# Recent research and development of inner core data assimilation: impact of relocation strategy; 4DIAU; and comparison of hourly 3DEnVar vs 6-hourly 4DEnVar

#### Xuguang Wang, Xu Lu, Ben Davis

Multiscale data Assimilation and Predictability (MAP) Lab University of Oklahoma, Norman, OK



In collaboration with EMC and HRD



# Impact of Vortex Relocation Strategies on Hurricane Inner-core Data Assimilation and Prediction in the HWRF EnVar DA System

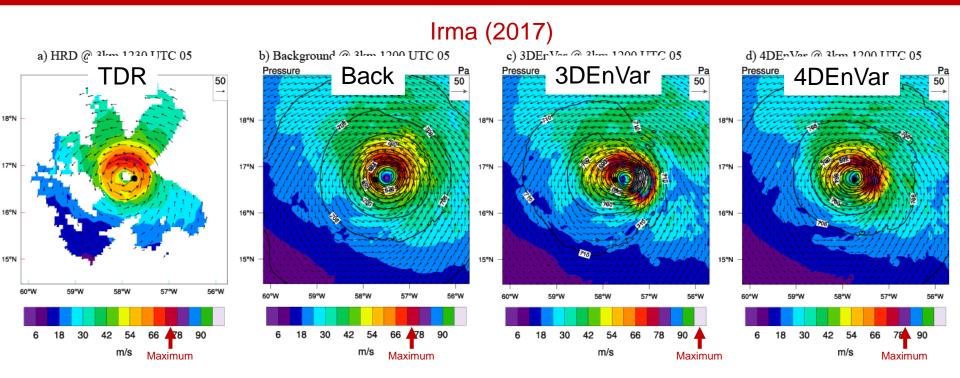






## Do where and how to relocate before DA matter?



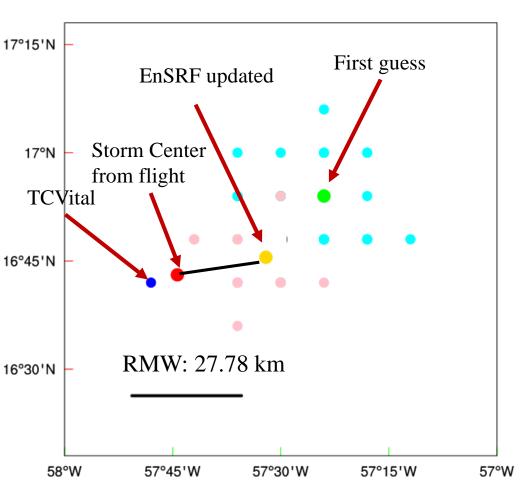


- VM is turned off when TDR is available and VR is used to relocate background before the assimilation
- 3DEnVar analysis produces spuriously strong wind
- In Lu et al. (2017), 4DEnVar is found to be better than 3DEnVar when the storm evolves fast and/or the data distribution is uneven within the DA window
- 4DEnVar can alleviate the issue but still too strong
- Issues are found to be associated with large location error in the relocated background.



## Errors of targeted location(s)





Blue - TCV Red - Flight-determined Track Orange/Pink – EnSRF updated Green/Cyan - Background

- The ensemble positions are updated using EnSRF toward TCVital before VR. The updated location error could still be large.
- TC vital itself has ~8-10km error.
- Large un-fixed location error could lead to un-reasonable increments (Chen and Snyder 2007)



### **Experiment Design**



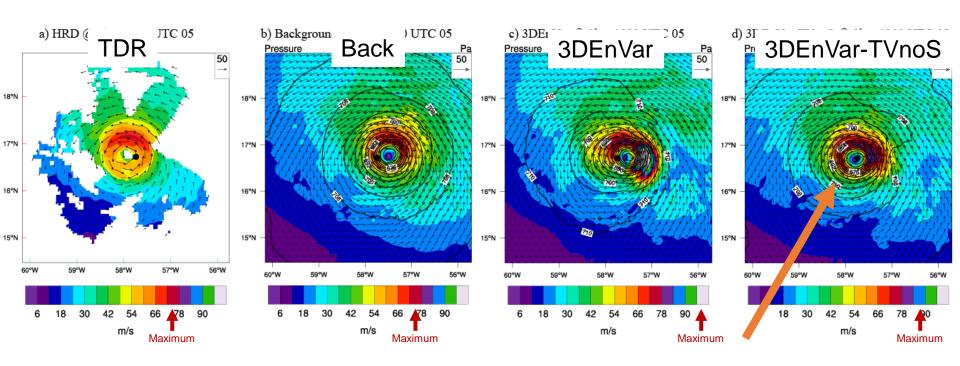
 Experiments are therefore conducted to investigate the different VR strategies on the inner-core DA

