

# HWRF based Ensemble Prediction System Using Perturbations from GEFS and Stochastic Convective Trigger Function

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# Outline

- Introduction to HWRF-based EPS
  - Background and Motivation;
  - Methodology;
  - Verification: Ensemble vs. Deterministic;
  - Statistical Validation of HWRF EPS.
- Ensemble Ranking and Selection Method
  - Motivation;
  - Max Potential Forecast Skill;
  - Two Ensemble Member Selection Methods;
- Conclusion and Future Work.

# Background and Motivation

➤ Convective Trigger function in Current HWRF Cumulus Parameterization Scheme (SAS: Simplified Arakawa-Schubert)

$P_{CSL} - P_{LFC} \leq DP(w)$  Convection is triggered,

$P_{CSL} - P_{LFC} > DP(w)$  No sub-grid convection

$P_{CSL}$ : Parcel pressure at Convection Starting Level,

$P_{LFC}$ : Parcel pressure at Level of Free Convection

$DP(w)$ : Convective Trigger, which is function of large scale vertical velocity  $w$ .

$DP(w)$  is arbitrarily confined between 120hPa-180hPa

➤ Storm intensity (Max Wind Speed) is found very sensitive to the convective trigger function;

➤ Necessary to introduce fuzzy logic trigger to represent sub-grid features.

# Methodology

➤ IC/BC Perturbations (Large scale):  
20 member GEFS (ETR-based).

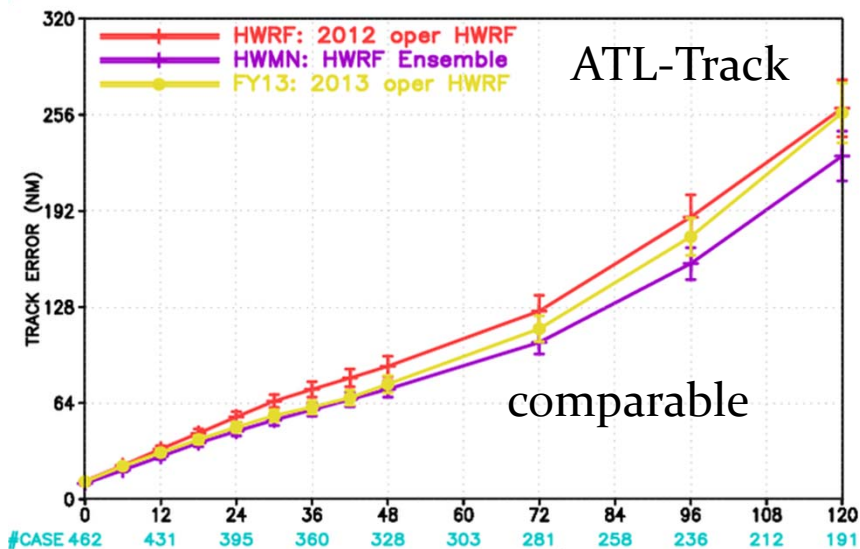
➤ Model Physics Perturbations (Sub-grid scale):  
Stochastic Convective Trigger

$$P_{\text{CSL}} - P_{\text{LFC}} \leq DP(w) + R_r(n)$$

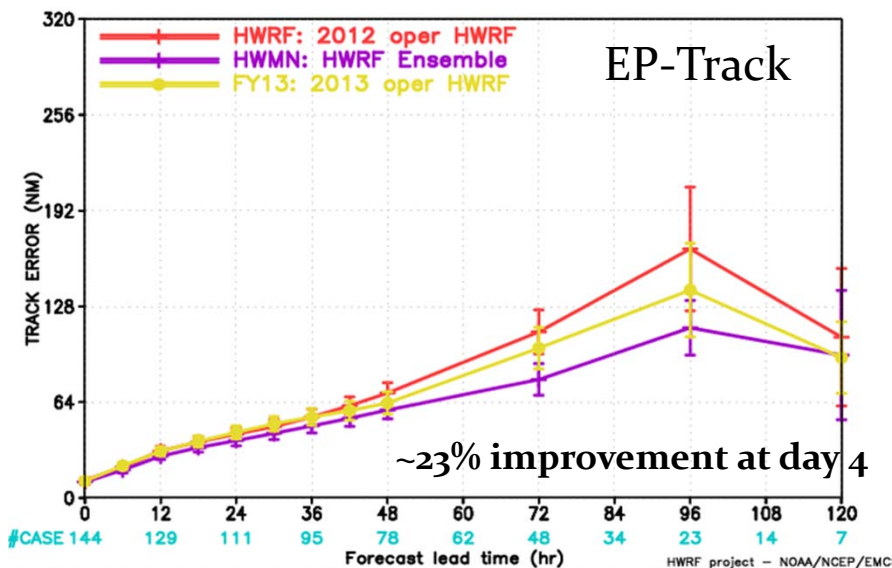
$R_r$  is white noise, ranging from -50hPa to +50hPa,  $n$  is  $n$ th ensemble member, used as random seed. No spatial and temporal correlations

# HWRF/EPS Verifications for 2011-2012 Storms

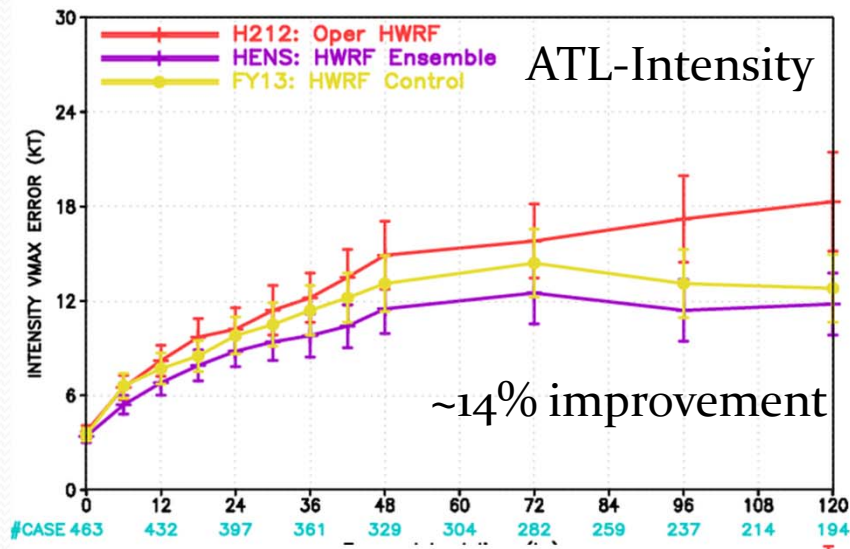
HWRF FORECAST – TRACK ERROR (NM) STATISTICS  
VERIFICATION FOR ENSEMBLE HWMN FOR ATLANTIC OCEAN 2011–2012



