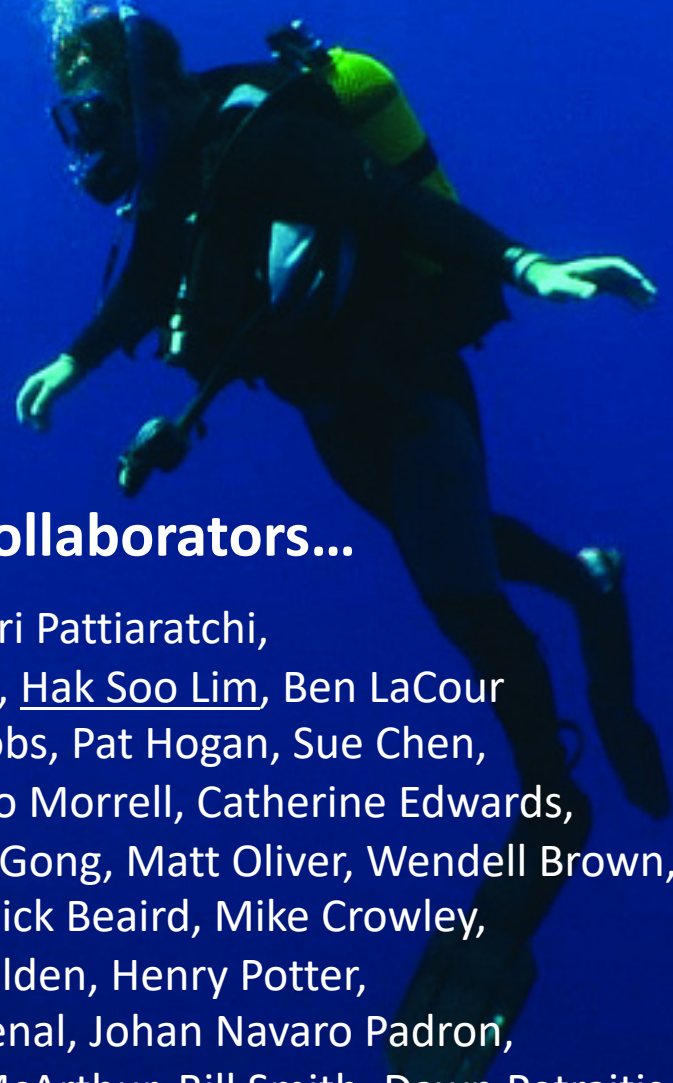


# Ocean Gliders in Tropical Cyclone Forecasting

EGO/UG2

21 May 2019



## A growing list of collaborators...

Scott Glenn, Gustavo Goni, Chari Pattiaratchi,  
Travis Miles, Maria Aristizabal, Cliff Watkins, Hak Soo Lim, Ben LaCour  
Avichal Mehra, Hyun-Sook Kim, Gregg Jacobs, Pat Hogan, Sue Chen,  
Nathan Allen, Doug Wilson, Roy Wilkinson, Julio Morrell, Catherine Edwards,  
Stephan Howden, Kevin Martin, Ruth Perry, Donglai Gong, Matt Oliver, Wendell Brown,  
Oscar Schofield, Josh Kohut, Grace Saba, Nick Beaird, Mike Crowley,  
Tony Knap, Steve DiMarco, Kerri Whilden, Henry Potter,  
Enric Pallas, Miguel Tenreiro, Ida Mitrani Arenal, Johan Navaro Padron,  
John Kerfoot, Bob Fratantonio, Ben Adams, Shannon McArthur, Bill Smith, Dawn Petraitis, .











# Leveraging Global Tropical Cyclone Expertise







Billion-dollar events to affect the U.S. from 1980 to 2018\* (CPI-Adjusted)

















DISASTER TYPE	NUMBER OF EVENTS	PERCENT FREQUENCY	CPI-ADJUSTED LOSSES (BILLIONS OF DOLLARS)	PERCENT OF TOTAL LOSSES	AVERAGE EVENT COST (BILLIONS OF DOLLARS)	DEATHS
 Drought	26	10.9%	\$241.3 <sup>‡</sup> CI	15.2% <sup>‡</sup>	\$9.7 <sup>‡</sup>	2,993 <sup>†</sup>
 Flooding	29	12.2%	\$123.5 <sup>§</sup> CI	7.8% <sup>§</sup>	\$4.3 <sup>§</sup>	543
 Freeze	9	3.8%	\$30.0 CI	1.9%	\$3.3	162
 Severe Storm	101	42.4%	\$223.4 CI	14.0%	\$2.2	1,615
 Tropical Cyclone	41	17.2%	\$870.7 <sup>‡</sup> CI	54.7% <sup>‡</sup>	\$21.8 <sup>‡</sup>	6,436
 Wildfire	16	6.7%	\$54.8 <sup>‡</sup> CI	3.4% <sup>‡</sup>	\$3.7 <sup>‡</sup>	253
 Winter Storm	16	6.7%	\$47.3 CI	3.0%	\$3.0	1,044
 All Disasters	238	100.0%	\$1,591.0 <sup>‡</sup> CI	100.0%	\$6.8 <sup>‡</sup>	13,046

**Hurricanes have caused \$870.7 B in damages since 1980, more than all other natural disasters combined (\$720.3 B)**





Billion-dollar events to affect the U.S. from 1980 to 2018\* (CPI-Adjusted)

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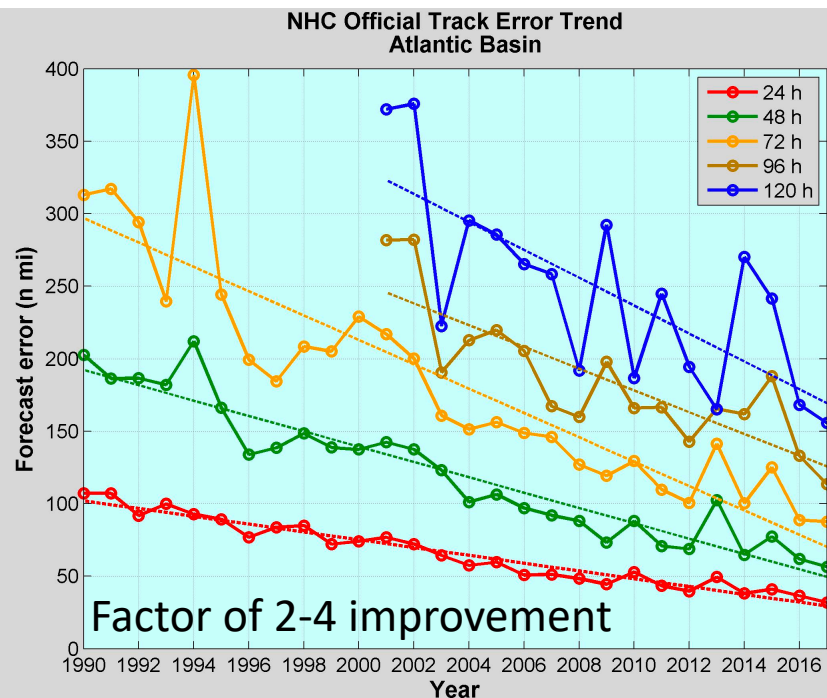
**Hurricanes have caused 6,436 deaths since 1980, similar to all other natural disasters combined (6,610)**



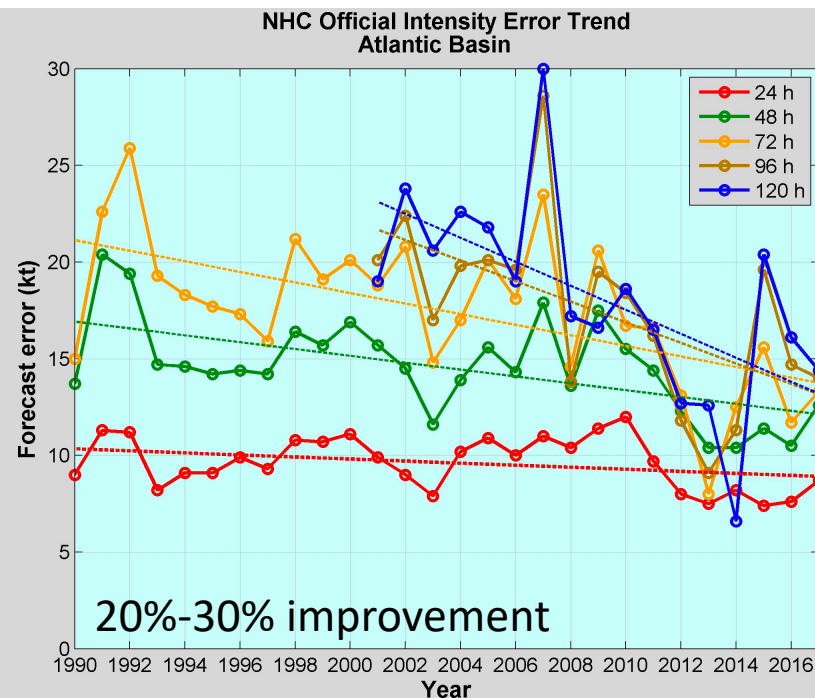


# NOAA Annual Operational Suite Review

## Average Track Errors: Atlantic Basin



## Average Intensity Errors: Atlantic Basin



**Evacuate vs Shelter-In-Place** decisions are often made 3-5 days ahead based on the forecast intensity at landfall

*Close the gap from both sides: forecasting and response*



# Tropical Cyclone Heat Potential - Rapid Intensification Proxy

But published research shows ...

