

**Predictability and Observability of the Genesis of
Tropical Cyclones through Cloud-resolving
Ensemble Analysis and Forecasting**

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Plans and Goals at PSU

Modeling: Real-time cloud-resolving ensemble analysis and forecasting assimilating airborne Doppler and dropsonde observations

Observations: Tracking the change of dynamics and thermodynamics as well as the surface fluxes associated with VHTs and VHT clusters

Science 1: The role of multiscale vortex interaction, upscale growth of diabatically generated vorticity anomalies in the genesis of tropical cyclones:

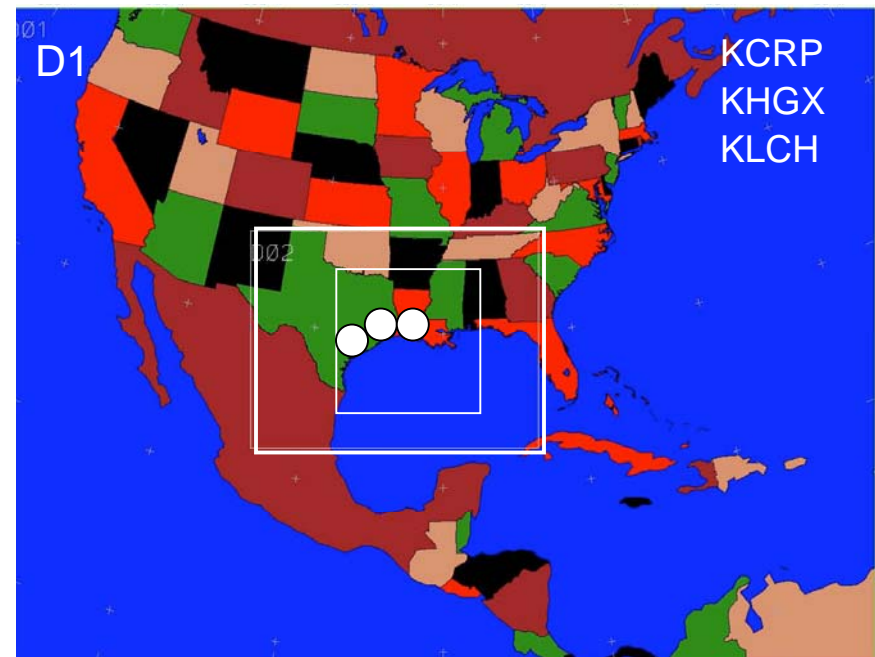
easterly waves \leftrightarrow “pouch” \leftrightarrow VHT clusters \leftrightarrow VHTs

Science 2: Observability of tropical cyclone genesis processes; flow and regime dependent tropical cyclone predictability

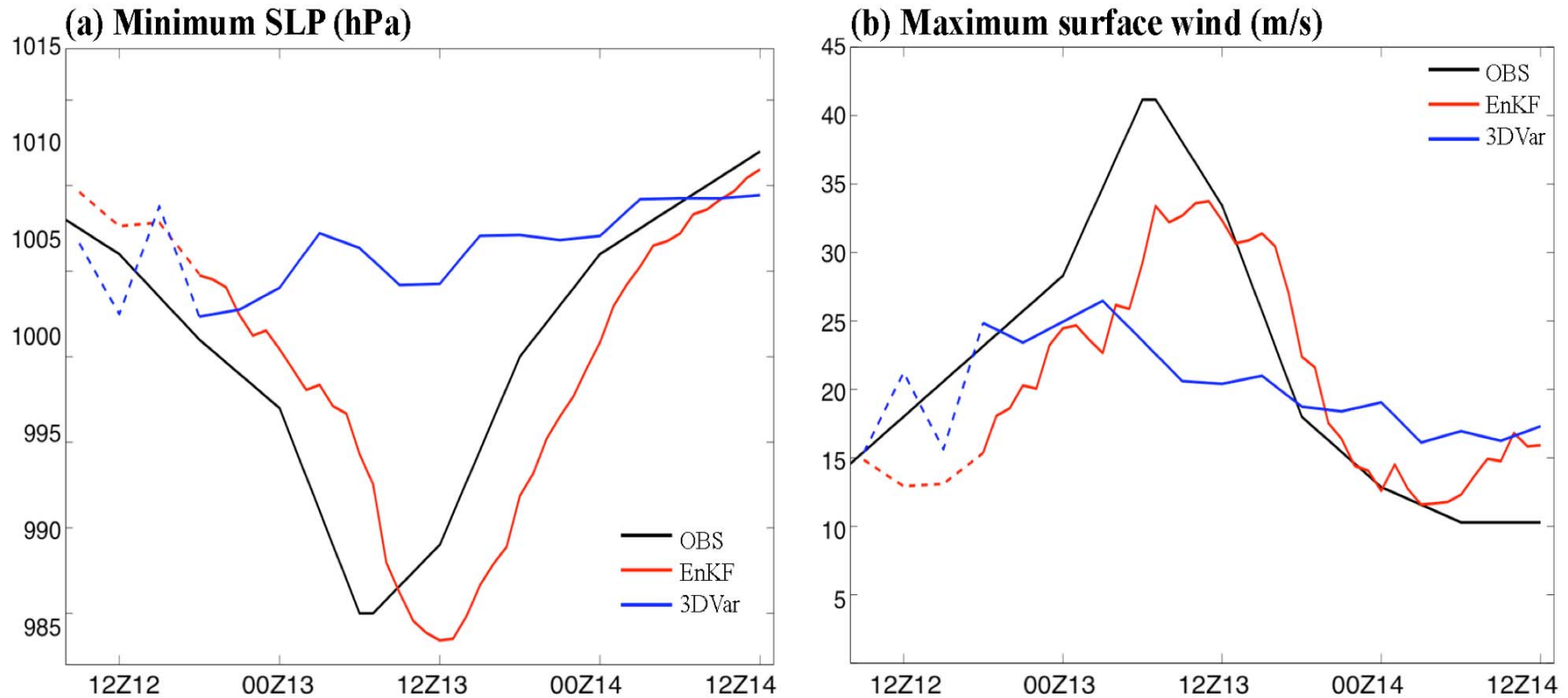
Assimilate W88D Vr for Humberto with EnKF

(Zhang et al. 2009 MWR)

- WRF domains: D1-D2-D3 grid sizes---40.5km, 13.5km, 4.5km
- and EnKF (Hammil Whitaker 2002; Snyder and Zhang 2003)
 - WRF-EnKF (Meng and Zhang 2008a,b MWR); 30-member ensemble
 - Initialized at 00Z 12 using 3DVar background uncertainty with FNL analysis
 - Covariance localization (Gaspari and Cohn 1999)
 - Covariance relaxation (Zhang et al. 2004)
- Data assimilated:
 - WSR88D at KCRP, KHGX and KLCH radar radial velocity every hour from 09Z to 21Z Sept 12, 2007
 - Data assimilation are performed for all domains; obs err 3m/s
 - **Successive covariance localization:** Radii of Influence=1800, 600 and 200km for 1/9, 1/3 and 5/9 of SOs, respectively



WRF/EnKF Forecast vs. Observations vs. 3DVAR

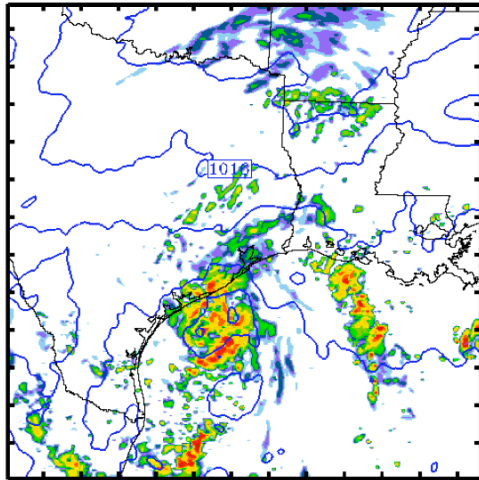
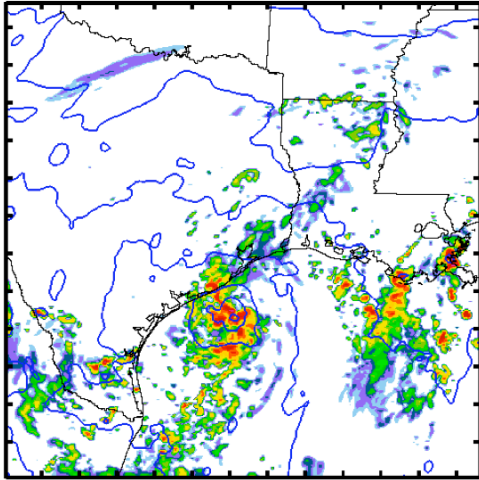


The WRF/3DVAR (as a surrogate of operational algorithm) assimilates the same radar data but without flow-dependent background error covariance, its forecast failed to develop the storm despite fit to the best-track observation better initially

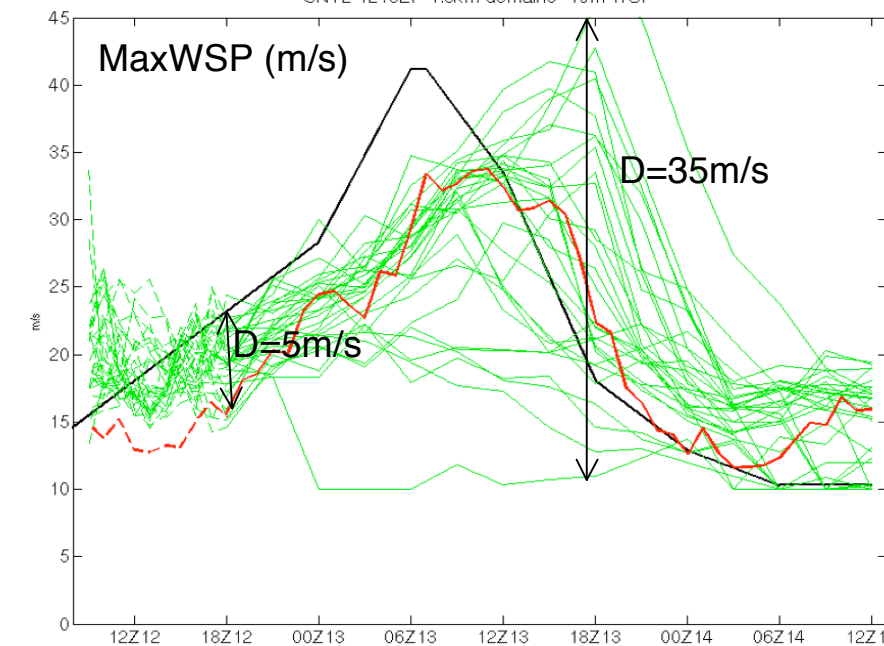
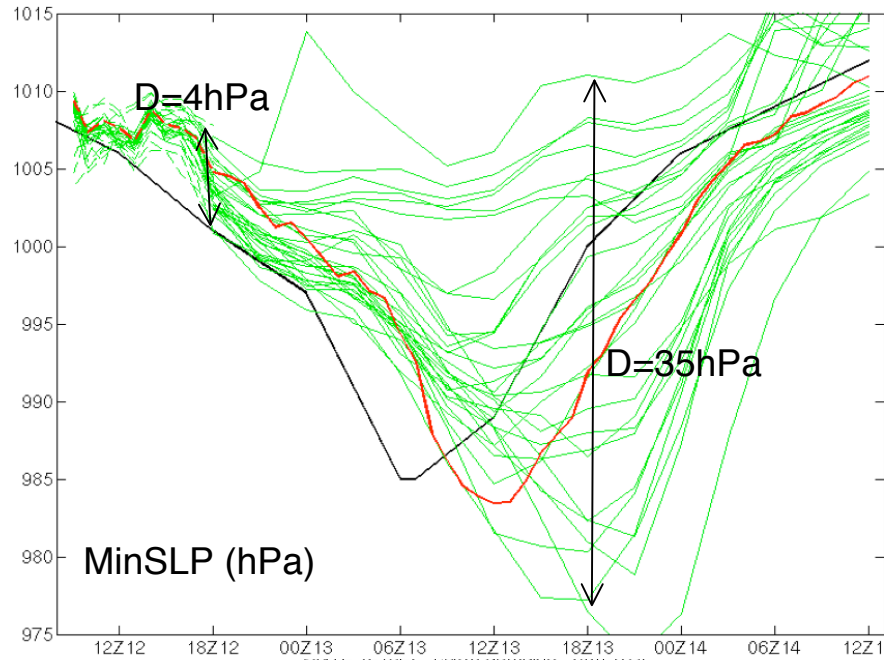
(Zhang et al. 2009)

Ensemble Forecast and Predictability of Intensity

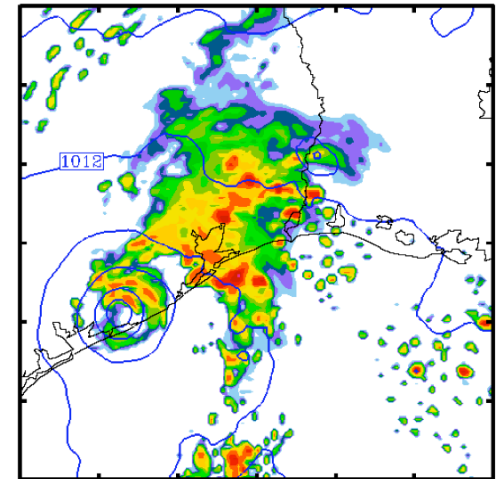
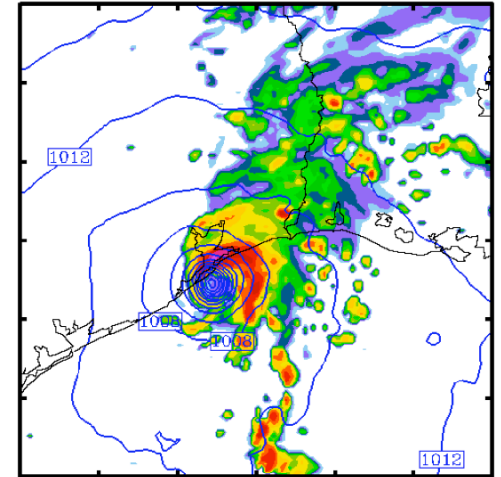
Strong member



Weak member



Strong member



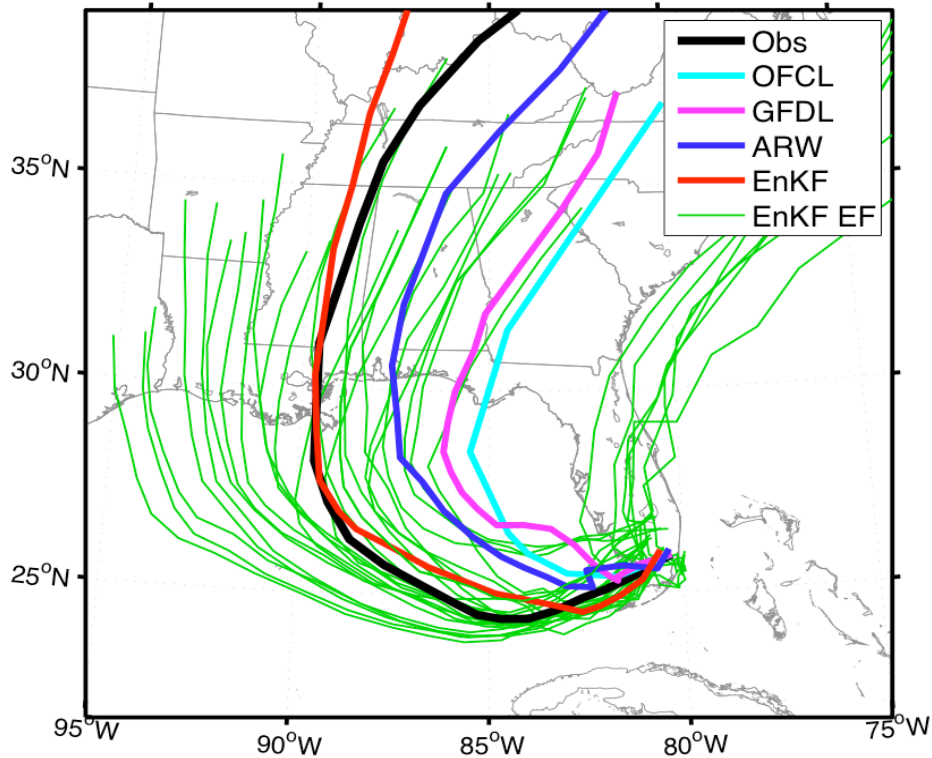
Weak member

(Sippel and Zhang 2009a)

