# Standardized catch rates of yellowtail snapper (Ocyurus chrysurus) from the Marine Recreational Fisheries Statistics Survey in south Florida, 1981-2010 

## Introduction

Yellowtail snapper are caught by recreational anglers primarily in south Florida from Palm Beach County on the east coast to Monroe County on the west coast. The Marine Recreational Fisheries Statistics Survey (MRFSS) was initiated in 1981 to collect catch, effort, and participation estimates from the recreational sector. MRFSS consists of a telephone survey of fishing effort and an access-site intercept survey of angler catch. Intercepts are conducted at public marine fishing access points (boat ramps, piers, beaches, marinas, etc.) to collect individual catch data including number of each species caught, number discarded, length, and weight. Access points are selected by a proportional random selection process in order to sample high activity sites most often. From these intercept data, catch per trip estimates can be made for each species encountered. These catch rates can provide an indication of population trends over time and are combined with the effort estimates from the telephone survey to produce total catch and harvest estimates. In 1991, MRFSS made several improvements to the survey and one of which was the linking together of separate intercepts of anglers that fished on the same trip and recording the total number of anglers in the party.

## Methods

## Data Preparation

To generate a standardized MRFSS catch rate, I used intercepts made during wave 2, 1981 through wave 6, 2010 on both coasts of Florida where the fishing mode was either private/rental or charter boat. Prior to 1986, headboat and charterboat intercepts were combined into a single fishing mode, however we excluded the headboat interviews by using the mode_f variable. Type 4 records were used to collapse ancillary intercepts into the appropriate type 1 fishing trip for years prior to 1991. All inland trips were excluded as well as any species that were observed in at least $1 \%$ of total trips. These constraints resulted in 124,998 recreational fishing trips, of which 7,159 caught yellowtail snapper.

## Data Subsetting

Of the 124,998 intercepts made from 1981 through 2010, some of these did not occur in areas where yellowtail snapper occur and should therefore be removed from the standardization process. To subset for trips likely to have caught yellowtail snapper, I used the clustering technique of Shertzer and Williams (2008) to identify species that co-occur with yellowtail snapper. To do this, I performed hierarchical cluster analysis with average linkage on the BrayCurtis similarity measure calculated on the square-root transformed catch data (total number of fish). Because choosing the appropriate number of clusters can be somewhat subjective, I plotted the number of clusters against the average distance between clusters (height) and used a piecewise regression with one breakpoint to determine the inflection point of the plot (Figure 1). The inflection point was chosen as that with the lowest residual mean square error, and at this point little information is gained from adding additional clusters. Eleven clusters were identified using this method with yellowtail snapper clustering with mutton snapper, blue runner, lane snapper, gray snapper, cero mackerel, black grouper, and grunts (Figure 2). This cluster can be considered a southern assemblage and is very similar to that revealed by Shertzer and Williams
(2008). After removing all trips that did not capture one of these species, 29,485 intercepts remained.

## Response and Explanatory Variables

After subsetting and prior to standardization, only trips occurring in either Monroe, Dade, Broward, or Palm Beach counties were retained as these counties account for nearly $98 \%$ of the catch and is considered to be encompass the center of yellowtail snapper's distribution. Records where hours fished, number of contributors, or days fished in previous wave (avidity) were not available were also removed. Finally, I removed any records with high leverage, calculated as that which is above a critical value determined by $2 * p / n$ where $p$ is the number of potential parameters in the model. The filtered dataset used in standardization consisted of 15,026 trips, of which 6,574 captured yellowtail snapper.

CPUE - The response variable is the total number of yellowtail snapper caught on a trip (A + B1 +B2). There were many trips which captured no yellowtail snapper and those that did usually caught less than 10 (Figure 3).

AREA - The MRFSS variable area_x was combined into two categories, inshore and offshore. There were 8,096 trip in the inshore area and 6,930 offshore trips. Mean CPUE was similar for both areas up until 1999 when CPUE for inshore trips became consistently lower than offshore trips indicating a potential year*area interaction (Figure 4a).

HOURS FISHED - Hours fished was combined into 6 levels (lower number is inclusive in group): 0-2, 2-4, 4-6, 6-8, 8-10, 10-12, and 12+. Most trips ( 5,377 ) fished for $4-6$ hrs followed by $2-4$ hrs $(4,660)$ and $6-8$ hrs $(3,286)$. Mean CPUE is fairly constant across all categories of hours fished and there appears to be no interaction with year (Figure 4b).