## Irene & Sandy \$87 B

Glenn et al., 2016 Nature Comms

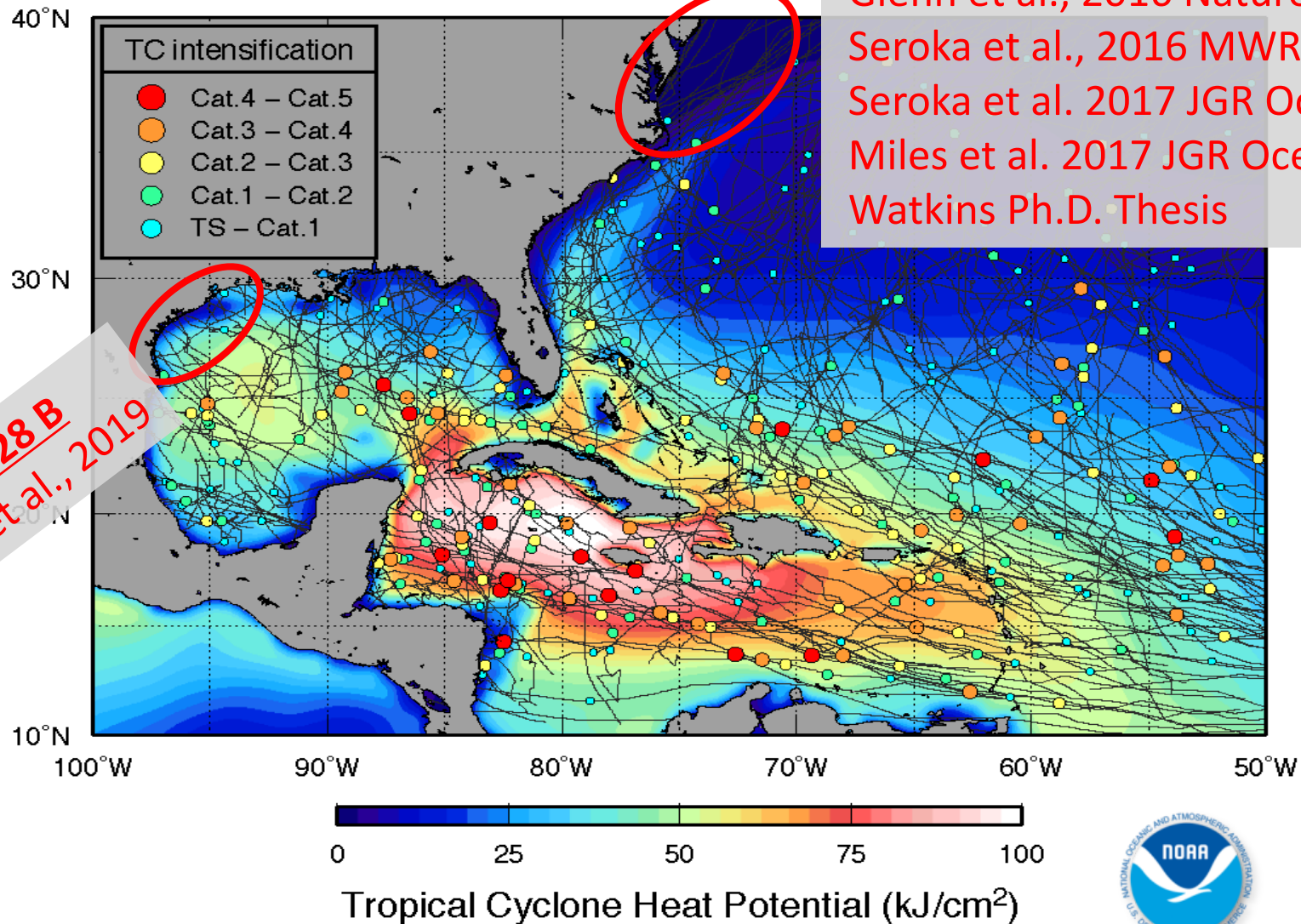
Seroka et al., 2016 MWR

Seroka et al. 2017 JGR Oceans

Miles et al. 2017 JGR Oceans

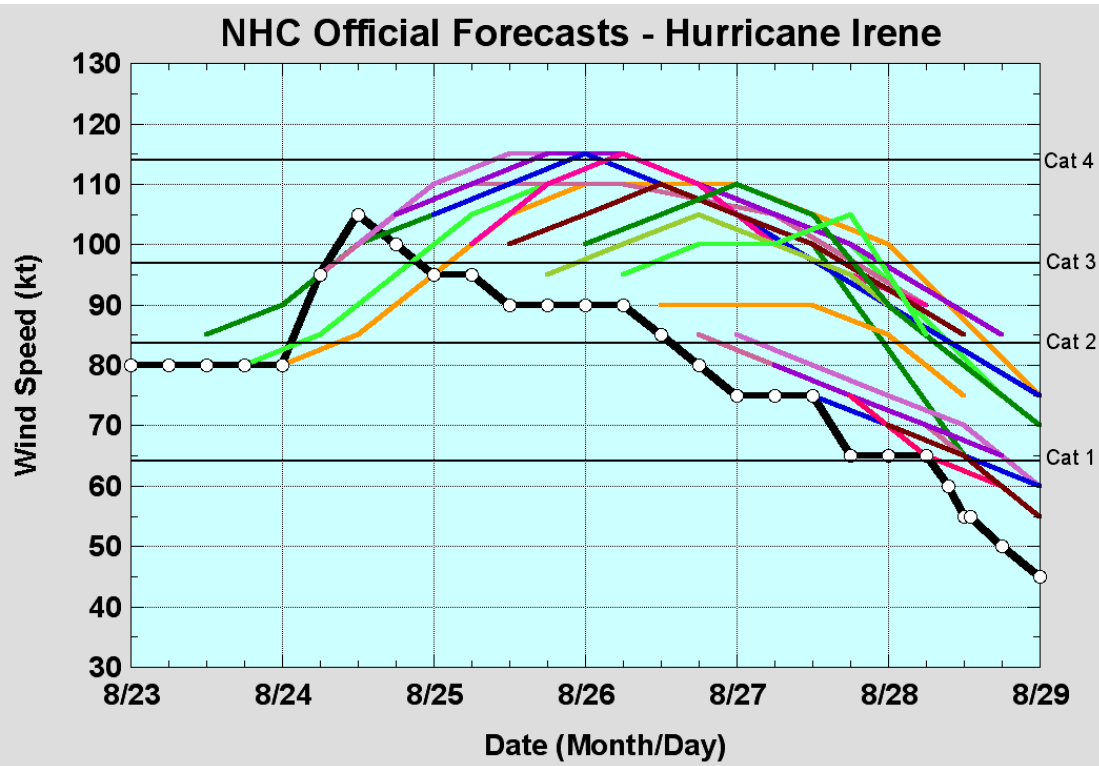
Watkins Ph.D. Thesis

Harvey \$128 B  
Potter et al., 2019





# August of 2011 - Pre-Irene Forecasts and Evacuations



Official NHC intensity forecasts for Irene every 6 h from 1200 UTC 23 August to 0600 UTC 28 August.

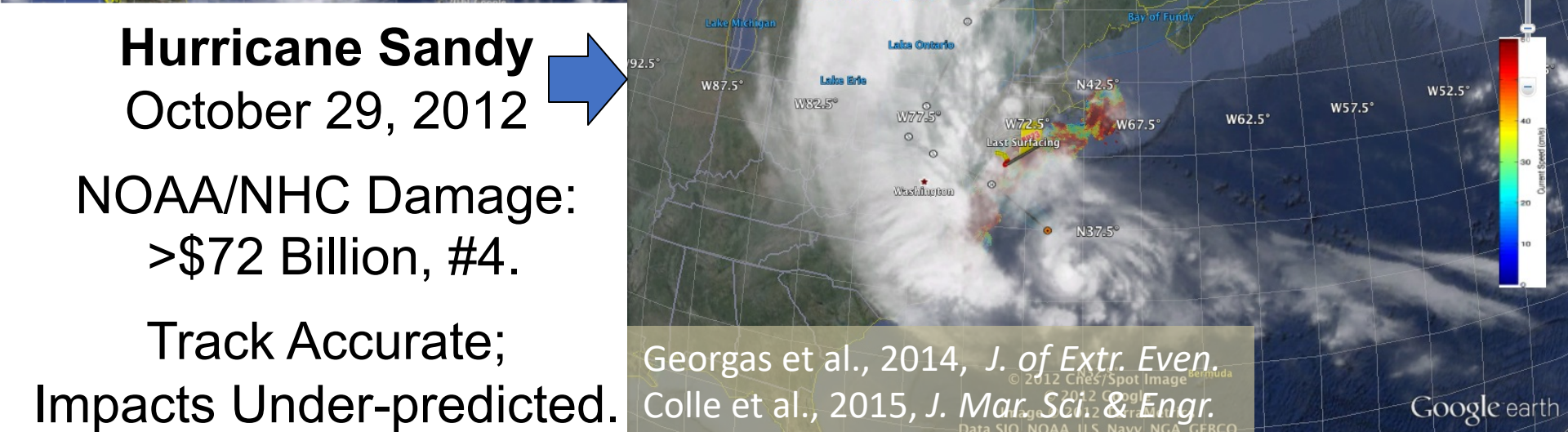
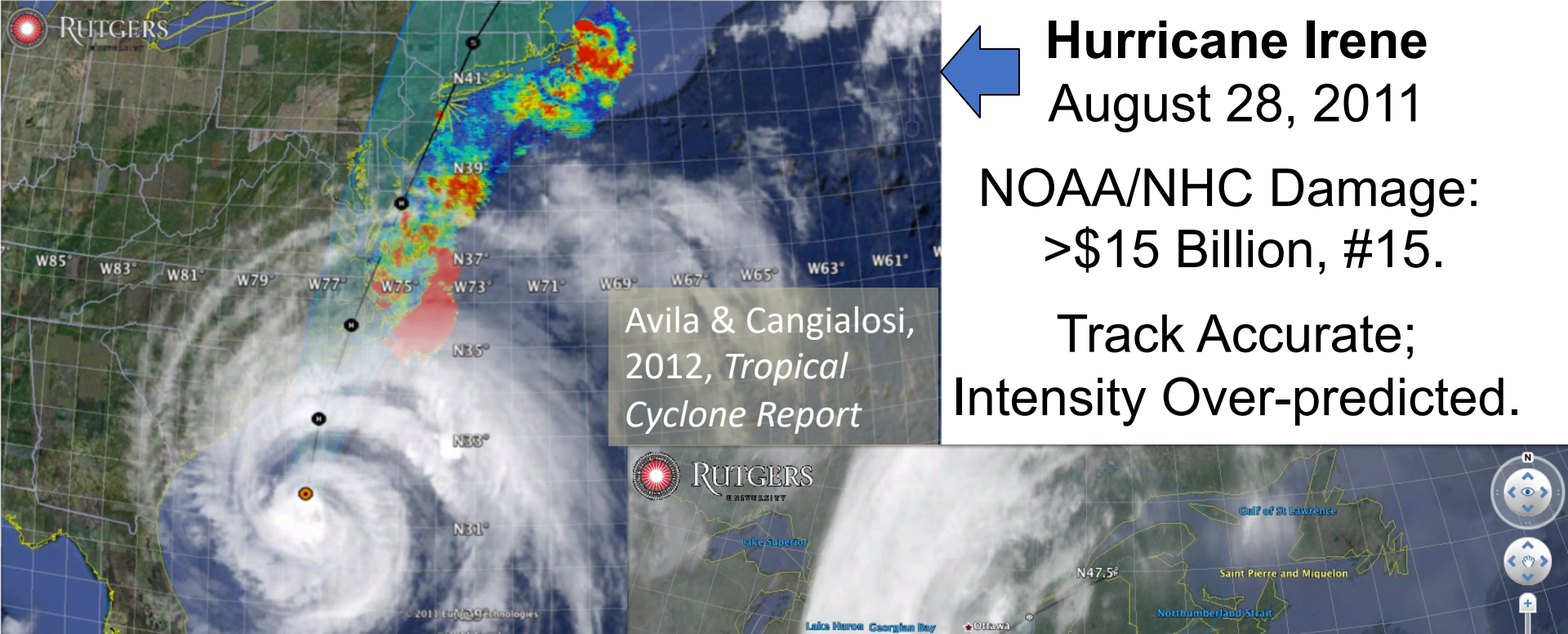


Over 2 million people ordered to “flee the storm’s path”.

**President Obama:** Shaping up to be a “historic hurricane” and urged residents to “be prepared for the worst”. “Don’t wait. Don’t delay.”

**New Jersey Governor Christie:** Ordered evacuation of 1 million people - “This is going to be an enormous storm, and for New Jersey, something we haven’t seen in over 60 years”. “Get the hell off the beach”.

**New York Mayor Bloomberg:** “Staying behind is dangerous, staying behind is foolish, and its against the law”. “The time to leave is right now”. The bridges, streets and subways were nearly empty ahead of a nearly unprecedented mass transit shutdown.