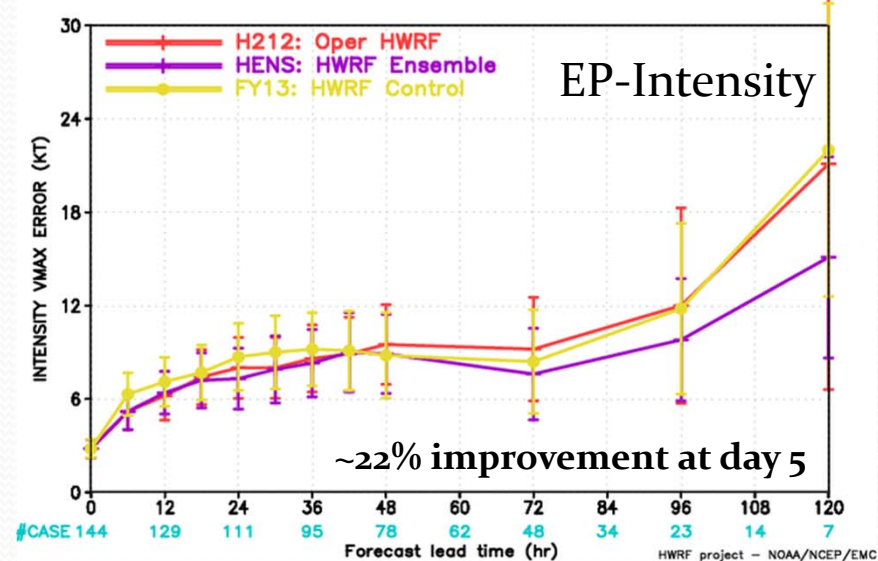
HWRF FORECAST – TRACK ERROR (NM) STATISTICS  
VERIFICATION FOR ENSEMBLE HWMN FOR East–Pacific Ocean 2011–2012



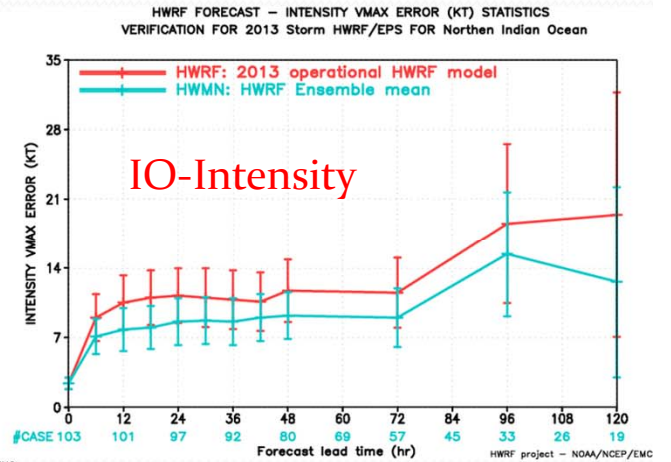
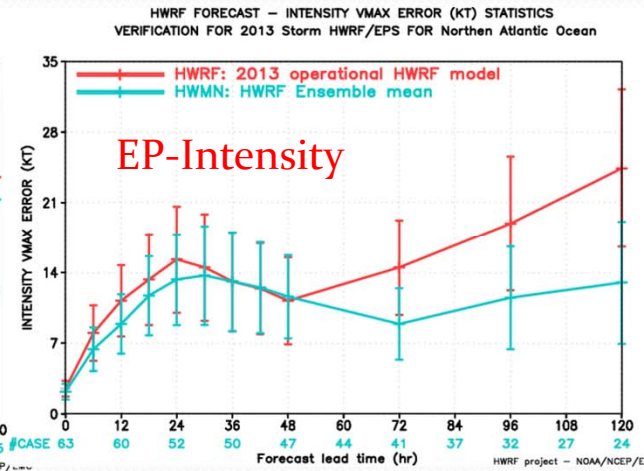
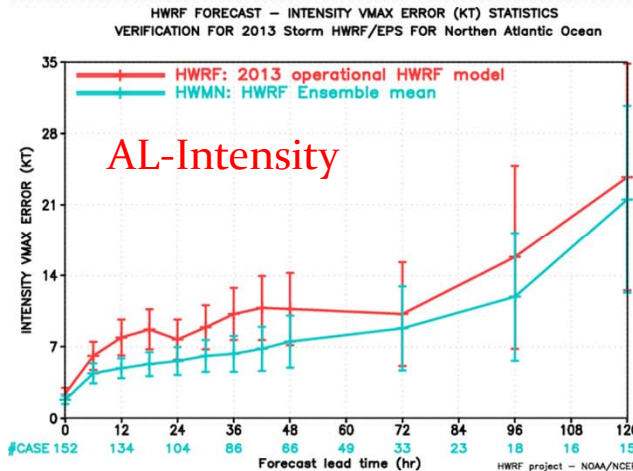
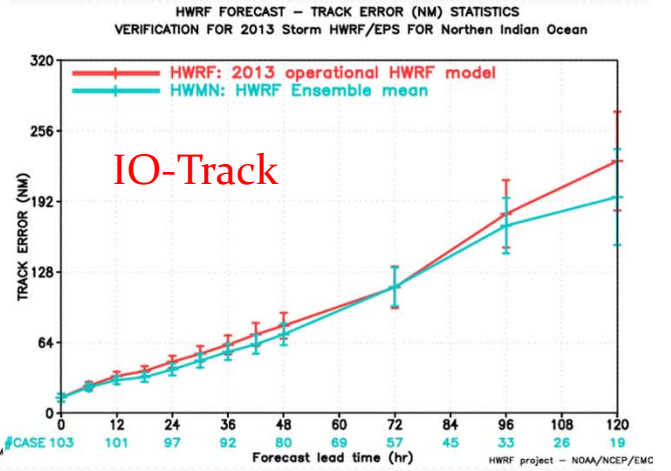
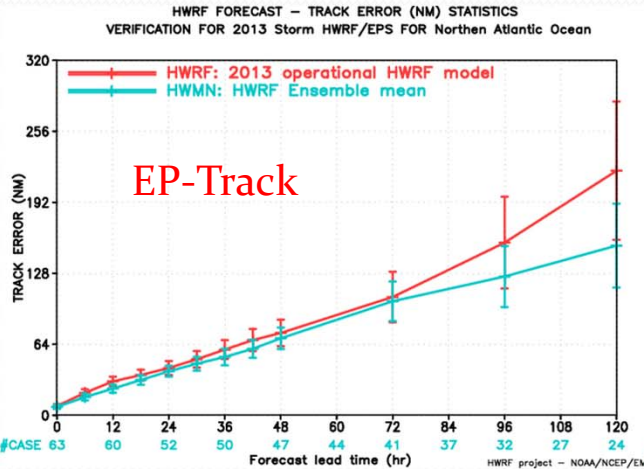
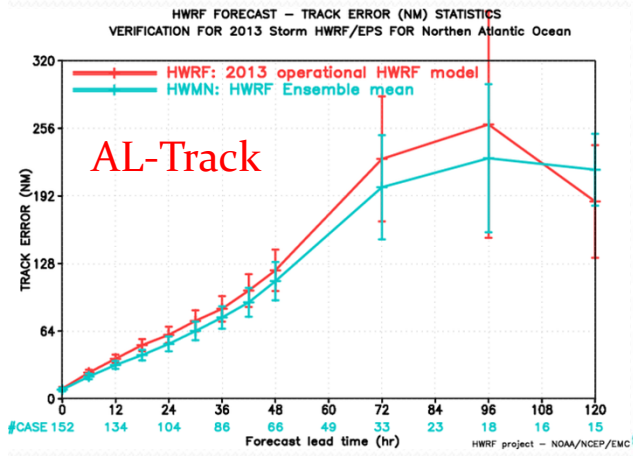
HWRF FORECAST – INTENSITY VMAX ERROR (KT) STATISTICS  
VERIFICATION FOR OPER HWRF FOR ATLANTIC OCEAN 2011–2012



