

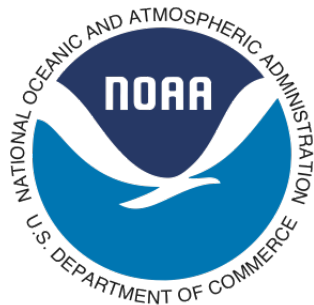
# Recent Advances in Vortex-Scale Data Assimilation using NOAA/AOML/HRD's HWRF Ensemble Data Assimilation System (HEDAS):

- (1) Real-data results from a multi-case experiment
- (2) Storm-relative data assimilation

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Bachir Annane, Shirley Murillo, Neal Dorst, Mike Page



# NOAA/AOML/HRD's

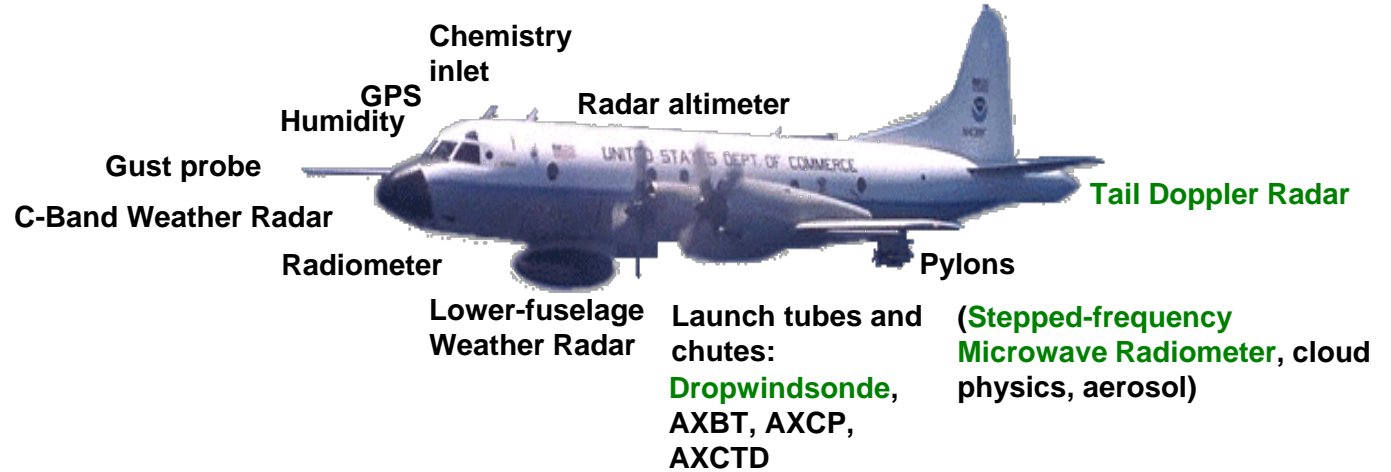
## HWRF Ensemble Data Assimilation System (HEDAS)

(Aksoy et al. 2012, MWR)

- **Forecast model:**
  - Exp. HWRF with 2 nested domains (9/3 km hor. resolution, 42 vert. levels)
  - Static inner nest to accommodate covariance computations
  - Ferrier microphysics, explicit convection on inner nest
- **Ensemble system:**
  - Initialized (cold start) from *GFS-EnKF (NOAA/ESRL)* ensemble member analyses
  - 30 ensemble members
- **Data assimilation:**
  - Square-root EnKF filter (Whitaker and Hamill 2002)
  - Assimilates data only on the inner nest
  - Covariance localization (Gaspari and Cohn 1999)
  - No explicit covariance treatment in the real time HEDAS
  - Filter solver parallelized using OpenMP

# Aircraft Data of Interest

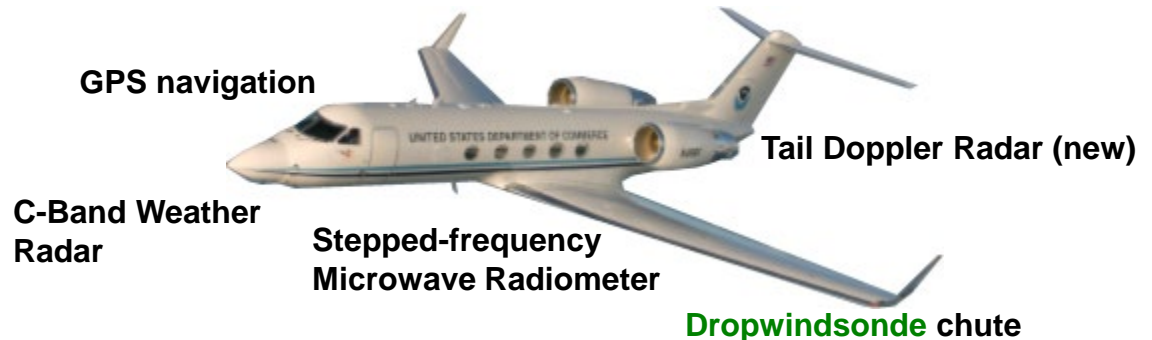
## P-3 Aircraft (eye penetrations)



HRD EnKF Effort Primarily Focusing on  
*Dropsonde, Doppler Radar, Flight-Level, and SFMR Obs*

Observation	Error
Doppler wind speed	2 ms <sup>-1</sup>
FL/Dropsonde Temperature	0.5 K
FL/Dropsonde zonal/merid. wind speed	2 ms <sup>-1</sup>
SFMR	Variable, mean ~5 ms <sup>-1</sup>

