# **Automated Recreational Fisheries** Monitoring : An Artificial Intelligence **Feasibility Study in Florida**

#### **Tiffanie Cross, Chloe Ramsay, Beverly Sauls**

Florida Fish and Wildlife Conservation Commission Fish and Wildlife Research Institute Marine Fisheries Research St. Petersburg, Florida





#### Outline

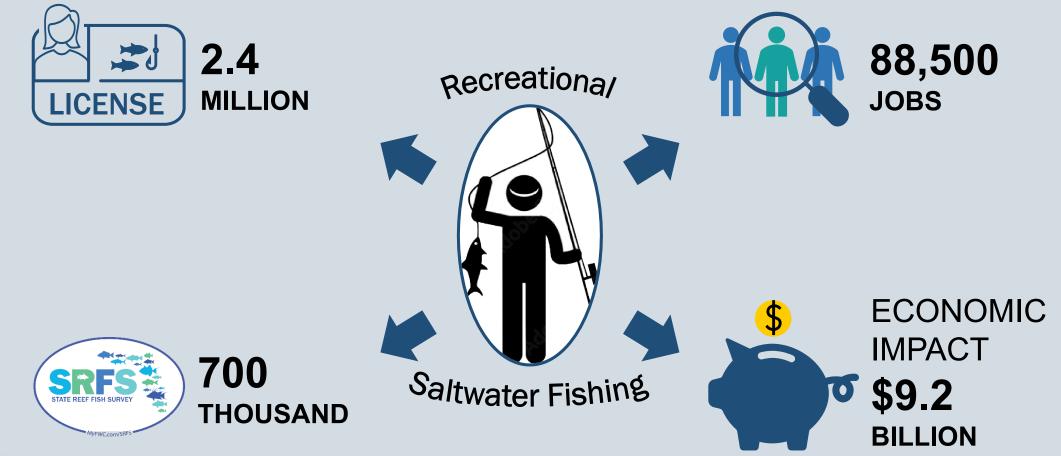
- Recreational Fishery Overview
- Current Monitoring Methods
- Camera-based Methods
- Machine Learning in Rec Fisheries
- Florida's Pilot Study
  - $\square$  Methods
  - □ Results
  - Lessons Learned
- Future Work







#### **Recreational Saltwater Fishing in Florida**



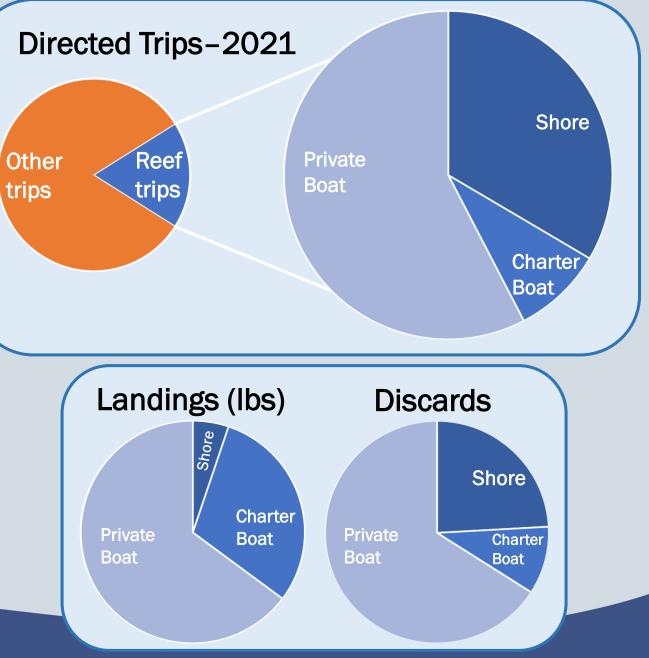


FWC FY 19/20 The Economic Impacts of Saltwater Fishing in Florida Southwick and Associates; American Sportfish Association

#### **Florida Recreational Reef Fish Fishery**

- Small proportion of trips
- Private boat mode
- Difficult to monitor
  - Pulse fisheries
  - High effort
  - High temporal and spatial variability
  - Dispersed over large area