# MARACOOS - Operations Center

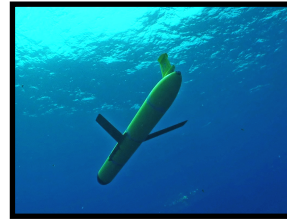
## Rutgers University - Center for Ocean Observing Leadership



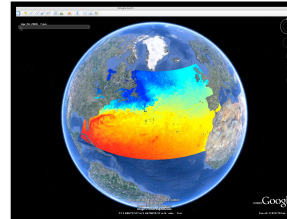
**L-Band & X-Band Satellite Receivers**



**46 Site CODAR Network**



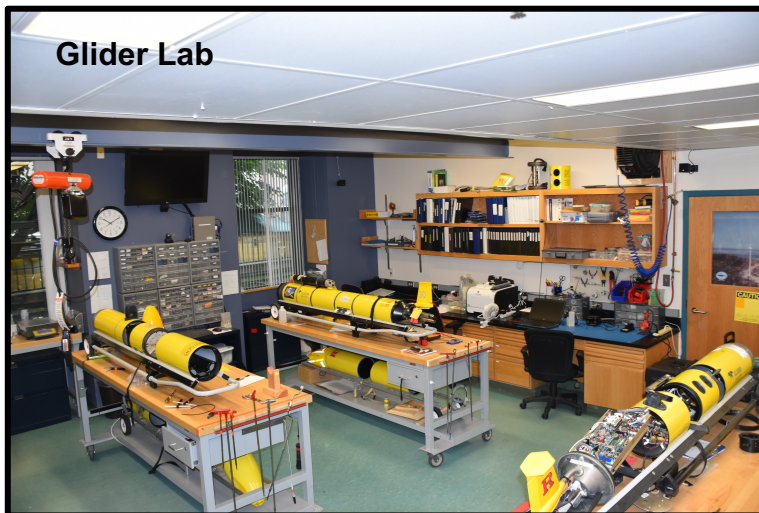
**>479 Glider Deployments**



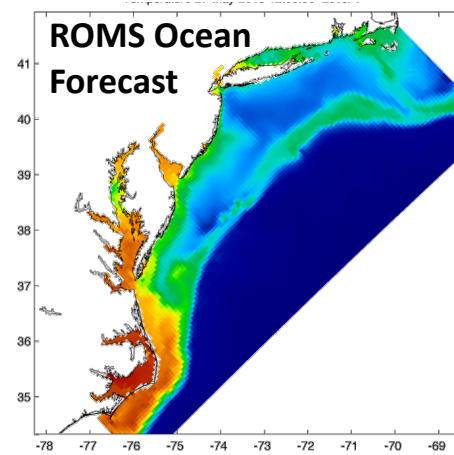
**Ocean & Atmos. Forecasts**



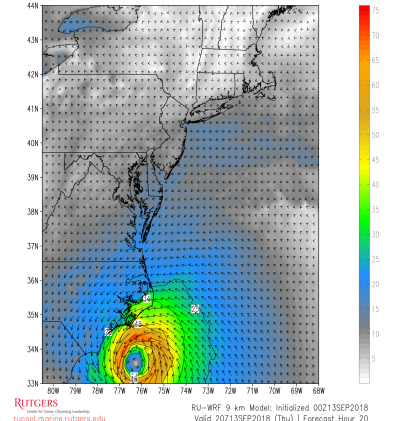
**MARACOOS is an IOOS Certified RICE**



**Glider Lab**

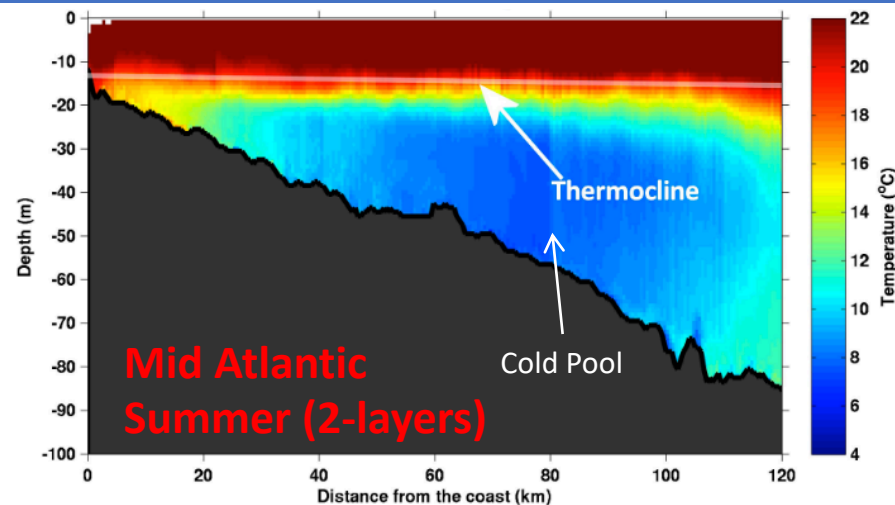
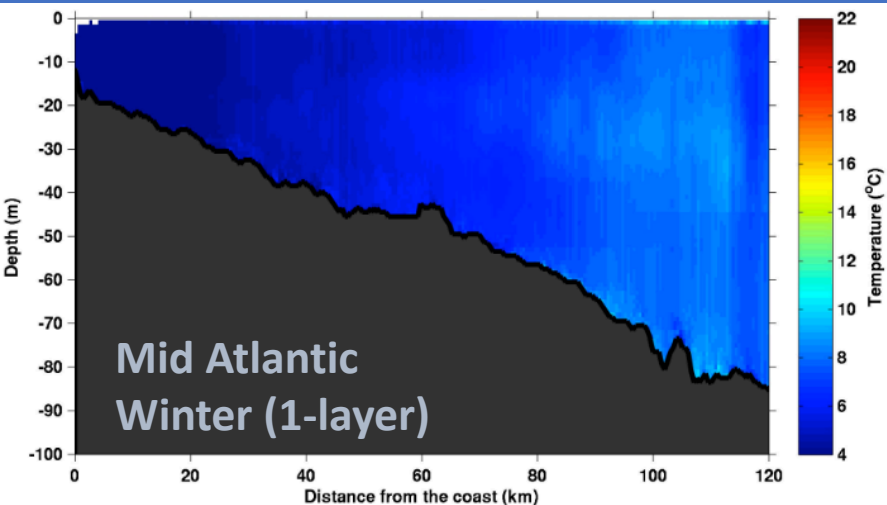


**WRF Atmospheric Forecast**



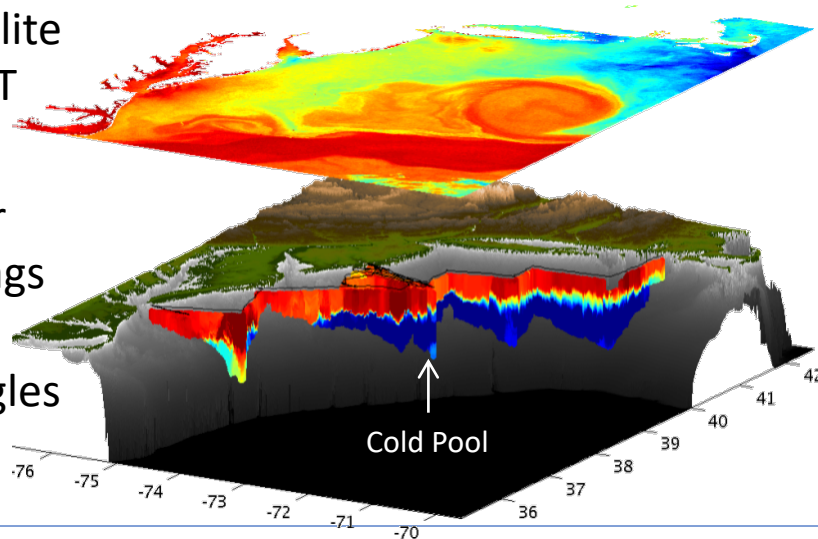
# Essential Ocean Feature - Mid-Atlantic's Cold Pool

A continental shelf-wide cold bottom layer beneath a warm summer surface layer



Satellite  
SST

Glider  
Zig-Zags  
or  
Triangles

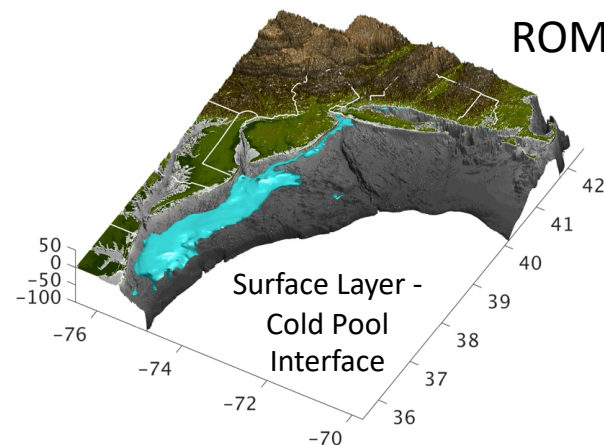


Assimilated  
into Regional  
Ocean  
Models



12° C on May 15, 2017

ROMS



**The Cold Pool is not monitored from space – we use Gliders, HF Radar, and Models**



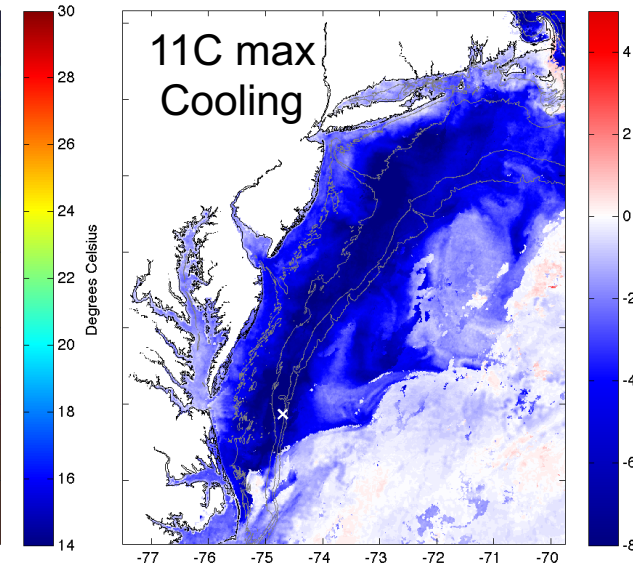
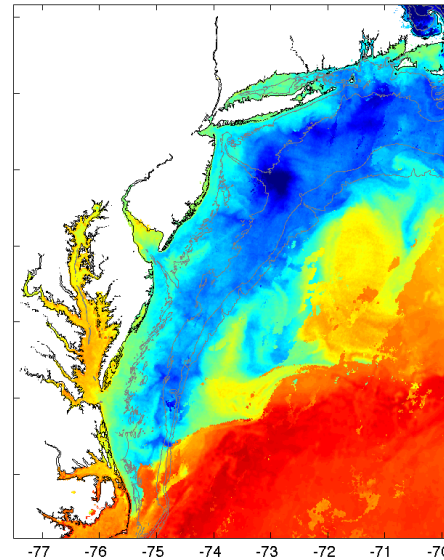
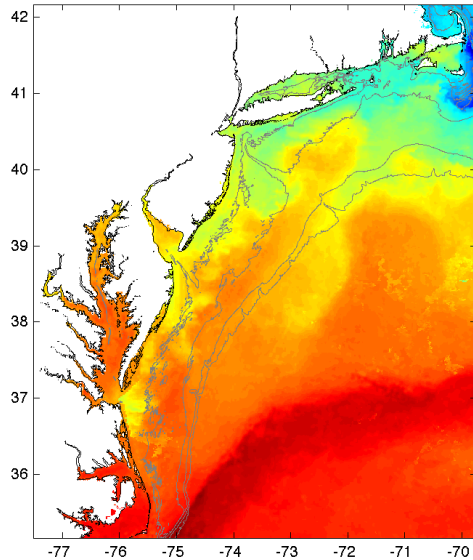
Pre-Irene