## G-IV Aircraft (environmental)

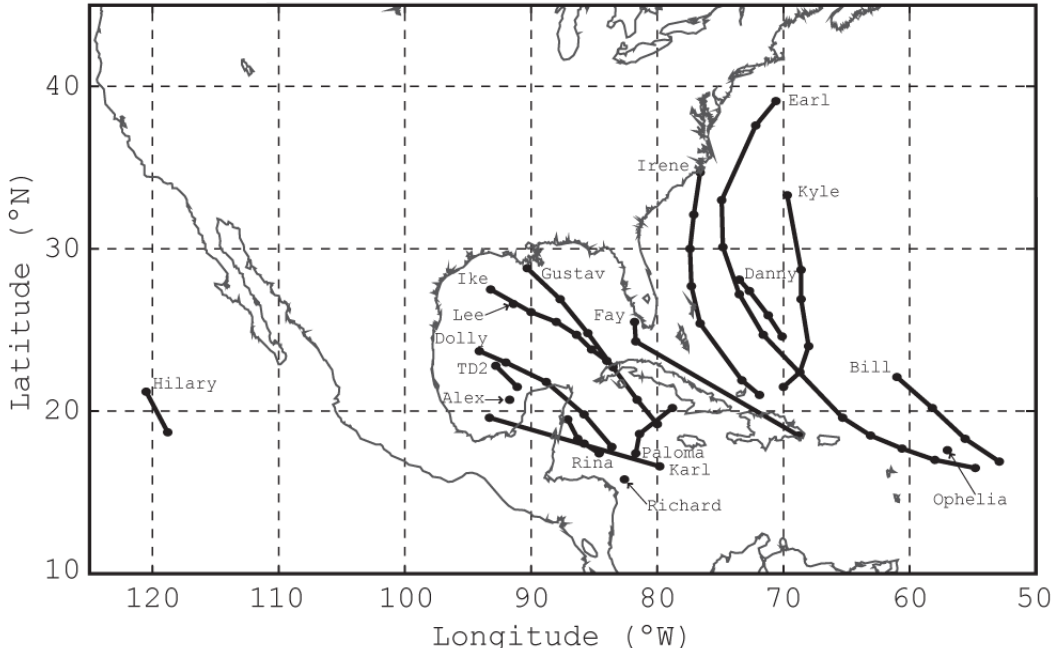


# 2008-2011 Real-Data Cases Considered

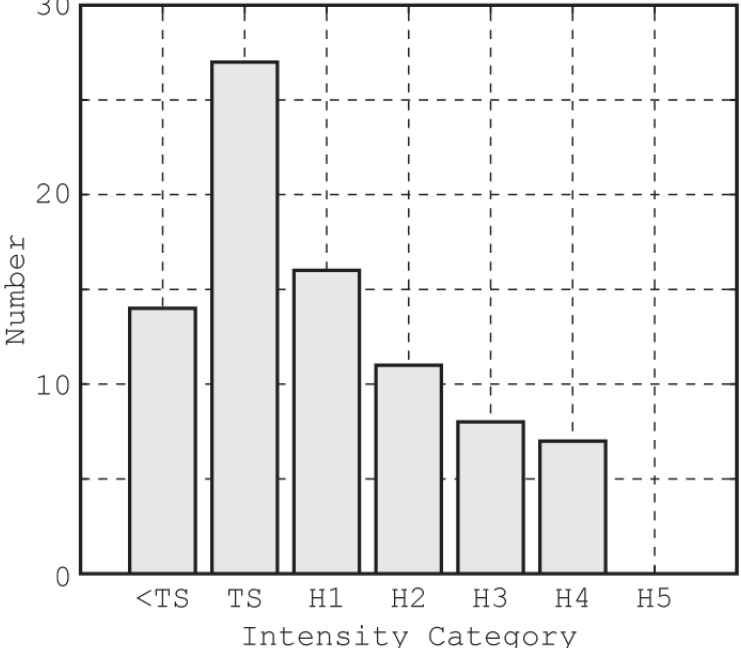
<b>2008</b>		Ike	09-12-18Z	<b>2010</b>		Tomas	11-15-00Z
Dolly	07-20-12Z	Kyle	09-23-00Z	Alex	06-29-00Z	Tomas	11-06-12Z
Dolly	07-21-00Z	Kyle	09-24-12Z	TD2	07-07-00Z	Tomas	11-07-00Z
Dolly	07-21-12Z	Kyle	09-25-00Z	TD2	07-07-12Z	<b>2011</b>	
Dolly	07-22-00Z	Kyle	09-25-12Z	TD2	07-08-00Z	Irene	08-24-00Z
Dolly	07-22-12Z	Kyle	09-26-00Z	Earl	08-29-00Z	Irene	08-24-12Z
Fay	08-14-12Z	Kyle	09-26-18Z	Earl	08-29-12Z	Irene	08-25-12Z
Fay	08-15-00Z	Kyle	09-27-00Z	Earl	08-30-00Z	Irene	08-26-00Z
Fay	08-15-06Z	Kyle	09-27-18Z	Earl	08-30-12Z	Irene	08-26-12Z
Fay	08-15-18Z	Paloma	11-07-06Z	Earl	08-31-00Z	Irene	08-27-00Z
Fay	08-18-18Z	Paloma	11-07-18Z	Earl	09-01-12Z	Irene	08-27-12Z
Fay	08-19-06Z	Paloma	11-08-18Z	Earl	09-02-00Z	Lee	09-02-00Z
Gustav	08-30-00Z	<b>2009</b>		Earl	09-02-12Z	Ophelia	09-24-18Z
Gustav	08-30-12Z	Ana	08-17-00Z	Earl	09-03-00Z	Hilary	09-28-18Z
Gustav	08-31-00Z	Bill	08-19-00Z	Earl	09-03-18Z	Hilary	09-29-18Z
Gustav	08-31-12Z	Bill	08-19-12Z	Earl	09-04-00Z	Rina	10-26-00Z
Gustav	09-01-00Z	Bill	08-20-00Z	Karl	09-13-00Z	Rina	10-26-18Z
Gustav	09-01-12Z	Bill	08-20-12Z	Karl	09-13-12Z	Rina	10-27-00Z
Ike	09-10-00Z	Danny	08-26-12Z	Karl	09-14-00Z	Rina	10-27-18Z
Ike	09-10-12Z	Danny	08-27-00Z	Karl	09-16-18Z		
Ike	09-11-00Z	Danny	08-27-12Z	Richard	10-23-06Z		
Ike	09-11-12Z	Danny	08-28-00Z	Tomas	11-04-00Z		
Ike	09-12-00Z			Tomas	11-04-12Z		

