

# Improvements in Statistical Tropical Cyclone Forecast Models: A Year 2 Joint Hurricane Testbed Project Update

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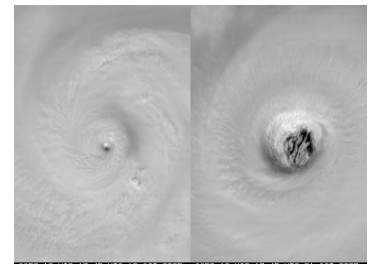
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# Outline

- Project Tasks
  1. Extended range baseline models for track and intensity
  2. Update of SHIPS/LGEM databases using new NCEP Climate Re-analysis
  3. Extending LGEM to 7 days
  4. SHIPS/LGEM specific for the Gulf of Mexico
- Progress so far
- Plans for 2013 season

# 1. New Baseline Forecast Models

- CLIPER and SHIFOR used as baseline for measuring track and intensity forecast skill
  - Errors provide estimate of forecast difficulty
- Input to linear regression equations
  - $t = 0$  h max wind, lat, lon, motion vector
  - $t = -12$ h max wind, lat, lon, motion vector
  - Julian Day
- Output
  - 5-day forecast of lat, lon, max wind
- Decay-SHIFOR modifies intensity over land using CLIPER track and climatological decay rate

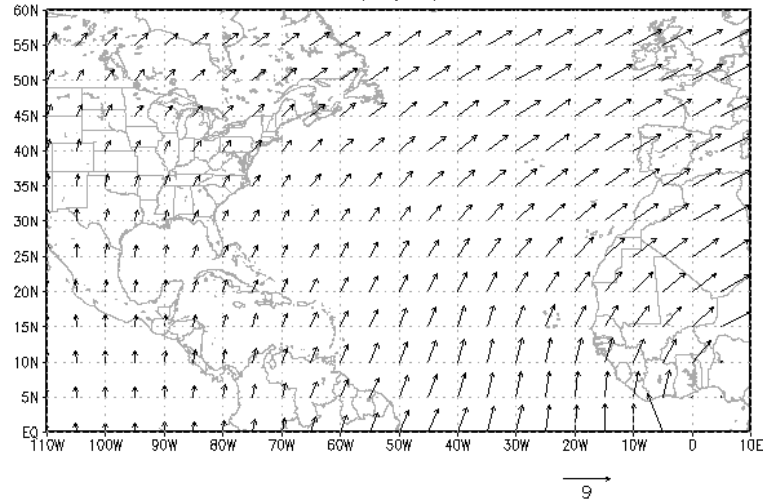
# Trajectory Approach for Baseline Models (T-CLIPER)

$$dx/dt = u \quad dy/dt = v \quad (1)$$

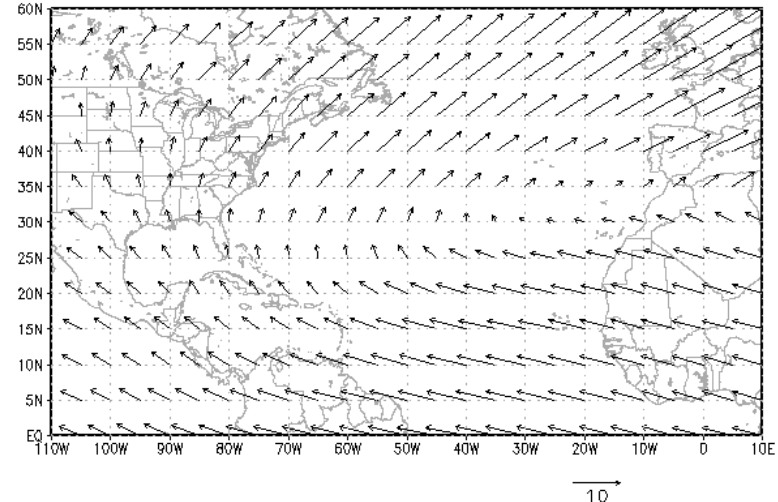
- Estimate  $u, v$  from climatological motion vector fields
- Modify  $u, v$  at early times using  $t=0$  motion vector
- Integrate (1) to desired time
- Similar approach for intensity using LGEM prediction equation with climatological input and T-CLIPER track
- Can be run to any forecast time until storm leaves model domain

