# Advancing the assimilation of airborne vortex-scale hurricane observations using the GSI-based high-resolution hybrid ensemble-variational data assimilation system for HWRF



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**Acknowledgement** 

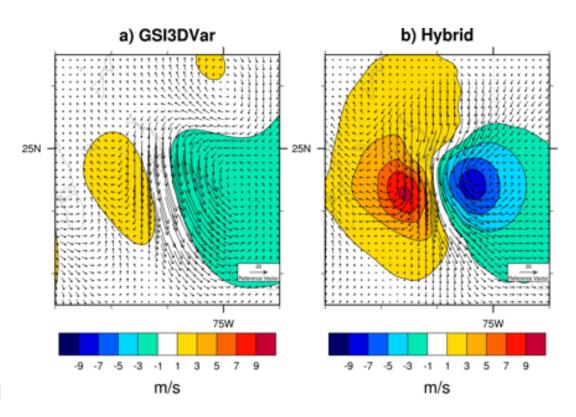
Mingjing Tong, Sam Trahan, Vijay Tallapragada, NCEP/EMC, College Park, MD Henry Winterbottom, Jeff Whitaker, NOAA/ESRL, Boulder, CO Ligia Bernardet, DTC, Boulder, CO

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### Early R&D for HWRF Hybrid DA Lu et al. 2015, QJRMS

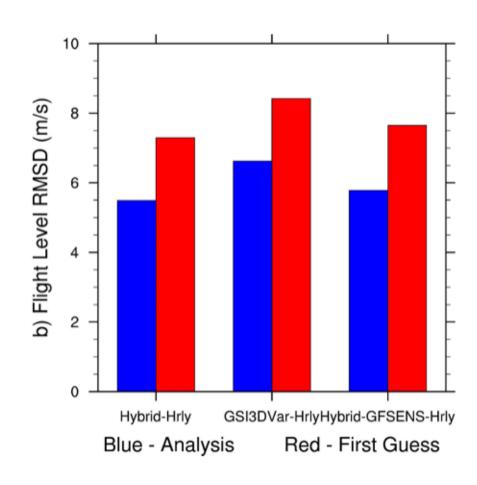
- The GSI-based hybrid EnKF-Var data assimilation (DA) system (Hybrid) was integrated for HWRF.
- Experiments focused on the assimilation of airborne radar data for 2012-2014 seasons.
- Hybrid was able to correct both the wind and mass fields in a dynamically and thermodynamically coherent fashion. In contrast, the wind and pressure adjustment by GSI 3DVar were inconsistent.





### Early R&D for HWRF Hybrid DA Lu et al. 2015, QJRMS

- Hybrid improved the analyzed TC structure, track and intensity forecasts not only when compared to GSI 3DVar, but also compared to using a GFS ensemble (Hybrid-GFSENS).
- Hybrid provided the largest positive impact of the airborne radar data (TDR).
- Hourly or leg-based TDR data assimilation performed similarly.



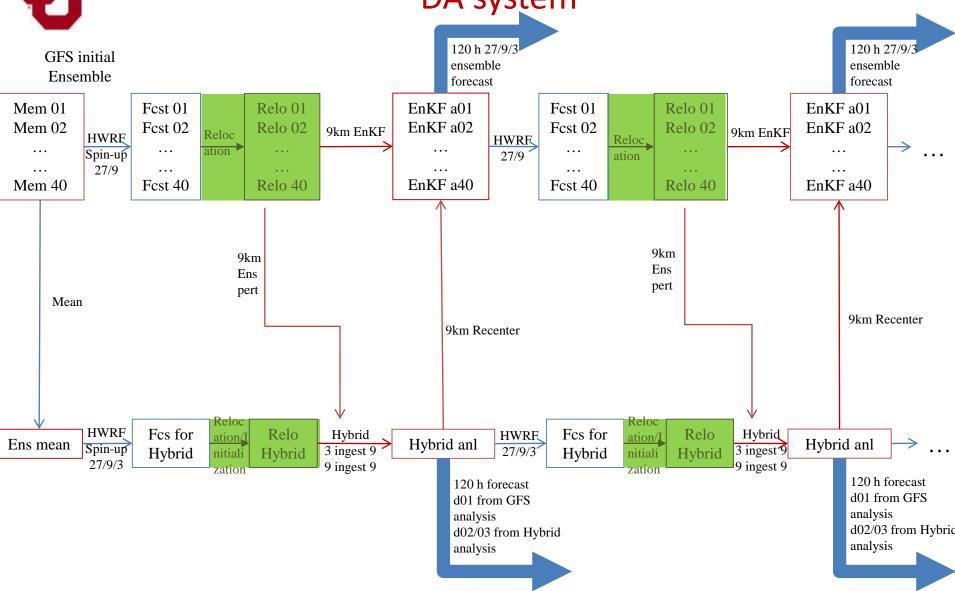


### Motivation of Further Development of GSI-based, Continuous Cycling, Dual-resolution, Hybrid EnKF-Var Data Assimilation for HWRF

- Early efforts (Lu et al. 2015) focus on assimilation during TDR periods
- ➤ The system is therefore extended to conduct DA and forecast cycles from the beginning to the end of the storm and to assimilate all operational observations
- Early efforts assimilate TDR data more frequently (hrly or leg based) than operational HWRF (6hrly)
- Optimize DA configuration in the context of end to end cycling
- Dual resolution Hybrid can save computational cost while still maintain improvement
- > Continuous DA cycling system with dual resolution DA capability