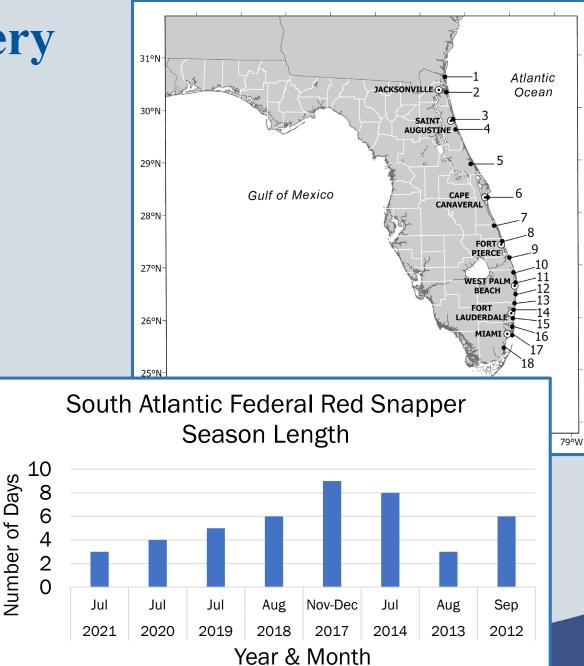
#### Reef fish trips are less frequently encountered in general surveys



#### **Recreational Reef Fish Fishery** in South Atlantic

- Offshore boat-based
- Distinct inlets
- Highly managed
  - South Atlantic Red Snapper
- Short seasons

General surveys not designed to monitor derby events precisely





# **Ongoing Monitoring**

- Surveys concurrent and overlapping
- All surveys have inherent sources of error and unknown bias

Need exists to validate accuracy of the estimates generated by these surveys



NOAA MRIP:

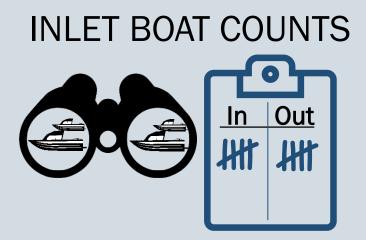
- Access Point Angler
   Intercept Survey
  - Fishing Effort Survey
  - For-Hire Survey FWC:
  - State Reef Fish Survey



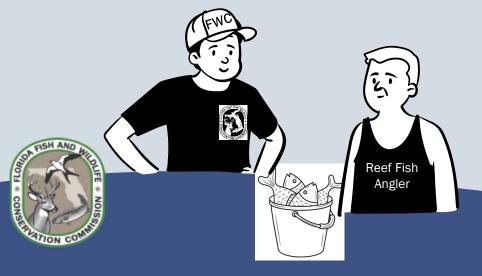
South Atlantic Survey FWC: • Atlantic Red Snapper In-Season Survey (Sauls et al. 2017)