# Mean Storm Motion Fields from 1982-2011 Sample

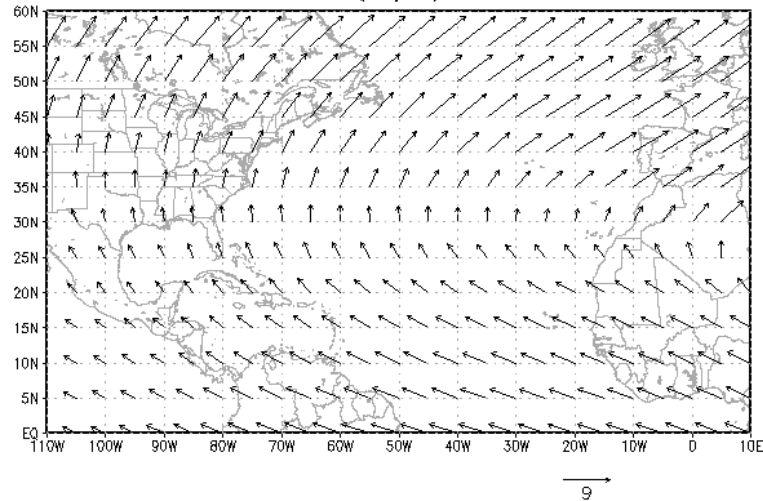
Wind (m/s), MAY



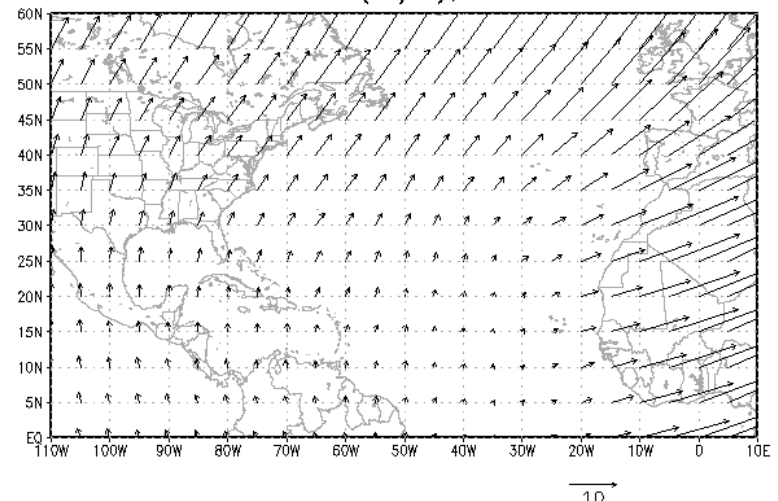
Wind (m/s), JUL



Wind (m/s), SEP



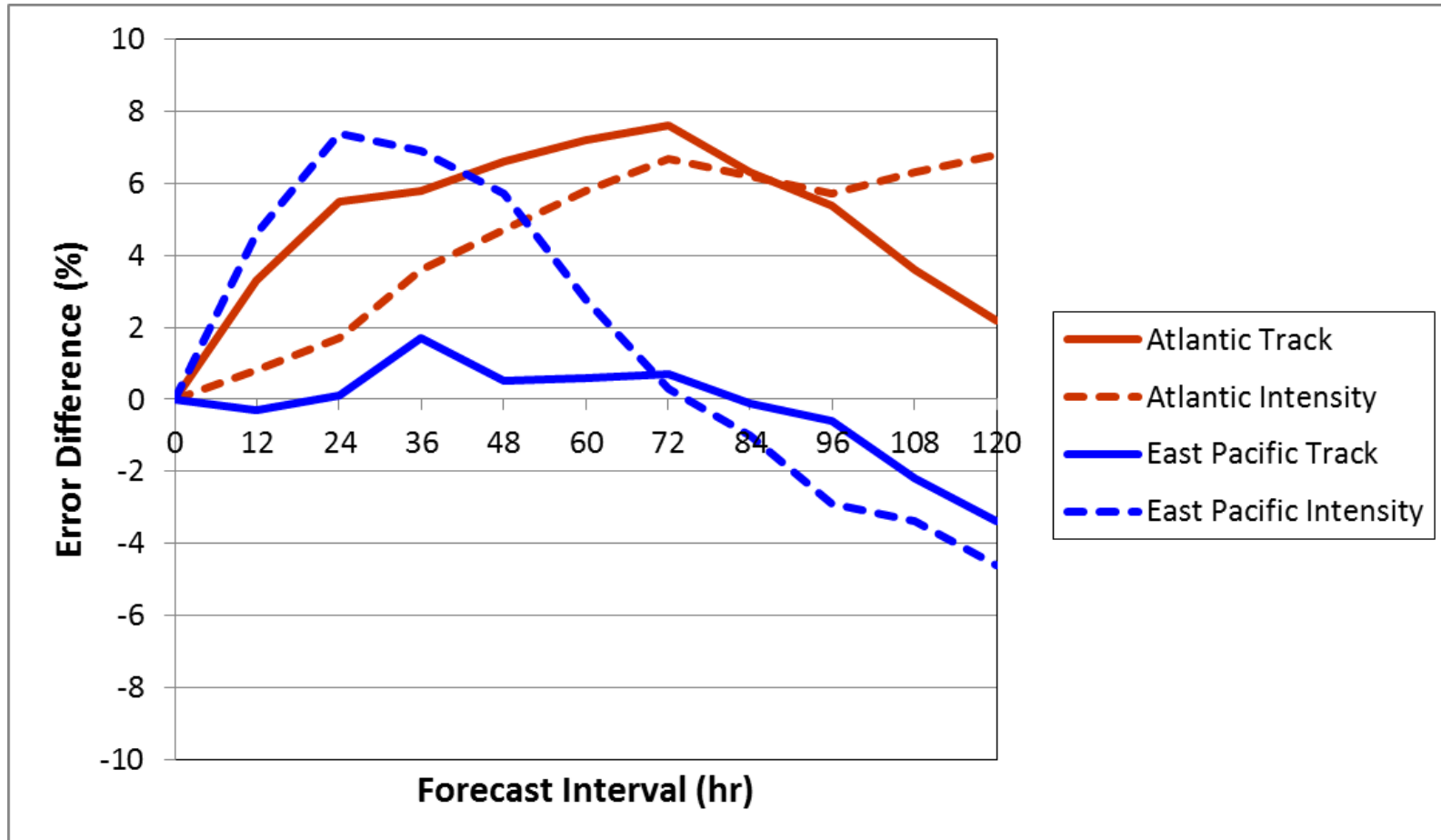
Wind (m/s), NOV



# T-CLIPER Tests

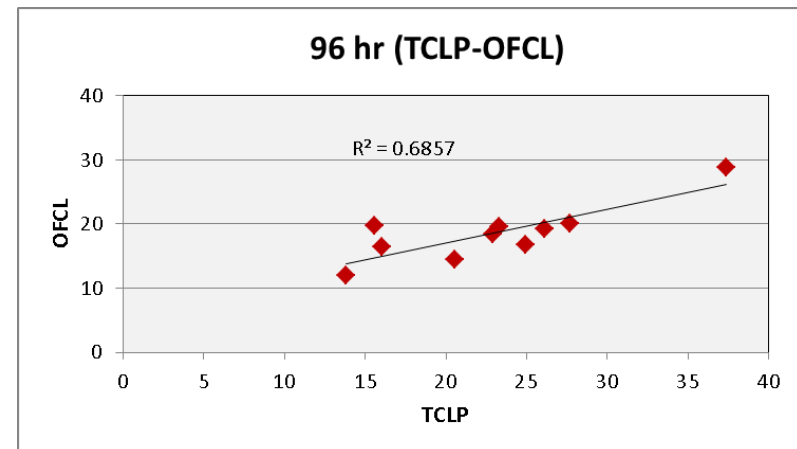