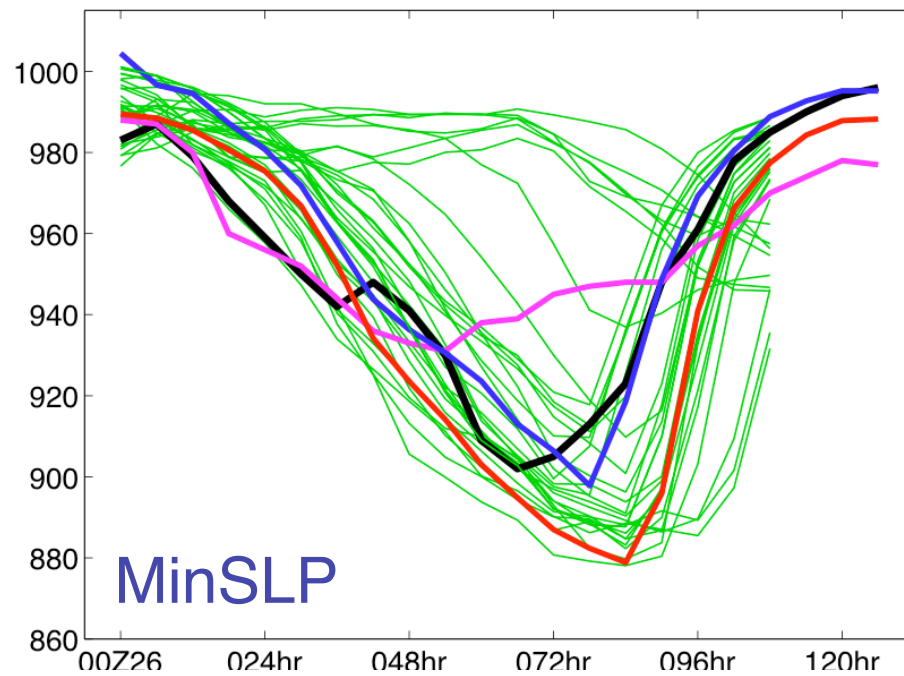
WRF/EnKF Performance (before Florida Landfall)

30-member ensemble forecast
from EnKF posterior uncertainty

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

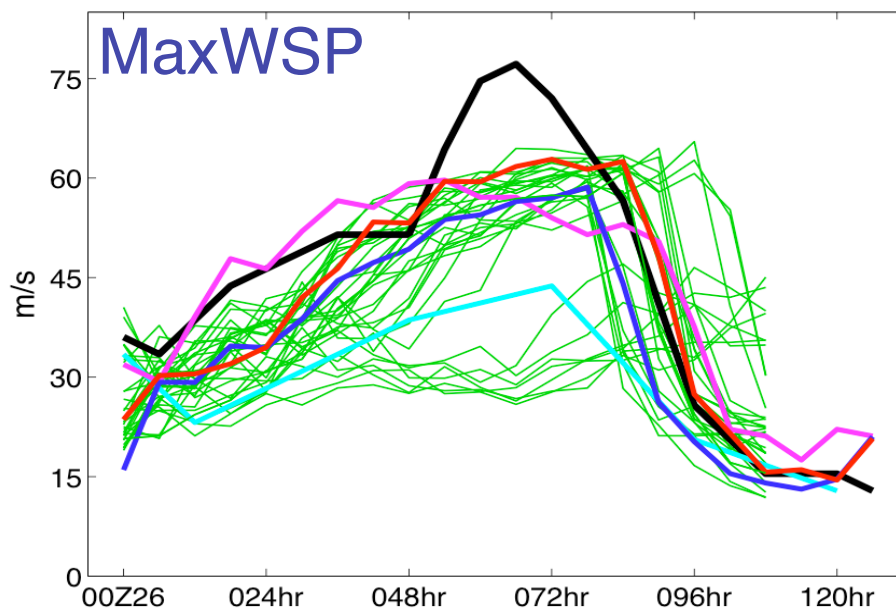


Katrina EnKF082512 minSLP
IC:12Z25; SO: 1401-2040



MinSLP

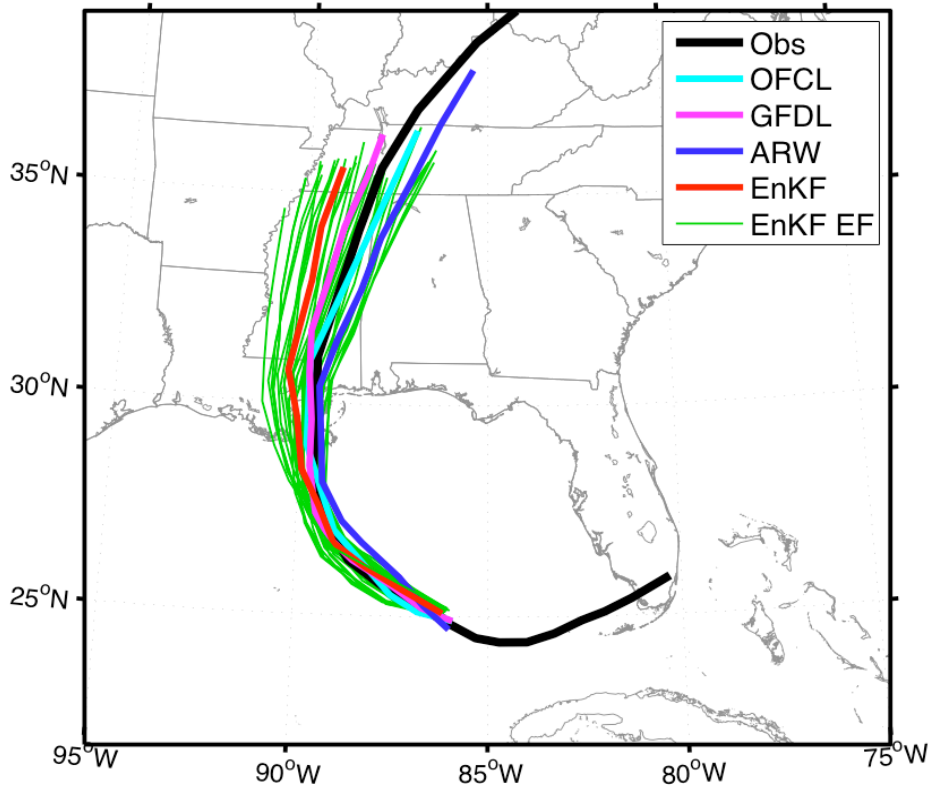
Katrina EnKF082512 max 10mWSP
IC:12Z25; SO: 1401-2040



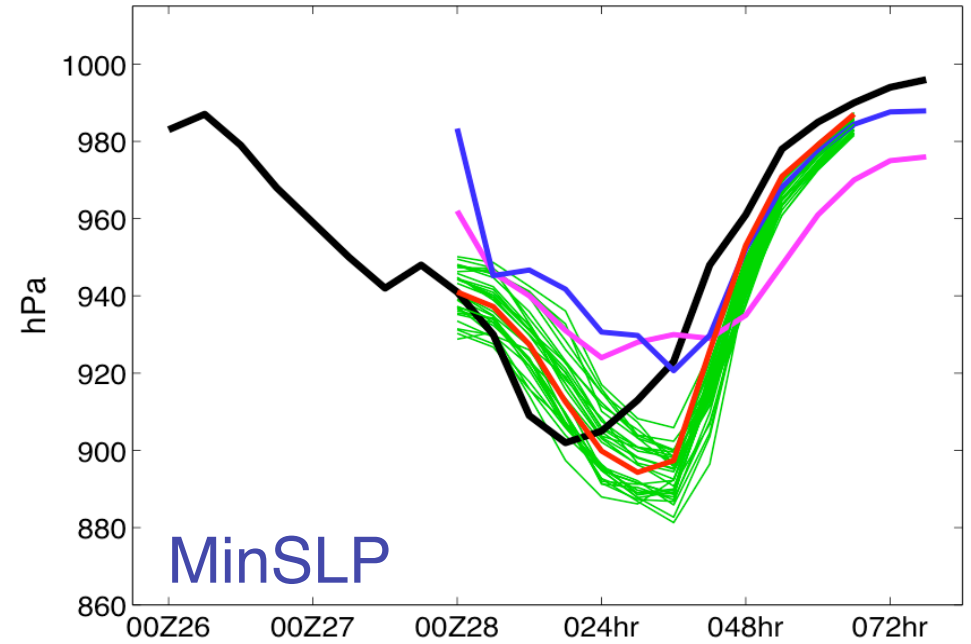
MaxWSP

WRF/EnKF Performance (after Florida Landfall)

Katrina EnKF082712 Track
IC:12Z27; SO: 1442-2025

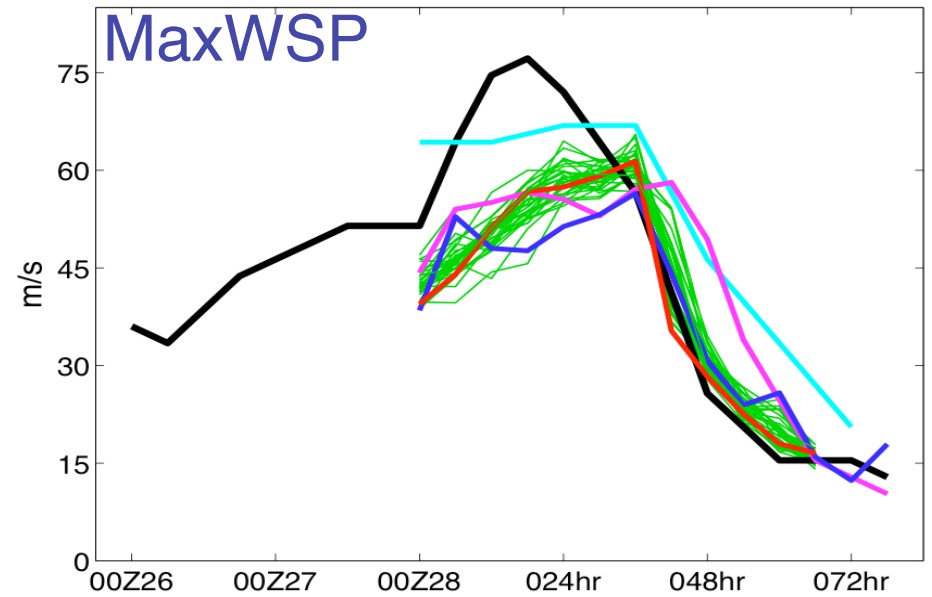


Katrina EnKF082712 minSLP
IC:12Z27; SO: 1442-2025



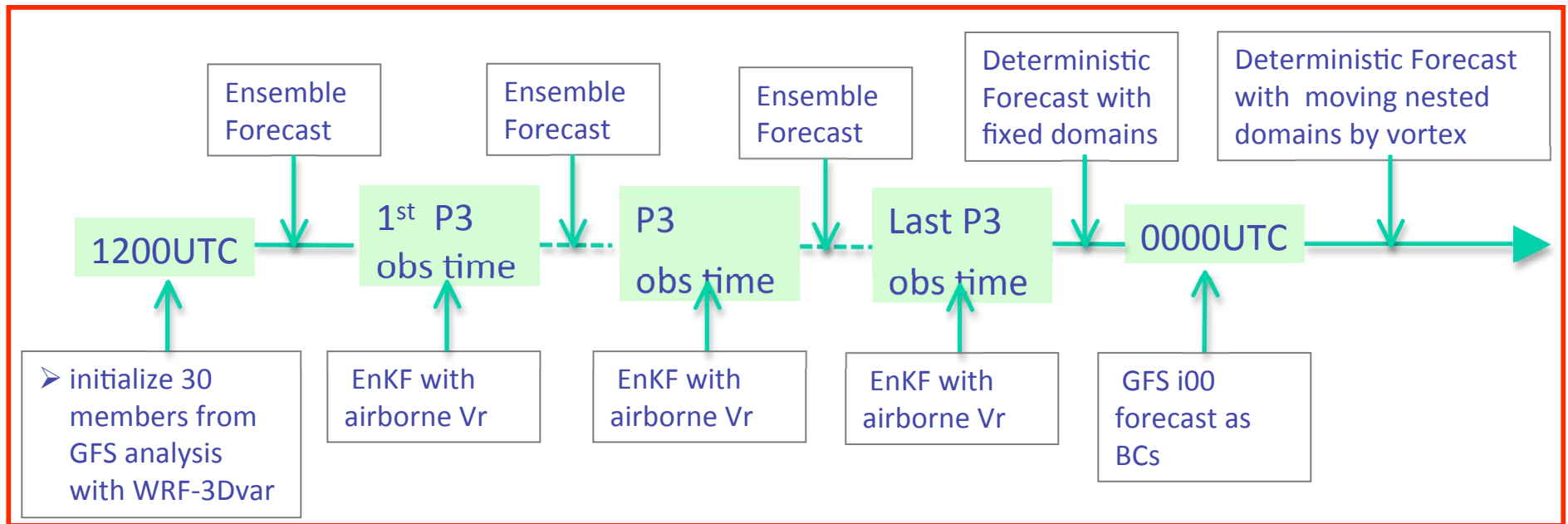
MinSLP

Katrina EnKF082712 max 10mWSP
IC:12Z27; SO: 1442-2025



MaxWSP

Assimilation and Forecasts: Work Flow and Timing for 2008/2009 Real-time Experiments



Estimated real-time WRF/ARW forecast initialized assimilating airborne Vr data

EnKF ensemble initialized with most recent available GFS: no waiting time

Quality control and super-observation (SO) of Airborne data per hour: 0.3h

Transfer airborne ~3000 SOs from P3 to TACC: 0.2h

EnKF assimilation of 1-h SOs: 0.5h

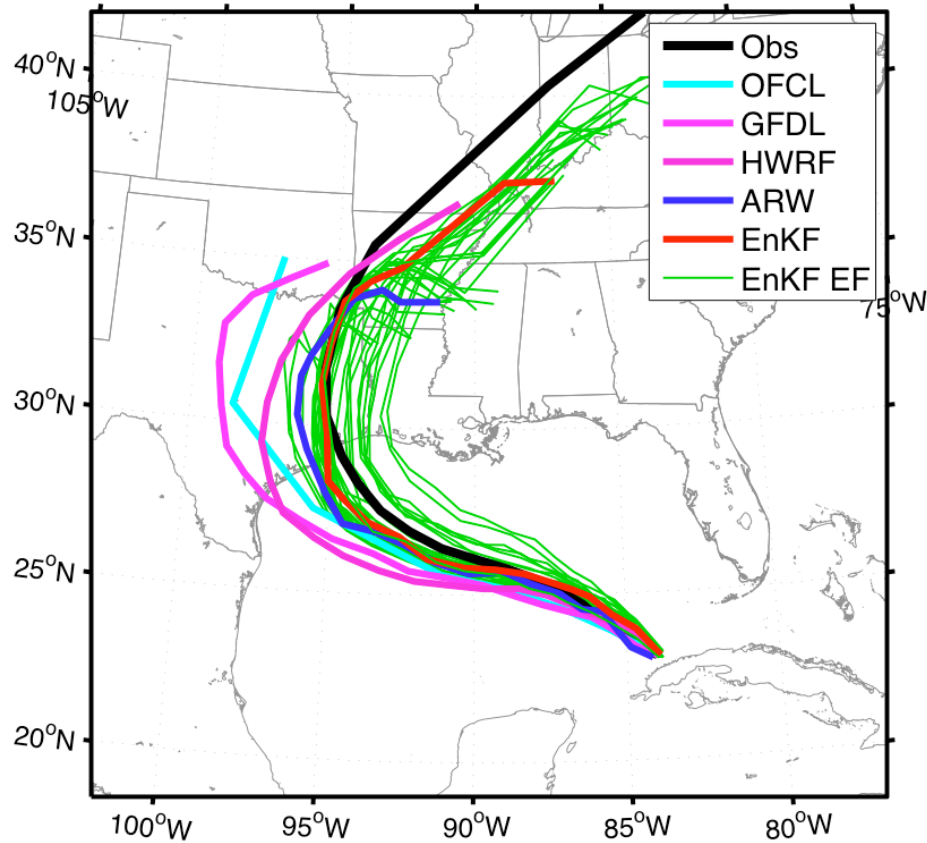
126-h WRF free forecast with 512 processors: 2.7h

Total time lapse: ~4h for 4.5km (7h for 1.5-km) after Doppler observations are taken

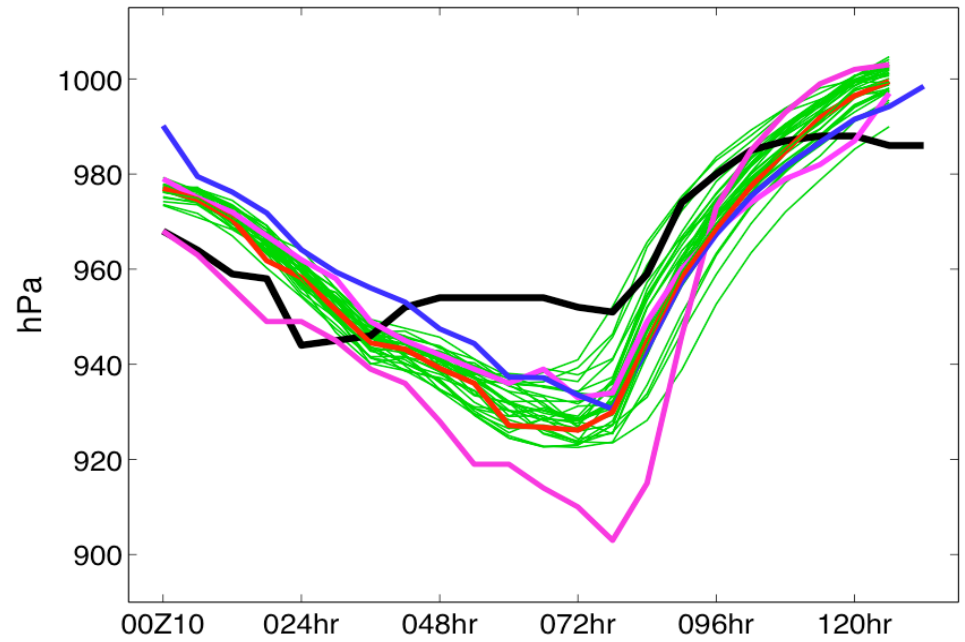
Total Ranger Service Units (SUs) occupied simultaneously: 20,000+