Post-Irene

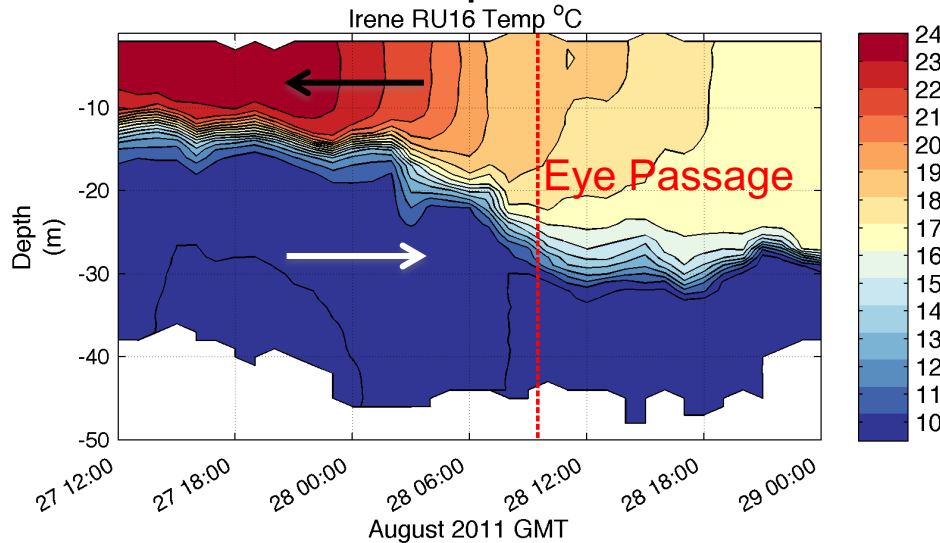
Difference

**WHAT?**

Satellite  
SST



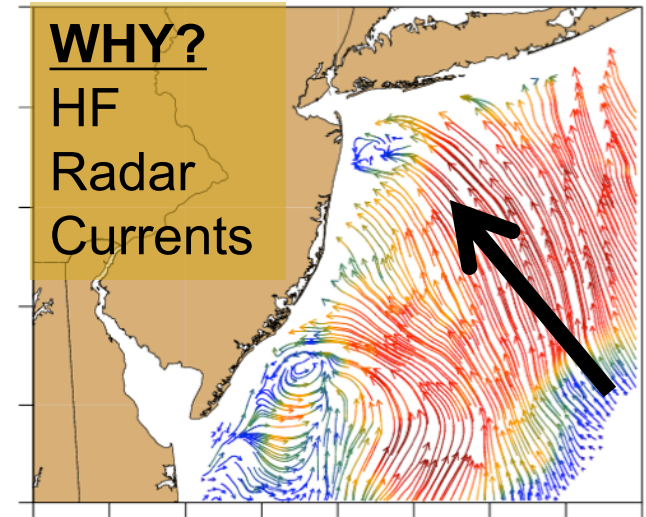
**WHEN?** Glider Temperature



Surface Current Field: 2011-Aug-28 06:00 GMT

**WHY?**

HF  
Radar  
Currents



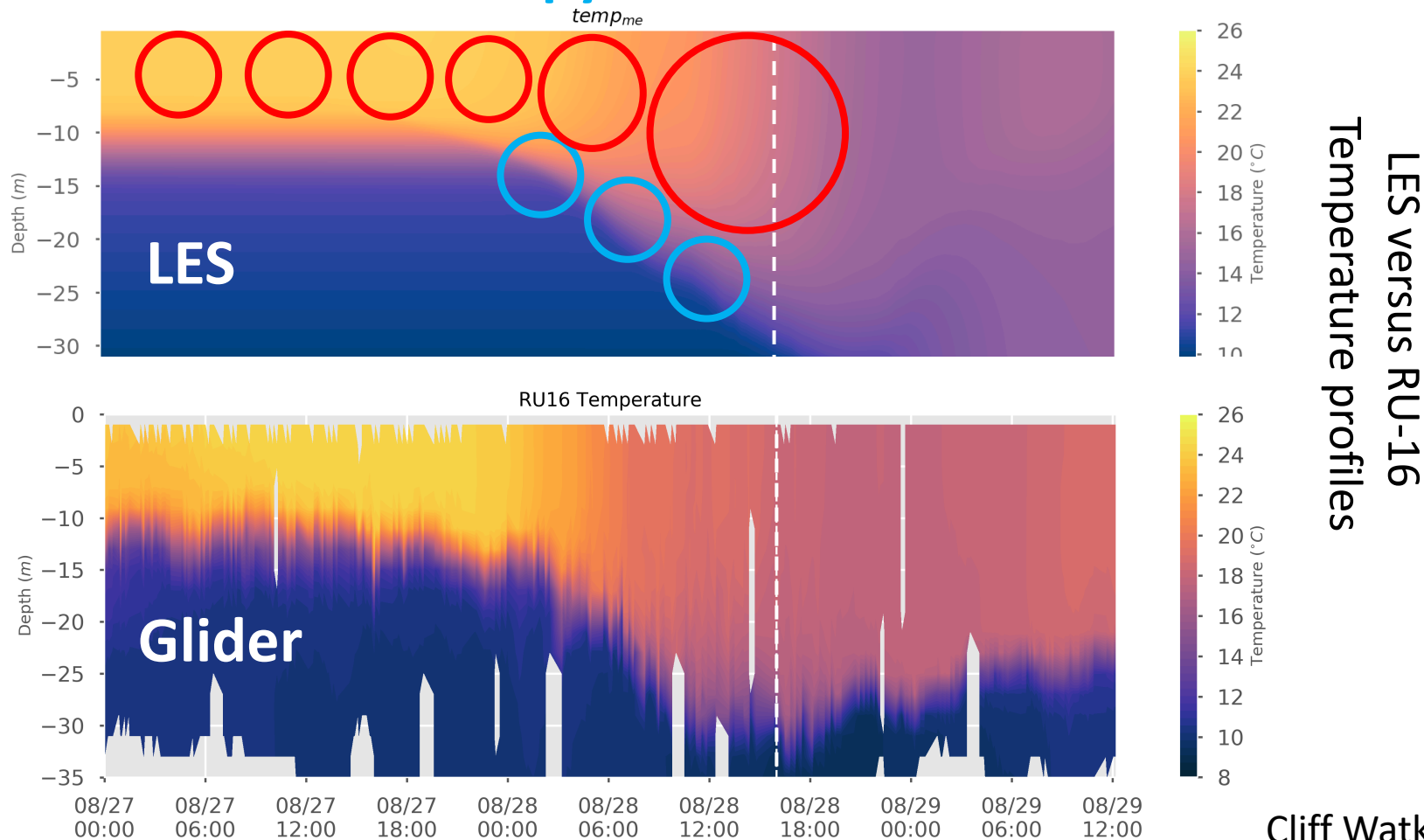
Glenn et al., Nat Comms, 2016

**Essential Ocean Processes in Hurricane Irene:**  
**Ahead of eye center – Vertical Shear > Mixing > Cooling > Weakening**

# Large Eddy Simulations (LES) of vertical mixing in Irene

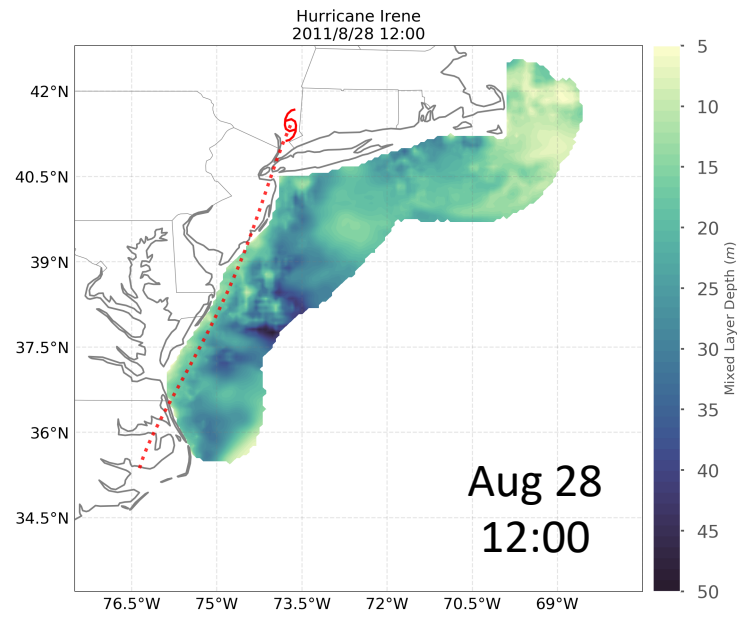
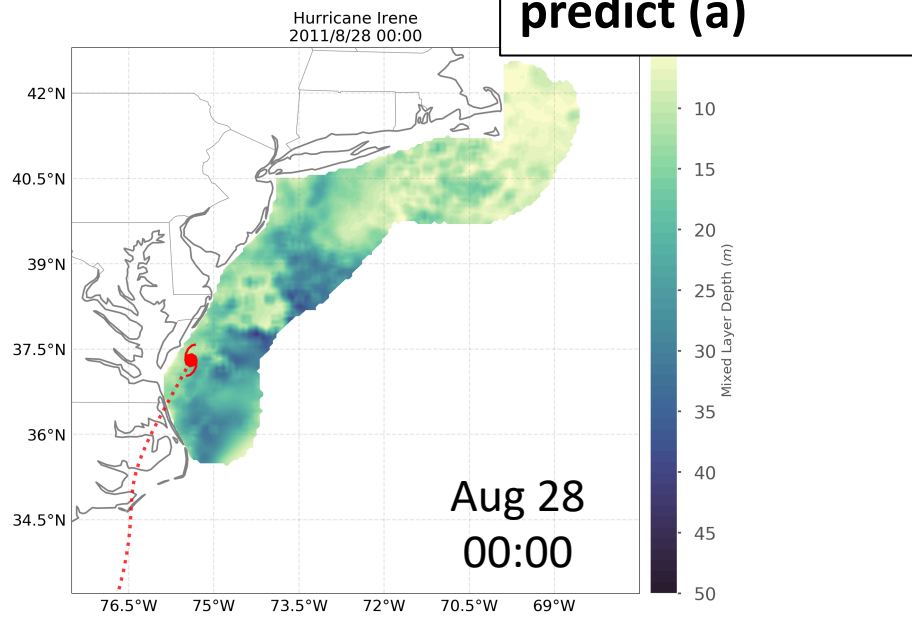
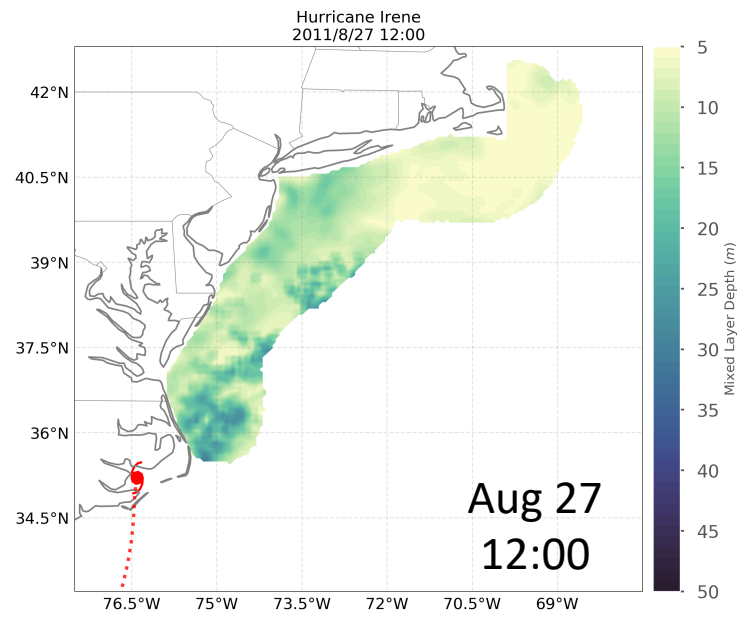
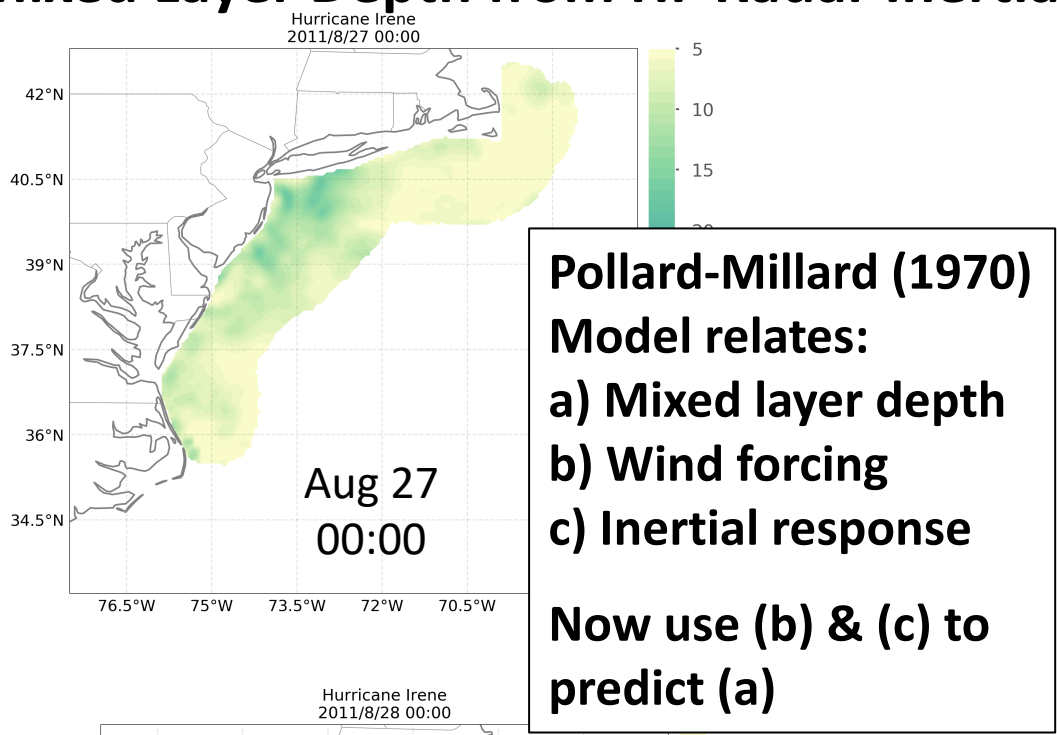
**Mixed-mode Instabilities – combination of:**