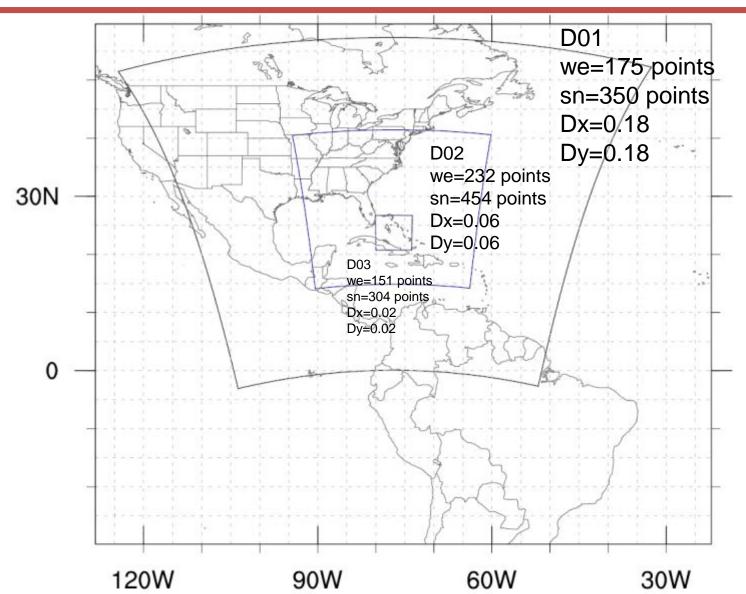


# Continuously cycled, Dual-resolution, HWRF hybrid DA system



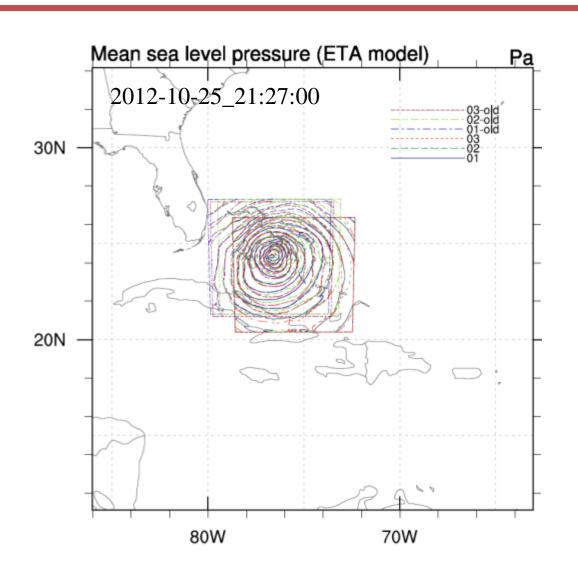


### Example of domain configuration for Edouard





# Directed moving strategy: move ensemble of domains to a same location



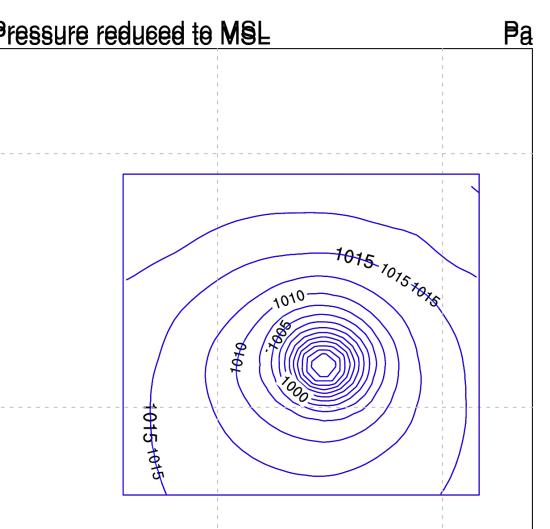
d01:
member 1 with domain
moving fixed
d02:
member 2 with domain
moving fixed
d03:
member 3 with domain
moving fixed

d01-old:
member 1 with domain
moving
d02-old:
member 2 with domain
moving
d03-old:
member 3 with domain
moving



### Directed Moving Strategy: flexibility to move and stop

### MSLP @ 20140915\_00:00:00



Black domain:

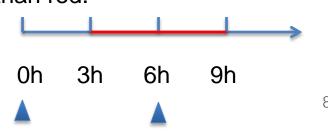
Original HWRF moving strategy.