Hurricane IKE (2008) Realtime EnKF assimilation of airborne Doppler winds

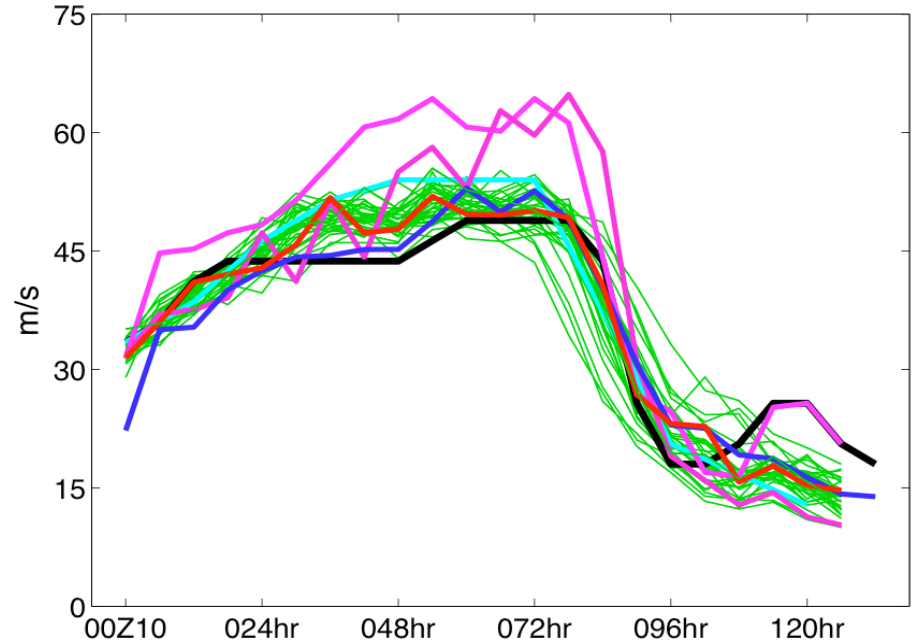
Ike EnKF090912 Track
IC:12Z09; SO: 2125-2227 & 2302-2341



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

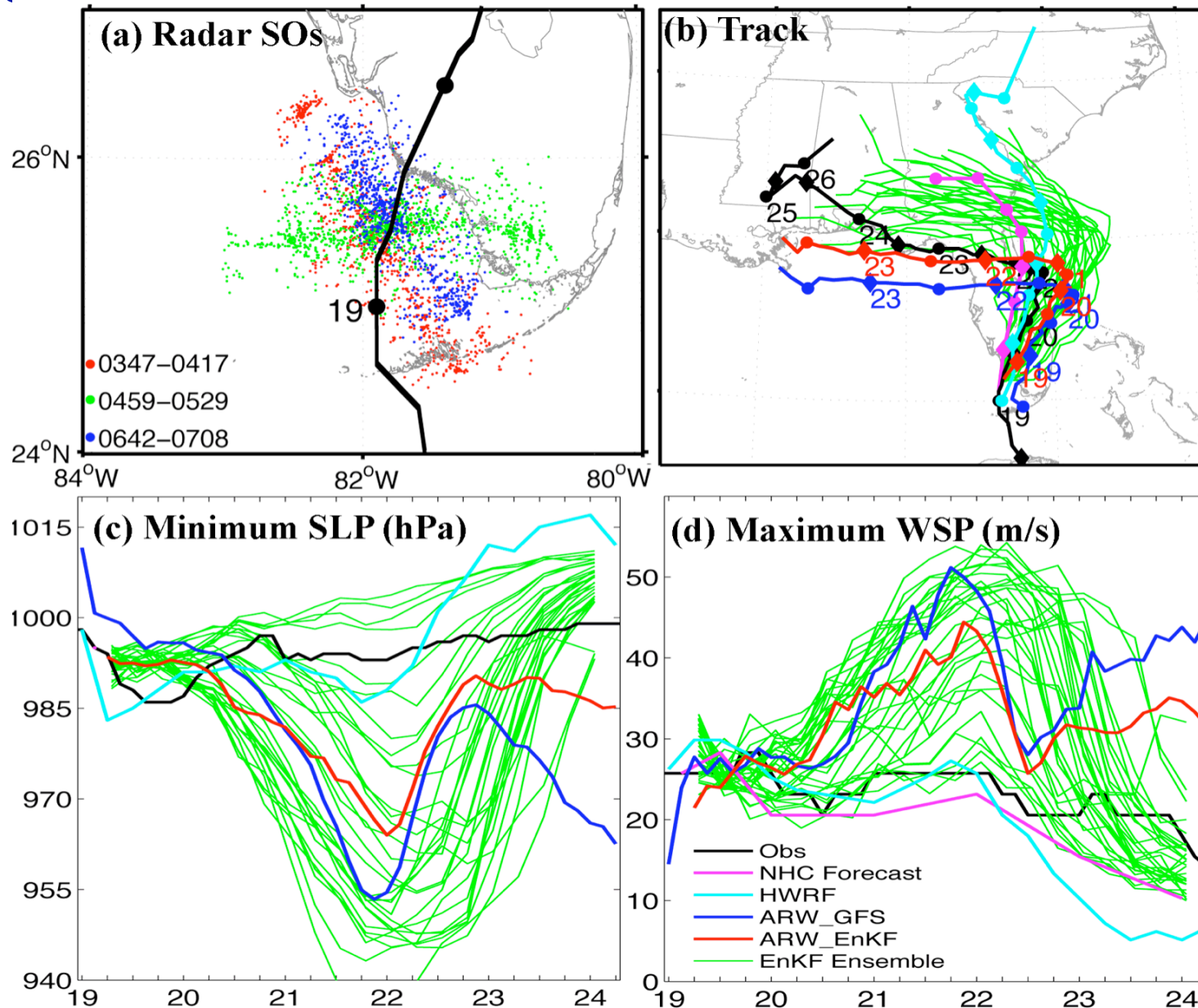


Ike EnKF090912 max 10mWSP
IC:12Z09; SO: 2125-2227 & 2302-2341

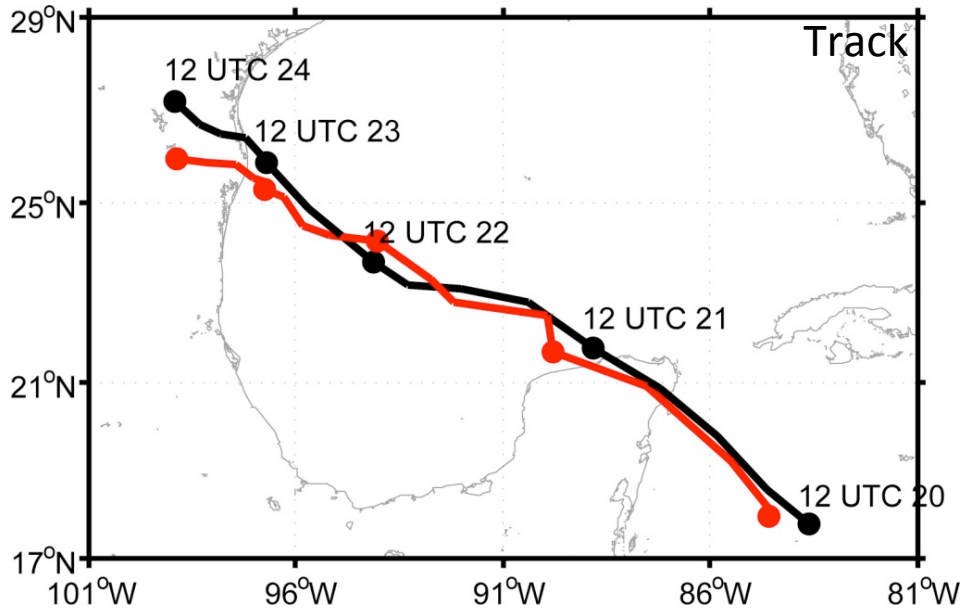


Tropical Storm Fay (2006)

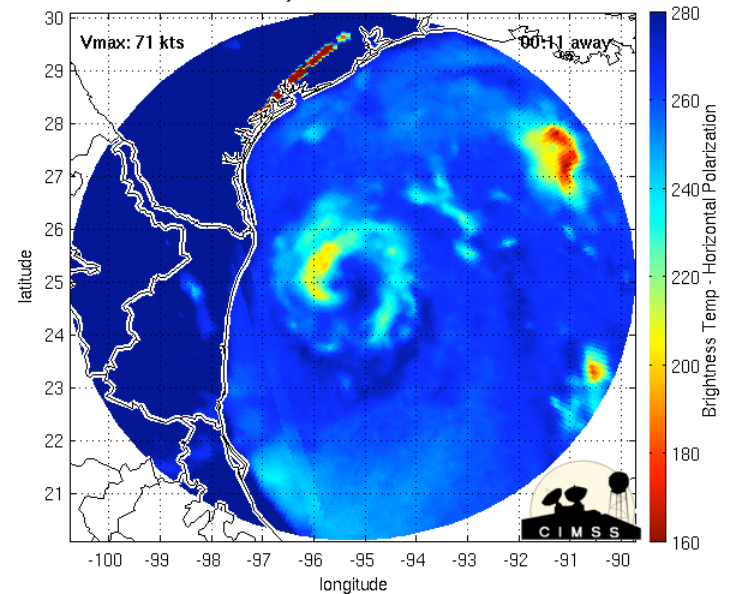
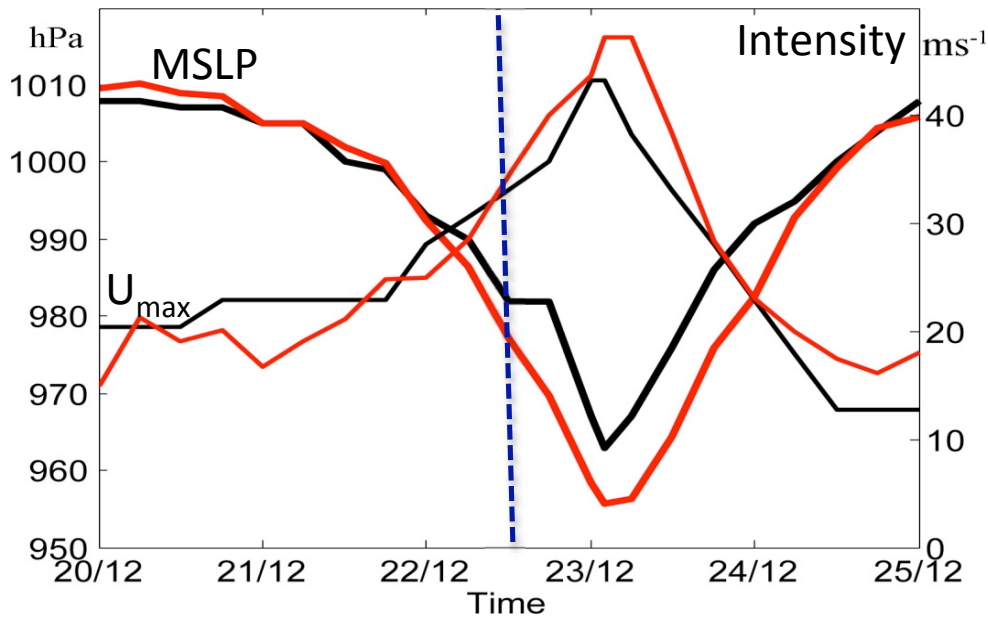
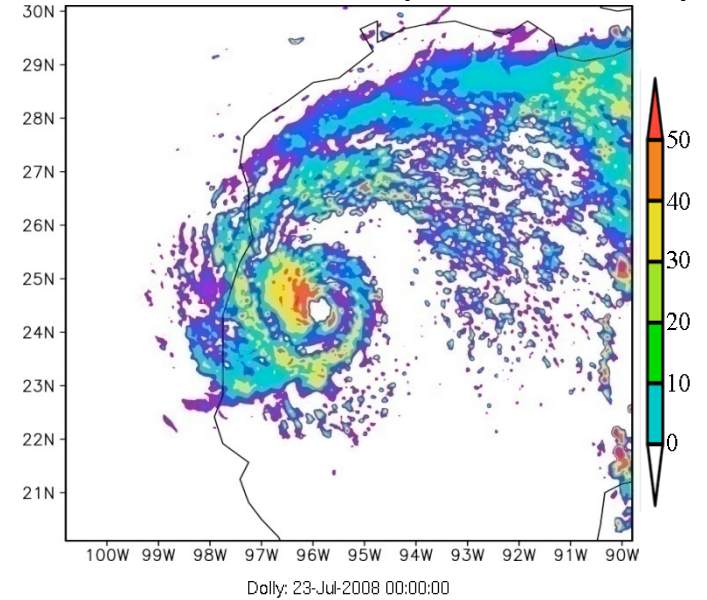
Realtime /EnKF assimilation of airborne Doppler winds



Modeled versus Observed Dolly



Model Reflectivity at 00Z 23 July



Observed brightness temperature

Easterly Wave Phase

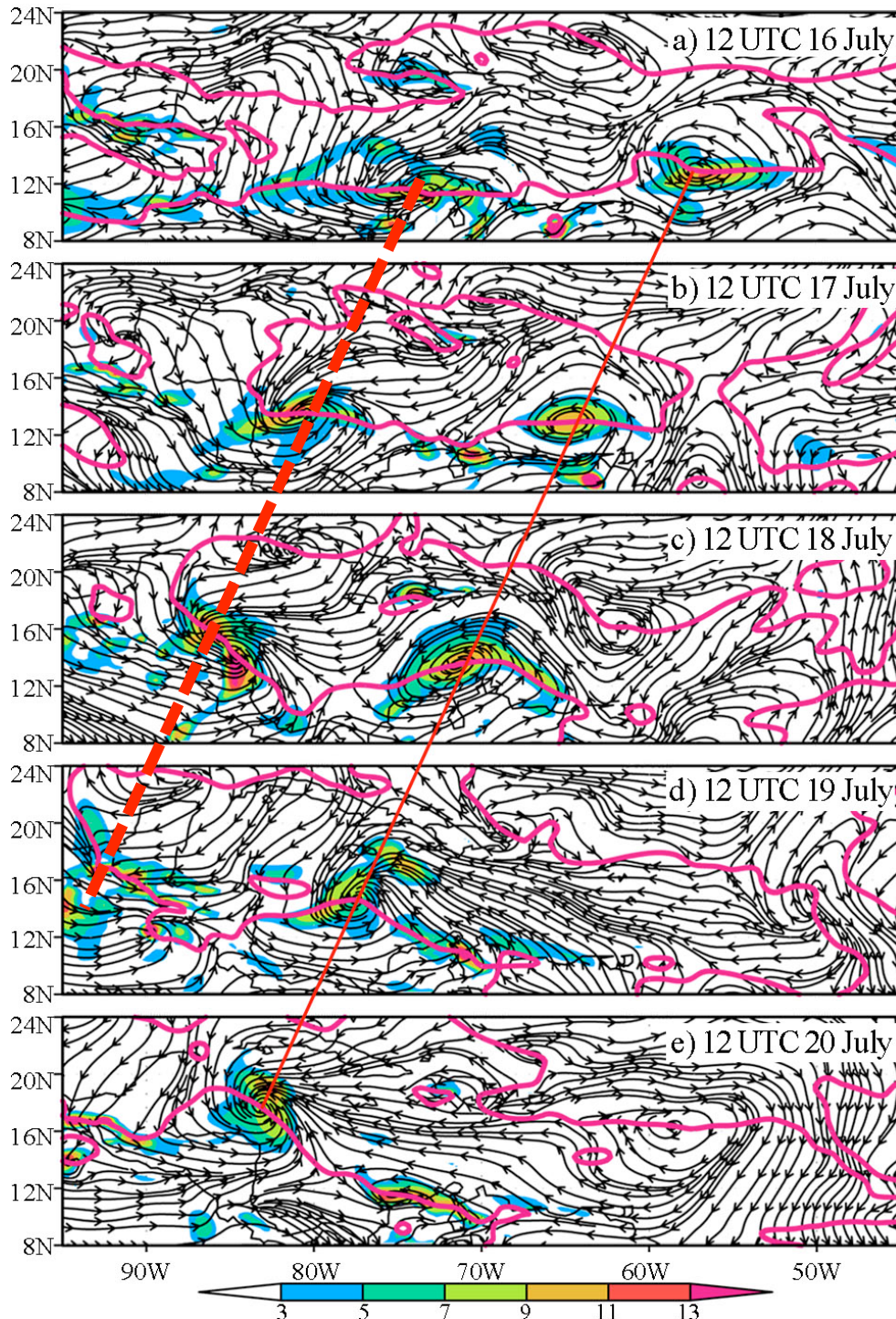
850mb GFS analysis of wave-relativestreamlines, relative vorticity and critical layer

