# Development and Applications of an Ocean, Infragravity Wave, Morphological, and Structural Response Coupled Nearshore Prediction System

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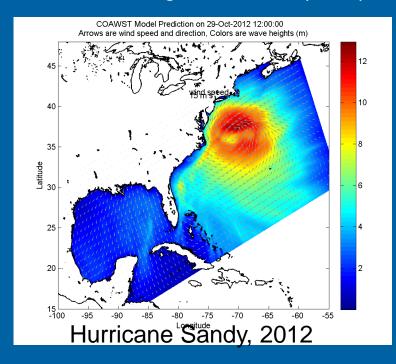
Joe Zambon Ruoying He Jennifer Warrilow



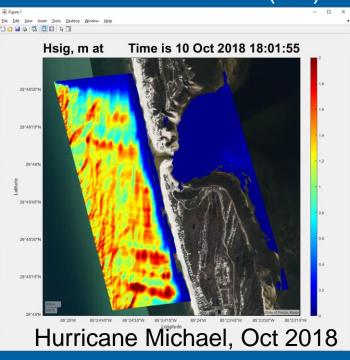
George Xue
Daoyang Bao
Yanda Ou



Regional Scale (km's)



Coastal Scale (m's)





Funding Support from: ONR N0001421IP00066 NOPP Hurricane Coastal Impacts (NHCI) Project

U.S. Department of the Interior U.S. Geological Survey

# **Outline**

COAWST modeling system overview

Model Coupling – physics fields exchanged

InWave infragravity wave model

**Sediment Model components** 

Hurricane Michael

Coastal erosion impacts

Structure damage assessments





# NOPP Hurricane Coastal Impacts (NHCI) Project www.nopp.org

### NOPP:

The National Oceanographic Partnership Program (NOPP) is a collaboration of Federal agencies which facilitates partnerships between Federal agencies, academia, industry, and others in the ocean scientific community to advance ocean science research and education

- **Task 0)** Provide hindcasts and forecasts of hurricane track and intensity predictions for CONUS landing hurricanes
- Task 1) Build and update Digital Elevation Models (DEM)
- **Task 2)** Satellite remote sensing for ground-truthing DEMs and geophysical measurements during the storms
- Task 3) In situ measurements of waves, currents, and water levels prior to and during landfall.
- Task 4) Forecasting of wave, surge, sediment transport, structure interaction and damage

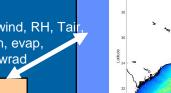
**COAWST** Coupled Ocean -Atmosphere - Wave -**Sediment Transport Modeling System** 

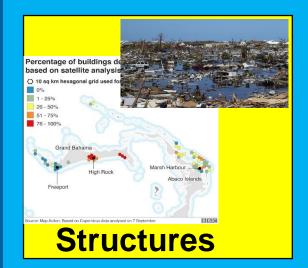
> **Structures Assessment**

# **COAWST**

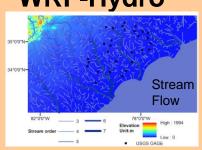
**WRF** 

Uwind, Vwind, RH, Tair cloud, rain, evap, SWrad, Lwrad





**WRF-Hydro** 



Water Levels

Water Levels.

Vertical fluxes

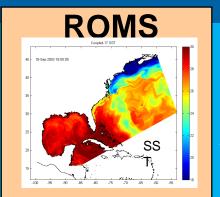
Streamflow.

MCT

MCT

Uwind, Vwind, Patm, RH, Tair, cloud, rain, evap, SWrad, Lwrad LH, HFX, Ustress, Vstress

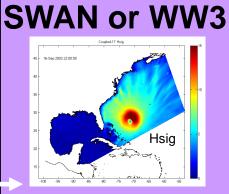
Wind speed



 $u_s$ ,  $v_s$ ,  $\eta$ , bath,  $Z_0$ 

### **MCT**

H<sub>wave</sub>, L<sub>mwave</sub>, L<sub>pwave</sub>, D<sub>wave</sub>, T<sub>psurf</sub>, T<sub>mbott</sub>, Q<sub>b</sub>, Diss<sub>bot</sub>, Diss<sub>surf</sub>, Diss<sub>wcap</sub>,