- 1. Wind-induced surface instabilities** plus
- 2. Shear induced pycnocline instabilities**



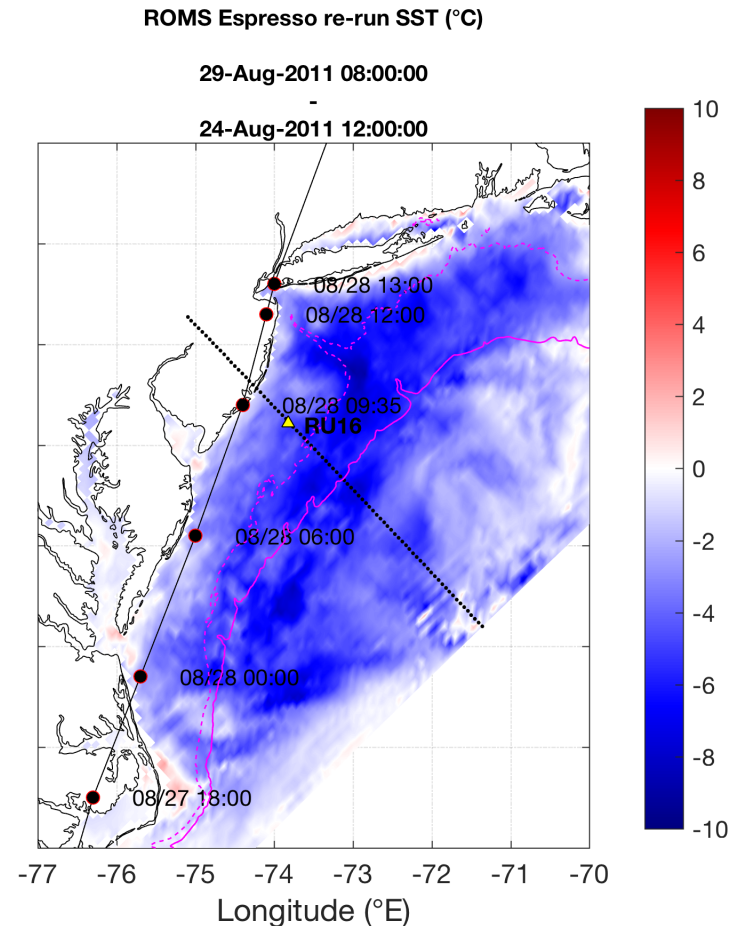
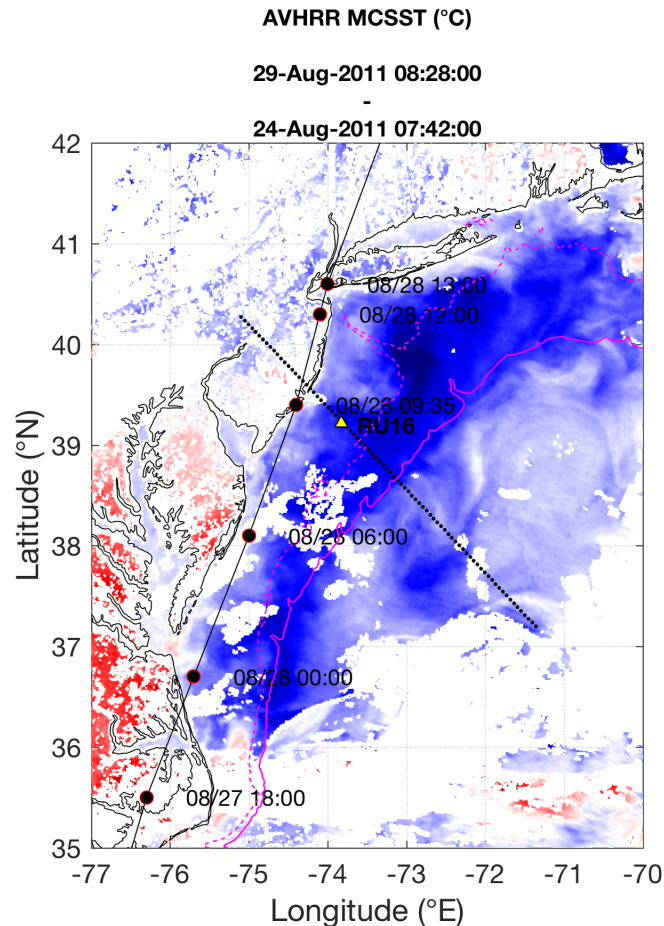


# Mixed Layer Depth from HF Radar Inertial Response & Wind Forecast



# Hurricane Irene SST Difference (Before-After)

## Satellite AVHRR vs. ROMS Model



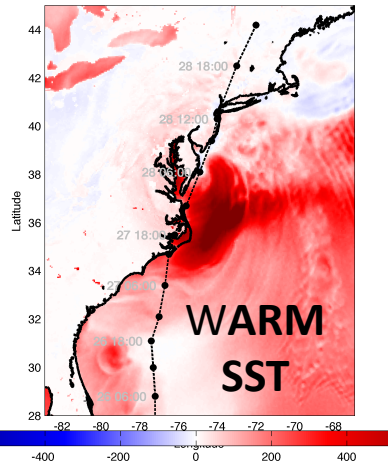
Difference

Significant shelf-wide cooling ahead-of-eye-center observed & forecast

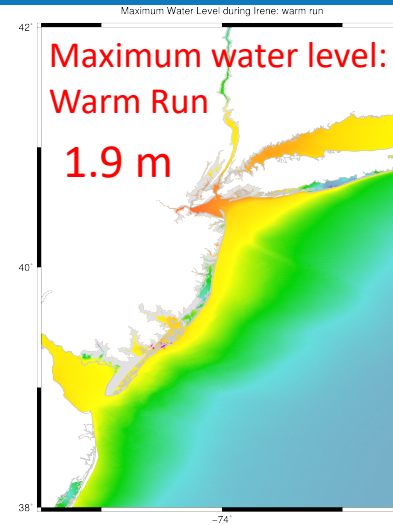
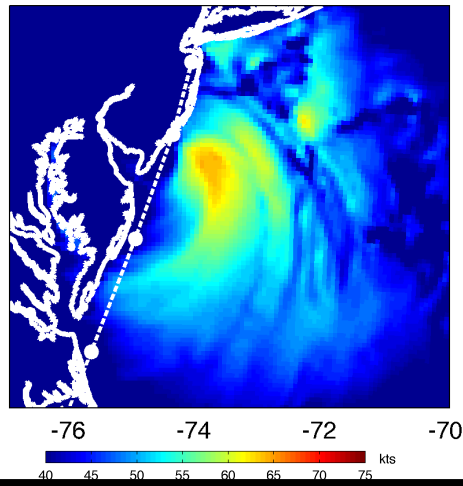


# Irene - Impacts of Warm (top row) vs Cold (bottom row) SST

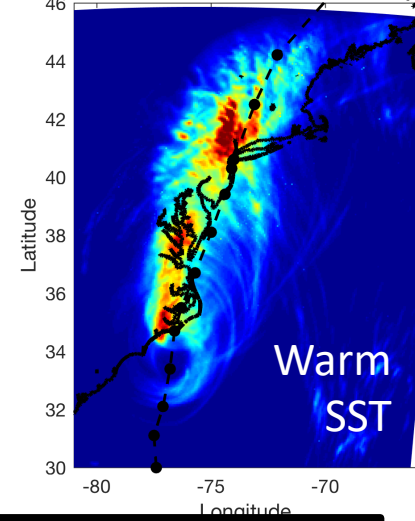
WRF Warm SST20110828\_0600 Latent Heat Flux (W m<sup>-2</sup>)



WRF Warm SST W Spd (kts)



WRF Warm SST 20110828\_1800 Total Precip (mm)



