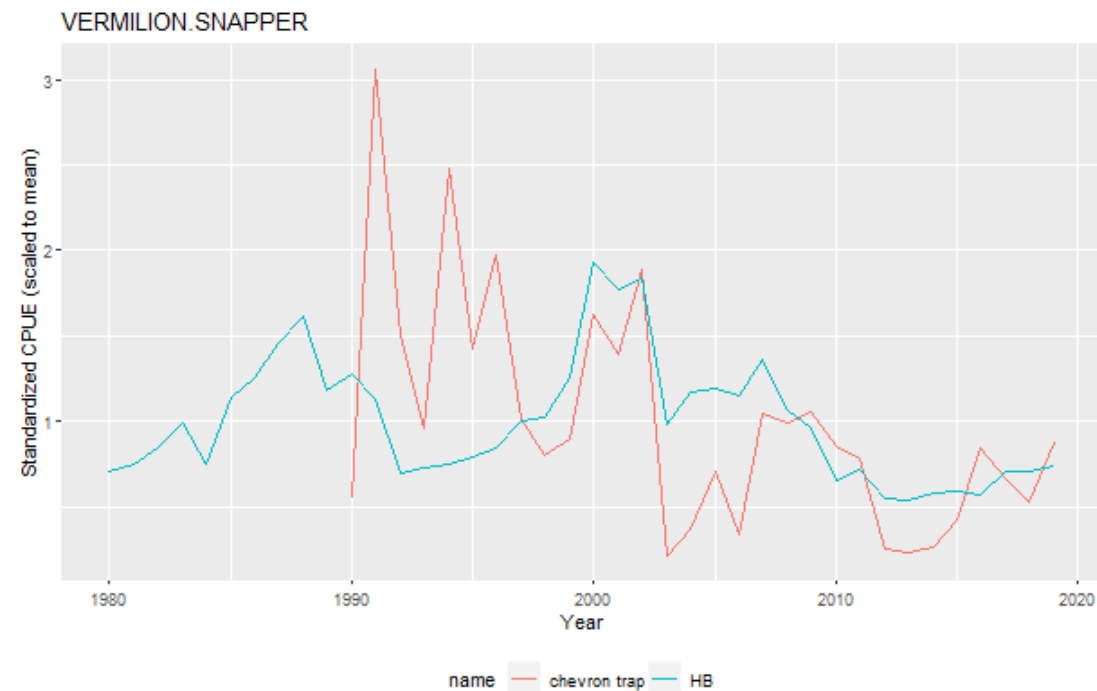
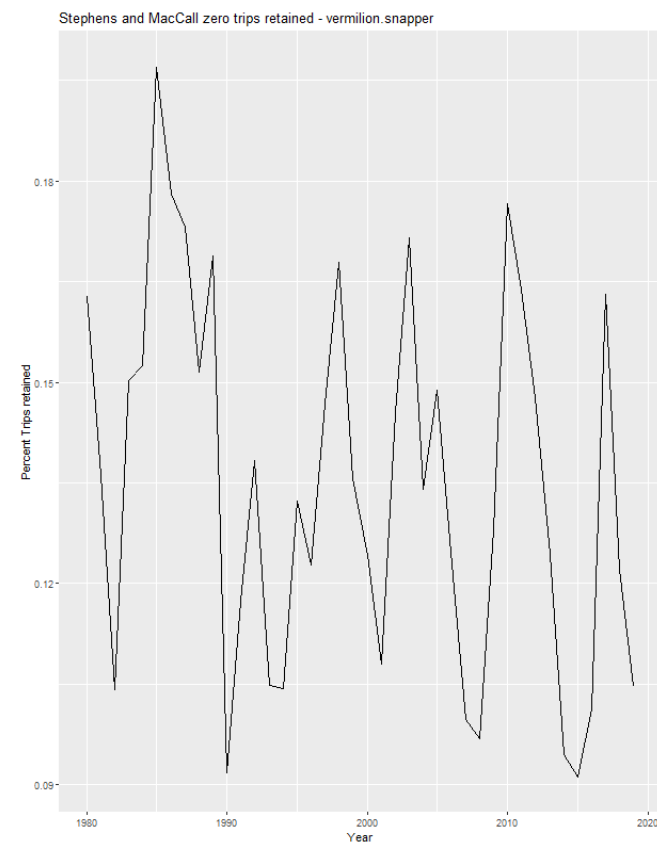
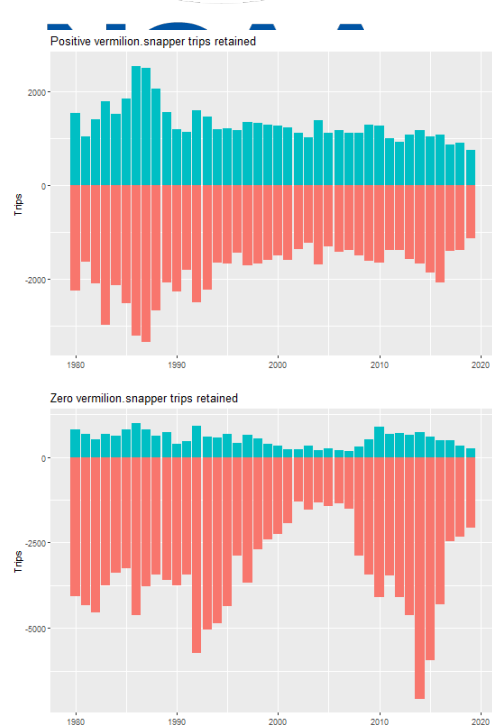