HWRF FORECAST – INTENSITY VMAX ERROR (KT) STATISTICS  
VERIFICATION FOR OPER HWRF FOR East\_Pac OCEAN 2012



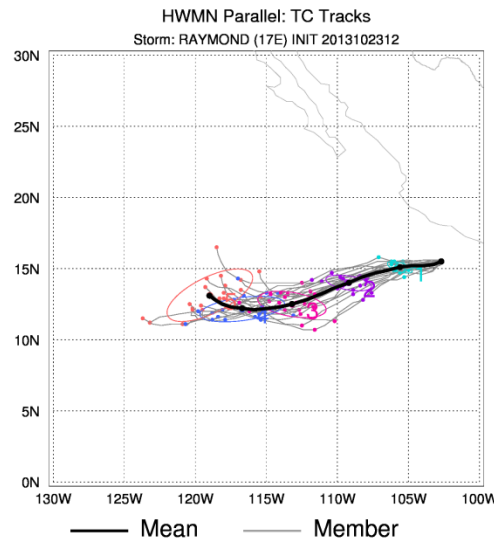
# HWRF/EPS Verifications for 2013 Storms



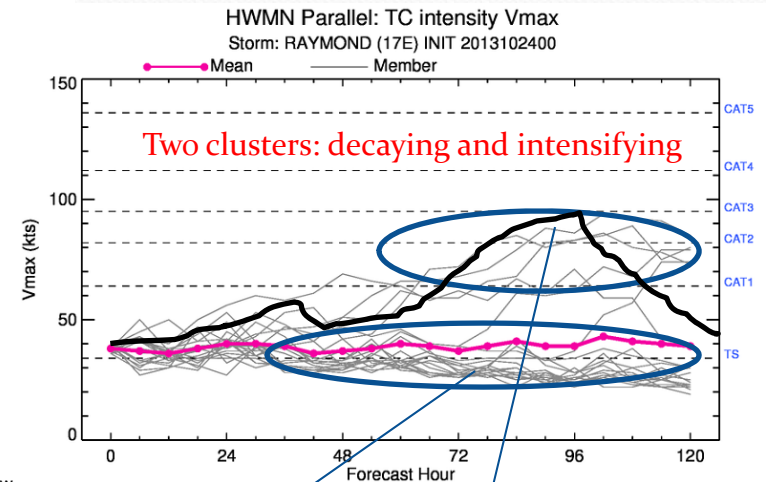
# Prediction for Hurricane Raymond, 20131024 00Z

Large differences in predicted storm intensity due to sub-grid uncertainties in model physics: stochastically perturbed cumulus convection scheme in HWRF

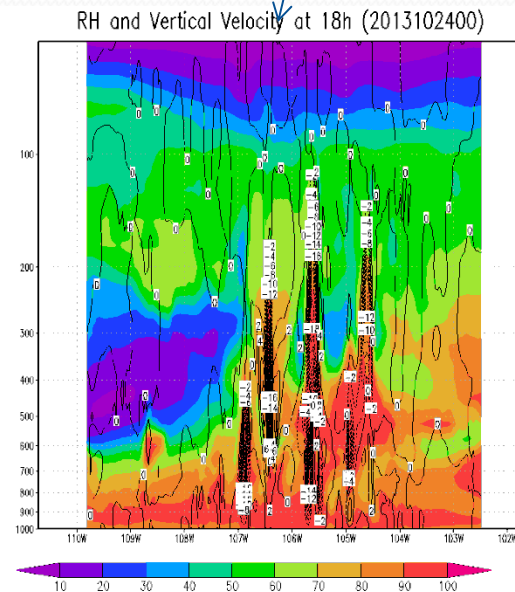
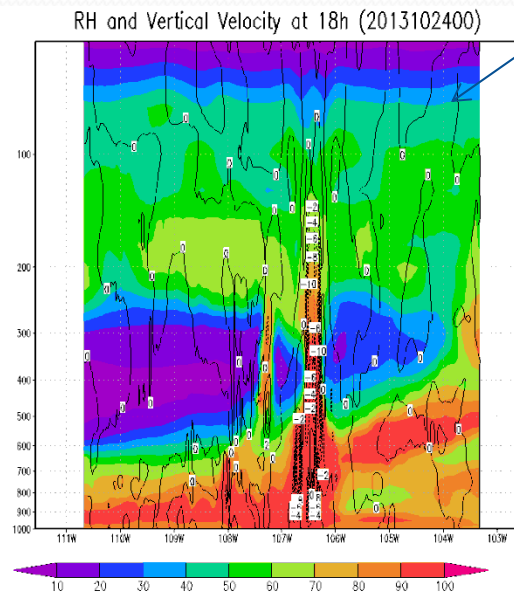
Dry air at mid-level suppressed storm development in one member, while active convective cells overcome the dry air, storm intensified in another member.