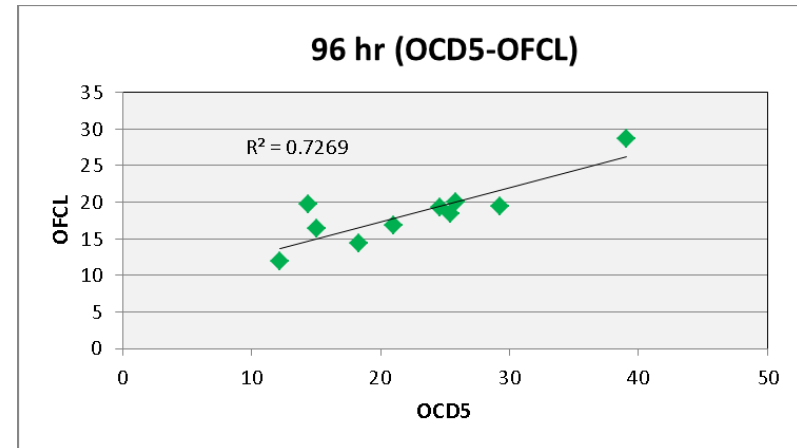
- Run in real time for most of 2012 season
- Re-runs for 2003-2011 using CARQ input
- Evaluation questions
  - How do average errors compare with OCD5 to 5 days?
  - Are annual average T-CLIPER errors correlated with NHC OFCL forecast errors?
  - What is the error behavior beyond 5 days?