CONTRIBUTORS - The number of contributors to an intercept was combined into 7 groups, 17+. The number of intercepts declined with the number of contributors. As expected, CPUE appears to increase with the number of contributors and there is no apparent year*contributors interaction (Figure 4c).

AVIDITY - Avidity was created as the number of days fished within last 2 months as a factor with 7 levels (lower number is inclusive in group): 0-5, 5-10, 10-15, 15-20, 20-25, 25-30, 30+. The number of intercepts generally was less with increasing avidity. CPUE is similar across all avidity levels and years (Figure 4d).

COUNTY - As mentioned above, four counties were used in the analysis: Monroe, Dade, Broward, and Palm Beach. Monroe County had the most number of intercepts $(7,890)$ followed by Palm Beach $(4,003)$, Dade $(2078)$, and Broward counties $(1,055)$. Mean CPUE is higher in Monroe county than other counties, with mean CPUE in the other counties relatively equal but the trend in CPUE appears to be similar for all counties over time (Figure 4e).

MODE - Fishing mode was either charter boat or private/rental boat. There were more intercepts of the private/rental mode $(8,939)$ than charter boat mode. CPUE was similar in both
fishing modes up until 1997 when CPUE began to trend higher for charter boats than private/rental modes (Figure 4f).

WAVE - Two month wave were included in the analysis and the number of intercepts was fairly uniform across waves. Mean CPUE appears to similar over time across all waves (Figure 4g).

## Standardization

CPUE was modeled using the delta-glm approach (Dick 2004; Lo et al. 1992; Maunder and Punt 2004) with R code provided by the SEFSC. This approach calculates an index as the product of the indices from binomial (presence/absence) and positive submodels. In this particular program, the response variable in the positive submodel can be defined by either lognormal or gamma distribution. To determine which distribution best described the data, I used the 'fitdistr' function of the MASS package in R to fit CPUE to the lognormal and gamma distributions (Figure 5). Positive CPUE of yellowtail snapper was described better by the lognormal distribution based on an improvement in AIC of 724 units. For both the positive and binomial submodels, explanatory variables were selected using stepwise forward selection based on AIC where $\mathrm{k}=\log (\mathrm{n})$ rather than 2 . This is thought to be more conservative than genuine AIC, especially when $n$ is large, and usually retains only the variables that explain a large portion of the deviance. The final positive submodel included the terms year, county, and contributors (Table 1Table 2) while the binomial submodel included year, contributors, county, wave, mode, and area (Table 3Table 4). The least squared means for the year factor from each model were multiplied together with a bias correction applied to the positive CPUE to account for transformation of the response variable from log space back to CPUE.

## Results

To evaluate residuals of the binomial model randomization was introduced to produce continuous normal residuals using the 'qres.binom' function of the 'statmod' package in R. Randomized quantile residuals for the binomial submodel were normally distributed and showed no pattern across predictor variables (Figure 6). Residuals from the positive submodel were also normal with no pattern across predictor variables (Figure 7). Diagnostic plots of the positive submodel indicate that residuals are normally distribution and exhibit no pattern, variance is homoscedastic, and there are no influential outliers in the dataset (Figure 8). The observed annual mean CPUE, modeled CPUE, and proportion of trips positive is provided in Table 5 and plotted in Figures 9-10.

## References

Shertzer, K. W., and E. H. Williams. 2008. Fish assemblages and indicator species: reef fishes off the southeastern United States. Fishery Bulletin 106:257-269.

Table 1. Model selection steps for the positive submodel. The final model consists of year, county, and contributors.

| Variable | Df | Deviance | AIC |
| :--- | :---: | :---: | :---: |
| log(response) ~ year |  |  | $\mathbf{1 9 8 4 1}$ |
| cnty | 3 | 7286 | 19262 |
| cntrbtrs2 | 6 | 7263 | 19272 |
| mode_fx | 1 | 7660 | 19563 |
| area2 | 1 | 7850 | 19719 |
| none> |  | 8014 | 19841 |
| wave | 5 | 7957 | 19844 |
| hrsf2 | 6 | 7947 | 19846 |
| avidity | 6 | 7999 | 19887 |
| log(response) ~ year + cnty |  |  | $\mathbf{1 9 2 6 2}$ |
| cntrbtrs2 | 6 | 6770 | 18852 |
| mode_fx | 1 | 7210 | 19206 |
| area2 | 1 | 7269 | 19257 |
| none> |  | 7286 | 19262 |
| hrsf2 | 6 | 7244 | 19284 |
| wave | 5 | 7275 | 19302 |
| avidity | 6 | 7270 | 19307 |
| log(response) $\sim$ ~ year + cnty + cntrbtrs2 |  |  | $\mathbf{1 8 8 5 2}$ |
| <none> |  | 6770 | 18852 |
| area2 | 1 | 6768 | 18860 |
| mode_fx | 1 | 6769 | 18861 |
| avidity | 6 | 6738 | 18880 |
| hrsf2 | 6 | 6745 | 18887 |
| wave | 5 | 6758 | 18889 |