| Experiment    | VR targeted location | <b>Ensemble Location Spread</b> | DA method |
|---------------|----------------------|---------------------------------|-----------|
| 3DEnVar       | EnSRF analyses       | Yes                             | 3DEnVar   |
| 3DEnVar-TVnoS | TCVital              | No                              | 3DEnVar   |
| 3DEnVar-TVS   | TCVital              | Yes                             | 3DEnVar   |
| 3DEnVar-FTnoS | Flight-determined    | No                              | 3DEnVar   |
| 3DEnVar-FTS   | Flight-determined    | Yes                             | 3DEnVar   |
| 4DEnVar       | EnSRF analyses       | Yes                             | 4DEnVar   |
| 4DEnVar-TVnoS | TCVital              | No                              | 4DEnVar   |
| 4DEnVar-TVS   | TCVital              | Yes                             | 4DEnVar   |
| 4DEnVar-FTnoS | Flight-determined    | No                              | 4DEnVar   |
| 4DEnVar-FTS   | Flight-determined    | Yes                             | 4DEnVar   |



## Move all members to TCVital (3DEnVar)



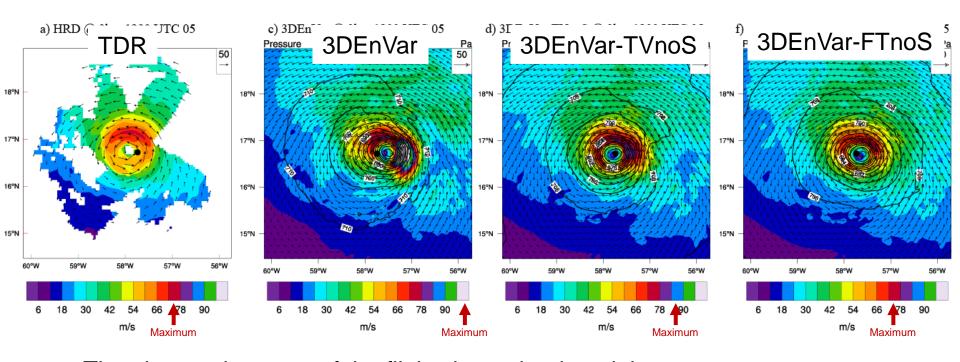


 Moving all members directly to the TCVital position, the analysis pattern is better but still spuriously too strong likely due to TCVital's errors (8-10km)



# Move all members to flight-determined location (3DEnVar)



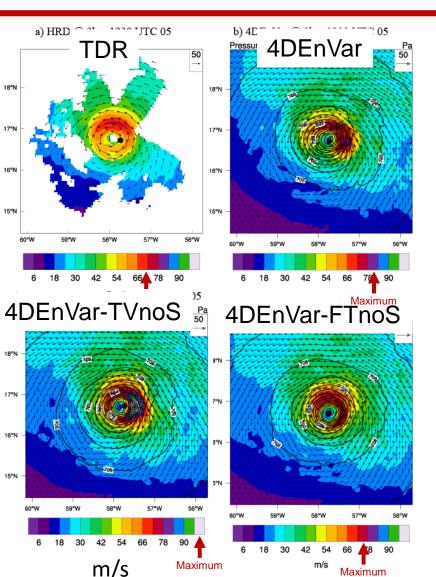


- The observation error of the flight-determined track is more accurate (observation error about 3km for intense storms, Willoughby and Chelmow, 1982)
- The analysis pattern in 3DEnVar-FTnoS is much improved than 3DEnVar-TVnoS

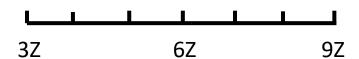


# Impact of Vortex Relocation Strategies on 4DEnVar





- Interpolated TCVtial have more errors
- Relocating all the members to the interpolated TCVital position worsen the analysis (4DEnVar-TVnoS), unless proper location spread is added (not shown).
- Relocating the first guess to the flightdetermined track significantly improves the analysis pattern.