# Distribution of Cases

(a) Position

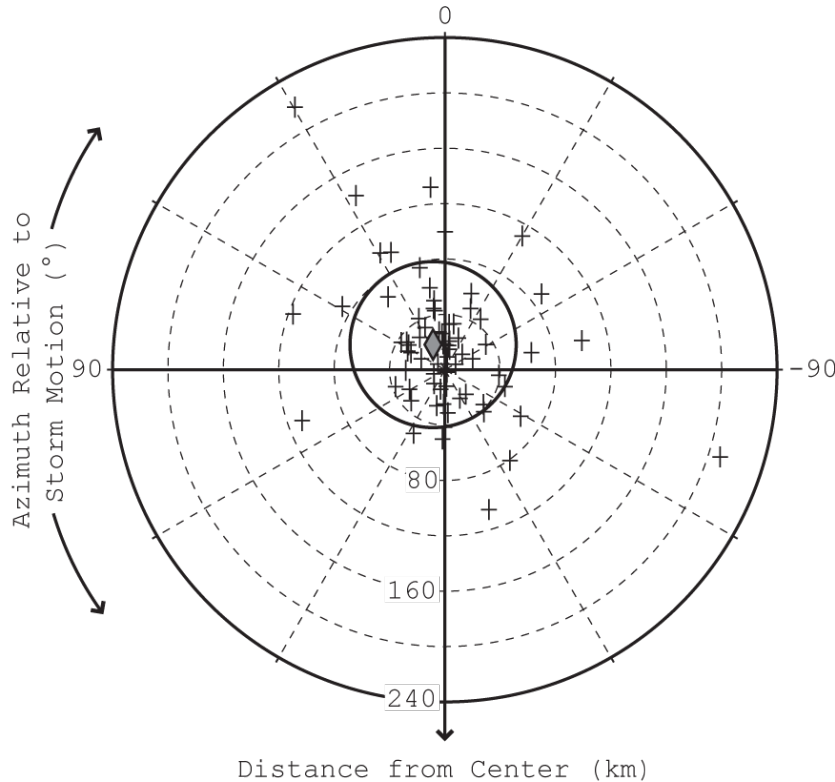


(b) Frequency Distribution

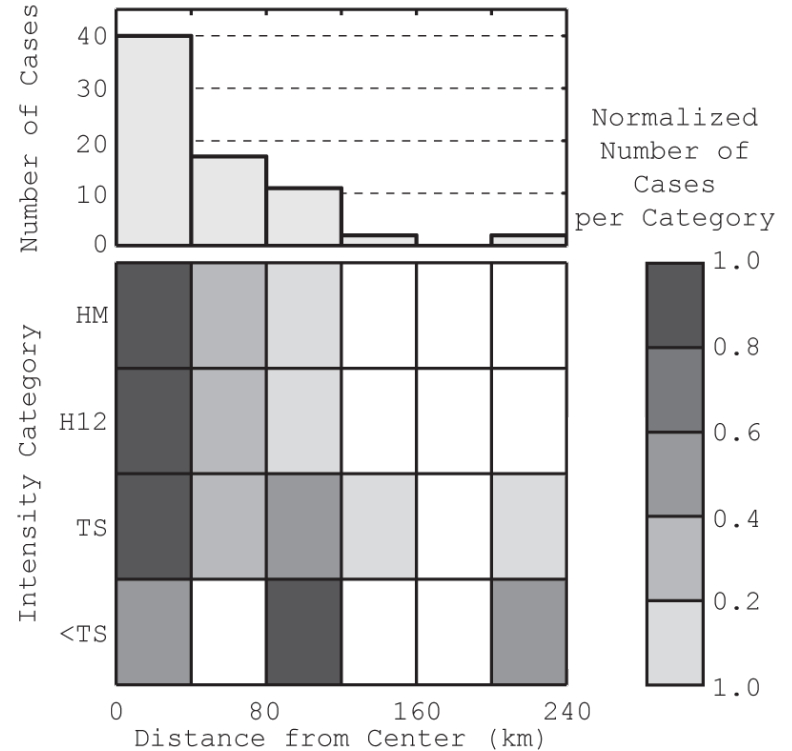


# Position Error (Analysis vs. Best Track)

(a) Storm-Relative Distribution



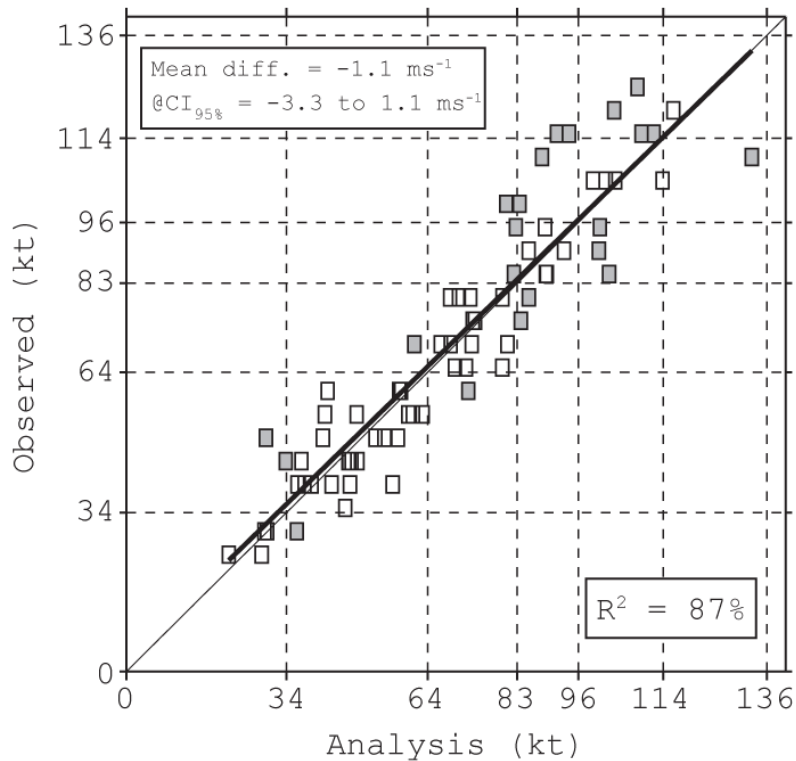
(b) Frequency Distribution



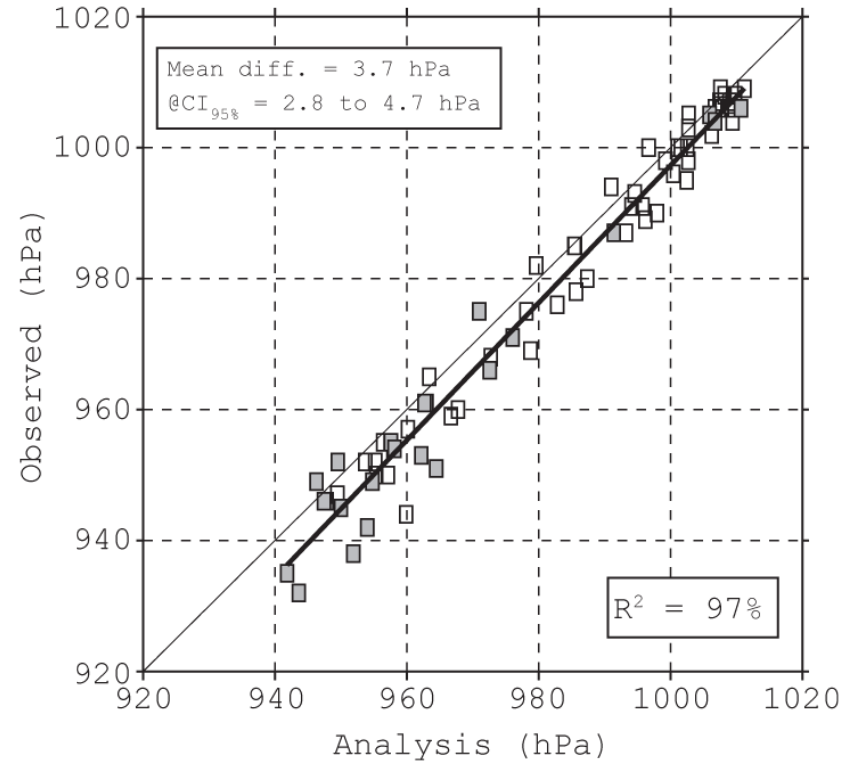