#### Red domain.

Directed moving til +03:00. Domain stops for model integration during +03:00~+09:00

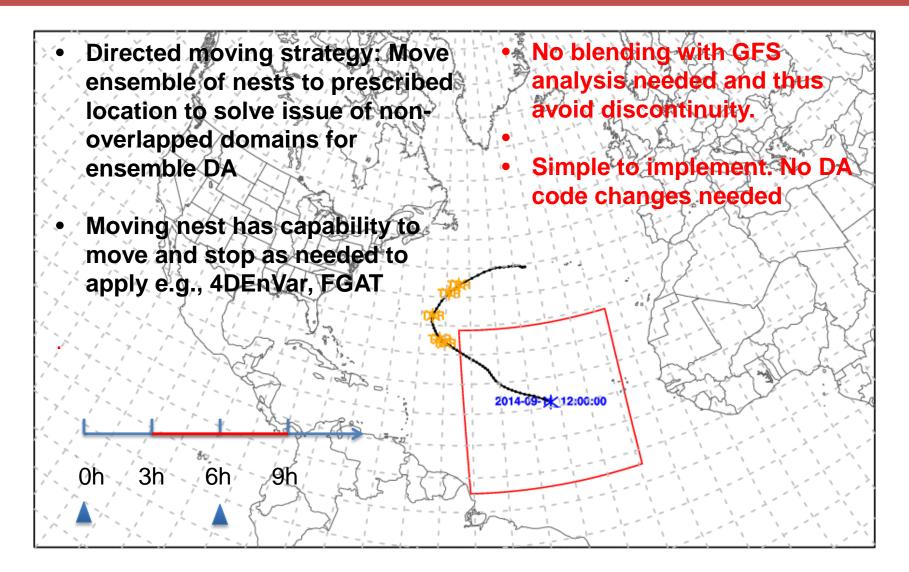
#### Blue domain:

As red but domain stops at a different location at +03:00. In this case, the directed moving is faster than red.





### Example of end-to-end 6-hourly cycling (Edouard 2014)





### Experiments for Edouard 2014

Experiment name	Description
Hybrid	<ul> <li>6-hourly continuous end to end cycling;</li> <li>3DEnVar hybrid with FGAT</li> <li>Dual-resolution hybrid (3km control ingests 9km ensemble);</li> <li>Adopted new directed moving nest strategy, and domains move for first 3 hour integration and stay for the next 6-hour integration.</li> <li>Control background: vortex relocation and initialization for the control background when no TDR; vortex relocation only when TDR</li> <li>Ensemble backgrounds: vortex relocation</li> </ul>
Hybrid-279	Same as "Hybrid" except it is not dual-resolution hybrid. Both hybrid control and ensemble are done at 9km resolution.
Hybrid-norelo	Same as Hybrid except it does not do any vortex initialization or relocation on control and ensemble backgrounds.
Hybrid-noensrelo	Same as Hybrid except it does not do relocation for ensemble backgrounds.
Hybrid-notdr	Same as Hybrid except it will not assimilate TDR data.  10



### **Experiments for Edouard 2014**

### Observations assimilated:

### 3km domain:

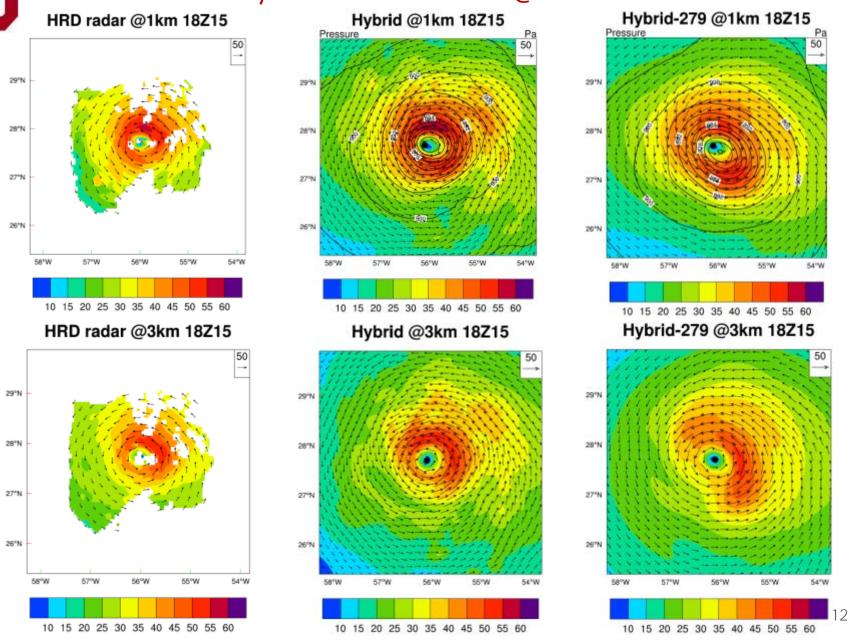
Conventional in-situ data in prepbufr, satellite wind, TDR and tcvital

### 9km domain:

Conventional in-situ data in prepbufr, satellite wind, TDR and tcvital
Satellite radiances