# Comparison of T-CLIPER and OCD5 10-year Average Errors



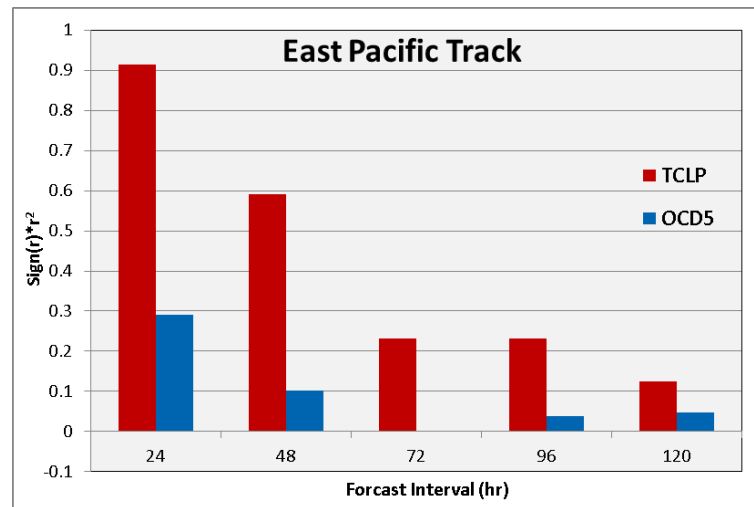
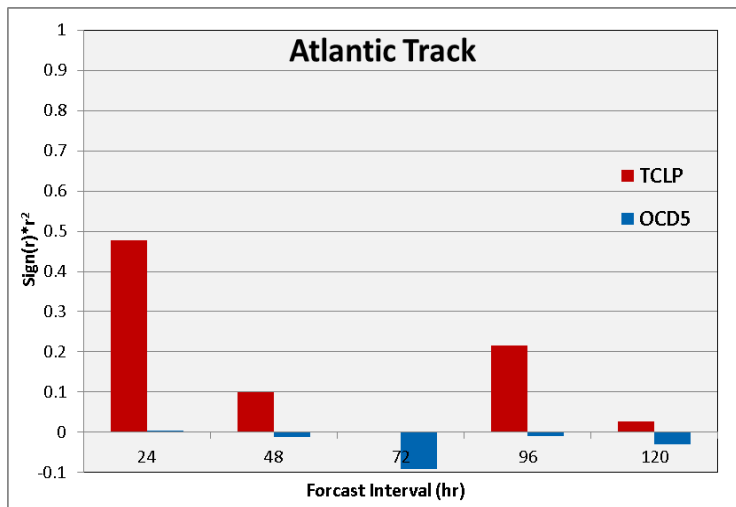
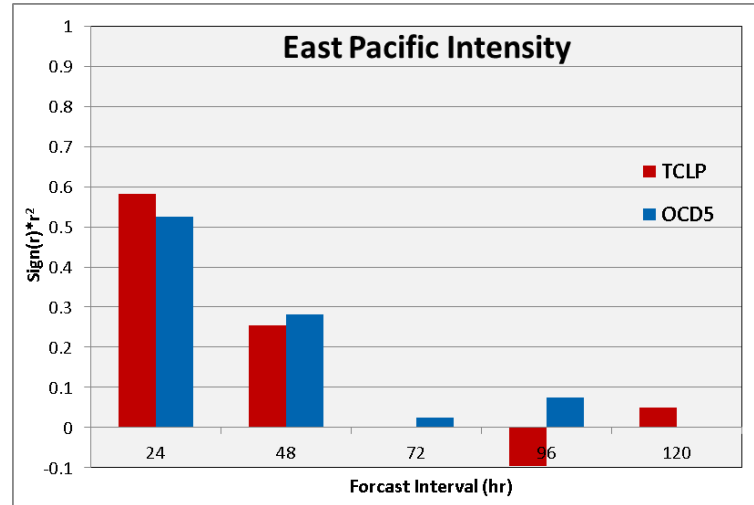
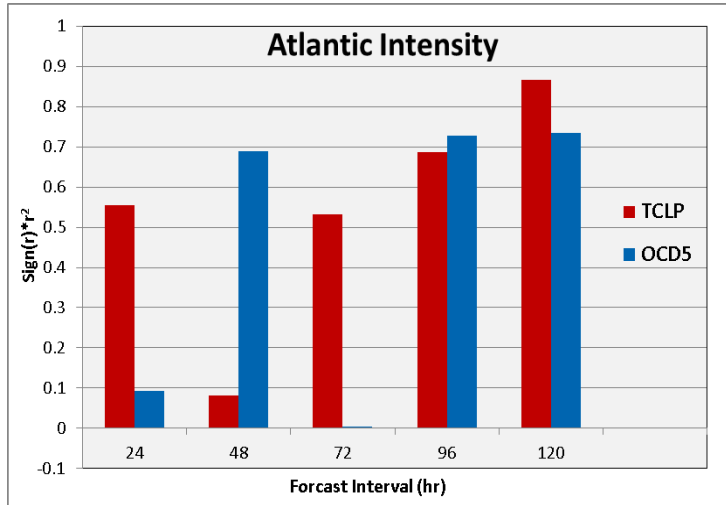
# Correlation of Annual OCD5 and T-CLIPER Errors with OFCL