	Nearest Synoptic Time	Interpolation to Analysis Time
Mean Difference	57.7 km	38.3 km
Standard Error of Diff.	7 km	5.9 km

# Intensity Error (Analysis vs. Best Track)

(a) Max. 10-m Wind Speed

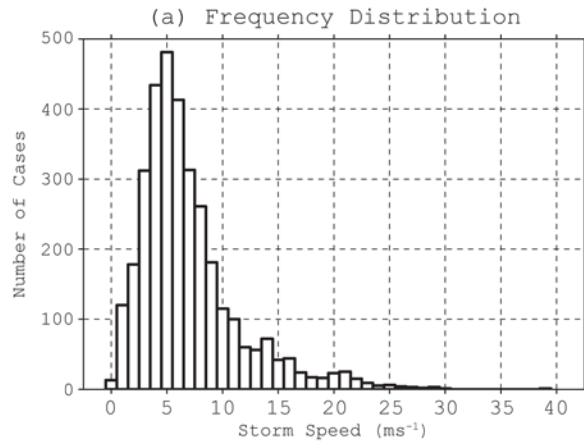


(b) Min. Sea-Level Pressure

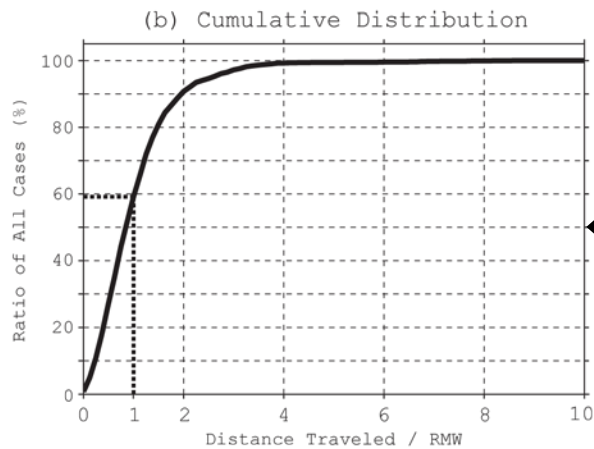


# Storm-Relative Tropical Cyclone DA: Motivation

(Aksoy 2012, MWR)



