

Diagnosing and Addressing Model Error in High-Resolution Tropical Cyclone Predictions

James D. Doyle, Jon Moskaitis, Sue Chen, Yi Jin, Will Komaromi, Hao Jin

U.S. Naval Research Laboratory, Marine Meteorology Division, Monterey, CA, USA

6th WGNE Workshop on Systematic Errors in Weather and Climate Models.

We acknowledge the support of the Office of Naval Research and Chief of Naval Research through the NRL Base Program.

Computational support provided by the Navy DoD Supercomputing Resource Center

Distribution Statement A: Approved for public release. Distribution is unlimited.



Outline

- Motivation and Background
- Regional Model Performance
- Surface and Boundary Layer, Air-Sea Coupling
- Cloud Microphysics
- Deep and Shallow Convection
- Horizontal and Vertical Resolution
- Summary and Recommendations

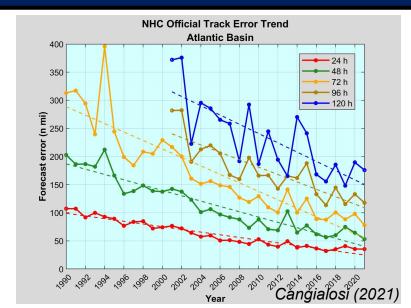


Motivation

- Property damage costs of TCs equal or exceed those of other natural catastrophes. Global estimates of TC damages are ~\$29B USD/year; single storm up to ~\$200B.
- Reliable forecasts of TC impacts (surge, flooding, winds), require accurate NWP and process representations of clouds, boundary layer, convection, radiation, and interaction with ocean.
- Track prediction has improved steadily, intensity forecast improvement has been slower.
- We use the U.S. Navy's regional COAMPS-TC modeling system to illustrate examples of systematic errors in TC track, intensity and structure (wind radii) forecasts and how we have addressed these.
- Which processes are the key to reduce track, intensity and structure systematic errors? What resolutions are needed? How should we evaluate TC forecast models?



Hurricane Ian Damage (USA Today)



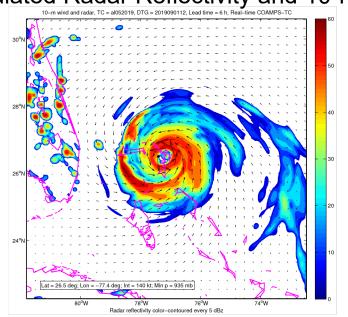


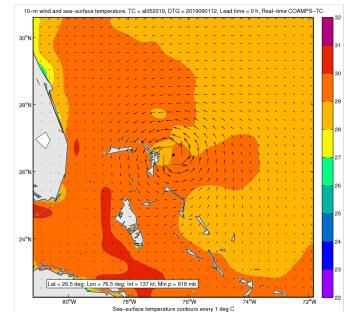
COAMPS-TC System overview

- COAMPS-TC is a specialized version of the U.S. Navy's mesoscale numerical weather prediction (NWP) model COAMPS, designed to predict (5 day) tropical cyclone (TC) track, intensity and structure (wind radii)
- Features: TC-following nested grid meshes (4 km on inner mesh, 40L) Specialized TC physics (drag coefficient; boundary layer; microphysics); TC Vortex initialization Coupled with NRL Coastal Ocean Model, NCOM
- Operational at Navy FNMOC: i) deterministic NAVGEM BCs (<u>COTC</u>) and NOAA GFS BCs (<u>CTCX</u>) ii) COAMPS-TC ensemble (11 member, 4 km resolution) based on NOAA GFS

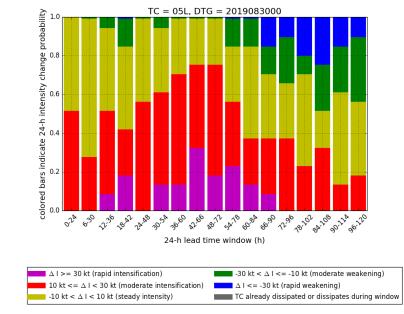
COAMPS-TC Deterministic (4km) Dorian (05L) (12Z 1 Sep 2019) Dorian (05L) (12Z 1 Sep 2019) Simulated Radar Reflectivity and 10-m Winds

NCOM Ocean (10km) SSTs and 10-m Winds





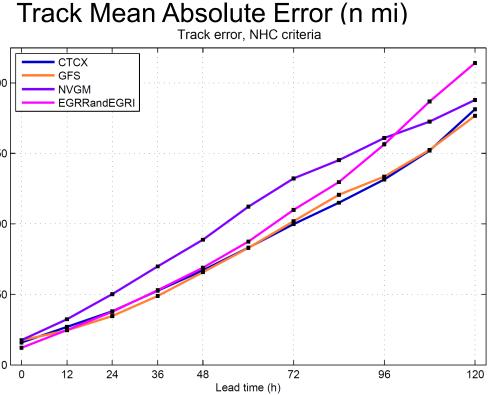
COAMPS-TC Ensemble (4km) Dorian (05L) (00Z 30 Aug 2019) 24-h Intensity Change Probability

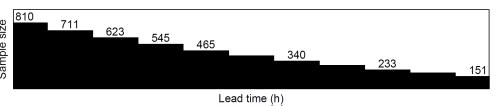




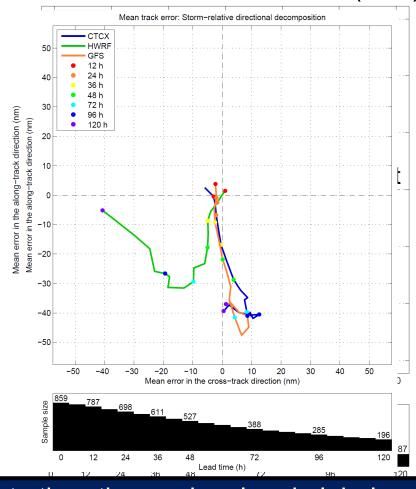
COAMPS-TC Evaluation Track Verification

2022 AL/EP/WP





Storm Relative Track Bias (n mi)

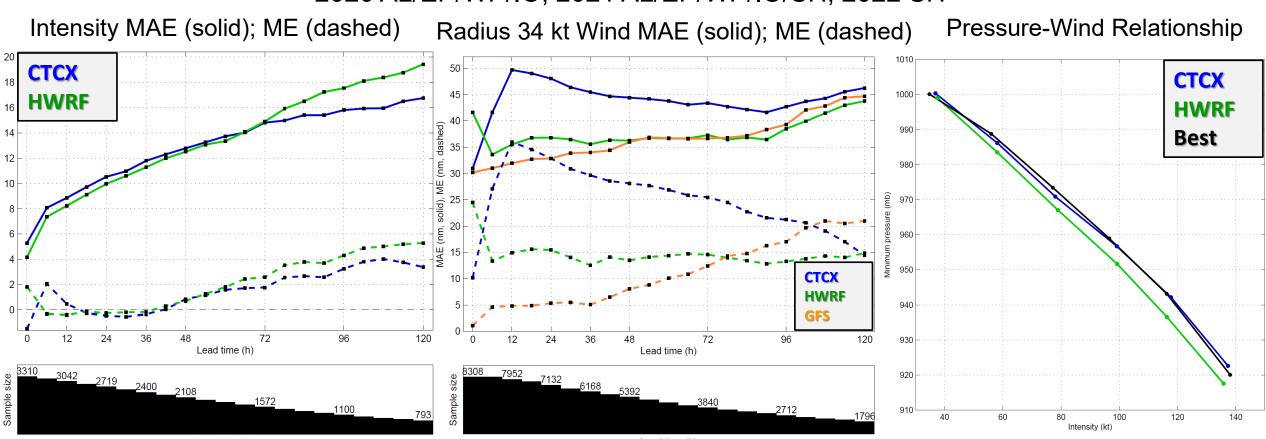


- •CTCX track similar to the GFS and generally superior to the other regional and global models.
- CTCX has a small cross track bias and similar to the GFS.



COAMPS-TC Evaluation Intensity and Structure Verification

2020 AL/EP/WP/IO, 2021 AL/EP/WP/IO/SH, 2022 SH

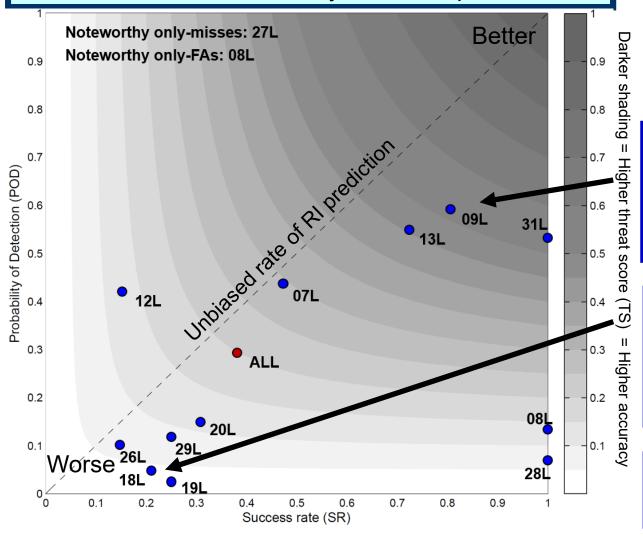


- CTCX intensity errors are similar to HWRF out to 72h, and lower in 72-120h range
- •R34 predictions for CTCX are systematically larger and less accurate than for HWRF and GFS
- CTCX pressure-wind relationship is near best track What is the P-W relationship most sensitive to?