# Further Development of Four-Dimensional Incremental Analysis Update (4DIAU) for HWRF 4DEnVar



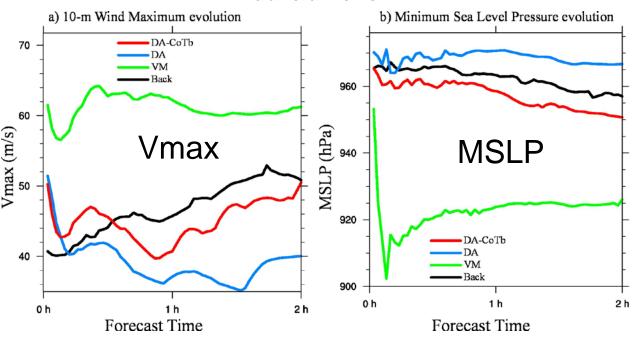




### Would IAU help alleviate the initial shock?



#### Patricia 2015



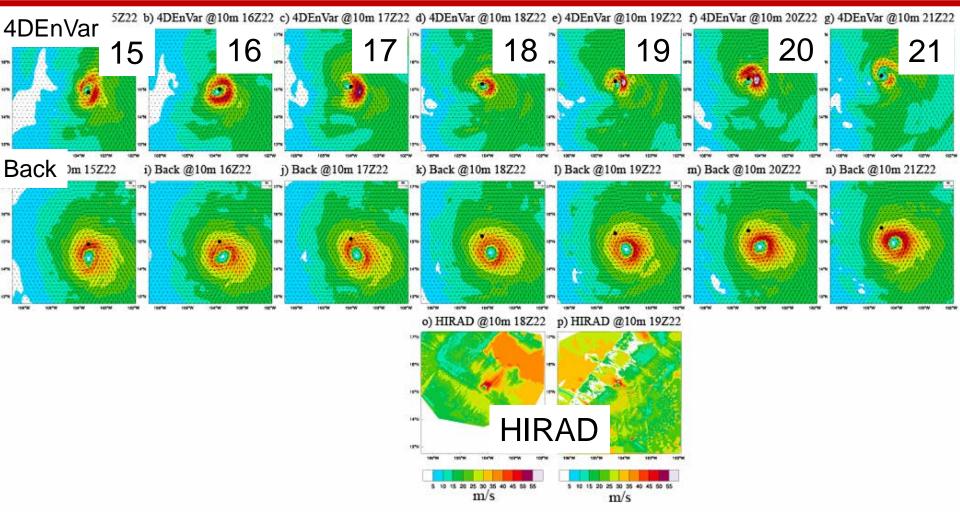
Lu and Wang 2018, MWR

- Using the modified physics (reduced coac+turbulent layer mixing), "spin down" is reduced (Lu and Wang 2018). Initial shock however is still seen.
- 4DIAU is shown to help for global 4DEnVar (Lei and Whitaker 2017).
- However, 4DIAU assumes the model evolution is linear or near linear.
- Does 4DIAU still work for the highly nonlinear case like Patricia (2015)?



## Implementation of 4DIAU in regional HWRF model -- Surface Wind Analysis (4DEnVar v.s. Back)



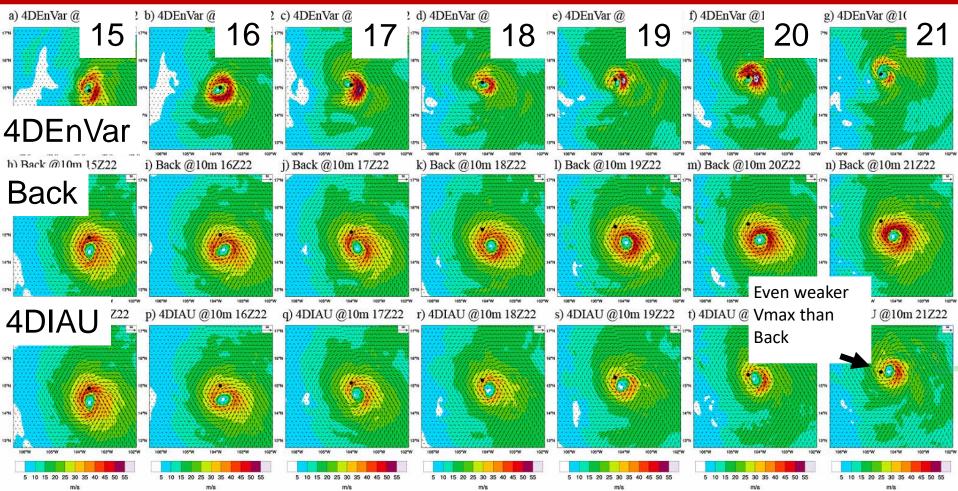


 4DEnVar can produce analyses more consistent with the observations than Back. E.g. reducing size.