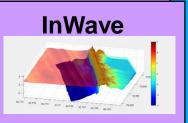
Vegetation



~25950 W







# **WAV 2 OCN**

Hwave
Lmwave
Lpwave
Dwave
Tpsurf
Tmbot
Qb
Dissbot
Disssurf
Disswcap

Ubot

height
length mean
length peak
direction
period surface
period bottom
percent breaking
Bottom dissipation
Breaking dissipation
Whitecap dissipation
Bottom orbital velocity



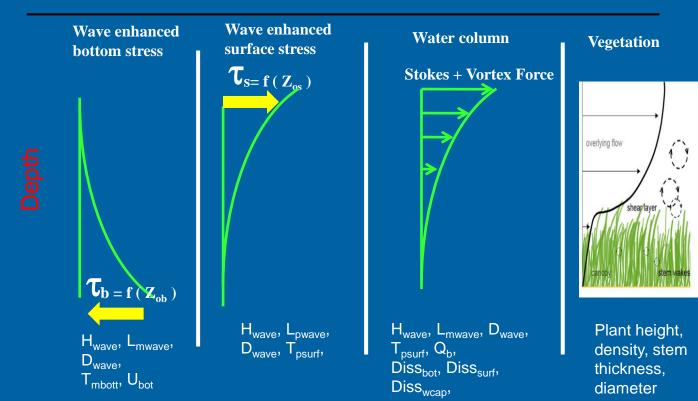
### Receiving component updated physics.

Warner, J.C., Sherwood, C.R., Signell, R.P., Harris, C.K., and Arango, H.G., (2008) "Development of a three-dimensional, regional, coupled wave, current, and sediment-transport model." *Computers and Geosciences*, 34, 1284-1306.

Olabarrieta, M., Warner, J.C., and Armstrong, B. (2012). "Ocean-atmosphere dynamics during Hurricane Ida and Nor'Ida: an atmosphere-ocean-wave coupled modeling system application." *Ocean Modelling*, 43-44, pp 112-137.

Kumar, N., Voulgaris, G., Warner, J.C., and M., Olabarrieta (2012). Implementation of a vortex force formalism in a coupled modeling system for inner-shelf and surf-zone applications. *Ocean Modelling*, 47, 65-95.

Beudin, A., Kalra, T. S., Ganju, N. K., and Warner, J.C. (2016). Development of a coupled wave-flow-vegetation interaction module. Computers and Geosciences, http://dx.doi.org/10.1016/j.cageo.2016.12.010



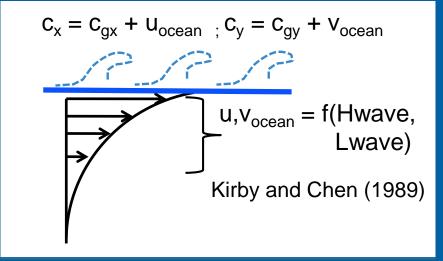
# **OCN 2 WAV**

 $v_s$  current eastward  $v_s$  current northward  $v_s$  water level bath bathymetry (morphology)  $v_s$  bottom roughness f(sed)

1) **Generation** wind speed forcing is modified by ocean currents

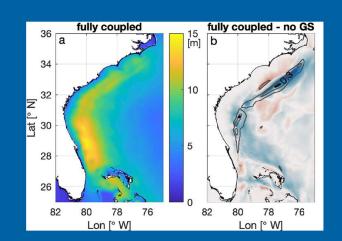


2) Propagation in geographic space wave celerity is modified by ocean currents



3) Propagation in theta space change of wave direction (refraction) due to η, bathy, and currents:

Hegermiller, C.A., J.C. Warner, M. Olabarrieta, and C.R. Sherwood, 2019: Wave–Current Interaction between Hurricane Matthew Wave Fields and the Gulf Stream. J. Phys. Oceanogr., 49, 2883–2900







