



Ciguatera Fish Poisoning in Florida

Motti Goldberger and
University of Maryland

Christopher Ryzowicz
New College of Florida



Order of Topics

1. Overview of Ciguatera Fish Poisoning (CFP)
2. Hypotheses
3. Variables/data collection
4. Modeling Strategy
5. Results/Analysis
6. Conclusion

Transfer of Ciguatoxin

- Ciguatoxin (CTXs) bioaccumulates up the food chain (Barrett, 2014)

Dinoflagellates → Herbivorous Fish → Carnivorous fish → Human





Significance for Studying CFP

- Ciguatera cases have steadily been increasing in Florida
 - Climate factors: Tropical Storms, SST, Heat stress?

- Economic factors
 - Reduction in fish sales/loss of jobs
 - Reduced tourism and recreational fishing
 - Medical costs

Symptoms/Treatments

- Approximately 50,000-500,000 cases annually worldwide (Fleming et al. 1998)
- Symptoms: nausea, itching, vomiting, fatigue, paralysis, and tachycardia
- Treatment: IV Mannitol, emetics, or self-healing (Human Immune System)





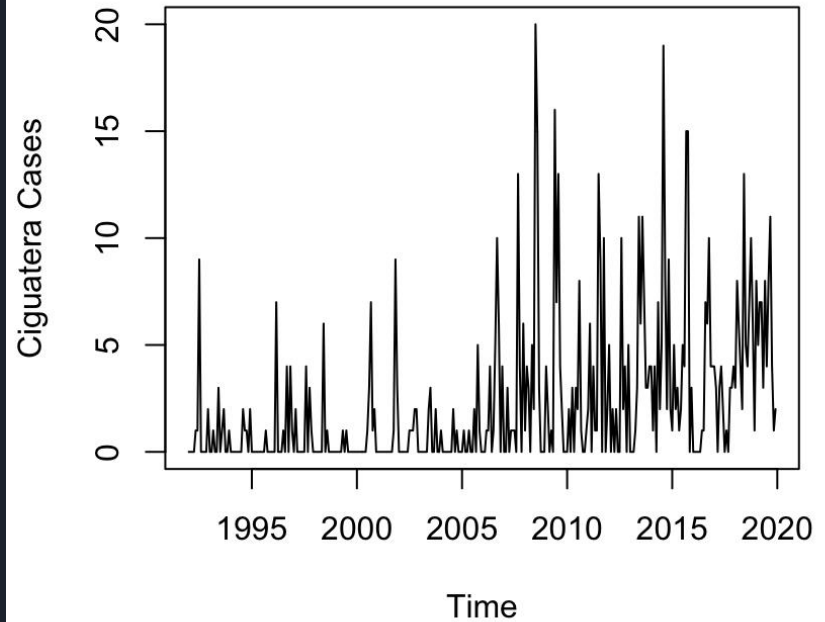
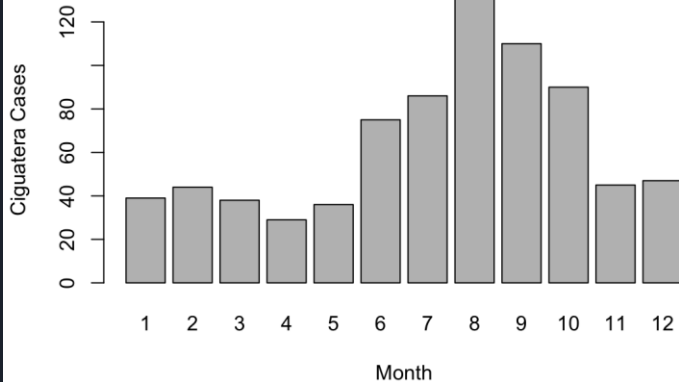
Hypotheses

- **Sea surface temperature** in southern Florida has a positive relationship with CFP cases in Florida
- **Fish landings** in Florida have a positive relationship with CFP cases in Florida
- **Heat stress** in southern Florida has a positive relationship with CFP cases in Florida
- **Tropical storm intensity** in southern Florida has a positive relationship with CFP cases in Florida

