

## Forecasting and Mapping of Coastal Flooding during Hurricanes

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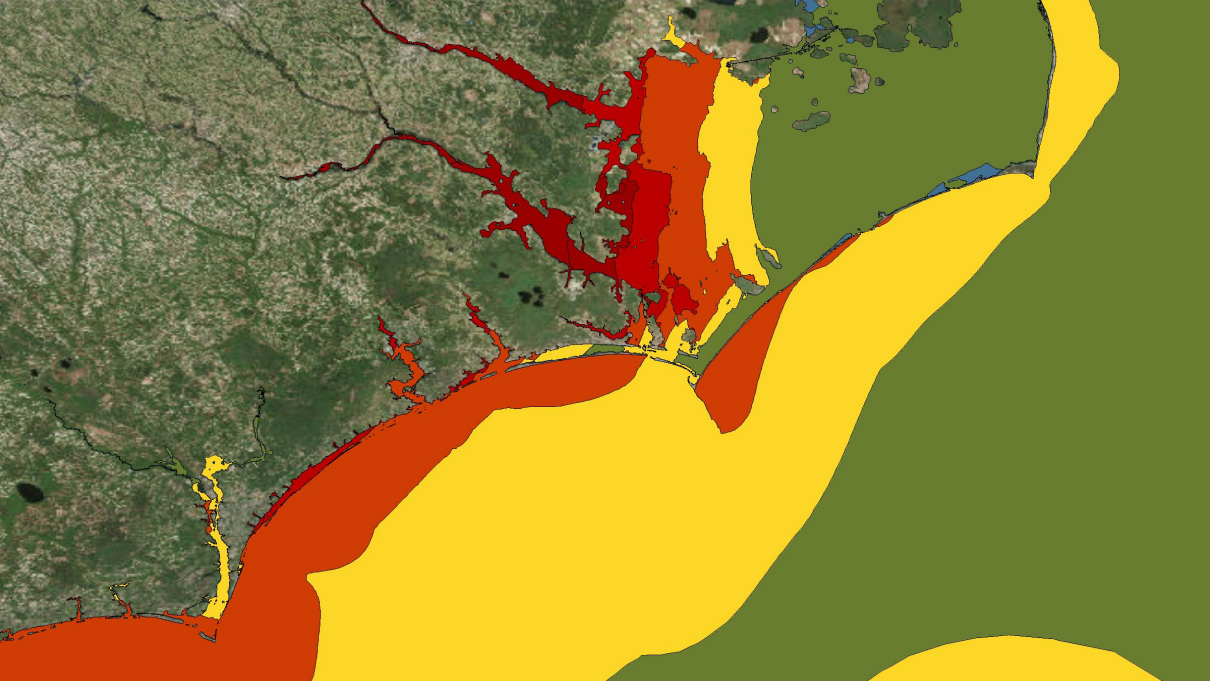
Numerical Analysis Seminar Series  
NCSU Dep't of Mathematics, 19 March 2018



COASTAL RESILIENCE CENTER  
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# Predictive Modeling for Hurricane Waves and Storm Surge

Wide Range of Spatial Scales

Waves and Storm Surge

Engineering Applications

## Real-Time Forecasting for North Carolina

Unstructured, Finite Element Mesh

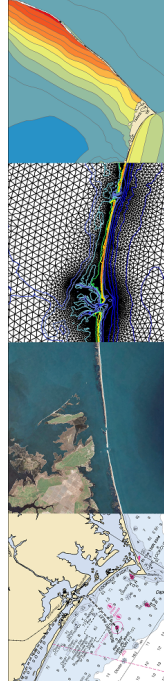
Hurricane Florence (2018)