- Easterly wave speed of -7.4m/s
- High vorticity anomaly and continuous moistening within enclosed streamlines (“pouch”; Dunkerton et al. 2008)
- A similar “pouch” preceding incipient Dolly never developed

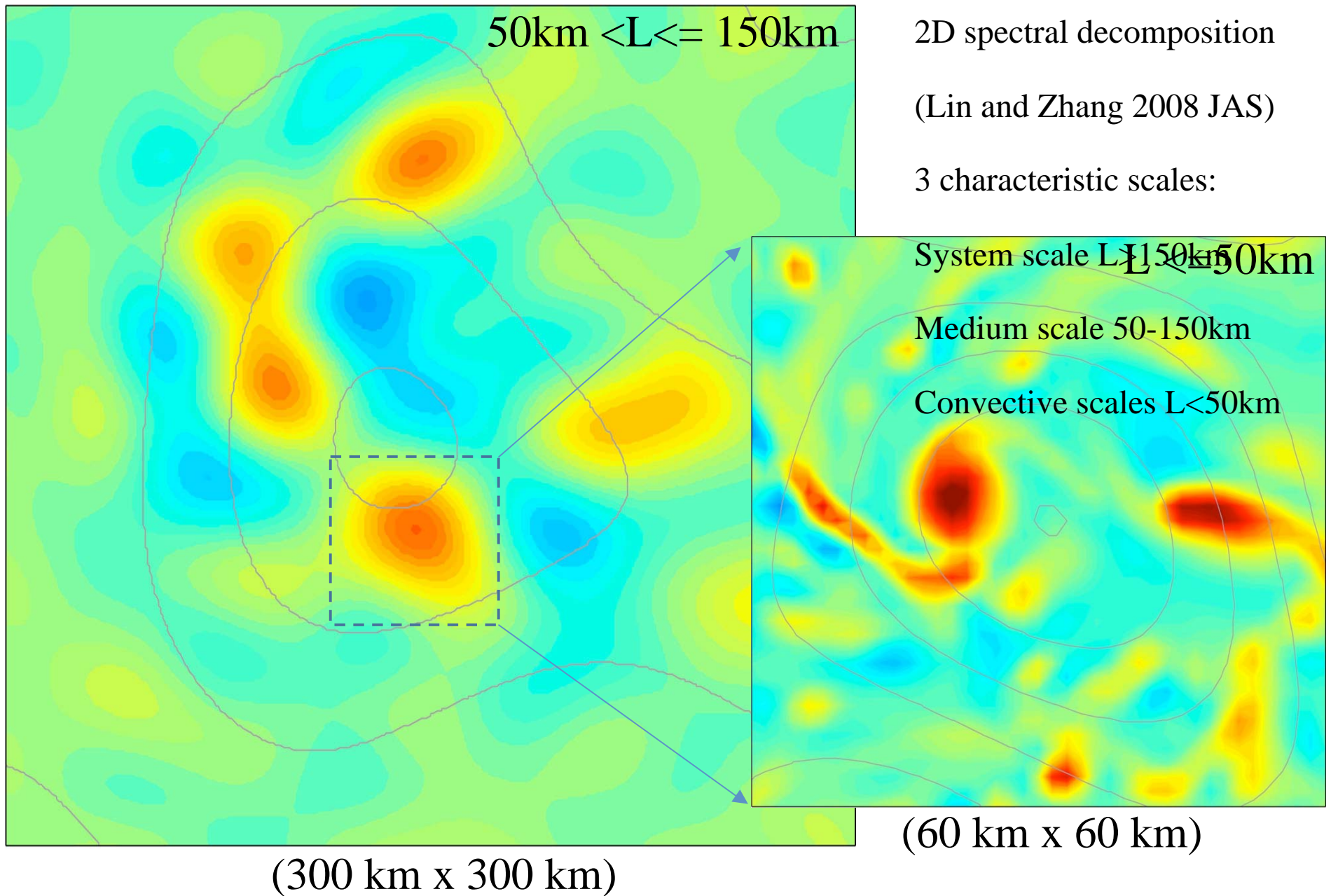
Cloud-resolving WRF simulation

(Fang and Zhang 2009 JAS)

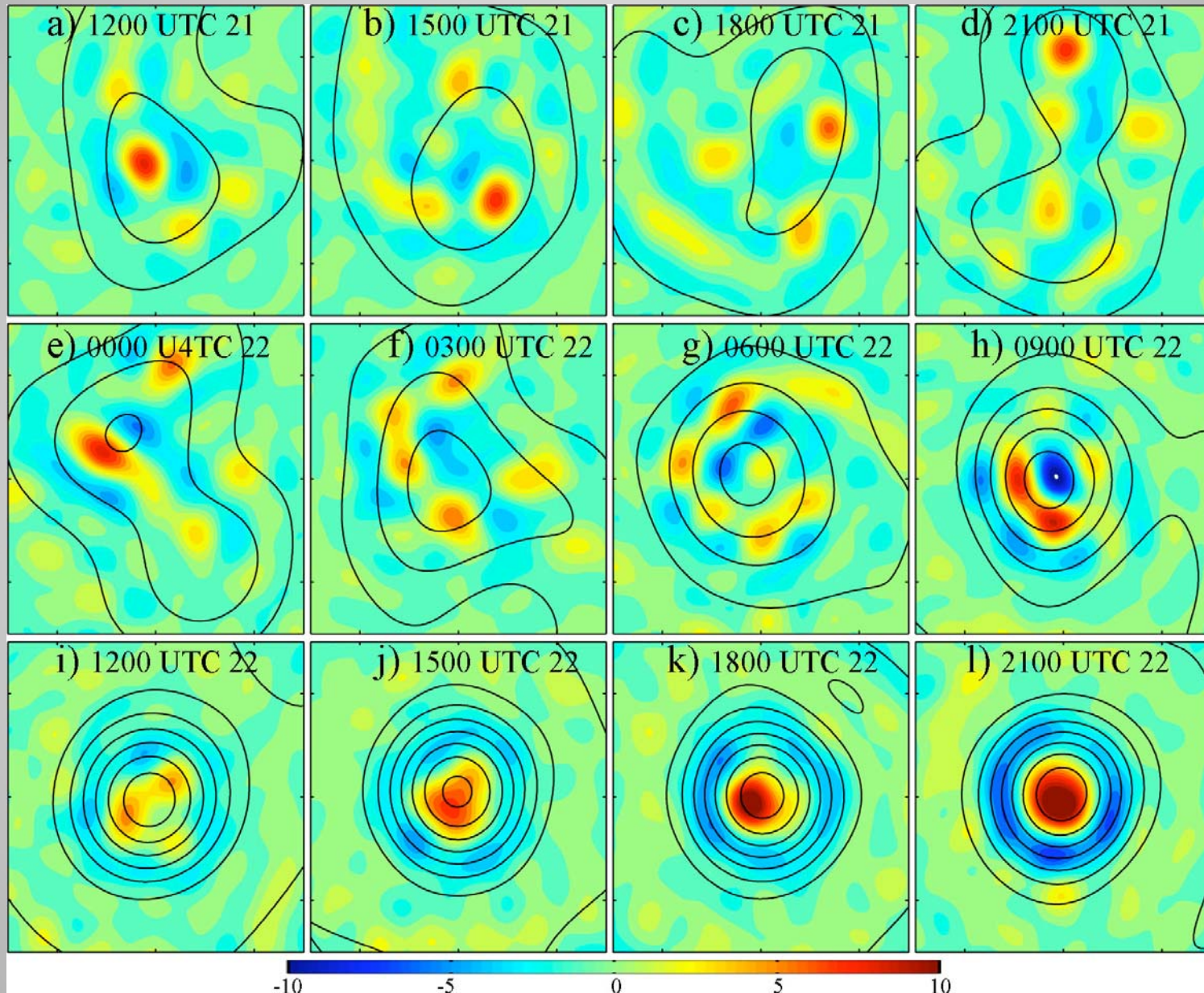
GFS as IC/BC; 3 nested domains, finest 1.5-km grid 1134x1134km



Multi-scale nature of vorticity anomalies at 39h

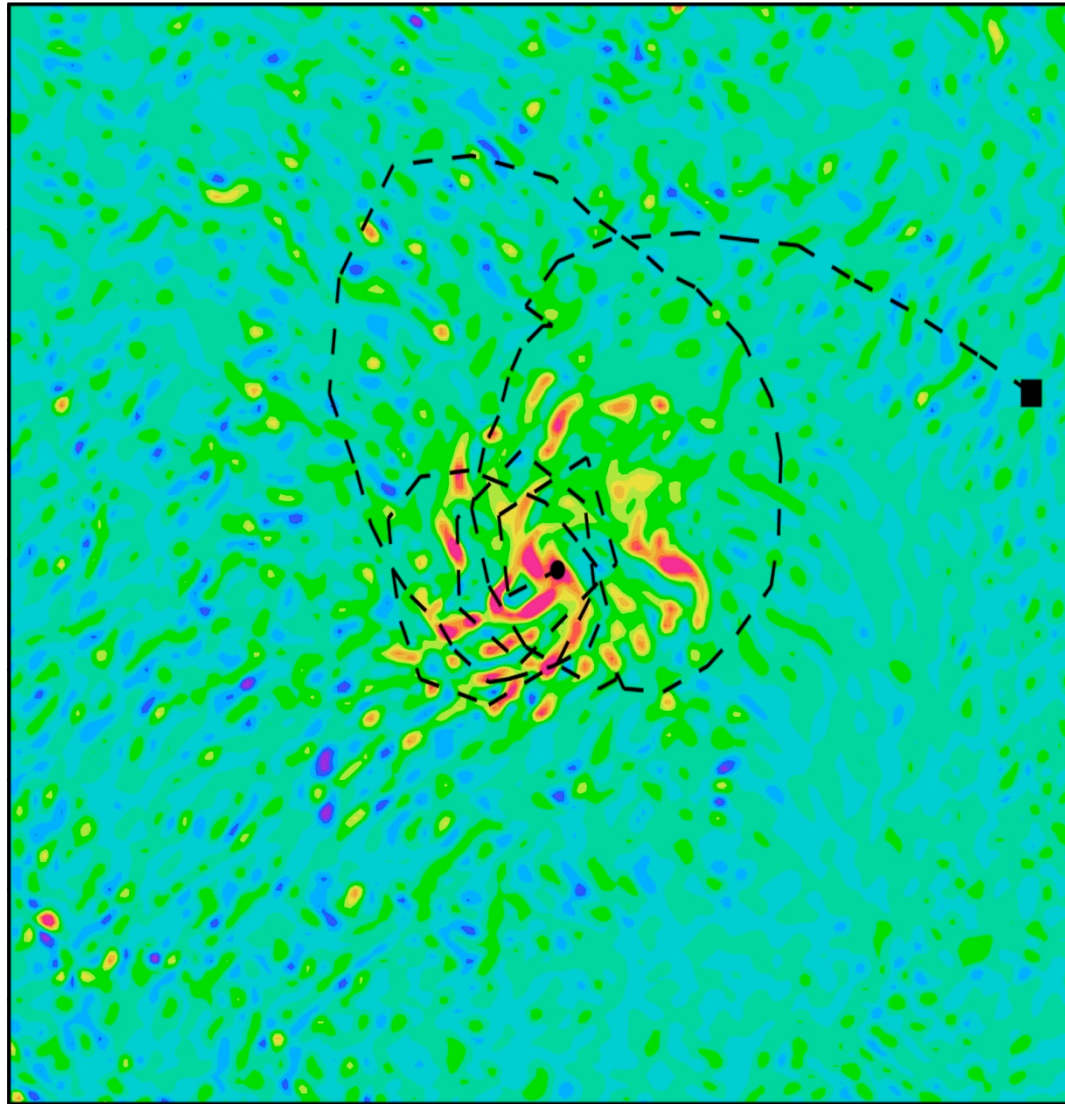


System-scale development



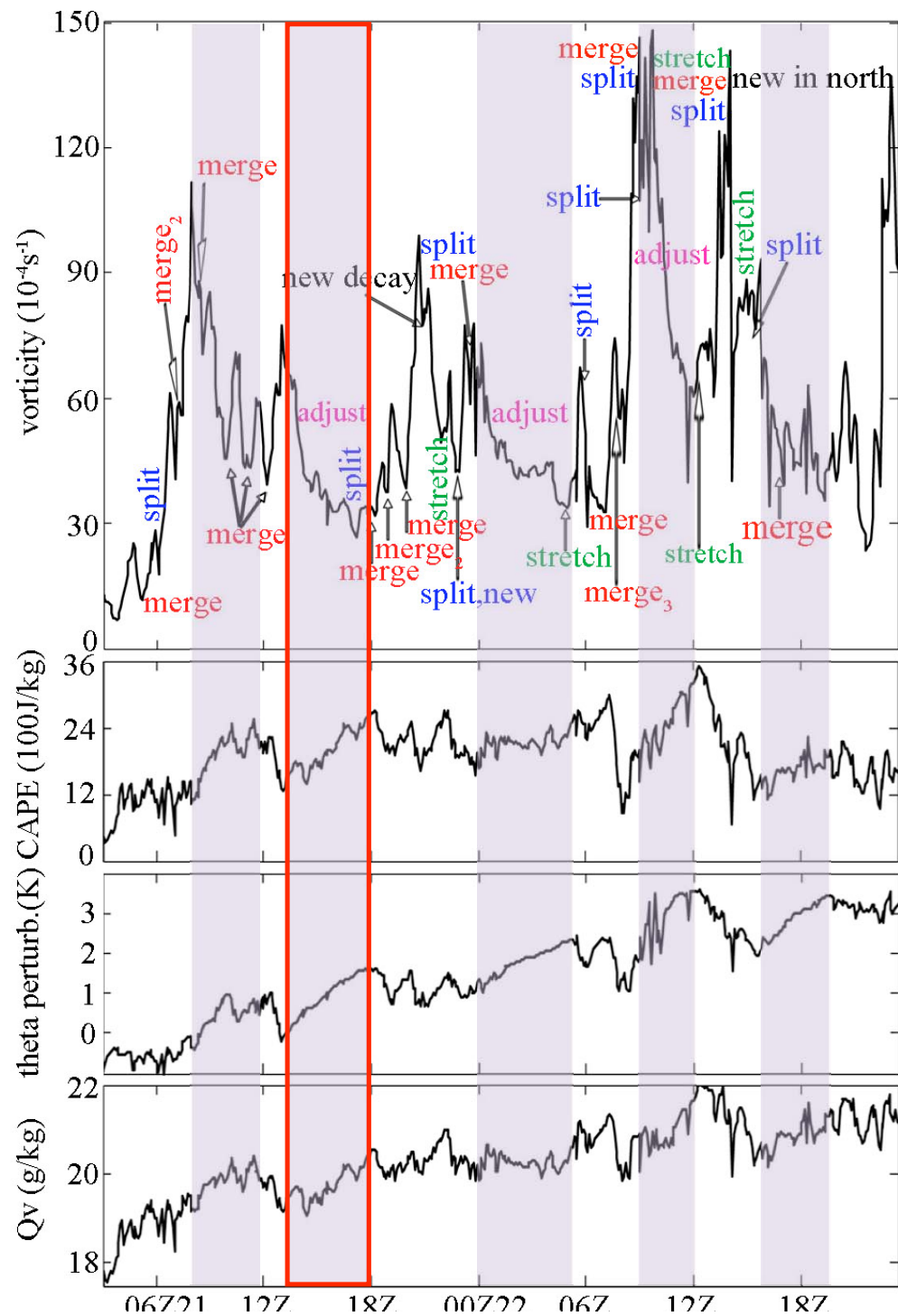
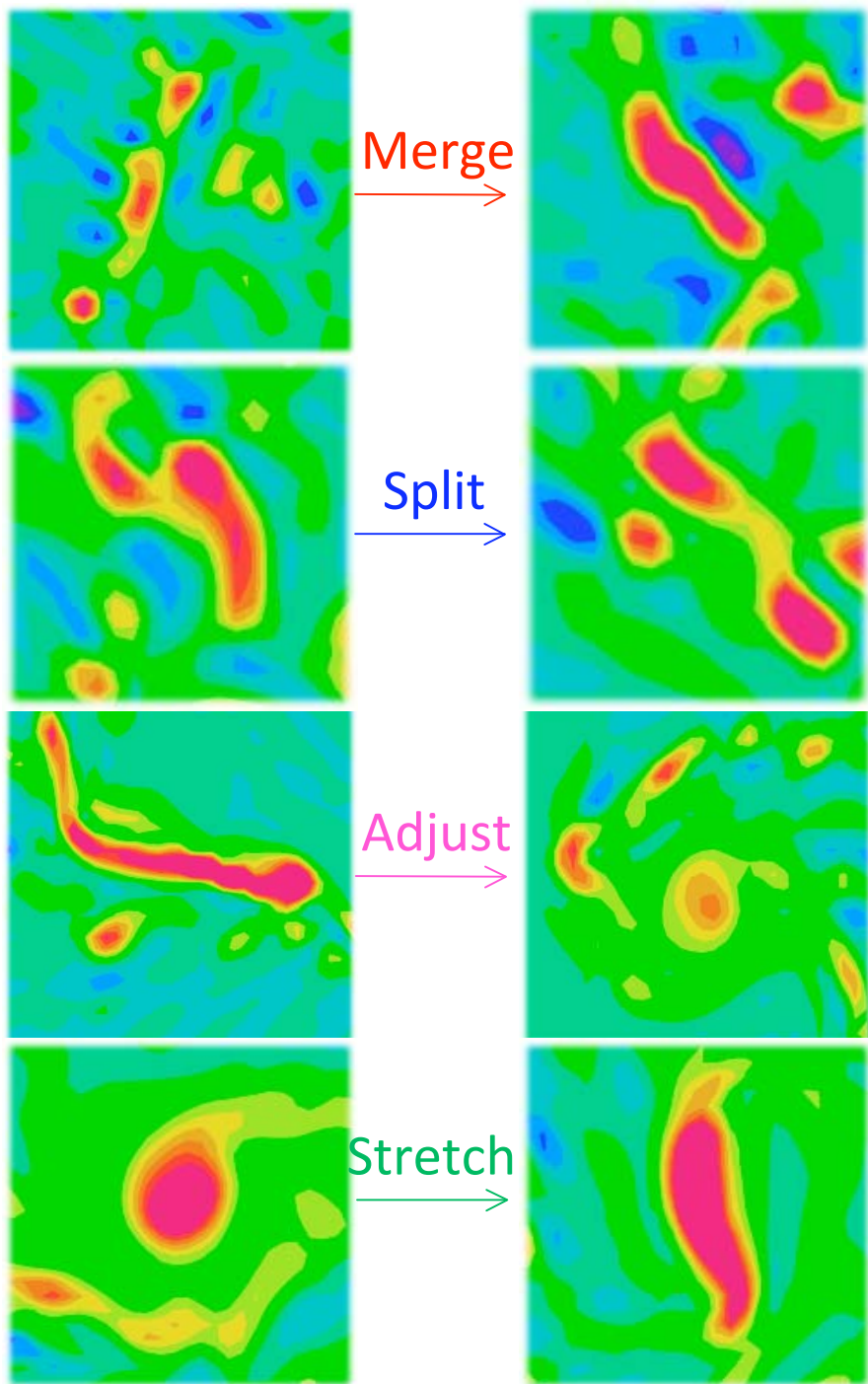
(300 km x 300 km) shading: $50 \text{ km} < L \leq 150 \text{ km}$ contours: $L > 150 \text{ km}$