COAMPS-TC Rapid Intensification (RI) Evaluation Atlantic Basin 2020-2021

2020/2021 Atlantic Storm-by-Storm RI performance



2020 TCRI storms

19L: Sally20L: Teddy26L: Delta

2021 TCRI storms

■ 07L: Grace

08L: Henri

09L: Ida

18L: Sam

The best CTCX RI forecasts are for storms with a prolonged period of RI with peak rate >= 55 kt / 24 h, and peak intensity >= Cat4. Ida (09L) is an example, as is GoM intensification of Grace (07L)

CTCX does not make great RI forecasts for all storms as described above, however. Poor forecasts were made for Delta (26L) and Sam (18L), which both had a very small inner core.

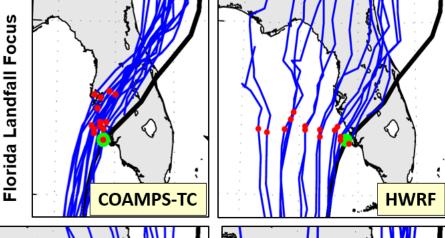
Henri (08L) was an unusual case in which CTCX consistently predicted RI but it did not occur

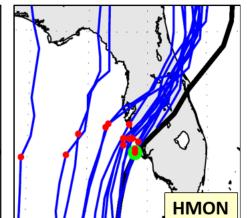
RI defined as a 30 kt intensity increase over 24h



COAMPS-TC Evaluation Hurricane Ian Track Forecasts

- Within 3 days of Florida landfall, COAMPS-TC forecasts did exceptionally well to predict the timing/location of landfall.
- Even for early forecasts 4 to 5 days in advance, COAMPS-TC predicted lan to be a major hurricane in the Gulf of Mexico





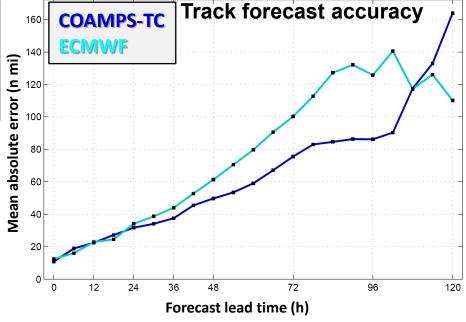
Blue lines: Forecast tracks
Red dots: Forecast TC
positions at time of landfall

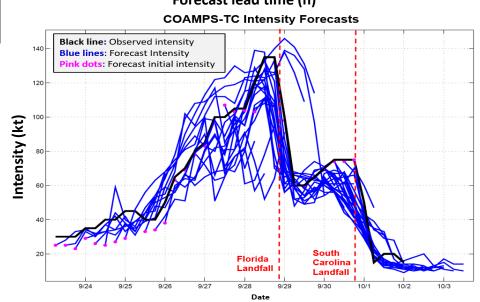
Green dot: Observed track **Green dot**: Observed TC position at time of landfall

	Category 5: 137+ kt		
	Forecast Peak Intensity (kt)		
Initial Time	COAMPS-TC	HWRF	HMON
25/18z	139	118	124
26/00z	128	117	132
26/06z	129	120	122
26/12z	111	121	119
26/18z	133	116	118
27/00z	111	121	123
27/06z	108	122	127
27/12z	118	128	126
27/18z	122	128	124
28/00z	119	128	129
28/06z	111	115	133
28/12z	133	142	139
Average	121.8	123.0	126.3

Category 3: 96 - 112 kt

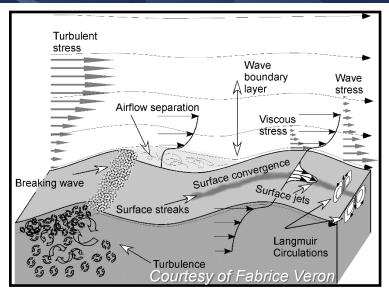
tegory 4: 113 - 136 kt

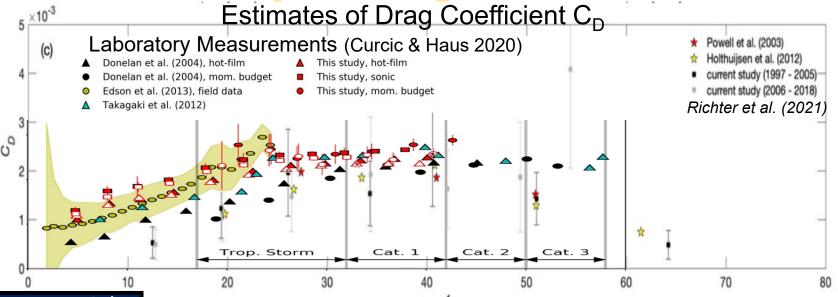




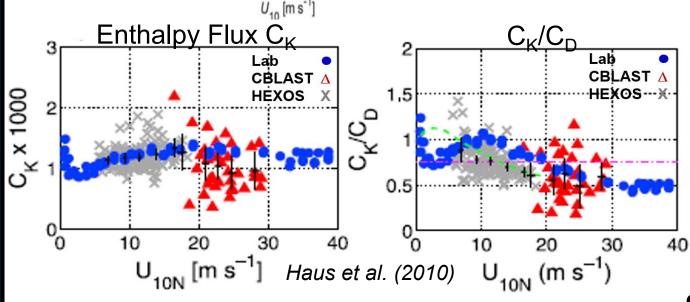


Surface Exchange and Boundary Layer Processes in Tropical Cyclones



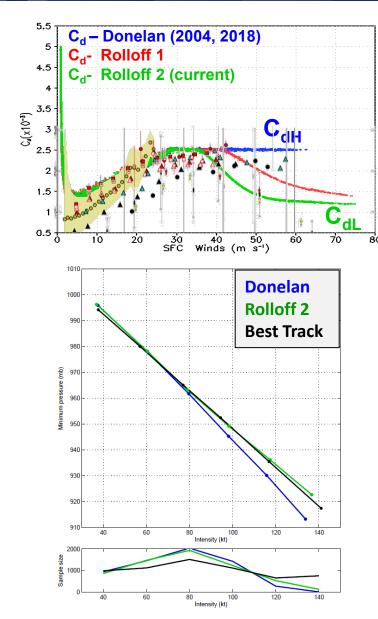


- Air-sea processes in TCs are crucial to accurately represent (fluxes, ocean mixing, spray) (Shay 2010; Holthuijsen et al., 2012; Bell et al. 2012; Nystrom et al. 2020)
- Estimation of air—sea momentum transfer in high winds use flux-profile method; C_D can be inferred from dropsondes (Powell et al. 2003)
- High-resolution TC models use C_D "rolloff" for U₁₀>30 ms⁻¹ (large spread, e.g., Richter et al. 2021)
- Surface exchange coefficients at high winds are very uncertain (laboratory & nature estimates)
- C_κ/C_d average is ~0.75 (Emanuel 1995).

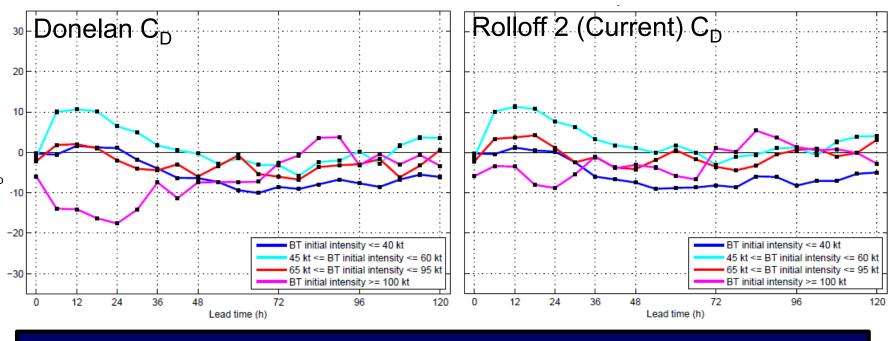




Surface Drag Parameterization COAMPS-TC C_D Formulation



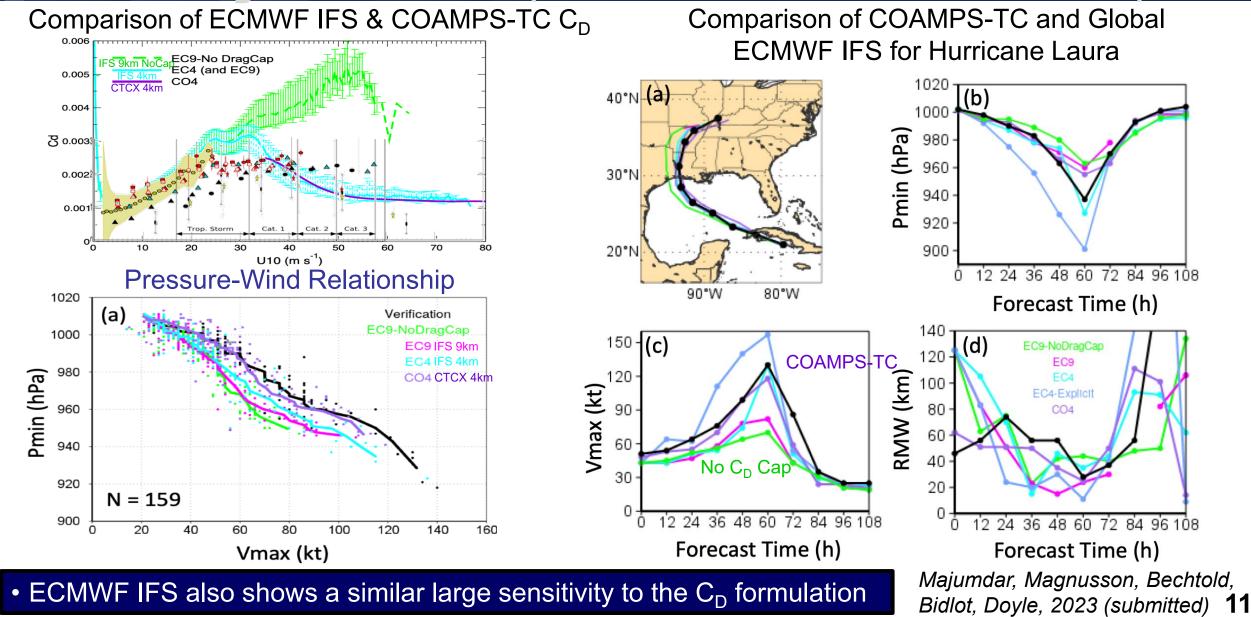
Mean Intensity Error (kt)