#### **Atlantic Red Snapper In-Season Survey**



#### ANGLER INTERCEPTS



Produces precise estimates

landings and effort

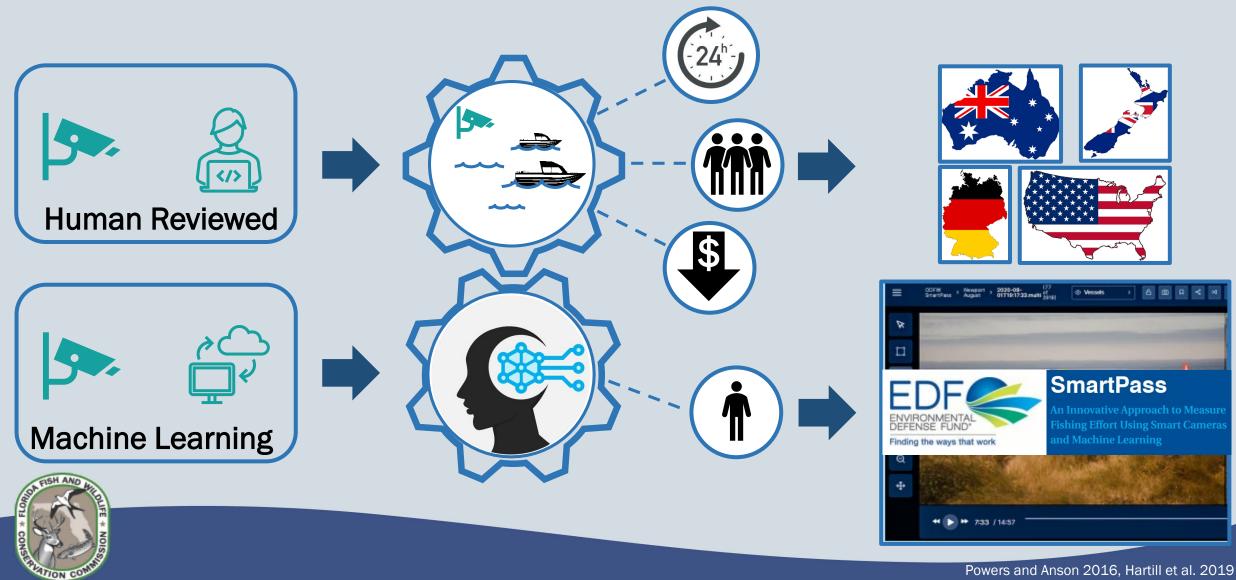


Need cost-efficient methods to scale this survey temporally and spatially

Sauls et al. 2017

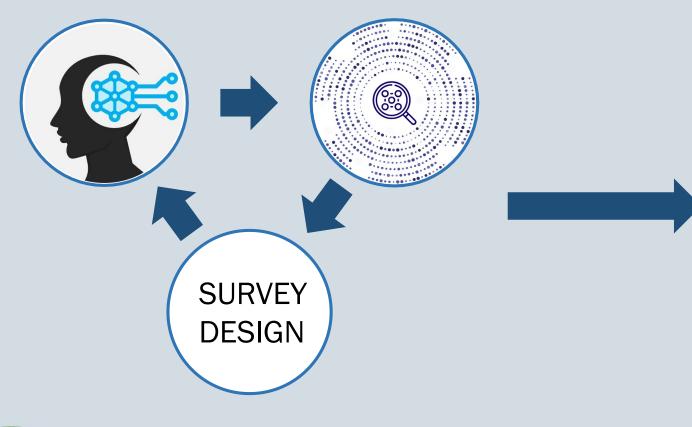
https://myfwc.com/research/saltwater/fishstats/srfs/atlanticredsnapper/

#### **Camera-based Recreational Fisheries Monitoring**



https://www.edf.org/sites/default/files/content/EDFSmartPass-whitepaper.pdf

#### Machine Learning in Recreational Fisheries Monitoring



- Near real-time counts
- Year-round, 24-hours
- Fill coverage gaps
- Improve cost efficiency
- Refine survey methods
- Increase precision
- Better understanding of fishery



# Florida's Pilot Study

- Florida's Atlantic coast
- Three (3) inlets
- Vary by:
  - Size, logistics, vessel traffic
- Contracted CVision AI

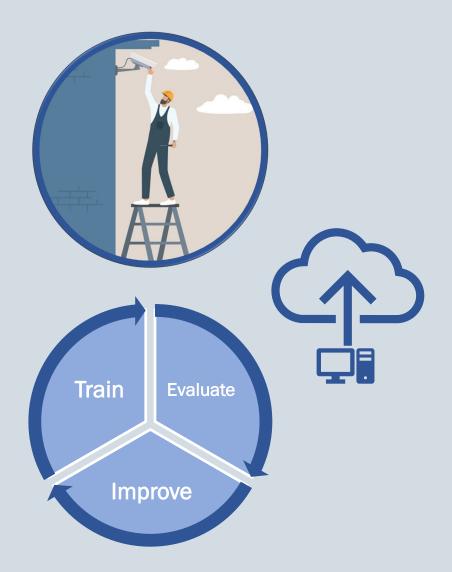
Test feasibility of using AI technology to continuously monitor recreational boating activity





