

# **Cloud-resolving Hurricane Analysis and Forecasting Assimilating Airborne Doppler Observations with EnKF**

**Yonghui Weng and Fuqing Zhang**  
**Penn State University**

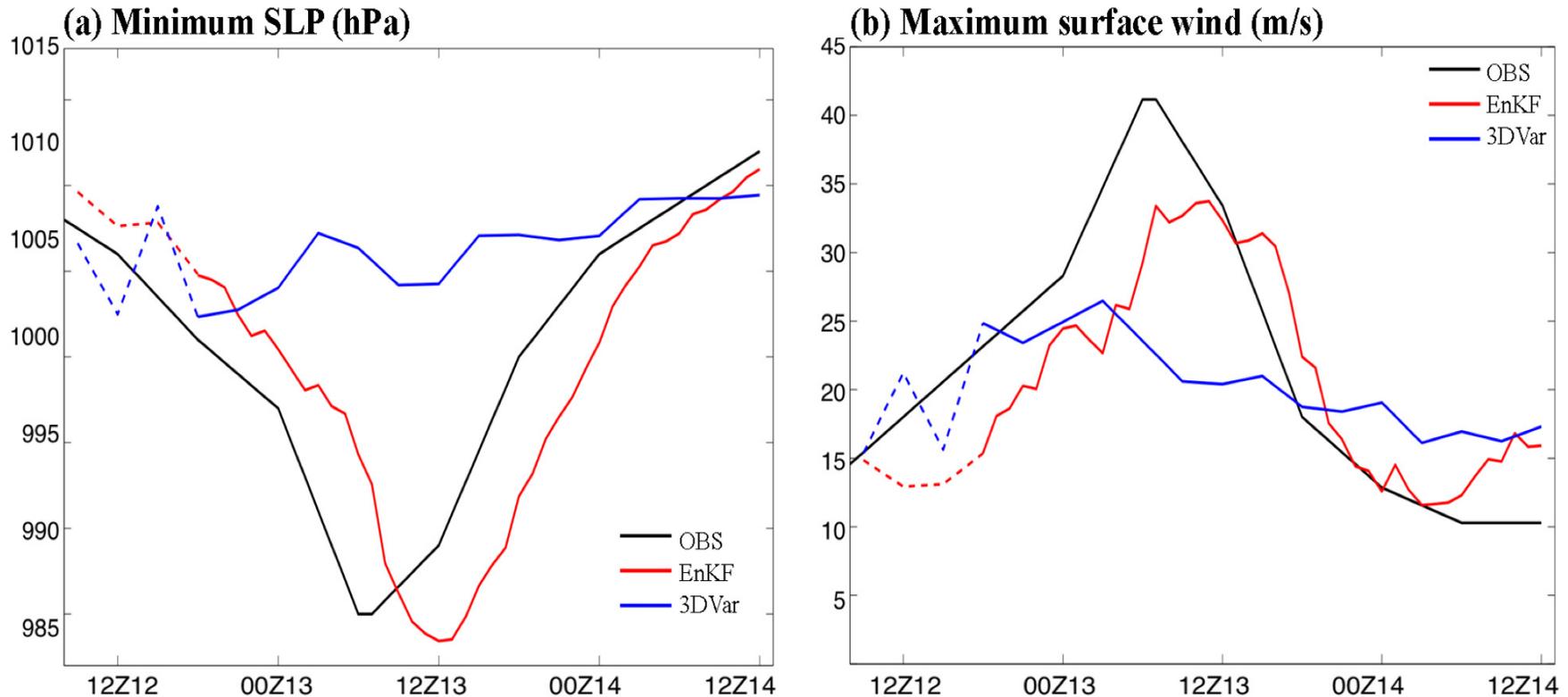
**Contributors:** John Gamache and Frank Marks, NOAA/HRD

**Special Acknowledgments:** NOAA-P3 crews; TACC staff

**Sponsors:** NSF, ONR and NOAA

# Assimilate W88D Doppler Vr for Humberto'05

*WRF/EnKF Forecast vs. Observations vs. 3DVAR*

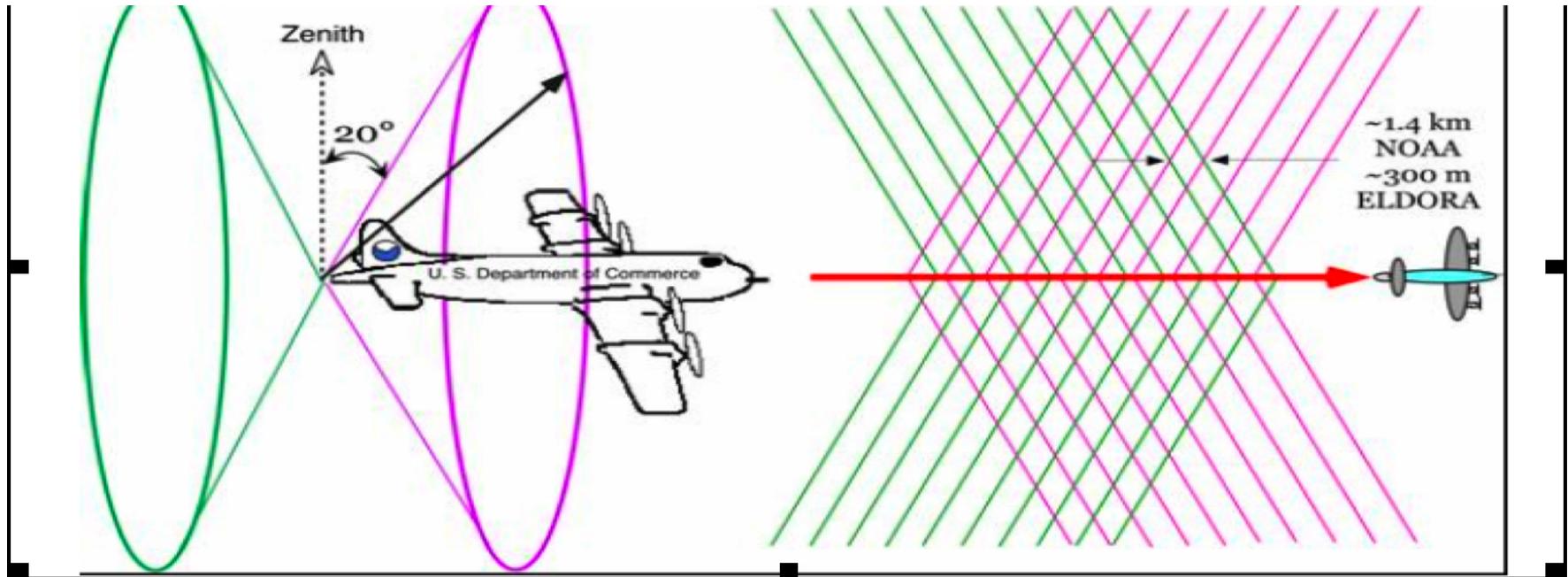


The WRF/3DVAR (as a surrogate of operational algorithm) assimilates the same radar data but without flow-dependent background error covariance, its forecast failed to develop the storm despite fit to the best-track observation better initially

**(Zhang et al. 2009 MWR)**

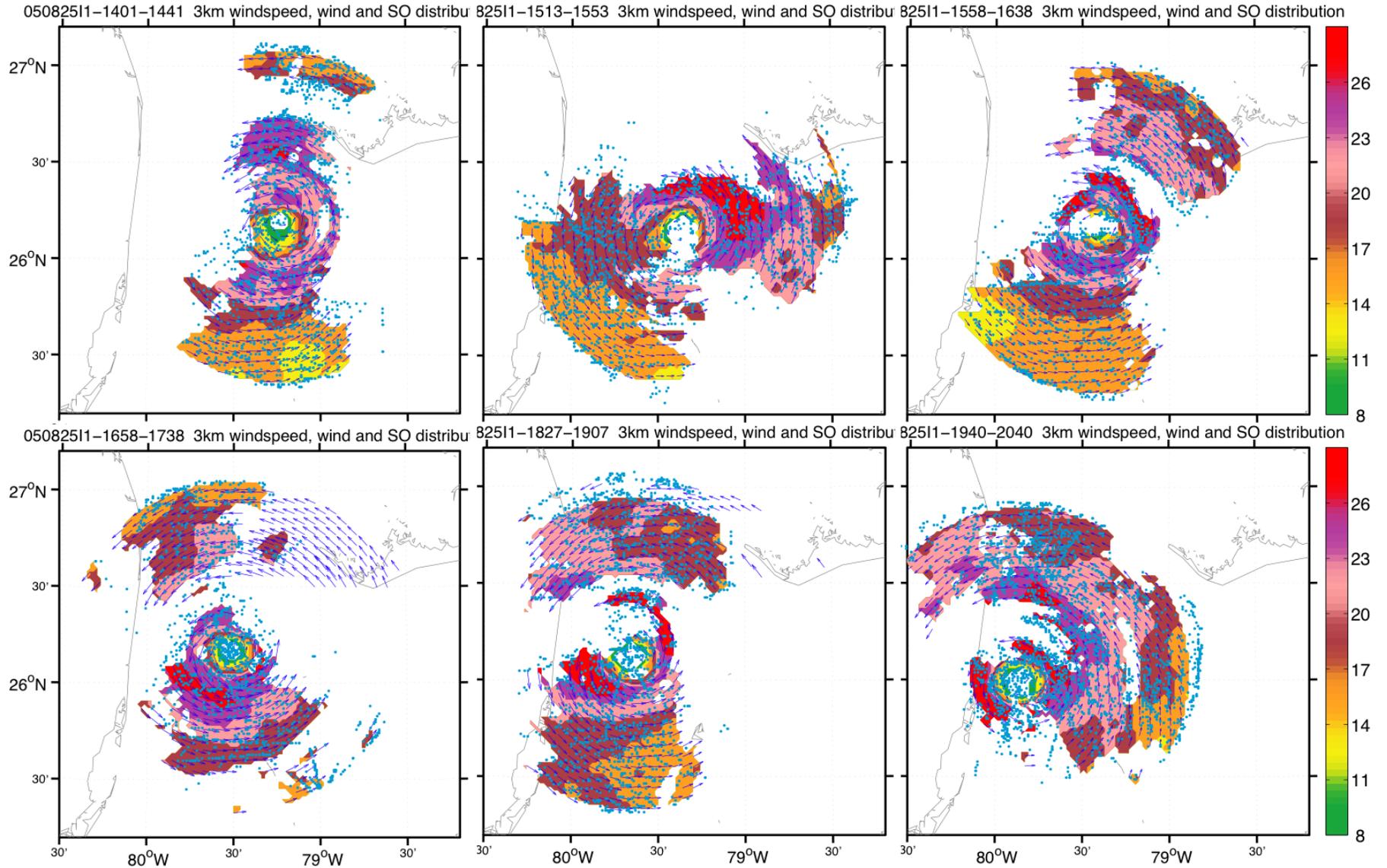
# Superobservation for Airborne Doppler Radar Winds