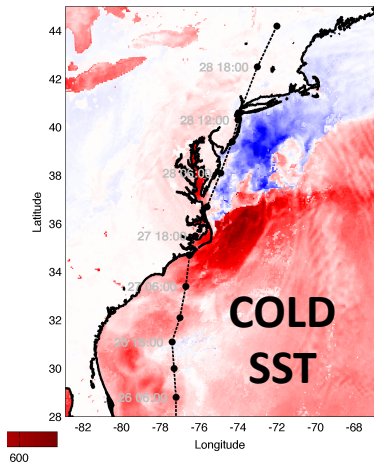
Surface Heat Flux

Wind Speed

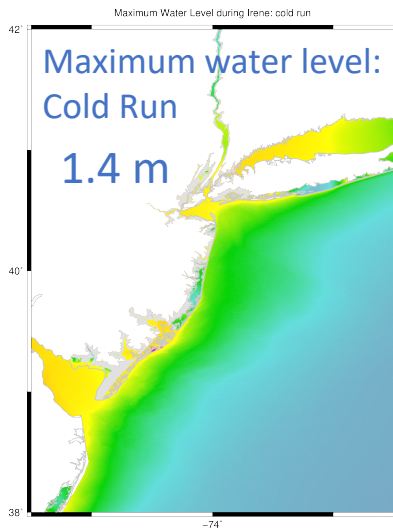
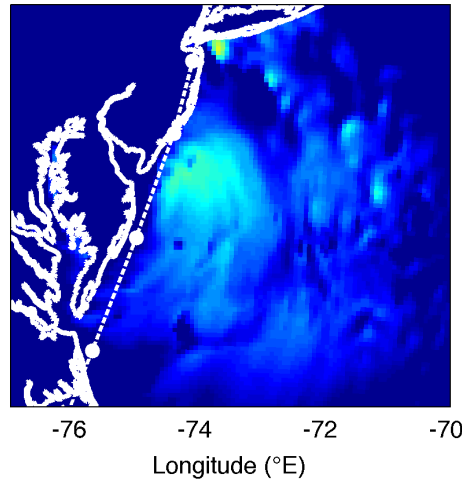
Storm Surge

Total Rainfall

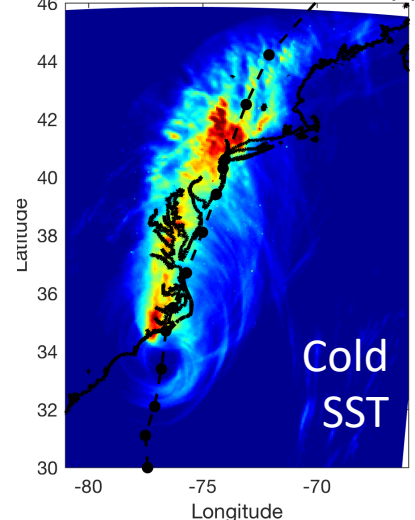
WRF Cold SST20110828\_0600 Latent Heat Flux (W m<sup>-2</sup>)



WRF Cold SST W Spd (kts)



WRF Cold SST 20110828\_1800 Total Precip (mm)



Sign Change  
as observed

10 knot reduction  
to observed

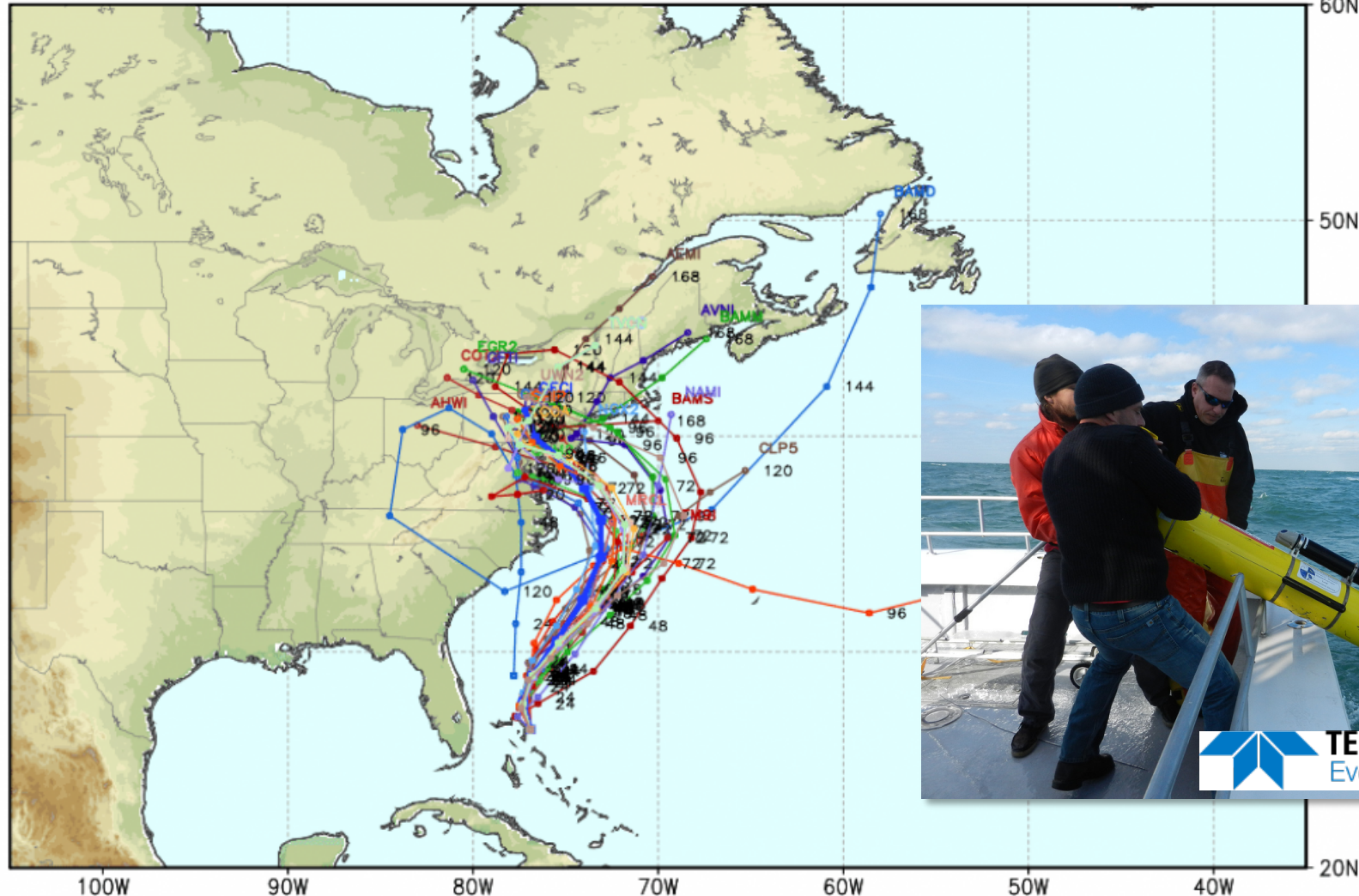
0.5 m reduction  
to observed

35 mm reduction  
to observed

# Hurricane Sandy – 1 year later

AL18 SANDY Guidance valid: 2012102612

Track Models



AEMI  
 AHWI  
 AVNI  
 BAMD  
 BAMB  
 BAMS  
 CLIP  
 CLP5  
 COT2  
 DRCL  
 DSHP  
 EGR2  
 FM9I  
 G01I  
 GED



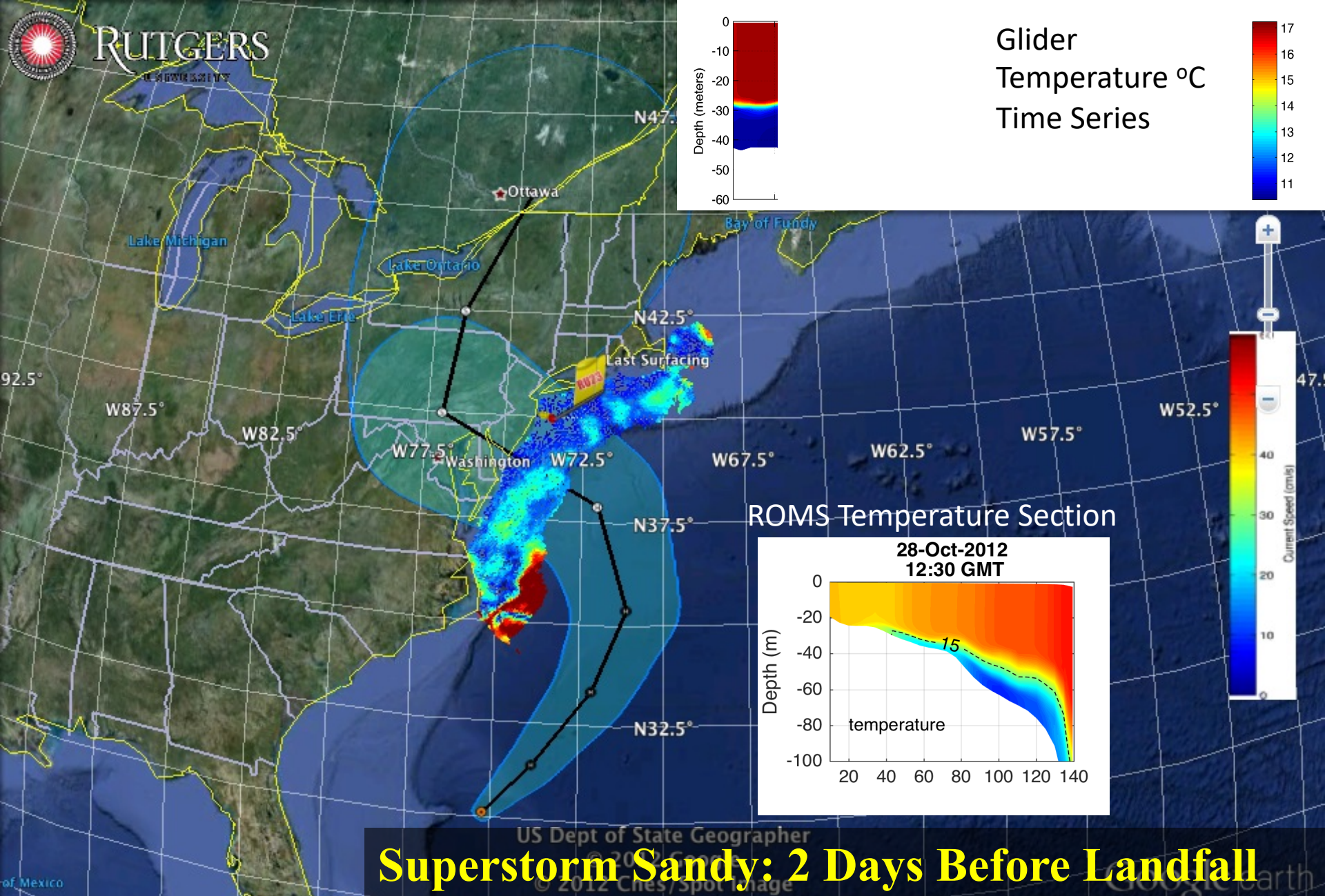
**TELEDYNE MARINE**  
 Everywhere you look™

Model guidance only — expert interpretation required. Check NHC Official Forecasts  
 Created by Dr. Ryan Maue, WeatherBELL Analytics.

