

Hurricane Wave and Storm Surge Forecasting for the North Carolina Coast

JC Dietrich¹, A Thomas¹, A Behnia², CN Dawson²

¹Dep't of Civil, Construction, and Environmental Engineering, NC State University

²Inst. for Computational Engineering and Sciences, University of Texas at Austin

Dep't of Civil and Environmental Engineering
Jackson State University, Jackson MS, 4 May 2016



COASTAL RESILIENCE CENTER

A U.S. Department of Homeland Security Center of Excellence



North Carolina State University

- ▶ Civil, Construction, and Environmental Engineering
 - ▶ Assistant Professor: 08/2013 to present



CCEE Department, Mann Hall, NCSU



North Carolina State University

- ▶ Civil, Construction, and Environmental Engineering
 - ▶ Assistant Professor: 08/2013 to present



University of Texas at Austin

- ▶ Institute for Computational Engineering and Sciences
 - ▶ Research Associate: 09/2012 to 07/2013
 - ▶ Postdoctoral Researcher: 11/2010 to 08/2012



University of Notre Dame

- ▶ Civil Engineering and Geological Sciences
 - ▶ Graduate Researcher: 08/2005 to 10/2010



University of Oklahoma

- ▶ Civil Engineering and Environmental Science
 - ▶ Graduate Researcher: 06/2004 to 07/2005
 - ▶ Undergraduate Researcher: 06/1999 to 05/2004



North Carolina State University

- ▶ Civil, Construction, and Environmental Engineering
 - ▶ Assistant Professor: 08/2013 to present



University of Texas at Austin

- ▶ Institute for Computational Engineering and Sciences
 - ▶ Research Associate: 09/2012 to 07/2013
 - ▶ Postdoctoral Researcher: 11/2010 to 08/2012



University of Notre Dame

- ▶ Civil Engineering and Geological Sciences
 - ▶ Graduate Researcher: 08/2005 to 10/2010



University of Oklahoma

- ▶ Civil Engineering and Environmental Science
 - ▶ Graduate Researcher: 06/2004 to 07/2005
 - ▶ Undergraduate Researcher: 06/1999 to 05/2004

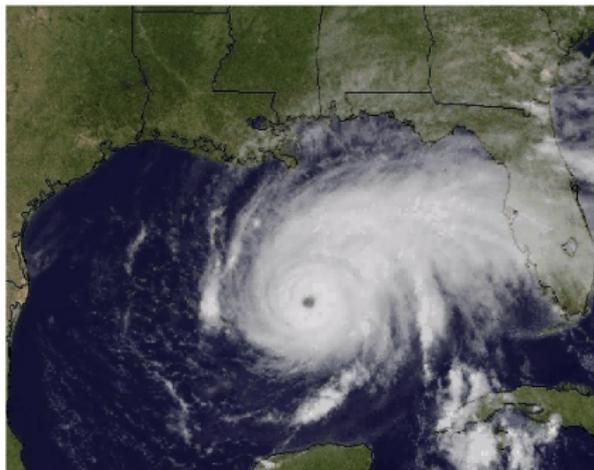
Hurricane Season 2005

Impacts on Southern Louisiana

Katrina: 08/28 - 08/29

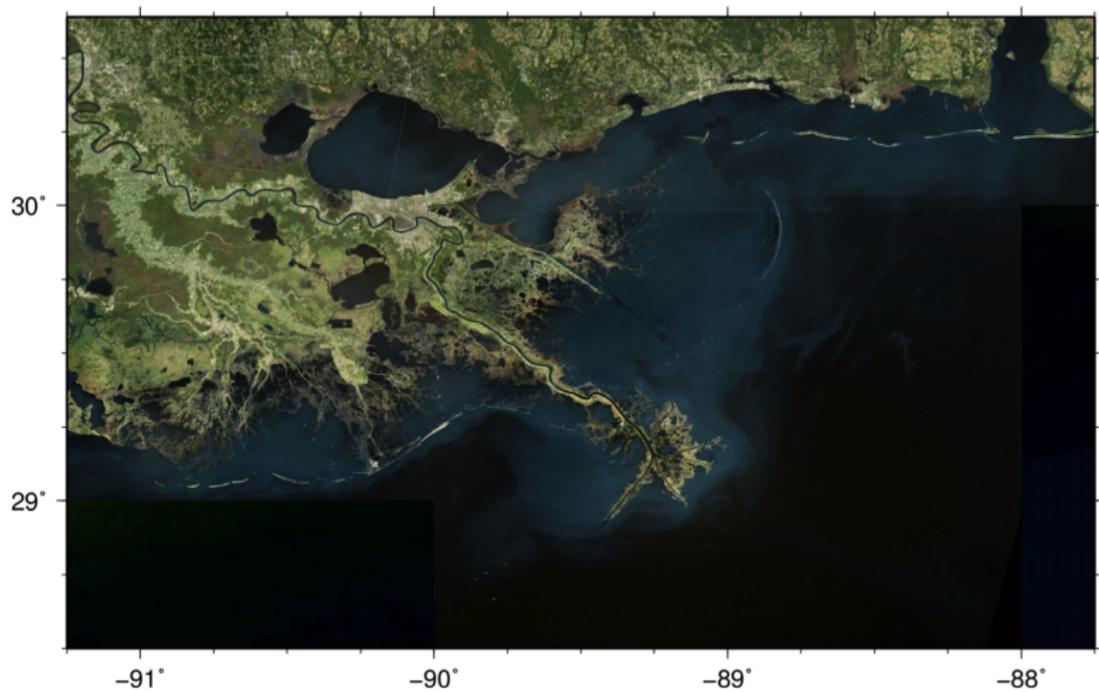


Rita: 09/22 - 09/24



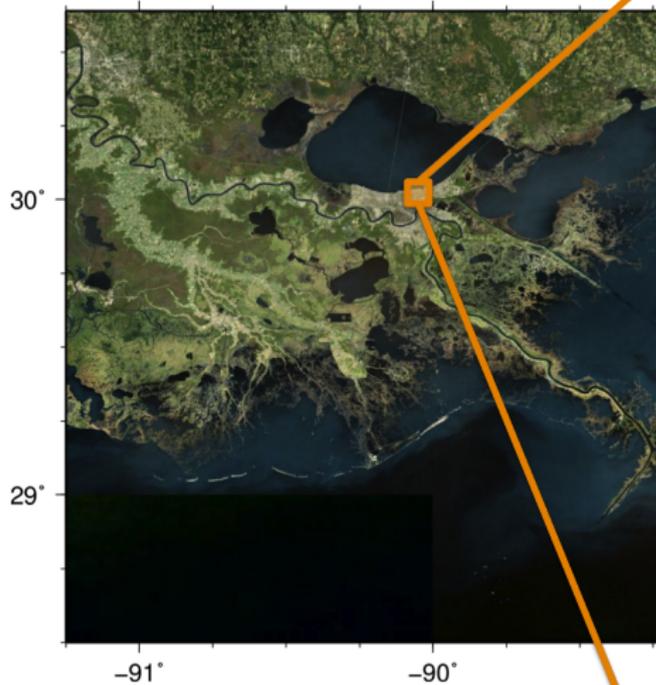
Hurricane Season 2005

Flooding of New Orleans



Hurricane Season 2005

Flooding of New Orleans



April/September 2000

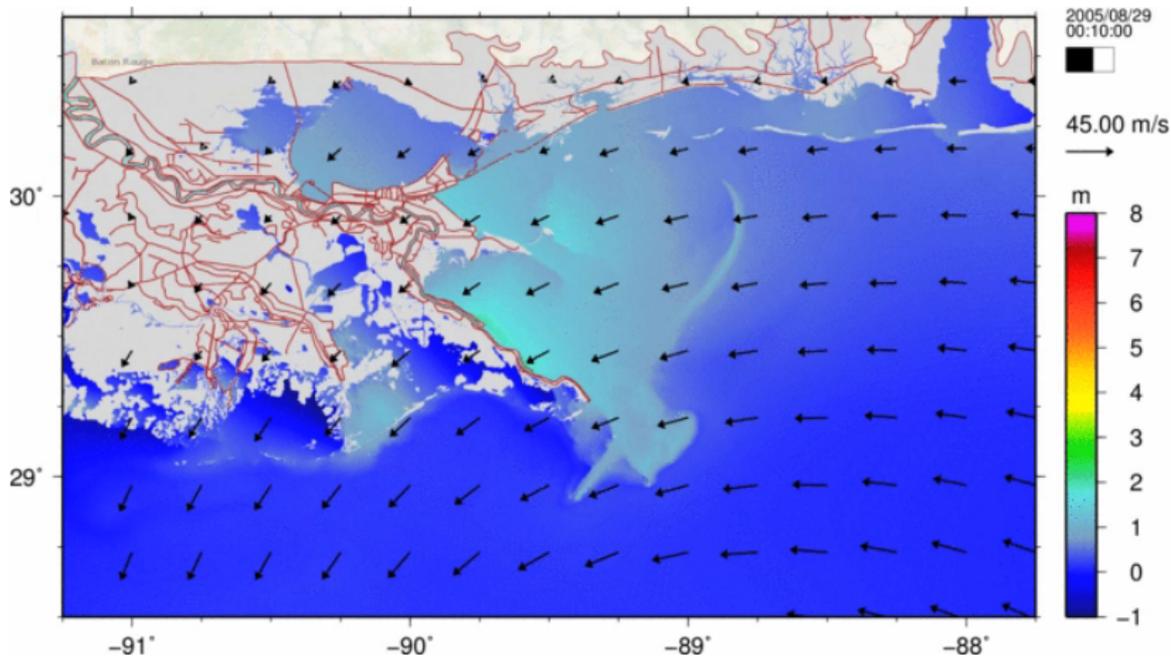


13 September 2005



Hurricane Season 2005

Katrina (2005) on 29 August

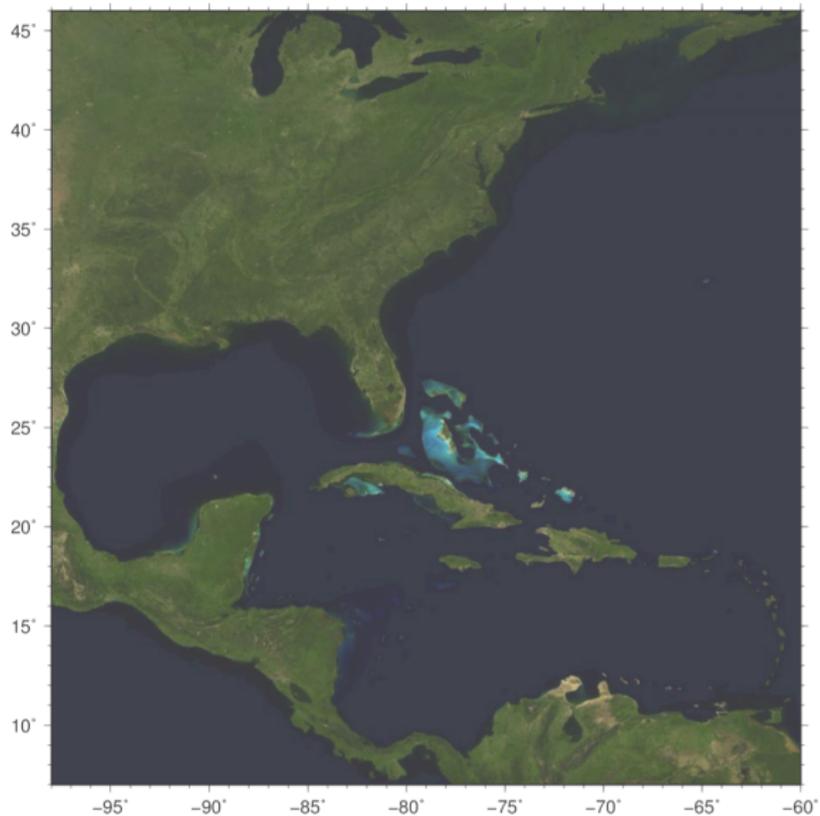


S Buna, JC Dietrich, *et al.* (2010). A High-Resolution Coupled Riverine Flow, Tide, Wind, Wind Wave and Storm Surge Model for Southern Louisiana and Mississippi: Part I – Model Development and Validation. *Monthly Weather Review*, 138(2), 345-377.