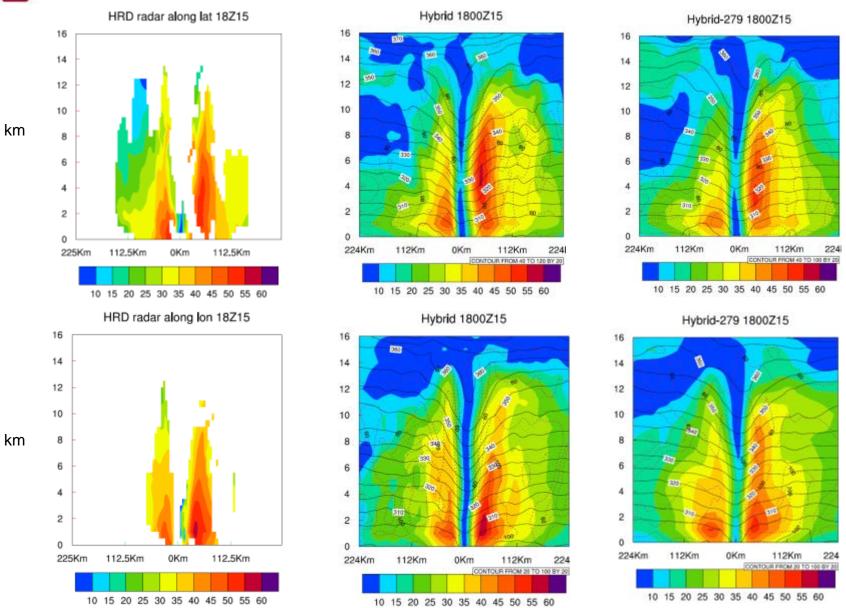
# Q

### Hybrid vs Hybrid-279





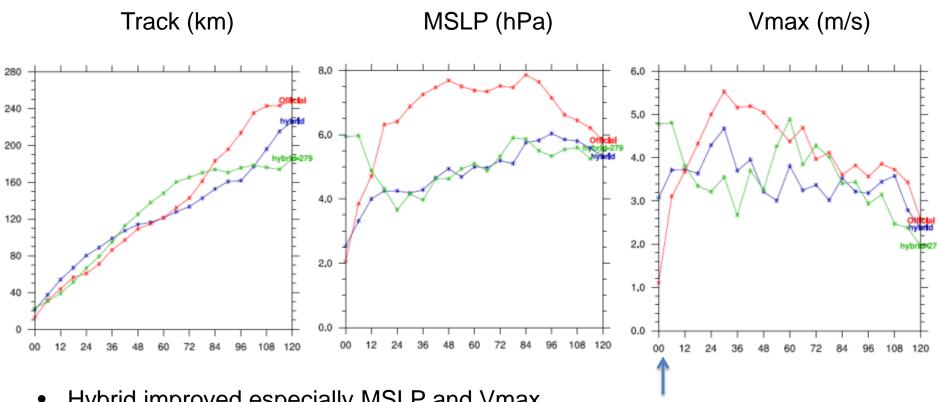
### Hybrid vs Hybrid-279





### Hybrid vs Hybrid-279 vs operational HWRF

RMSE for all cycles

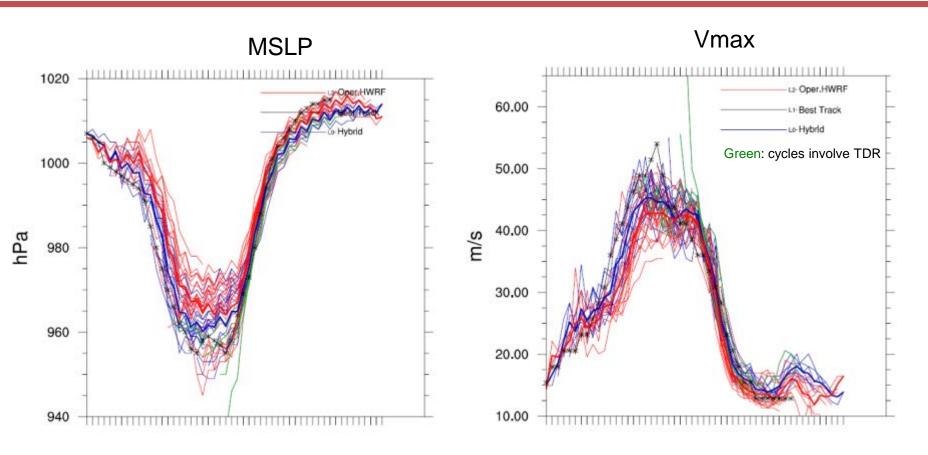


- Hybrid improved especially MSLP and Vmax forecasts compared to operational HWRF
- Dual resolution hybrid improved MSLP and Vmax forecast for the first 12/18 hours than single 9km resolution hybrid

Affected by two cycles with TDR. Fixed by hrly assimilation when TDR available. See later slides



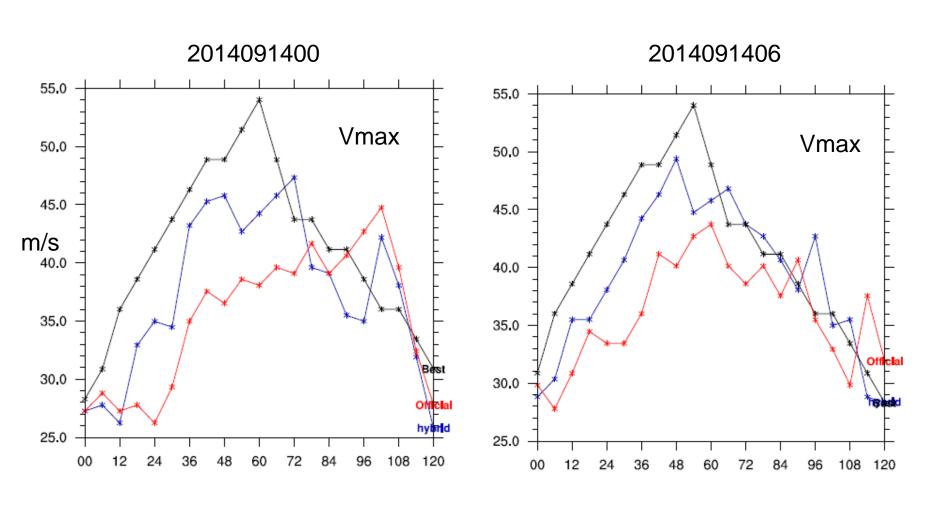
### Hybrid vs operational HWRF



 Hybrid improved MSLP and Vmax forecast relative to operational HWRF during RI and when Edouard reached intensity max