Refresh Image every 30-minutes for most recent data

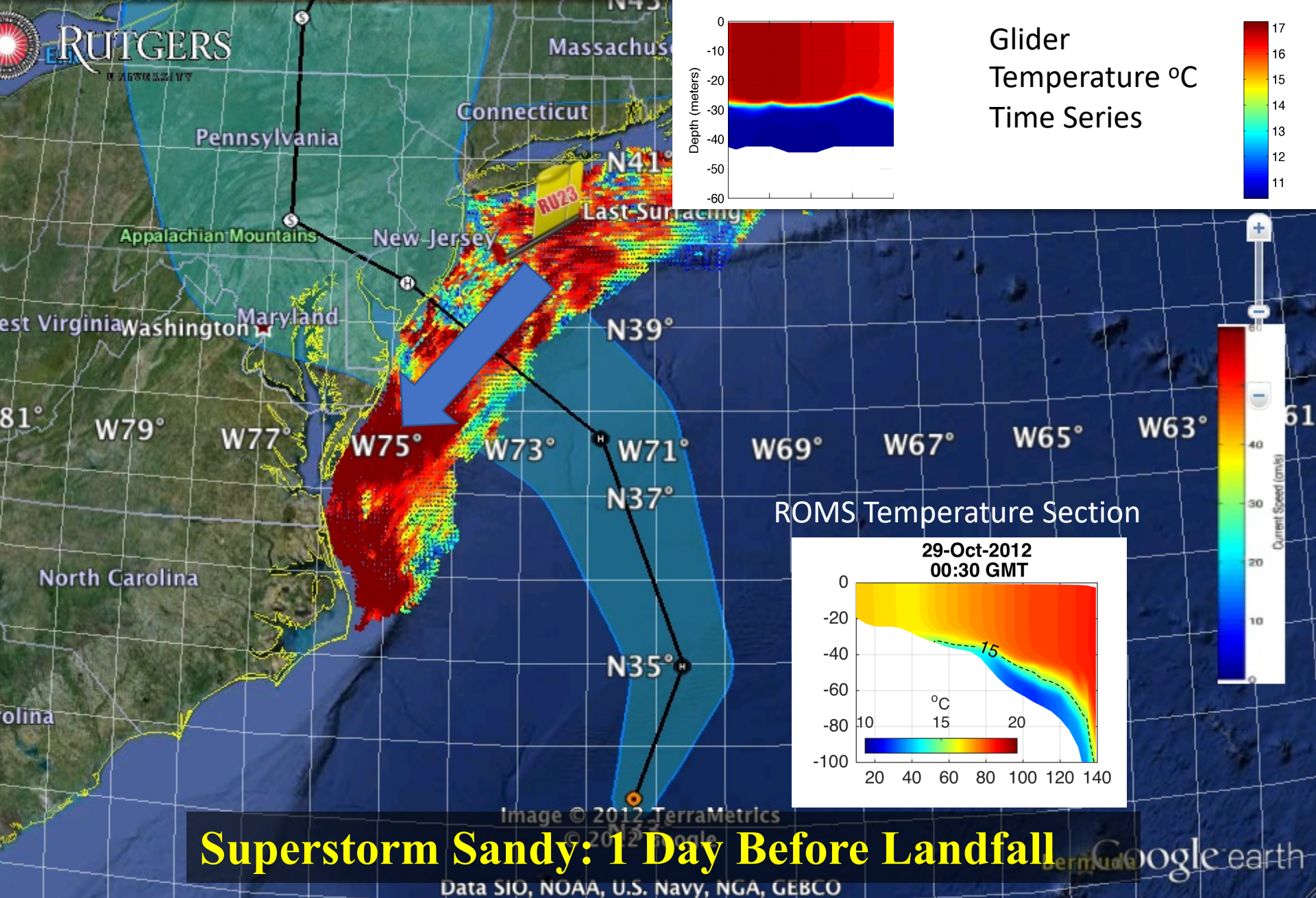
*Miles et al., J. of Geophys. Res. Oceans (2015) and (2017)*





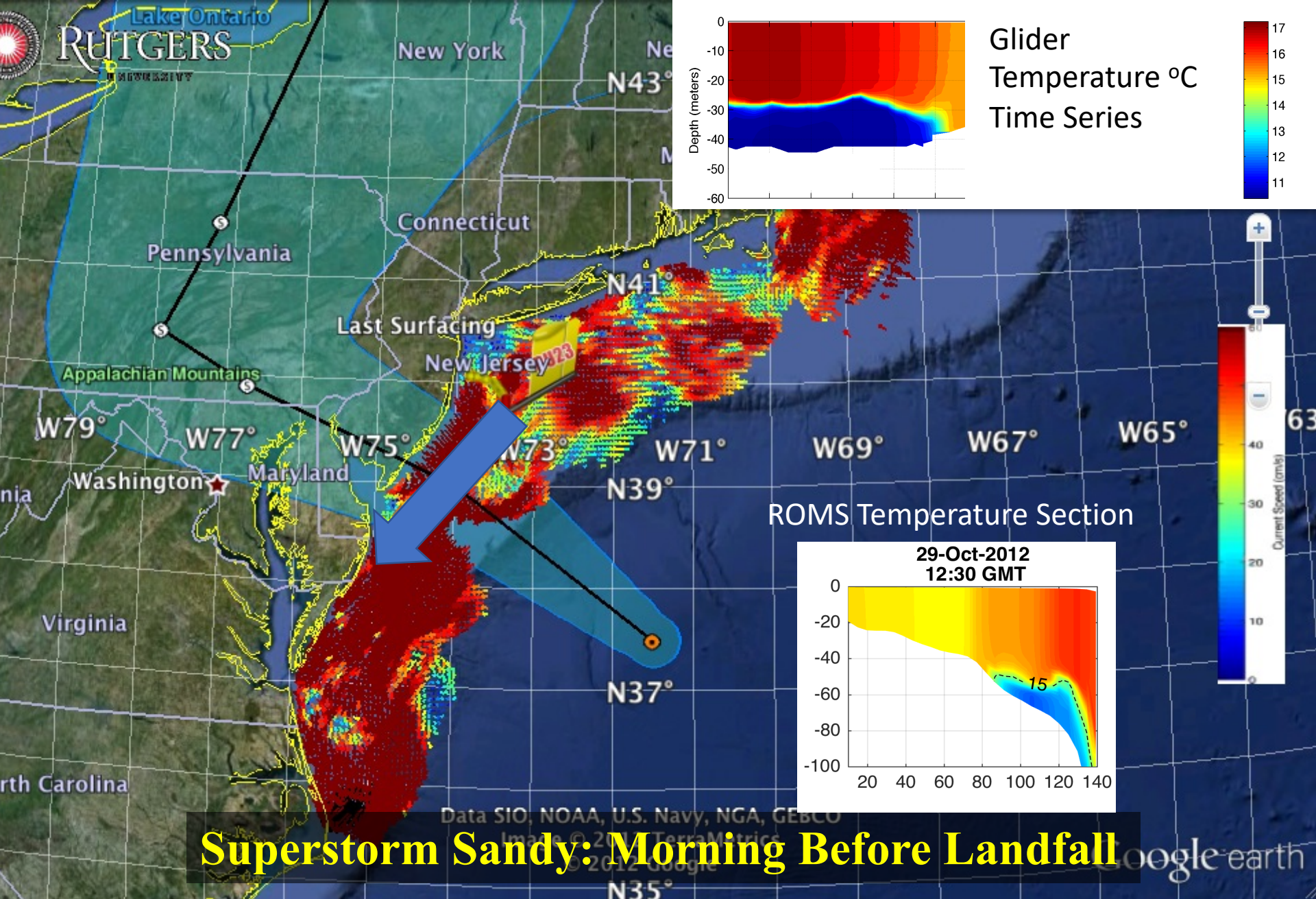
Miles et al., *J. of Geophys. Res. Oceans* (2015) and (2017)





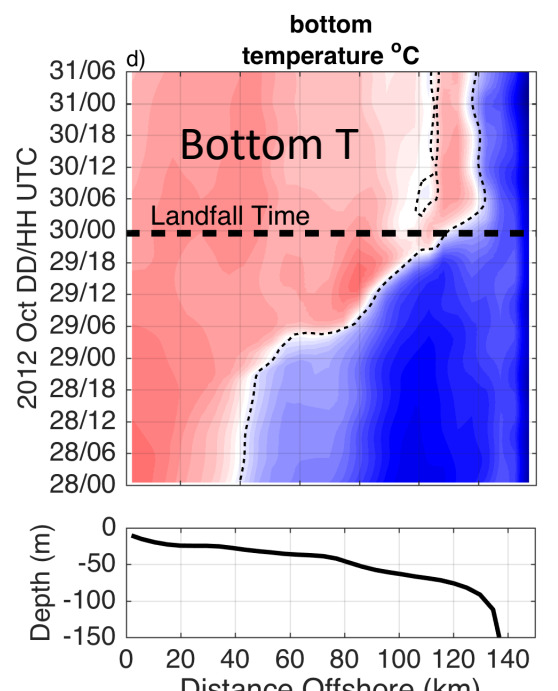
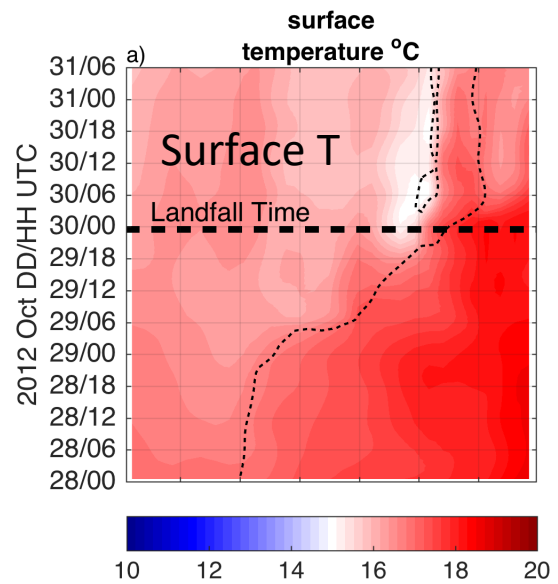
*Miles et al., J. of Geophys. Res. Oceans (2015) and (2017)*



