IMPROVEMENTS TO OPERATIONAL STATISTICAL TROPICAL CYCLONE INTENSITY FORECAST MODELS

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OUTLINE

Part 1 : Modify Statistical Hurricane Intensity Prediction Scheme (SHIPS) and Logistic Growth Equation Model (LGEM) to use daily instead of weekly SST

Part 2: Modify SHIPS and LGEM to **use Depth Averaged Temperature (DAVT)** to account for SST cooling

Part 3: Add TC structure forecasts to SHIPS/LGEM

SHIPS/LGEM with DSST and DAVT

Operational SHIPS and LGEM use weekly Reynolds SST

- SHIPS/LGEM modified to use DSST, DAVT, and/or RSST for different parts of the code
- DSST retrospective (2004-2015) and parallel (2016) runs and verification completed, results similar to expected
- Adjustments made based on parallel runs:
 - Use 1 or 2 days old DSST for reruns
 - Use RSST if DSST is older than RSST
- Code and verification results for DSST provided to NHC
- SHIPS/LGEM retrospective runs with DAVT assuming constant mixing depth completed
- New climatology developed to include MLD, provided to NHC
- Work continues on use of DAVT based on variable mixing depth

SHIPS/LGEM VERIFICATION DSST VS RSST



2004 - 2015 :

- Most improvement: LGEM EP
- Worse: DSHP AL

2016:

- Improved: LGEM AL, 0 60 hr
- Worse: SHIPS EP
- Biases similar to RSST
- Significant impact in some cases



EP03 2016 Major Hurricane BLAS DSST vs RSST



DEPTH-AVERAGED TEMPERATURE (DAVT)

Use daily SST to estimate a vertical average of the initial (pre-hurricane) ocean *T* (*Price, 2009*), which is better estimate of ocean-TC interaction than OHC

$$T_{\overline{d}}(x,y) = \frac{1}{d} \int_{-d}^{0} T_i(x,y,z) dz$$

d – depth of vertical mixing caused by TC



- EP significant, up to 7% improvement for LGEM for FLT > 30 h
- AL forecast get much worse
- Possible reasons:
 - Not using MLD climatology: updated climatology developed
 - Need to adjust empirical MPI
 - Need to use DAVT based on variable mixing depth for the AL

DAVT ASSUMING VARIABLE MIXING DEPTH : OCEAN AGE (OA)

"Ocean Age" – a measure of the amount of time the storm area within R = 60 nmi has been over the same patch of ocean



$$OA = \int_{-L_{max}}^{0} Fdt$$

$$L_{max} = Max Tlag with D < 2R$$

- Average OA: AL 6.5 hours, EP 7.6 hours
- Critical Translational
 - Speed: Ocean Age
 - = Inertial Period

 $\begin{array}{cc} \text{Mixing} & \text{Upwelling} \\ Mixing \ Depth = a + b * OA + c(lat) * OA^2 \end{array}$







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SHIPS-BASED WIND RADII FORECASTS (DSWR)

Design Principles

- Predicts TC size changes
- Multiple regression
- Environmental predictors
- Storm predictors
- Wind radii via parametric model
- MSLP is also estimated
- Contribute positively to RVCN (Sampson and Knaff (2015)
- Was run at CIRA in 2016
- Was supplied to NHC in 2016
- Published 2017

Hurricane Matthew 1 October 00 UTC



Knaff, J. A., C. R. Sampson, and G. Chirokova, 2017: A global statistical-dynamical tropical cyclone wind radii forecast scheme. Wea. Forecasting. doi: 10.1175/WAF-D-16-0168.1.

DSWR MEAN ABSOLUTE ERRORS AND BIAS (GALES/34-KT)

AL: Large DSWR errors

> EP DSRW

- skillful vs DRCL
- \succ among top performers
- 2016 unusual AL year
- all models were high biased!
- Will look at the source of high bias
- DSWR has near zero bias In the East (&West Pac)!

Decay SHIPS wind radii (DSWR) HWRF GFDL/GFTI Wind Radii CLIPER (DRCL)



CONSENSUS (RVCN) IMPROVEMENTS

RVCN North Atlantic, 2016 70 60 50 MAE [n mi] 40 30 20 10 12h 24h 36h 72h 96h 120h 48h Forecast Hour ■ R34 without \equiv R34 with ■ R50 without \equiv R50 with ■ R64 without \equiv R64 with

DSWR provided either improvements or **no** degradation to the multimodel wind radii consensus (RVCN) when added as a member **– all basins**

RVCN included HWRF, GFS, GFDL

- Largest improvements with DSWR inclusion
- 1. R64 (0 to 28%)
- 2. R50 (0 to 10 %)
- 3. R34 (0 to 9%)
- See Sampson & Knaff (2015)





SUMMARY AND CONCLUSIONS

SHIPS/LGEM with daily Reynolds SST:

- Completed and verified retrospective (2004 2015) and parallel (2016) runs
- Results: overall intensity forecast can get slightly better or worse with DSST, biases are reduced, DSST contribution can be very significant in some cases
- Code and verification results provided to NHC
- SHIPS/LGEM with Depth Averaged Temperature:
 - > Modified models to use RSST, DSST, DAVT in different parts
 - Completed retrospective runs for 2004 2015 (constant mixing depth): improvement for EP
 - Working on estimating variable mixing depth as a function of TC translation speed using OA

TC structure forecasts:

- A statistical-dynamical method developed to estimate wind radii and MSLP for global TCs using satellite data and SHIPS/LGEM intensities. (Based on 1996-2014 data)
- Parallel runs and verification completed for 2016, code provided to NHC, JTWC
- > 2016 results: AL high bias; EP almost zero bias; improves RVCN

<u>Remaining work:</u>

- > Complete tests and retrospective runs with DAVT with varying mixing depth
- > Apply changes to the global version (2017) of SHIPS/LGEM
- Conduct parallel runs for 2017 season and respond to feedback

ADDITIONAL SLIDES

Abbreviations used:

- Statistical Hurricane Intensity Prediction Scheme (SHIPS)
- Logistic Growth Equation Model (LGEM)
- Decay SHIPS wind radii (DSWR) forecasts
- Tropical Cyclone (TC)
- Sea Surface Temperature (SST)
- Weekly Reynolds SST (RSST)
- Daily Reynolds SST (DSST)
- Depth-Averaged Temperature (DAVT)
- Maximum Potential Intensity (MPI)
- Ocean Age (OA)
- Mixed Layer Depth (MLD)