## Improving Efficiency via Dynamic Load Balancing

Domain Decomposition

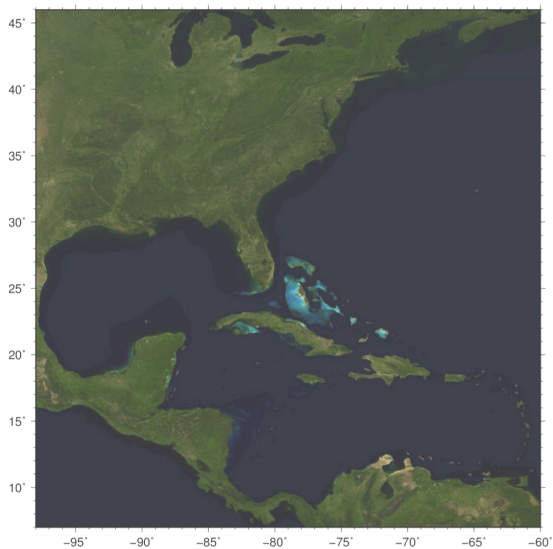
Examples of Efficiency Gains

## Summary



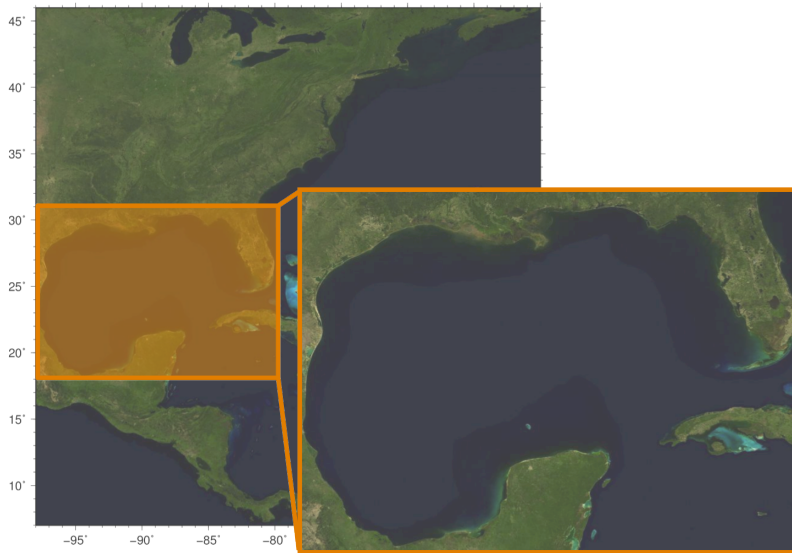
# Wide Range of Spatial Scales

## Gulf and Atlantic Coasts



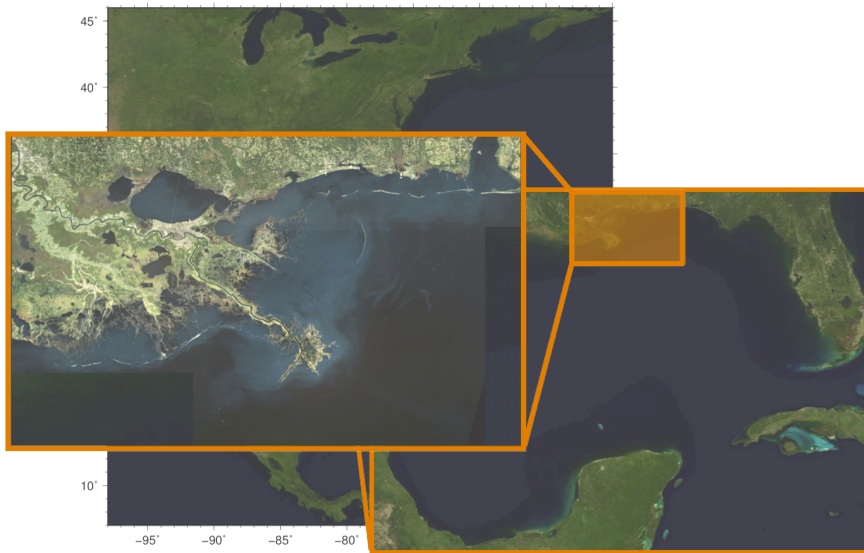
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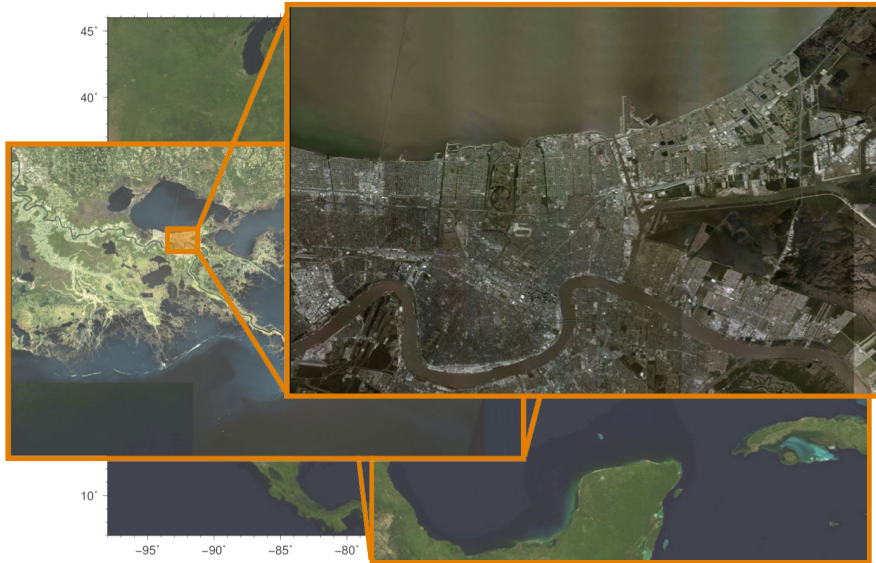
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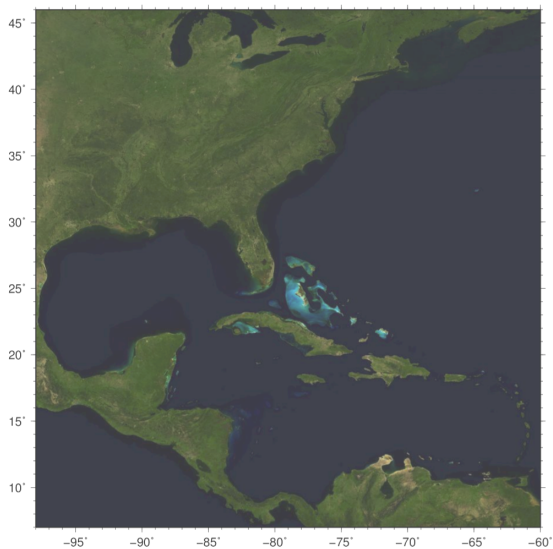
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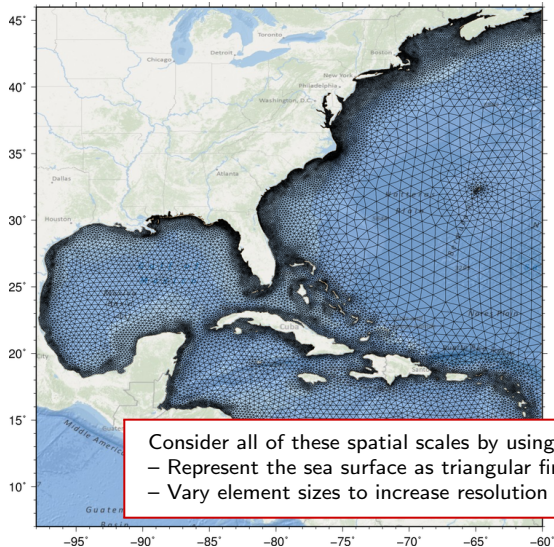
# Wide Range of Spatial Scales

## Gulf and Atlantic Coasts



# Wide Range of Spatial Scales

## Unstructured, Finite-Element Meshes

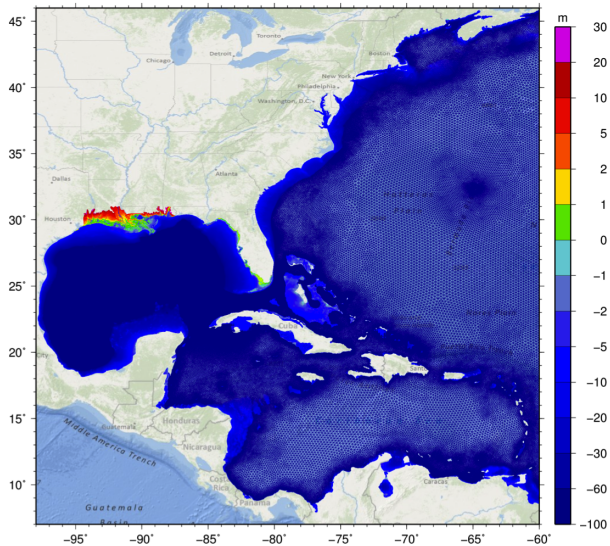


- Consider all of these spatial scales by using *unstructured meshes*:
- Represent the sea surface as triangular finite elements
  - Vary element sizes to increase resolution in regions of interest



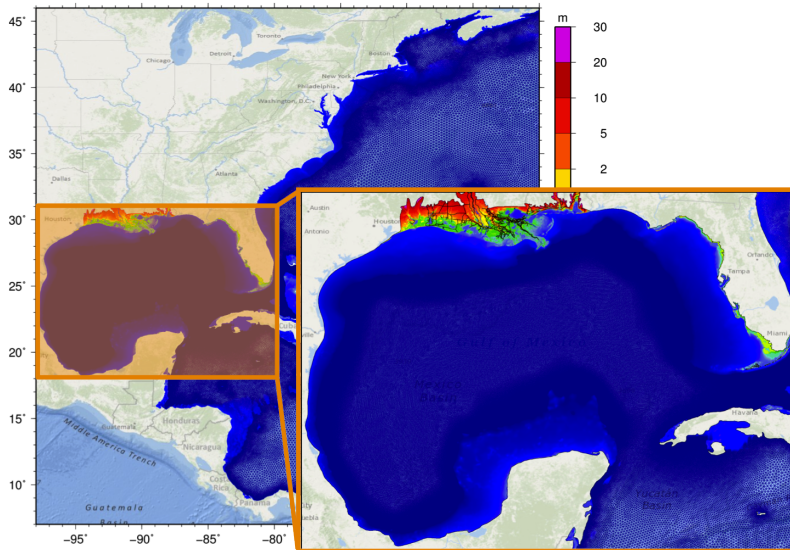
## Wide Range of Spatial Scales

### SL16 Mesh for Southern Louisiana



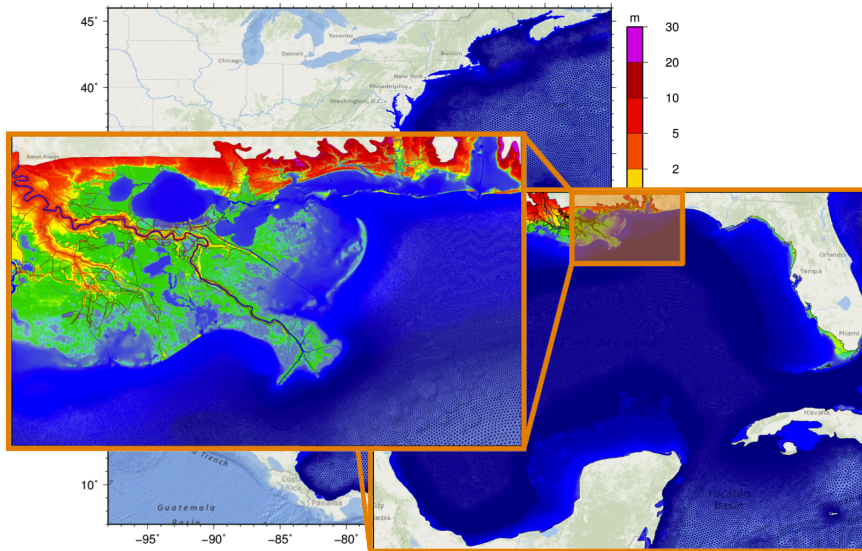
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## SL16 Mesh for Southern Louisiana