Tracking of a vorticity anomaly from 39 h to 52 h

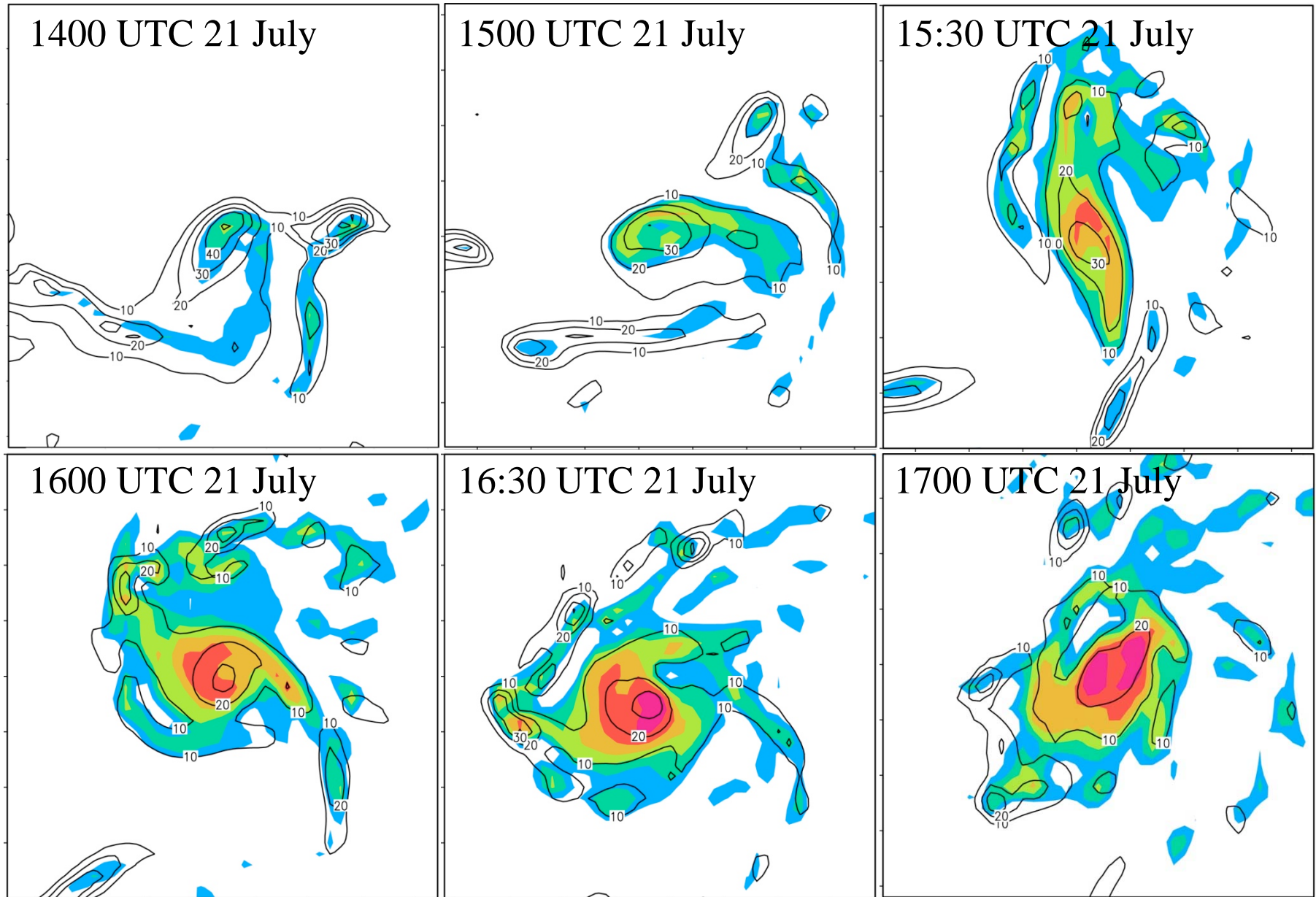


Strongest
Long lasting

(300 km x 300 km, every 5 minutes)



Vorticity (contour, 10^{-4}s^{-1}) and CAPE (shading) associated with VHT-210304



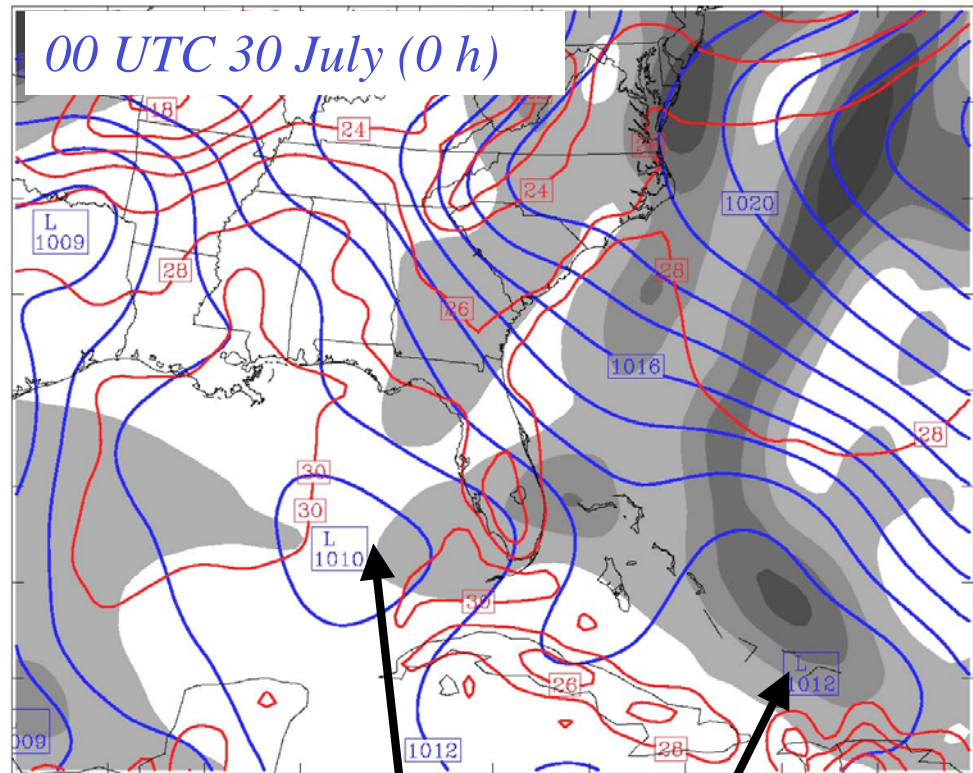
(60 km x 60 km)

1200 1400 1600 1800 2000 2200 (J/kg)

Predictability of a 2004 Gulf of Mexico Disturbance

- West-moving disturbance
- Slight intensification on 7/29
- Favorable environment (similar to that of pre-Alex)
- Forecasters thought it would be “the one” to develop
- Never attained TD status but *could've been Alex*

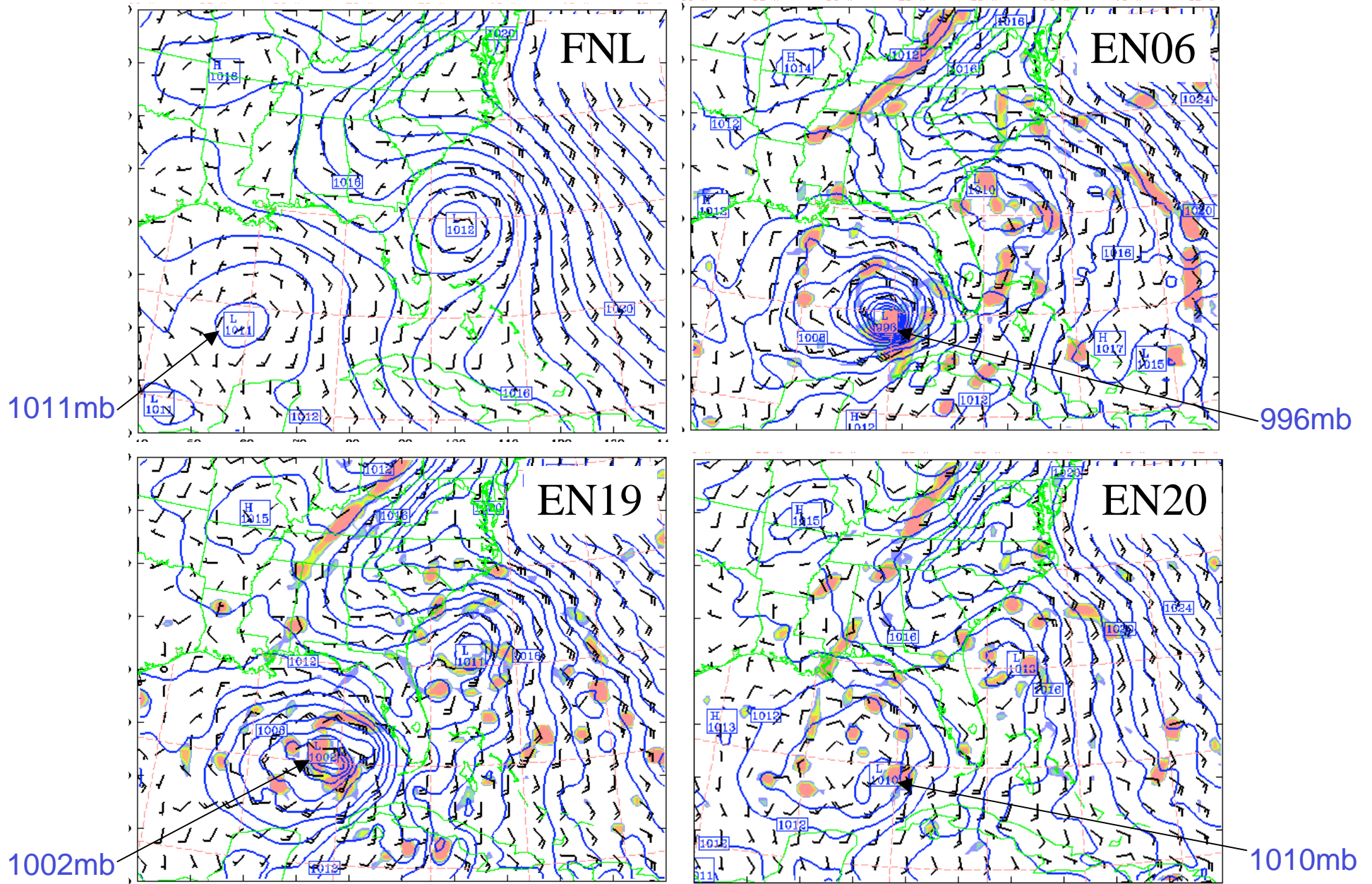
SLP, sfc T and 200hpa PV



Gulf
Low

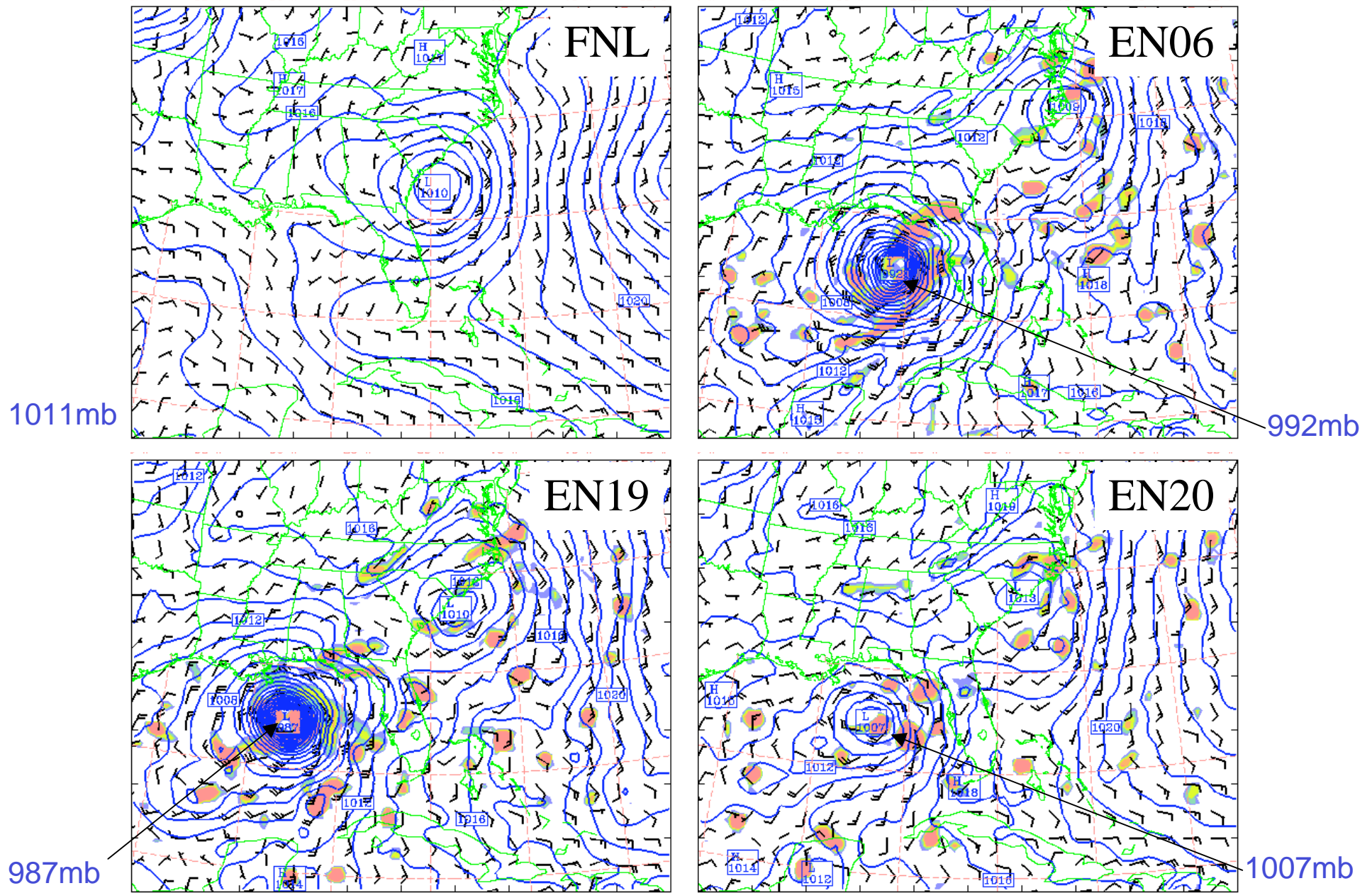
Alex

FNL analysis and ensemble members #6, 19, 20 valid at 36h



(Sippel and Zhang 2009b JAS; Zhang and Sippel 2008 JAS)