## **Objectives – Year 1**

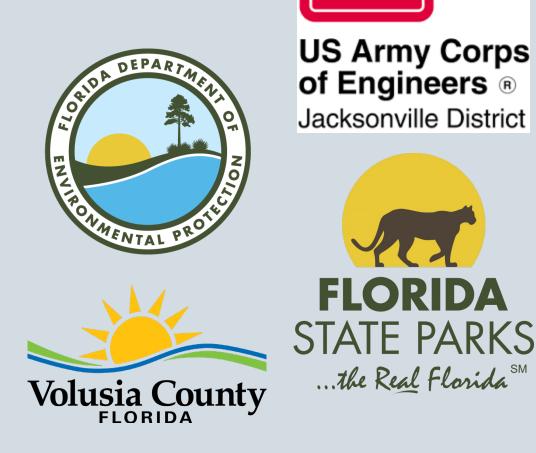
- Install vessel monitoring systems
  - Three sites
- Refine existing algorithms using video from Florida sites
- Detect, classify, track, and count vessels entering and exiting inlets
- Evaluate performance of algorithms vs. human observers





# **Logistical Considerations**

- Contracts with partner agencies
- Special Use Permits
- Agency-required restrictions
- Site characteristics
  - Electricity & internet/cellular network
  - Size (optics)
  - Ease of access
- Exposure to elements



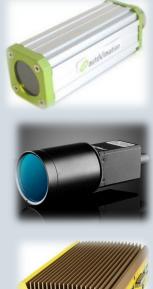
**US NAVY** 



#### Hardware

- Cameras
  - Lucid Technology 4k imaging sensors
- Rugged Intel-based dataloggers
  - DC capable for solar/battery
- 4G cellular antenna
- Waterproof housing
- Brackets & cables
- Lithium battery and charger











# **Cumberland Sound**

- January 2022
- Remote location
- Poor cellular connectivity
- Unreliable electricity
- Very large inlet
  - ~1.75 miles: cameras to jetty tips
- Military and cargo ships
- Borders Georgia





# Mayport

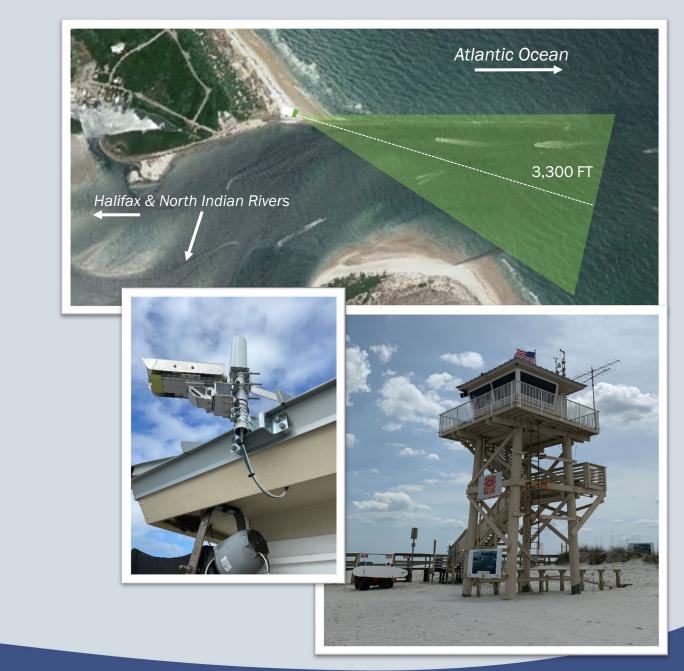
- May 2022
- U.S. Naval Station Mayport
- Restricted cellular network
  - Hard drive swaps
  - Manual upload to cloud
- Reliable electricity
- Large inlet
  - 1+ mile: camera to jetty tips
- Military and cargo ships