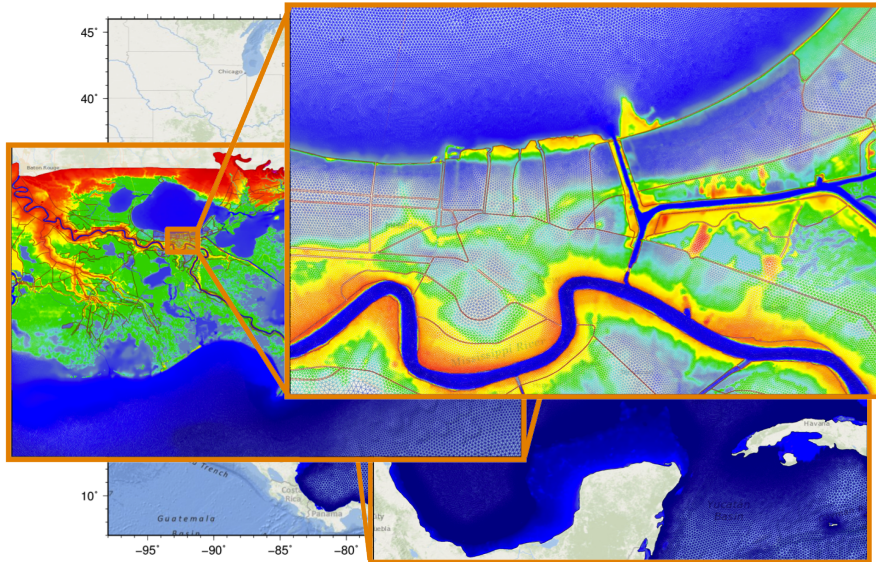
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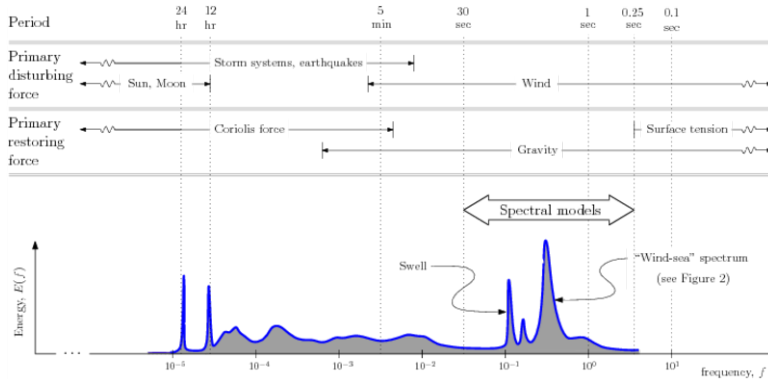


# Waves and Storm Surge

## Temporal Scales

Sea surface can be described with both *long* and *short* waves

- ▶ Long waves due to tides, storm surge
- ▶ Short waves due to wind (swell and wind-sea)



## Waves and Storm Surge

### ADvanced CIRCulation (ADCIRC)

For long waves, we use ADCIRC

- Does represent the phases of tides and/or storm surge

Solves the generalized wave continuity equation (GWCE) for water levels  $\zeta$ :

$$\frac{\partial^2 \zeta}{\partial t^2} + \tau_0 \frac{\partial \zeta}{\partial t} + \frac{\partial \tilde{J}_x}{\partial x} + \frac{\partial \tilde{J}_y}{\partial y} - UH \frac{\partial \tau_0}{\partial x} - VH \frac{\partial \tau_0}{\partial y} = 0$$

Solves the depth-averaged momentum equations for currents ( $U, V$ ):

$$\frac{DU}{Dt} - fV = -g \frac{\partial}{\partial x} \left[ \zeta + \frac{p_s}{g\rho_0} - \alpha\eta \right] + \frac{\tau_{sx} + \tau_{bx}}{\rho_0 H} + \frac{M_x - D_x}{H}$$

$$\frac{DV}{Dt} + fU = -g \frac{\partial}{\partial y} \left[ \zeta + \frac{p_s}{g\rho_0} - \alpha\eta \right] + \frac{\tau_{sy} + \tau_{by}}{\rho_0 H} + \frac{M_y - D_y}{H}$$

# Waves and Storm Surge

## ADCIRC Discretization

In geographic space:

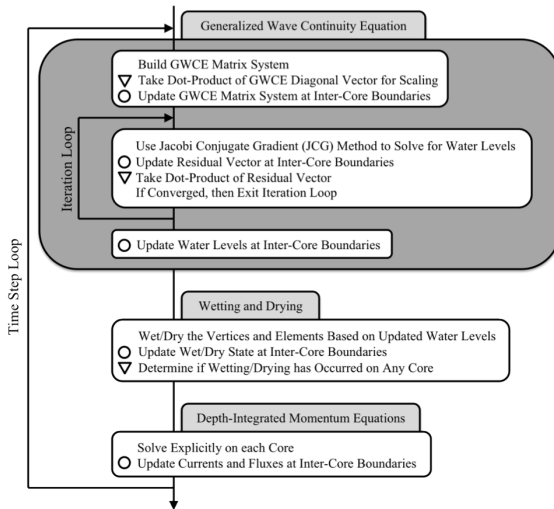
- ▶ Piecewise-linear, continuous, Galerkin finite elements
  - ▶ Unique values for  $(\zeta, U, V)$  at every mesh vertex
- ▶ Typical minimum mesh spacings of 10 to 50 m

In time:

- ▶ Semi-implicit
  - ▶ Implicit solution of GWCE using Jacobi Conjugate Gradient (JCG) solver
  - ▶ Explicit solution of momentum equations with lumped mass matrix
- ▶ Fully explicit
  - ▶ Also possible to use lumped mass matrix for solution of GWCE
- ▶ Typical time steps of 0.5 to 10 sec

# Waves and Storm Surge

## ADCIRC Solution Algorithm





# Waves and Storm Surge

## Simulating WAVes Nearshore (SWAN)

For short waves, we use SWAN

- ▶ Does not represent the phase of each individual wave
  - ▶ Conserved quantity is the action density  $N(t, x, y, \sigma, \theta)$
  - ▶ Can be integrated to compute statistical wave properties

Solves the action balance equation:

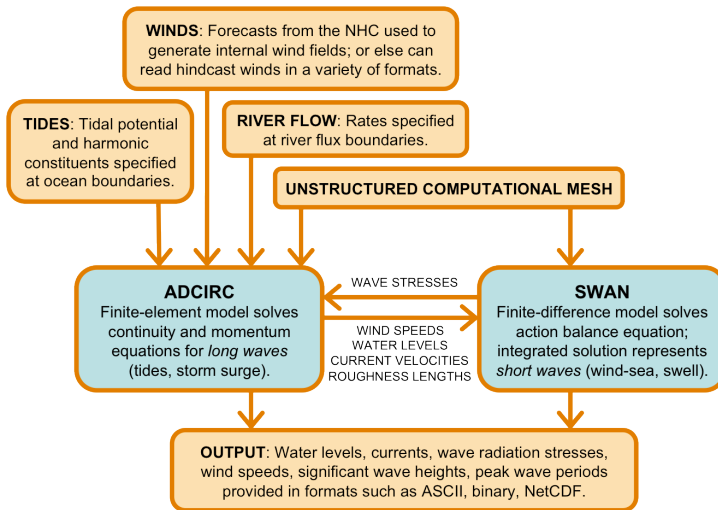
$$\frac{\partial N}{\partial t} + \nabla_{\mathbf{x}} \cdot [(\mathbf{c}_g + \mathbf{U}) N] + \frac{\partial c_\theta N}{\partial \theta} + \frac{\partial c_\sigma N}{\partial \sigma} = 0$$

Solution methods in geographic  $(x, y)$  and spectral  $(\sigma, \theta)$  spaces:

- ▶ Gauss-Seidel in geographic space
- ▶ Iterative solution of matrix system in spectral space