*Available for 20+ years but never used in operational models due to the lack of resolution and/or the lack of efficient data assimilation methods*



SOs: 1. Separate forward and backward scans; 2. removing data with vertical pointing angles greater than 45 degree; 3. treat every 3 adjacent full scans as one fixed-space radar (translation < 5 km); 4. thinning --- one bin for 5 km in radial distance and 5 degree in scanning angle; 5. use medium as SO after several additional QC criteria checking  
*These SOs are generated on flight of NOAA P3's; transmitted to ground in realtime*

# Assimilate Airborne Doppler Vr for Katrina (2005)



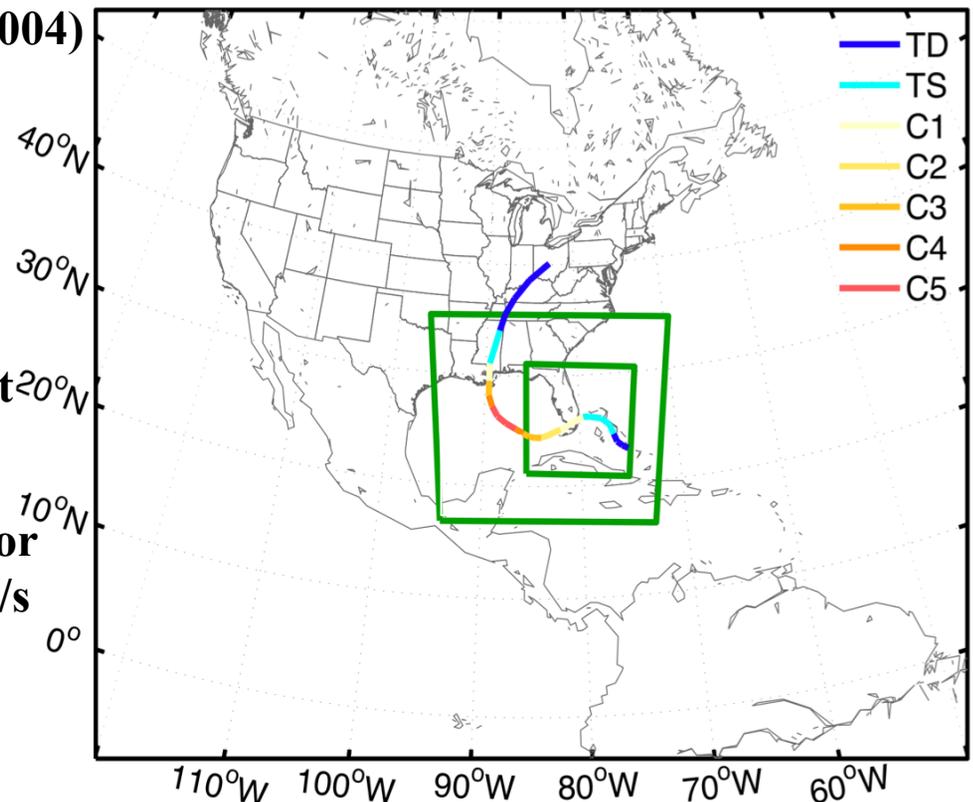
# Assimilate Airborne Vr with EnKF for Katrina

- **WRF domains:** D1-D2-D3 grid sizes---40.5, 13.5, 4.5km (movable)
  - **Physics:** WSM 6-class microphysics; YSU PBL; Grell-Devenyi CPS
- **EnKF (Meng & Zhang 2008a,b; Zhang et al 2009):** - 30-member ensemble
  - IC/BC perturbations: WRF3DVar background uncertainty (Barker et al. 2005)
  - Covariance localization: Gaspari&Cohn (1999) but successively smaller
  - Covariance relaxation (Zhang et al 2004)

$$(\mathbf{x}_{\text{new}}^a)' = (1 - \alpha) (\mathbf{x}^a)' + \alpha (\mathbf{x}^f)'$$

- **Data assimilated**

- SOs from 6 flight legs at 1430, 1530, 1630, 1730, 1900, 2000UTC 25 August
- Data assimilation are performed for all domains but reduced density for D1 and D2; SO observation error 3m/s



# Successive Covariance Localization

(Zhang et al. 2009)

SCL is designed to assimilate dense observations that contain information about the state of the atmosphere at different scales, as is the case for hurricanes. It is also designed to reduce computation cost and sampling errors

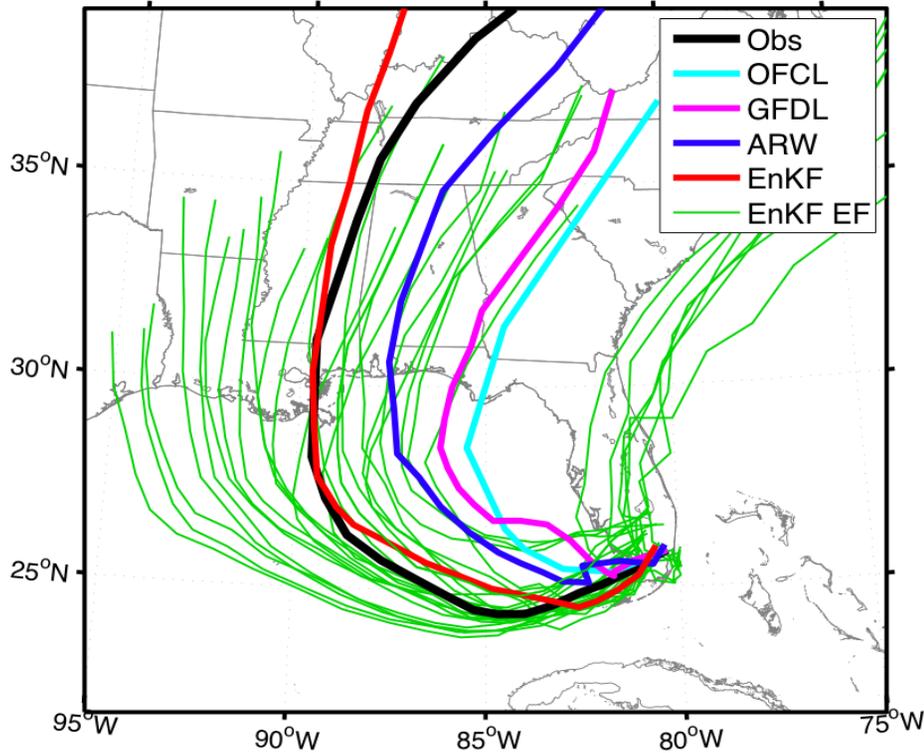
Rationale: Assuming larger-scale errors will have larger correlation length scales and smaller-scale errors have much smaller correlation length scales, fewer observations with larger radii of influence (ROIs) are needed to constrain large-scale errors, and a larger number of observations are needed to constrain small-scale errors

**CNTL experiments: SCL with different radii of influence (ROIs):** 1200km (1/18 of SOs) characteristic scale for large-scale flow; 400km (1/9 of SOs) for subsynoptic or TC storm scale; 135km (1/3 of SOs) for mesoscale to convective-scale details; other 1/2 not used now

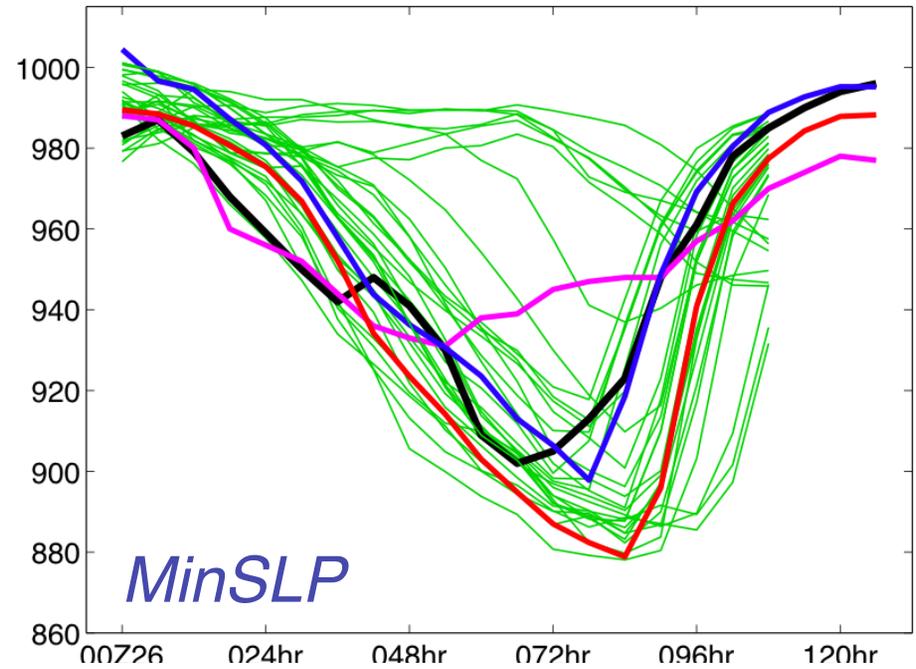
# WRF/EnKF Performance With airborne Vr obs