**PDF of storm speed:**  
All 1970-2010 Atlantic tropical cyclones with central pressure less than 990 hPa



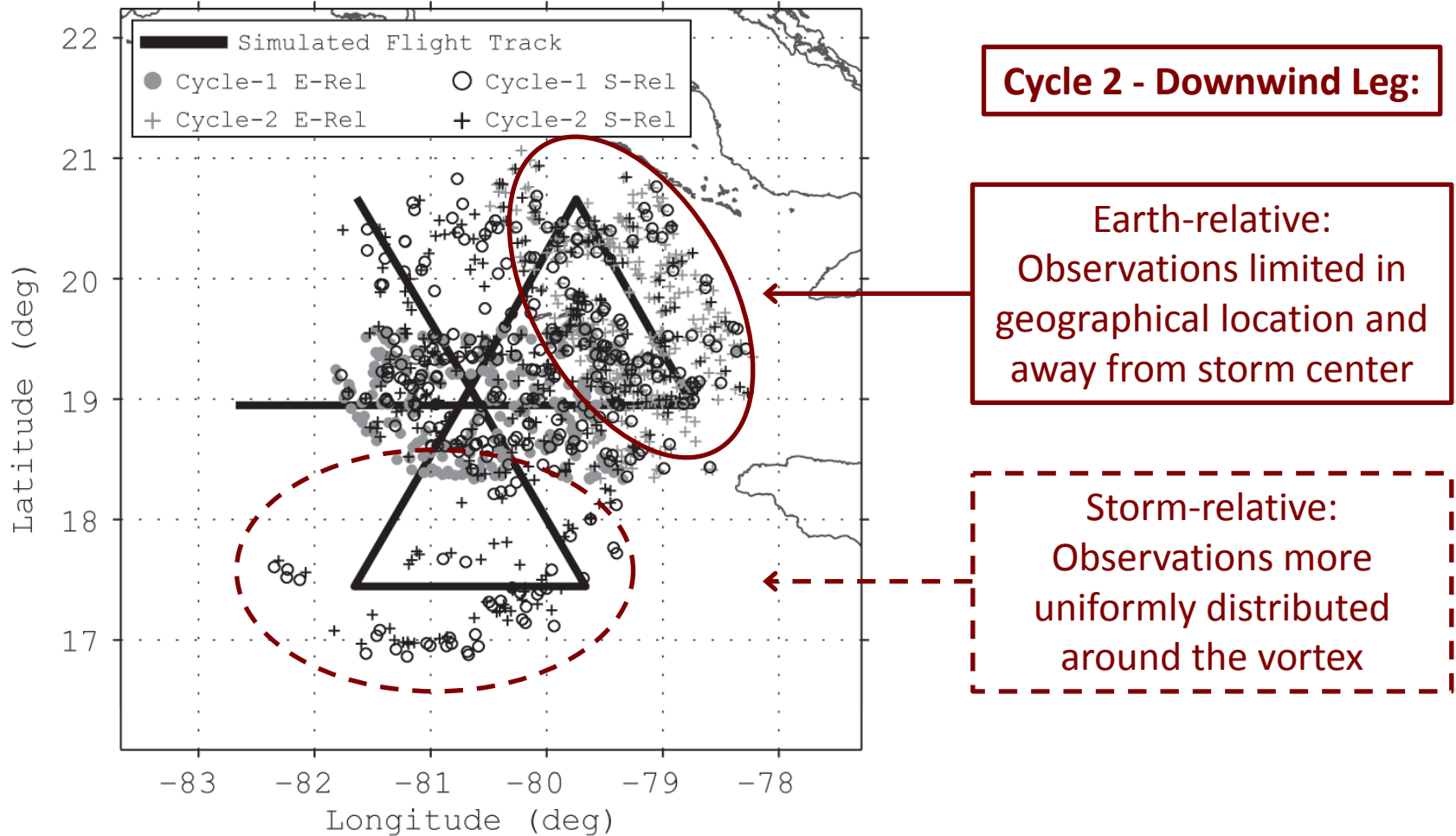
**CDF of distance traveled / RMW:**  
If storm speed is converted to distance using a 2-h possible separation between obs and ctr, and normalized by RMW

⇒ For ~40% of the TCs considered, DA would be carried out using observations that are more than 1 RMW apart!

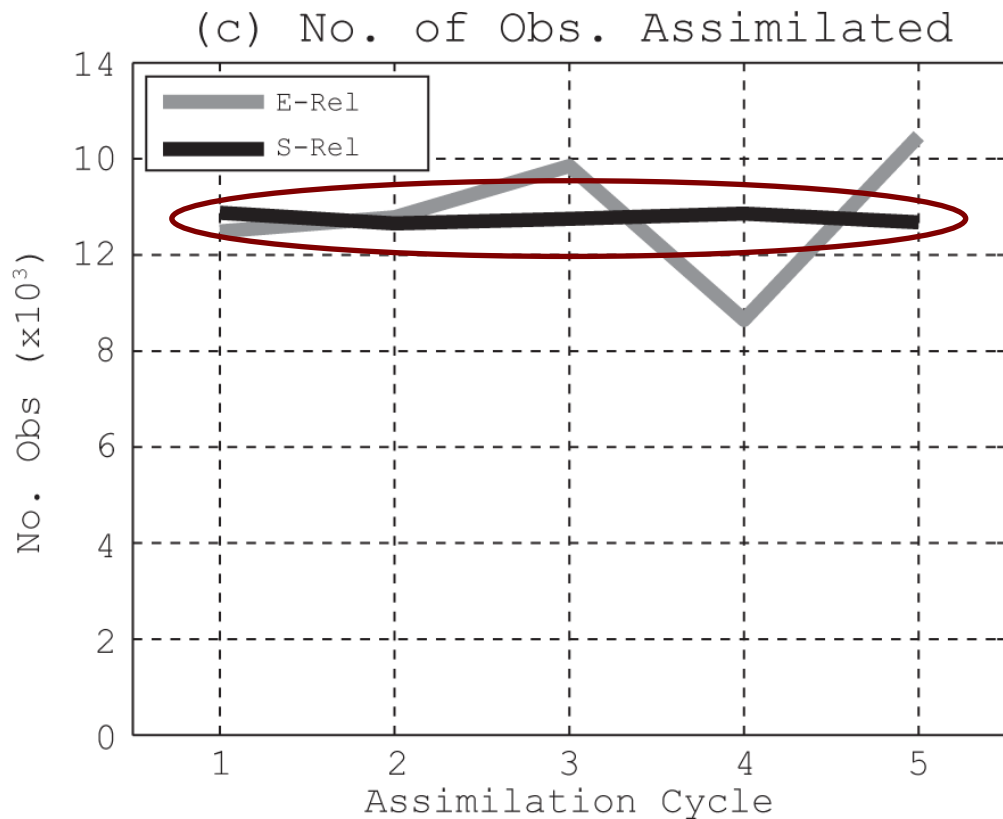


# Horizontal Distribution of Observations: Earth-Relative vs. Storm-Relative

(a) Horizontal Dist. of Obs.