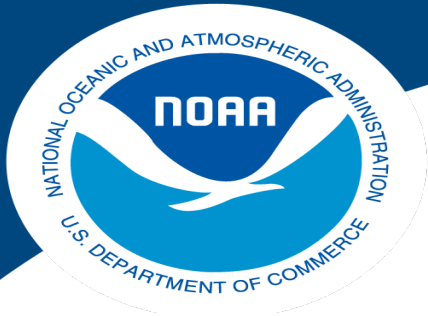
# Red grouper



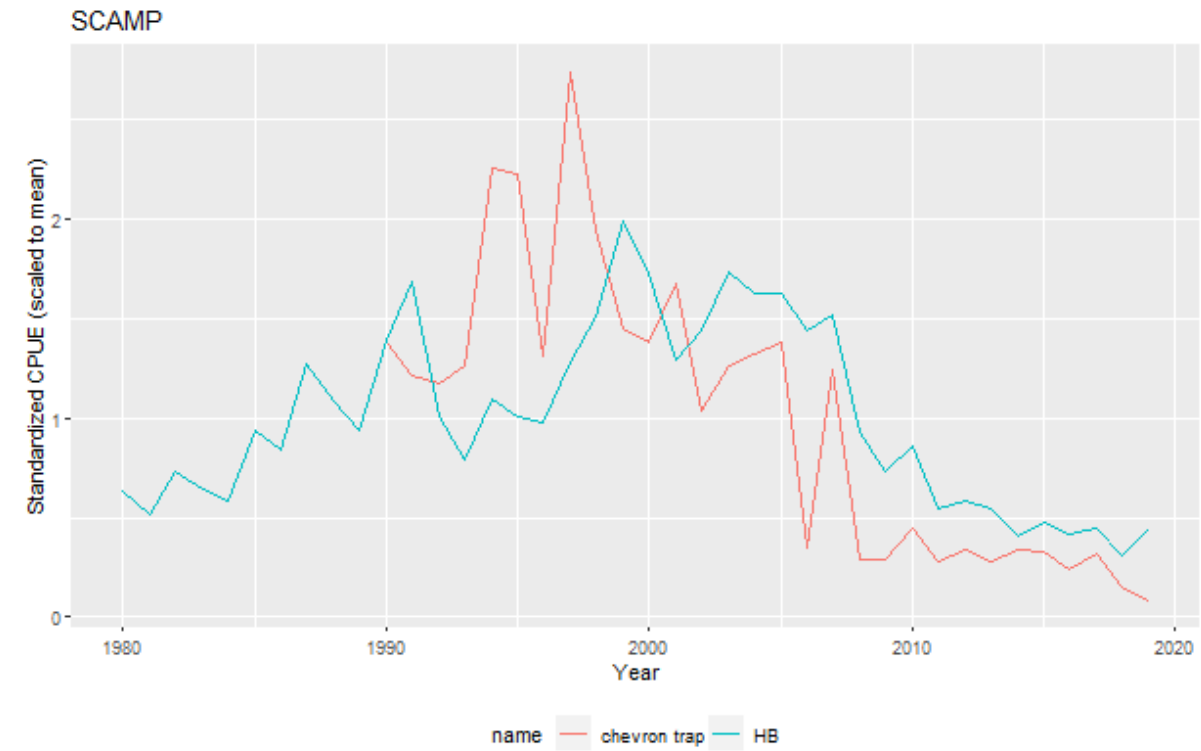
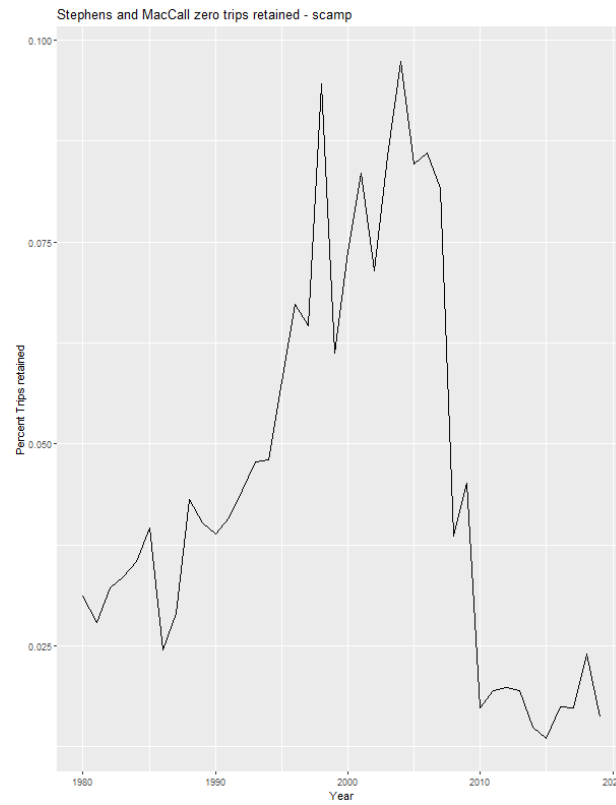
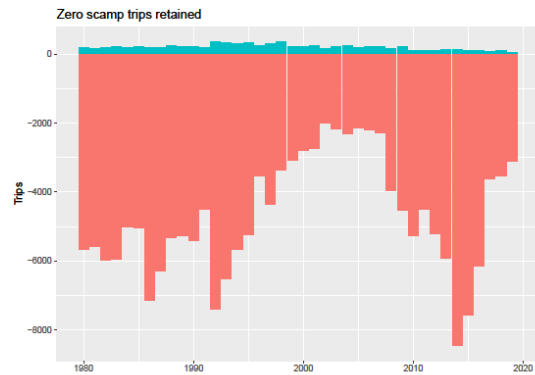
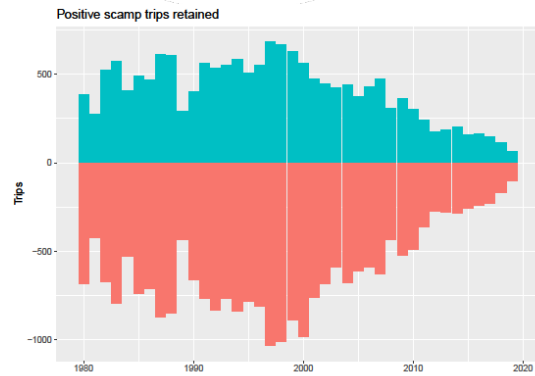