# InWave – nearshore infragravity wave model

### Wave action balance transport equation in Cartesian coordinate system

$$\frac{\partial(A)}{\partial t} + \frac{\partial(C_{g,x}A)}{\partial x} + \frac{\partial(C_{g,y}A)}{\partial y} + \frac{\partial(C_{g,\theta}A)}{\partial \theta} = -\frac{D_w}{\sigma}$$

$$C_{g,x} = C_g \cos\theta + U$$

$$C_{q,y} = C_q \sin\theta + V$$

$$C_{g,\theta} = \frac{\sigma}{\sinh(2kh)} \left( \frac{\partial h}{\partial x} \sin\theta - \frac{\partial h}{\partial y} \cos\theta \right) + \cos\theta \left( \frac{\partial U}{\partial x} \sin\theta - \frac{\partial U}{\partial y} \cos\theta \right) + \sin\theta \left( \frac{\partial V}{\partial x} \sin\theta - \frac{\partial V}{\partial y} \cos\theta \right)$$

### Wave dispersion relation + Doppler relation

$$\sigma = \sqrt{gk \tanh(kh)}$$

$$w = \sigma + \vec{k} \cdot \vec{u}$$

$$C = \frac{gk \tanh(kh)}{\sinh(2kh)}$$

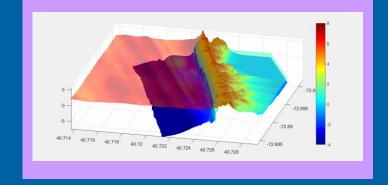
$$C = \frac{gk \tanh(kh)}{\sinh(2kh)} \qquad C_g = 0.5C \left(1 + \frac{2kh}{\sinh(2kh)}\right)$$

### **Eikonal equation**

$$\frac{\partial k_x}{\partial t} = -\frac{\partial (w)}{\partial x} \qquad \qquad \frac{\partial k_y}{\partial t} = -\frac{\partial (w)}{\partial y}$$

$$\frac{\partial k_{y}}{\partial t} = -\frac{\partial (w)}{\partial y}$$

$$|\vec{k}| = k_x^2 + k_y^2$$





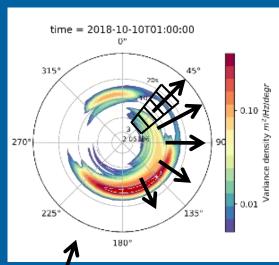
Convert Wave: A → Hwave, Dwave k → Lwave

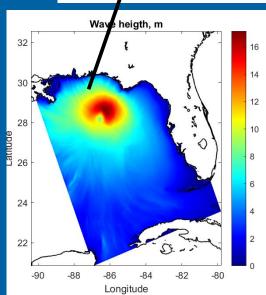


**Vortex Force 3D** hydrodynamics

# InWave wave group bc's

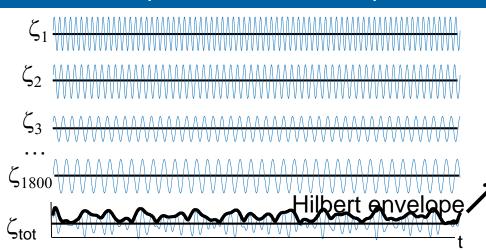
### 2D spectra



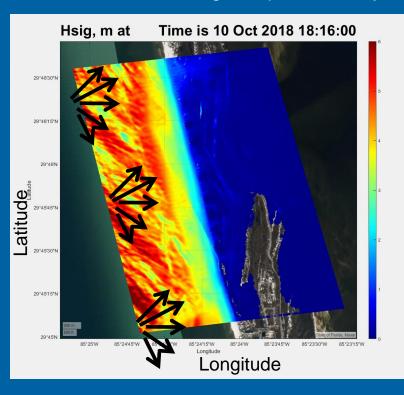


### For each direction:

- compute water level time series for each freq.
- $-\zeta = amp * sin(2\pi f t + phase + k L)$
- 3600 s time series
- 1800 freqs
- sum them up, take Hilbert envelope



Impose BC's at every point along the open boundary.



Repeat for other directions.
Use ~ 15 degree directional bins.



WaveAction =  $\rho$  g  $(2\eta)^2$  T /  $(16 \pi)$ 

Adding this feature to WW3! (w3updtmd.ftn)

# **Sediment and Nearshore Processes**

### **Vortex Force**

Wave energy dissipation transferred from WAV to OCN model to drive ocean momentum. Kumar et al, 2010

### Vertical turbulent mixing

Generic Length Scale (GLS) by Umlauf and Burchard (2003), as implemented by Warner et al (2005).