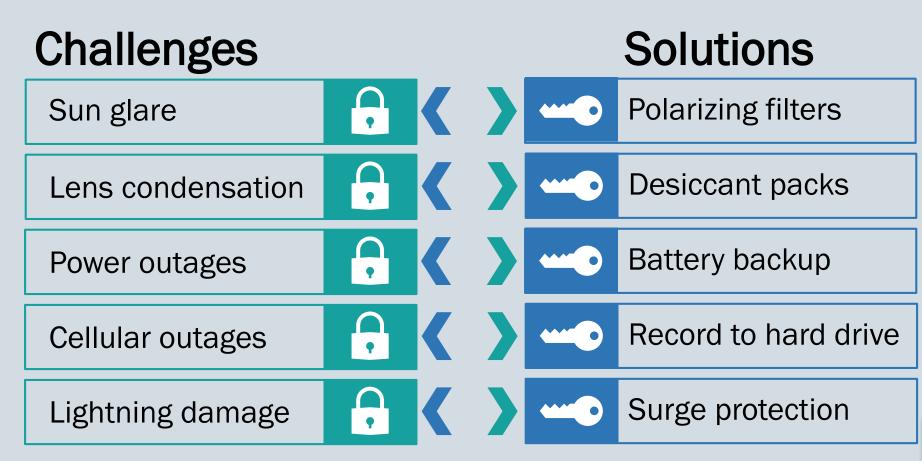
## **Ponce Inlet**

- December 2021
- Installation Contractor
- Strong cellular network
  - Upload to cloud
- Reliable electricity
- Medium-sized inlet
  - ~3,300 feet: camera to jetty tips
- Proximity to ocean/salt spray

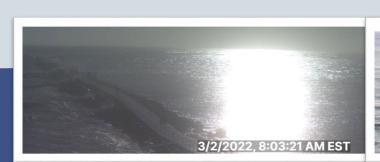




## **Speed Bumps Along the Way**











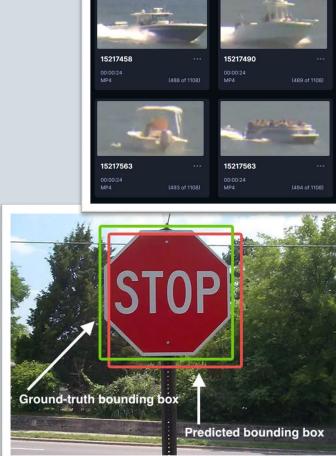


## **Machine Learning Algorithms**

- Vessel Detection
  - Utilized Yolov5 detection architecture
  - Vessel imagery across United States
- Measure Detection Accuracy
  - Intersection over Union (IoU)
- Vessel Tracking
  - Motion estimation filters



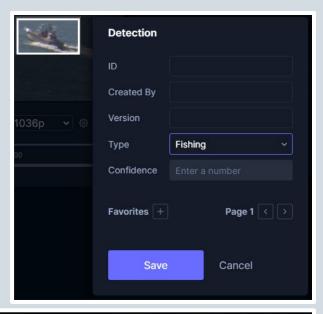


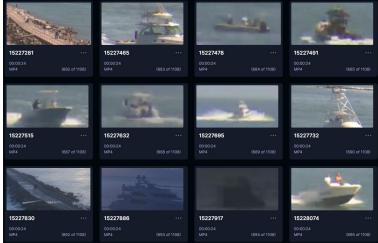


## **Algorithm Training & Development**

- Annotation
  - Draw boxes around boats
  - Assign "Type"
  - Creates "Ground Truth" dataset
- Iterative Process
  - Identify detection and tracking errors
  - More annotation
  - Rerun model
  - Rinse, repeat









## **Detection and Tracking Criteria**

Detections

Recreational Boats
Waves
Birds
People

#### Tracking

Travels at least 50% of channel
 Meets height-to-length ratio







## **Algorithm in Action**









# **Speed Bumps Along the Way**

- Large inlets and not enough zoom
- Recreational vessels too small to reliably count
  - Humans





### **Evaluate Algorithm Performance**

- Atlantic Red Snapper Season July 8<sup>th</sup> & 9<sup>th</sup>
- Ponce Inlet
- Algorithms
  - Detect, track, and classify vessels
- Human Observers
  - Real-time vessel counts

VS. Human-reviewed video aka "Truth Dataset"