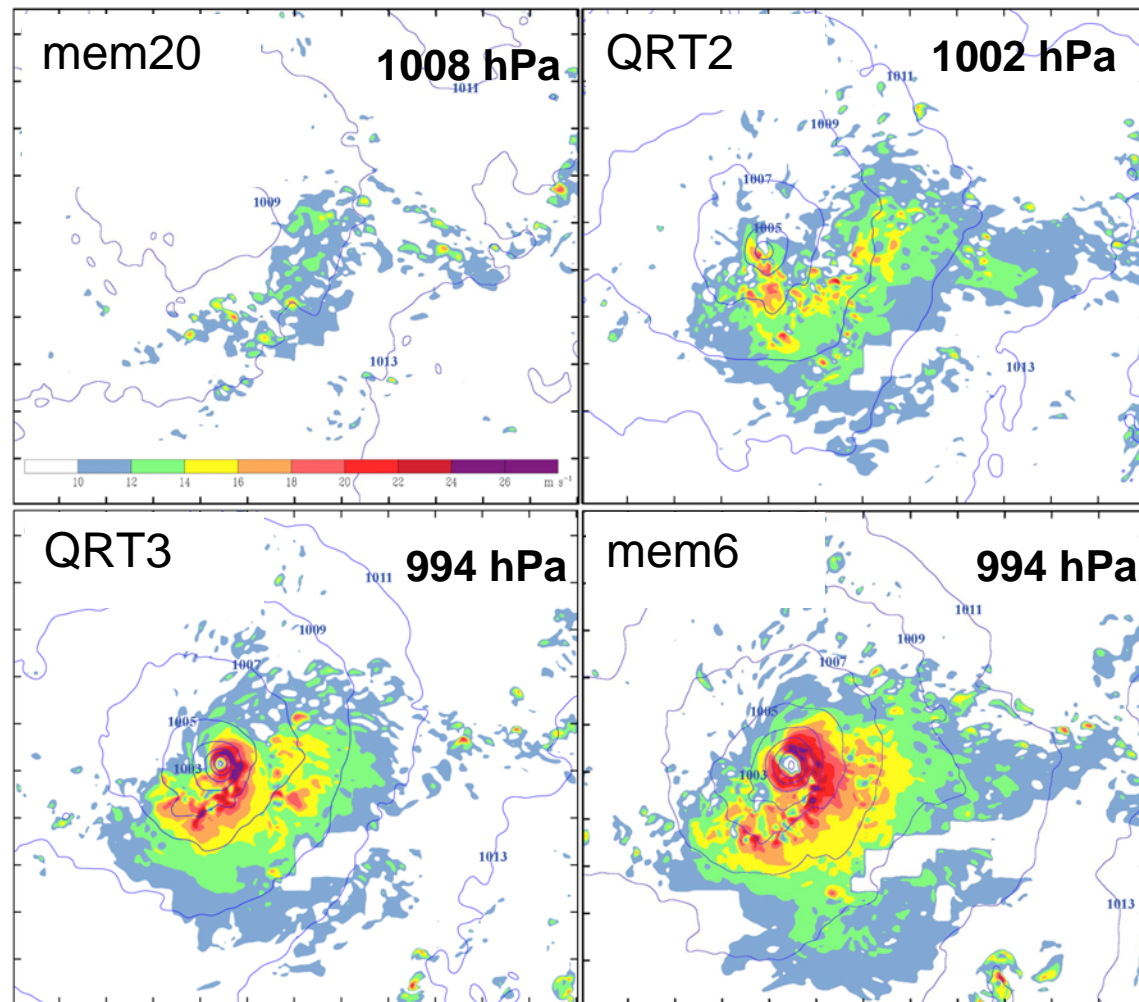
FNL analysis and members #6, 19, 20 valid at 72h



(Sippel and Zhang 2009b JAS; Zhang and Sippel 2009 JAS)

Gulf low: Sensitivity study

- **Limit of intrinsic predictability**
 - Simulated storms can be *very sensitive* to practically *immeasurable* changes in ICs

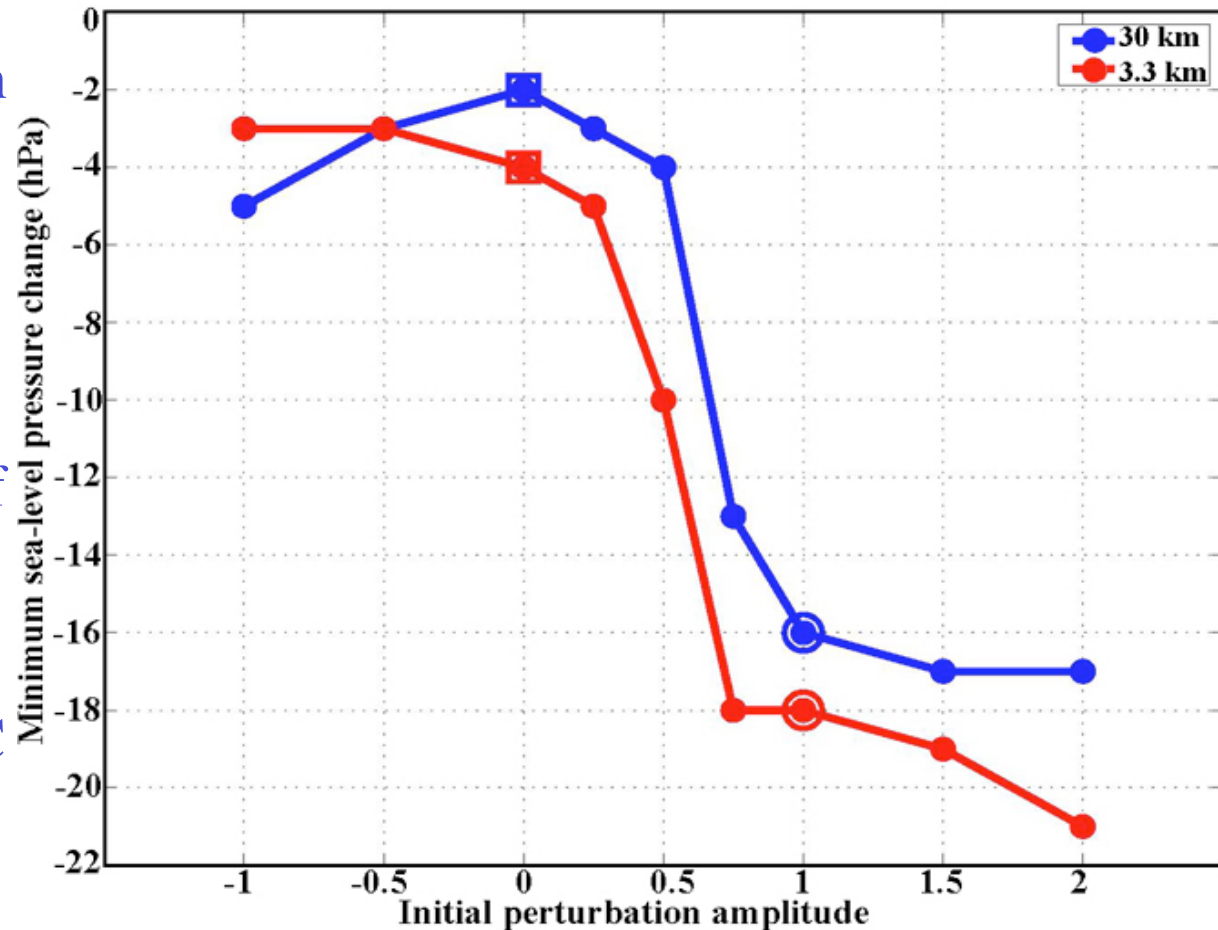


Winds every 2 m/s above 10 m/s; Pressure every 10 hPa

(Zhang & Sippel 2009, JAS)

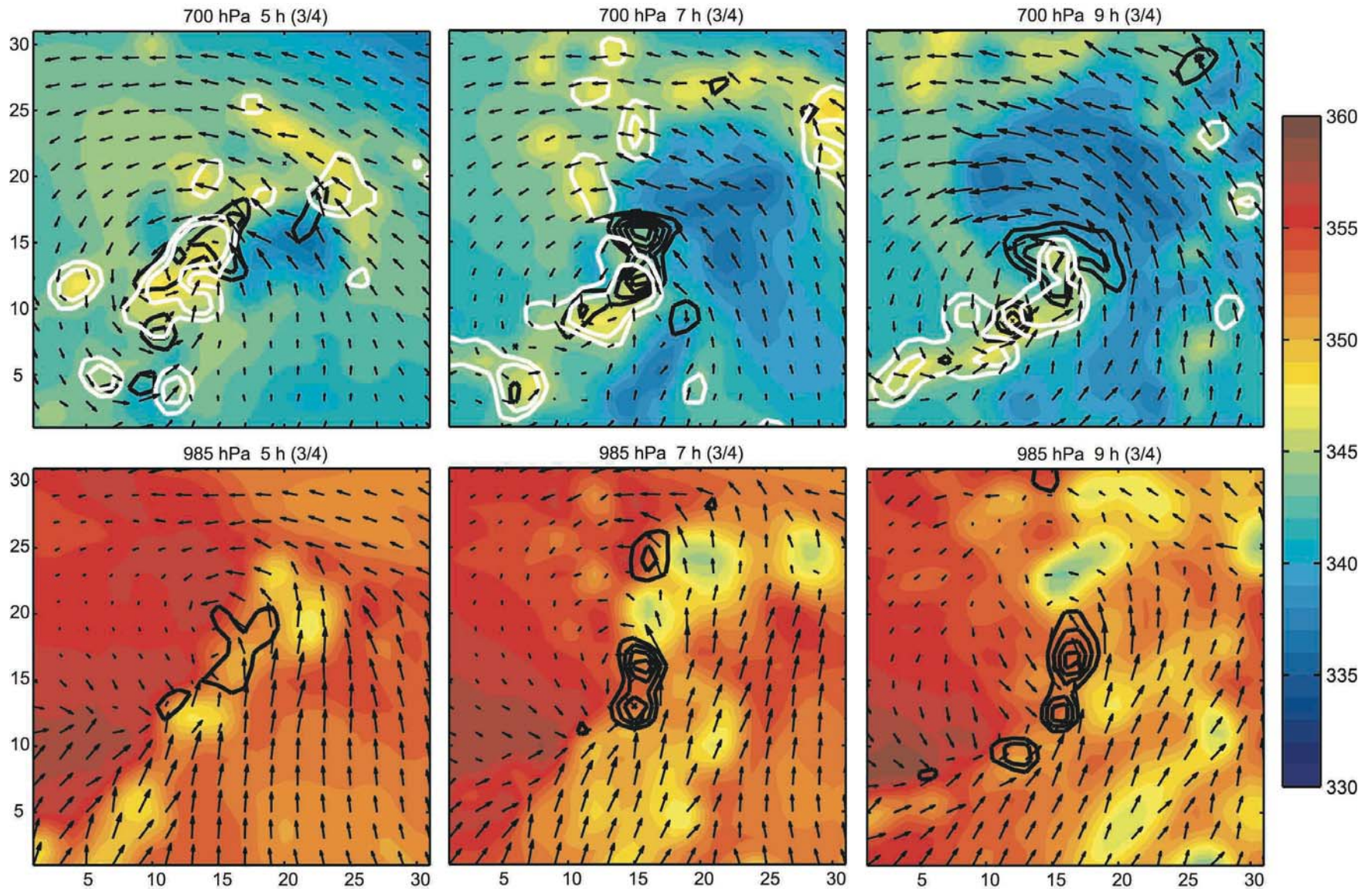
Gulf low: Limit of Intrinsic Predictability

- Simulated storms can be *very sensitive* to *immeasurable* changes in ICs
- How do previous findings on impact of moist convection manifest themselves to result in large responses to small IC differences?



Sensitivity of 36-h MSLP change forecast to IC differences by linearly rescaling the initial difference between ensemble members #20 (0) and #6 (1)

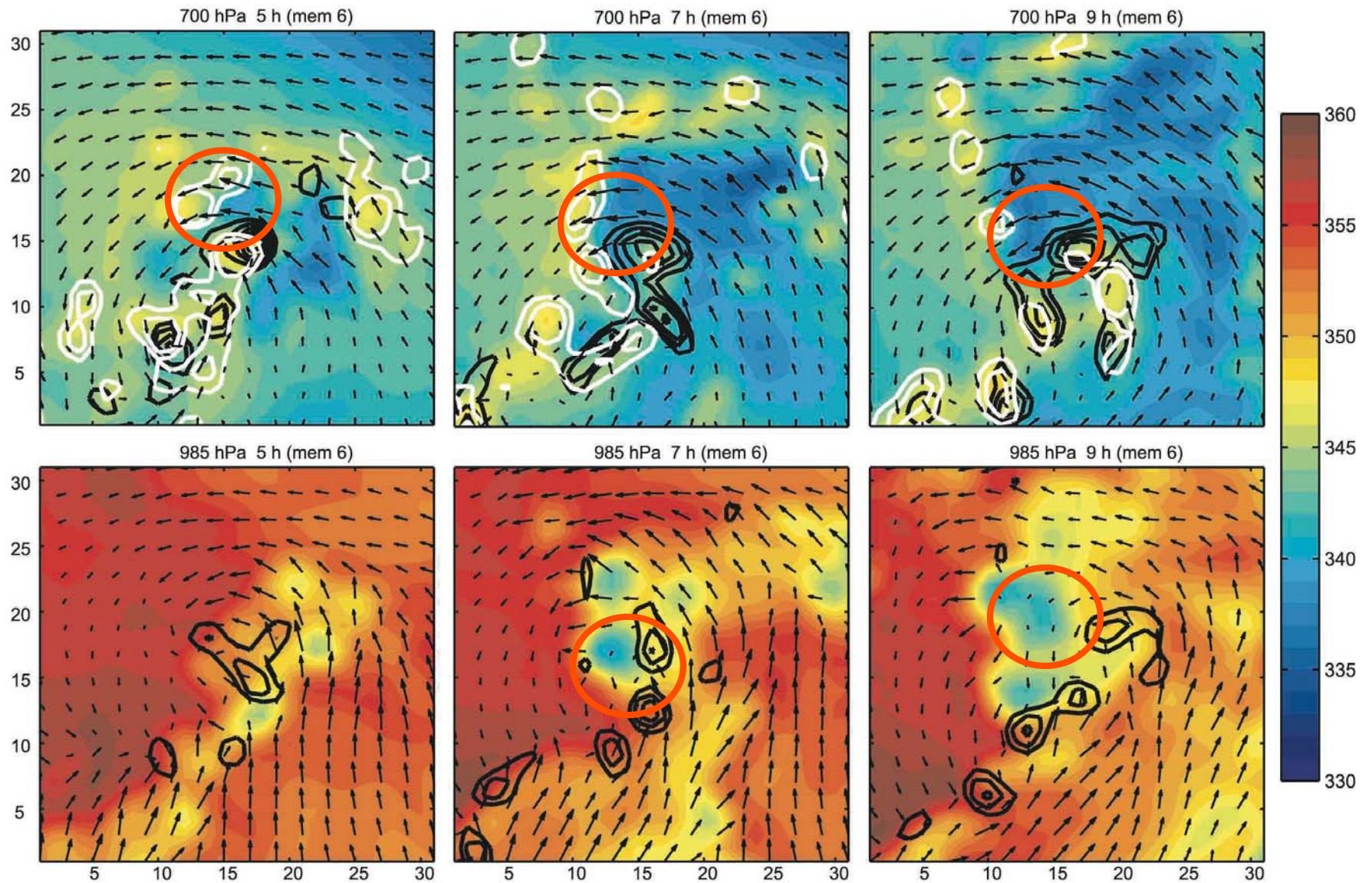
Gulf low: Cold pool interaction with VHTs -EXP(3/4)



Color: θ_e Black Contour: vorticity (every $.00025 \text{ s}^{-1}$) White Contour: w (every 0.5 m/s)

(Zhang and Sippel 2009 JAS)

Gulf low: Cold pool interaction with VHTs - #6(1)



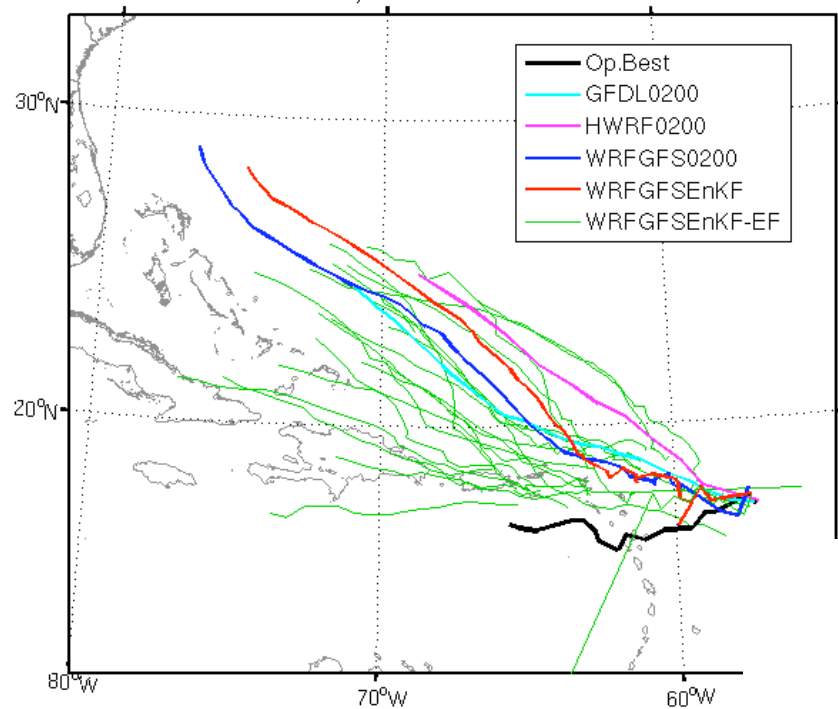
Color: θ_e

Black Contour: vorticity (every $.00025 \text{ s}^{-1}$)