*30-member ensemble forecast  
from EnKF posterior uncertainty*

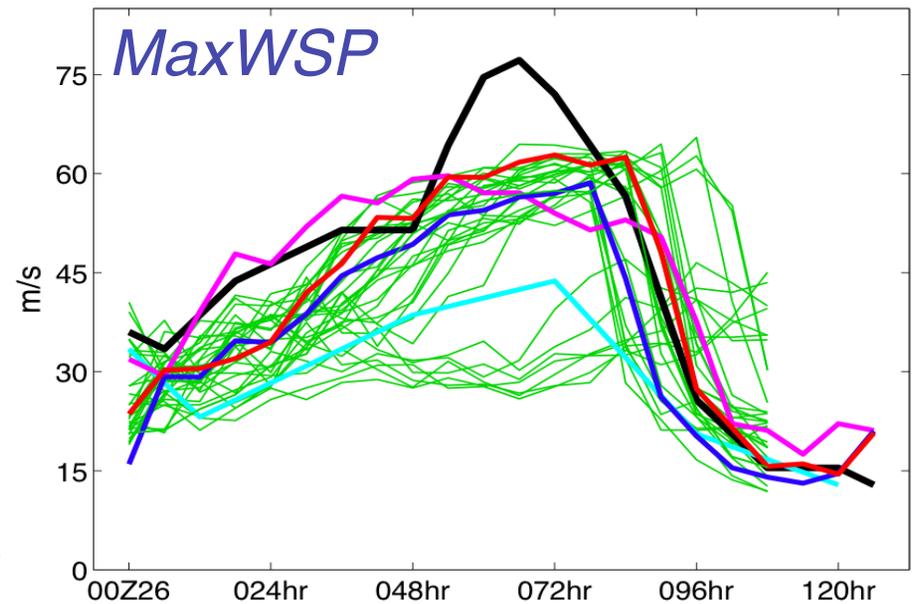
Katrina EnKF082512 Track  
IC:12Z25; SO: 1401-2040



Katrina EnKF082512 minSLP  
IC:12Z25; SO: 1401-2040

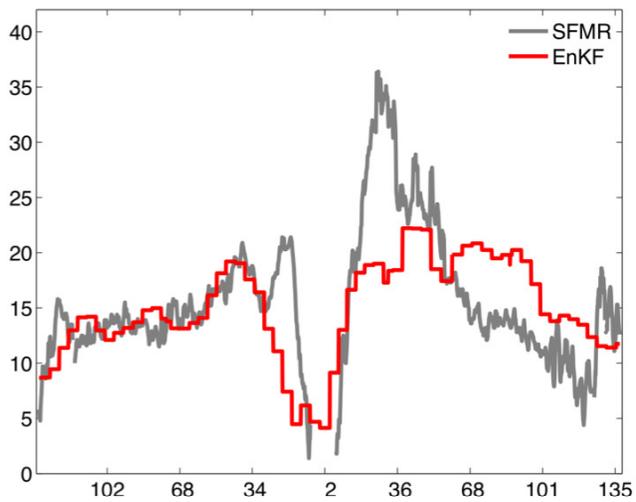


Katrina EnKF082512 max 10mWSP  
IC:12Z25; SO: 1401-2040

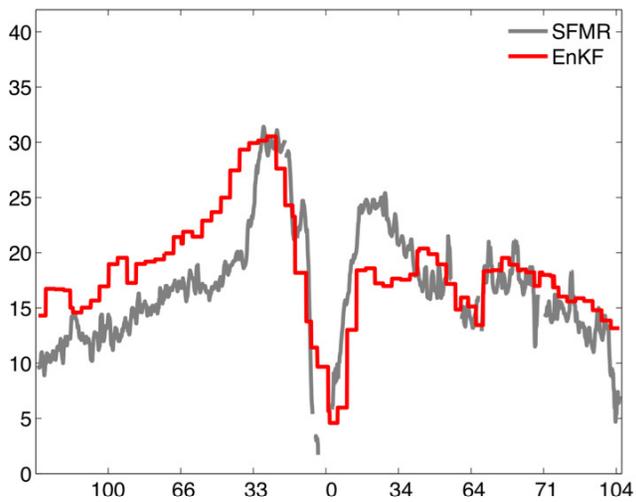


# Verification: SFMR wind obs vs. EnKF sfc analysis

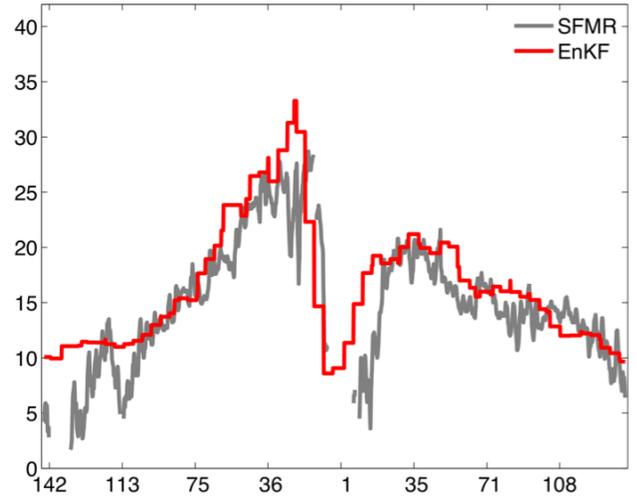
140100–144101 SMFR surface vs lowest model level wind speed



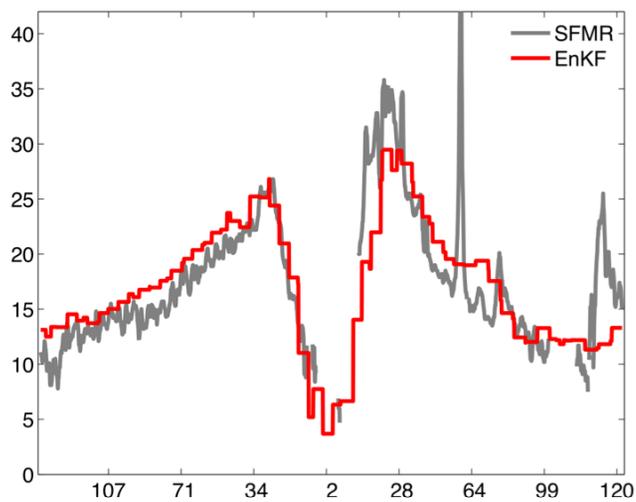
151300–155301 SMFR surface vs lowest model level wind speed



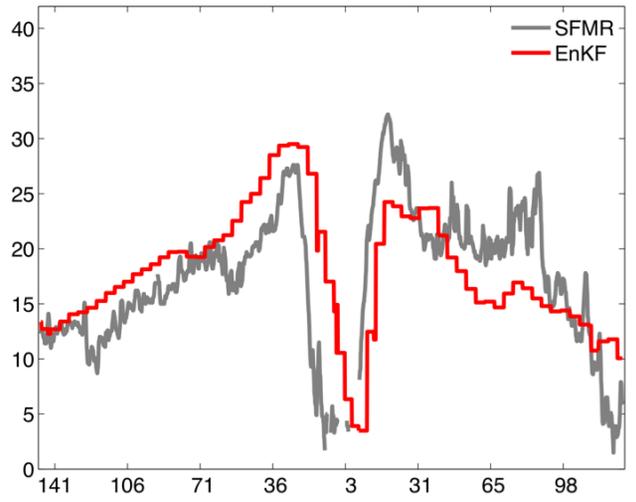
155800–163801 SMFR surface vs lowest model level wind speed



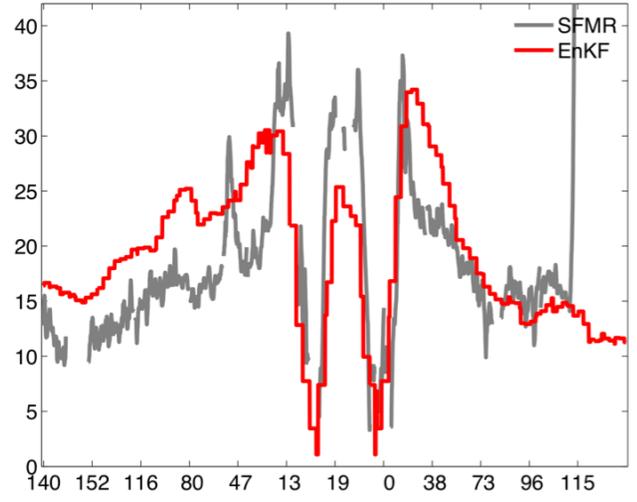
165800–173801 SMFR surface vs lowest model level wind speed



182700–190701 SMFR surface vs lowest model level wind speed

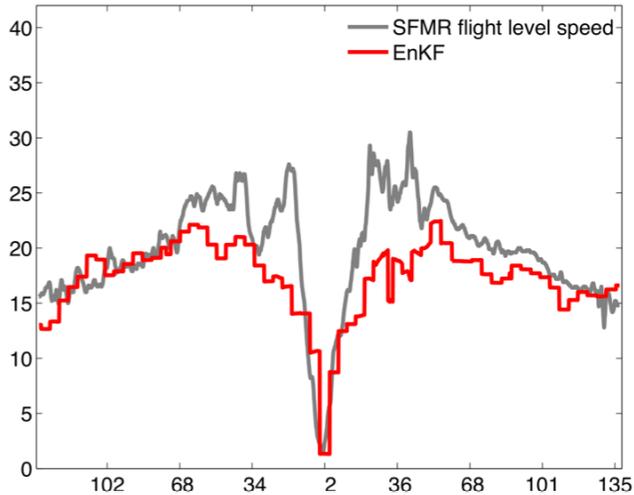


194000–204001 SMFR surface vs lowest model level wind speed

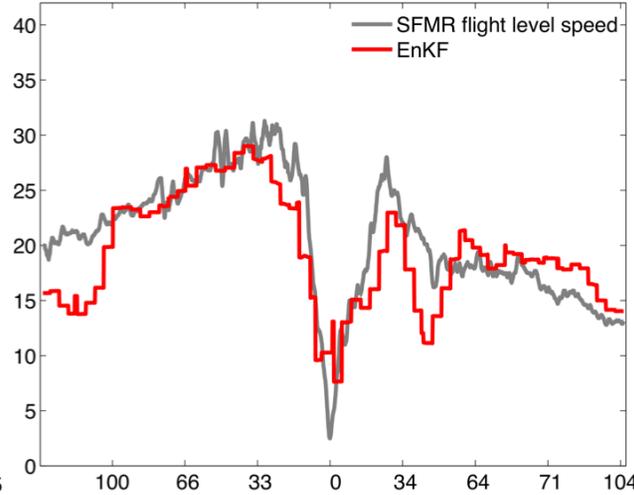


# Verification: P3 flight-level wind vs. EnKF analysis

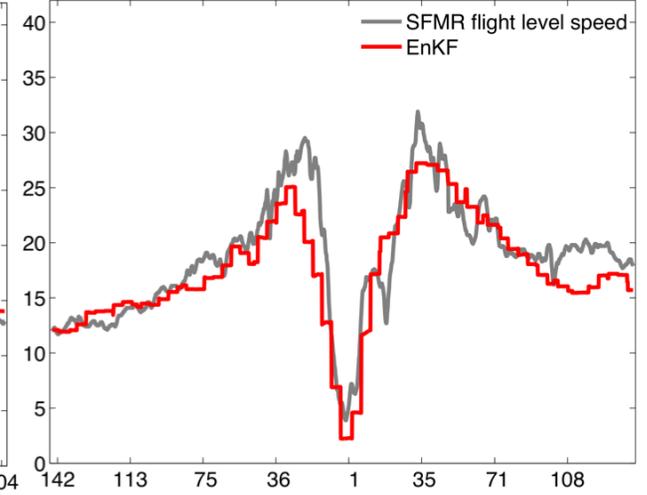
140100–144101 SMFR vs model flight level wind speed