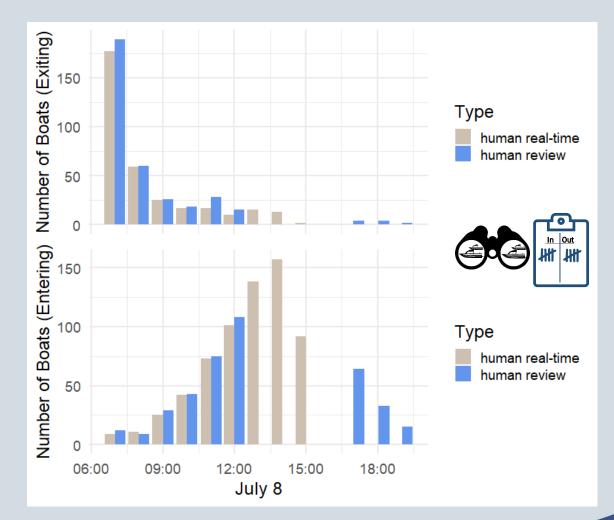


#### **Preliminary Results**

#### Human real-time VS. Human Review

- Real-time observers undercounted consistently
- Average error: 0.04 0.08

Number of Recreational Boats:	Exiting Inlet	Entering Inlet
Human Review	335	399
Human Real-time	310	382
Absolute Error	25	17
Average Error	0.044	0.078

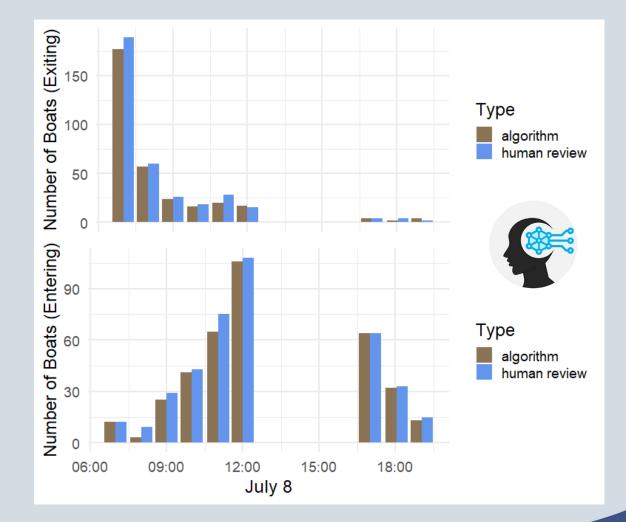




## **Preliminary Results**

- Algorithm VS. Human Review
  - Algorithm undercounted consistently
  - Average error: 0.07 0.10

Number of Recreational Boats:	Exiting Inlet	Entering Inlet
Human Review	1,023	1,064
Algorithm Estimate	928	995
Absolute Error	95	69
Average Error	0.097	0.067