- Motivation: Address large intensity bias in strong storms
- Methods: Explore the C_D Wind relationship
- Key Findings:
 - Large sensitivity of the forecast intensity to the C_D
 - C_D Cap and Rolloff improves bias for most intense (>100 kt) TCs
 - The pressure-wind relationship is very sensitive to the C_D

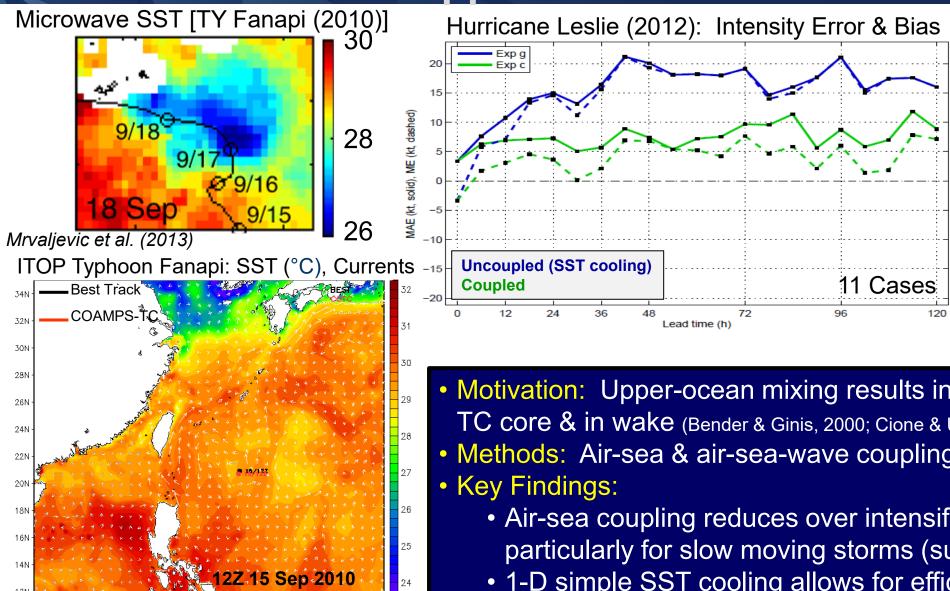


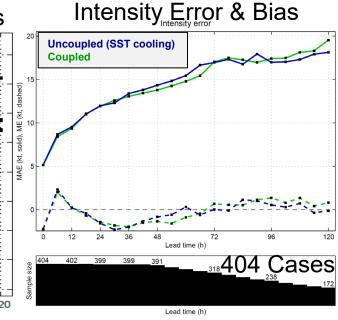
Surface Drag Parameterization C_D Formulation (ECMWF IFS and COAMPS-TC)





Air-Ocean Coupling in Tropical Cyclones **Upper Ocean Processes**





- Motivation: Upper-ocean mixing results in SST cooling beneath TC core & in wake (Bender & Ginis, 2000; Cione & Uhlhorn, 2003; Chen et al., 2007)
- Methods: Air-sea & air-sea-wave coupling; 1-D simple ocean
 - Air-sea coupling reduces over intensification biases, particularly for slow moving storms (such as Hurricane Leslie)
 - 1-D simple SST cooling allows for efficient testing



Hurricane Boundary Layer Sensitivity to PBL Parameterization

- Motivation: TC intensity and structure are very sensitivity to PBL parameterizations (Kepart 2010; Hazleton 2018; Zhu 2021; Chen 2022)
- Methods: Testing 1.5 Order TKE scheme, 1st order closure (YSU PBL)
- Key Findings:
 - Sensitivity of intensity and structure to mixing length (& S_h, S_m)
 - NRL MY (Blackadar 1962; Mellor & Yamada 1982; Burk & Thompson 1990)
 - Bougeault (Bougeault & Andre 1986; Bougeault & Lacarrère 1989)
 - Hybrid (Mellor-Yamada in PBL and Bougeault above PBL)
 - Poor performance of the 1st order close scheme (YSU) (not shown)

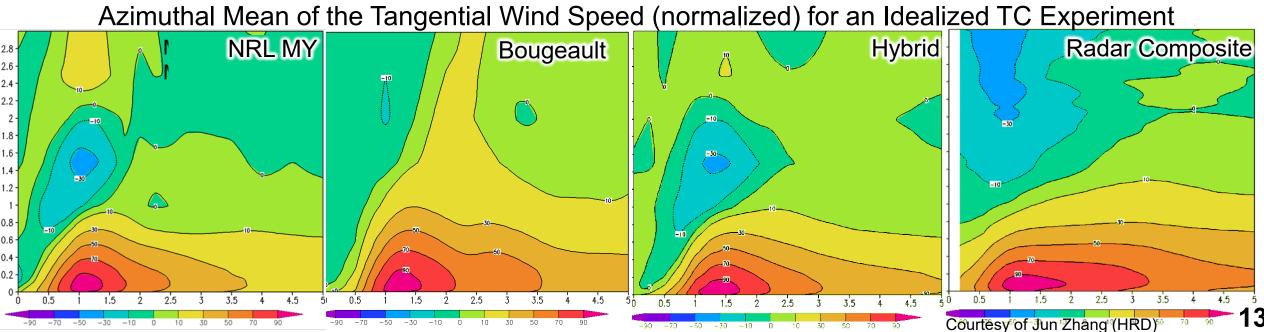
COAMPS-TC 1.5 order closure (modified Mellor and Yamada 1982)

$$e = (\overline{u'^2 + v'^2 + w'^2})/2$$
 $K_{h,m} = S_{h,m} l e^{-1/2}$

$$\frac{D}{Dt}(e) - \frac{\partial}{\partial z} (K_e \frac{\partial}{\partial z}(e)) = K_M (\frac{\partial U}{\partial z})^2 + K_M (\frac{\partial V}{\partial z})^2$$
Diffusion Shear

$$-\beta g K_H \frac{\partial \theta}{\partial z} - \frac{(2e^{-})^{3/2}}{\Lambda_1} + U \frac{\partial}{\partial x} (e)^* + V \frac{\partial}{\partial y} (e)^*$$

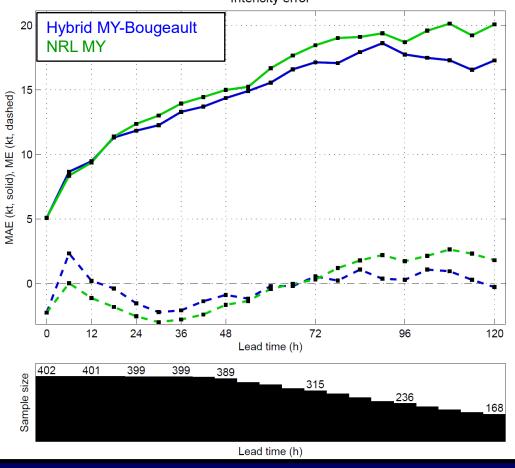
Buoyancy Dissipation Advection



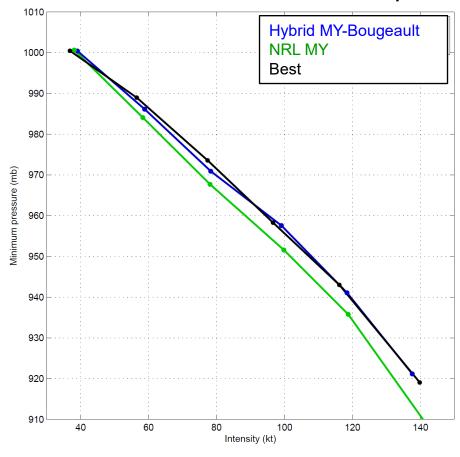


Hurricane Boundary Layer Sensitivity to PBL Parameterization

Intensity MAE (solid) and ME (dashed)



Pressure-Wind Relationship



- Using the MY-Bougeault mixing length improves the intensity MAE, ME, and pressure-wind relationship
- The MY mixing length produces more weaker storms and over intensifies stronger storms
- The radius of the 34 kt (and 50 kt, RMW) are slightly degraded by the MY-Bougeault mixing length