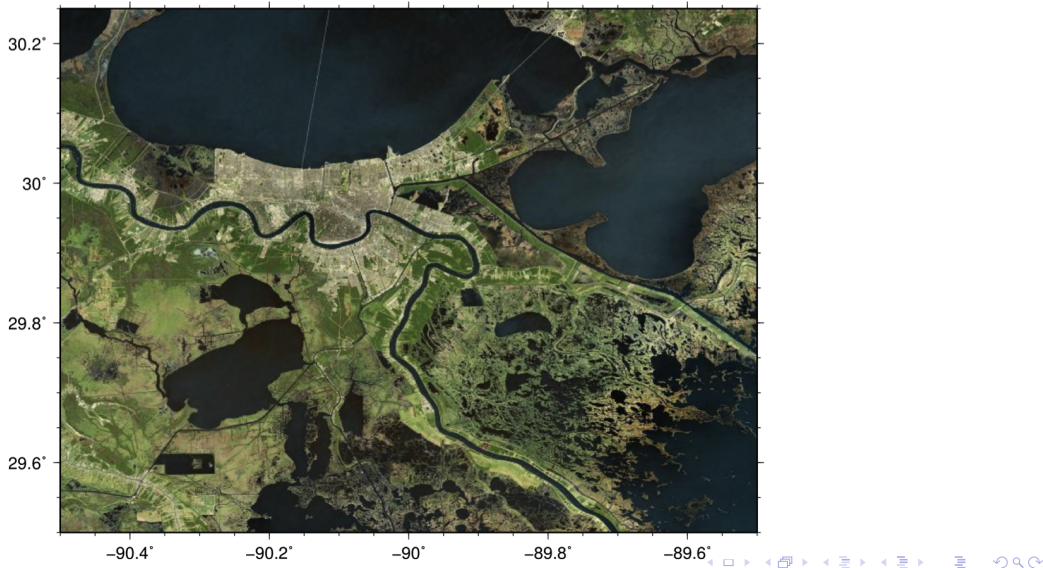
# Waves and Storm Surge

## Tight Coupling of SWAN+ADCIRC



# Engineering Applications

## Surge Barrier Design with the USACE



# Engineering Applications

## Surge Barrier Design with the USACE



# Engineering Applications

## Surge Barrier Design with the USACE

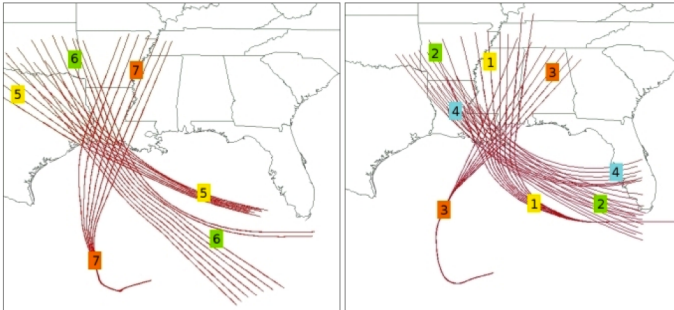


## Engineering Applications

### Floodplain Risk Maps for FEMA

Joint Probability Method with Optimal Sampling (JPM-OS):

- ▶ Hypothetical storms with varying characteristics
- ▶ Combine results to develop 100-yr flood maps

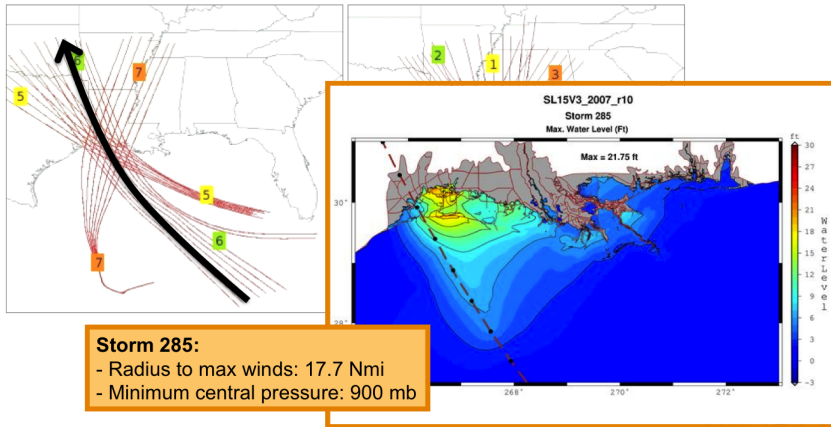


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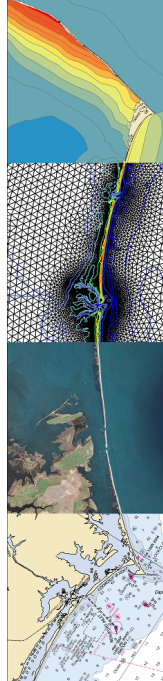
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Examples of Efficiency Gains