Ciguatera Fish Poisoning (CFP) Data

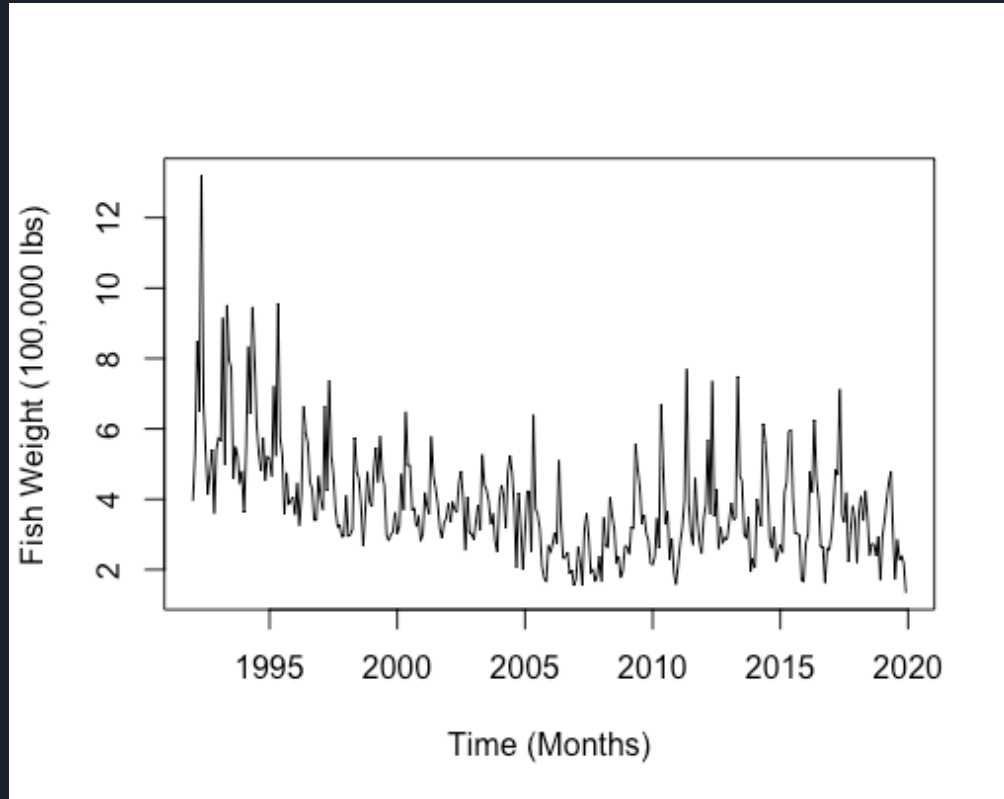
- Collected from Florida Department of Health Disease Reports
- Monthly CFP calls in Florida from 1992-2019
- Over 150 months that reported zero cases
- Our response variable

Histogram of total number of CFP each month



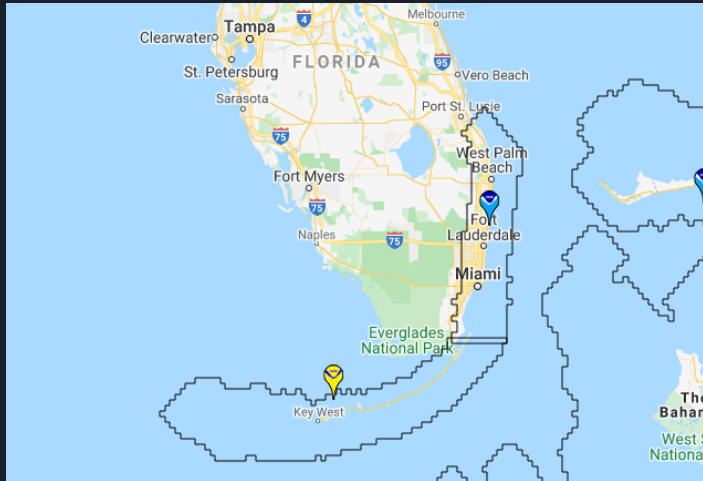
Commercial Fish Landings

- From Florida Fish and Wildlife Conservation Commission landings summaries
- Monthly weights in pounds of 8 species connected to the ciguatoxin
- Summed 8 fish weights each month