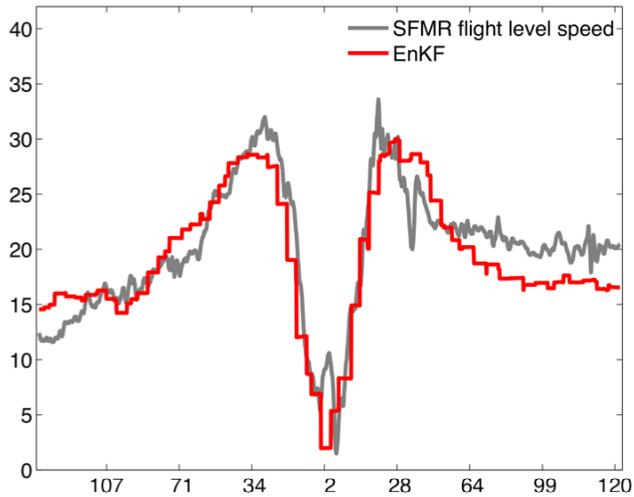
151300–155301 SMFR vs model flight level wind speed



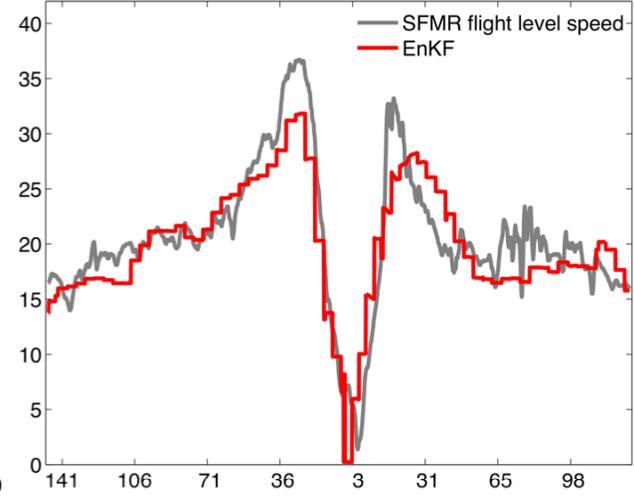
155800–163801 SMFR vs model flight level wind speed



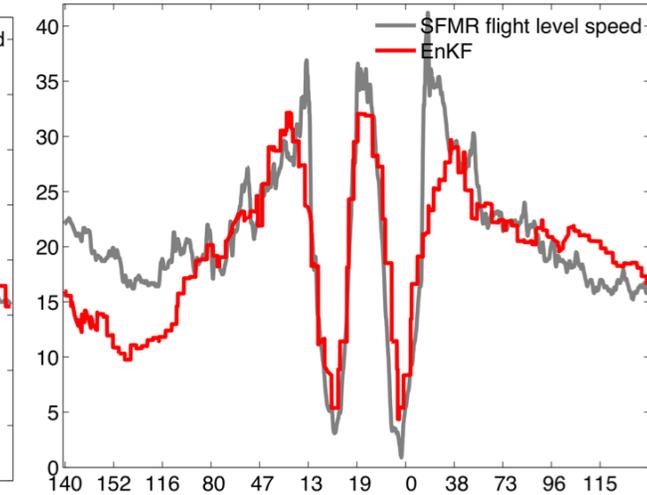
165800–173801 SMFR vs model flight level wind speed



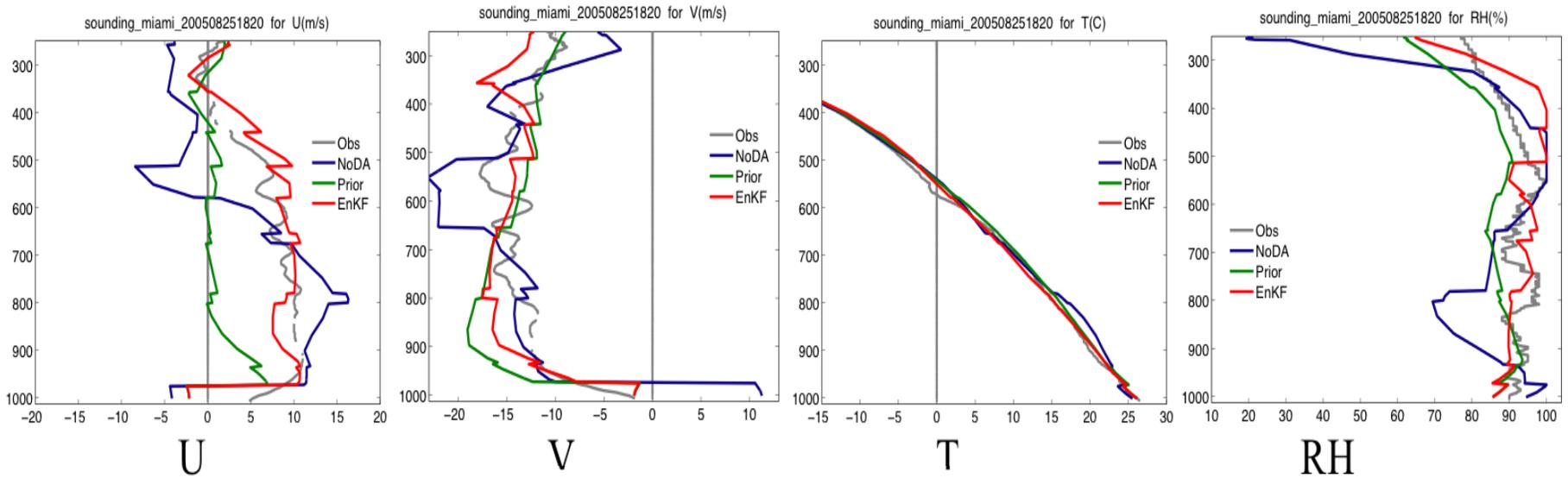
182700–190701 SMFR vs model flight level wind speed



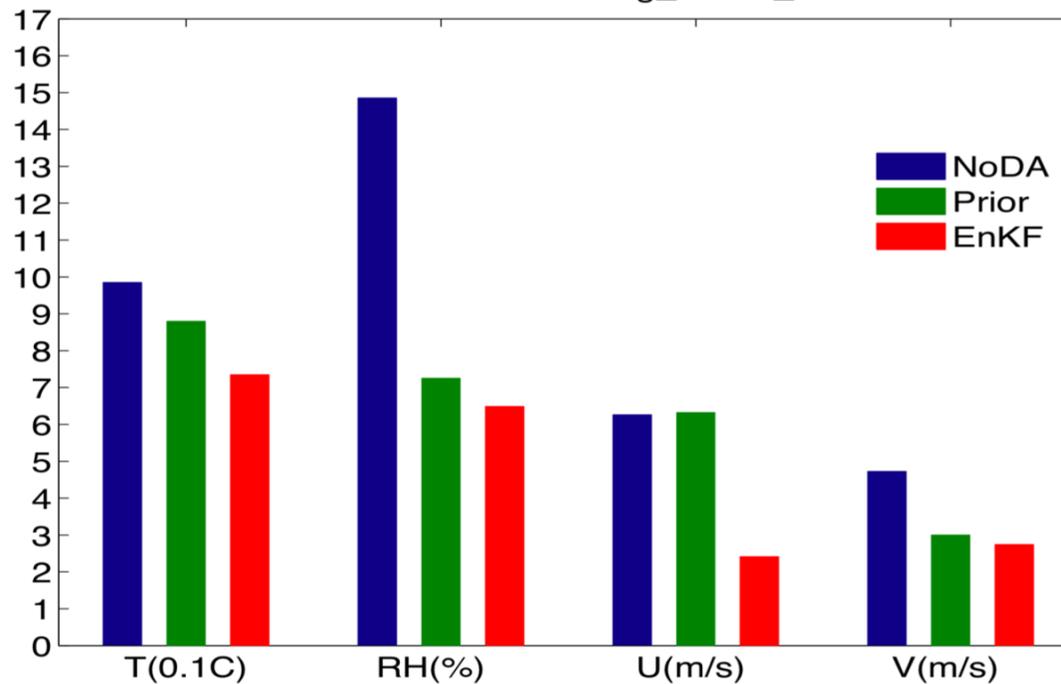
194000–204001 SMFR vs model flight level wind speed



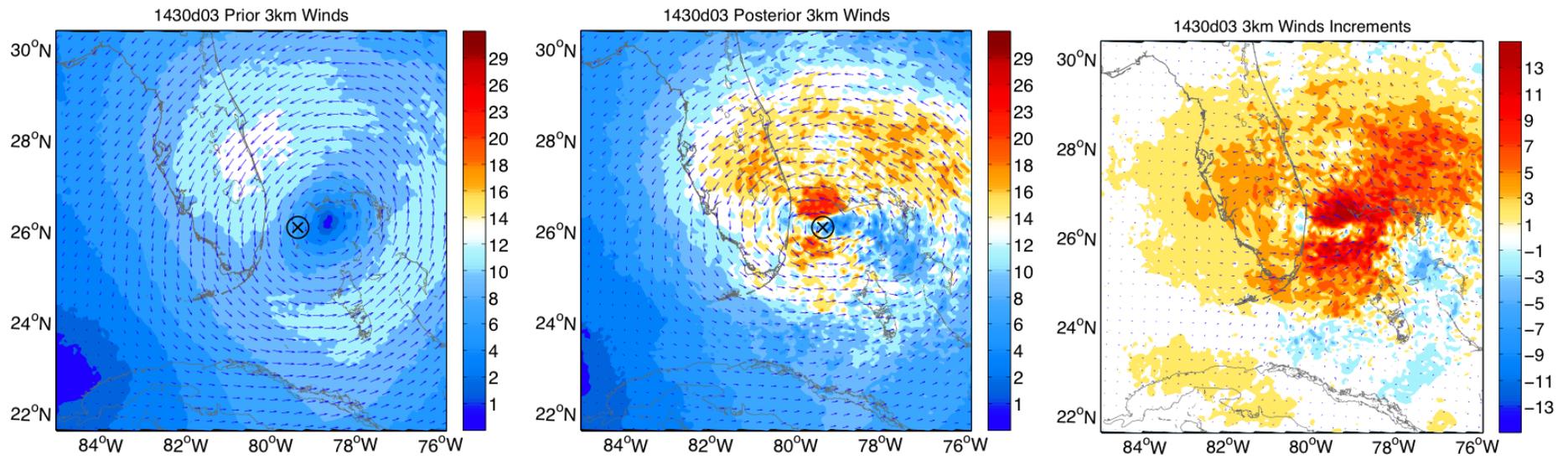
# Verification: Miami Sounding 1820Z vs. EnKF analysis 19Z