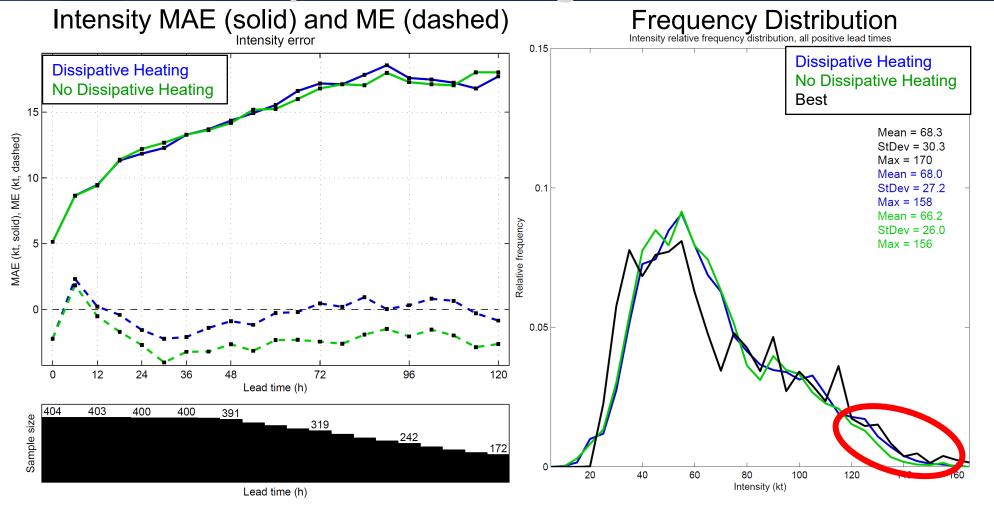
Hurricane Boundary Layer Dissipative Heating

Dissipative Heating Parameterization

$$C_p \frac{\partial T}{\partial t} \approx \varepsilon$$

$$\varepsilon = -\frac{1}{2} \left[\frac{\partial (u'^2 + \upsilon'^2)}{\partial t} \right]_{diss}$$

Following Jin et al. (2007)



- Dissipative heating improves mean intensity bias by ~2-3 kt, especially for strong TCs
- Intensity relative frequency distribution is improved for strong TCs



Microphysics

Sensitivity to Microphysics Representation

- Motivation: Large uncertainties exist in the representation of cloud microphysics (Morrison et al. 2020). Parameterizations of convection, clouds and interaction with radiation are key for accurate TC forecasts of track, intensity, and structure (Wang 2002; Bu et al. 2014; Jin et al. 2014; Fovell et al. 2010, 2016; Park et al. 2020)
- Methods: Single (NRL) and double moment schemes (Thompson, Morrison) experiments and diagnostics

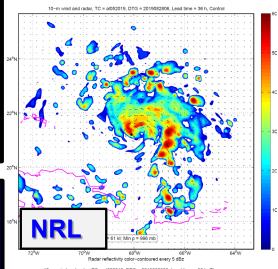
Homogeneous ice nucleation Riming Vapor deposition Aggregation Heterogeneous ice nucleation Wet growth Secondary ice production CCN/INP Coalescence Condensation Drop breakup Evaporation

Morrison et al. (2020)

Key Findings:

- Substantial differences in storm structure and hydrometeor distribution, and intensification (including RI) using NRL, Thompson, and Morrison microphysics
- Interactions of clouds, convection and radiation is important for TCs structure and intensity as well

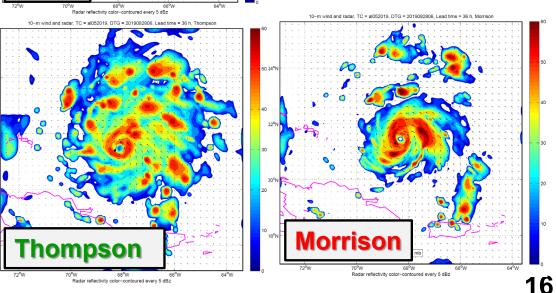
Simulated radar reflectivity, 36 h CTCX forecast for Hurricane Dorian



NRL (Control): 6 class microphysics with graupel

Thompson: 6-class
microphysics with graupel.
Prognostic ice and rain number
concentrations.

Morrison: 6-class microphysics with graupel. Prognostic rain,
 ice, snow, and graupel number concentrations.



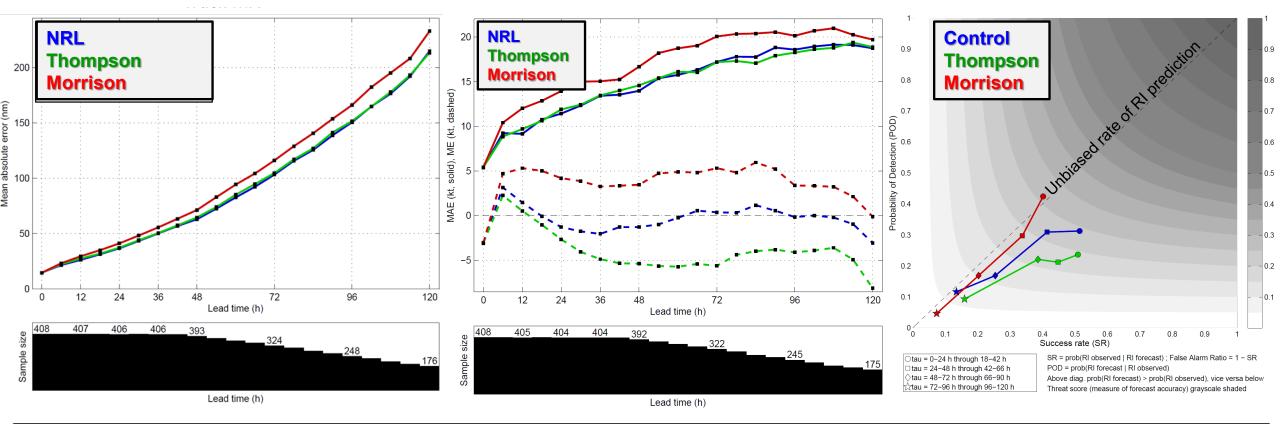


Microphysics Sensitivity to Microphysics Representation



Intensity MAE (solid) and ME (dashed)

RI performance: 2018-2020 sample

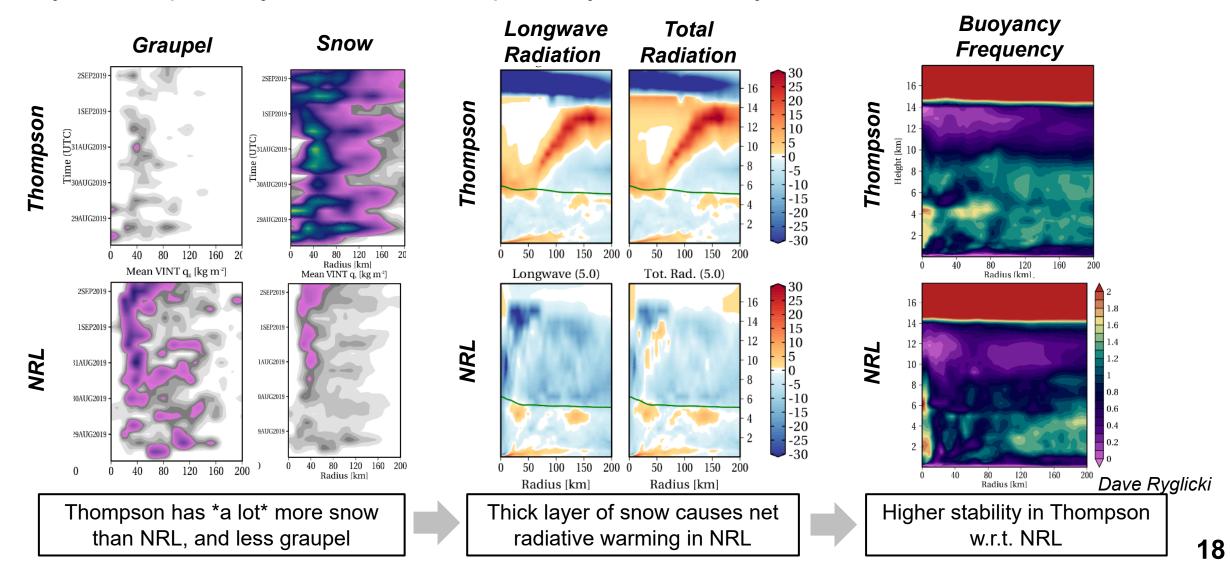


- Thompson has a similar track bias as the NRL, but Morrison lags the NRL scheme by 10% or more.
- Thompson has weak intensity bias, but similar MAE w.r.t. NRL. Morrison is too strong with poor accuracy.
- The NRL scheme has the best RI accuracy, but Morrison has best RI relative frequency



Microphysics Sensitivity to Microphysics Parameterization

Why are tropical cyclones in Thompson systematically weaker than in the Control?