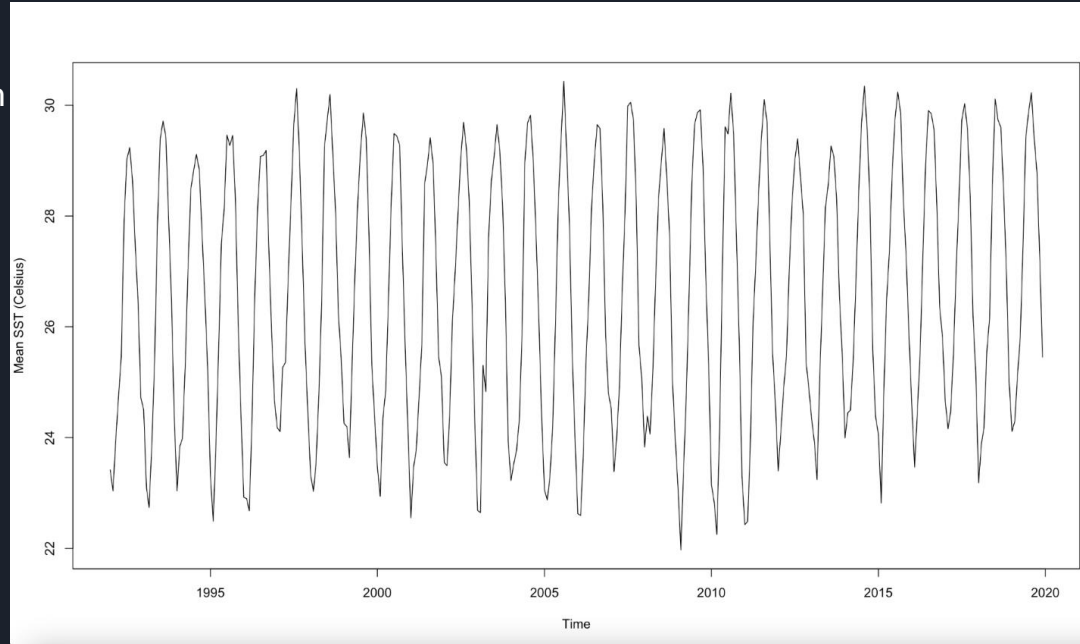


Mean Sea Surface Temperature (SST)

- Collected from 2 virtual stations in the Florida Keys by the NOAA Coral Reef Watch
- Averaged values for every month, then averaged the 2 stations



Mean SST (°C)