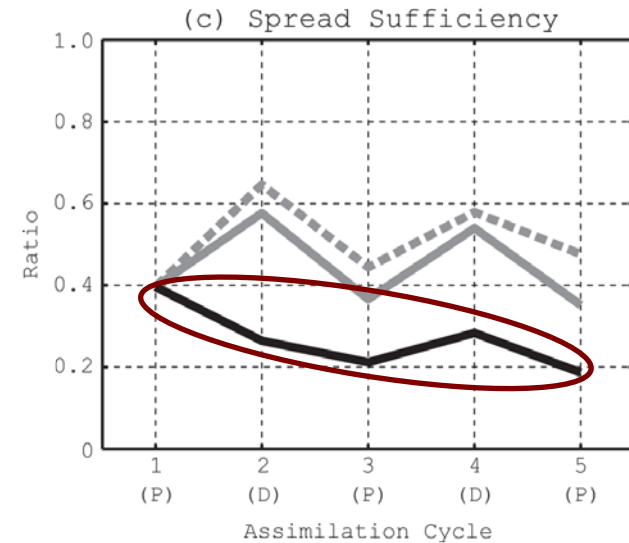
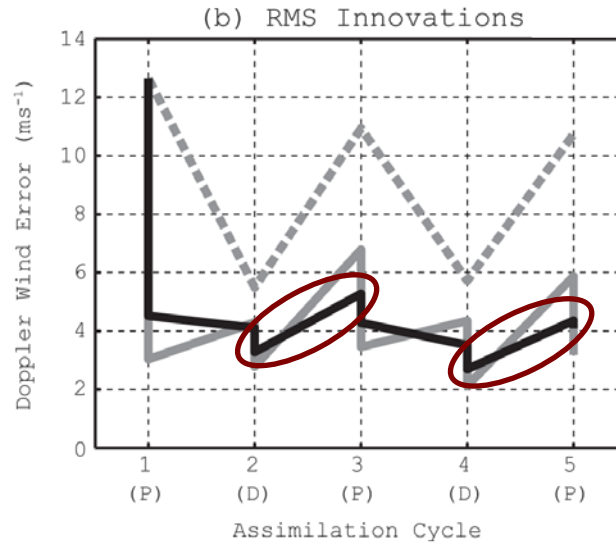
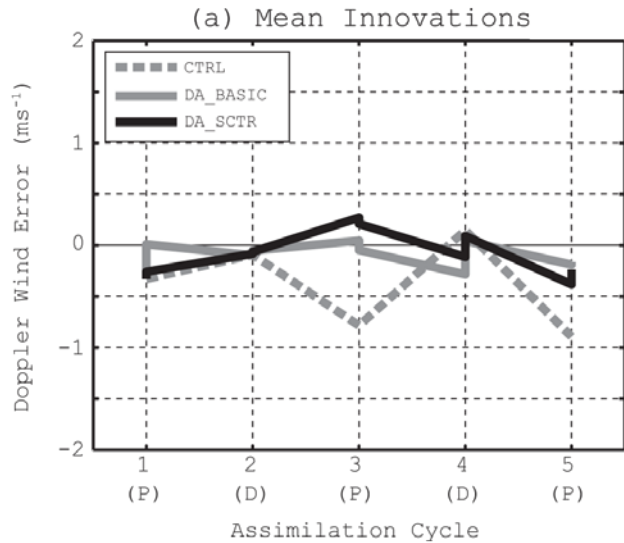


# Number of Observations Assimilated per Assimilation Cycle: Earth-Relative vs. Storm-Relative



Storm-relative:  
More uniform geographical  
distribution leads to better  
cycle-to-cycle number of  
observation consistency