HW06

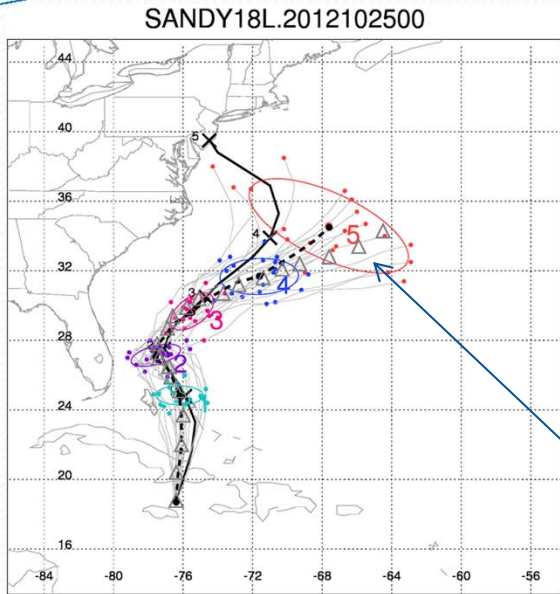


HW10

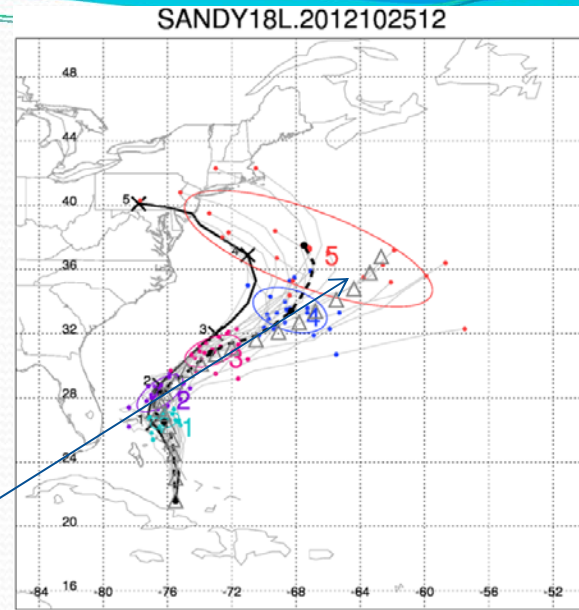


# Track Probability Forecasts for Hurricane Sandy

Few members turned west

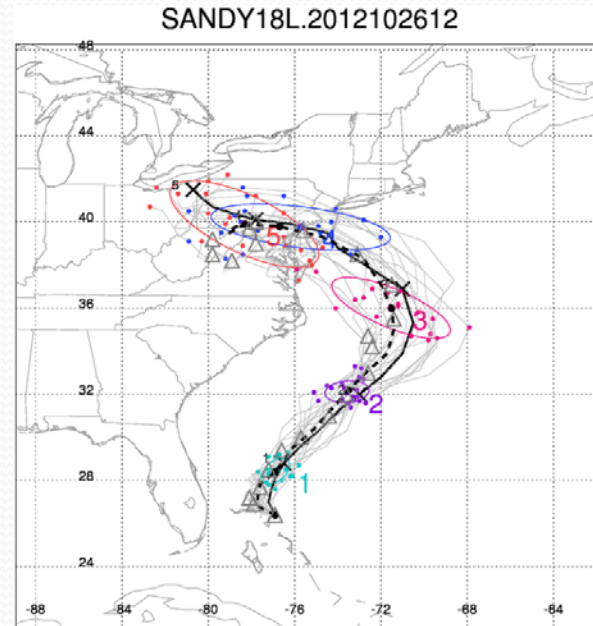
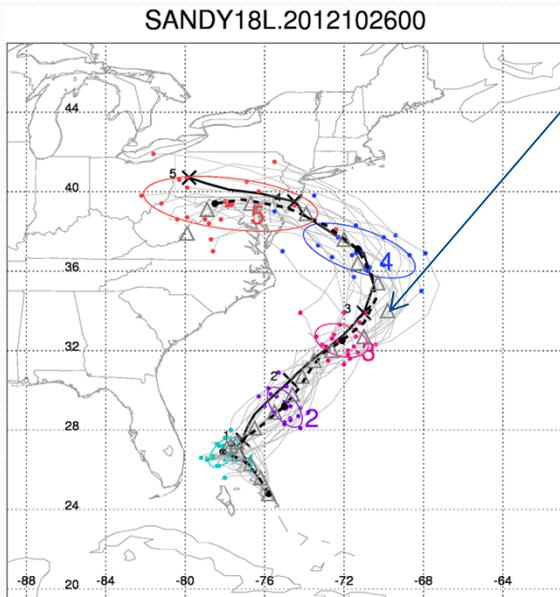