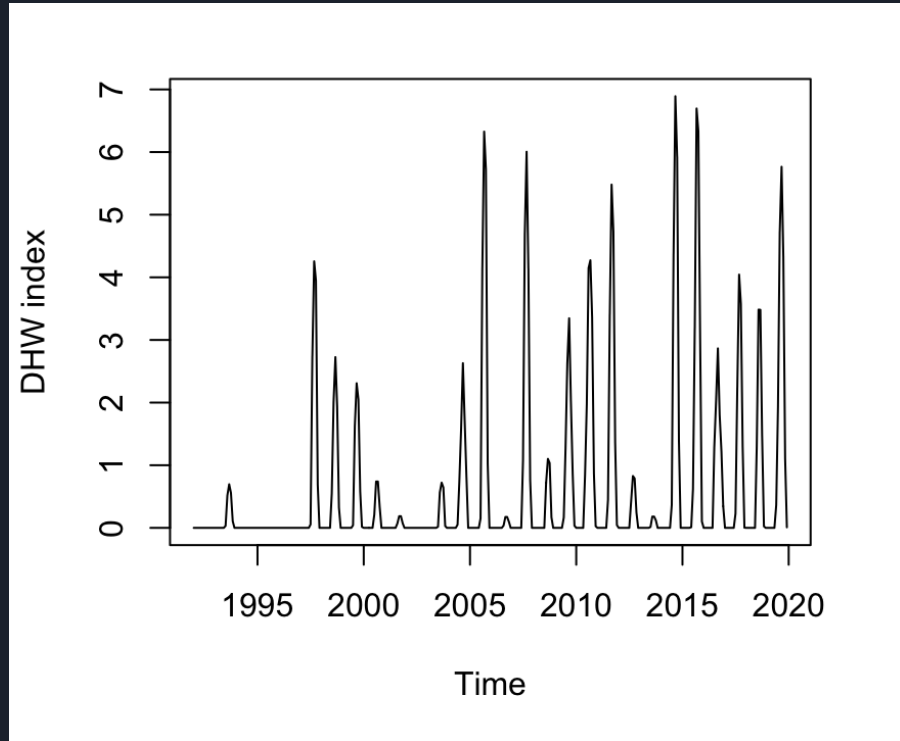


Time

Degree Heating Week (DHW) Index

- Also from NOAA Coral Reef Watch virtual stations
- Measure of accumulated heat stress for coral reefs
- Calculated based on previous 12 weeks HotSpot values

$$DHW_i = \sum_{j=i-83}^i \left(\frac{HS_j}{7} \right), \text{ where } HS_j \geq 1$$



Impact Area and Wind Swaths

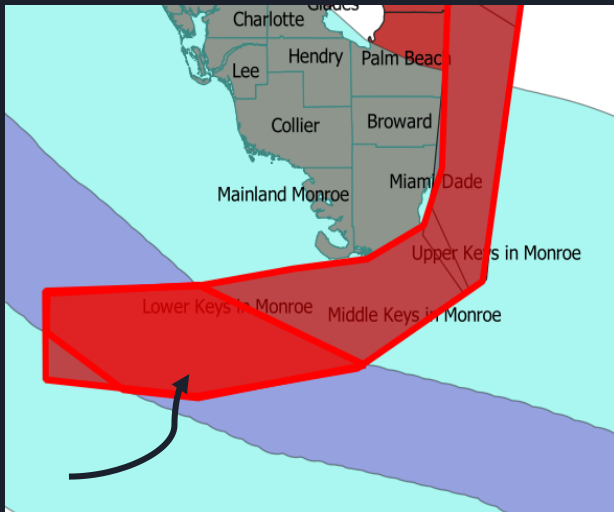
Wind Speed (WS) Classification:

0 if $WS \in [0,34]$ knots

1 if $WS \in (34,50]$ knots

2 if $WS \in (50,64]$ knots

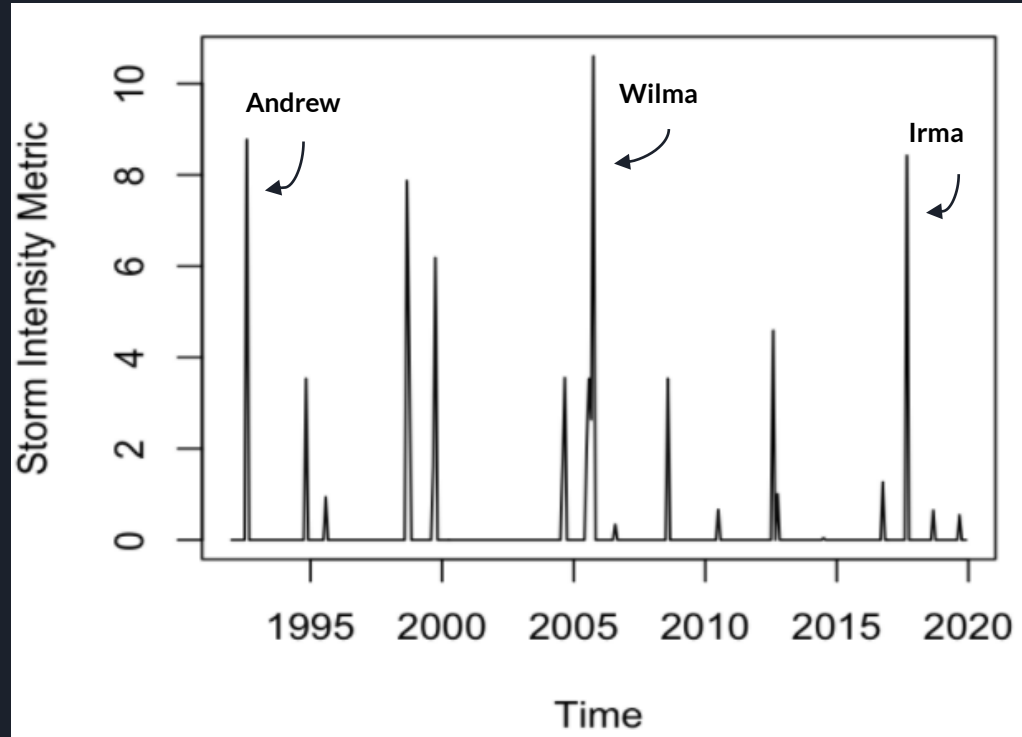
3 if $WS \in (64, \infty)$ knots



Tropical Storm Intensity Metric

- Collected wind swath from National Hurricane Center (NHC) of 24 tropical storms that hit our buffer area
- Based off a linear combination of wind swath area and wind intensity category

$$\text{Storm Intensity} = \sum_{i=0}^3 (i \cdot \text{Intersection Area}_i)$$





Modeling CFP

- Predictor Variables

- Storm Intensity
- DHW Index
- MeanSST
- Fish Landings

- Models

- Multi-Linear
 - Residuals are non-normal
 - Heteroscedasticity exists
- Poisson
 - Mean CFP per month = 2.217
 - Variance CFP per month = 11.96
- Negative Binomial
- Zero Inflated Negative Binomial
 - Zero Inflated Model
 - Count Model based on Zero Inflated Model

- Lag

- Is there a lag between the variables and their effect on CFP?



Best Negative Binomial Model

AIC = 1235.8

Sum of Residuals = 718.91

Predictors	Coefficients	P-Values
MeanSST	0.53	< .001
Storm Intensity	-0.78	.0095
Fish Weight	-0.56	< .001
Storm Intensity*Fish Weight	-0.63	.021