- Correlate OCD5 and OFCL annual errors for 10 year sample
- Repeat for T-CLIPER and OFCL
- Plot  $r^2$  versus forecast interval
  - Plot  $r^2$  as negative if  $r$  is negative

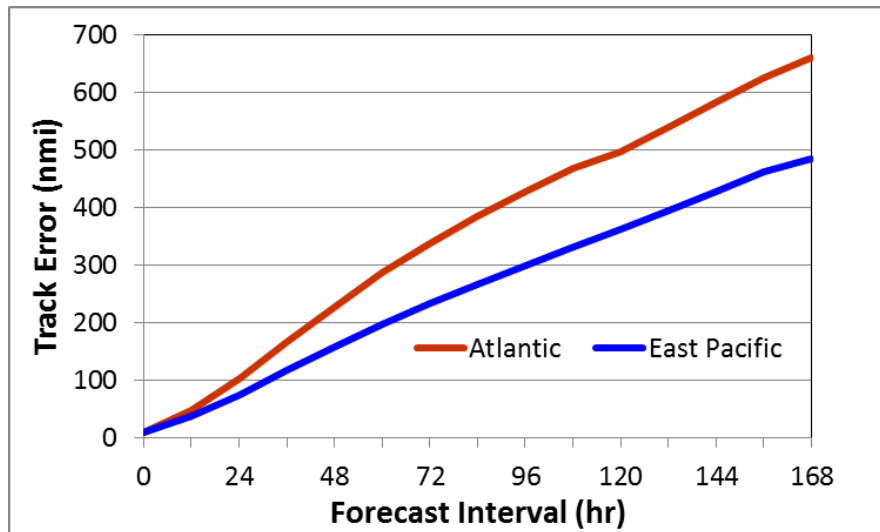