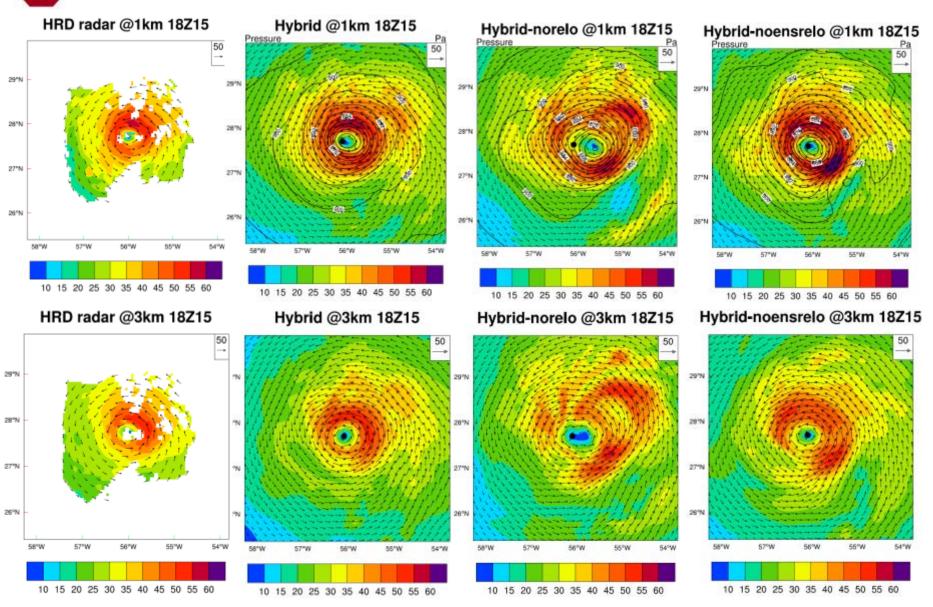


# Hybrid vs operational HWRF: Alleviation of spin-down issue during RI



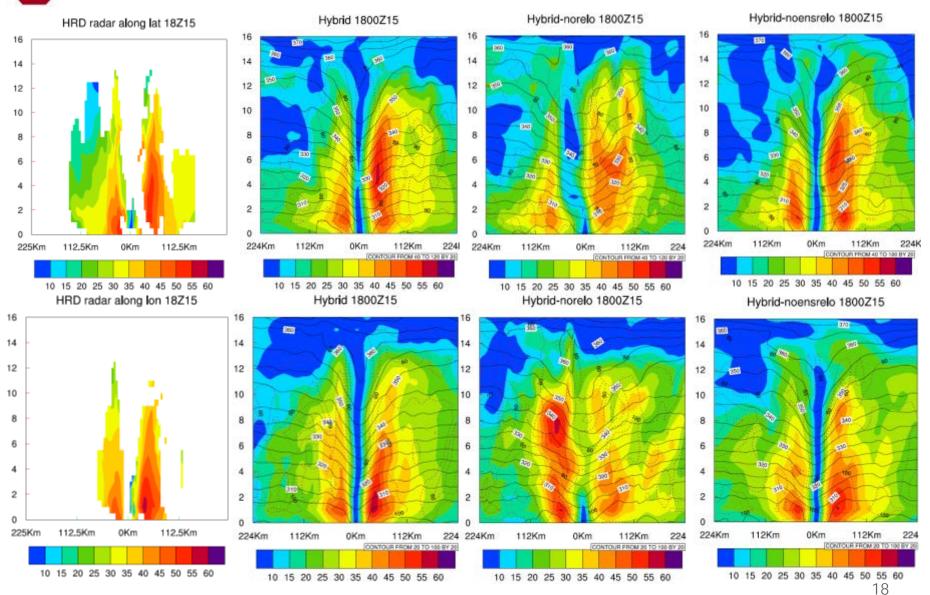


### Hybrid vs Hybrid-norelo vs Hybrid-noensrelo



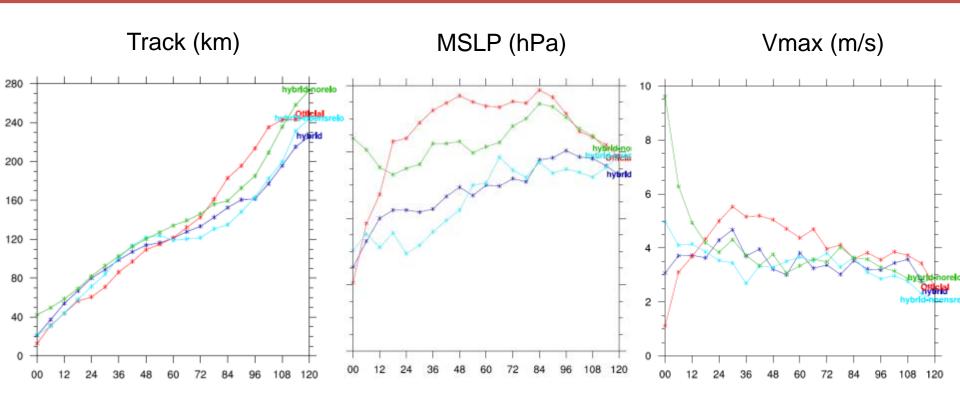


### Hybrid vs Hybrid-norelo vs Hybrid-noensrelo





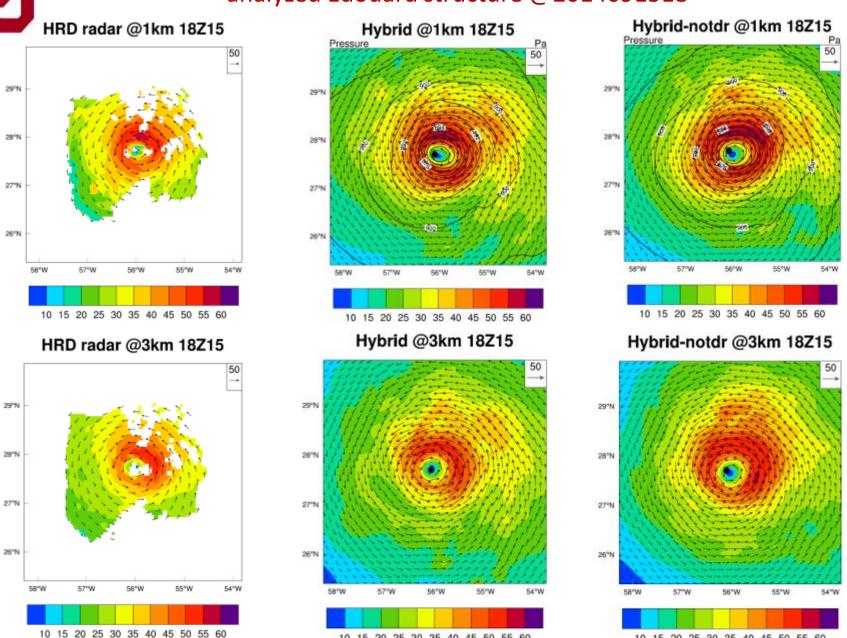