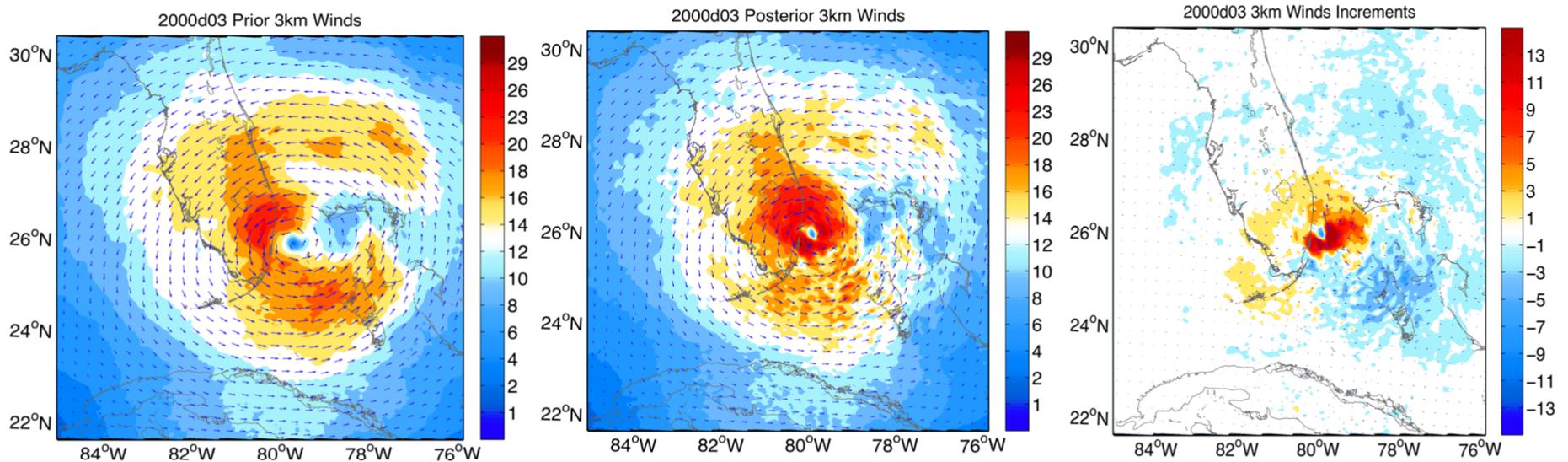
model at 1900 RMSE vs. sounding\_miami\_200508251820



# WSP prior, posterior and increments 1<sup>st</sup> and last leg

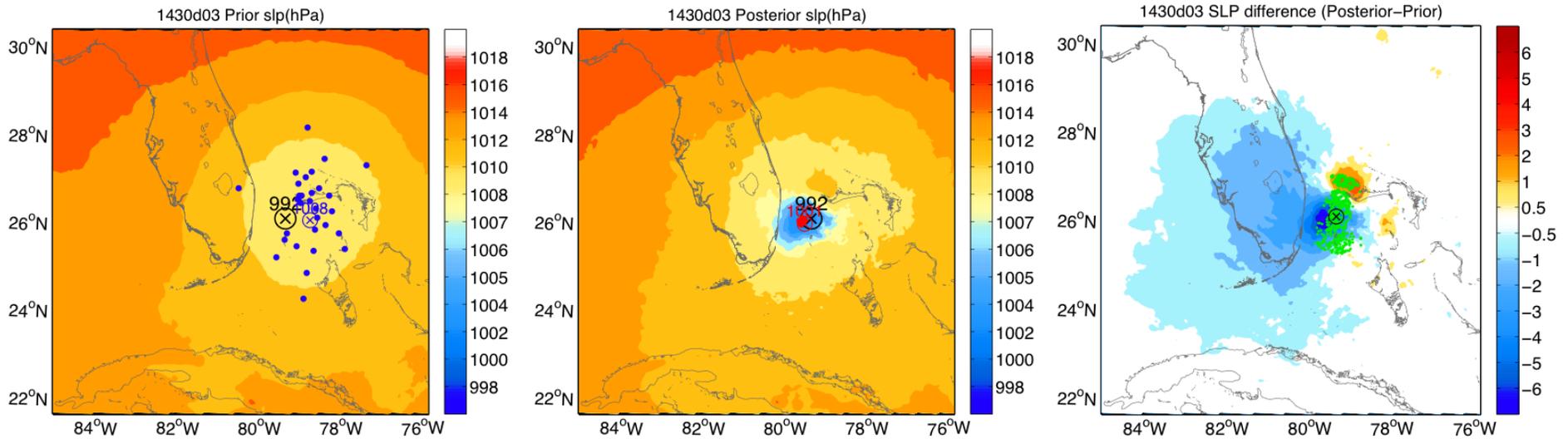


14:30 D03 (4.5km)

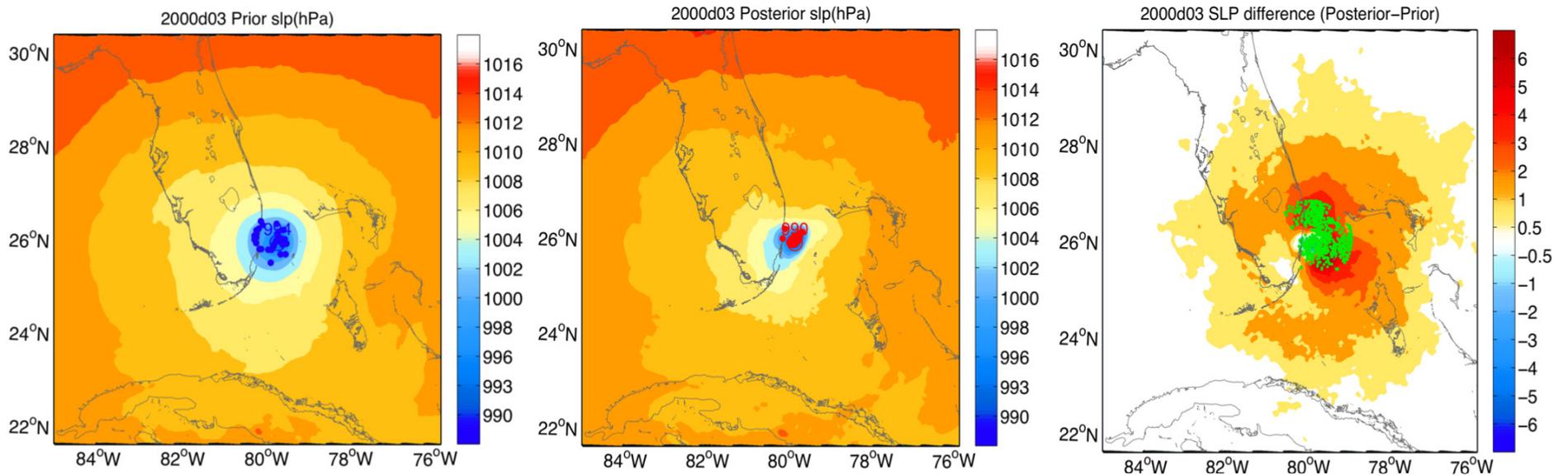


20:00 D03 (4.5km)