Table 2. Deviance table for final positive submodel.

|  | Resid. |  |  |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Var | Df | Deviance | Df | Resid. Dev | P(>\|Chi|) | PercDevExp |  |
| NULL | NA | NA |  | 6374 | 8282 | NA | NA |
| year | 29 | 269 | 6345 | 8014 | $2.82 \mathrm{E}-37$ |  |  |
| cnty | 3 | 728 | 6342 | 7286 | $2.16 \mathrm{E}-147$ | 48.13 |  |
| cntrbtrs2 | 6 | 516 | 6336 | 6769 | $3.73 \mathrm{E}-101$ | 34.12 |  |

Table 3. Model selection steps for the binomial submodel. The final model consists of year, county, and contributors.

| Variable | Df | Deviance | AIC |
| :---: | :---: | :---: | :---: |
| $\log ($ response) ~ year |  |  | 20601 |
| cntrbtrs2 | 6 | 19714 | 20061 |
| cnty | 3 | 20006 | 20324 |
| mode_fx | 1 | 20206 | 20504 |
| area2 | 1 | 20230 | 20529 |
| wave | 5 | 20251 | 20588 |
| hrsf2 | 6 | 20242 | 20589 |
| none> |  | 20312 | 20601 |
| avidity | 6 | 20301 | 20648 |
| response ~ year + cntrbtrs2 |  |  | 20061 |
| cnty | 3 | 19569 | 19945 |
| area2 | 1 | 19690 | 20046 |
| wave | 5 | 19655 | 20050 |
| <none> |  | 19714 | 20061 |
| mode_fx | 1 | 19713 | 20070 |
| hrsf2 | 6 | 19681 | 20085 |
| avidity | 6 | 19706 | 20110 |
| response ~ year + cntrbtrs2 + cnty |  |  | 19945 |
| wave | 5 | 19500 | 19924 |
| mode_fx | 1 | 19546 | 19931 |
| <none> |  | 19569 | 19945 |
| area2 | 1 | 19563 | 19948 |
| hrsf2 | 6 | 19534 | 19968 |
| avidity | 6 | 19551 | 19984 |
| response ~ year + cntrbtrs2 + cnty + wave |  |  | 19924 |
| mode_fx | 1 | 19476 | 19910 |
| <none> |  | 19500 | 19924 |
| area2 | 1 | 19494 | 19928 |
| hrsf2 | 6 | 19465 | 19947 |
| avidity | 6 | 19482 | 19964 |
| response $\sim$ year + cntrbtrs2 + cnty + wave + mode_fx |  |  | 19910 |
| area2 | 1 | 19463 | 19906 |
| <none> |  | 19476 | 19910 |
| hrsf2 | 6 | 19439 | 19930 |
| avidity | 6 | 19466 | 19957 |
| response $\sim$ year + cntrbtrs2 + cnty + wave + mode_fx + area2 |  |  | 19906 |
| <none> |  | 19463 | 19906 |
| hrsf2 | 6 | 19429 | 19930 |
| avidity | 6 | 19453 | 19954 |

Table 4. Deviance table for final binomial submodel.

| Variable | Df | Deviance | Resid. Df | Resid. Dev | P( $>\mid$ Chi $\mid$ ) | PercDevExp |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| NULL | NA | NA |  | 15025 | 20484 | NA |
| year | 29 | 173 | 14996 | 20312 | $2.27 \mathrm{E}-22$ |  |
| cntrbtrs2 | 6 | 597 | 14990 | 19714 | $8.19 \mathrm{E}-126$ | 16.90 |
| cnty | 3 | 145 | 14987 | 19569 | $3.21 \mathrm{E}-31$ | 14.49 |
| wave | 5 | 69 | 14982 | 19500 | $1.33 \mathrm{E}-13$ | 6.80 |
| mode_fx | 1 | 23 | 14981 | 19476 | $1.28 \mathrm{E}-06$ | 2.30 |
| area2 | 1 | 14 | 14980 | 19463 | $2.31 \mathrm{E}-04$ | 1.33 |

Table 5. Nominal mean CPUE and final modeled index.