## Hybrid vs Hybrid-norelo vs Hybrid-noensrelo RMSE for all cycles



Vortex relocation/initialization integrated with 6-houlry Hybrid DA improved forecasts

### Hybrid vs Hybrid-notdr

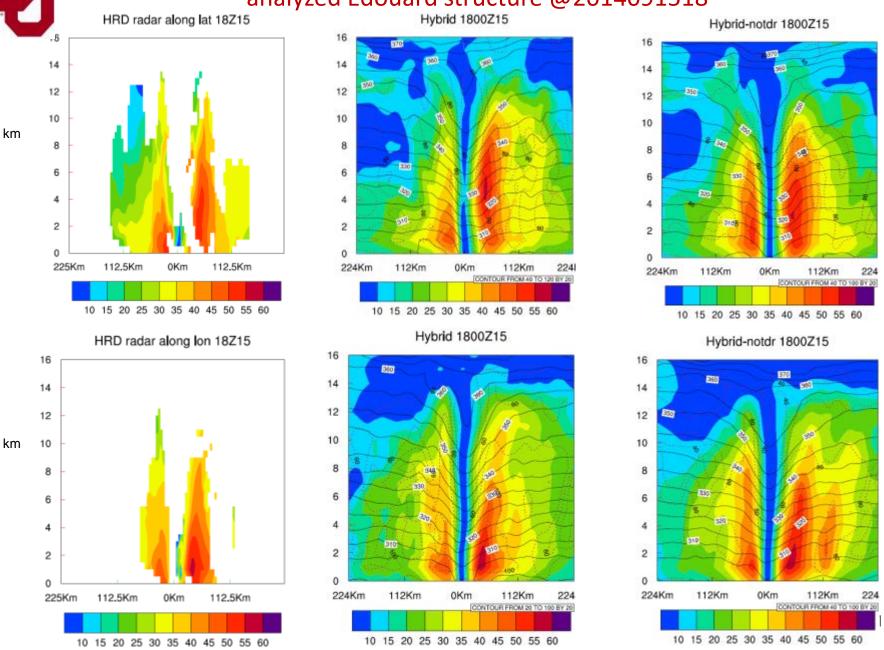
#### analyzed Edouard structure @2014091518