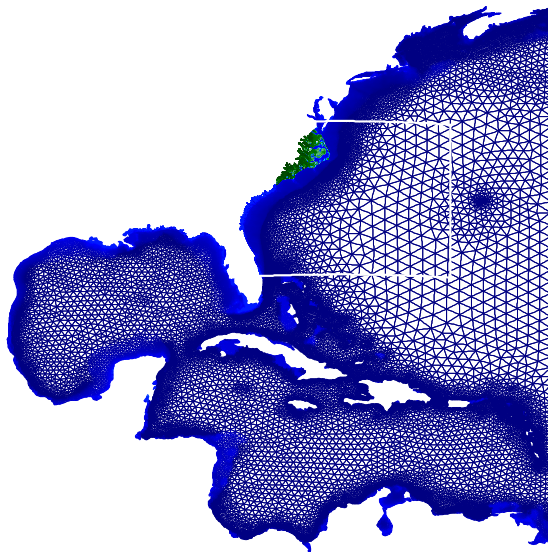
## Summary





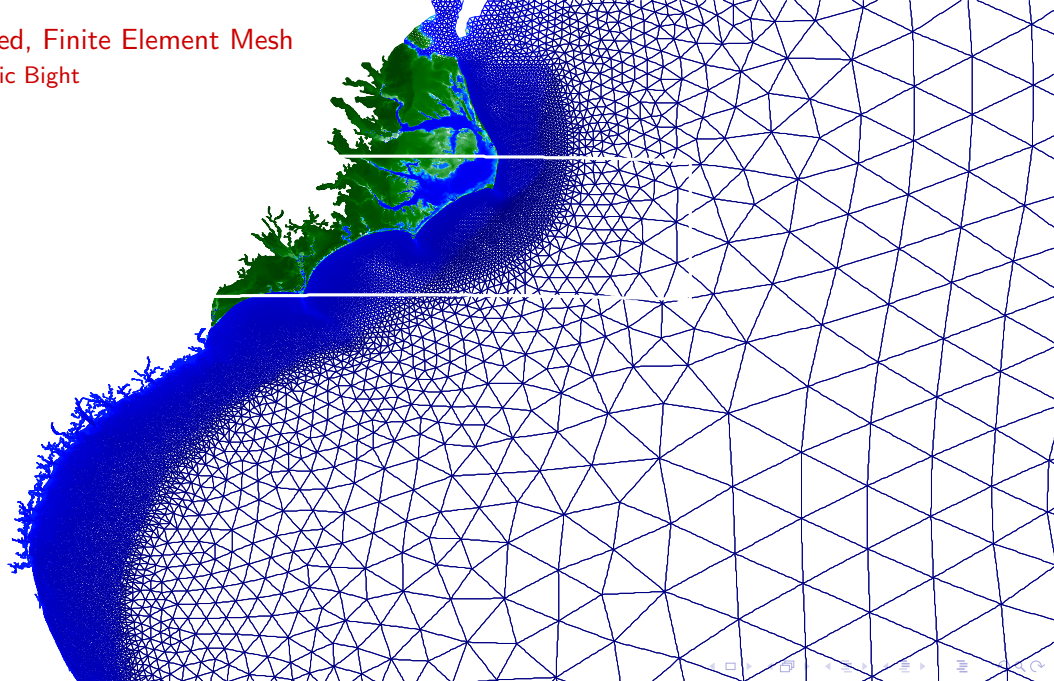
# Unstructured, Finite Element Mesh

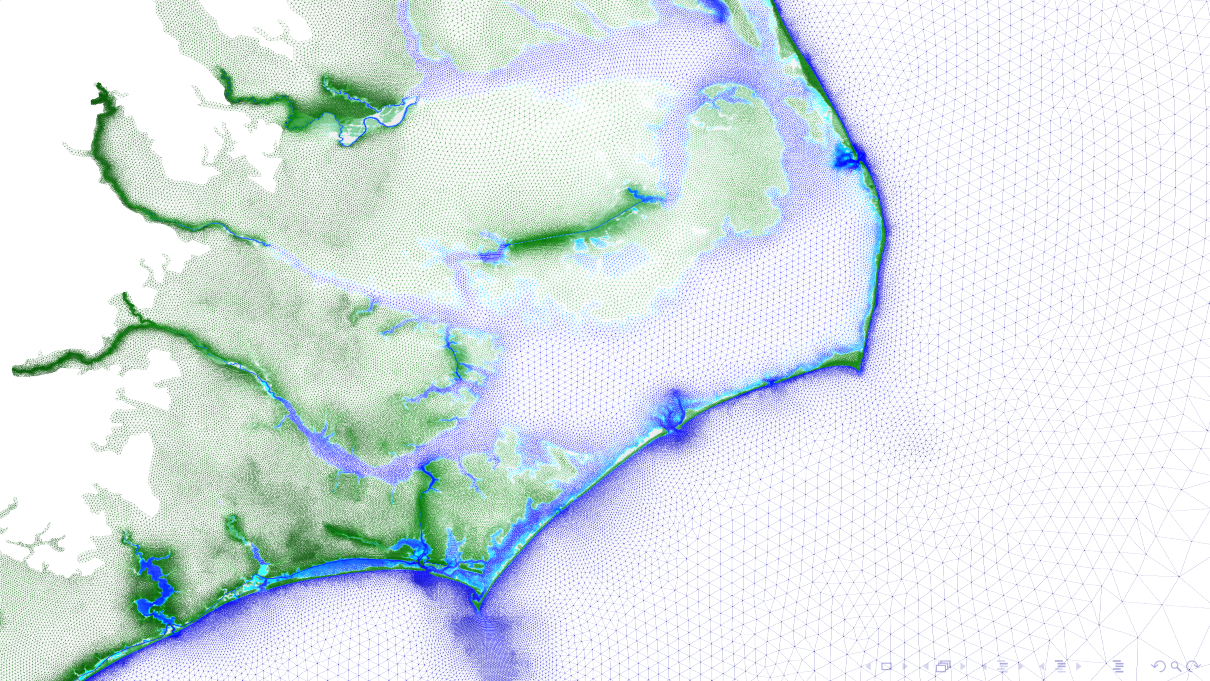
## Western North Atlantic Ocean



# Unstructured, Finite Element Mesh

## South Atlantic Bight





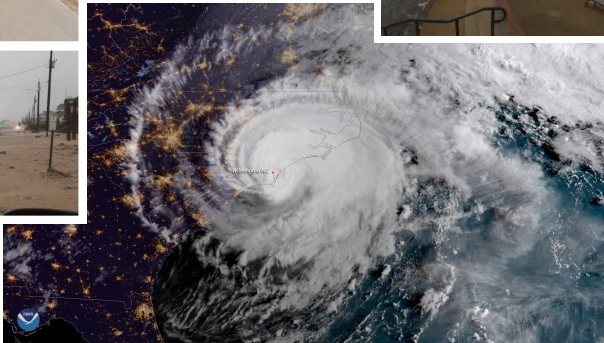
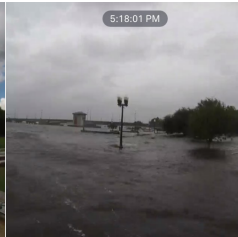
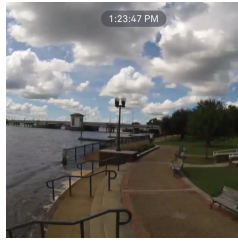
# Hurricane Florence (2018)

## Extensive Impacts to Coastal NC

Surf City NC (@AdamWGME)



Union Point in New Bern NC (@NWSEastern)

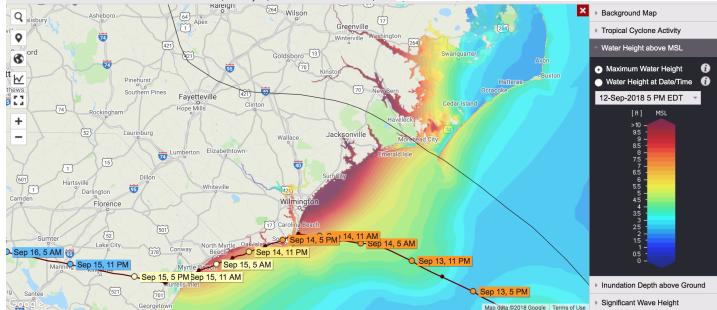
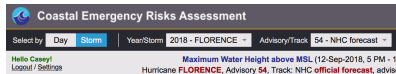


Florence making landfall on Fri Sep 14 (@NOAASatellites)

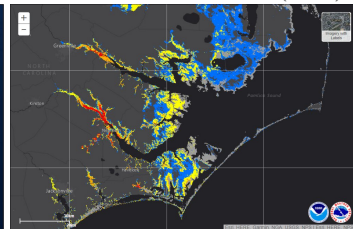
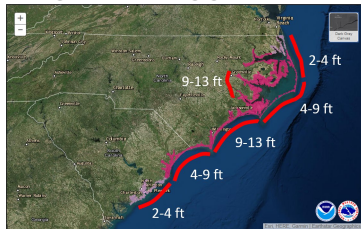
# Hurricane Florence (2018)

## Forecasts of Storm Surge

## Surge and flooding guidance from the National Hurricane Center (NHC)



ADCIRC maximum water levels for Advisory 54 (CERA)



## Hurricane Florence (2018)

### ADCIRC Surge Guidance System (ASGS)

SWAN+ADCIRC can be employed in real-time

- **Everything happens automatically**
  - Models are initialized, run, and processed by Perl scripts

Wind fields from two sources:

- Under normal conditions:
  - Downloaded from NAM model output by NOAA/NCEP
  - Converted into format compatible with SWAN+ADCIRC
- Under storm conditions:
  - Download advisories from NOAA/NHC
  - Generate wind fields using parametric model (Holland, 1980)

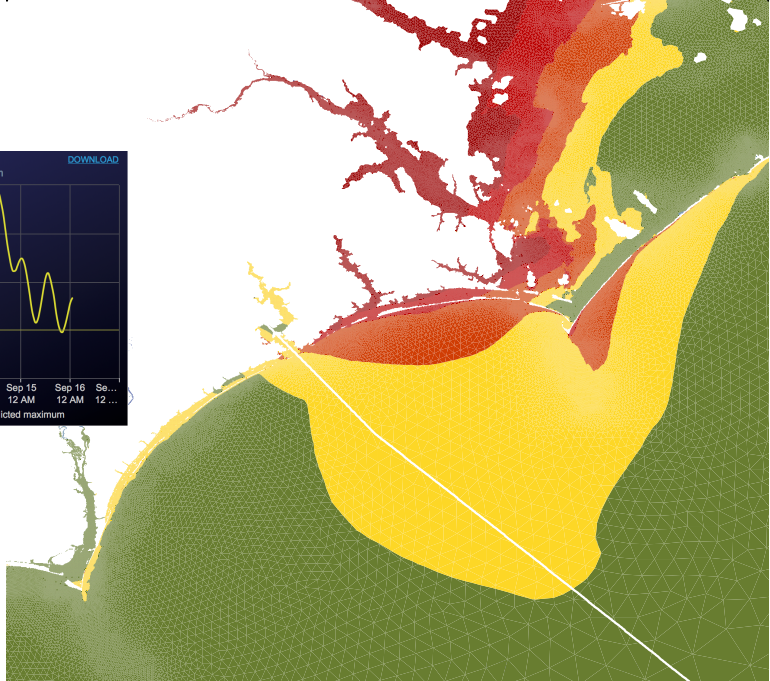
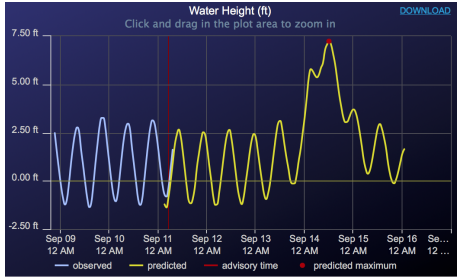
Guidance can be shared in multiple formats:

- Send directly to stakeholders (NC Emergency Management)
- Share publicly via web service (<http://www.adcirc.org>)



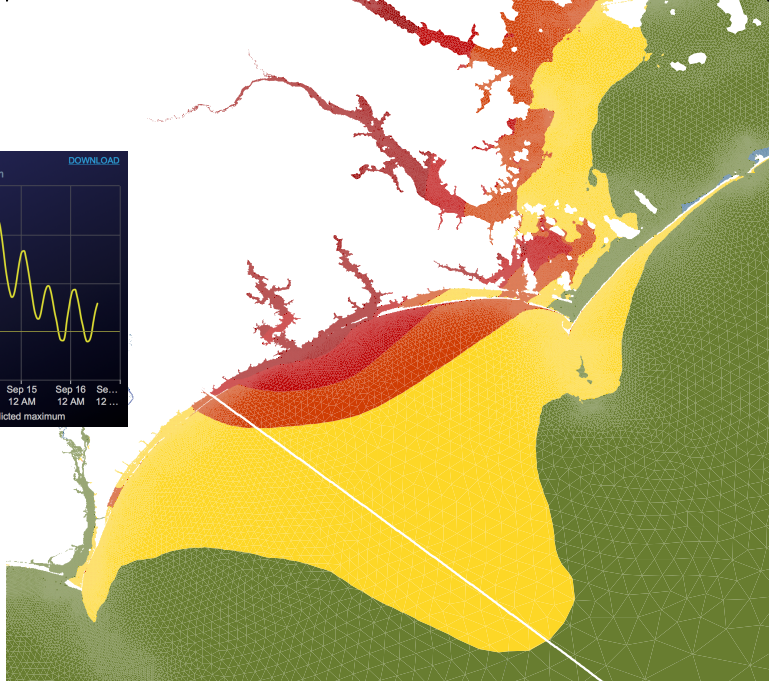
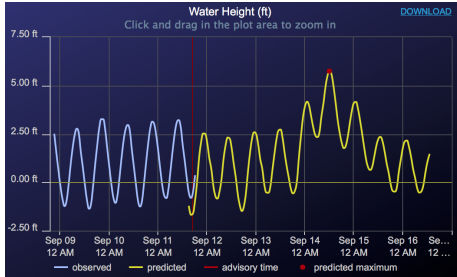
# Hurricane Florence (2018)

Adv 48 – Sep 11 Tue 5am



# Hurricane Florence (2018)

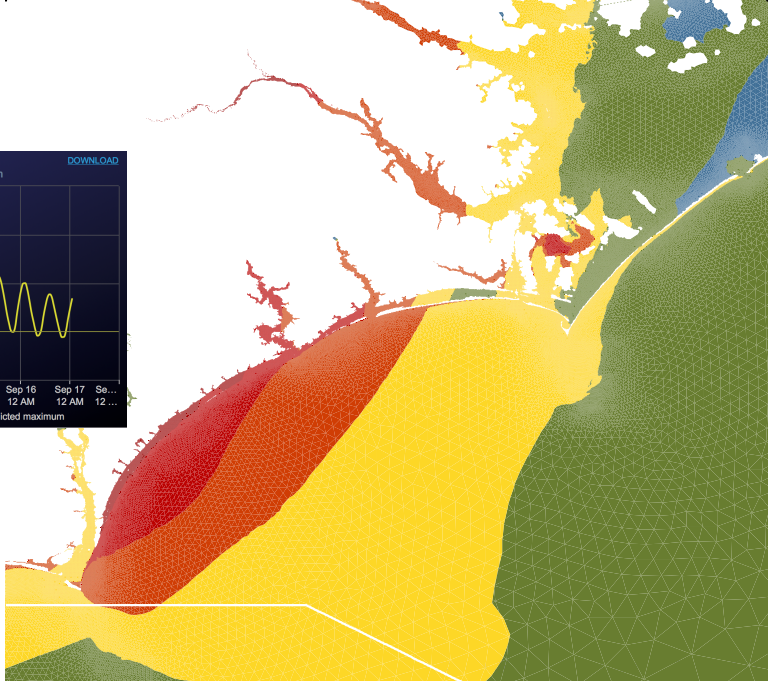
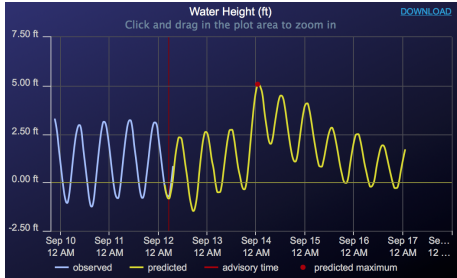
Adv 50 – Sep 11 Tue 5pm





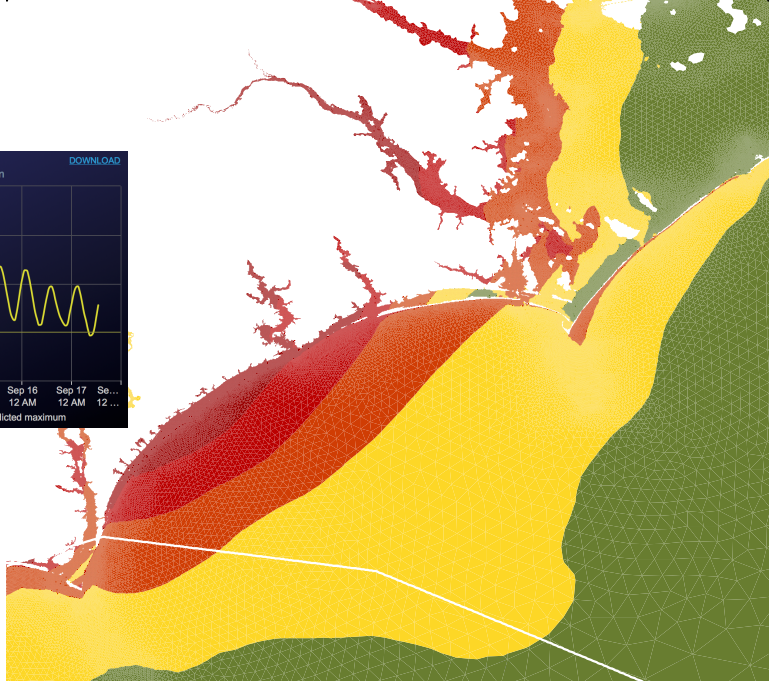
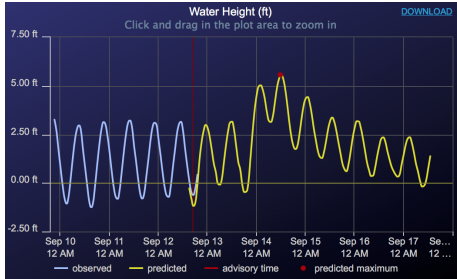
# Hurricane Florence (2018)