Microphysics Observations in Hurricane Ida ONR TCRI Microphysics Observations

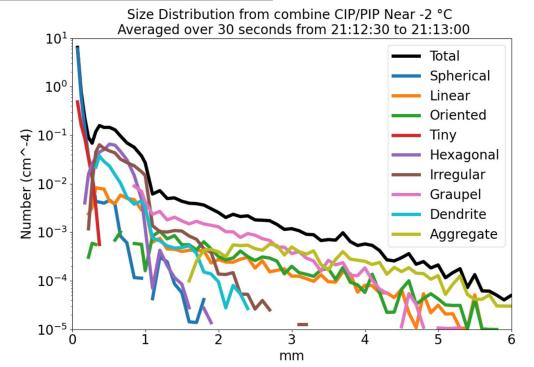
Hurricane Ida P3 track microphysical spiral

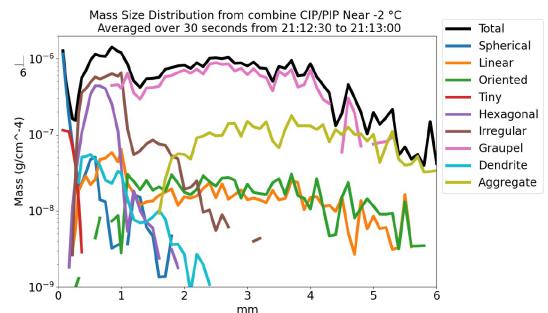


Hydrometeors transition from water to ice



- Motivation: Lack of observations of cloud microphysics in TCs
- Methods: New microphysics obs (NOAA P3s) in ONR TCRI
- Preliminary Findings:
 - Sample size and habit distribution near -2 C
 - Numerous spherical particles below 0.2 mm (supercooled drops?)
 - High concentrations of pristine ice (plates, dendrites) and possible rimed ice (irregular) near 1 mm
 - Graupel and aggregates dominate distribution > 1 mm





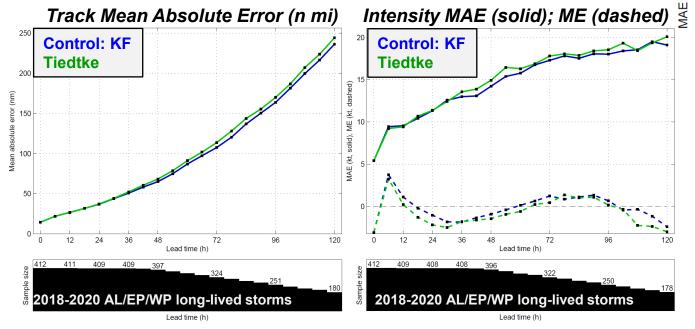
Michael Bell, Alex DesRosiers, and Chelsea Nam (Colorado State Univ.)
ONR TCRI Team and NOAA APHEX Team

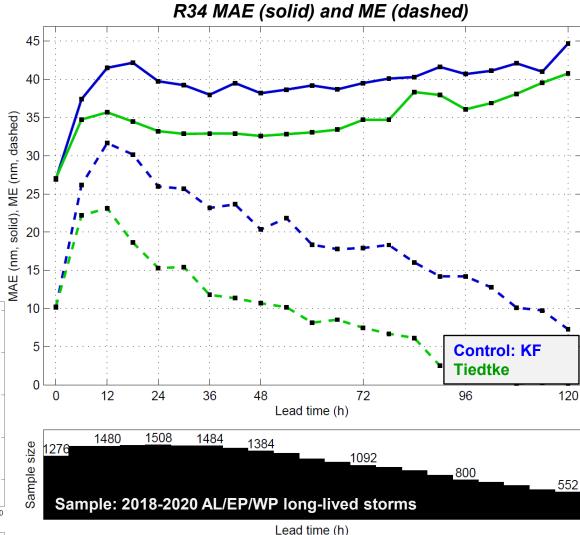
1



Convection Deep Convection

- Motivation: CTCX track errors lag global models. Track errors have been linked to cumulus parameterization. (Nasrollahi et al. 2012; Sun et al. 2014a,b; Shepherd & Walsh 2017)
- Methods: Testing with Kain Fritsch, Tiedtke (WRF), and SAS (NOAA)
- Key Findings:
 - Some sensitivity to track and intensity, however greater sensitivity to the wind radii, in part due to changes in the middle tropospheric moisture biases.



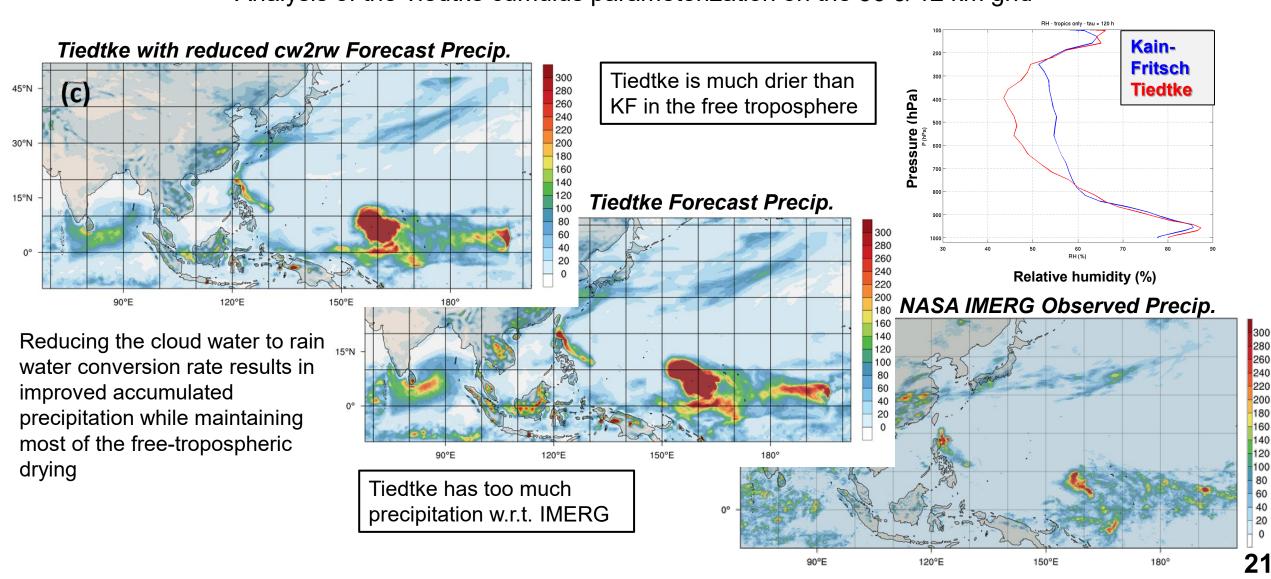


Tiedtke has a drier middle free troposphere than KF, which helps reduce positive bias in R34



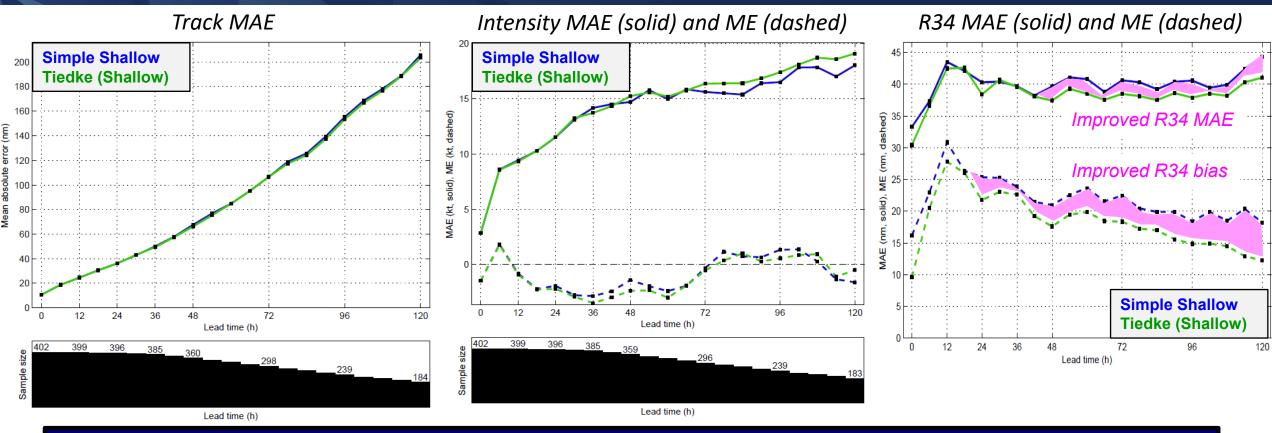
Convection Deep Convection: Kain-Fritsch vs. Tiedtke

Analysis of the Tiedtke cumulus parameterization on the 36 & 12 km grid





Convection Shallow Convection



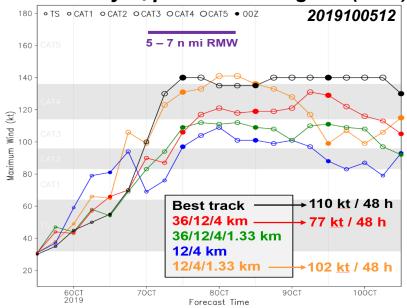
- Motivation: Impact of shallow and congestus convection parameterization on TC track (Han and Pan 2011; Torn and Davis 2012) and intensity and structure (Wang 2014; Parker et al. 2016)
- Methods: Sensitivity tests using a simple shallow convection and the Tiedtke shallow convection
- Key Findings:
 - Tiedtke (mass flux closure) shallow convection on 36km and 12km meshes improved the R34.
 - Tiedtke convection scheme on the fine mesh results in an over-intensification bias



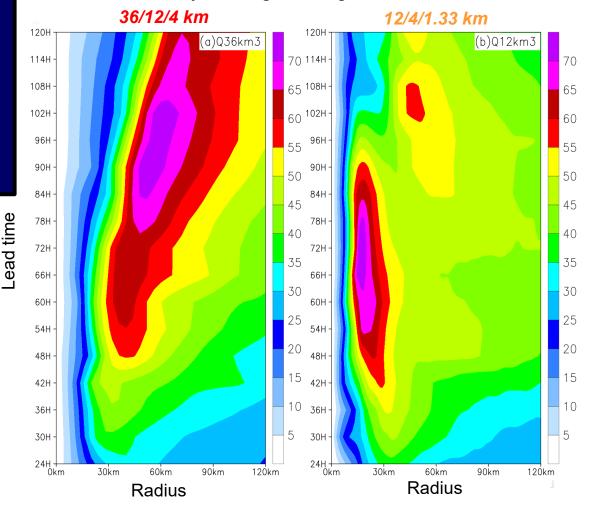
Sensitivity to Resolution Horizontal Resolution

- Motivation: Numerical prediction of TC intensity & structure require resolving horizontal scales of ≤4 km to capture sharp gradients of momentum & moisture (Alaka et al. 2022). COAMPS-TC does not predict intensification of small core systems well.
- Methods: Higher horizontal/vertical resolution tests; case studies
- Key Findings:
 - Higher horizontal resolution (~1 km) improves structure and intensity of small core systems (necessary but not sufficient)