## Nonlinearity can cause 4DIAU to degrade the analysis -- Surface Wind Analyses (4DEnVar v.s. 4DIAU)



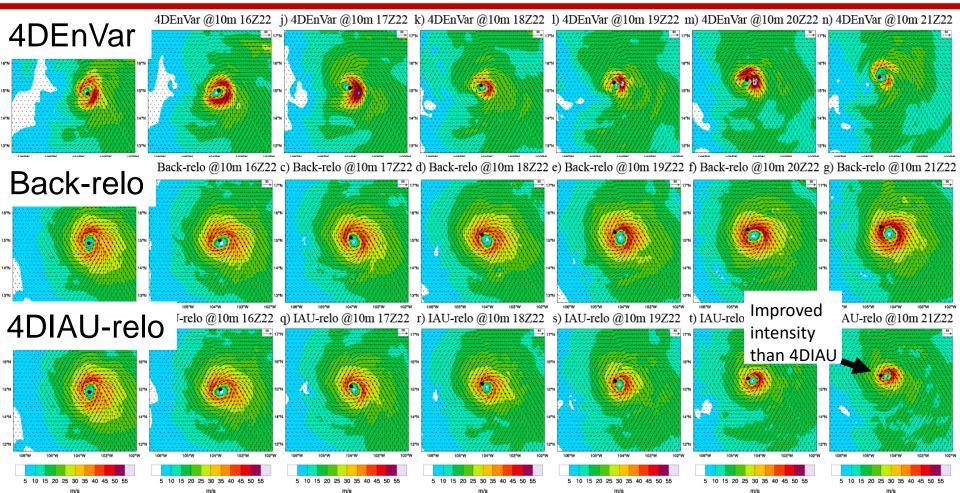


Diagnostics show that large increment (due to fixing both size and location) will produce a trajectory that is different from the original background due to nonlinearity, which creates inconsistency during IAU that leads to too weak of Vmax.



## Reducing nonlinearity effect: 4DIAU using a relocated initial background



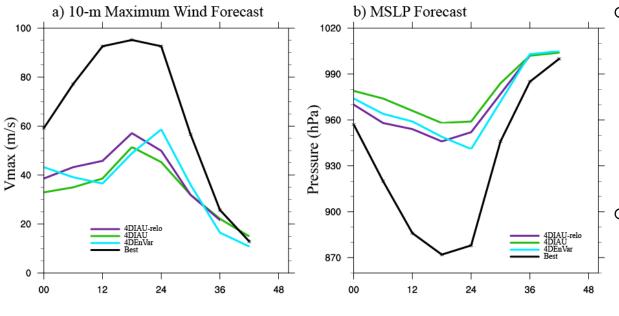


- o Inconsistency due to large increment and nonlinear model evolution during IAU is reduced when the background to calculate increments is initially relocated.
- As a result Vmax at the end of IAU is improved.



## Reducing nonlinearity effect: 4DIAU using a relocated initial background



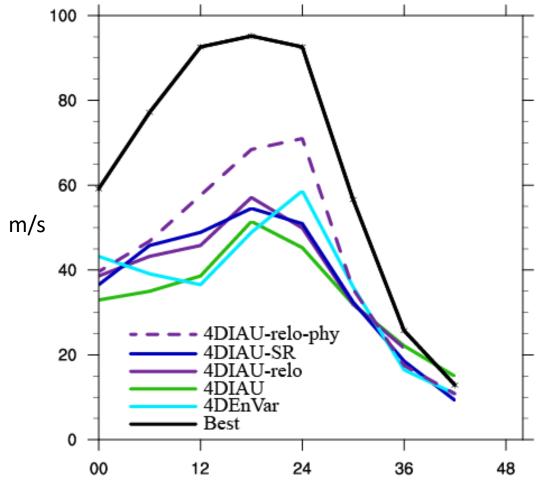


- 4DIAU-relo produces improved intensity forecast compared to 4DEnVar such as timing of peak intensity given spin-down is alleviated.
- 4DIAU-relo produces improved peak intensity forecast compared to 4DIAU.