# Observation-Space Performance: Earth-Relative vs. Storm-Relative

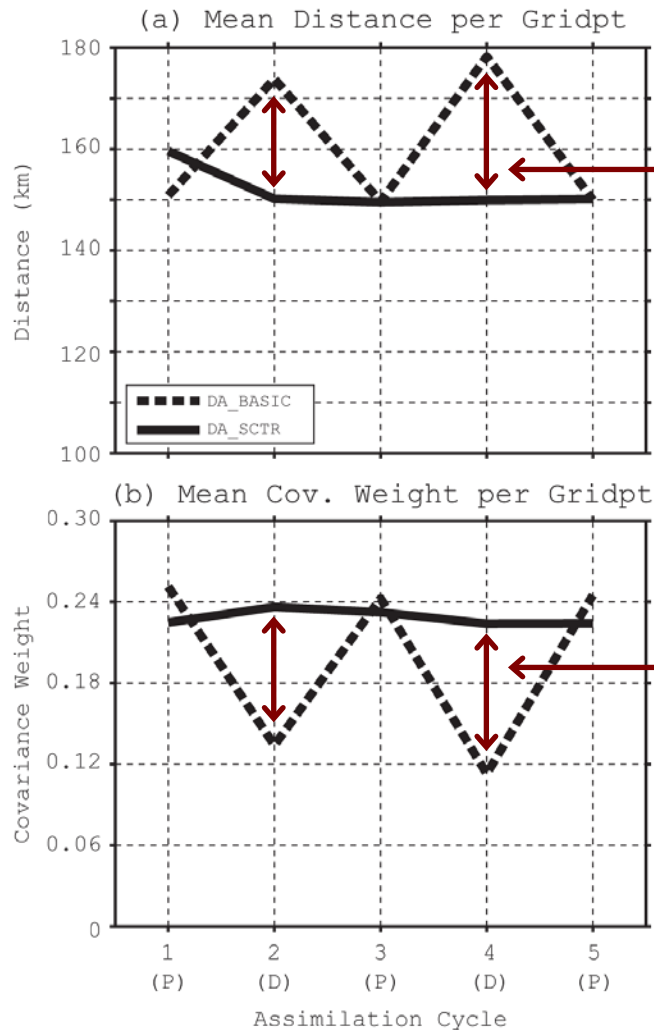


↑  
(1) Smaller analysis-forecast  
error growth

↑  
(2) Worsened  
spread sufficiency

CTRL : No DA  
DA\_BASIC: Earth-relative  
DA\_SCTR : Storm-relative

# Why Does Ensemble Spread Suffer in Storm-Relative Data Assimilation?



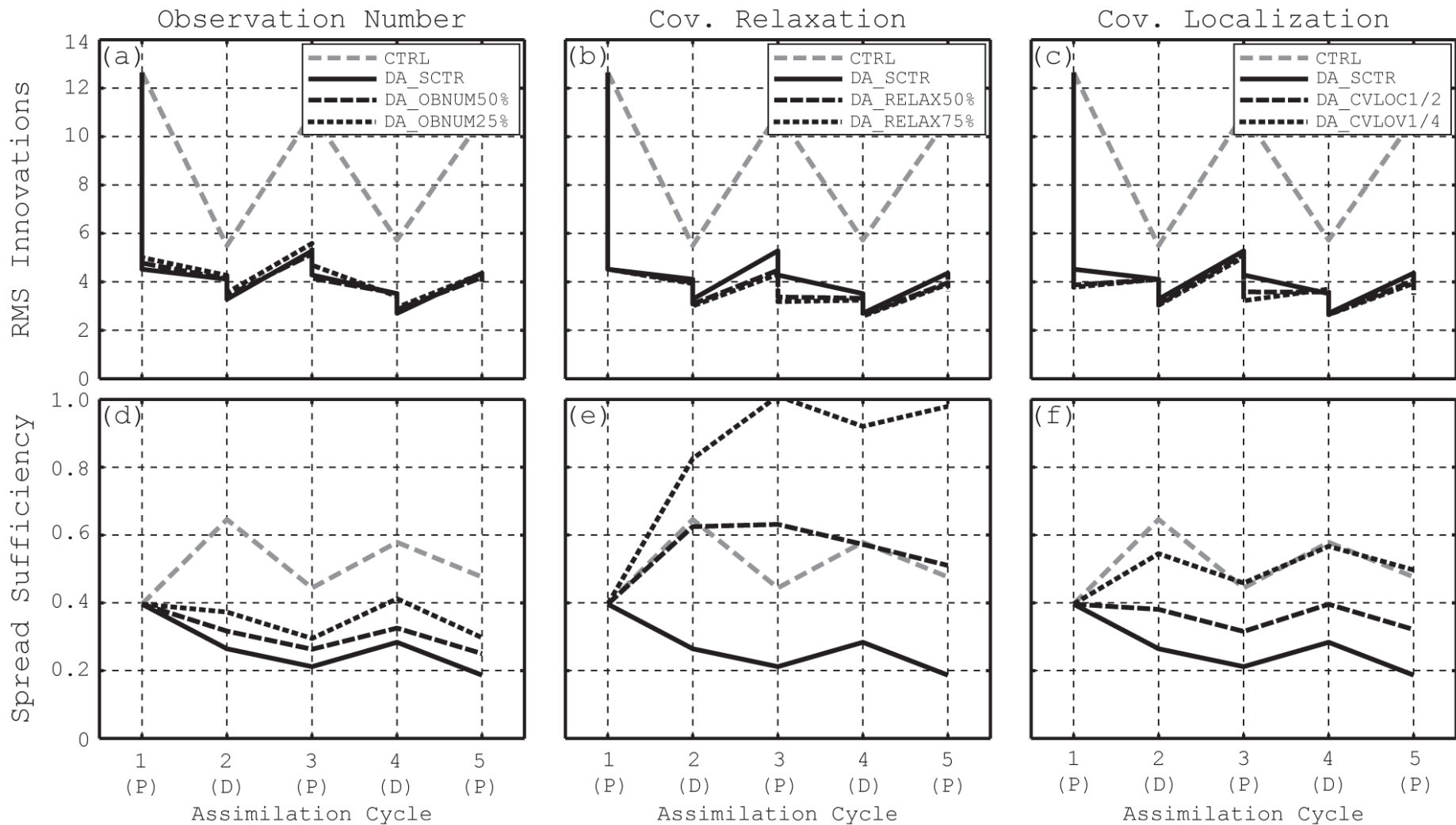
In storm-relative framework, observations are more uniformly distributed around the vortex

Per updated model grid point, this leads to a smaller average distance to assimilated observations, especially in downwind legs

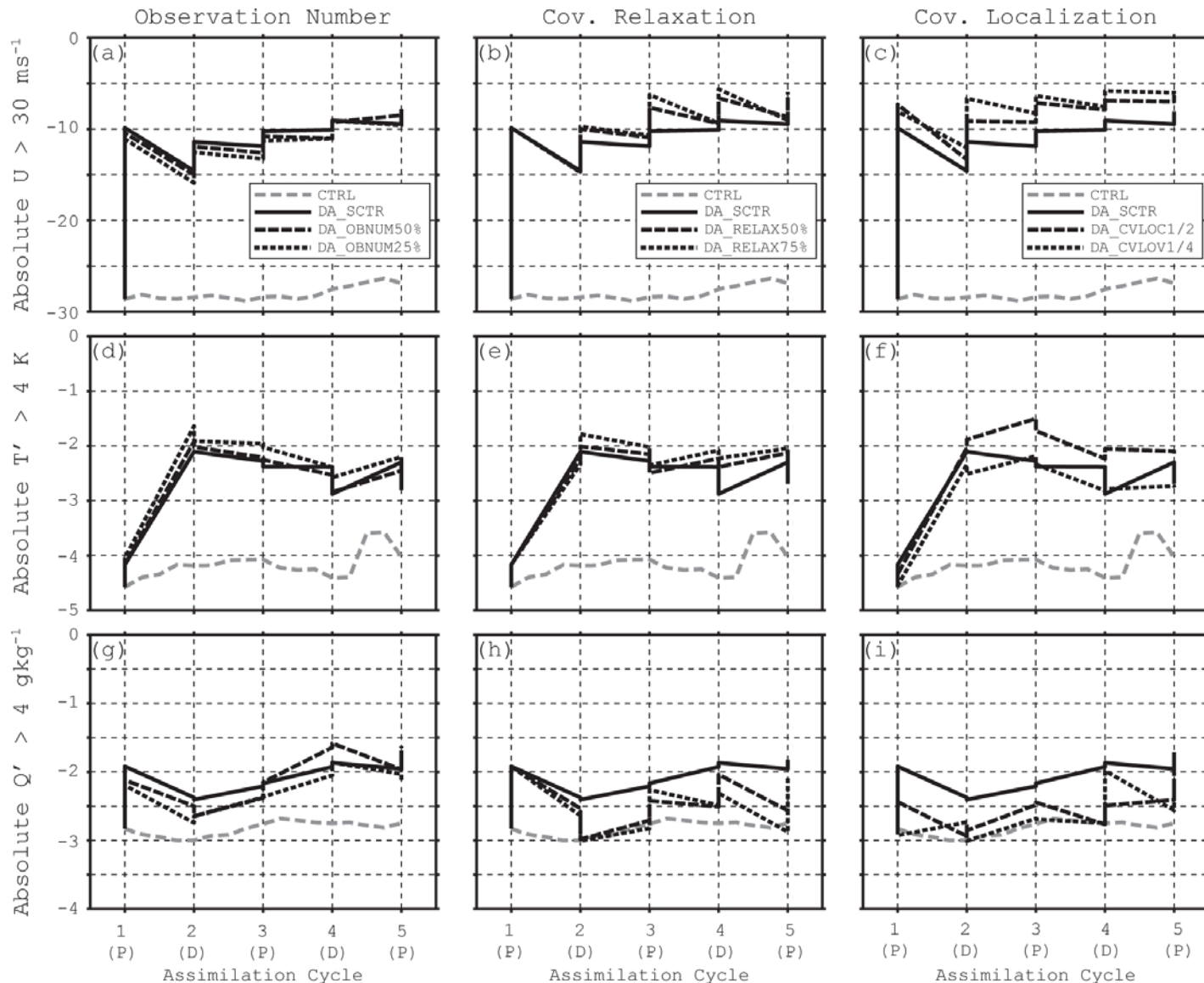
Smaller average distance translates to greater average covariance weight in covariance localization, thus increasing the overall impact of obs.