Adv 52 – Sep 12 Wed 5am



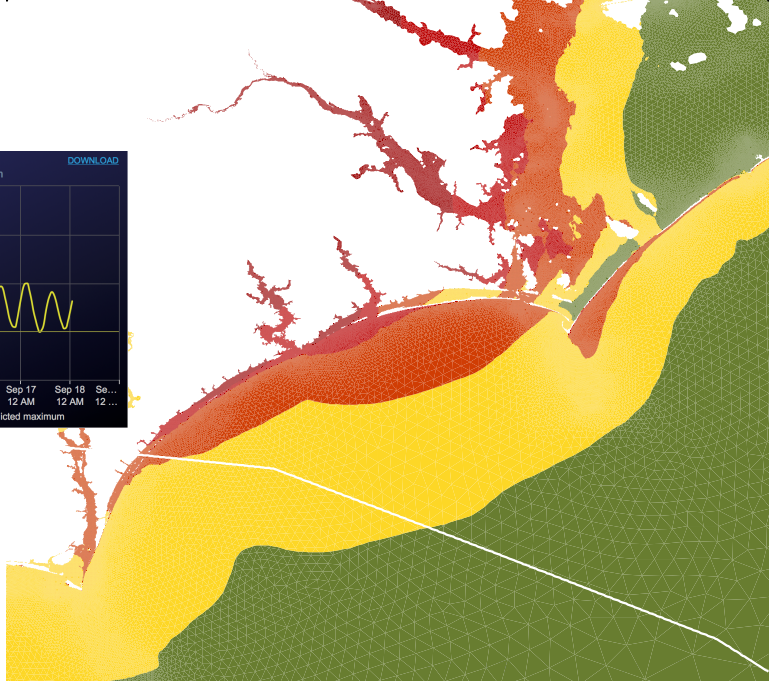
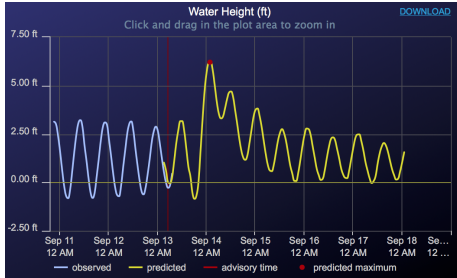
# Hurricane Florence (2018)

Adv 54 – Sep 12 Wed 5pm



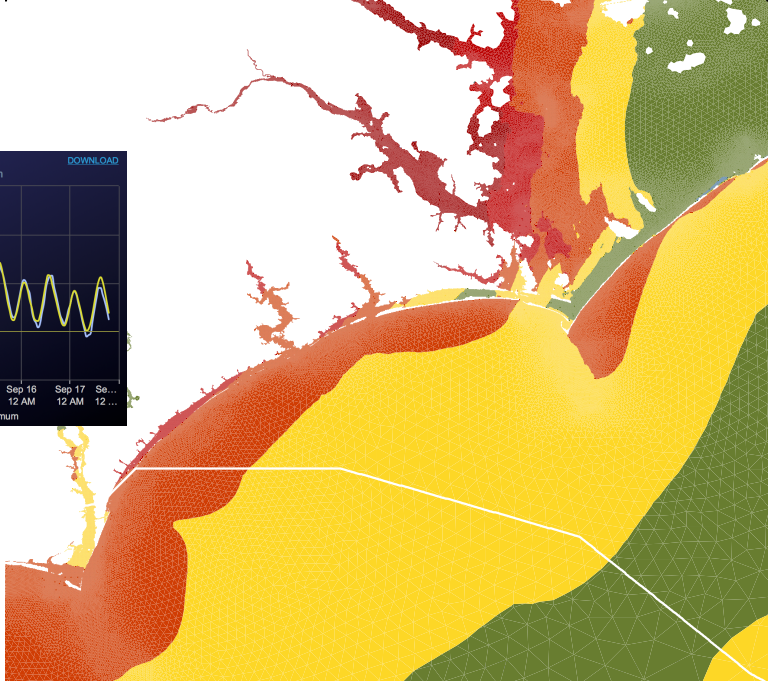
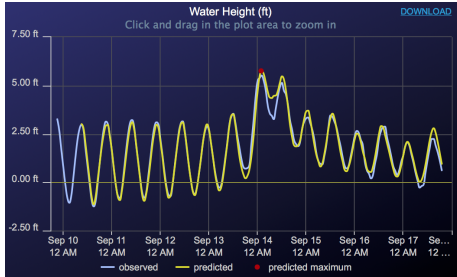
# Hurricane Florence (2018)

Adv 56 – Sep 13 Thu 5am



# Hurricane Florence (2018)

## Best-Track Hindcast



## Predictive Modeling for Hurricane Waves and Storm Surge

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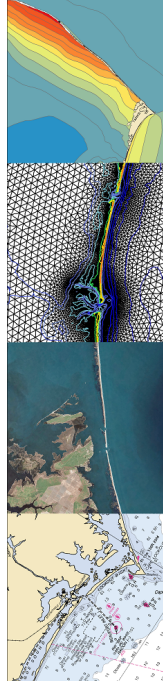
Hurricane Florence (2018)

## Improving Efficiency via Dynamic Load Balancing

Domain Decomposition

Examples of Efficiency Gains

## Summary

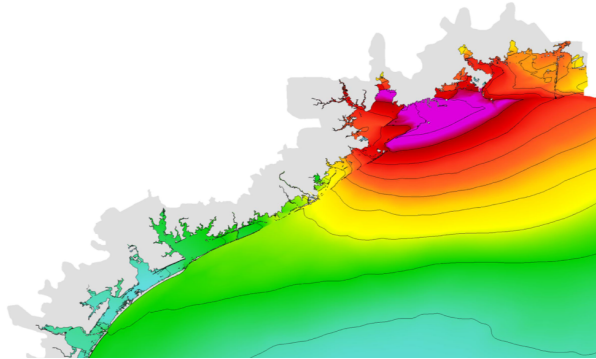
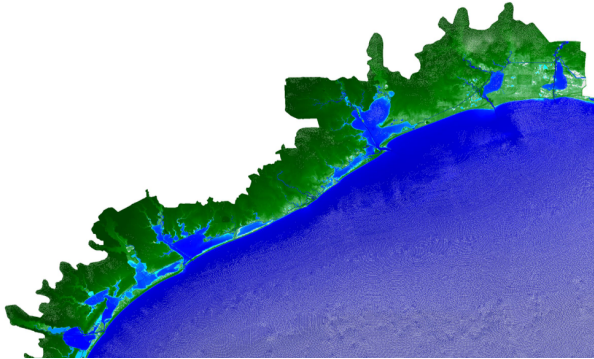


## Domain Decomposition

### What About the Dry Regions?

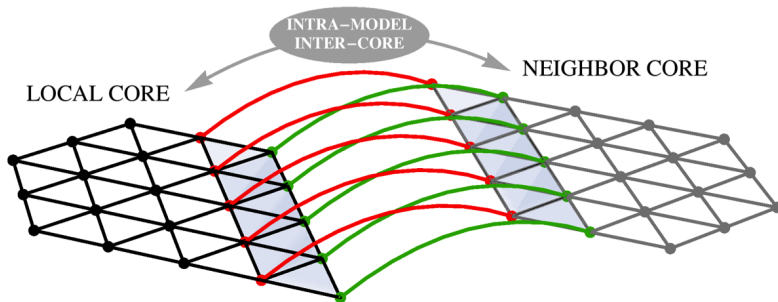
Example ADCIRC simulation for Hurricane Ike (2008):

- The mesh (on left) includes floodplains along the entire Texas coastline
- About 1/2 is wet at the start, and only 2/3 is wet at the peak inundation (on right)
- **What can we do with the 1/3 of the mesh that is never used?**