## Combined effect of 4DIAU and modified physics

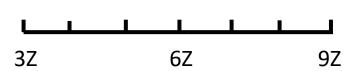




- 4DIAU shows bigger impact with improved model physics (reduced coac+turbulent mixed layer PBL, Lu and Wang 2018)
- Finer resolution is needed to improve analyzed and peak Vmax (not shown)

# 6-hourly 3DEnVar, hourly 3DEnVar, 6-hourly 4DEnVar





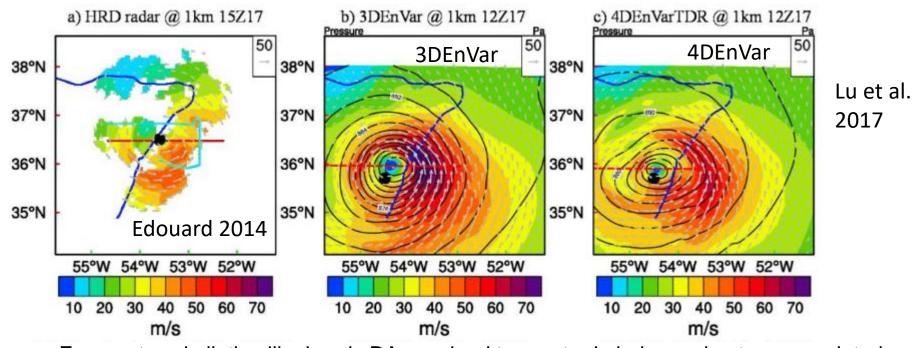




## **Background**



- 6-hourly 3DEnVar ignores temporal variation of errors within 6 hour window.
- Both 6-houry 4DEnVar and hourly 3DEnVar can potentially improve this aspect (Lu et al, 2017)



- Frequent assimilation like hourly DA may lead to greater imbalance due to accumulated model shocks
- 6 hourly 4DEnVar may have less of an imbalance problem, but convective scale errors may reach saturation (loss of predictability) by a 9-hour model integration



## Main findings with limited samples



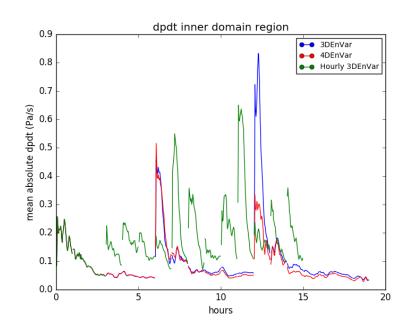
- TDR missions from Edouard and Irma suggested
- ✓ Both 6 hourly 4DEnVar and hourly 3DEnVar are better than 6 hourly 3DEnVar (consistent with Lu et al. 2017)
- ✓ 6 hourly 4DEnVar and hourly 3DEnVar are comparable
- Imbalance from hourly 3DEnVar did not get accumulated given they propagate out of the inner most domain within one hour.
- Frequent assimilation likely hourly 3DEnVar when data are dense sometimes can lead to small spread which can cause in-effective correction of the storm location during the pre-DA VR step.
- Need run with more samples!

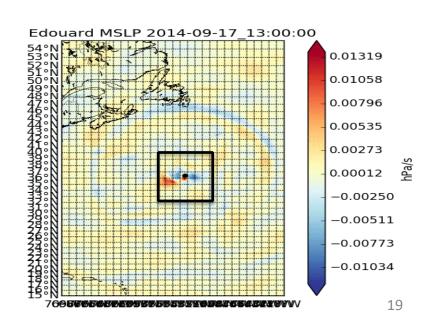


# Is imbalance accumulated for hourly update?



- For Hourly 3DEnVar the wave is no longer in the inner domain by the next assimilation cycle → no accumulation of imbalance during hourly cycling in the inner most domain
- Therefore imbalance in hourly 3DEnVar does not appear to be more of an issue than 6 hourly 4DEnVar







## Summary and discussion



- □ Large location error of the background can cause spuriously large Vmax in the analysis. Relocation of the background toward a more accurately estimated position can help on the issue.
- ☐ Continue exploring frequent assimilation of inner core data and its comparison with 4DEnVar.
- □ IAU with proper treatment of model nonlinearity can alleviate the spin down issue. Larger impact is found with an improved model physics.
- ☐ Continue Investigating inner core DA issues (resolution, non-Gaussianity/nonlinearity, imbalance, new data, etc.)
- ☐ Shared development of DA and model physics

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