Intensity experiments: Hagibis (20W)

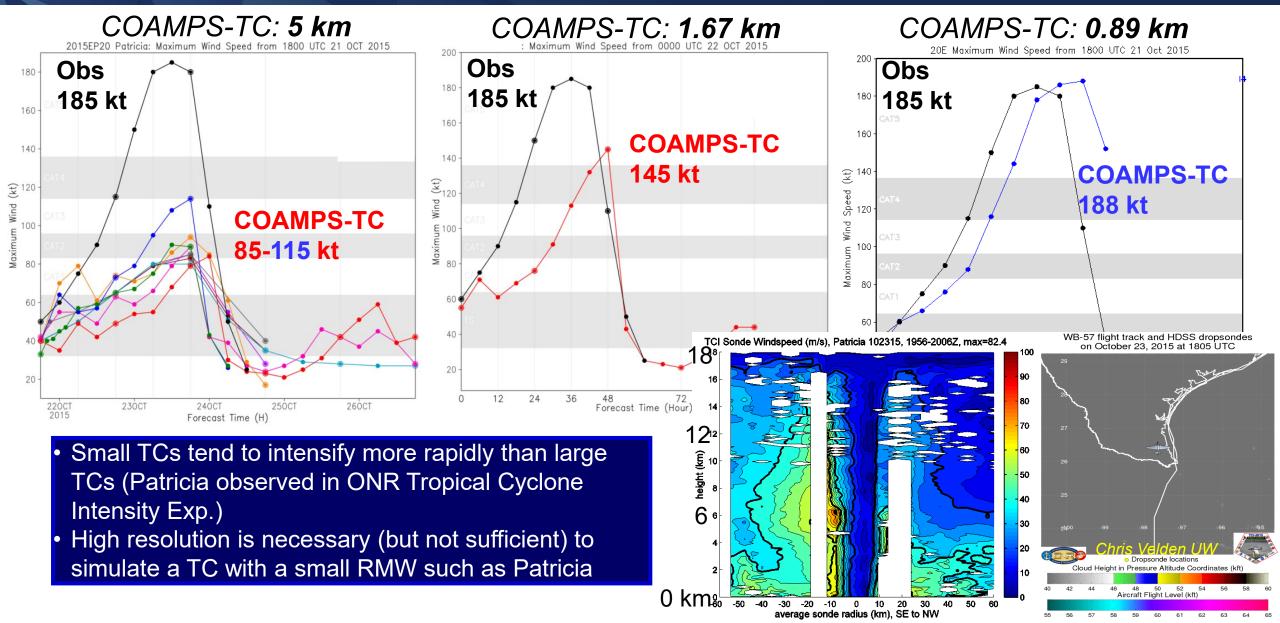


Azimuthally Averaged Tangential Wind at 1 km





Sensitivity to Resolution Horizontal Resolution: Hurricane Patricia





Sensitivity to Resolution

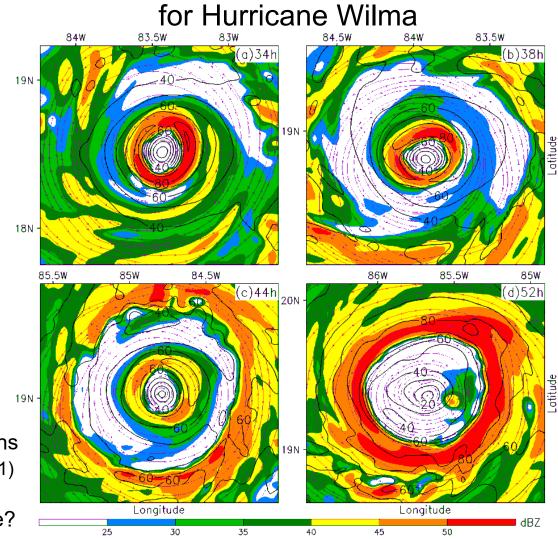
Secondary Eyewall Formation / Eyewall Replacement Cycle

Secondary Eyewall Formation / Eyewall Replacement Cycle in Hurricane Ian



- ERCs form due to the interplay between annular heating and BL inflow
- During SEFs/ERCs, the maximum wind speed of the inner core weakens significantly after formation of the secondary eyewall (Sitkowski et al. 2011)
- Wind field then broadens, which has implications for impacts
- Can operational TC models predict SEFs/ERCs are these predictable?

At high resolution (1.67 km), COAMPS-TC can represent a SEF/ERC

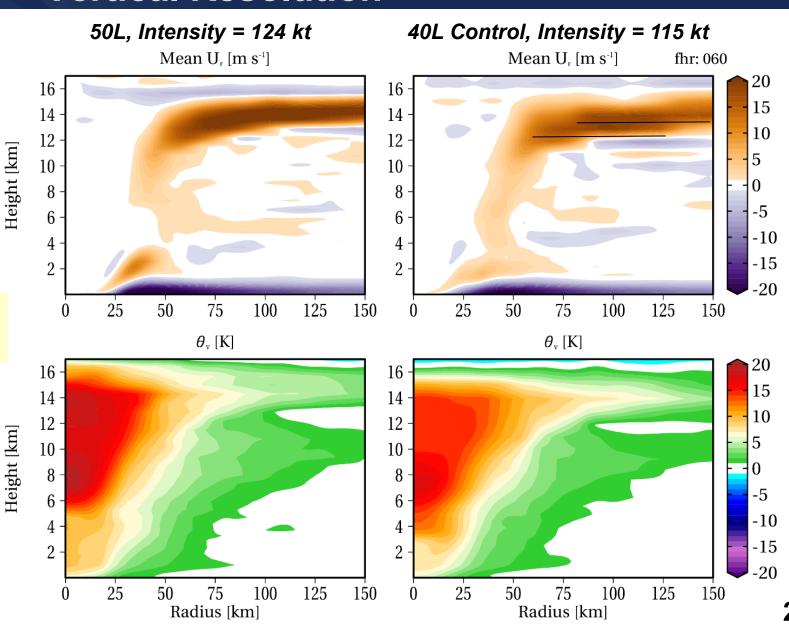




Sensitivity to Resolution

Vertical Resolution

- We have extensively tested 50L and 60L configurations
 - 50L about ~1 kt stronger than 40L
 Control on average
 - RI relative frequency 6.6% in 40L
 Control, 7.5% in 50L
- Why are TCs stronger and quicker to intensity in 50L w.r.t. 40L?
 - Stronger radial outflow around 14 km in 50L w.r.t. 40L
 - Thin layer of radial inflow (above outflow layer) better defined in 50L
 - "Double" warm-core extending to higher altitude in 50L





Future Outlook

Can High-Res Global Models Perform Similarly to a Specialized TC Model?

Comparison of ECMWF IFS and COAMPS-TC

with Observations for Hurricane Laura

for 2020 W. Atlantic Basin (c) EC4 Large-Scale Rain (a) NEXRAD Reflectivity (b) EC4 Convective Rain EC 4km CTCX 4km EC 9km Rate Rate (e) EC4-Explicit Reflectivity EC4km-EC9km (d) EC4 Reflectivity (f) CO4 Reflectivity 60 CTCX-EC4km 50 55 Forecast Time (h) Forecast Time (h) dBZ

Majumdar, Magnusson, Bechtold, Bidlot, Doyle, 2023 (submitted)

Comparison of ECMWF IFS and COAMPS-TC

- In the relatively near future, global models may be able to replicate the skill of high-res. TC models
- Open questions : required resolution, cumulus parameterization, C_D/C_K, coupling, PBL, dynamics



Summary and Recommendation

COAMPS-TC development provides insights into key systematic errors & how to address them

- ➤ Intensity systematic errors identified are most sensitive to:
 - C_D, air-sea coupling, boundary layer, microphysics, shallow & deep convection
- > Track systematic errors identified are most sensitive to:
 - Shallow & deep convection, cloud microphysics and radiation, boundary layer

Recommendations

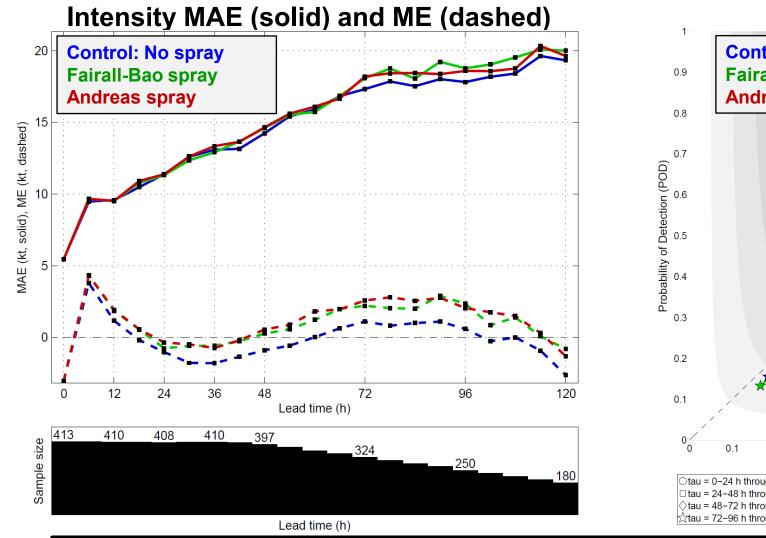
- > Use observations (aircraft, UxS, radar, drops, field programs...), LES to inform model development
- > Focus on TC intensification and structure prediction challenges.
 - ➤ Predicting RI: Models now have sufficient skill for RI that some cases are reasonably captured (e.g. Ida, Laura, Ian), but other TCs that undergo RI remain a challenge (super RI events ...)
 - ➤ Predicting secondary eyewall formation, moderately sheared TCs that intensify, inner core dynamics (roll circulations, TC gusts etc.)
- ➤ Physics challenges: C_D, C_K, air-sea-wave coupling, boundary layer, microphysics, convection
- Next Frontiers: i) TC prediction using coupled, convection-allowing, global models (including S2S);
 ii) Probabilistic impact based predictions (high-resolution ensembles); iii) LES modeling of TCs