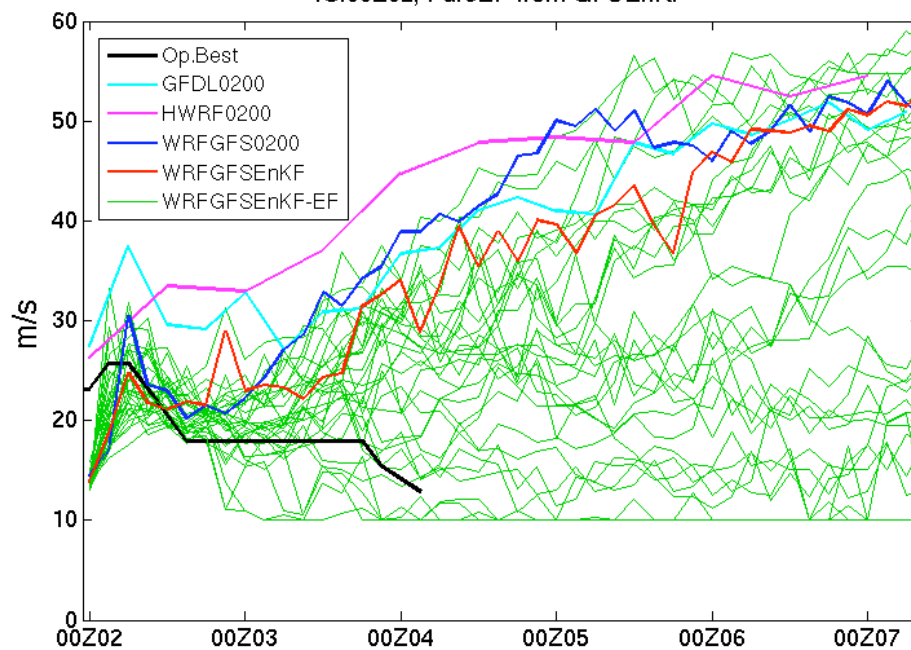
White Contour: w (every 0.5 m/s)

(Zhang and Sippel 2009 JAS)

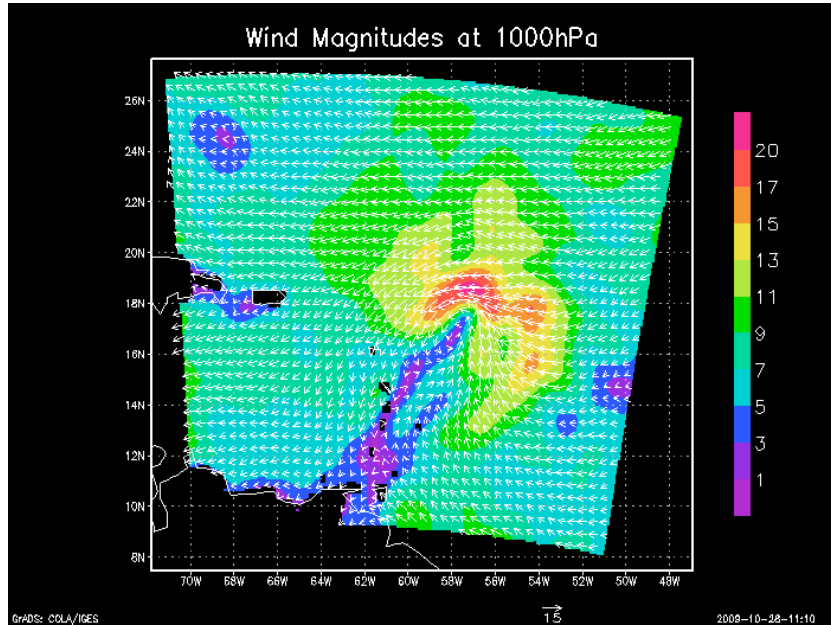
Erika 09090200 Track and EnKF DF wind swath
IC:00Z02; PureEF from GFSEnKF



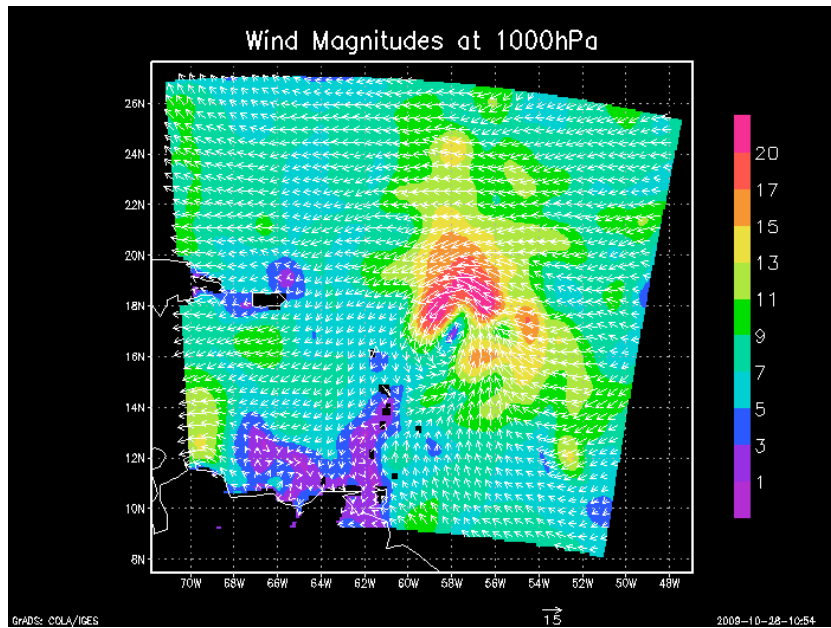
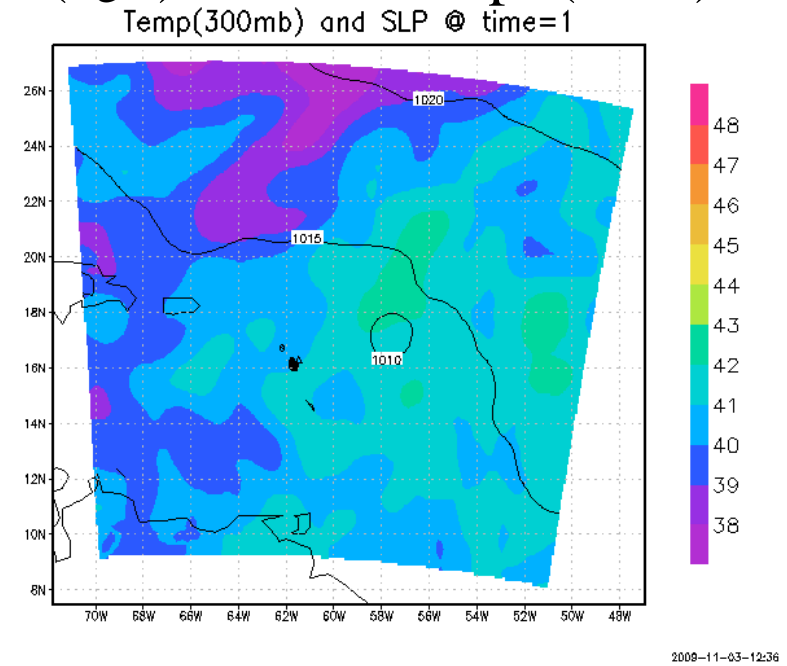
Erika 09090200 max 10m WSP
IC:00Z02; PureEF from GFSEnKF



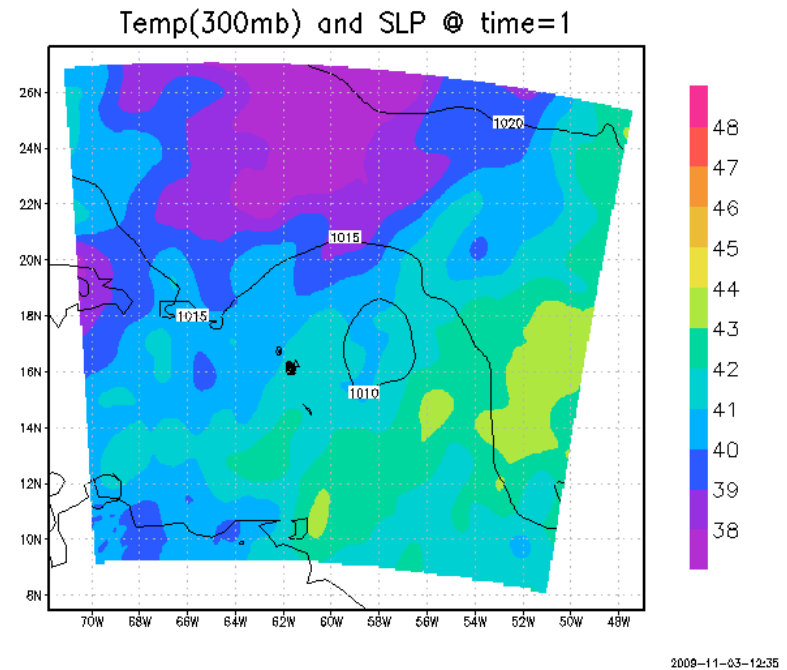
Surface winds (left) and 300mb temperature (right) at 00Z 2 Sept (t=0h)



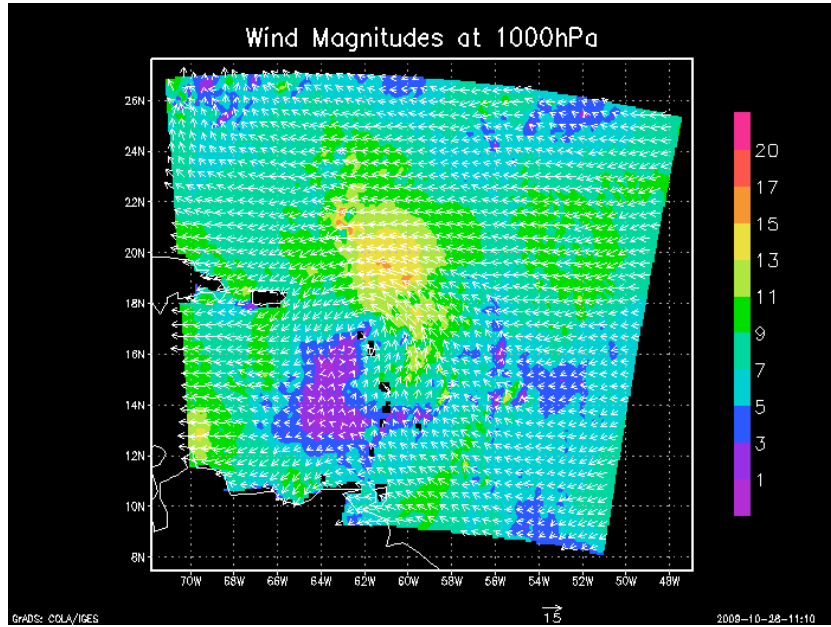
Ensemble member 38



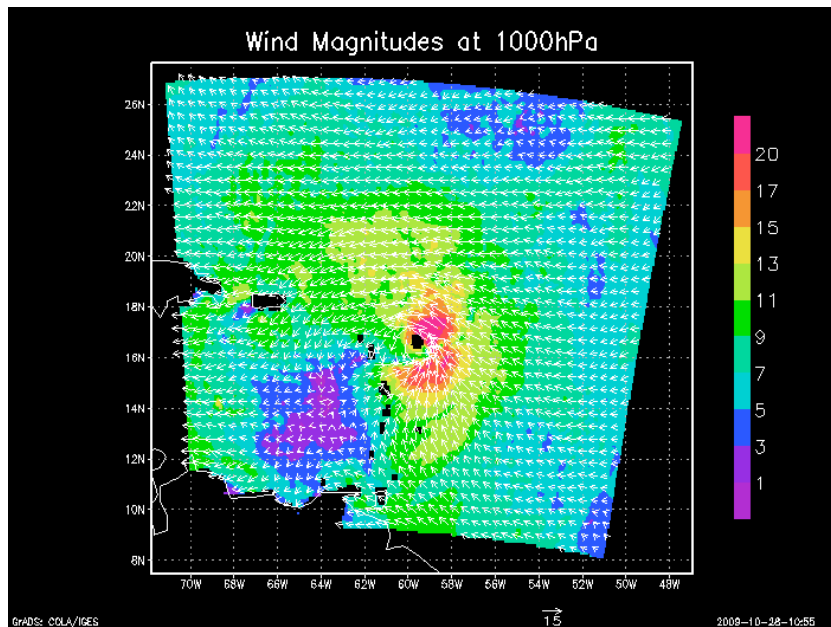
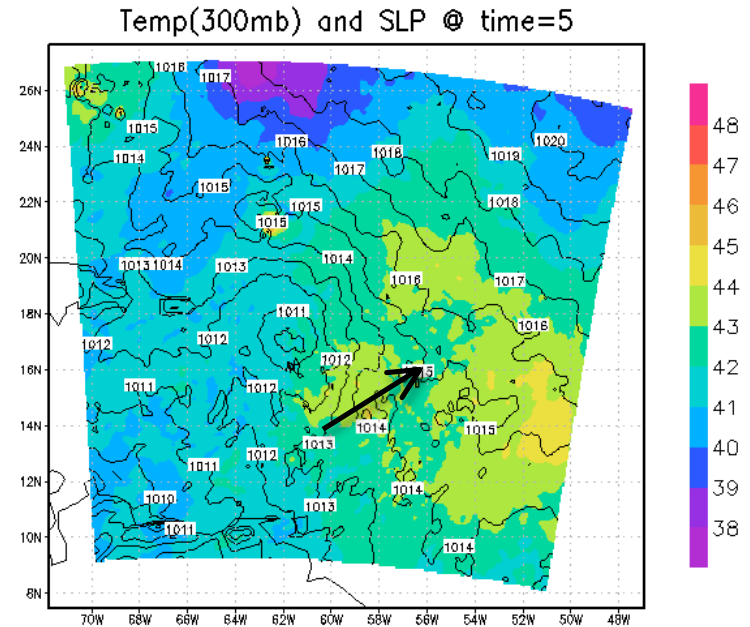
Ensemble member 26



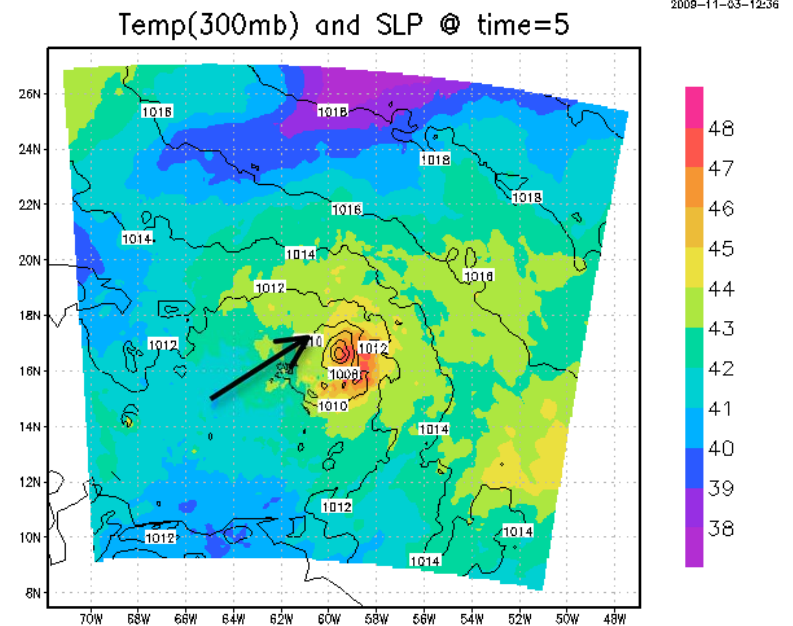
Surface winds (left) and 300mb temperature (right) at t=24h forecast time