# Vermilion snapper

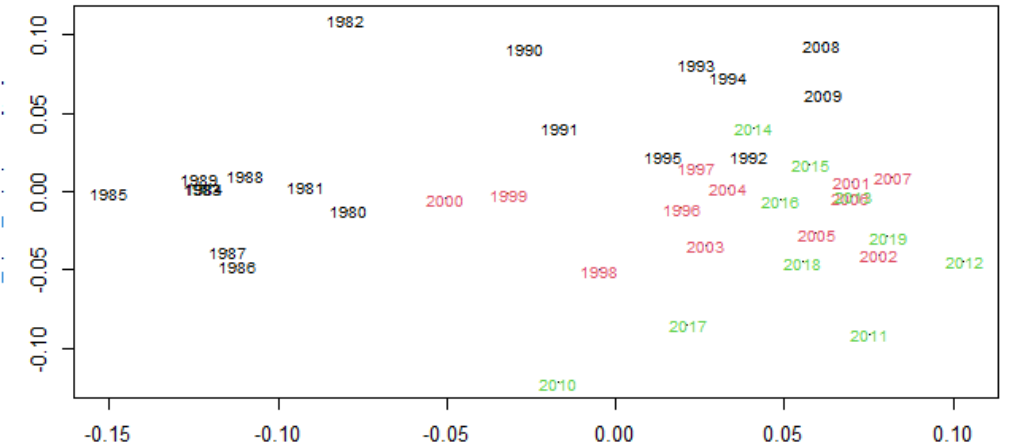
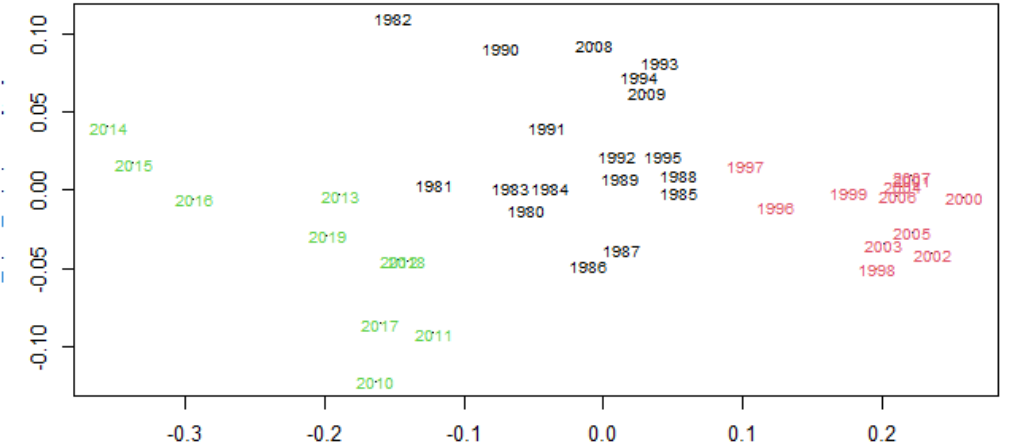