More members turned west



FY13

All members turned west

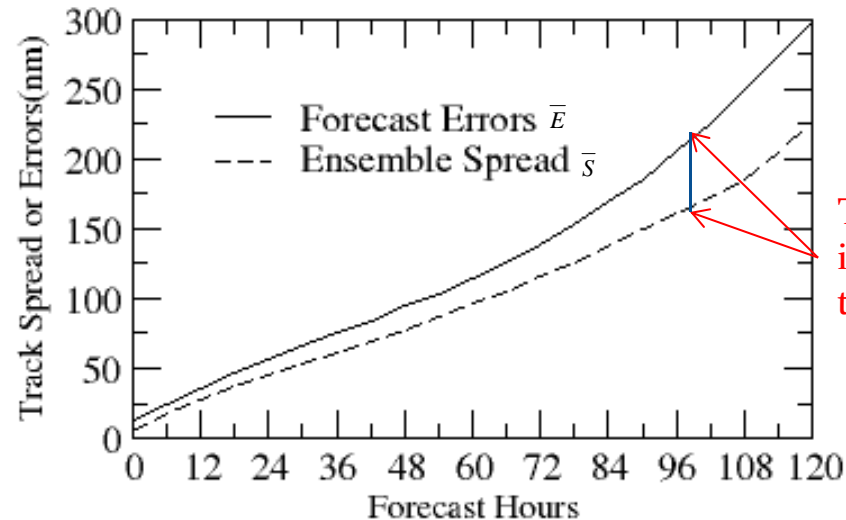




# Statistical Validation of HWRF EPS

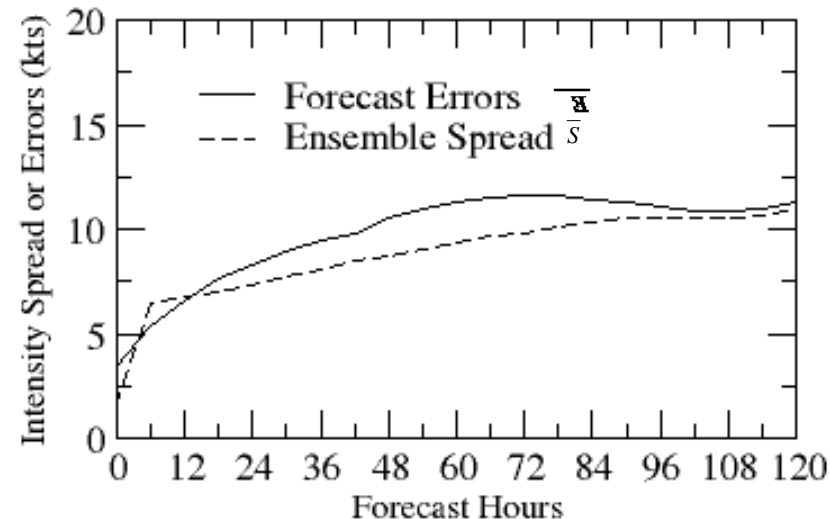
## Forecast Errors and Ensemble Spread (Track and Intensity)

Averaged over all 2011-2012 storms



The under-dispersion increases with forecast lead time

1. The mean of ensemble spread is close to the mean of the forecast errors;
2. The difference between the two lines indicates the level of ensemble dispersion;





# Ensemble Ranking and Selection Method

# Selecting Individual Ensemble Member to Represent Ensemble Forecasts

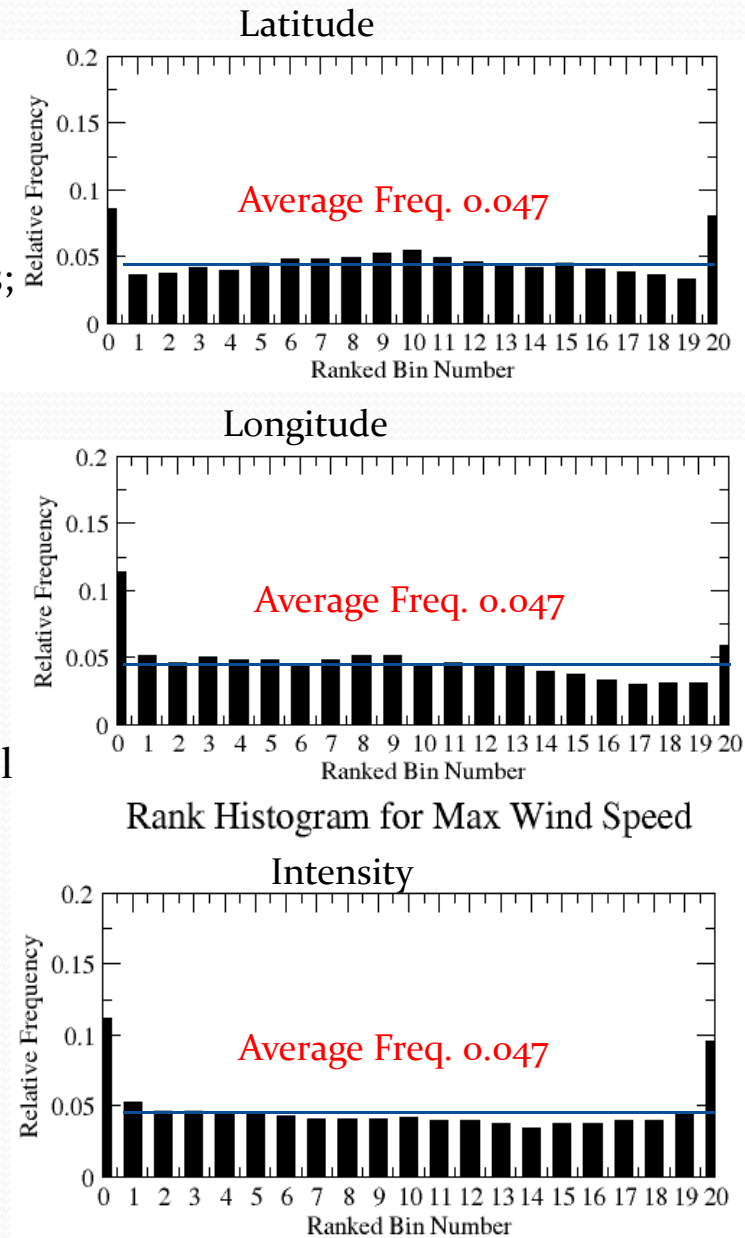
## Analysis of Rank Histogram

### Motivation:

- The ensemble mean track/intensity forecasts are NOT associated with any 3-dimensional model forecast fields;
- Because of the phase diff. among the members, ensemble mean of 3D fields don't represent predicted storm structures.
- It is desirable to select one ensemble member to represent 3D ensemble forecast fields for diagnostic purpose, so we can further improve model physics.