JC Dietrich, *et al.* (2010). A High-Resolution Coupled Riverine Flow, Tide, Wind, Wind Wave and Storm Surge Model for Southern Louisiana and Mississippi: Part II – Synoptic Description and Analysis of Hurricanes Katrina and Rita. *Monthly Weather Review*, 138(2), 378-404.

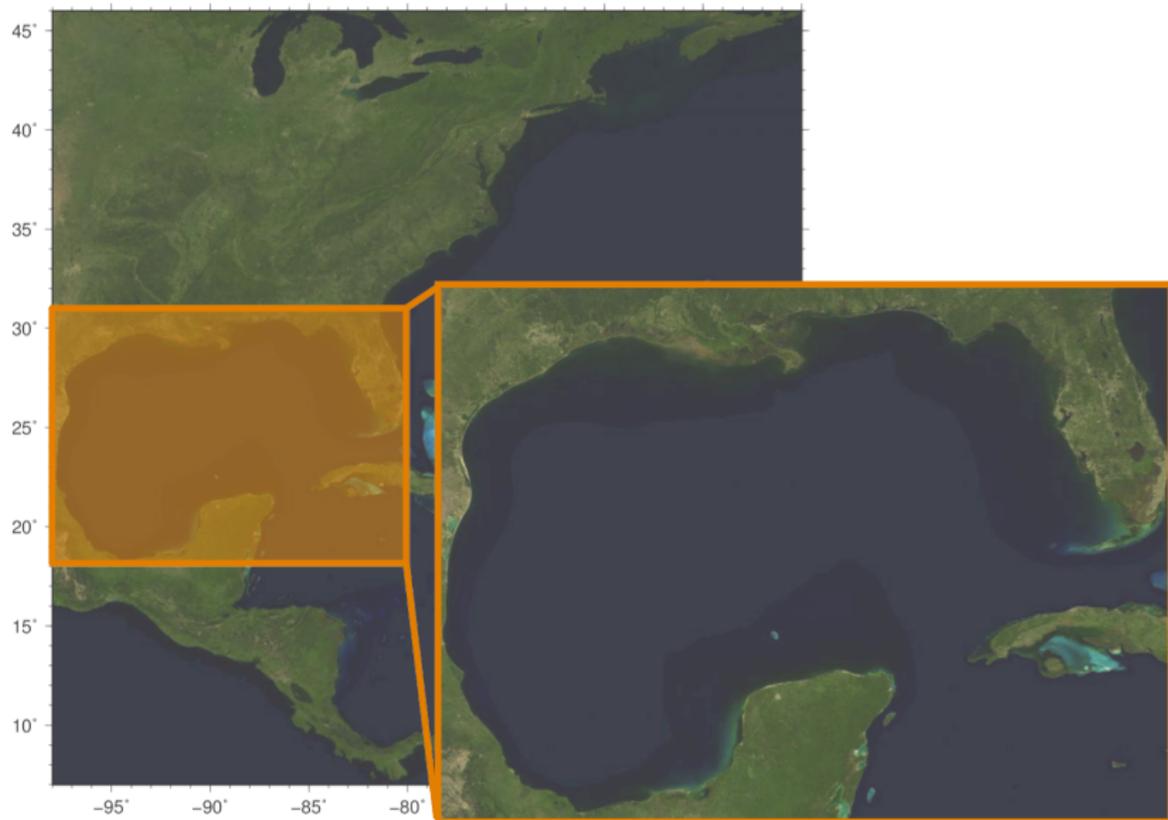
Wide Range of Spatial Scales

Gulf and Atlantic Coasts



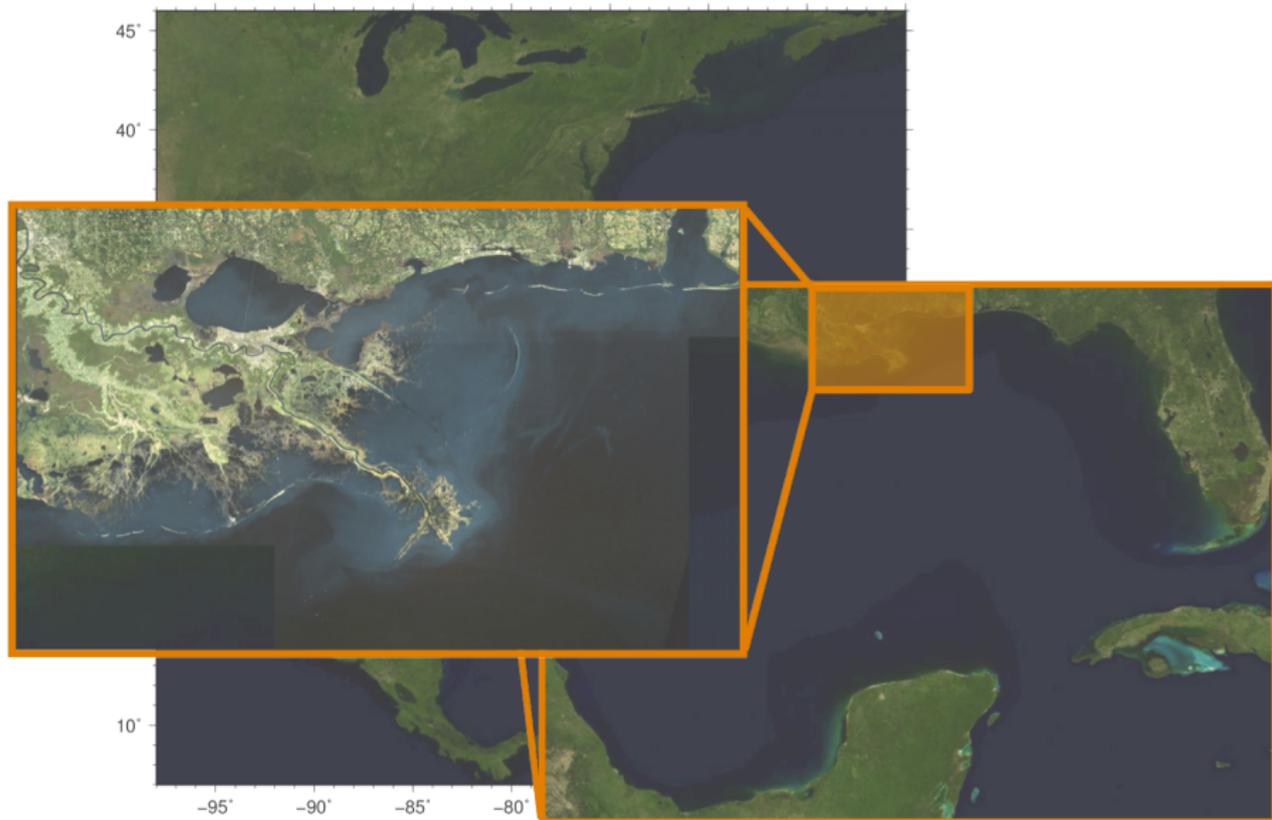
Wide Range of Spatial Scales

Gulf and Atlantic Coasts



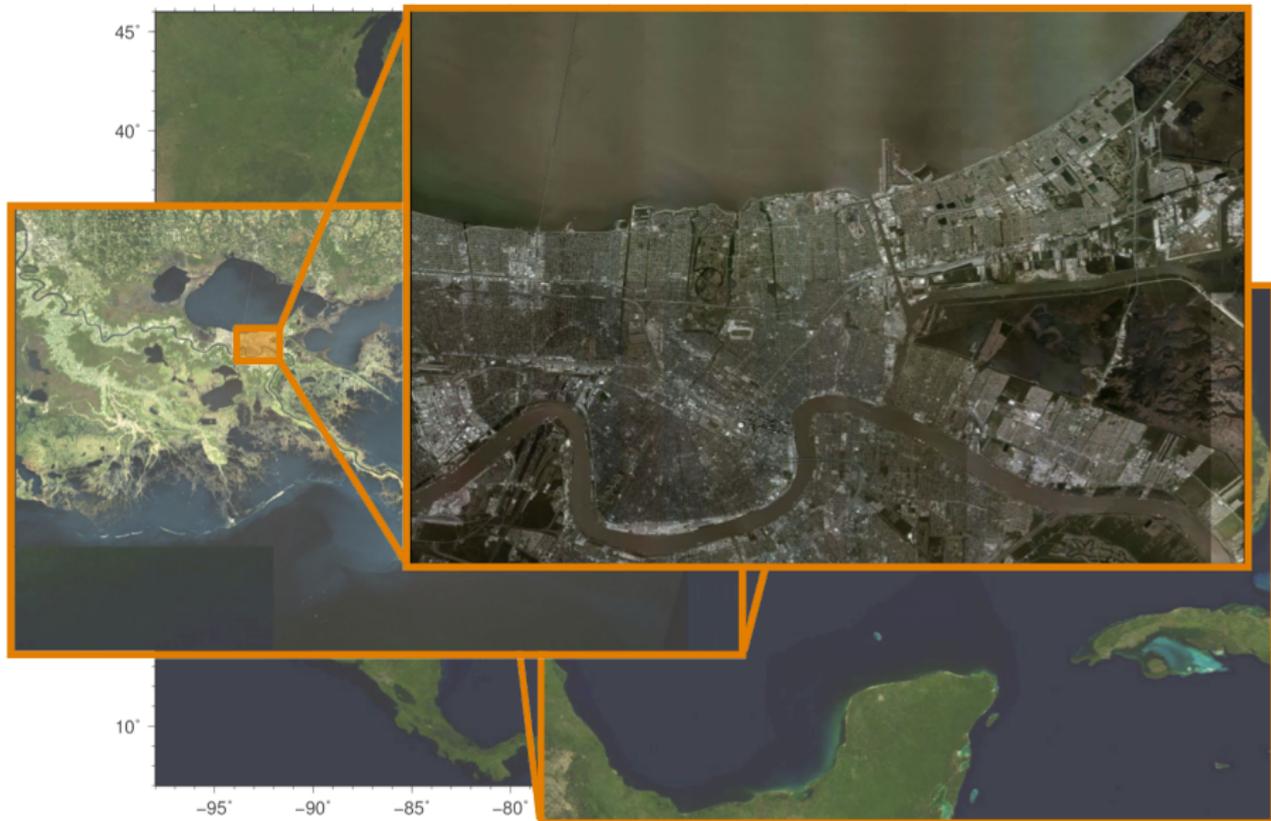
Wide Range of Spatial Scales

Gulf and Atlantic Coasts



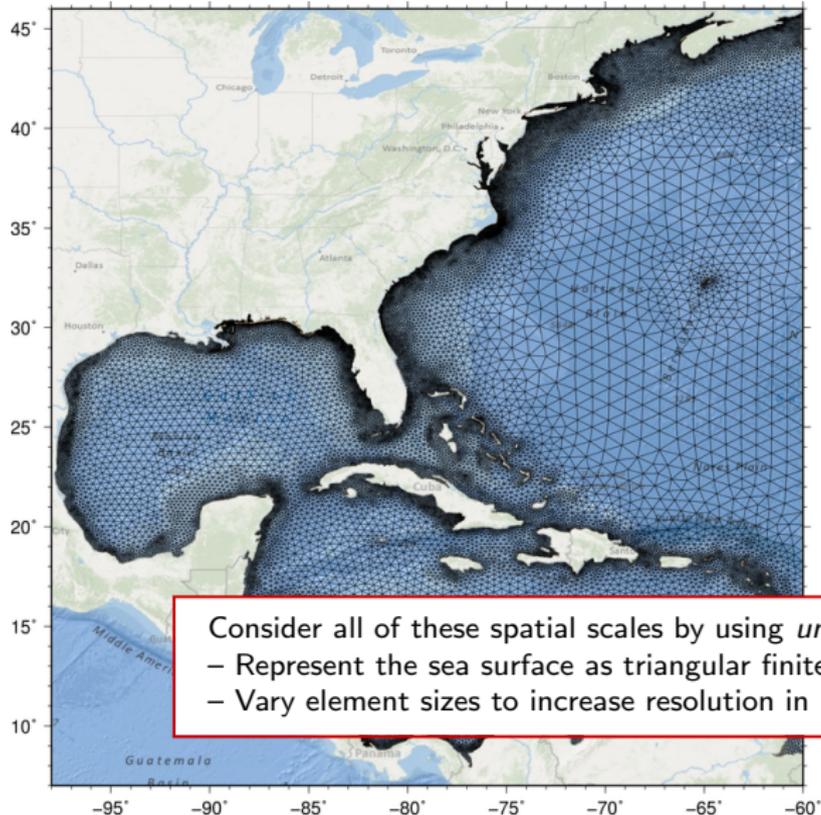
Wide Range of Spatial Scales

Gulf and Atlantic Coasts



Wide Range of Spatial Scales

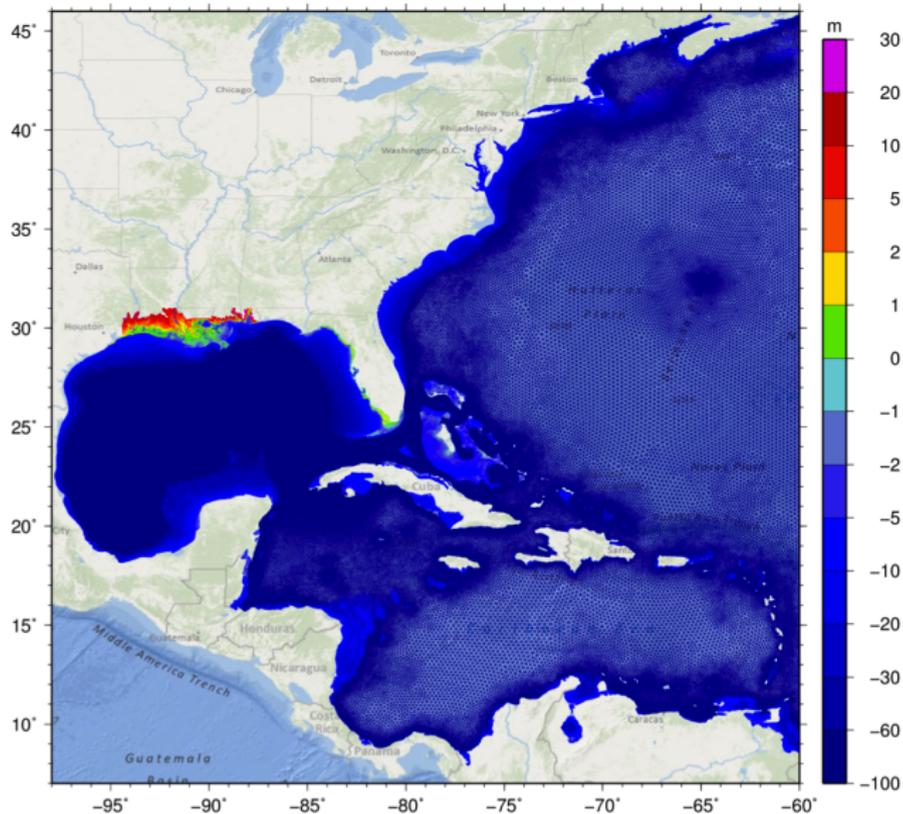