# SLP prior, posterior and increments 1<sup>st</sup> and last leg

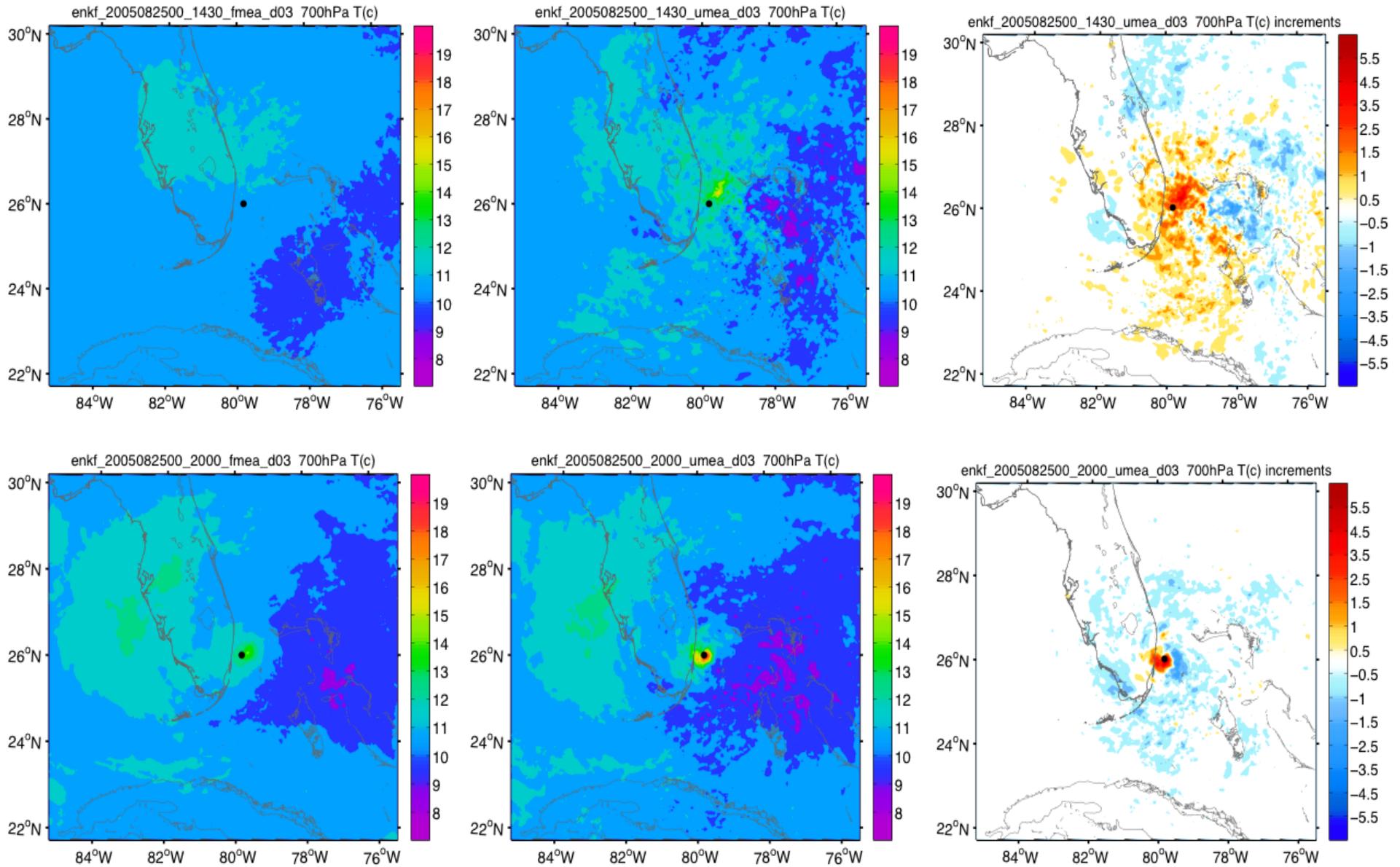


14:30 D03 (4.5km)



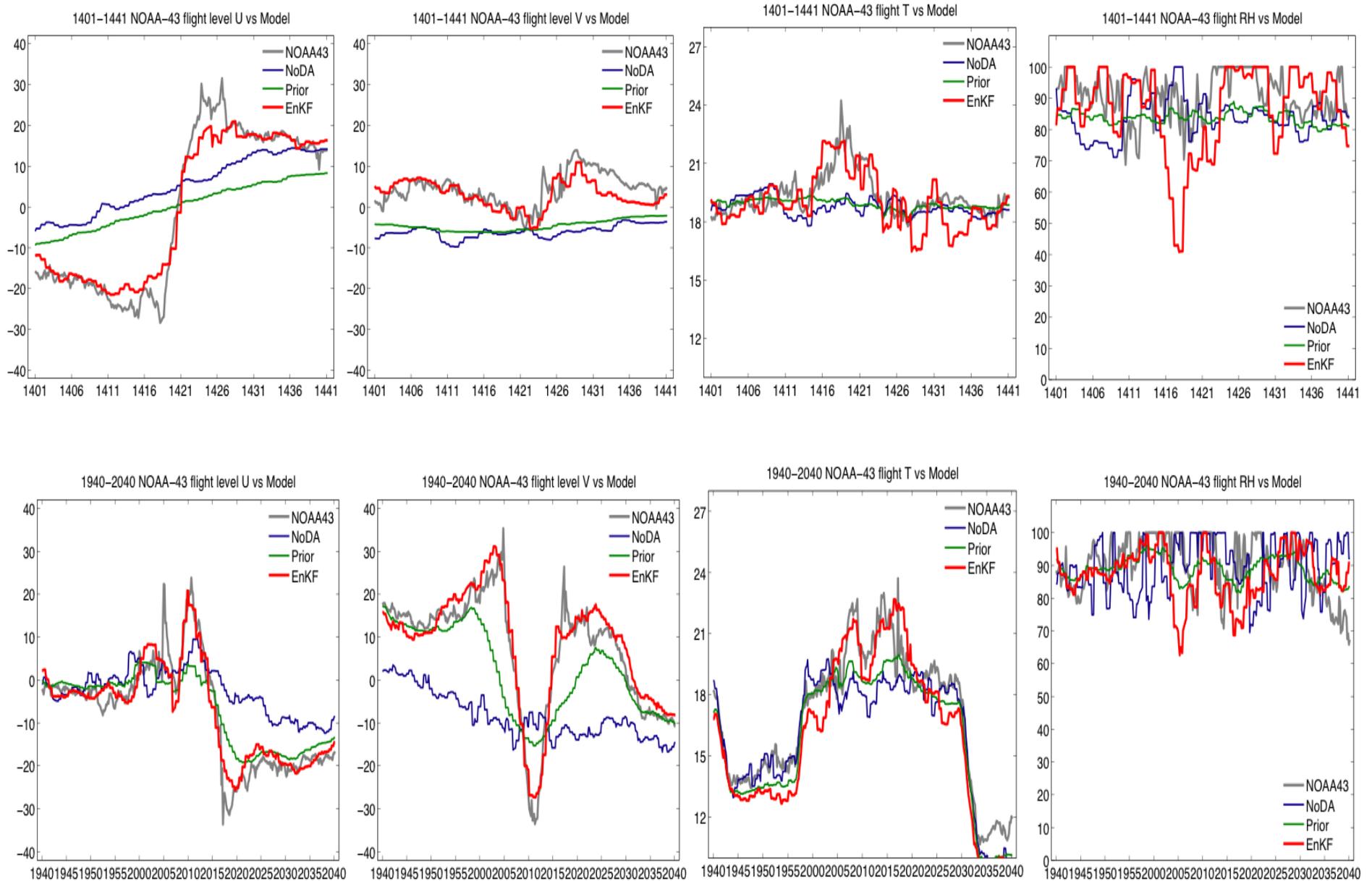
20:00 D03 (4.5km)

# T(700mb), posterior and increments 1<sup>st</sup> and last leg

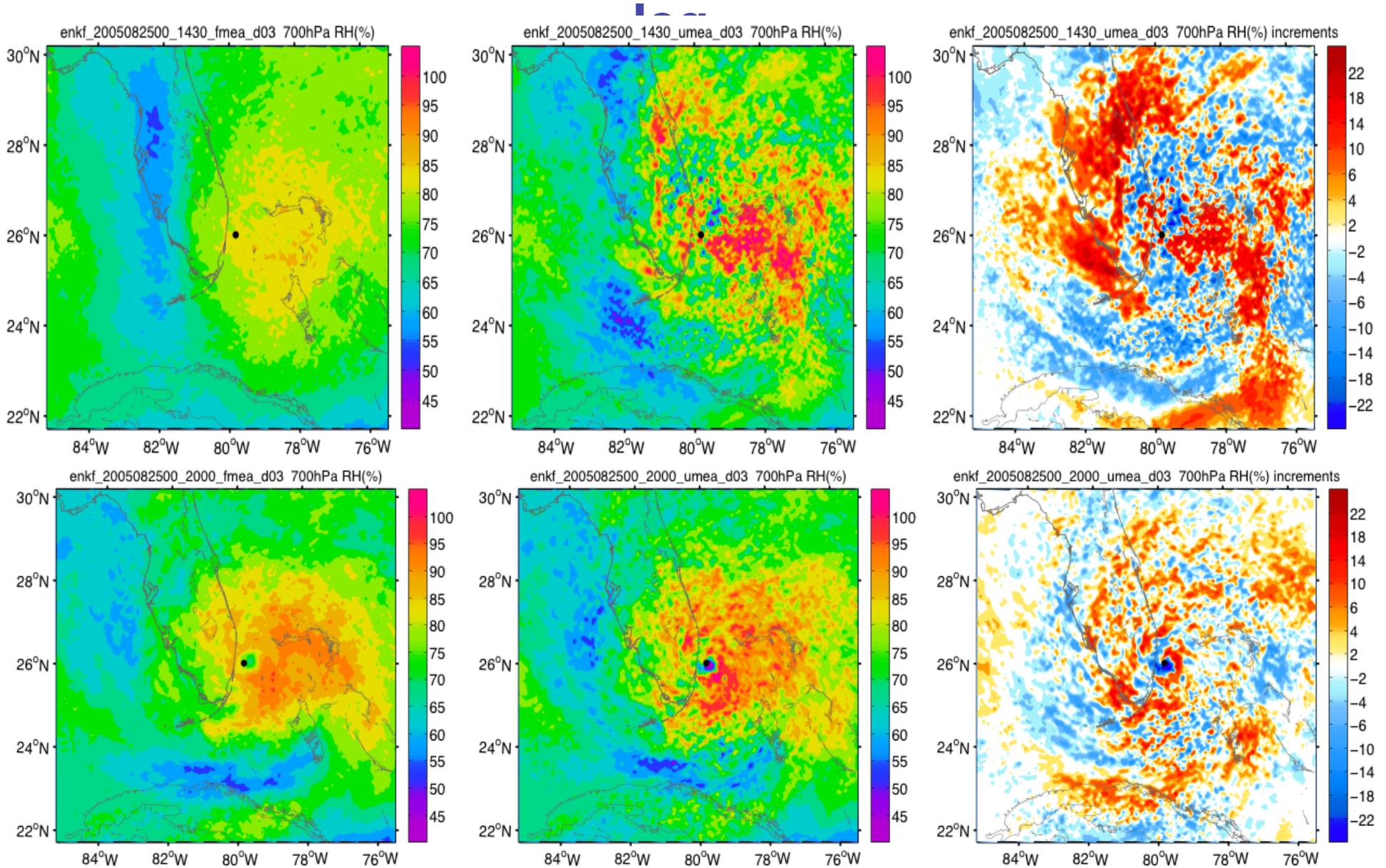


20:00 D03 (4.5km)