### Methodology:

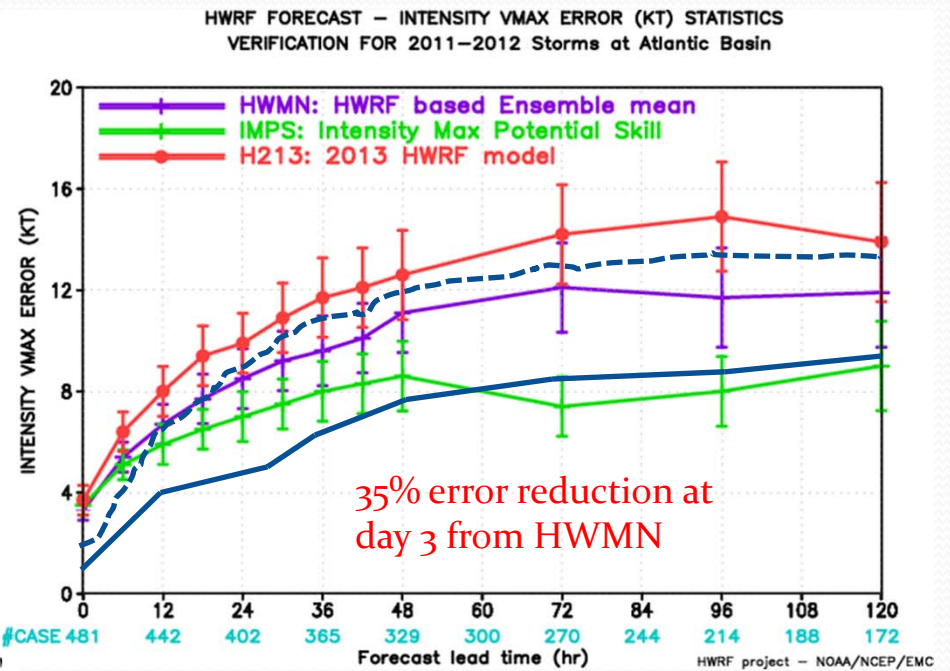
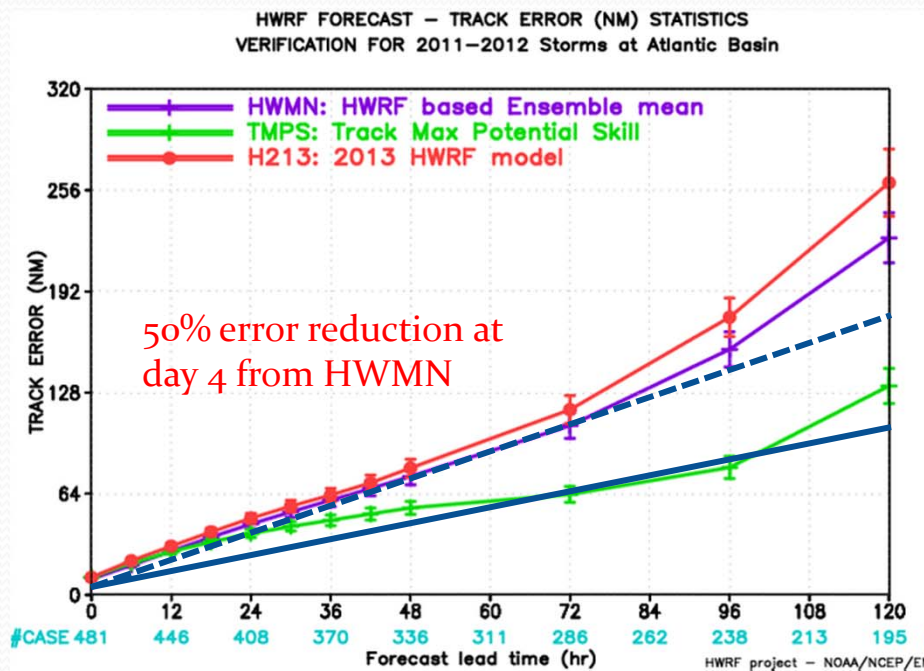
- Although the performance of individual members statistically perform in an equally likely manner in a well designed EPS, the performance of individual member is certainly not equal in every single forecast event;
- It is desirable to know beforehand the performance of each member relative to other members;
- The optimal member selection will be based on ensemble mean of track/intensity forecasts.



# Max Potential Forecast Skill

- Max Potential Forecast Skill (MPFS) is defined as the track/intensity forecast skill by assuming we always make the right decision and select the ensemble member that is closest to the truth;
- Assume the best track info is known beforehand, the member whose track/intensity is closest to the obs. is selected as its final forecast;
- MPFS shows the forecast skill limit of the current HWRF EPS.

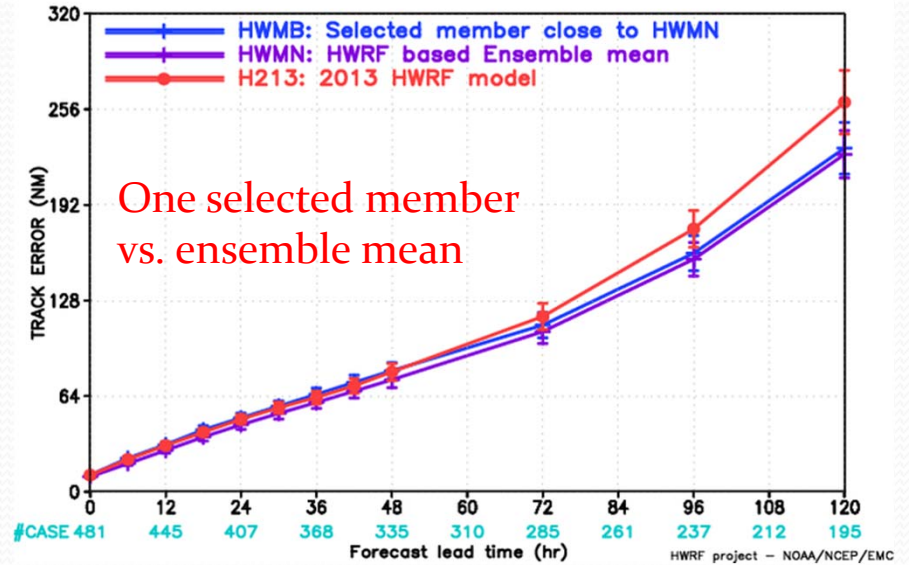
----- HFIP 5 year goal      ——— HFIP 10 year goal



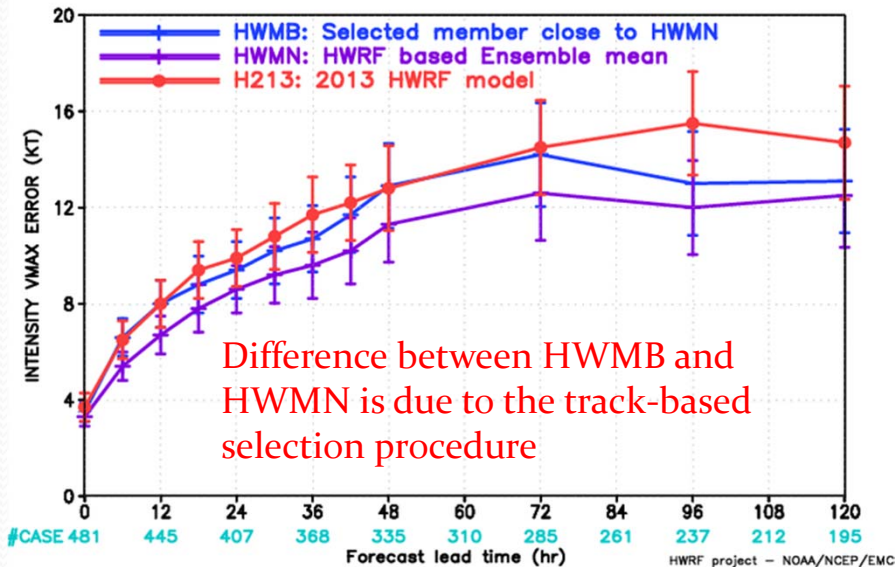
# Ensemble Mean based selection method

It is natural to assume that the ensemble mean is a good estimation of the truth, so the member, whose track/intensity is closest to the ensemble mean (HWMN), is considered as the optimal member.