Unstructured, Finite-Element Meshes



- 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

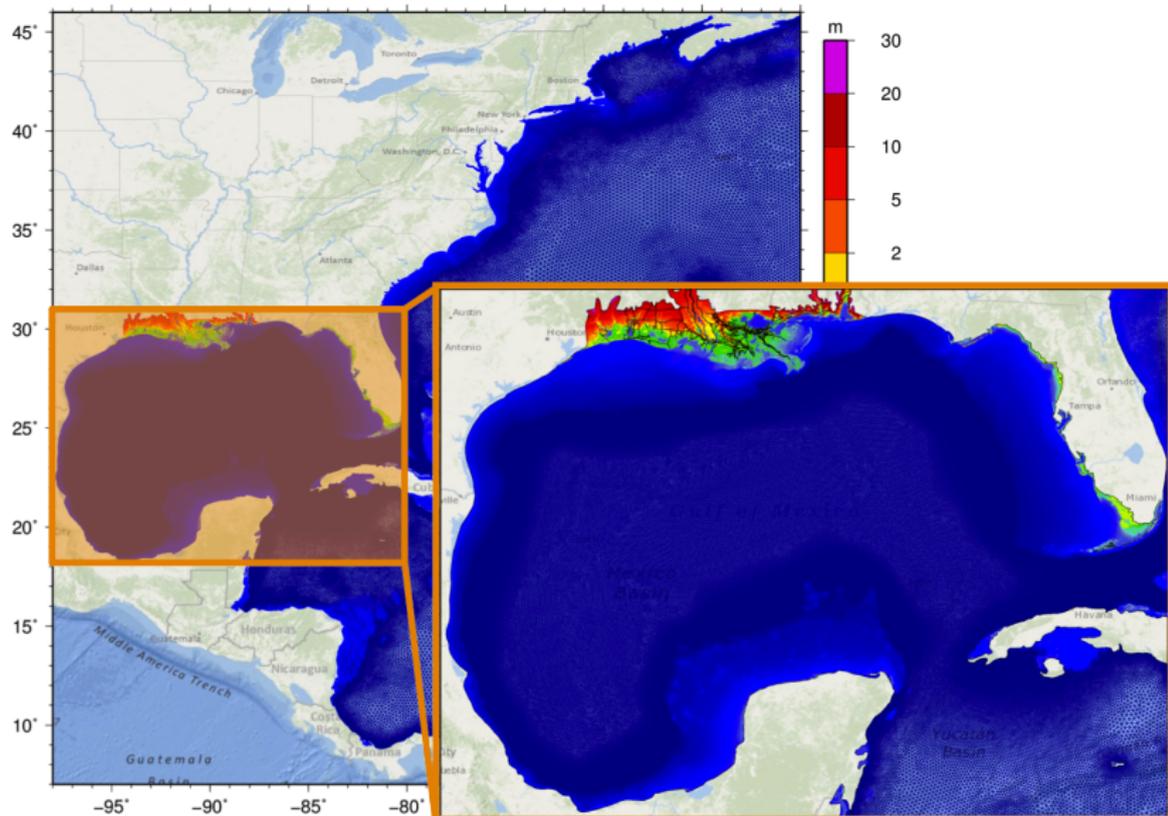
Wide Range of Spatial Scales

SL16 Mesh for Southern Louisiana



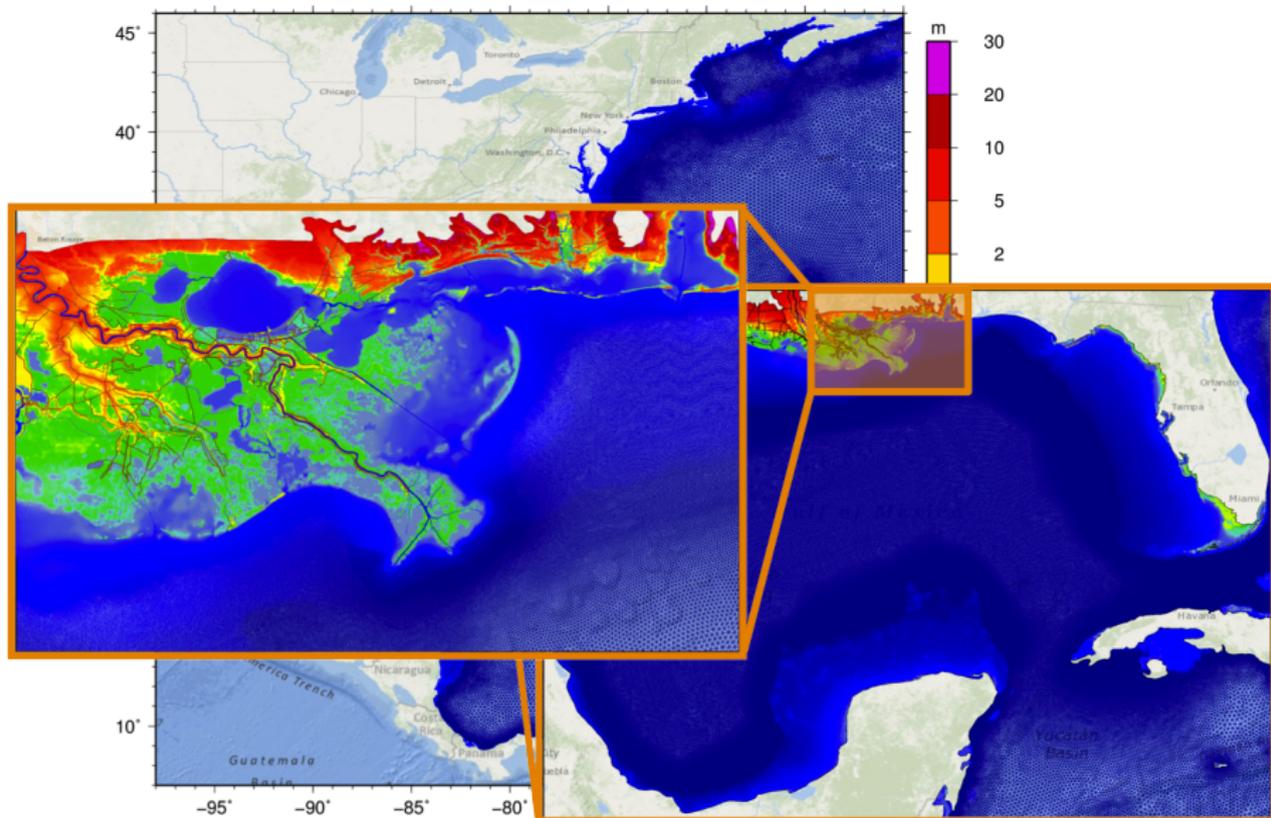
Wide Range of Spatial Scales

SL16 Mesh for Southern Louisiana



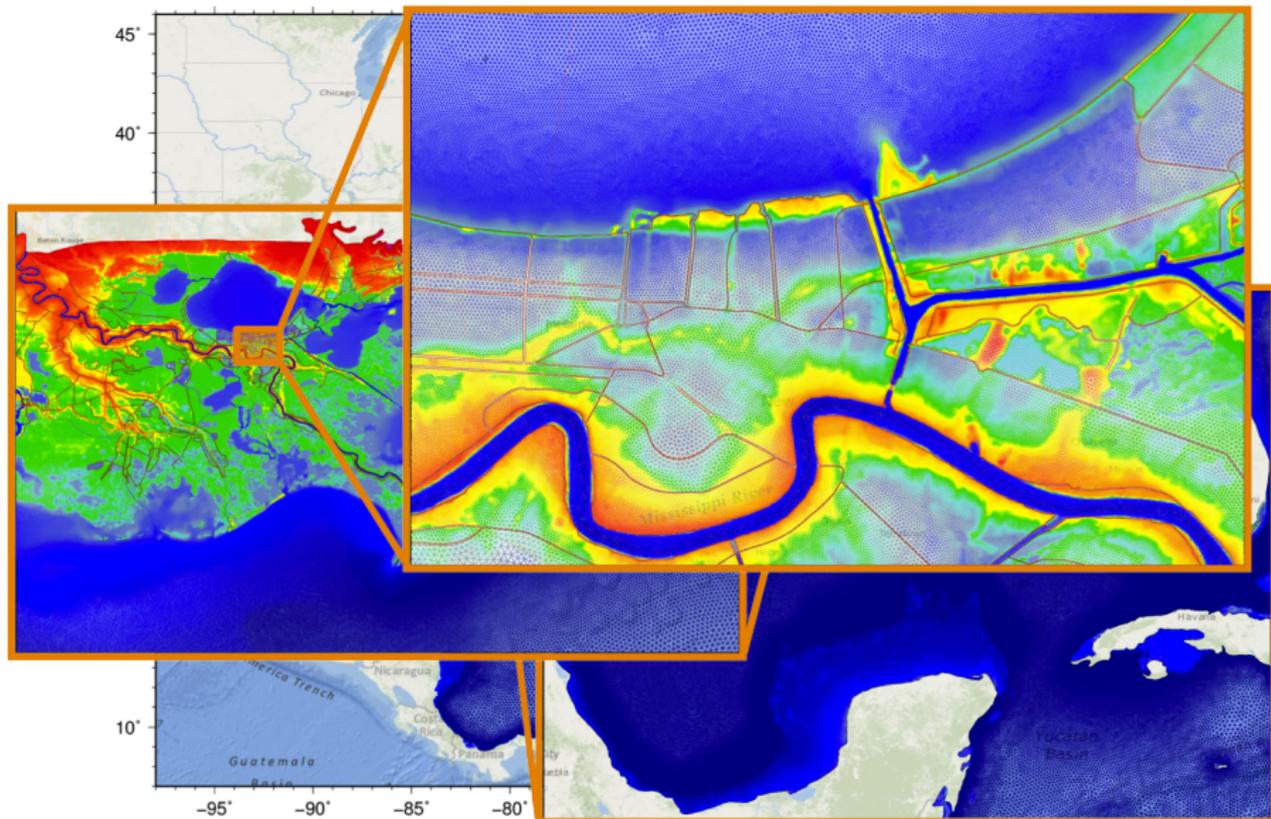
Wide Range of Spatial Scales

SL16 Mesh for Southern Louisiana



Wide Range of Spatial Scales

SL16 Mesh for Southern Louisiana

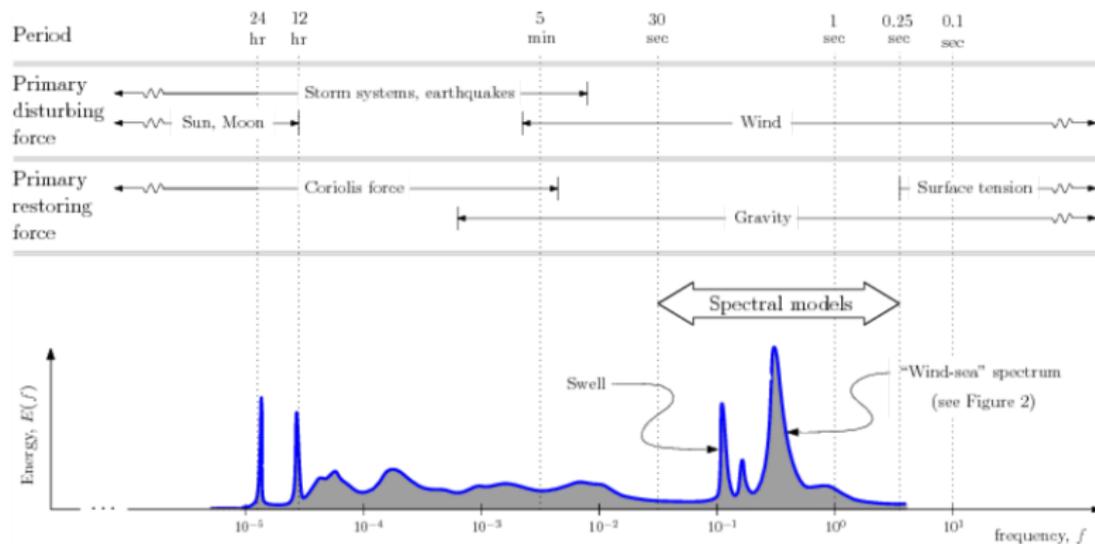


Waves and Storm Surge

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

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:

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