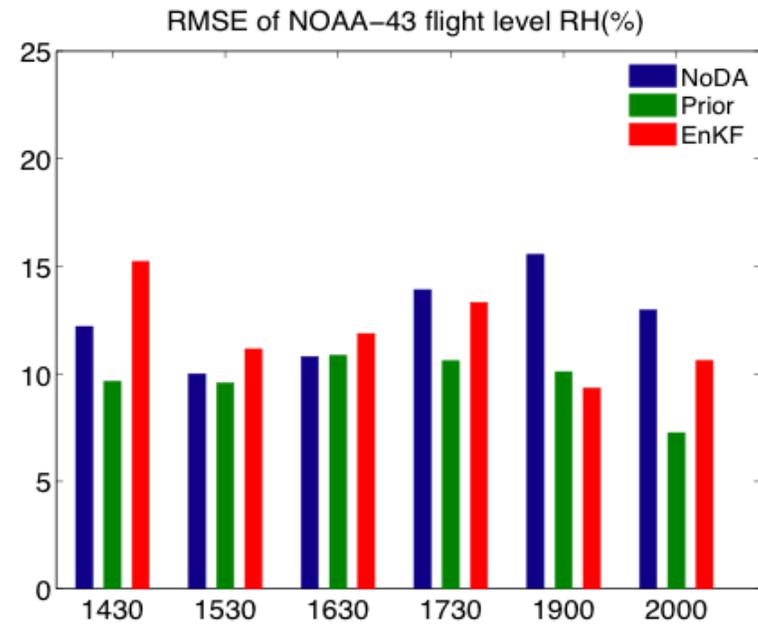
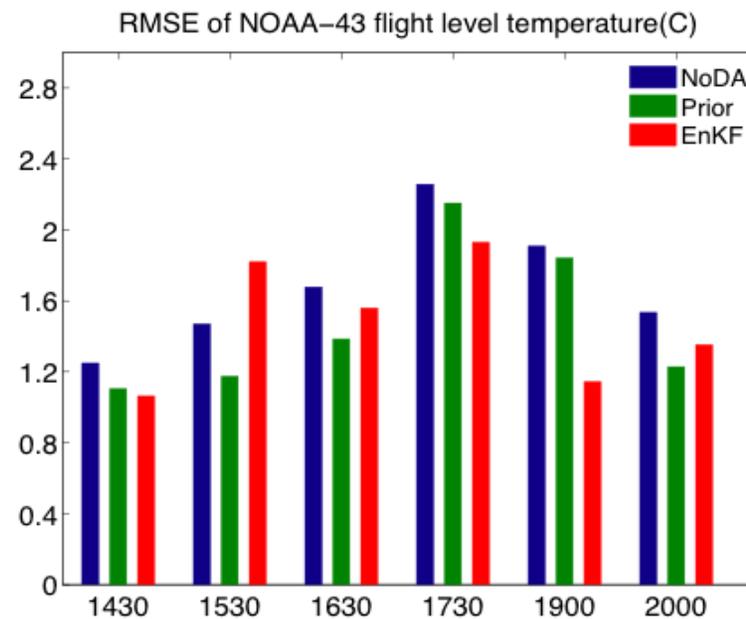
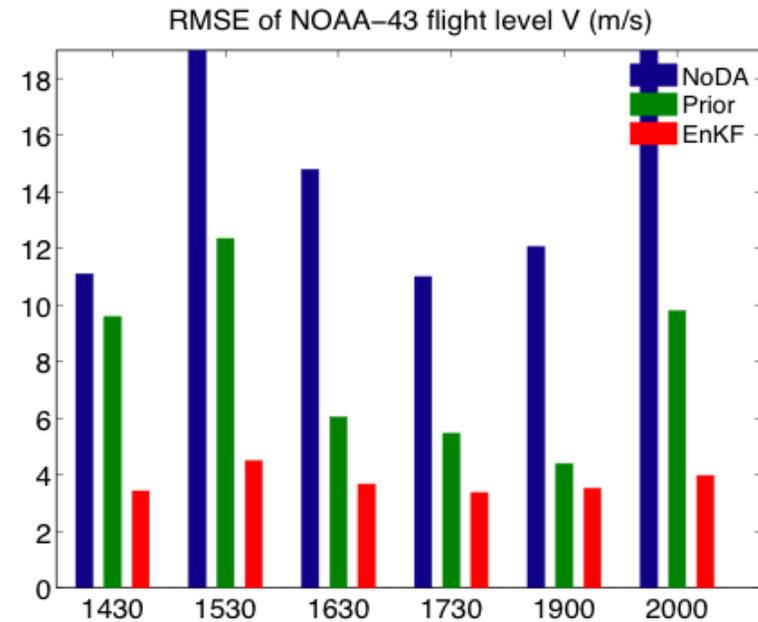
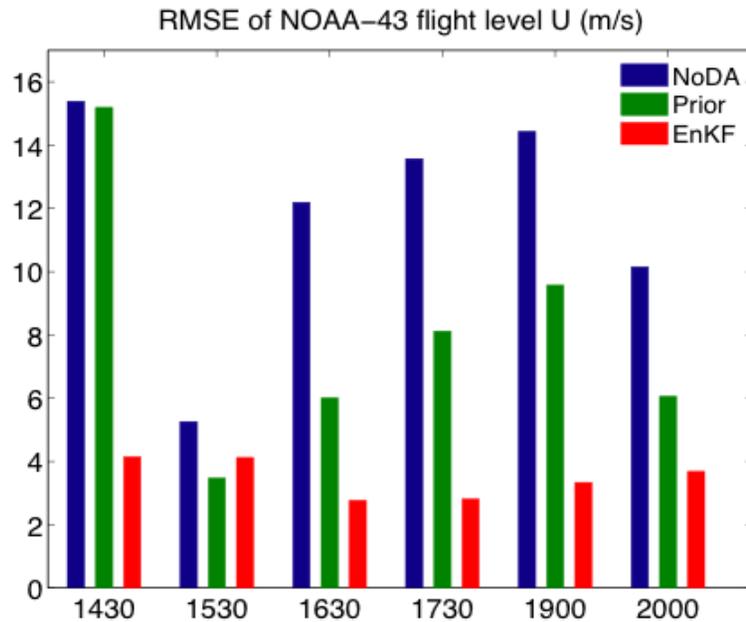
# Verification: Flight-level obs vs. EnKF analysis



# 700mb RH7, posterior and increments 1<sup>st</sup> and last



# Verification: Flight-level obs vs. EnKF analysis

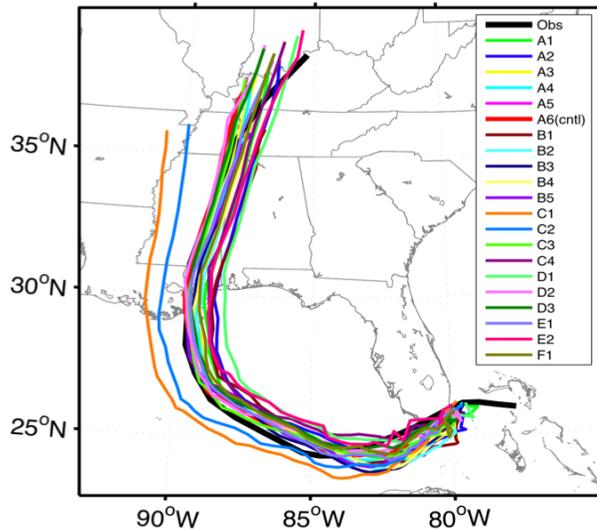


# How many legs of Airborne Vr are needed?

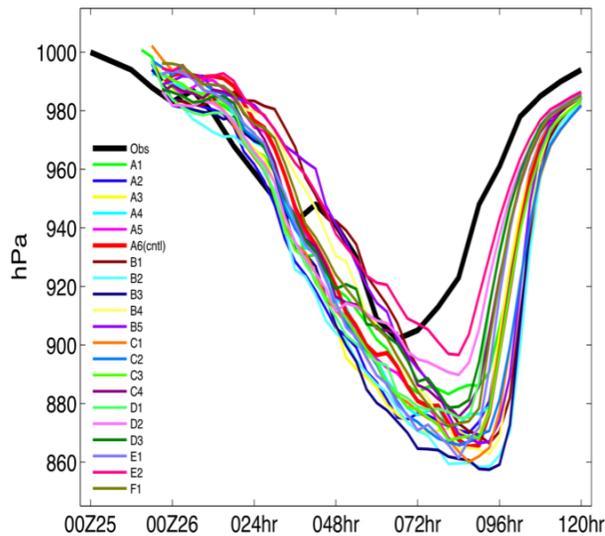
## *Sensitivity to number of flight legs observations simulated*

Experiment Name		End of EnKF, hence forecast					
		1430	1530	1630	1730	1900	2000
Start P3 assimilation	1430	A1	A2	A3	A4	A5	A6 (cntl)
	1530		B1	B2	B3	B4	B5
	1630			C1	C2	C3	C4
	1730				D1	D2	D3
	1900					E1	E2
	2000						F1

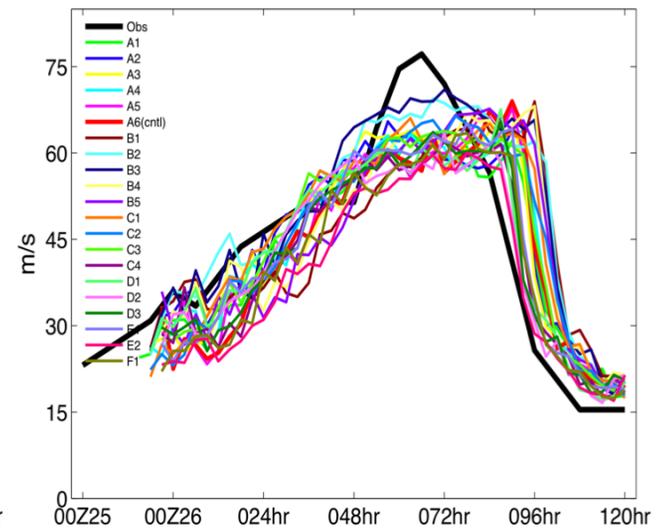
Katrina EnKF vs VAR KAMX Track  
IC:00Z25; KAMX: 1430-2000