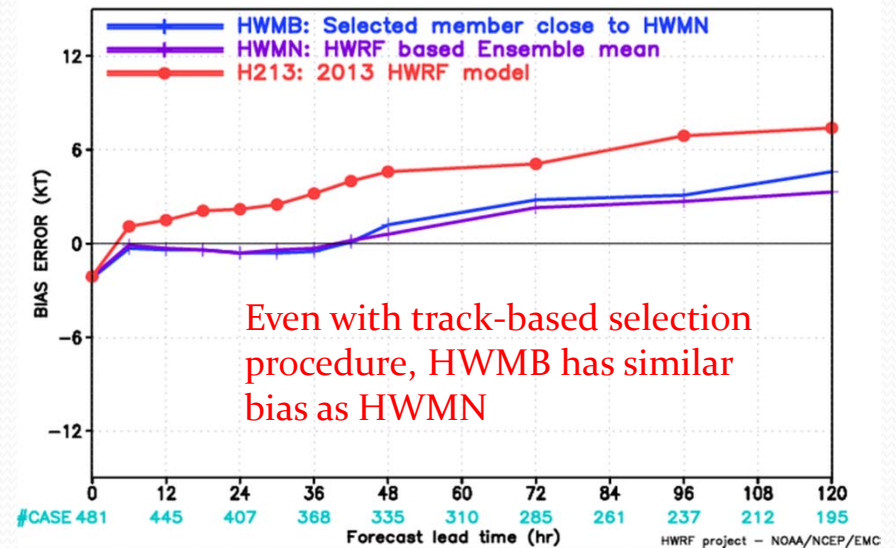
HWRP FORECAST – TRACK ERROR (NM) STATISTICS  
VERIFICATION FOR 2011–2012 Storms at Atlantic Basin



HWRP FORECAST – INTENSITY VMAX ERROR (KT) STATISTICS  
VERIFICATION FOR 2011–2012 Storms at Atlantic Basin



HWRP FORECAST – BIAS ERROR (KT) STATISTICS  
VERIFICATION FOR 2011–2012 Storms at Atlantic Basin



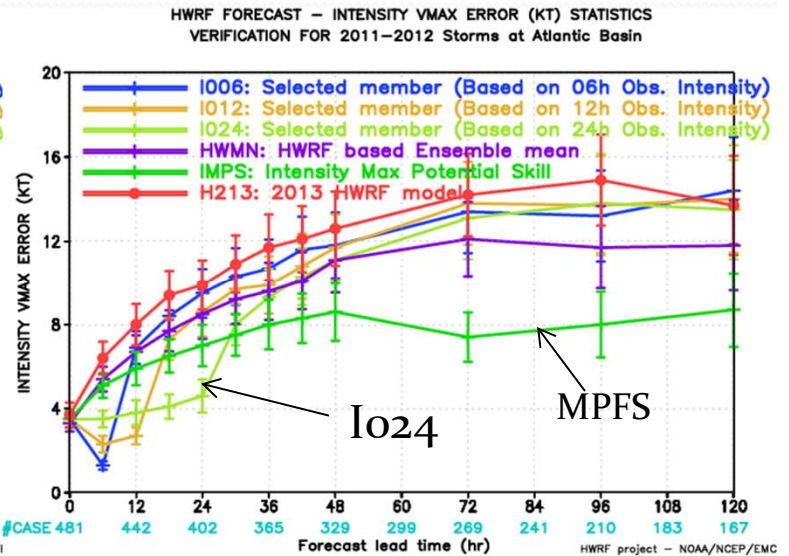
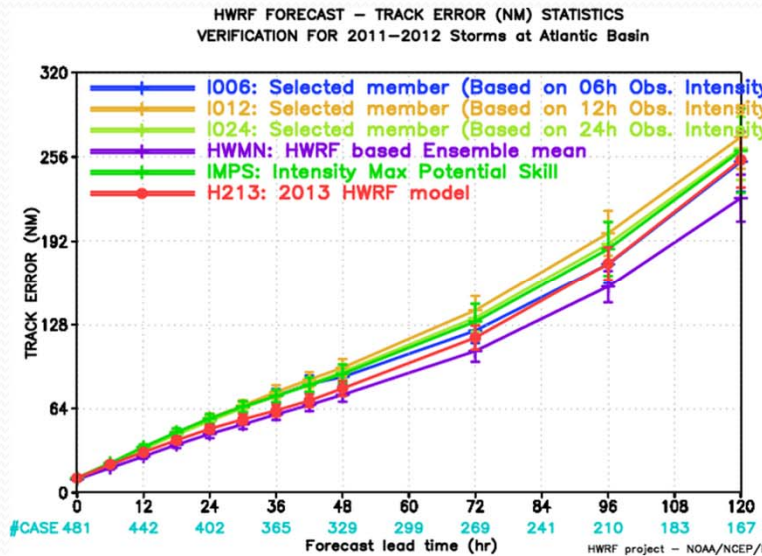
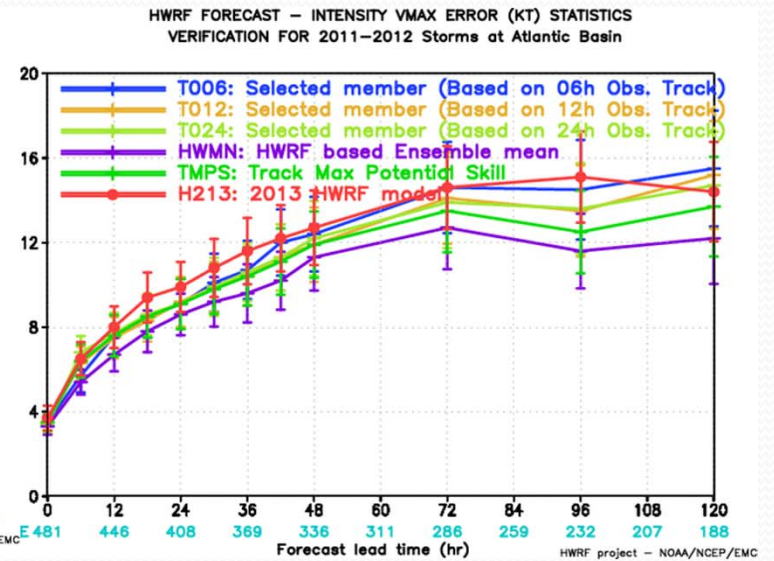
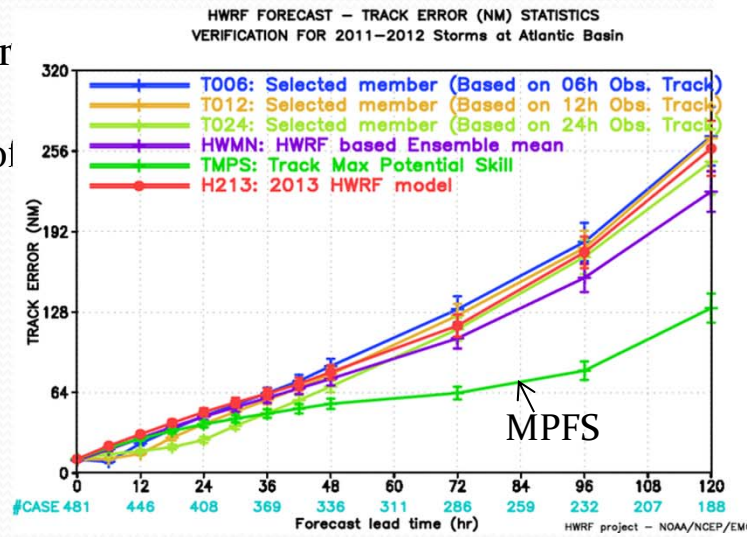
# Observation based selection method