# Surface tke flux from wave breaking

- Vertical tke flux from surface wave breaking
- surface flux boundary conditions to GLS

### Roller model

Transfers non-breaking wave momentum flux landward Reniers et al., 2004.

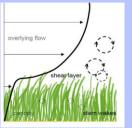
### **Wetting / Drying**

- User defined Dcrit establishes minimum depth criteria.
- Flux onto a dry (or wet) cell is always permitted.

# Cross-shore distance

### Vegetation

Momentum loss throughout vertical height of plant layer Beudin,et al., 2016



### **Dune slumping**

- Dune slope slumping criteria
- Bed slope transport

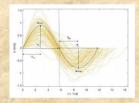
# boundary layer

Wave-current bottom

- Enhanced bottom stress from oscillatory wave motion
- Enhanced bed stress for currents and Erate
- Compute sand ripple dimensions

### **Bedload Transport**

- Meyer-Peter Muller (1948)
- Soulsby and Damgaard (2005)
- Van der A et al. (2013) wave asymmetry based mobility

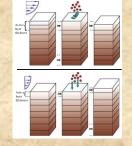


### Suspended-Sediment Transport

- Tracer advection w/ Sources/Sinks.
- Flux resuspension
- WENO settling algorithm (no CFL)
- Multiple sediment classes: settling velocity, density, erosion rate, bed porosity, grain diameter, and critical stress for erosion.

### Morphology

- Update seafloor elevation as sediment is transported and bed model evolves.
- Update of this bed elevation is critical to provide feedback to the circulation.
- Transfer elevations to WAV model critical.
- Implemented Implicit vertical advection for stability
- Implemented 5<sup>th</sup> order bed update elevation scheme



### **Bed model**

- 3D underlies hydro grid
- constant number of bed layers
- erosion: material removed from top layerdeposition: material is added to top layer
- layers are merged or separated based on user criteria

# **Hurricane Michael 2018**

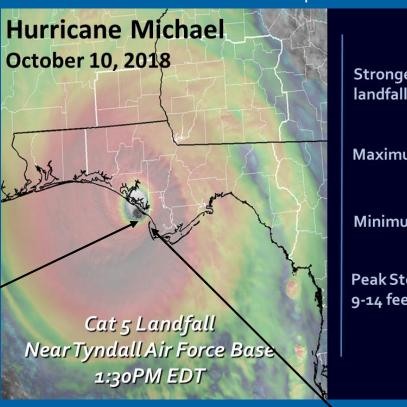
https://www.weather.gov/tae/HurricaneMichael2018

### Structure Impacts



### Mexico Beach

Beven, Berg, and Hagen, NHC TC Report AL142018 Michael 2018.