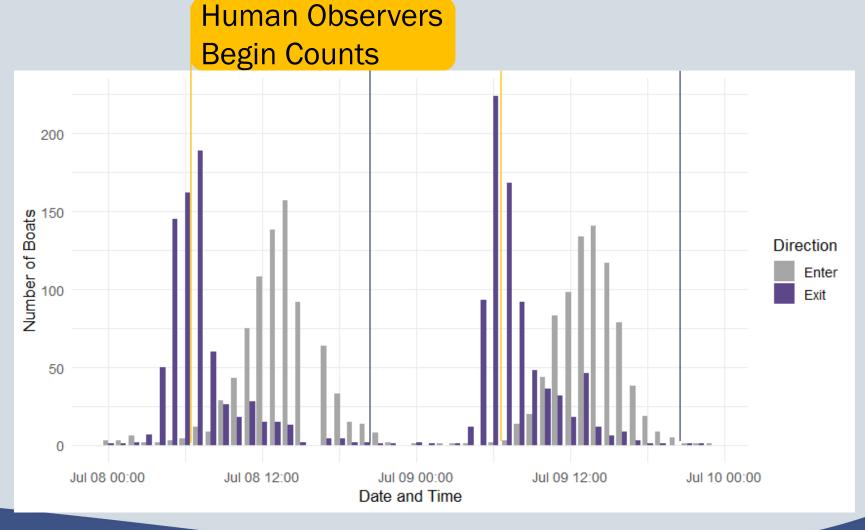
### **Preliminary Results**

#### Human Observers End Counts



- AM Peak Exiting
- PM Peak Entering

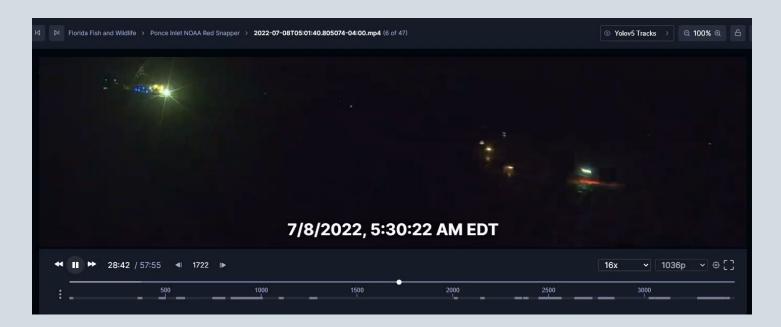
*Capture boat trips occurring outside of observer hours* 





## **Algorithm in Action – After Dark**

Tracked object Counted Tracked object Counted already •To be counted Untracked object Do not count





#### Looking Ahead – Year 2

- Optics Improvements
  - Fixed vs variable zoom
- Test cross-channel view
- Refine algorithms for night detection
- Overall algorithm performance
- Scale to additional sites





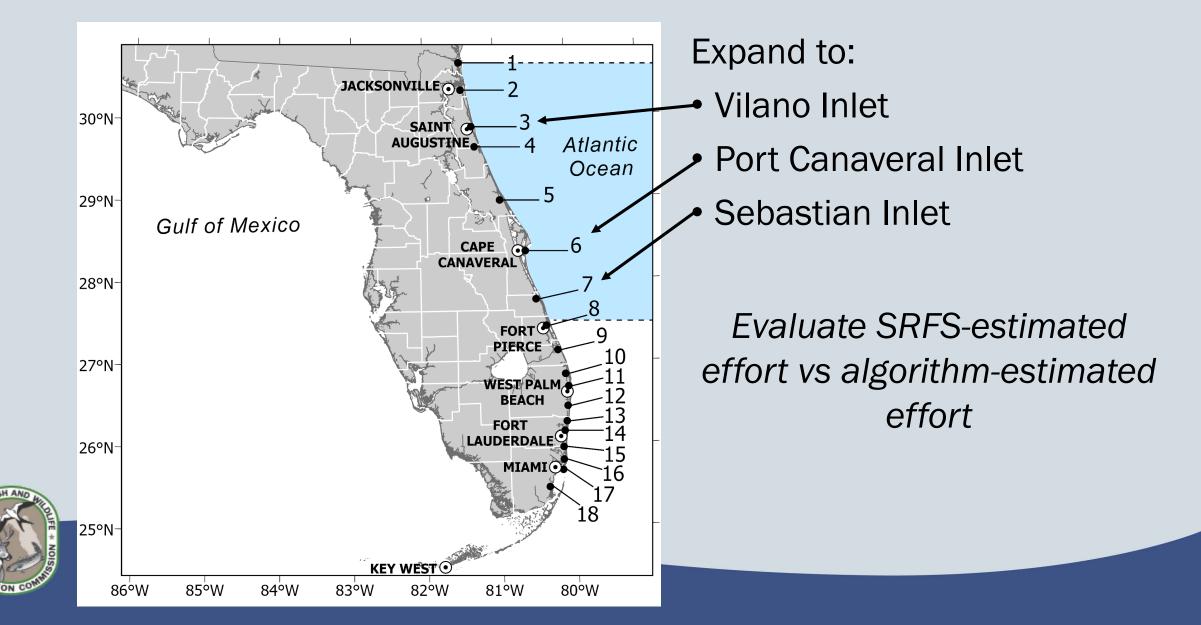
### **Cross-Channel Test: Mayport**







#### **Effort Validation: Scaling to Additional Sites**



## Acknowledgments



#### Lisa Holland

orps S ® Curtis Hall

#### US NAVY NS MAYPORT Environmental Arne Olsen Heather Hahn



Heath Alboher

Adam Balding Jason Allgood



Beach Safety Team

Chris Dembinsky

Lifeguard Staff



Permitting & Guidance



## **Questions?**