Solution methods in geographic (x, y) and spectral (σ, θ) spaces:

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

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 for water levels ζ :

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

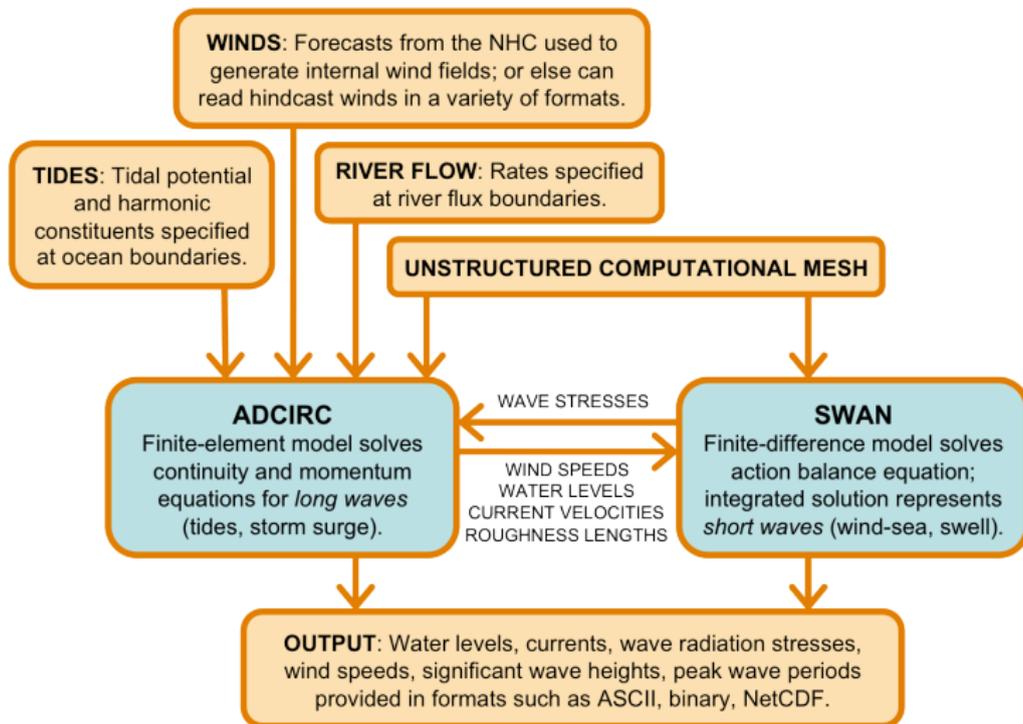
Solves the depth-averaged momentum equations for currents (U, V):

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

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

Tight Coupling of SWAN+ADCIRC

Flow Chart

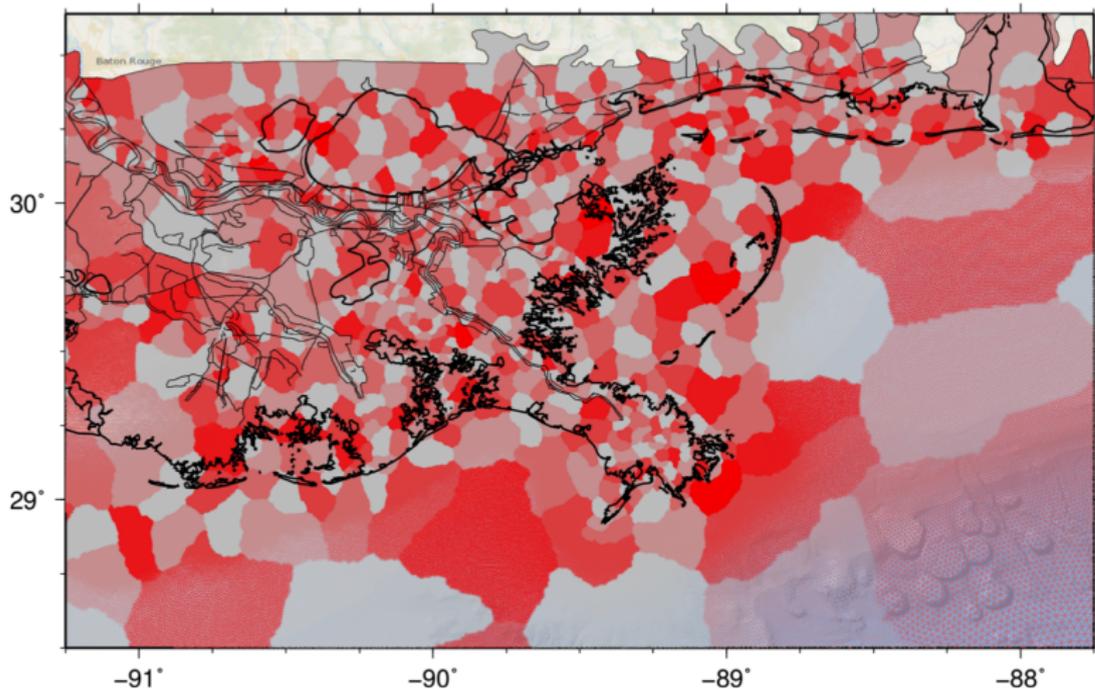


Tight Coupling of SWAN+ADCIRC

Domain Decomposition

Large-scale problem is cut into thousands of small-scale problems

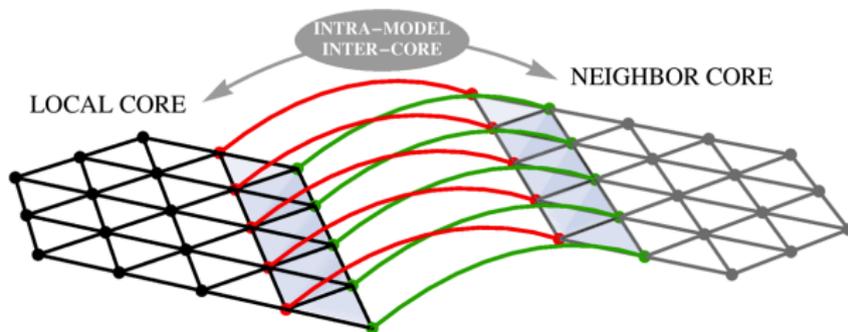
- ▶ Each computational core works on its own sub-mesh