Cape San Blas





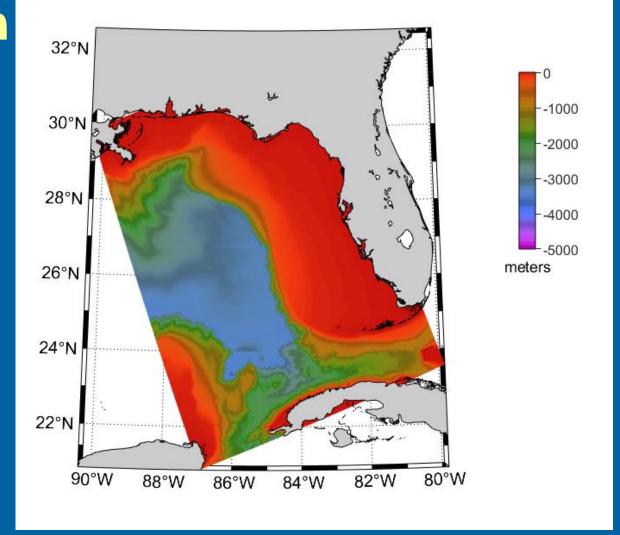
Geomorphic Impacts



# GoM Regional grids: ROMS + SWAN simulation

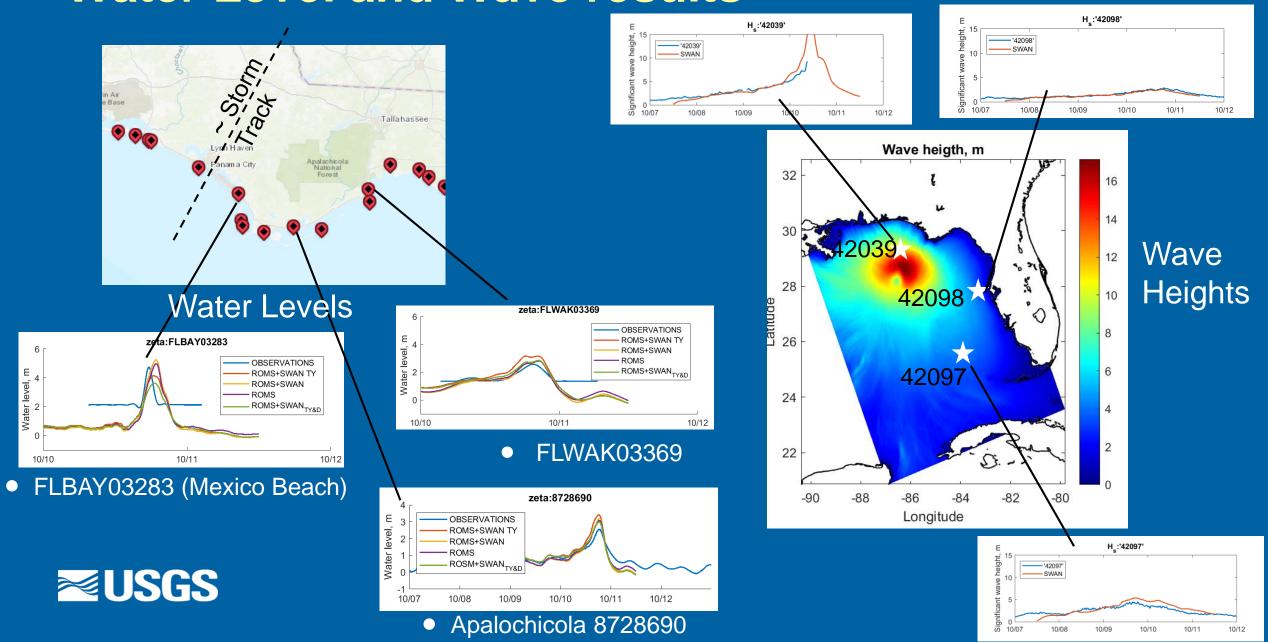
### L1 Grid

- 15 vertical layers
- Approx. 950 m horizontal resolution
- Init and boundary conditions from coarser grid covering all GoM and USEast coast.
- COMAPS-TC atmospheric forcings of 10m winds, atm pressure
- -Tides TPOX 8.0
- -Bathy GEBCO19
- -Simulated Oct 7-11, 2018