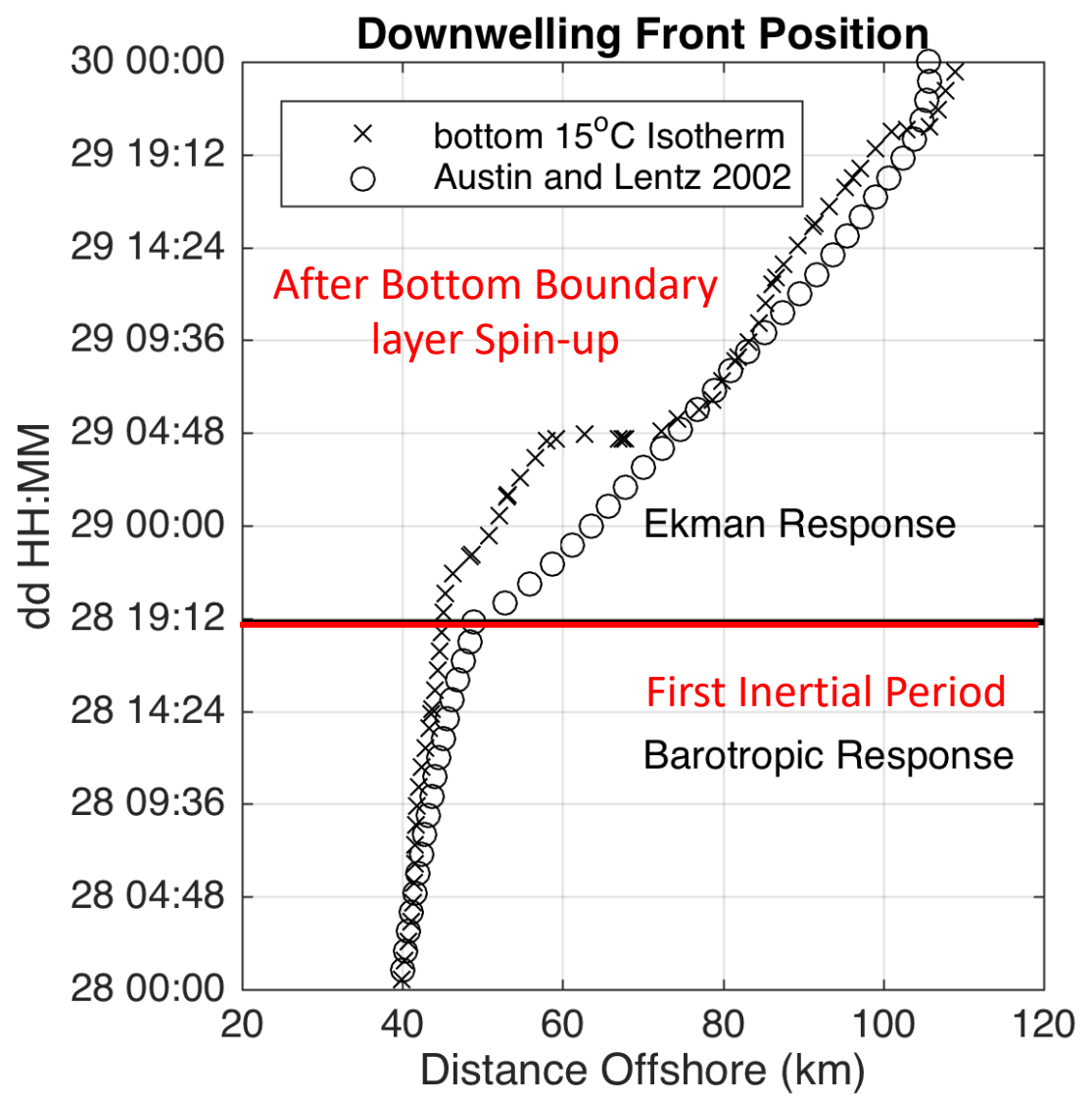


*Miles et al., J. of Geophys. Res. Oceans (2015) and (2017)*

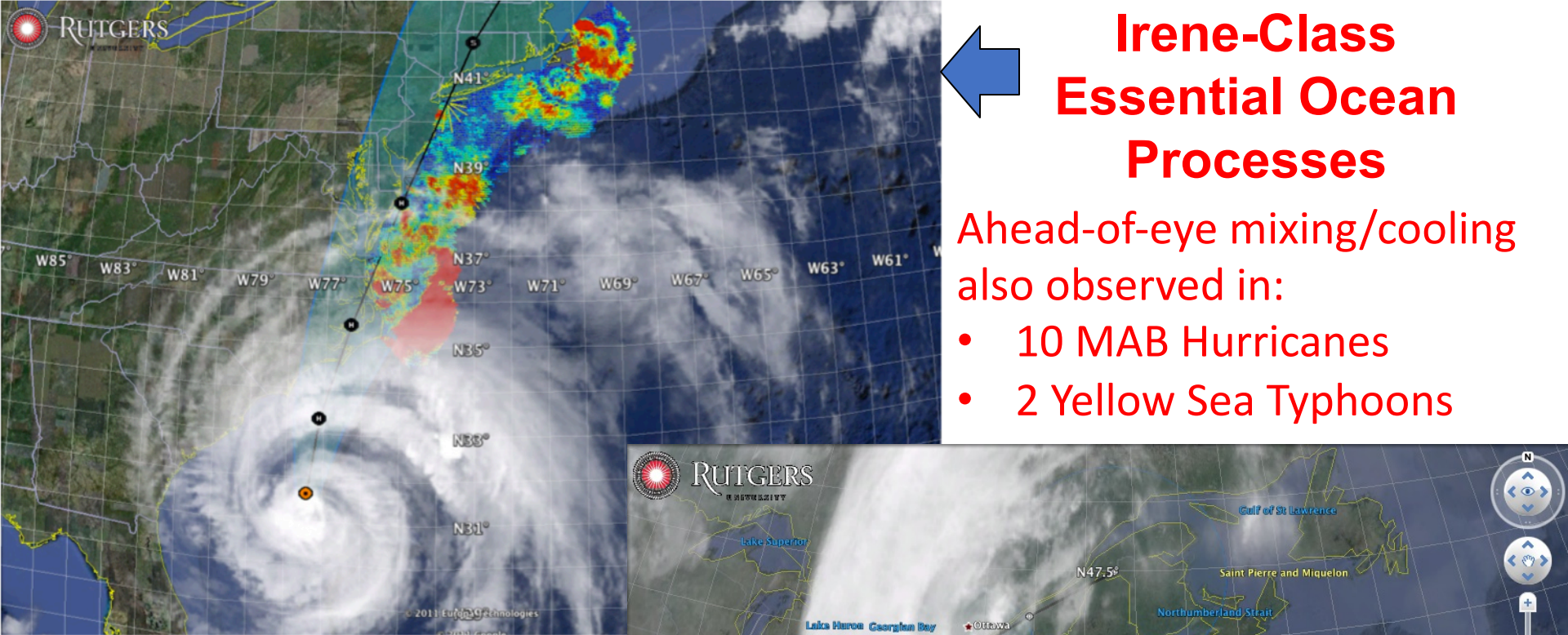
# Hurricane Sandy Hovmoller Diagrams Surface and Bottom Temperature



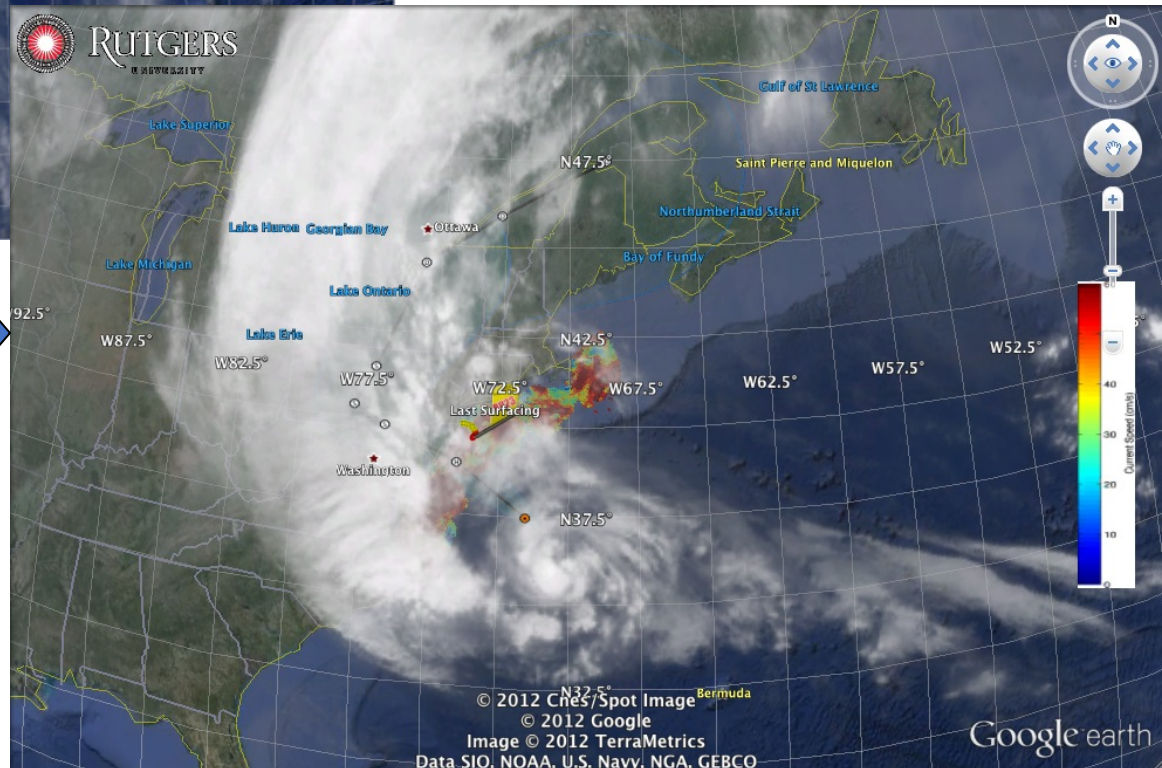
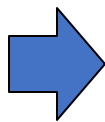
time





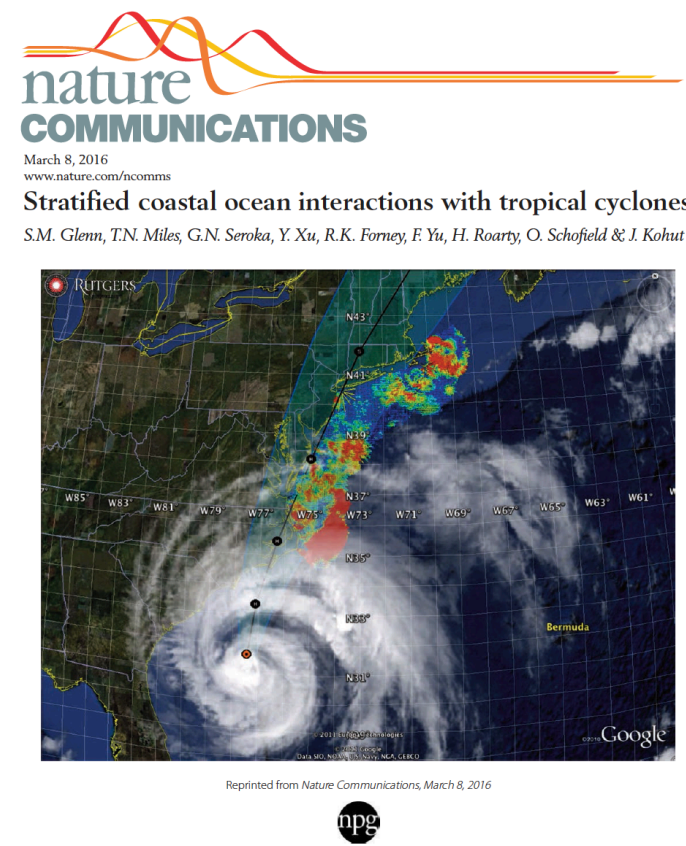


## Sandy-Class Essential Ocean Processes



# New Scientific Understanding:

- Two types of coastal ocean response to Mid Atlantic hurricanes discovered
- The essential ocean features are
  - Seasonally warmed surface water
  - Persistent Cold Pool bottom water
- The essential ocean processes are
  - (a) ahead-of-eye mixing/cooling
  - (b) ahead-of-eye downwelling
- The essential ocean feedbacks on the atmosphere are
  - (a) ocean mixing/cooling reduces storm intensity - **Irene**
  - (b) offshore advection of cold bottom water leaves a warm surface layer that acts to increase intensity - **Sandy**



+ Monthly Weather Review (2016)

+ JGR-Oceans (2017)

+ JGR-Oceans (2017)





## Conclusions

- Gliders are an increasingly valuable platform for hurricane research and forecasting
- Used to identify essential ocean features & processes in each Atlantic region that forecast models must include
- Glider-enabled storm science motivated a 2018 community response through the IOOS Glider DAC
- New Glider datasets are pushing the limits of our operational data assimilation capabilities