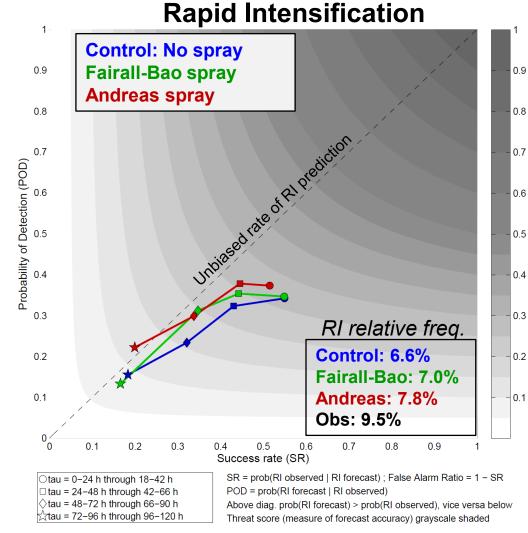


Extra Slides



Air-Ocean Coupling in Tropical Cyclones Sea Spray Processes



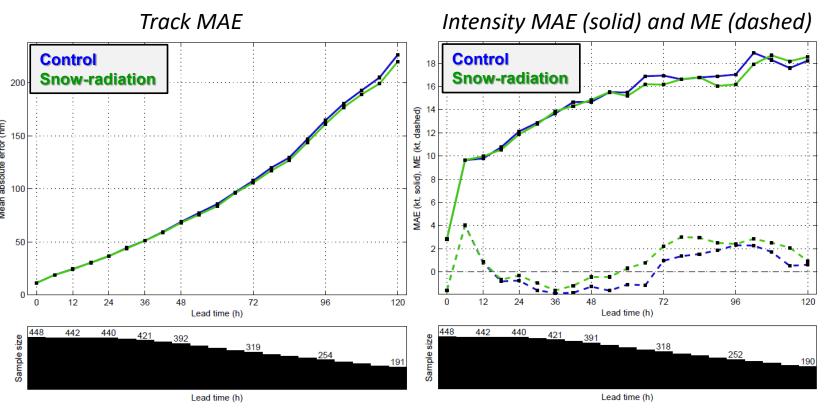


 Sea spray parameterizations (Fairall-Bao and Andreas) show improved RI statistics, however the mean absolute and mean errors are larger than the control

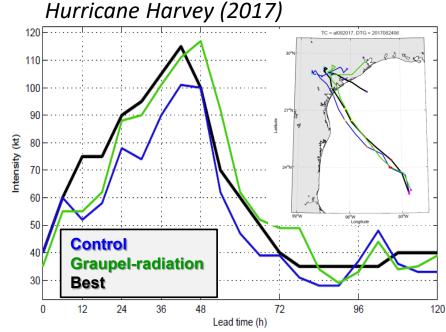


Microphysics Microphysics and Radiation Interactions

Snow-Radiation Interaction



Graupel-Radiation Interaction



- Inclusion of interactions between snow and radiation show modest improvements in track and intensity errors
- Graupel and radiation interactions show improved intensity errors as well



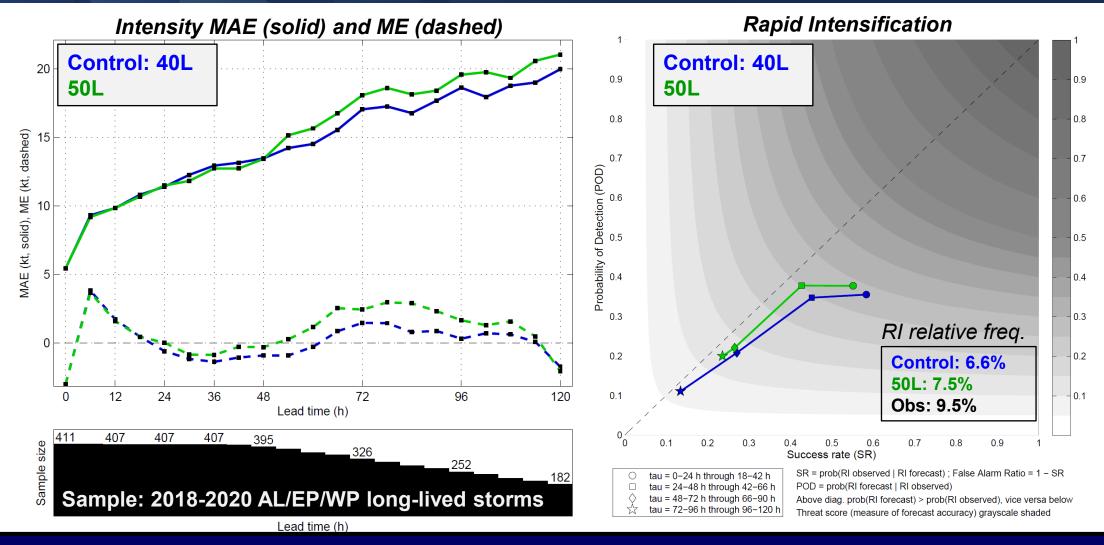
TC Air-Sea Interaction Scanning Radar Altimeter in Hurricane Ivan

- Young, steep, and short waves in the right-rear quadrant
- Older, flatter, and longer waves in the right-front and leftfront quadrants.
- To the left rear and left front of the eye, the wind and waves are at right angles to each other.

Directional wave spectra Hs Tri-modal ⁻⁵⁵⊳55\m|s-1 **HWIND** wind analysis **Bi-modal** (includes SFMR obs.) Courtesy: Ed Walsh



Sensitivity to Resolution Vertical Resolution

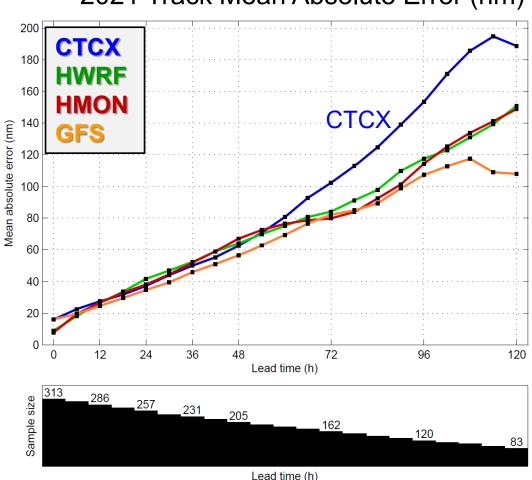


- 50L configuration with additional levels in mid-upper troposphere: Best combo of performance & cost
- 50L improves RI accuracy and bias, but degrades intensity MAE beyond 48 h.

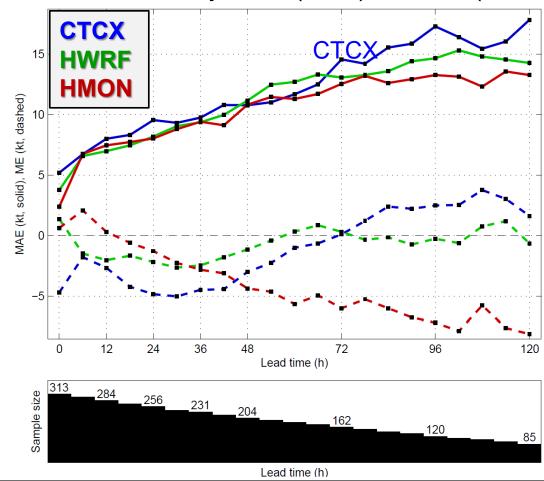


COAMPS-TC PerformanceAtlantic Basin 2020-2021

2021 Track Mean Absolute Error (nm)



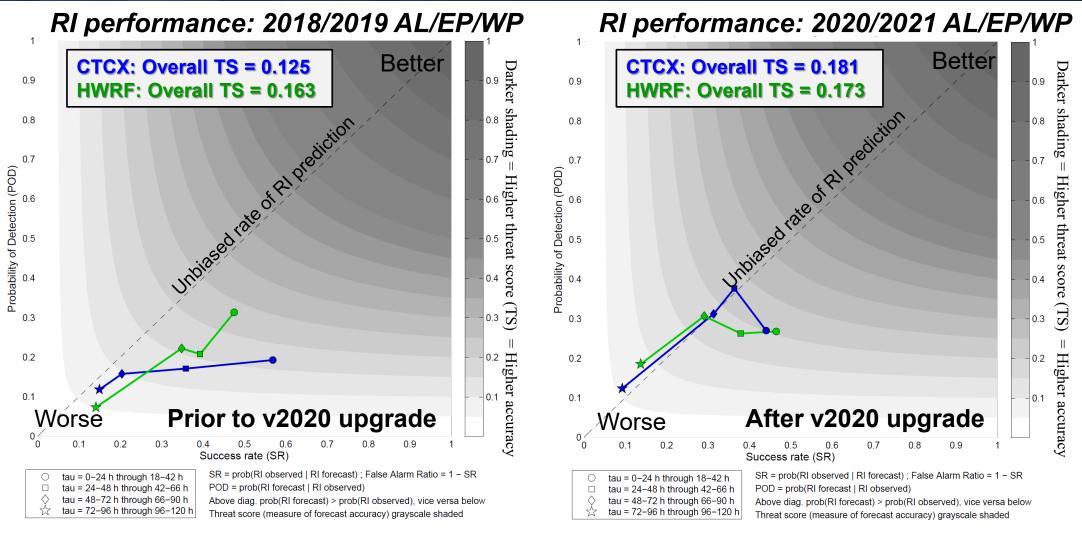
2021 ATL Intensity MAE (solid) and ME (dashed)



- •Low track error for CTCX in 2020; CTCX virtually the same in 2021, yet track errors were worse
- Intensity errors similar to HWRF and HMON to 72h and trailed other models after by 1-2 kts.