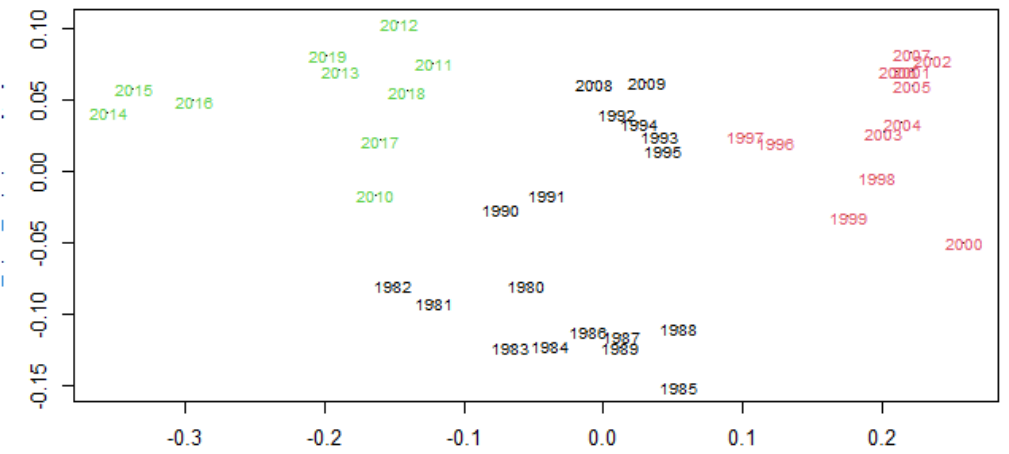
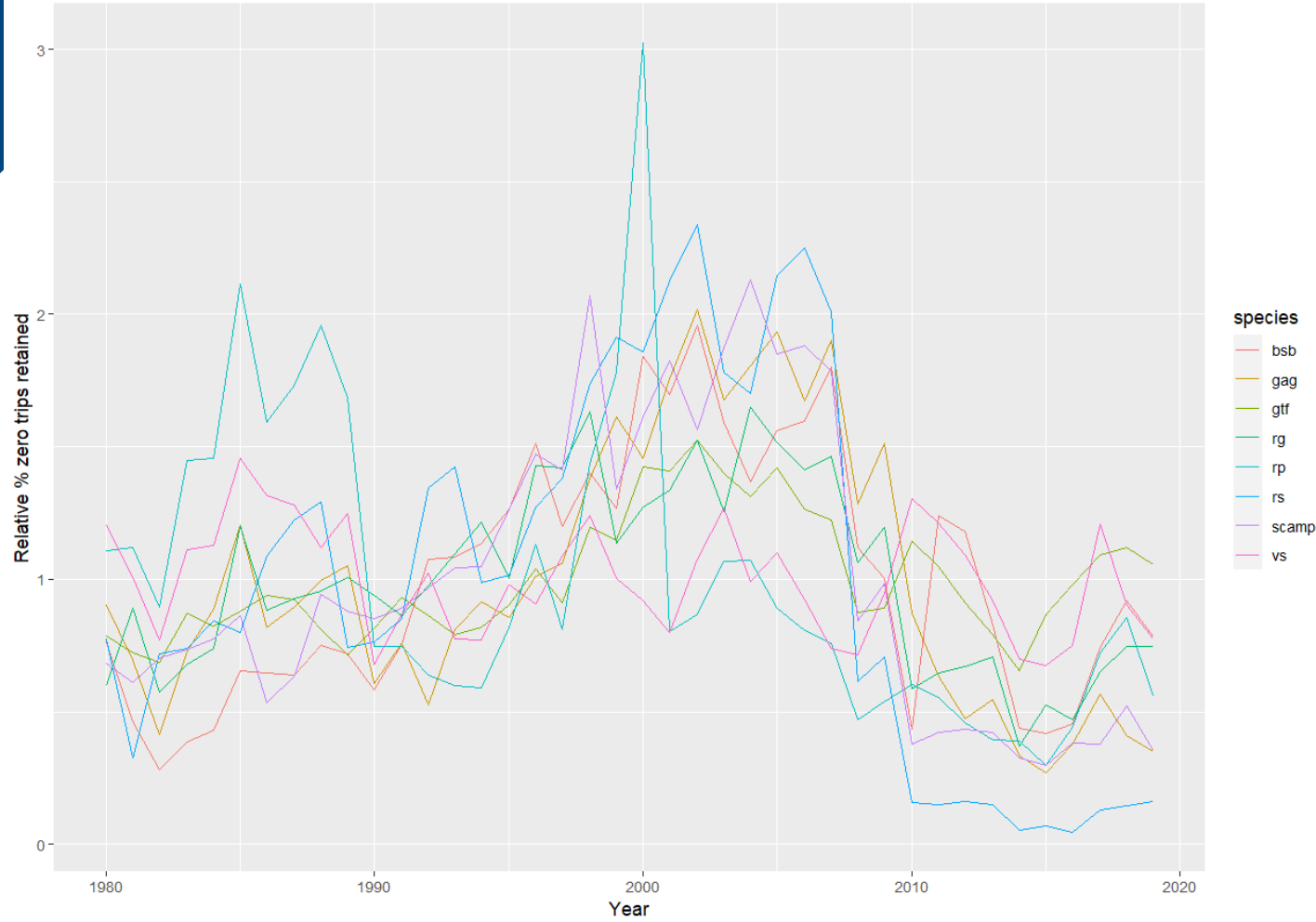