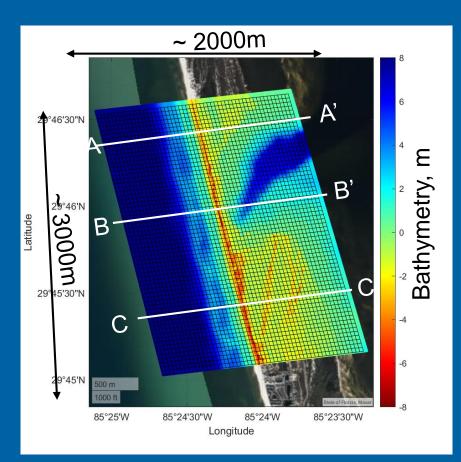




# Water Level and Wave results



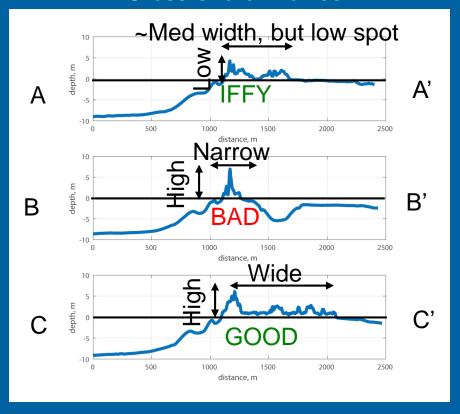
# Cape San Blas nearshore grid



Grid 550 cells 'x',  $dx \sim 4m$  650 cells 'y',  $dy \sim 5m$ 



### **Cross-shore Profiles**

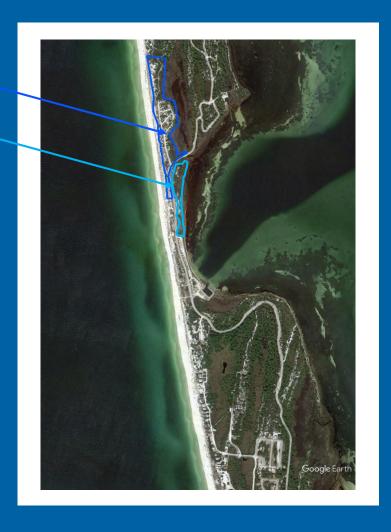


'ncei19\_n30X00\_w085X50\_2019v1\_pre\_michael.tif'

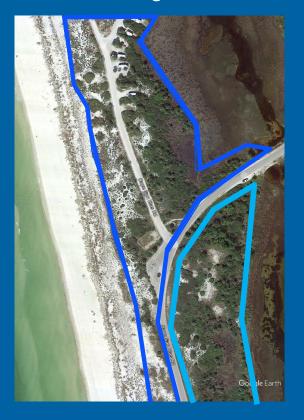


# **Vegetation map**

Areas defined as 'vegetated'



Zoom in of vegetated area.



### Parameters for Cape San Blas

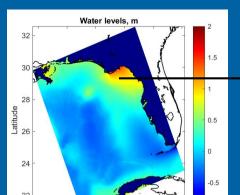
plant density 10 stems/m<sup>2</sup>
plant diameter 0.03 m
plant thickness 0.005m
plant height 1.0m



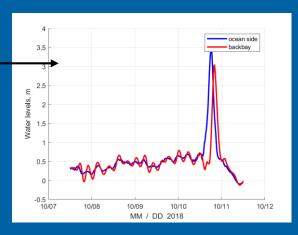
Very approximate vegetation cover for now.



# Cape San Blas-forcings



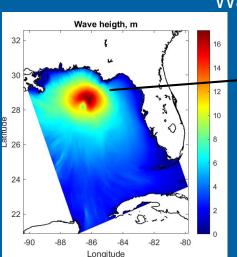
### Water levels



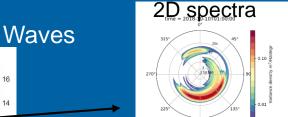
Water levels

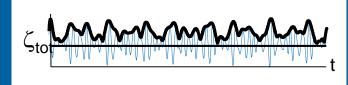
Simulated the storm event from Oct 10, 2018 to Oct 11, 2018

Extract data from coarser grid



Extract data from coarser grid

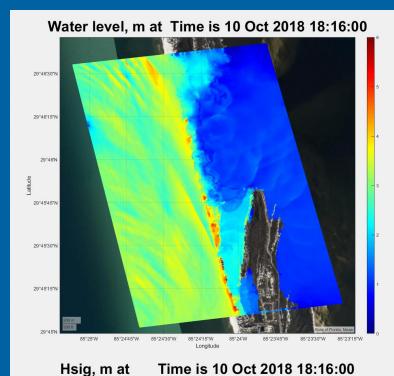


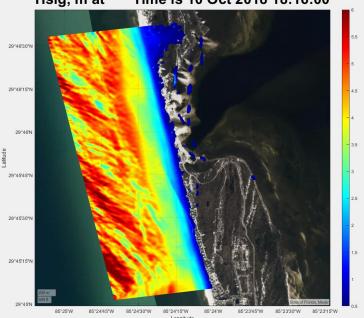


Hilbert envelope over reconstructed water level time series.



wave action density (wave group envelope)



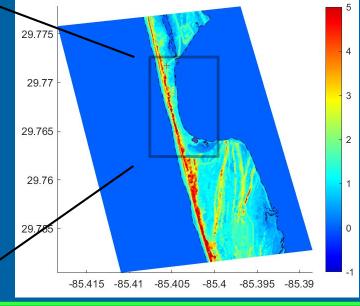


# Cape San Blas breach

Elevations of water level and dunes, near mid tide.