Tight Coupling of SWAN+ADCIRC

Parallel Communication

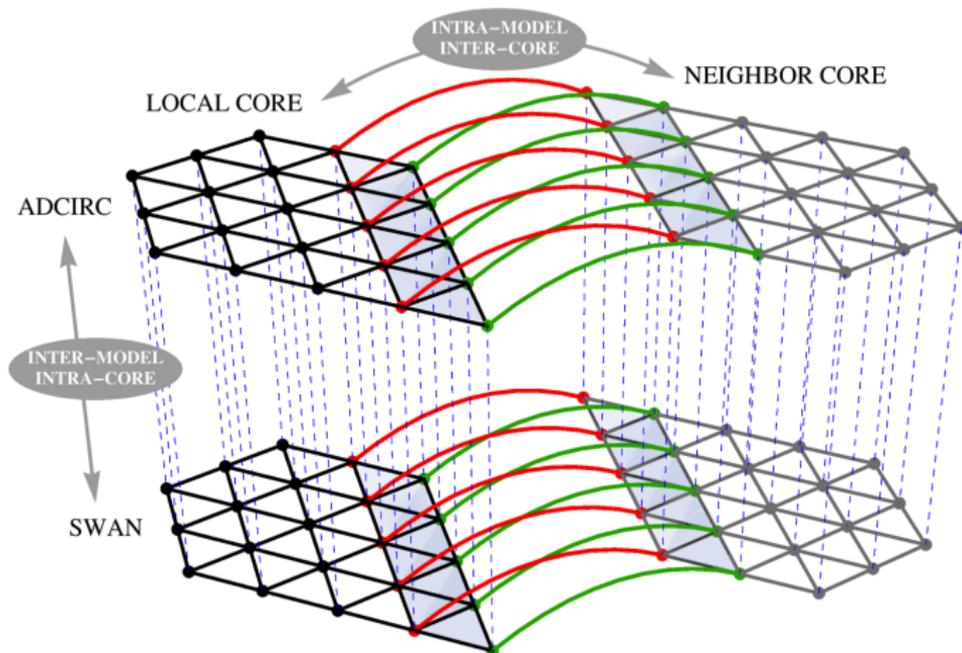
Communication between cores at sub-mesh boundaries



Tight Coupling of SWAN+ADCIRC

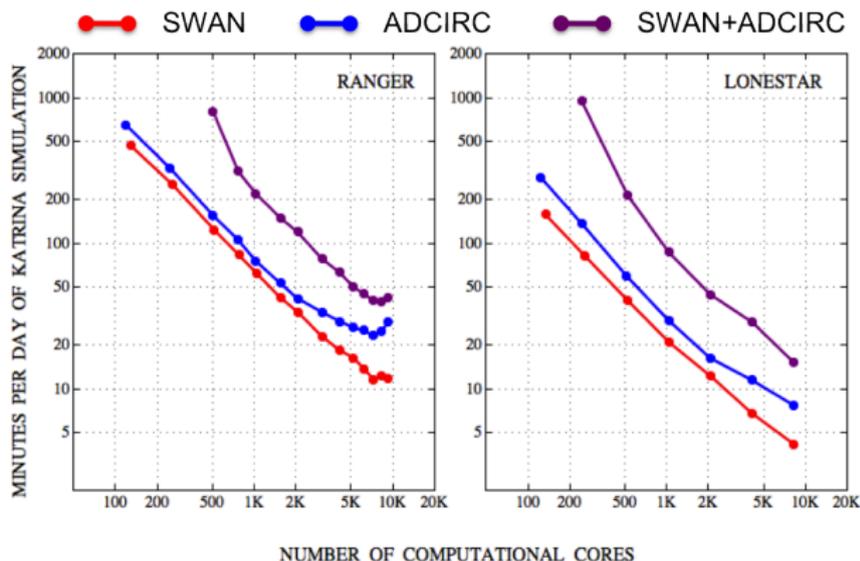
Parallel Communication

Communication between cores at sub-mesh boundaries



Tight Coupling of SWAN+ADCIRC

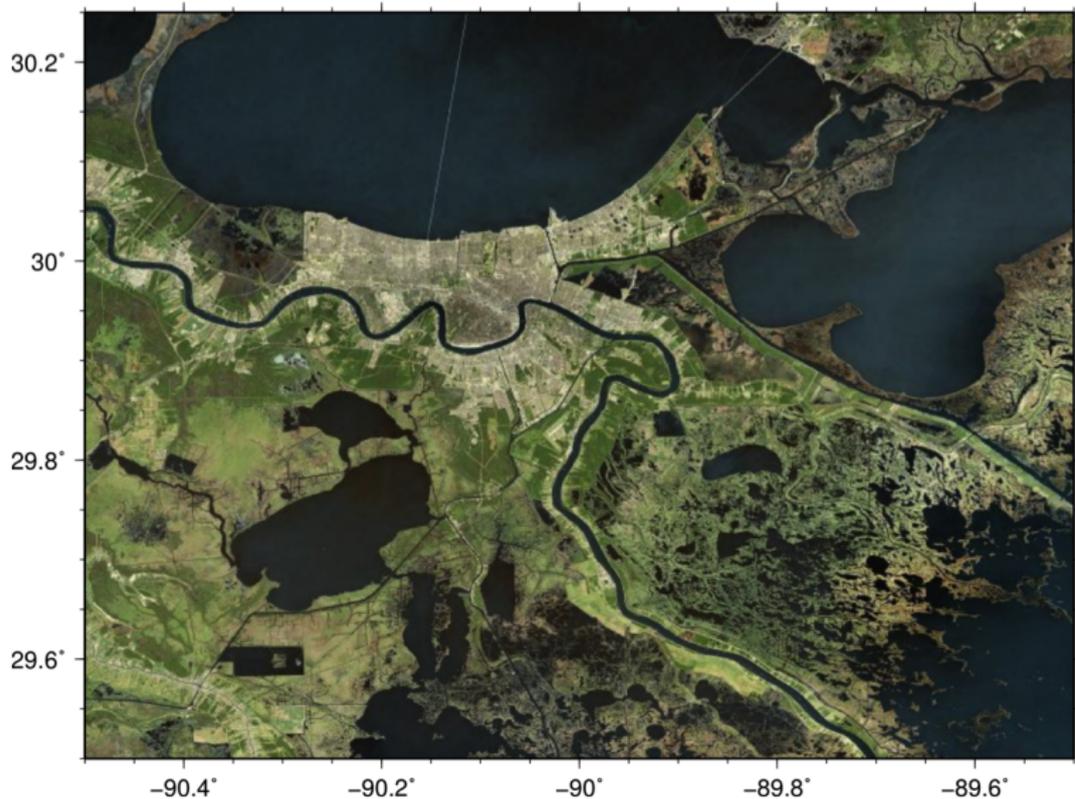
Parallel Scaling



	TACC Ranger	TACC Lonestar
Node	Sun Blade x6420	Dell PowerEdge M610
CPU	4 Quad-core AMD Opteron 8356	2 Six-core Xeon 5680
Frequency	2.3 GHz	3.33 GHz
Architecture	AMD K10 (Barcelona)	Intel Nehalem (Westmere-EP)