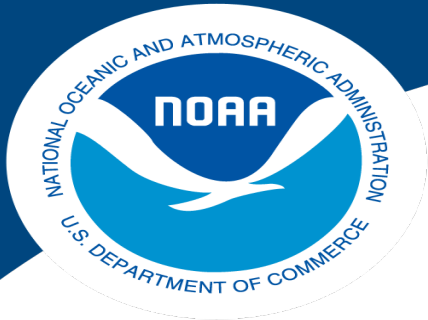


# Scamp



# Stephens and MacCall zero trips retained

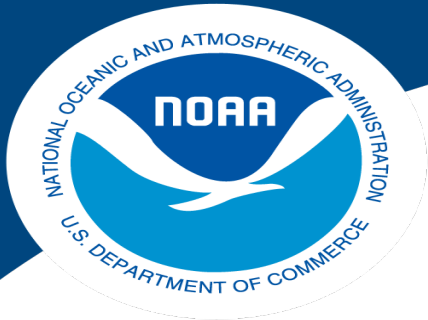




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## SUMMARY

- Pattern suggesting decrease in proportion positive by species and region
- Pattern suggesting decrease in number of vessels with positive trips by species and region
- Consistent decline starting in approximately 2010 in how Stephens and MacCall is identifying effective effort (retaining zero trips)
- Species specific targeting in the headboat fishery due to management regulations



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### Recommendation:

- A cautionary approach should be taken when developing fishery dependent indices for use in the stock assessment process.
- The burden of proof should be providing additional evidence that these fishery dependent indices are reflecting trends in abundance (i.e., compared to fishery independent indices, presence of strong year class in age comps corresponding to the say year in the index, etc.).
- It should now be assumed that fishery dependent indices may no longer be tracking abundance due to effects of increased management regulations on the fishery (i.e. shifts in behavior, targeted, avoidance, hyperstability, hyperdepletion, etc.).