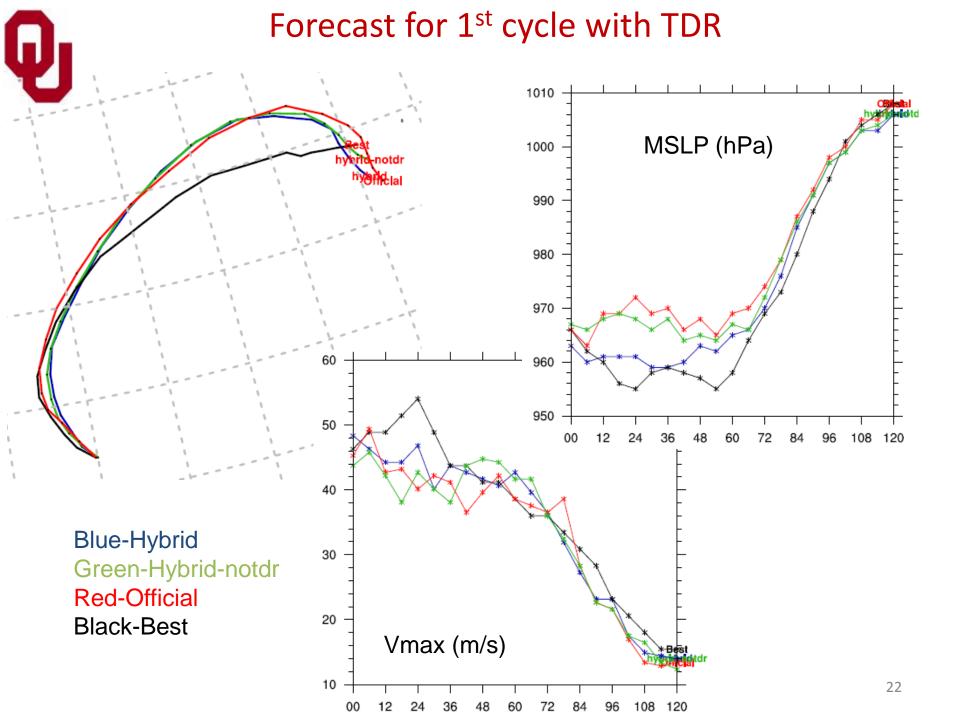


10 15 20 25 30 35 40 45 50 55 60

10 15 20 25 30 35 40 45 50 55 60

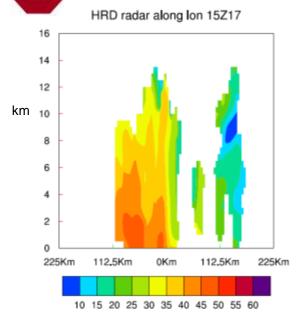
### Hybrid vs Hybrid-notdr

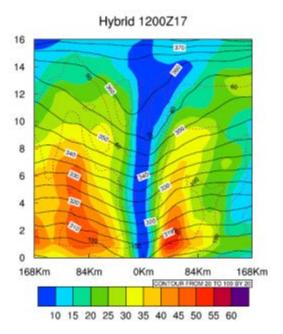


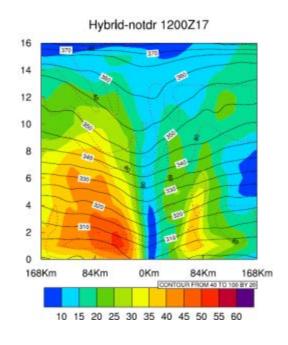


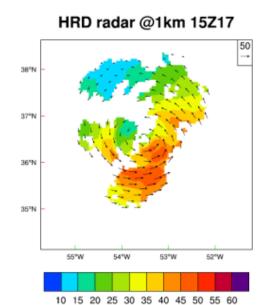


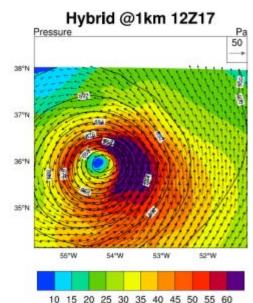
### Hybrid vs Hybrid-notdr

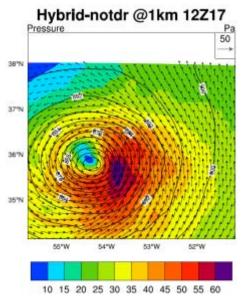








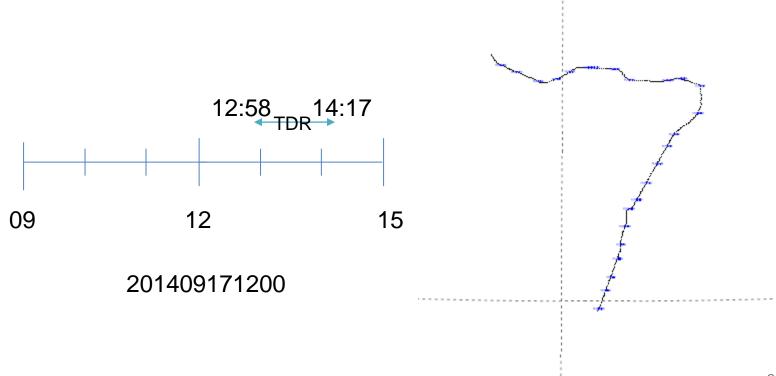






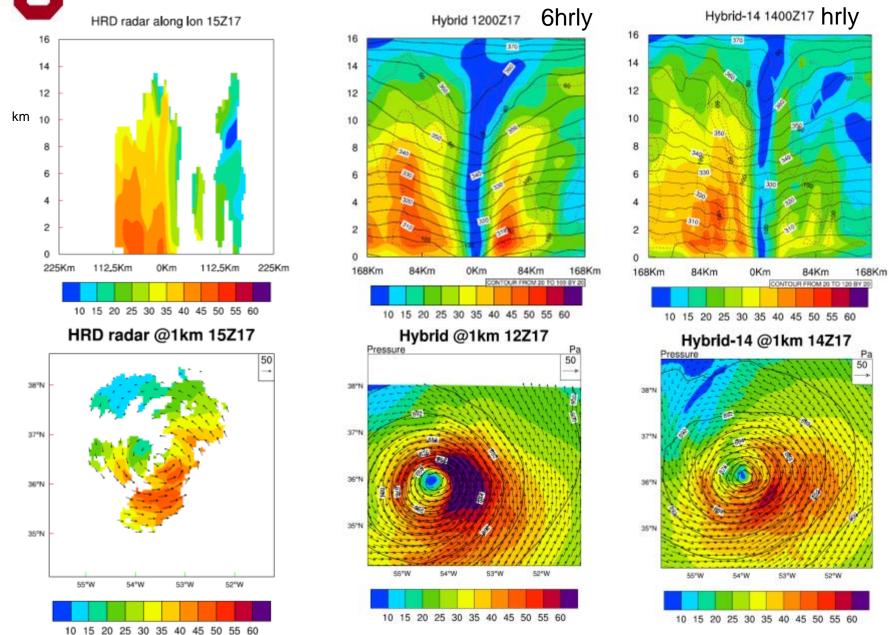
### Reasons for the large Vmax in the last two TDR cycles

- Edouard went through complicated eyewall replacement process during these two cycles. Drastic change within 6-hr window.
- TDR coverage was very brief.
- Hourly DA or 4DEnVar (rather than 3DEnVar over 6-hr window) is needed based on our previous results (Lu et al 2015)



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### Hybrid vs Hybrid-hourly





### **Efforts for Operational Implementation**

- □ Primary components of the system are implemented in HWRF repository following the operational HWRF's python and Rocoto scripting environment.
- 1) Add the new HWRF moving nest strategy;
- 2) Add the HWRF EnKF including both the calculation of Hx ensembles and the EnKF executable;
- 3) Add cycling HWRF ensemble to provide the ensemble covariance for dual resolution hybrid replacing cold started HWRF ensemble in the current operational HWRF system.



### Summary and Ongoing Work

#### Summary

- GSI-based, continuous cycling, dual resolution, hybrid EnKF-Var DA system with new moving nest strategy, assimilating all operational observations for HWRF is developed.