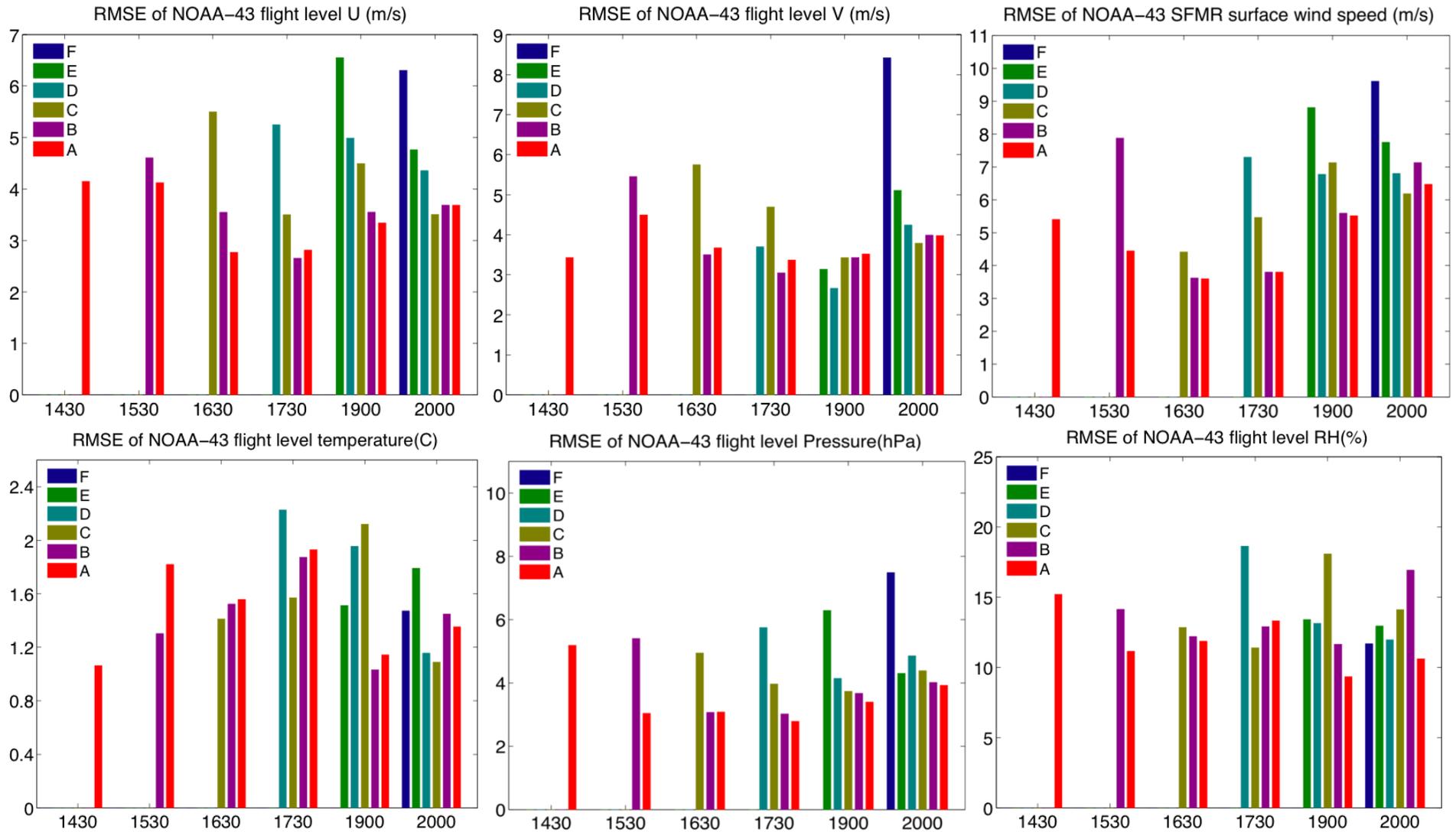
Katrina EnKF vs VAR KAMX minSLP  
IC:00Z25; KAMX: 1430-2000



Katrina EnKF vs VAR KAMX max 10mWSP  
IC:00Z25; KAMX: 1430-2000



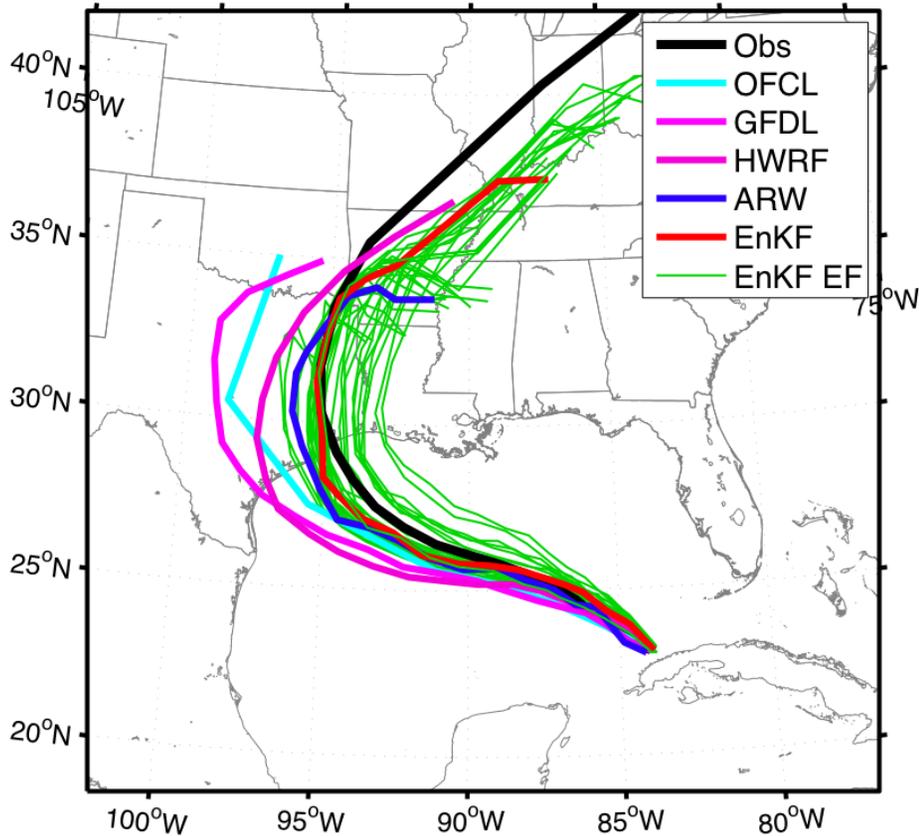
# How many legs of Airborne Vr are needed?



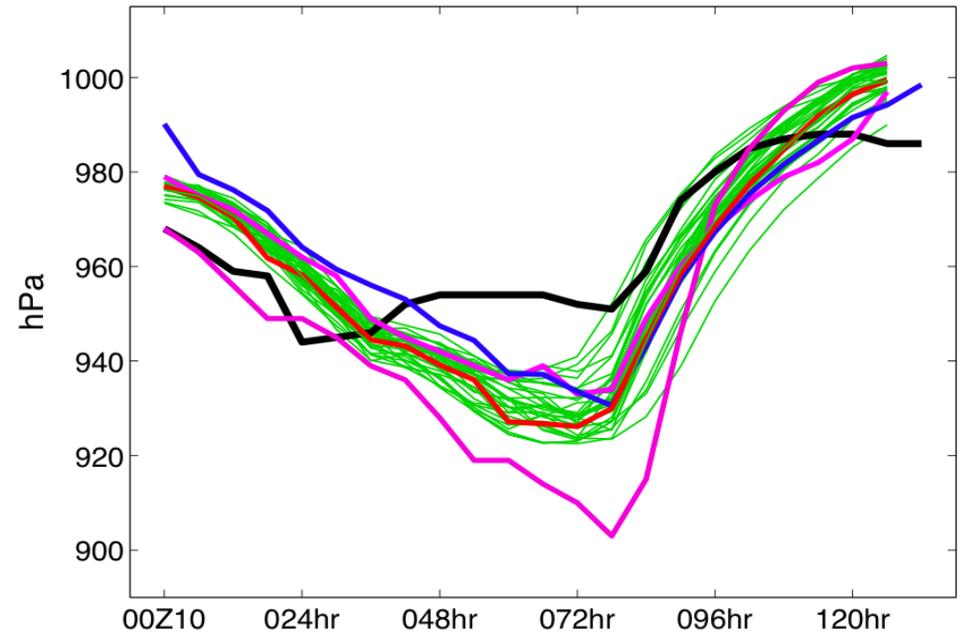
# Hurricane IKE (2008)

## Realtime EnKF assimilation of airborne Doppler winds

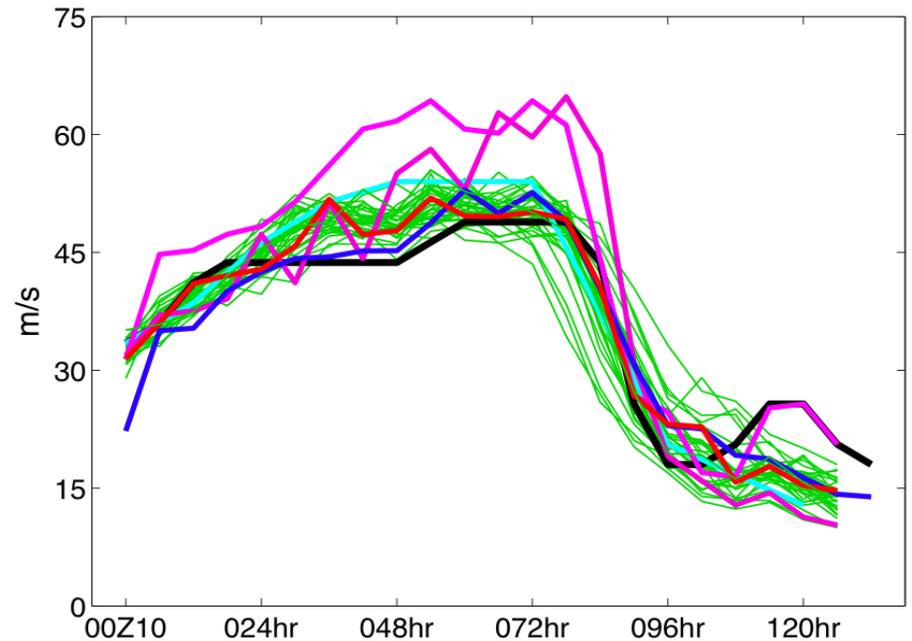
Ike EnKF090912 Track  
IC:12Z09; SO: 2125-2227 & 2302-2341



Ike EnKF090912 minSLP  
IC:12Z09; SO: 2125-2227 & 2302-2341



Ike EnKF090912 max 10mWSP  
IC:12Z09; SO: 2125-2227 & 2302-2341



## Concluding Remarks

- EnKF assimilation of airborne Doppler radar observations into cloud-resolving mesoscale models is promising for convective-resolving hurricane analysis and initialization, deterministic and probabilistic forecasts; impact similar to WSR88D
- Promising for realtime 4D hurricane analysis beyond Hwind\*
- Successive covariance localization (SCL) and covariance relaxation again simple but useful for multiscale complex flows; it has the benefits of reducing sampling errors and computation
- Realtime convective-permitting realtime ensemble analysis and forecasts for 2008/2009 Atlantic season quite successful; sample size still limited
- **Our proof-of-concept realtime success is continuing on this year**