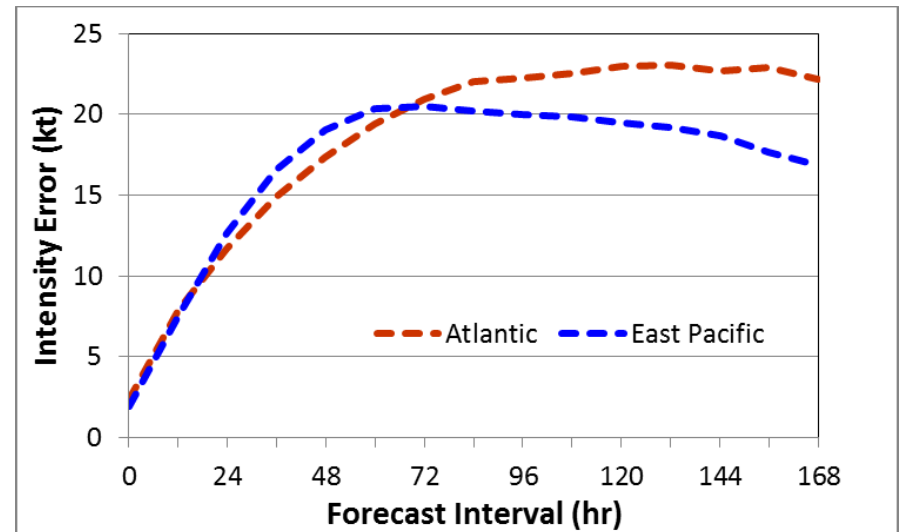
# Variance of OFCL Errors Explained by OCD5 and T-CLIPER



# 10-Year Average T-CLIPER Errors



**Track**

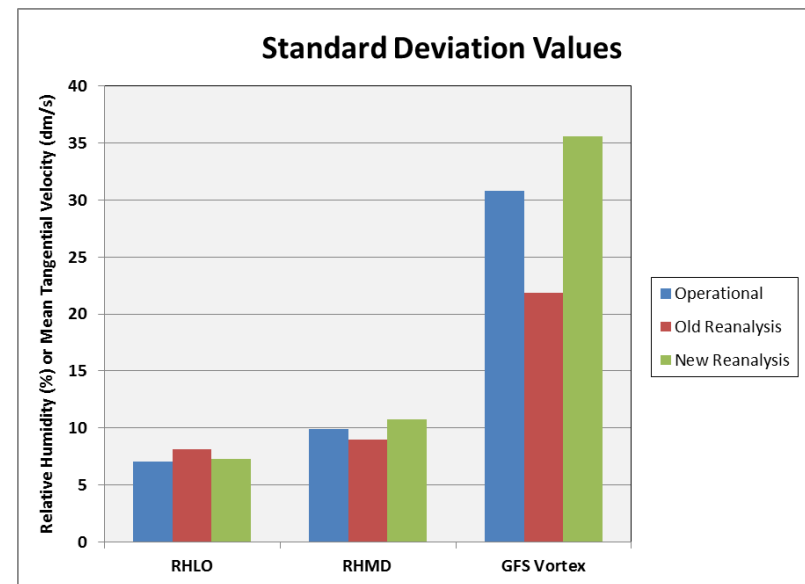
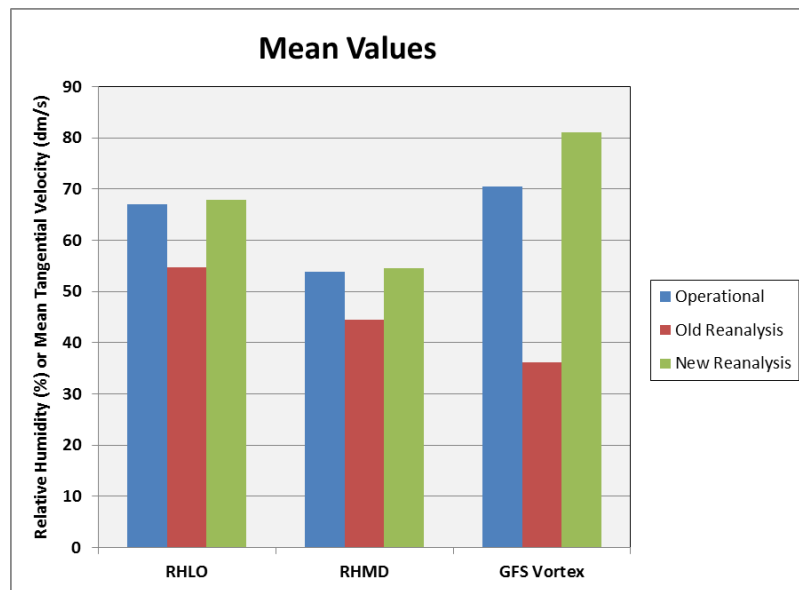