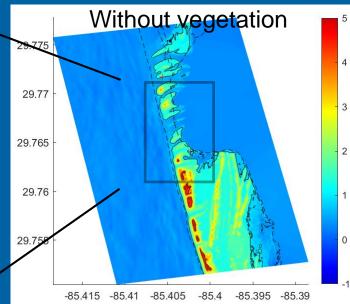
before storm

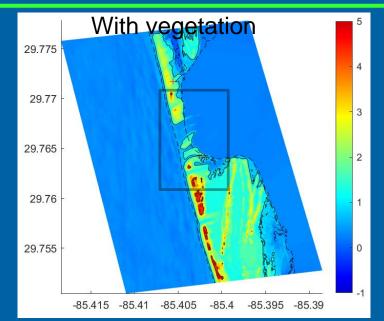




after storm



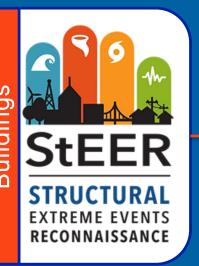




Excessive dune erosion and many breaches.

Limited erosion and breaches.

# Damage to Structures – Objective

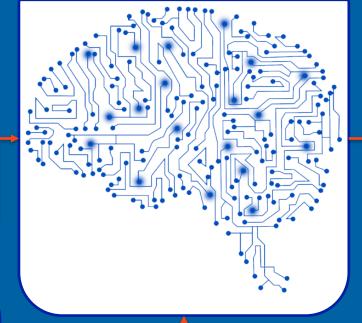




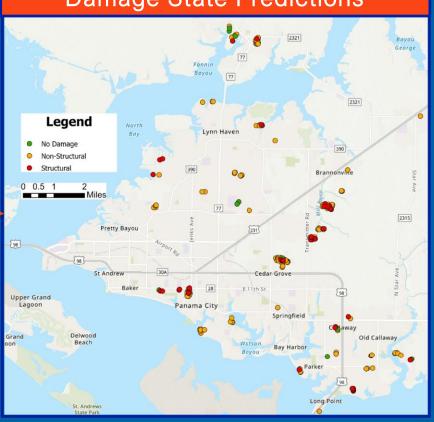




### Machine Learning



### **Damage State Predictions**



# Damage to Structures – Results

### **Prediction Model**

- Random Forest algorithm
- Trained on reconnaissance data

### **Important Input Features**

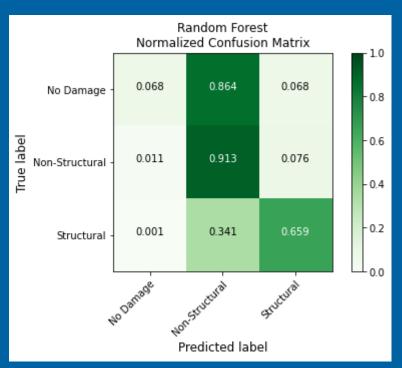
- Design wind speed exceedance
- Age
- Distance to coastline
- Surge depth

- Wall structural type
- Roof structural type
- Number of stories
- Roof shape
- Wall cladding material

	Extent of failure in:		
Damage State	Roof/Wall Cover	Roof/Wall Substrate	Roof/Wall Structure
No Damage	0%	None	None
Non-Structural	> 0% and ≤ 50%	≤ 3 panels	None
Structural	> 50%	> 3 panels	Any

### **Hurricane Michael Case Study Performance**

- Accuracy = 79%
- Over-conservative
  - Predicts No Damage as Non-Structural Damage
  - Very few "No Damage" samples in available data



# Conclusions

NOPP Hurricanes Project is pulling together many needed resources to address predictions of landfall hurricanes.

Continuing to develop an Ocean-Atmosphere-Wave-SedimentTransport Modeling System to couple coastal storm processes.

Application of Hurricane Michael with larger scale grids simulated the wave, current, and water levels and provide boundary forcings for smaller scale models.

Cape San Blas smaller scale application (~ 4m grid spacing) simulated dune overtopping and barrier island breaching.

Inclusion of small/local scale (O~m) land use/cover features of vegetation resulted in more accurate simulation of breaching.



Developing a machine learning framework to predict categorical damage states to buildings in hurricane impact areas.