| Year | Nominal <br> CPUE | $\mathbf{N}$ | Proportion <br> Positive | Index | Index |
| :---: | :---: | ---: | ---: | :---: | :---: |
| 1981 | 4.109 | 92 | 0.500 | 3.901 | 0.150 |
| 1982 | 2.722 | 194 | 0.402 | 3.675 | 0.196 |
| 1983 | 1.771 | 131 | 0.328 | 2.960 | 0.161 |
| 1984 | 1.910 | 189 | 0.402 | 3.307 | 0.199 |
| 1985 | 1.422 | 135 | 0.281 | 2.627 | 0.159 |
| 1986 | 1.788 | 231 | 0.346 | 3.525 | 0.132 |
| 1987 | 2.067 | 372 | 0.336 | 2.786 | 0.142 |
| 1988 | 2.328 | 293 | 0.392 | 3.809 | 0.145 |
| 1989 | 2.154 | 267 | 0.318 | 3.787 | 0.131 |
| 1990 | 2.227 | 256 | 0.551 | 4.587 | 0.112 |
| 1991 | 4.892 | 278 | 0.518 | 7.183 | 0.094 |
| 1992 | 3.264 | 550 | 0.522 | 6.113 | 0.097 |
| 1993 | 3.210 | 499 | 0.473 | 4.819 | 0.106 |
| 1994 | 3.265 | 423 | 0.487 | 4.578 | 0.121 |
| 1995 | 3.572 | 339 | 0.407 | 5.179 | 0.117 |
| 1996 | 3.332 | 404 | 0.455 | 4.048 | 0.120 |
| 1997 | 4.085 | 424 | 0.394 | 4.408 | 0.118 |
| 1998 | 4.203 | 536 | 0.384 | 4.066 | 0.105 |
| 1999 | 3.477 | 792 | 0.365 | 4.397 | 0.106 |
| 2000 | 3.308 | 672 | 0.408 | 4.016 | 0.108 |
| 2001 | 3.977 | 665 | 0.350 | 4.168 | 0.104 |
| 2002 | 3.568 | 911 | 0.393 | 3.710 | 0.100 |
| 2003 | 3.956 | 895 | 0.397 | 4.407 | 0.099 |
| 2004 | 4.048 | 831 | 0.432 | 5.125 | 0.096 |
| 2005 | 4.392 | 738 | 0.466 | 5.325 | 0.094 |
| 2006 | 4.010 | 762 | 0.454 | 5.296 | 0.090 |
| 2007 | 4.386 | 888 | 0.453 | 5.436 | 0.090 |
| 2008 | 4.296 | 948 | 0.465 | 4.797 | 0.100 |
| 2009 | 3.164 | 623 | 0.424 | 4.284 | 0.099 |
| 2010 | 4.792 | 688 | 0.458 | 5.140 | 0.195 |
|  |  |  |  |  |  |

## Scree Plot for MRFSS Cluster Analysis



Figure 1. Plot of number of clusters against height from the hierarchical cluster analysis, where height is the average dissimilarity among species in a cluster with 1 being most similar. Included are the piecewise regression lines (solid line) using a breakpoint (dashed vertical line) that minimized the residual mean square error.

## Dendrogram for MRFSS Cluster Analysis



Species
(sqrt trans, bray similarity, average linkage)
Figure 2. Dendrogram from hierarchical cluster analysis of species in the MRFSS data. Height measures the average dissimilarity among species within a branch with a value of 1 being most similar. Yellowtail snapper is represented as 'target' in this plot.

## Yellowtail Snapper MRFSS CPUE (all trips)



Yellowtail Snapper MRFSS CPUE (pos trips only)


Figure 3. Distribution of CPUE of yellowtail snapper from MRFSS for all trips and positive trips only after applying filters and subsettings.


Figure 4. Interaction plots of year and each predictor variable on CPUE.

## Histogram of d1_pos



Figure 5. Fit of CPUE to the gamma and lognormal distributions.

## Randomized Quantile Residuals for Binomial Model



Figure 6. Standardized residuals for the binomial submodel.

## Standardized Residuals for Positive Model



Figure 7. Standardized residuals for the positive submodel.

## Diagnostic Plots of Positive Submodel



Figure 8. Diagnostic plots for the positive submodel.

Modeled and Observed CPUE index with $95 \% \mathrm{Cl}$


Figure 9. Modeled and observed CPUE, scaled to mean = 1, of yellowtail snapper from MRFSS data.

## Modeled and Observed CPUE index with $95 \% \mathrm{Cl}$



Figure 10. Modeled and observed CPUE (number of fish per trip) of yellowtail snapper from the MRFSS data.