* Denotes interaction between variables



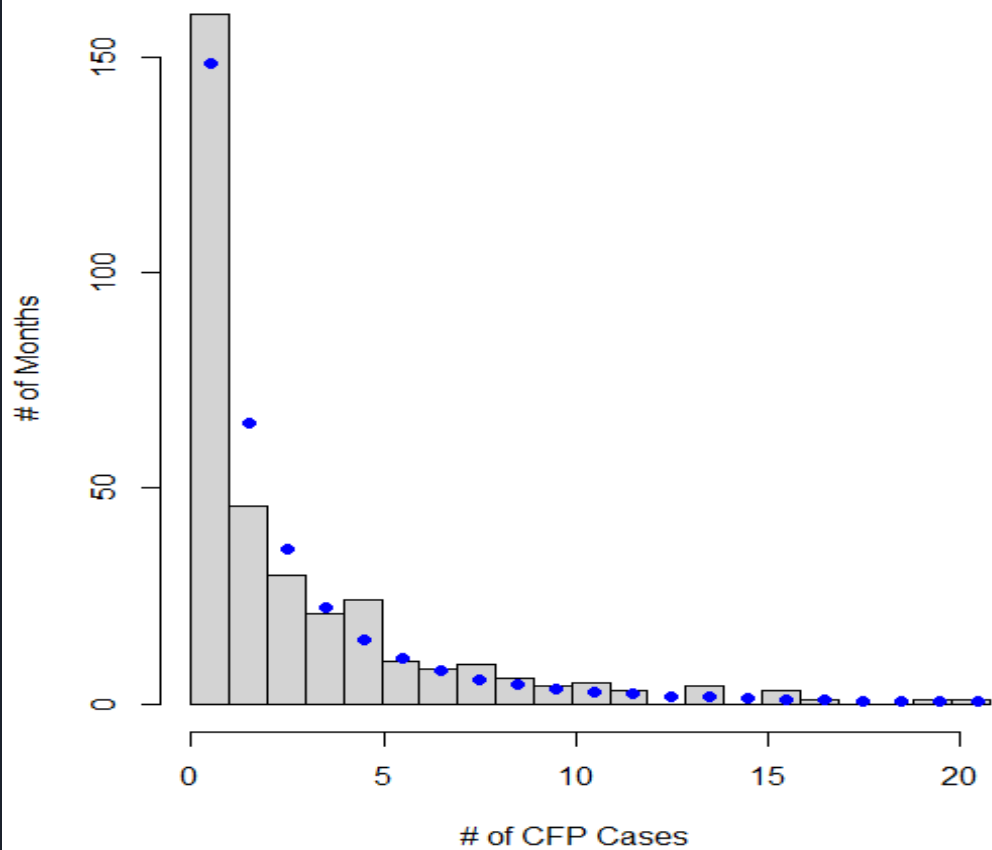
Best Negative Binomial Model with MonthNum

AIC = 1184.435

Sum of Residuals = 643.520

Predictors	Coefficients	P-Values
MonthNum	0.657	<.001
MeanSST	0.50	< .001
Storm Intensity	-0.63	.0349
Fish Weight	-0.27	.0143
Storm Intensity*Fish Weight	-0.54	.0420

Histogram of CFP with NegBin Model Expected Value



Best Zero Inflated Negative Binomial Model

AIC = 1223.526

Sum of Residuals = 704.43

	Predictors	Coefficient	P-Value
Count Model			
	Fish Landings	-0.610	< .001
	MeanSST	0.310	< .001
	Storm Intensity	-0.937	.003
	DHW*Storm Intensity	-0.180	0.014
	Storm Intensity*Fish Weight	-1.16	.002
Zero Inflated Model			
	MeanSST	-0.71	.0015

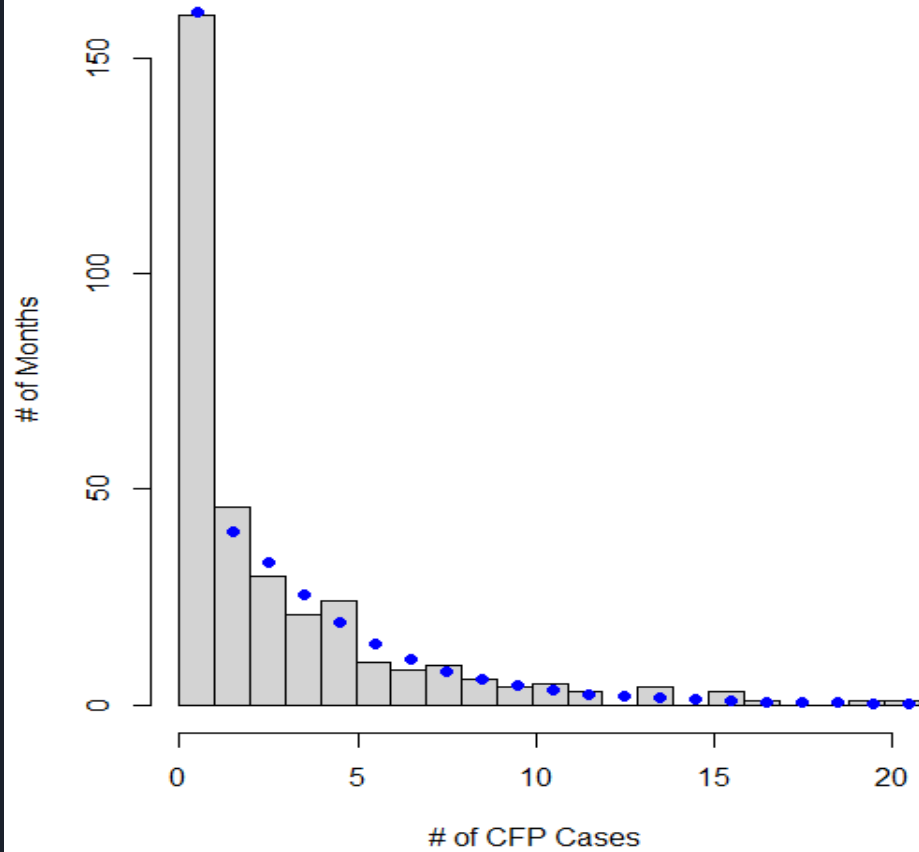
Best Zero Inflated Negative Binomial Model with MonthNum