Engineering Applications

Surge Barrier Design with the USACE



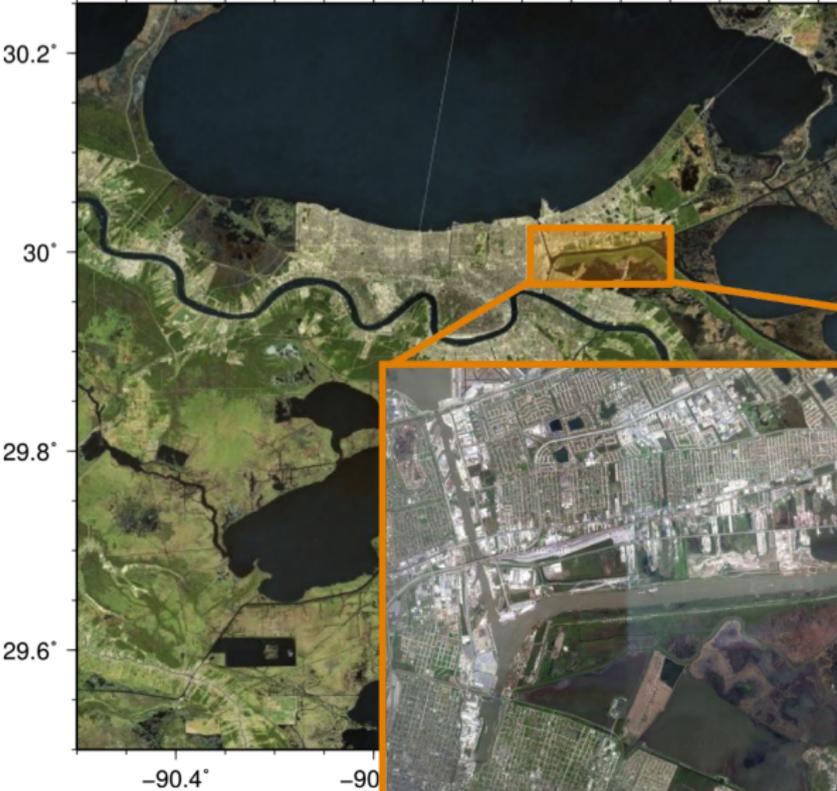
Engineering Applications

Surge Barrier Design with the USACE



Engineering Applications

Surge Barrier Design with the USACE

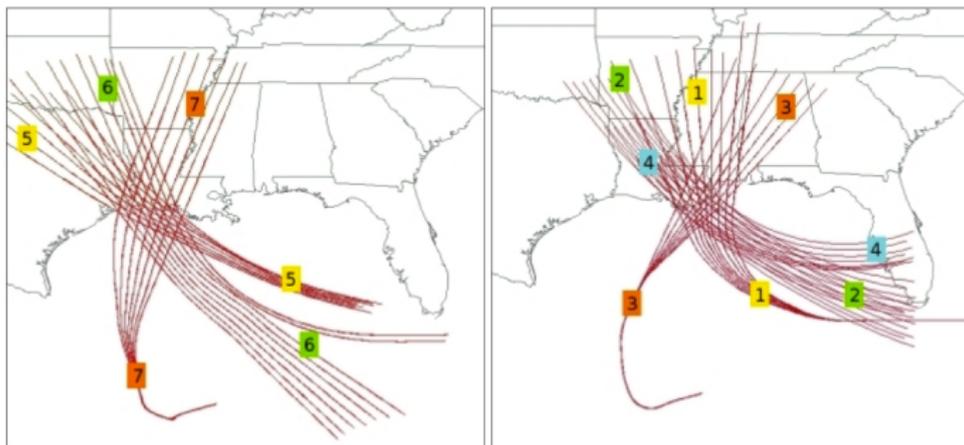


Engineering Applications

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

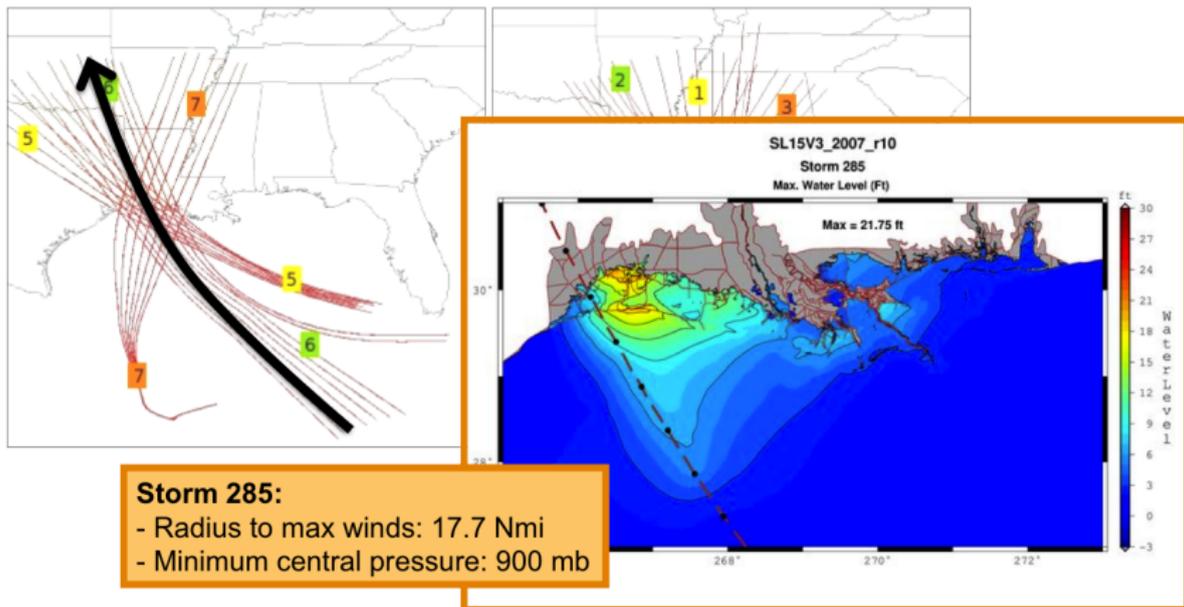


Engineering Applications

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



Real-Time Forecasting

North Carolina Forecasting System (NCFS)

In North Carolina, the guidance is available from the Coastal Emergency Risks Assessment (CERA) team:

- ▶ Shared via Web portal: nc-cera.renci.org

Updated often with new guidance:

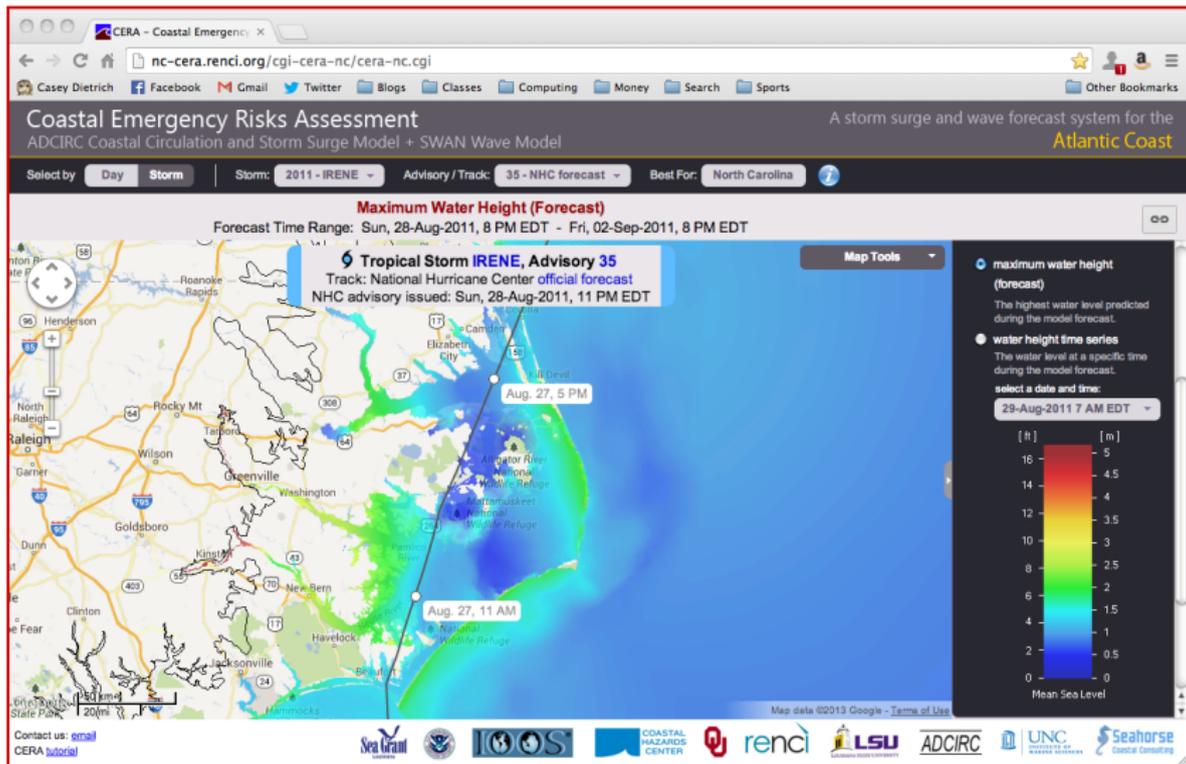
- ▶ Normal conditions with base meteorology from NOAA/NCEP
- ▶ Extreme conditions with storm advisories from NOAA/NHC

Guidance is interactive within Google Maps:

- ▶ View results as a time series or as maxima
- ▶ Select layers for:
 - ▶ Water levels (above MSL or above ground)
 - ▶ Waves (significant heights, peak periods)
 - ▶ Wind speeds
 - ▶ Hydrographs at NOAA/NOS gage stations

Real-Time Forecasting

Example during Irene (2011): nc-cera.renci.org



Dynamic Load Balancing

Initial Progress for DHS CRCoE Project

Motivation:

- ▶ Predictive models are costly
- ▶ Hundreds or even thousands of CPUs, hours of wall-clock time
- ▶ Why spend resources on regions that are never flooded by the storm?

Dynamic load balancing:

- ▶ Assign an equal amount of wet regions to each core
- ▶ Reallocate computational resources to improve parallel efficiency
- ▶ Each core will be responsible for developing its own subdomain

Initial attempts:

- ▶ Optimize the initial domain decomposition
- ▶ Decomposition is still static for now

Dynamic Load Balancing

History of Domain Decomposition in ADCIRC

We use METIS to decompose our domain

- ▶ Separate library, written in C, developed at Univ. Minnesota
- ▶ Weights based on the number of edges connected to each vertex
- ▶ METIS tries to equalize the weights across the subdomains

Our preprocessor (`adcprep`) was written about 15-18 years ago

- ▶ Our domains were entirely wet – oceans and coastal regions
- ▶ No floodplains or dry regions to consider in the decomposition
- ▶ Initial decomposition was static

Need to revise the domain decomposition

- ▶ Equal amounts of wet and dry to each core
- ▶ Make ADCIRC skip computations on dry vertices

Dynamic Load Balancing

Changes to adcprep Preprocessor

Now METIS is called twice

- ▶ Called first to decompose only the wet regions
- ▶ Called again to decompose only the dry regions

Each core is assigned one wet region, and one dry region

- ▶ This way, each core will be contributing to the workload
- ▶ Work is balanced at start of simulation
- ▶ May become imbalanced due to wetting / drying during simulation

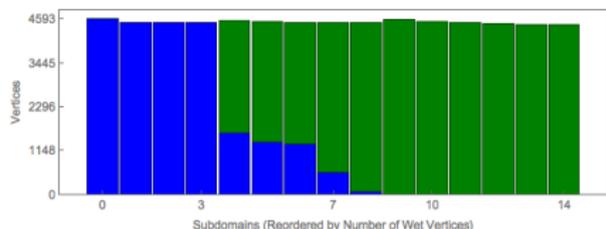
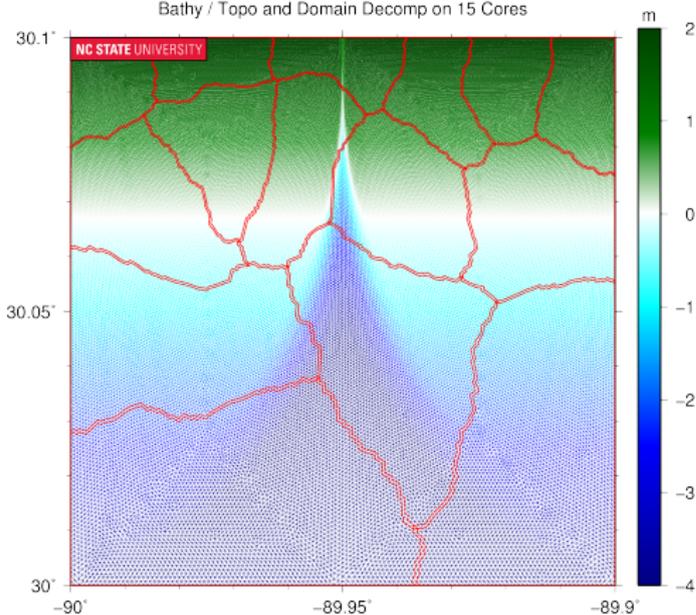
No guarantee that each core's wet and dry regions will be connected

- ▶ One core may have two subdomains that are far from each other
- ▶ Potential problem for large domains – we are increasing the communication

Test Case 1 – Ideal Channel and Floodplain

Initial Domain Decomposition

Bathy / Topo and Domain Decomp on 15 Cores



First test case is channel and floodplain:

- Ideal mesh: 64,415 vertices
- Shallow depths from -4m to +2m
- Tidal range from -1m to +1m