**Intensity**

## 2. New Climate Reanalysis Fields

- New NCEP CFSR reanalysis fields obtained for 1979-2009
  - 0.5° lat/lon grib files
- Current SHIPS database
  - 1982-1999 Old NCEP reanalysis (2.5°)
  - 2000-2011 Operational GFS analyses (2°)
    - Inconsistency of RH and GFS vortex parameters
    - Old reanalysis not used in RII
      - Incomplete operational analyses used for 1989-1999
- 2000-2009 – New, Old reanalysis and Operational analyses all available

# Comparison of SHIPS Predictors for Different Analyses (2000-2009 Atlantic Sample)



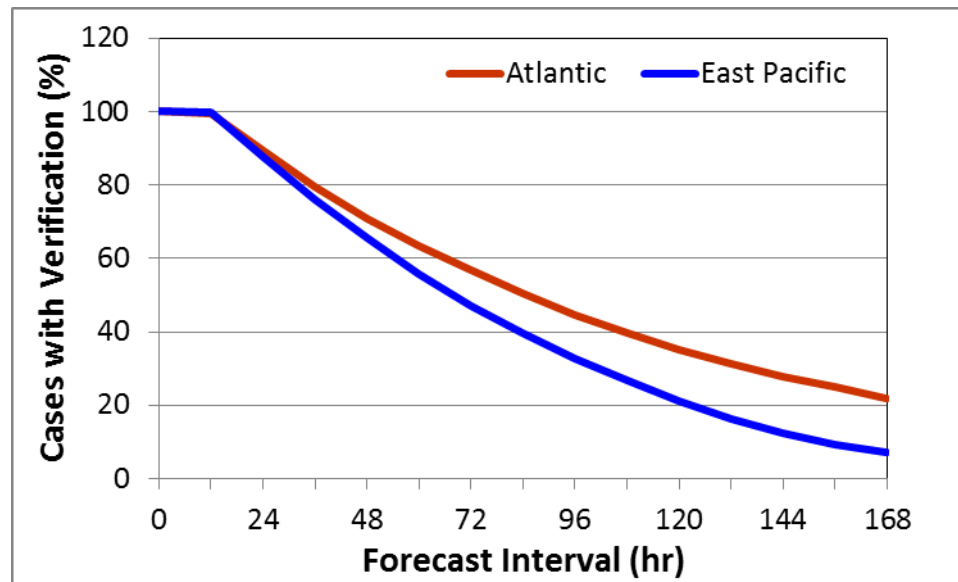
RHLO = 850-700 hPa RH      r=200 to 800 km  
 RHMD = 700-500 hPa RH      r=200 to 800 km  
 GFS Vortex = 850 hPa tangential wind, r= 0 to 600 km

# New SHIPS Database

- 1979-2009: New NCEP reanalysis (1°)
- 2010-2012: Operational GFS analysis (1°)
- 2013 SHIPS, LGEM and RII will all use the same database

### 3. Seven-Day LGEM

- Small sample size beyond 5 days makes fitting difficult
- Use new formulation of LGEM that fits entire forecast at once



2003-2012 Sample

# Comparison of Fitting Methods

- LGEM Equation:  $dV/dt = \kappa V - \beta(V/V_{\text{mpi}})^n V$   
 $\beta, n, V_{\text{mpi}}$  known or specified, need to find  $\kappa$
- Old fitting method
  - Solve for  $\kappa$ :  $\kappa = (1/V)dV/dt + \beta(V/V_{\text{mpi}})^n V$
  - Calculate  $\kappa$  from best track
  - Fit best track  $\kappa$  to predictors using least squares at each forecast period (6, 12 ..., 168 h)
- New fitting method
  - Define “cost” function  $E = \frac{1}{2} \int (V_{\text{fcst}} - V_{\text{obs}}) dt$
  - Find single set of  $\kappa$  coefficients to minimize  $E$ 
    - Requires adjoint of LGEM equation for fitting