AIC: 1163.066

Sum of Residuals = 616.297

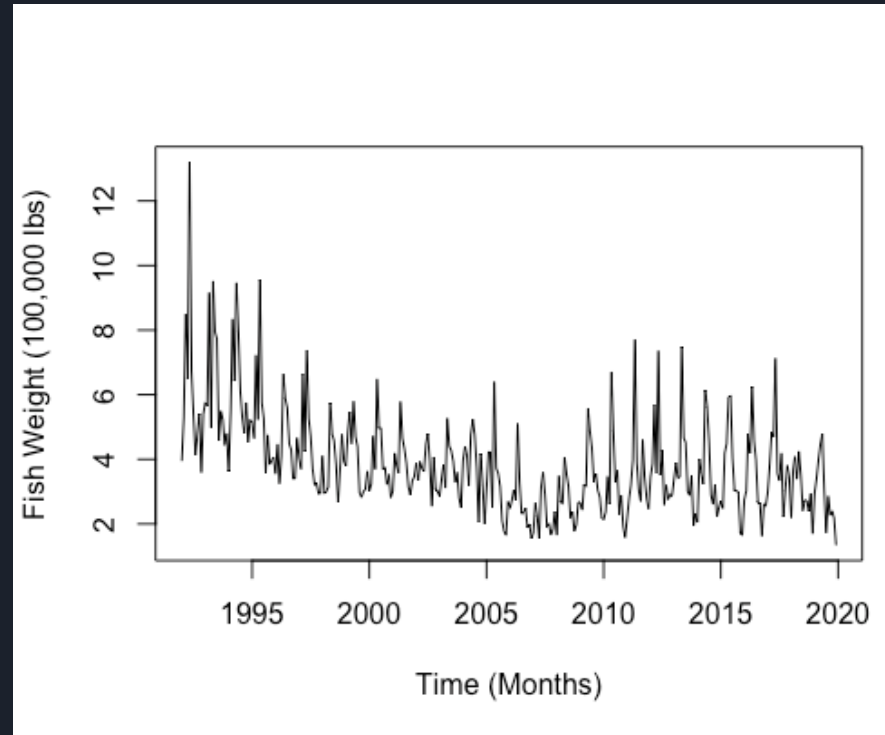
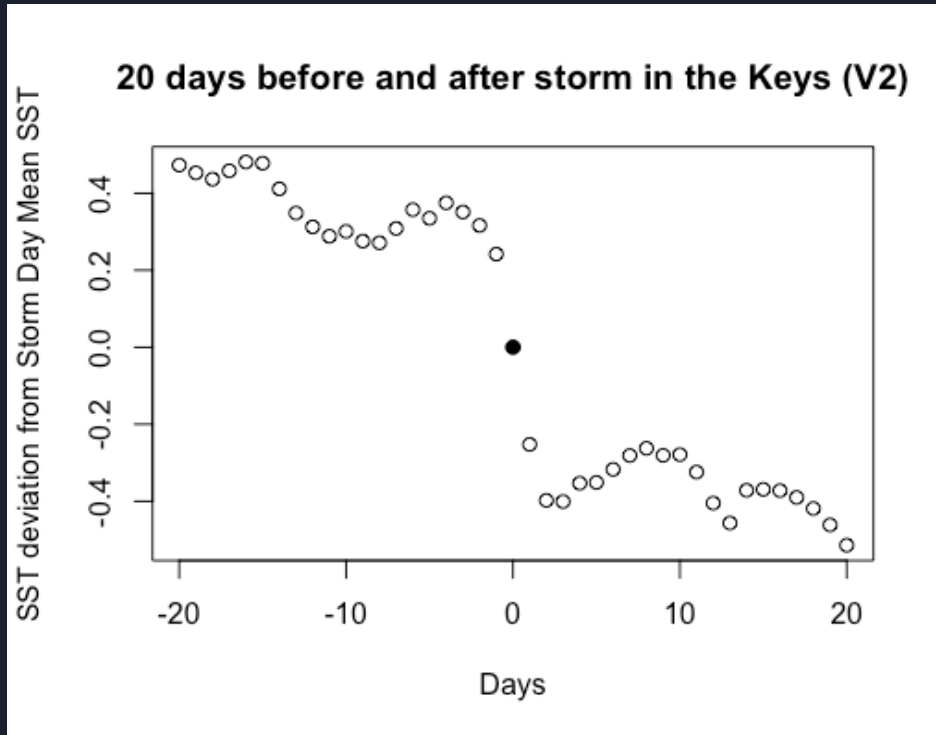
	Predictors	Coefficient	P-Value
Count Model			
	MonthNum	0.348	<.001
	MeanSST	0.295	<.001
	Storm Intensity	-0.36	<.001
	Fish Weight	-0.803	.0141
	Storm Intensity*DHW Index	-0.165	.0121
	Storm Intensity*Fish Weight	-1.05	.004
Zero Inflated Model			
	MonthNum	-1.003	<.001
	MeanSST	-0.638	<.001