So we expect a lot of wetting/drying:

- Roughly 1/3 of the domain by size
- More of the domain by resolution

Initial decomposition is sub-optimal:

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

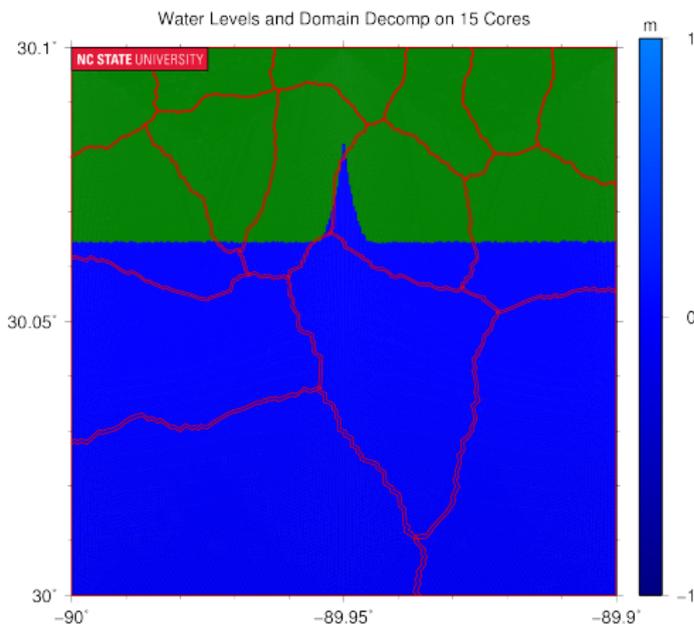
Simulation of 4 days:

- Eight tidal cycles
- Extensive wetting and drying
- Some cores are always dry

Wall-clock time of ~ 17.8 min

Test Case 1 – Ideal Channel and Floodplain

Initial Domain Decomposition



First test case is channel and floodplain:

- Ideal mesh: 64,415 vertices
- Shallow depths from -4m to $+2\text{m}$
- Tidal range from -1m to $+1\text{m}$

So we expect a lot of wetting/drying:

- Roughly $1/3$ of the domain by size
- More of the domain by resolution

Initial decomposition is sub-optimal:

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

Simulation of 4 days:

- Eight tidal cycles
- Extensive wetting and drying
- Some cores are always dry

Wall-clock time of ~ 17.8 min

Test Case 1 – Ideal Channel and Floodplain

Optimizing Initial Decomposition for Wet Vertices

We optimized the decomposition:

- All cores are both wet and dry

Changes to adcprep:

- METIS called twice
- Weights only on vertices (not edges)
- Separate subdomains for wet and dry

For example, core 0000:

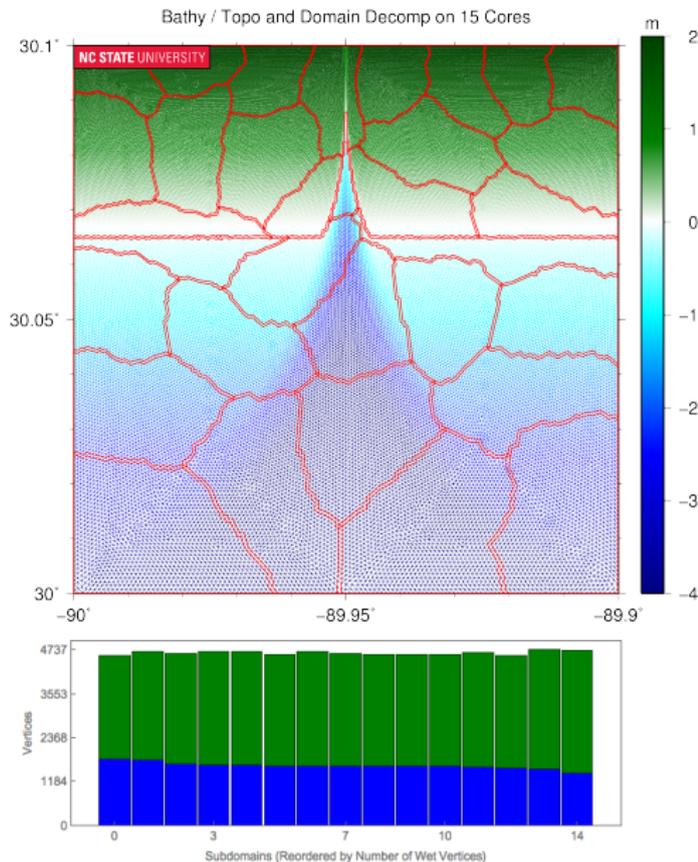
- Wet region with 1591 vertices
- Dry region with 3013 vertices
- Not guaranteed to connect

Now every core is contributing

- Still imbalances during tidal cycle

Wall-clock time of ~ 13.1 min

- Speedup of **26 percent**



Test Case 1 – Ideal Channel and Floodplain

Optimizing Initial Decomposition for Wet Vertices

We optimized the decomposition:

- All cores are both wet and dry

Changes to adcprep:

- METIS called twice
- Weights only on vertices (not edges)
- Separate subdomains for wet and dry

For example, core 0000:

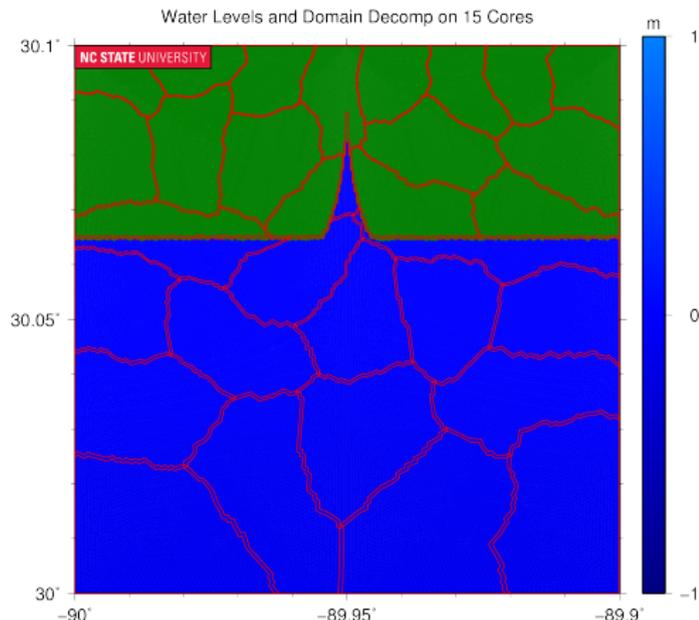
- Wet region with 1591 vertices
- Dry region with 3013 vertices
- Not guaranteed to connect

Now every core is contributing

- Still imbalances during tidal cycle

Wall-clock time of ~ 13.1 min

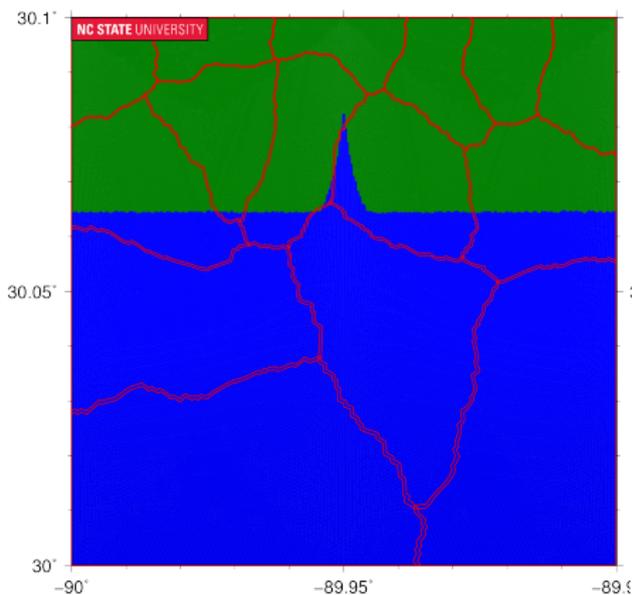
- Speedup of **26 percent**



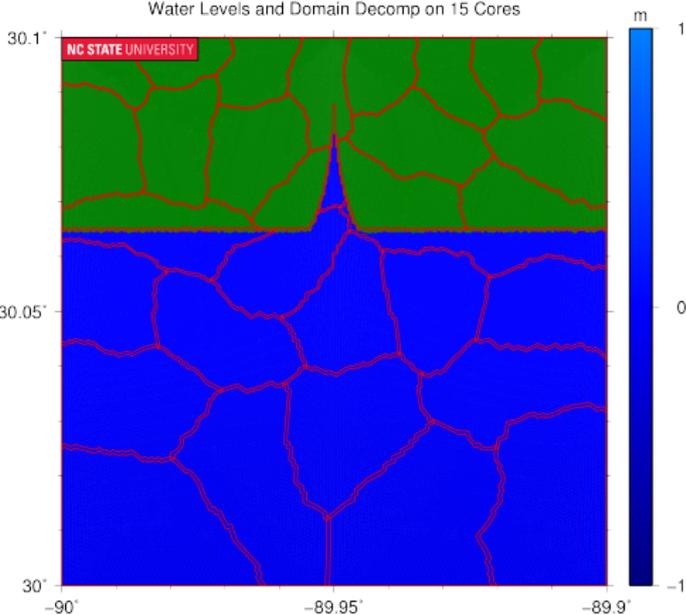
Test Case 1 – Ideal Channel and Floodplain

Water Level Comparison and Timings

Water Levels and Domain Decomp on 15 Cores



Water Levels and Domain Decomp on 15 Cores

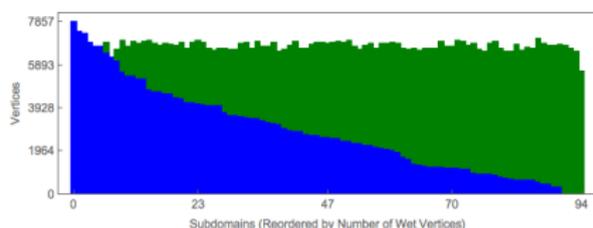
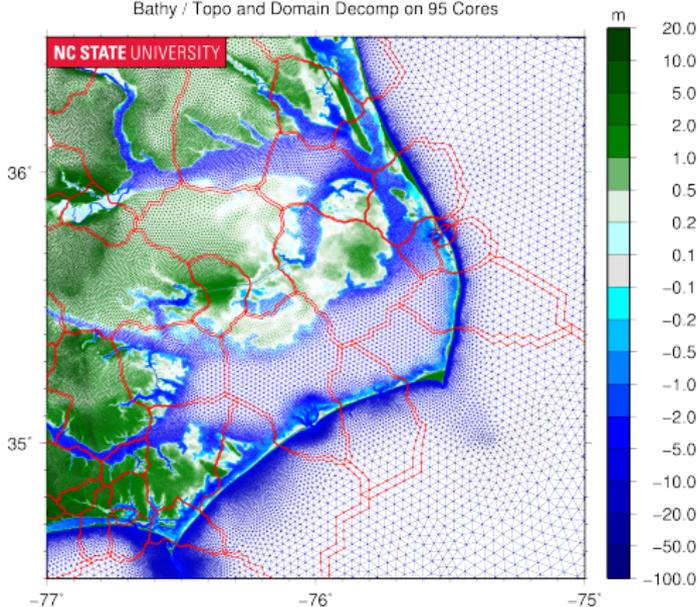