**DA\_BASIC:** Earth-relative  
**DA\_SCTR** : Storm-relative

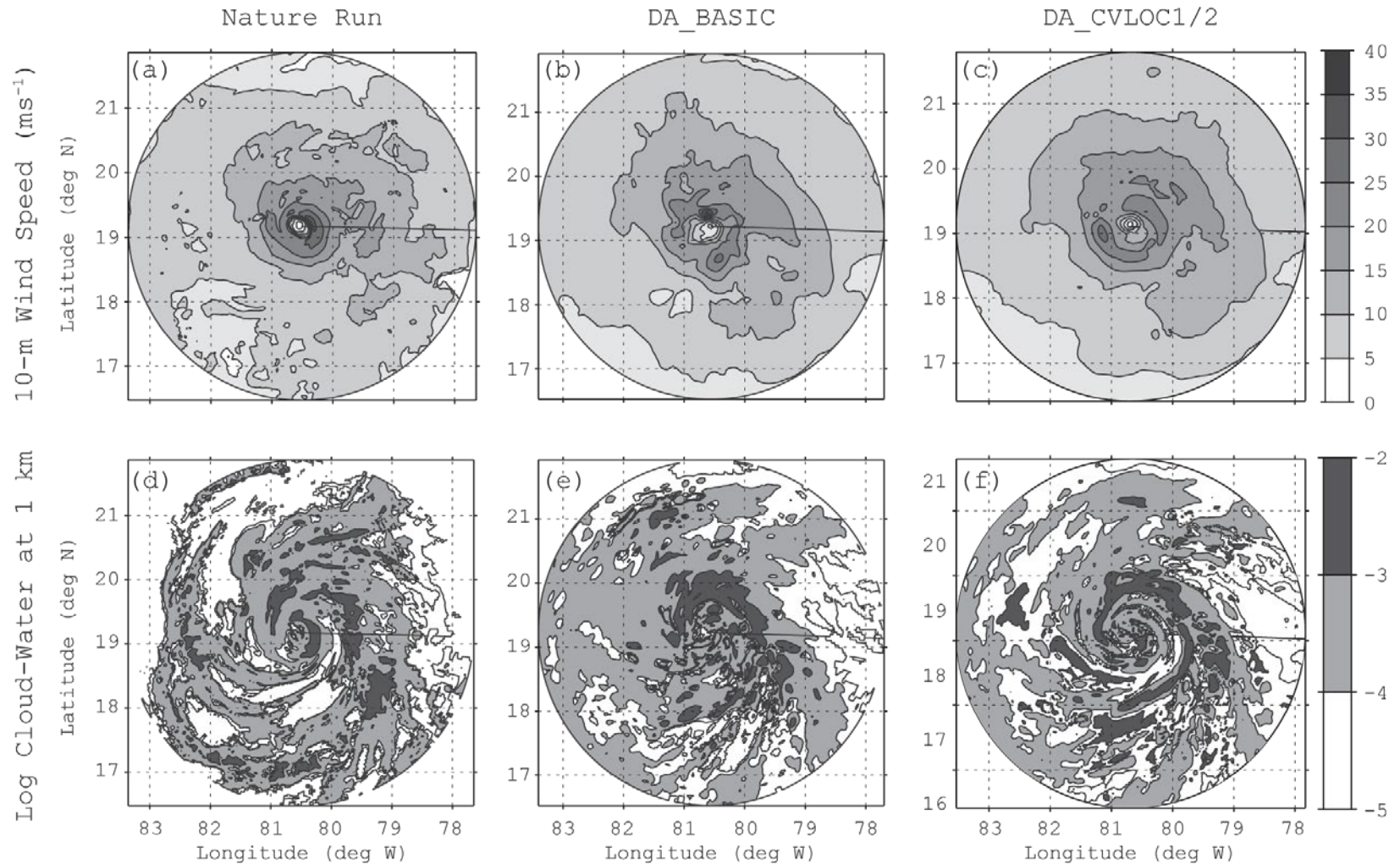
# Observation-Space Performance with Variations in HEDAS Configuration



# Model-Space Performance with Variations in HEDAS Configuration



# Performance of Storm-Relative DA: Comparison of 2-D Fields



# Summary

- Successful implementation of HEDAS for vortex-scale data assimilation with inner-core radar observations (84 real-data cases spanning 4 years and variety of storms/categories)
- HEDAS analyses exhibit good statistical conformance with observed position/intensity/structure
- Assimilation of storm-relative observations result in improvements in analyses compared to Earth-relative observations
- Smaller analysis-to-forecast error growth during cycling is encouraging
- Worsened ensemble spread must be accounted for through stricter covariance localization and inflation