# Domain Decomposition

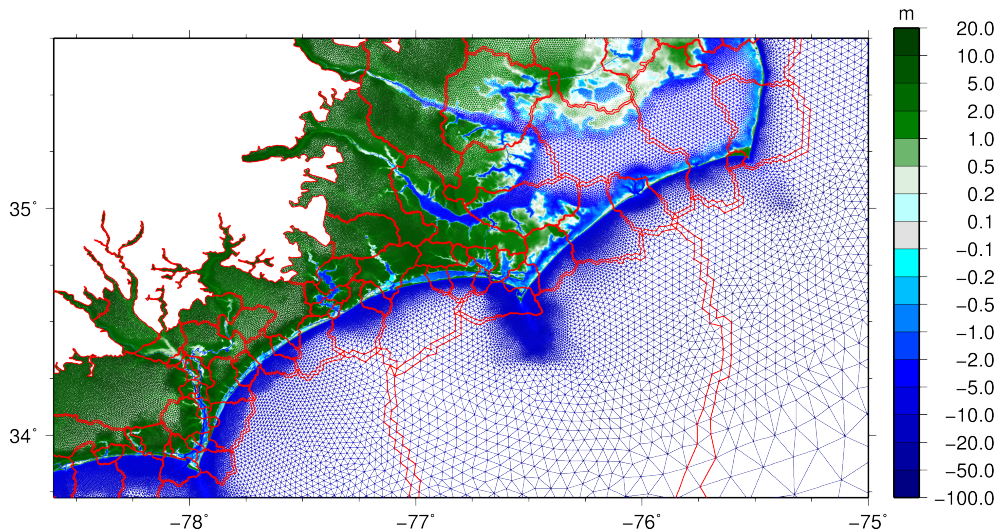
## Schematic of Parallel Communication





## Domain Decomposition

### Example for Realistic Domain





## Domain Decomposition

### Integration with Zoltan Library

Working closely with the Notre Dame team

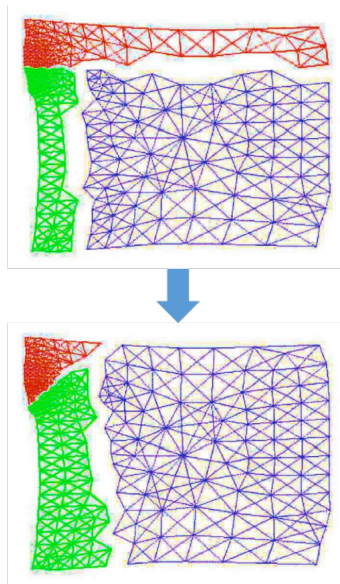
- Keith Roberts, Joannes Westerink

Integrated the **Zoltan toolkit** with ADCIRC

- Parallel, dynamic load balancing
- At checkpoints, rebalance for latest workload
- Migrate information between CPUs

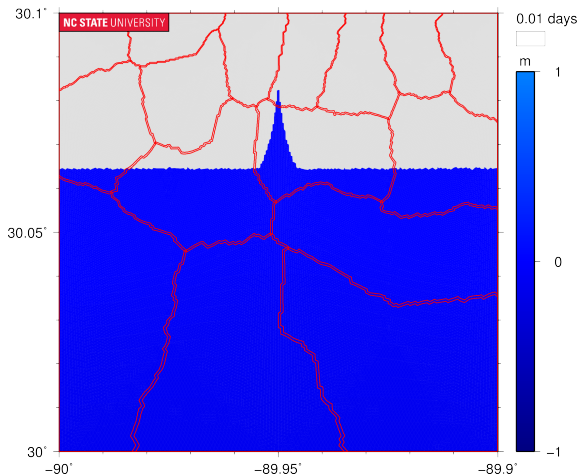
Progress in the past year:

- Streamlined the migration
- Hardened the integration
- Expanded the testing



# Examples of Efficiency Gains

## Simple Tide in Idealized Channel



## Simple channel and floodplain

- Depths from -4 m to +2 m
- Tidal range from -1 m to +1 m
- Expect a lot of wetting and drying

## Initial decomposition is sub-optimal

- 4 CPUs start fully wet
- 5 CPUs start partly wet/dry
- 6 CPUs start fully dry

Wall-clock time of about 17.6 min

## Examples of Efficiency Gains

### Simple Tide in Idealized Channel

Now the workload is rebalanced

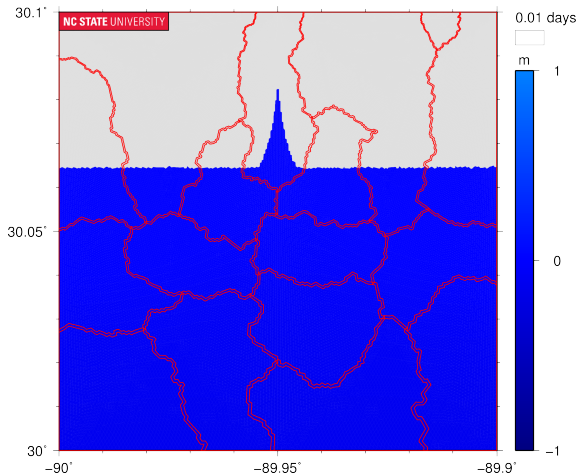
- Total of 28 migration events
- Total of 11 sec doing migration

Rebalancing during first tidal cycle

- Need to weigh cost vs benefit
- If an element is in the inter-tidal zone, then keep it wet

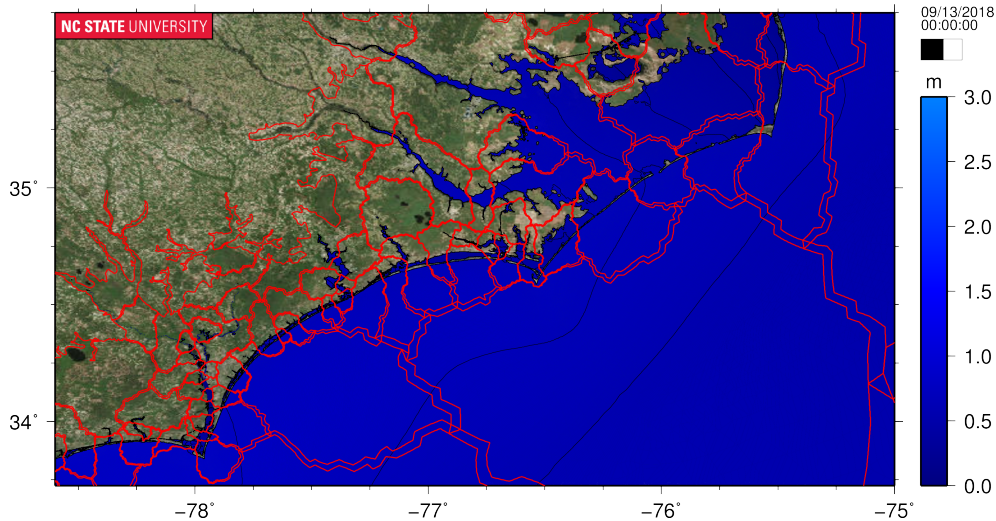
Wall-clock time of 11.2 min

- **Speed-up of 36 percent!**



## Examples of Efficiency Gains

### Florence (2008) in North Carolina



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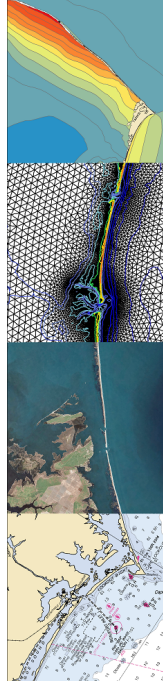
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## Summary

### Forecasting and Mapping of Coastal Flooding during Hurricanes

Real-time forecasting for coastal North Carolina:

- Available at: [www.adcirc.org](http://www.adcirc.org)
- Matthew (2016), Harvey & Irma (2017), Florence & Matthew (2018)
  - Providing guidance for multiple states
  - Every advisory and perturbations
- Working with NCEM to support their decision-making

Dynamic load balancing:

- Need to weigh cost vs benefit
  - Revised to minimize number of rebalances
  - Careful to select buffer between wet/dry
- Timings are encouraging
  - Large speed-ups (near theoretical) without sacrificing accuracy