Test	Code Version	Cores	CPU-hr	% Change
Wet/Dry	ADCIRC v52.22 + load balancing	15	4.46 3.29	- 26.3

Test Case 2 – Hurricane Irene (2011) on NC9

Initial Domain Decomposition

Bathy / Topo and Domain Decomp on 95 Cores



Second test case is Irene (2011):

- NC9 mesh: 622,946 vertices

Should be a lot of wetting/drying:

- Roughly 1/2 of domain starts dry
- Flooding of NC coastal regions

Initial decomposition is sub-optimal:

- Only 7 cores start fully wet
- Most cores are mostly dry

Simulation of 8 days:

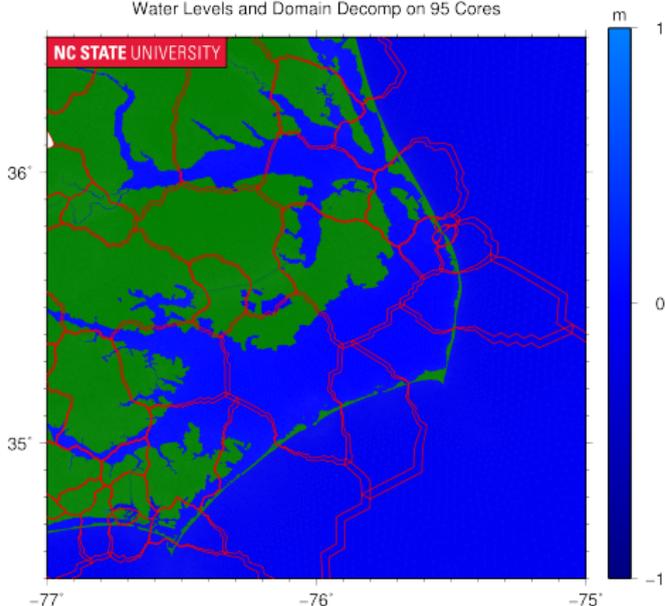
- Initial flooding in SW Pamlico Sound
- Sound-side flooding of Hatteras Island

Wall-clock time of 3.52 hr

Test Case 2 – Hurricane Irene (2011) on NC9

Initial Domain Decomposition

Water Levels and Domain Decomp on 95 Cores



Second test case is Irene (2011):

- NC9 mesh: 622,946 vertices

Should be a lot of wetting/drying:

- Roughly 1/2 of domain starts dry
- Flooding of NC coastal regions

Initial decomposition is sub-optimal:

- Only 7 cores start fully wet
- Most cores are mostly dry

Simulation of 8 days:

- Initial flooding in SW Pamlico Sound
- Sound-side flooding of Hatteras Island

Wall-clock time of 3.52 hr

Test Case 2 – Hurricane Irene (2011) on NC9

Optimizing Initial Decomposition for Wet Vertices

We optimized the decomposition:

- All cores are both wet and dry
- Domain boundaries follow shoreline
- Channels separate from floodplains

Domain not decomposed equally:

- Some cores have more wet / dry
- Reflects complexity of mesh

For example, core 0000:

- Wet region with 2274 vertices
- Dry region with 5479 vertices

For example, core 0001:

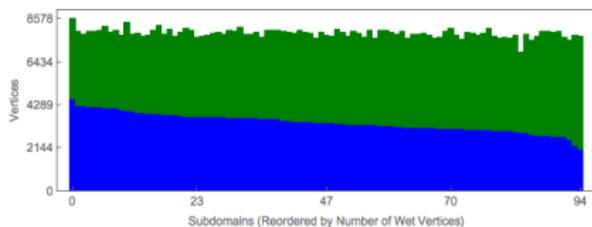
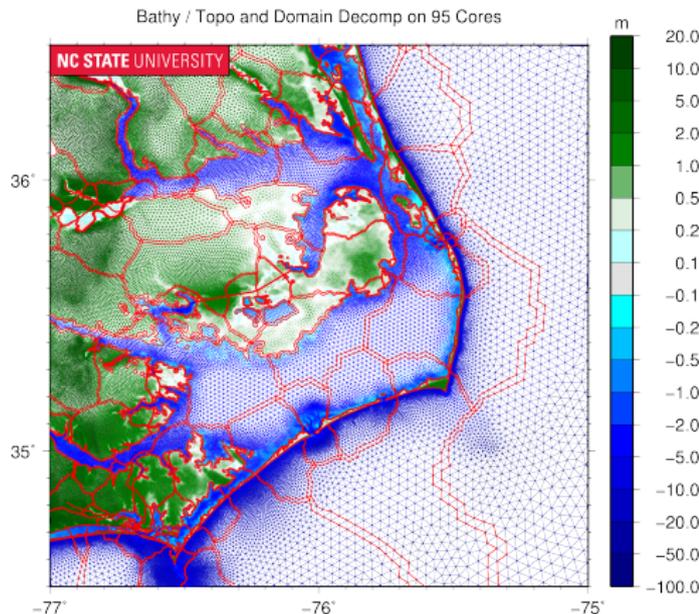
- Wet region with 3066 vertices
- Dry region with 4766 vertices

Now every core is contributing

- Still imbalances during storm

Wall-clock time of ~ 2.77 hr

- Speedup of **21 percent**



Test Case 2 – Hurricane Irene (2011) on NC9

Optimizing Initial Decomposition for Wet Vertices

We optimized the decomposition:

- All cores are both wet and dry
- Domain boundaries follow shoreline
- Channels separate from floodplains

Domain not decomposed equally:

- Some cores have more wet / dry
- Reflects complexity of mesh

For example, core 0000:

- Wet region with 2274 vertices
- Dry region with 5479 vertices

For example, core 0001:

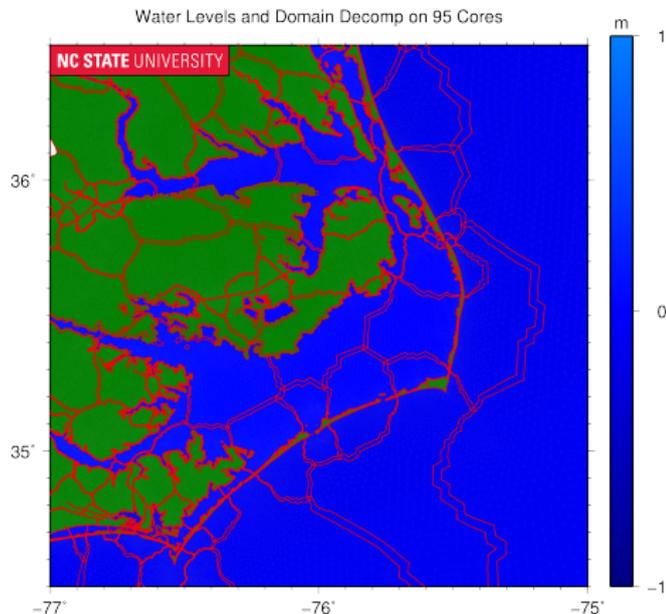
- Wet region with 3066 vertices
- Dry region with 4766 vertices

Now every core is contributing

- Still imbalances during storm

Wall-clock time of ~ 2.77 hr

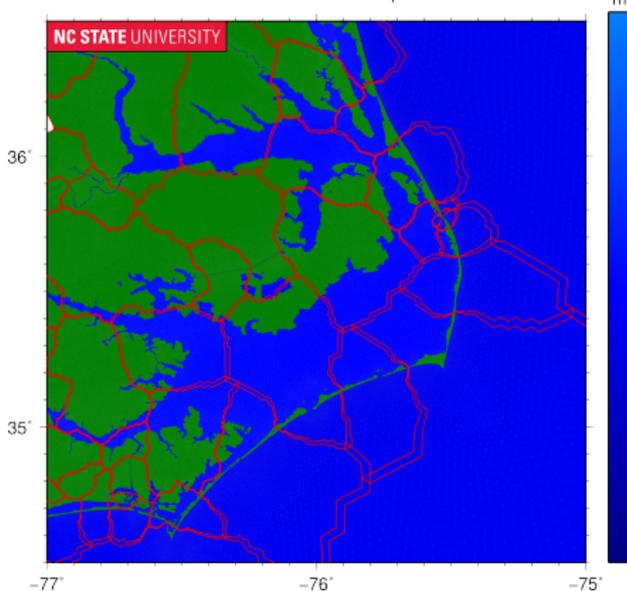
- Speedup of **21 percent**



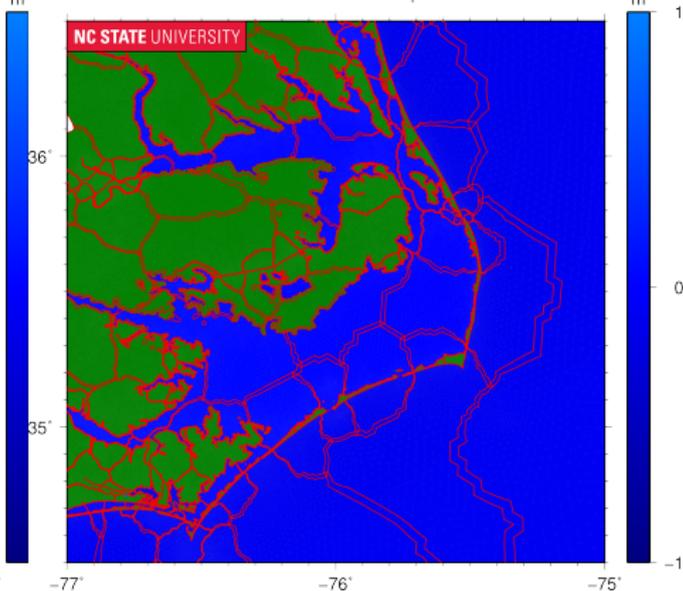
Test Case 2 – Hurricane Irene (2011) on NC9

Water Level Comparison and Timings

Water Levels and Domain Decomp on 95 Cores



Water Levels and Domain Decomp on 95 Cores



Test	Code Version	Cores	CPU-hr	% Change
Tides	ADCIRC v52.22	15	259.2	- 18.7
	+ load balancing		210.7	
Irene	ADCIRC v52.22	96	334.3	- 21.2
	+ load balancing		263.3	

Summary and Future Work

Improving the Efficiency of Wave and Surge Models

Tight coupling of SWAN+ADCIRC

- ▶ Resolution varies from kilometers to meters in unstructured mesh
- ▶ Domain decomposition to assign problem to 1000s of cores
- ▶ Applications – surge barriers, flooding risk maps, forecasting

Dynamic load balancing

- ▶ Initial speed-up of 20 percent
- ▶ Revise adcprep so it can be called as a subroutine from ADCIRC

Obvious benefits for end users

- ▶ Faster forecasts for decision support for emergency managers
- ▶ Better utilize resources for larger studies for engineering design



COASTAL RESILIENCE CENTER

A U.S. Department of Homeland Security Center of Excellence