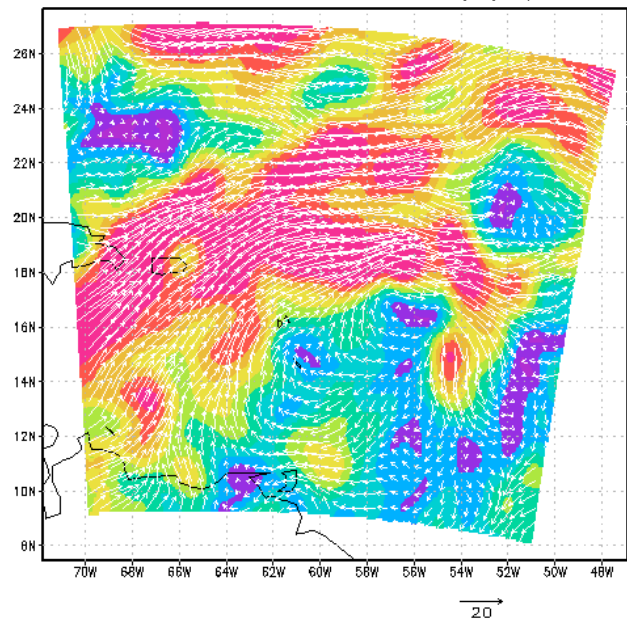
38 - Good



26 - Bad

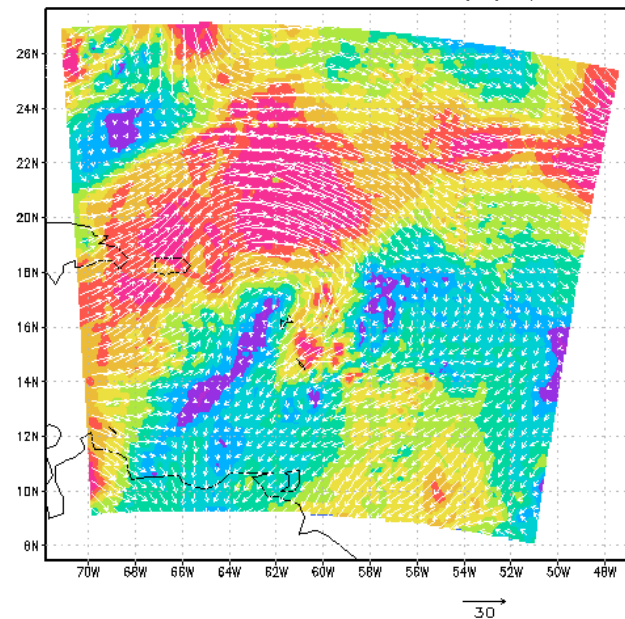


Mem38d2 300-850 mb Shear (m/s) @ t=1



GRADS: COLA/IGES

Mem38d2 300-850 mb Shear (m/s) @ t=5

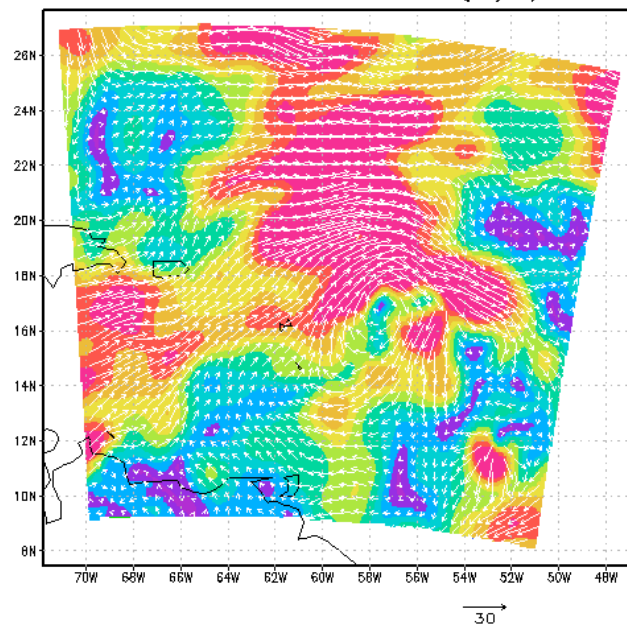


2009-11-03-14:12

GRADS: COLA/IGES

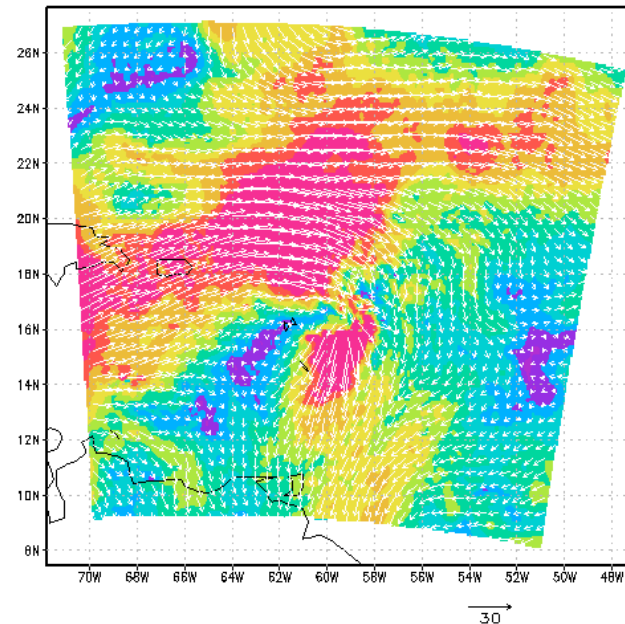
2009-11-03-14:12

Mem26d2 300-850 mb Shear (m/s) @ t=1



GRADS: COLA/IGES

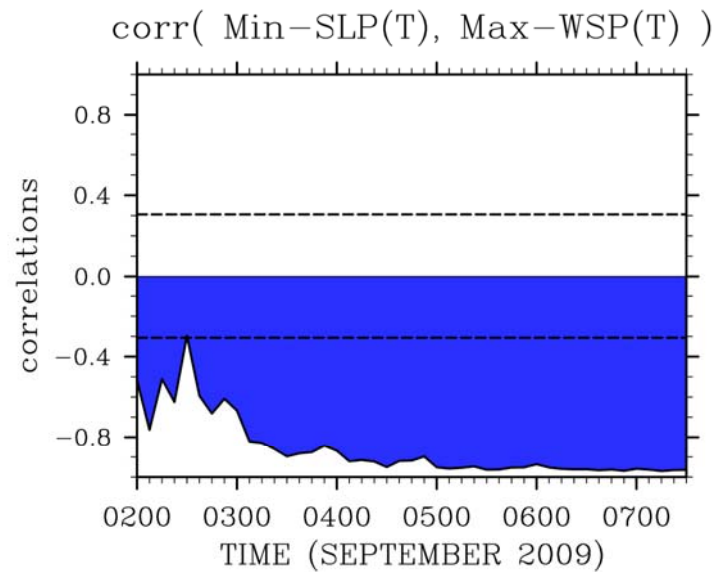
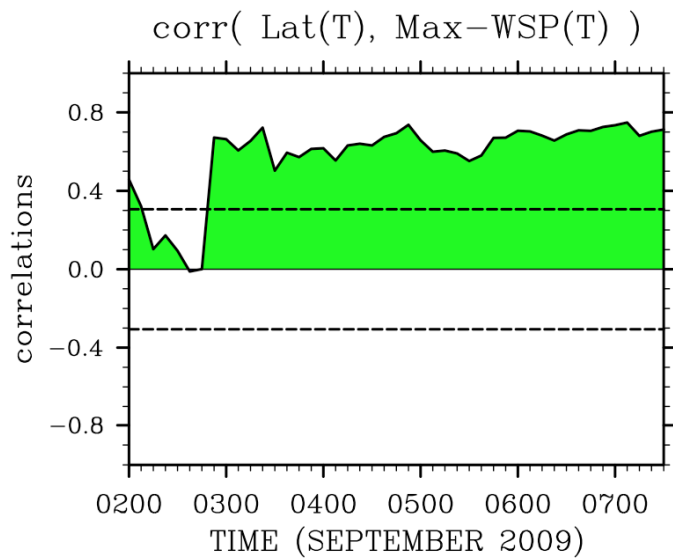
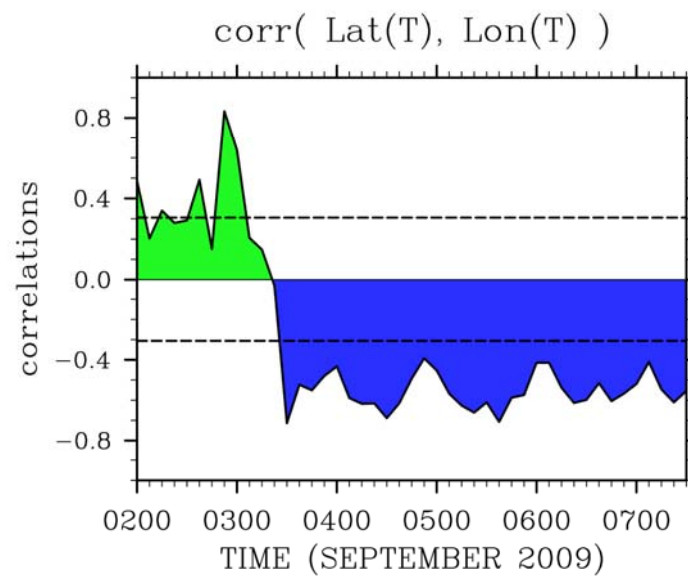
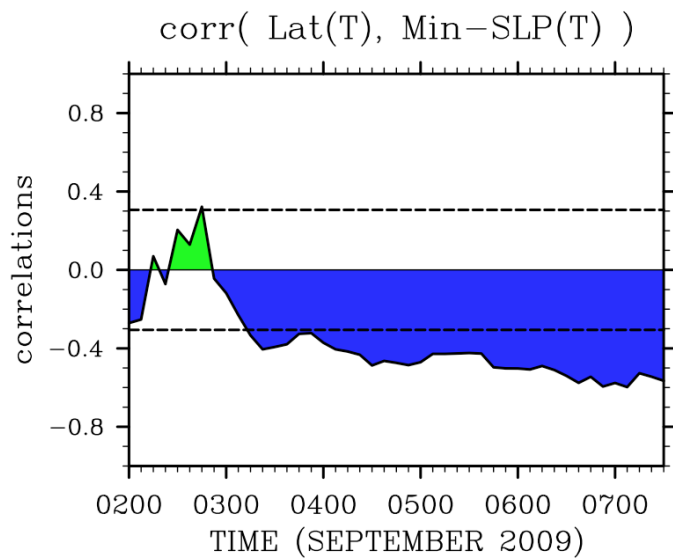
Mem26d2 300-850 mb Shear (m/s) @ t=5



2009-11-03-14:10

GRADS: COLA/IGES

2009-11-03-14:10



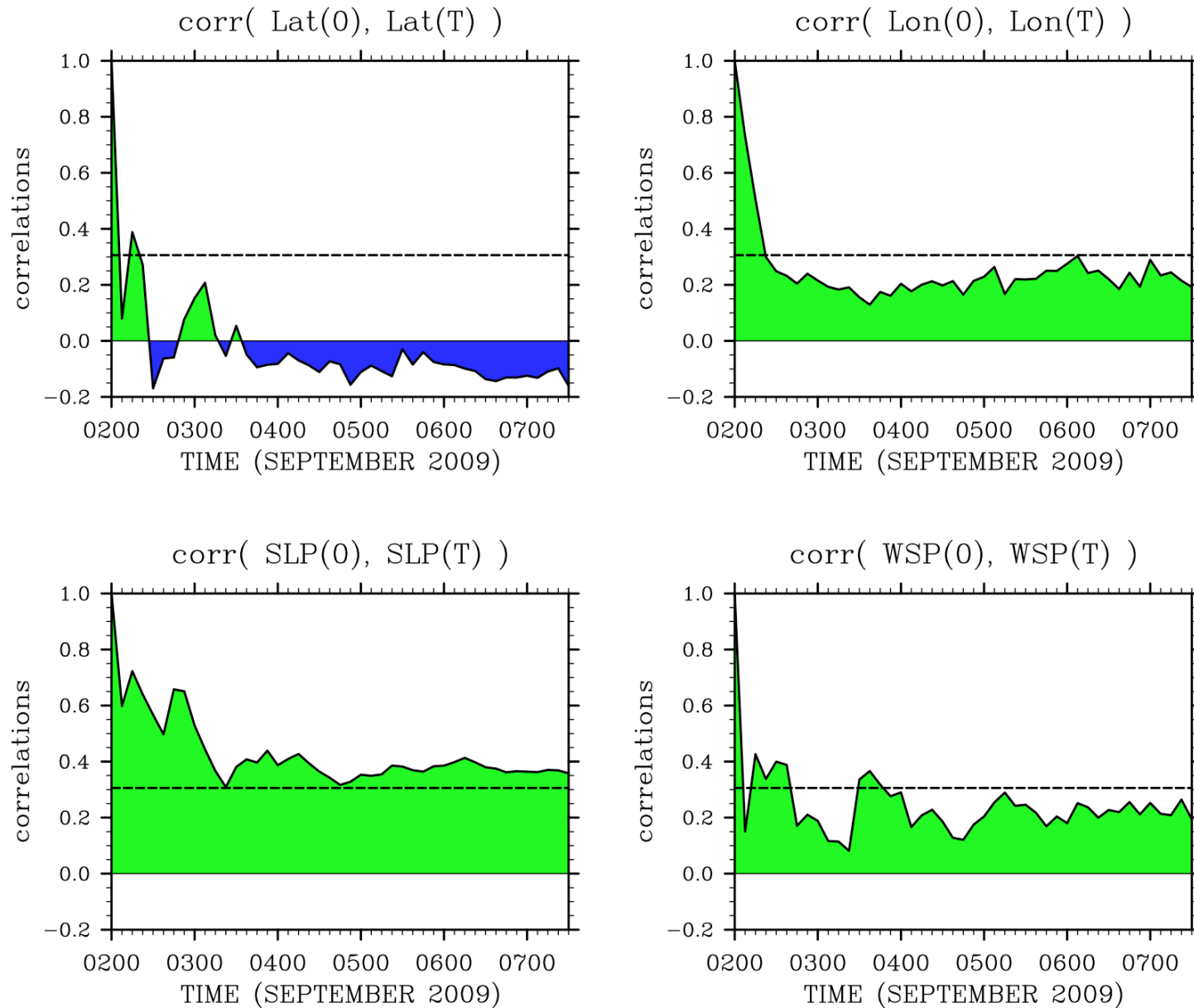


Figure 4 Time changes of correlation coefficients between initial time step and all time steps for the track (latitude, longitude) and the intensity (minimum sea level pressure and maximum wind speed) of Tropical Storm Erika

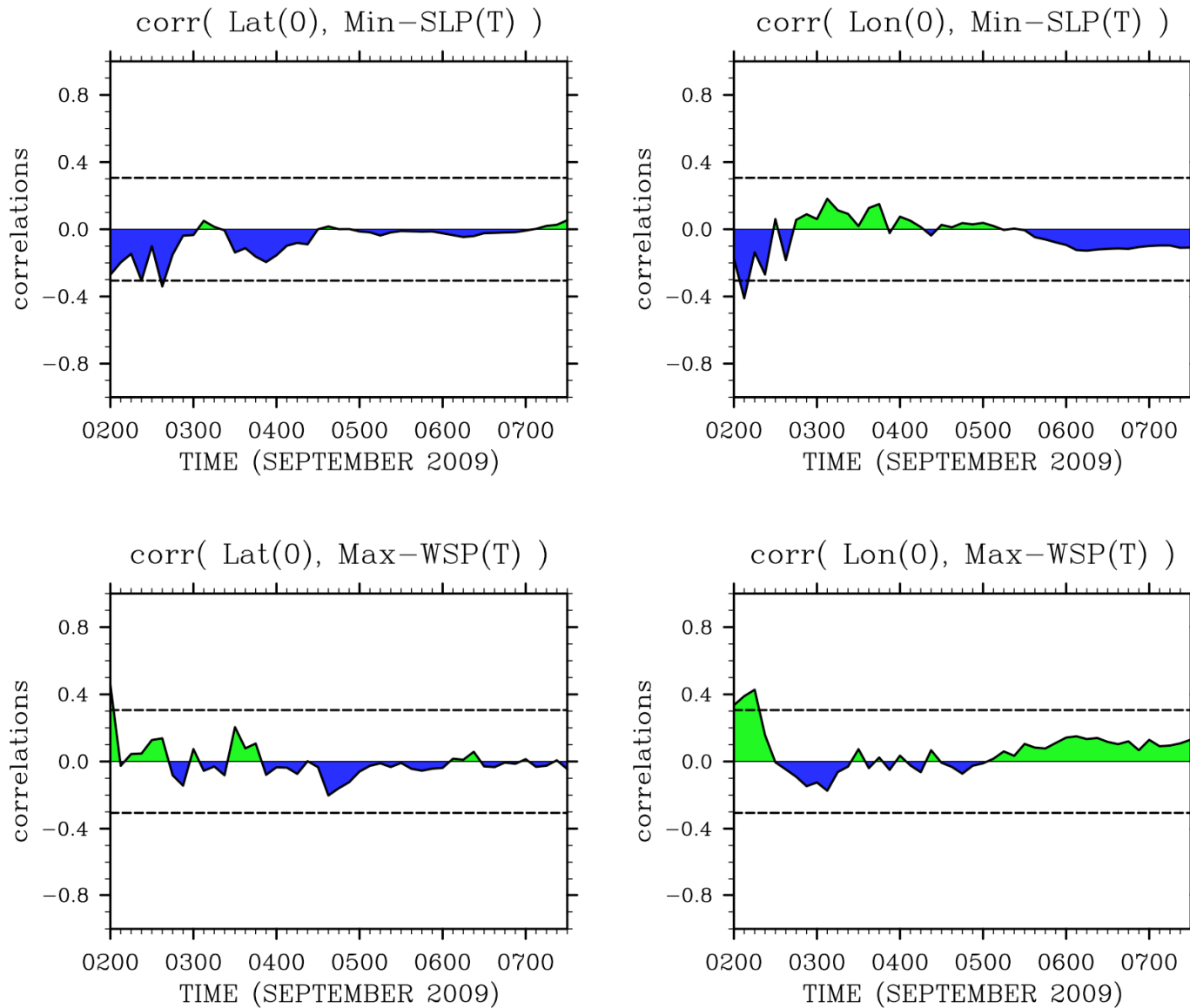


Figure 5 Time changes of correlation coefficients between the track (latitude, longitude) at initial time step and the intensity (minimum sea level pressure and maximum wind speed) at all time steps of Tropical Storm Erika