Histogram of CFP with ZeroInf NegBin Model EV



Analysis of Variable Coefficients

- Storm Intensity has a negative coefficient
- Fish Landings has a negative Coefficient





Conclusions

- MeanSST has a strong positive relationship with CFP
- Storm Intensity has a negative relationship with CFP
- Our ZINB is the best model we found and can predict a PMF of the # of CFP in a given month
- Confounding factors that are not in our model could contribute to the increase in CFP cases since 1992



Research Team

Faculty Advisors -

Professor Michael Splitt - College of Aeronautics

Dr. Nezamoddini-Kachouie - Dept. of Mathematical Sciences

Dr. Van Woesik - Dept. of Engineering and Marine Science

Graduate Assistant -

Dan Breininger - Dept. of Mathematical Sciences



References

1. Ault, J.S., Smith, S.G. and Bohnsack, J.A., 2005. Evaluation of average length as an estimator of exploitation status for the Florida coral-reef fish community. *ICES Journal of marine Science*, 62(3), pp.417-423.
2. Barrett, J.R., 2014. Under the weather with ciguatera fish poisoning: Climate variables associated with increases in suspected cases.
3. Chinain, M., Gatti, C.M.I., Darius, H.T., Quod, J.P. and Tester, P.A., 2020. Ciguatera poisonings: A global review of occurrences and trends. *Harmful Algae*, p.101873.
4. Fleming, L.E., 1998. Seafood toxin diseases: issues in epidemiology and community outreach. *Harmful algae*, pp.245-248.
5. Gingold, D.B., Strickland, M.J. and Hess, J.J., 2014. Ciguatera fish poisoning and climate change: analysis of National Poison Center data in the United States, 2001–2011. *Environmental Health Perspectives*, 122(6), pp.580-586.
6. Rongo, T. and van Woesik, R., 2013. The effects of natural disturbances, reef state, and herbivorous fish densities on ciguatera poisoning in Rarotonga, southern Cook Islands. *Toxicon*, 64, pp.87-95.



Questions?