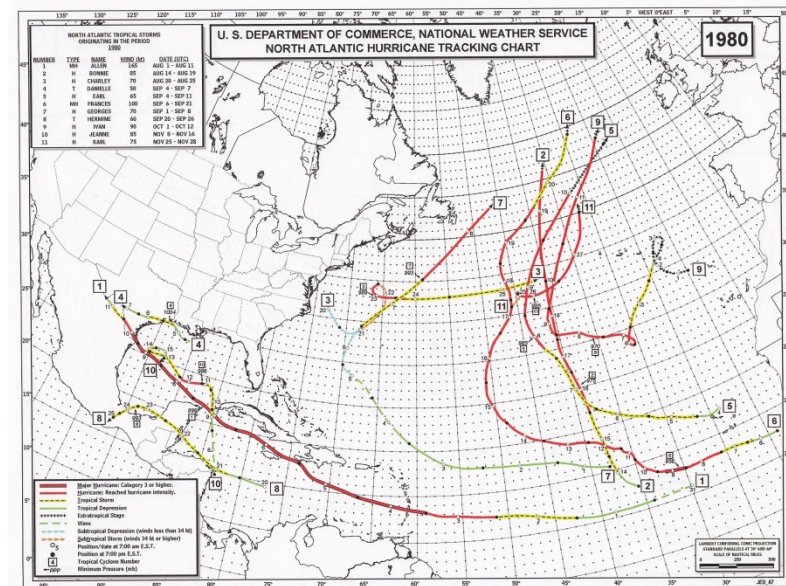
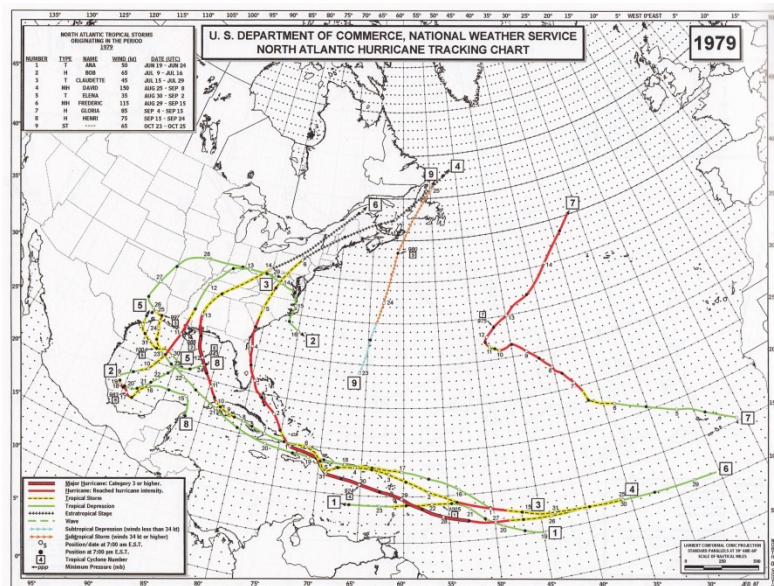
# Features of 7-Day LGEM

- Adjoint minimization instead of least squares fit to  $\kappa$ 
  - Need to reduce predictor set for efficiency
- Replace simple empirical MPI function with theoretical Bister and Emanuel (2003) formula
  - Can incorporate SST cooling and entrainment in MPI formula
- Include persistence and GOES data through modification of  $\kappa$  at early times
  - Similar to T-CLIPER approach



# 4. Gulf of Mexico LGEM

- Rappaport et al. (2010) showed Gulf storms have consistent behavior
  - Gulf-specific SHIPS/LGEM may improve skill
- Gulf sample size very small, especially beyond 72 h
  - Use same formulation as 7-Day LGEM
  - Add new Gulf cases from 1979-1980



# Plans for 2013 Hurricane Season

- Run standard 5-day SHIPS/LGEM
- Run parallel 7-day LGEM with new formulation
  - Includes Gulf-specific version
- Pre-season tests
  - Run on HFIP stream 1.5 retrospective cases
    - 2010-2012 sample
      - Only 2012 to 7 days since NHC track needed
  - Run for 2008-2009 cases with recon

# Summary

- T-CLIPER provides new extended range forecast baseline
  - Errors within +8% to -5% of OCD5 to 5 days
  - Predicts OFCL intensity error similar to OCD5
  - Predicts OFCL track errors better than OCD5
- New NCEP reanalysis provides more consistent and higher resolution developmental sample
- 7-day and Gulf-specific LGEM to be run in parallel in 2013 season
- SHIPS/LGEM/RII being developed for W. Pacific, Indian Ocean and S. Hemisphere
- *Acknowledgement: This NOAA Joint Hurricane Testbed project was funded by the US Weather Research Program in NOAA/OAR's Office of Weather and Air Quality*