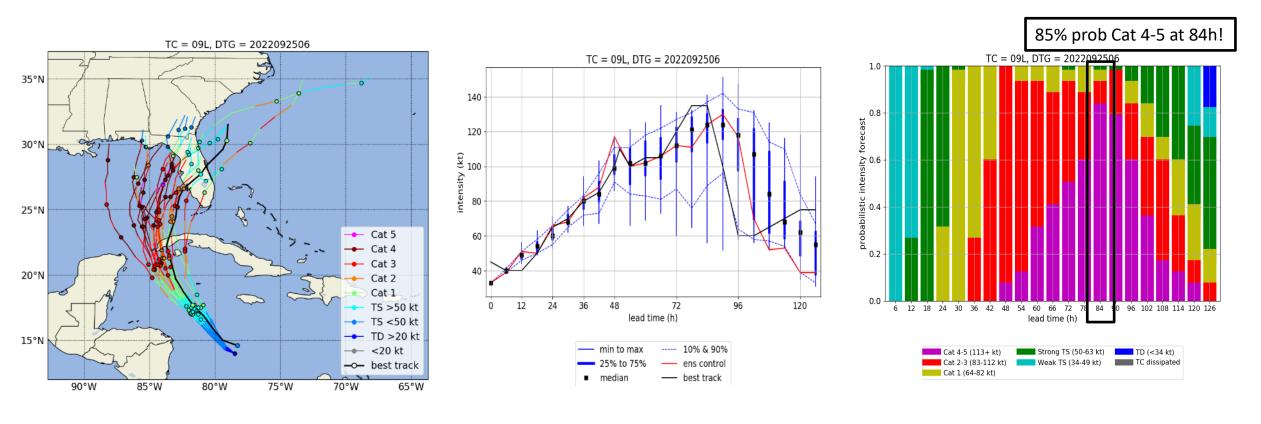
COAMPS-TC RI Performance Atlantic, Eastern Pacific, Western Pacific



After physics and vortex initialization upgrades in 2020, COAMPS-TC showed considerably improved RI forecasts



COAMPS-TC Performance COAMPS-TC Ensemble Prediction for Hurricane Ian

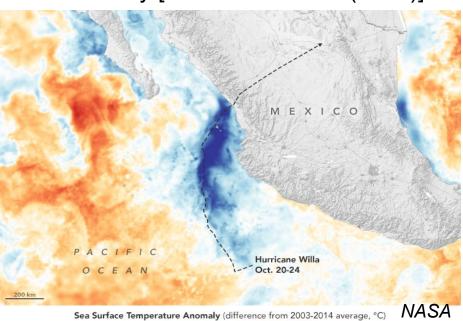


- COAMPS-TC Ensemble intensity forecast was extremely good for lan
- 85% of ensemble members predicted Cat 4-5 at 84h; verification: Cat 4

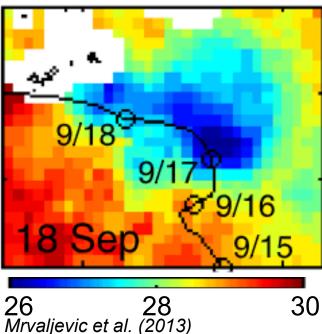


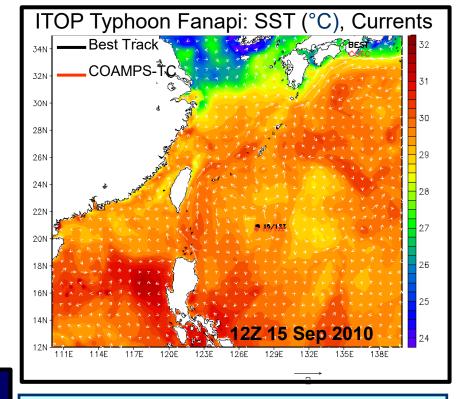
Air-Ocean Coupling in Tropical Cyclones Upper Ocean Processes

SST Anomaly [Hurricane Wilma (2018)]



MW SST [TY Fanapi (2010)]



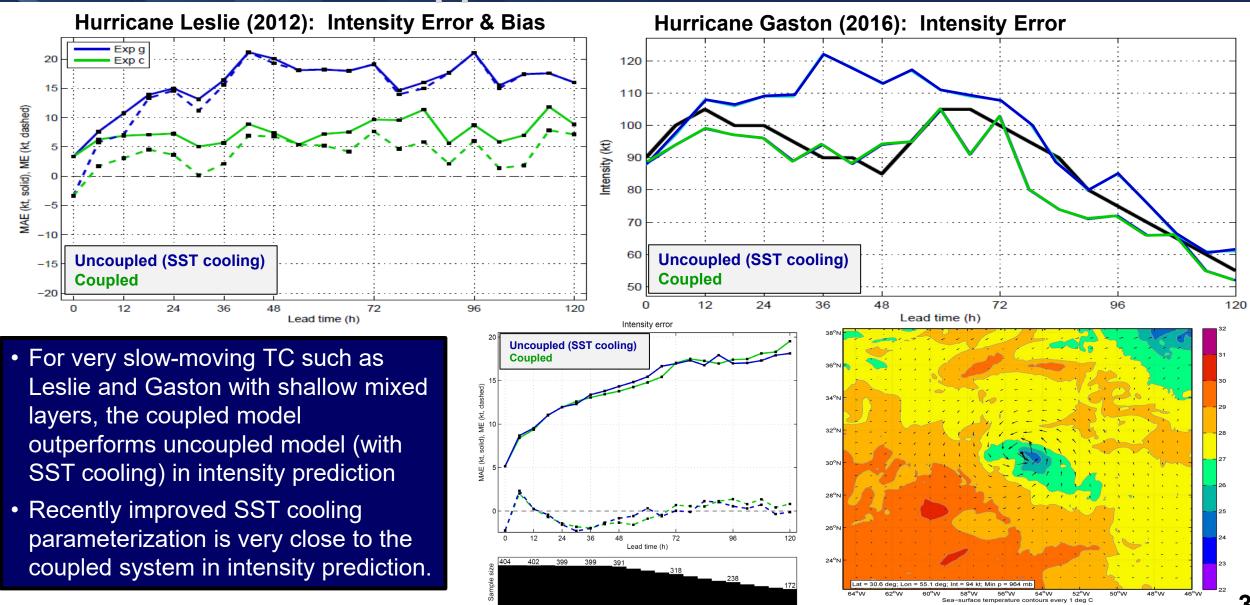


- Motivation: Upper-ocean mixing results in SST cooling beneath TC core & in wake (Bender & Ginis, 2000; Cione & Uhlhorn, 2003; Chen et al., 2007)
- Methods: Air-sea & air-sea-wave coupling; 1-D simple ocean
- Key Findings:
 - Air-sea coupling reduces over intensification biases, particularly for slow moving storms
 - 1-D simple SST cooling allows for efficient testing

Coupled COAMPS-TC Capable of Capturing SST Wake of ~4°C in Agreement with ITOP Observations

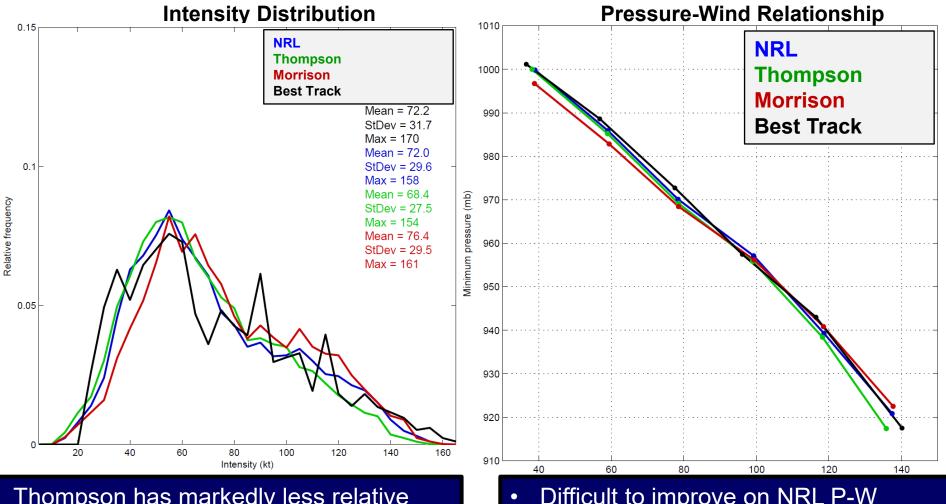


Air-Ocean Coupling in Tropical Cyclones Upper Ocean Processes





Microphysics Sensitivity to Microphysics Parameterization



- Thompson has markedly less relative frequency above 105 kt intensity
- Morrison does not have enough weak intensities (< 50 kt)

 Difficult to improve on NRL P-W relationship: Thompson's pressure is a little low at high intensity; Morrison pressure a little low at low intensity