- Experiments with Edouard with 6-hourly continuous, end to end DA cycling suggest:
- The system improved MSLP and Vmax forecasts compared to operational HWRF especially during RI and max intensity periods through alleviation of spin down issue
- high resolution analysis produced through dual resolution hybrid DA improved structure analysis and intensity forecasts.
- Vortex relocation/initialization integrated with 6-houlry Hybrid improved forecasts
- Assimilation of TDR data (6hrly) improved MSLP and Vmax for later lead times. Diagnostics suggest further positive impact of TDR is expected with more frequent assimilation (hrly or 4DEnVar).

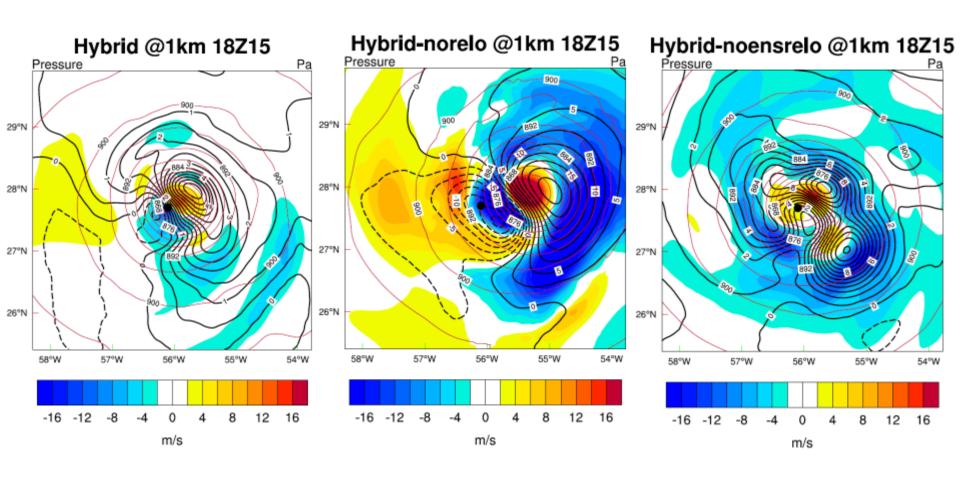
#### Ongoing work

- Continue operational implementation.
- Explore the impact of using higher resolution ensemble in hybrid DA (9km vs 3km ensemble).
- Sensitivity to different, directed locations
- Include and test new obs. products.
- Continue optimizing system configuration (cycling frequency, 3DEnVar vs 4DEnVar, mixture of 6 hourly and hourly, storm relative DA.).
- Optimize the usage of and explore the impact of other airborne observations (P3, GIV radar, dropsonde, flight level, SFMR, etc.) using the new system. Including better preprocessing and assignment of obs. errors.



### Hybrid vs Hybrid-norelo vs Hybrid-noensrelo

Increment @2014091518



Red contour: pressure background @ 1km height
Black contour: positive (solid) and negative (dash) pressure increment @ 1km
Shaded: wind increment @ 1km