Assumption:

The best track info for certain period is available at the time of the forecast.

- 06h BT is avail.
- 12h BT is avail.
- 24h BT is avail.
- MPFS
- H213

Even though the forecast skills are improved initially, HWMN is better in general. More info other than obs. Track/intensity may be needed for this approach



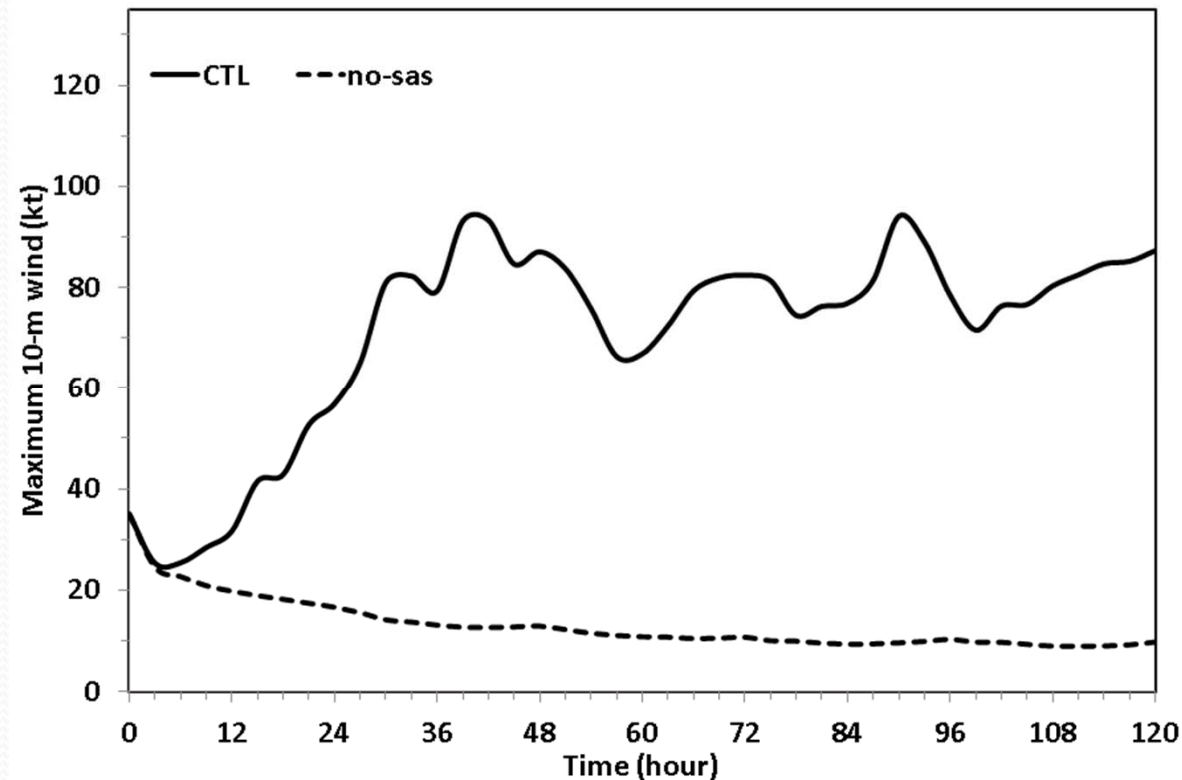
# Summary

- HWRF-based EPS includes perturbations from large scale flows (GEFS) and sub-grid scales (physics-based SCT);
- Statistical characteristics shows that HWRF EPS introduces no bias but inherits some biases from the deterministic model in terms of track/intensity forecasts;
- Both HWMN track and intensity forecast skills are improved over its deterministic versions (H212 and FY13), with more improvements in intensity forecasts;
- MPFS and ensemble member selection procedure are discussed. Ensemble mean based selection method produced better forecast skills than observation based method.

## Future work:

- Add more stochastic processes to model physics in HWRF EPS;
- Explore ensemble performance ranking method to select optimal member to present ensemble forecasts.

# Impact of Cumulus Convection on Large Scale Flow Idealized Experiment



Solid line: SAS in Do1 and Do2 (27km and 9km)

Dash line: no SAS in Do1 and Do2.

Sub-grid convection is explicitly expressed in Do3 in both exps.

The model storm will not develop when SAS scheme is turned off in the 27- and 9-km domains even if the domain 3 (3km) resolution is high enough to resolve the convection scheme.