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# Correcting for Position Errors in Variational Data Assimilation

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**Data Assimilation II: Methodology, 13.3**

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# Introduction :: Feature Calibration and Alignment (FCA)

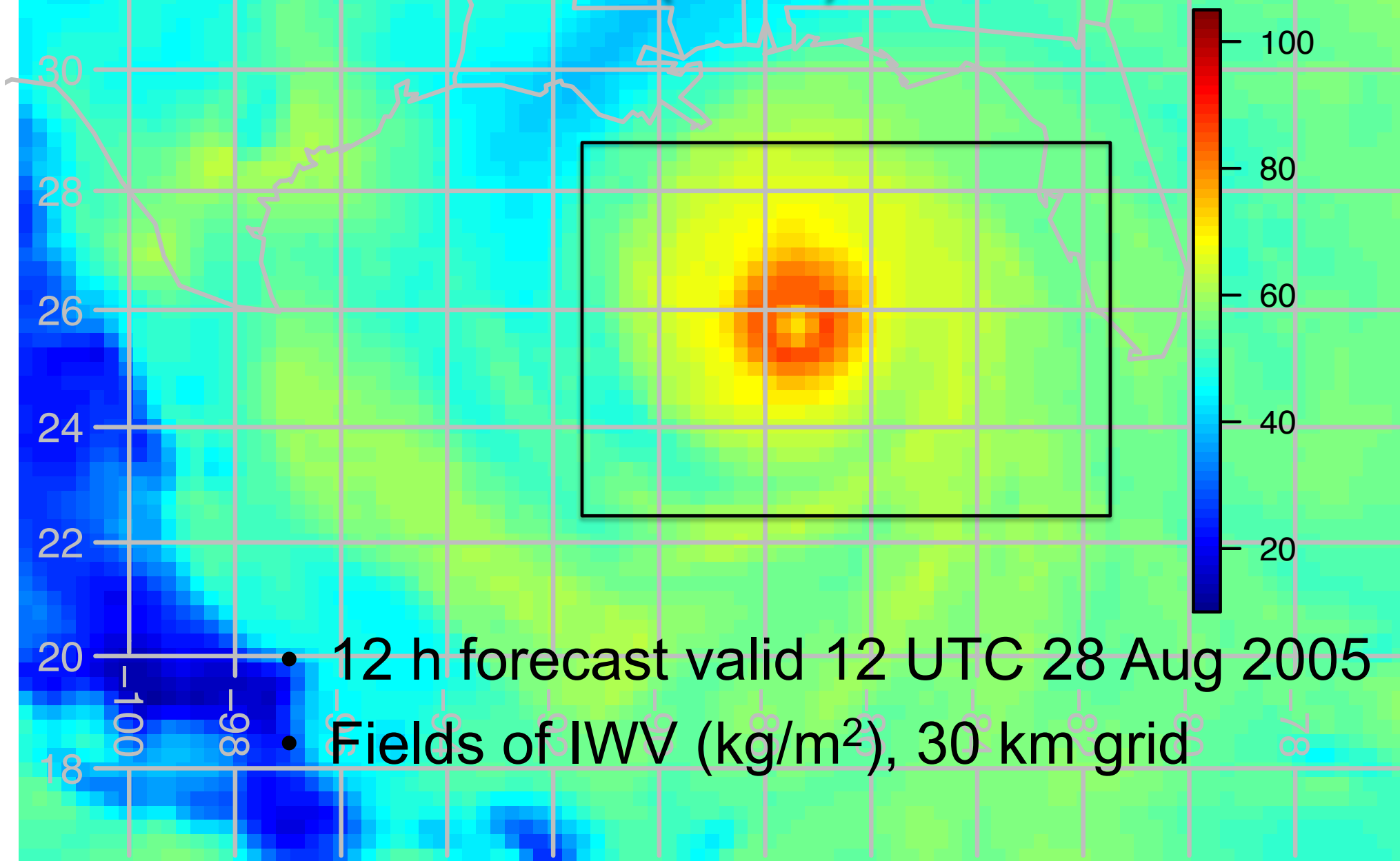
- For cloud-related fields, position errors of features are both common and problematic
  - Non-Gaussian error statistics
  - Poor convergence of variational analysis schemes
- FCA represents errors (or differences) in terms of errors of alignment and errors of amplitude and “random” errors
  - Here we do not consider FCA amplitude errors
  - Developed in context of WRFDA pre-processor

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# Summary

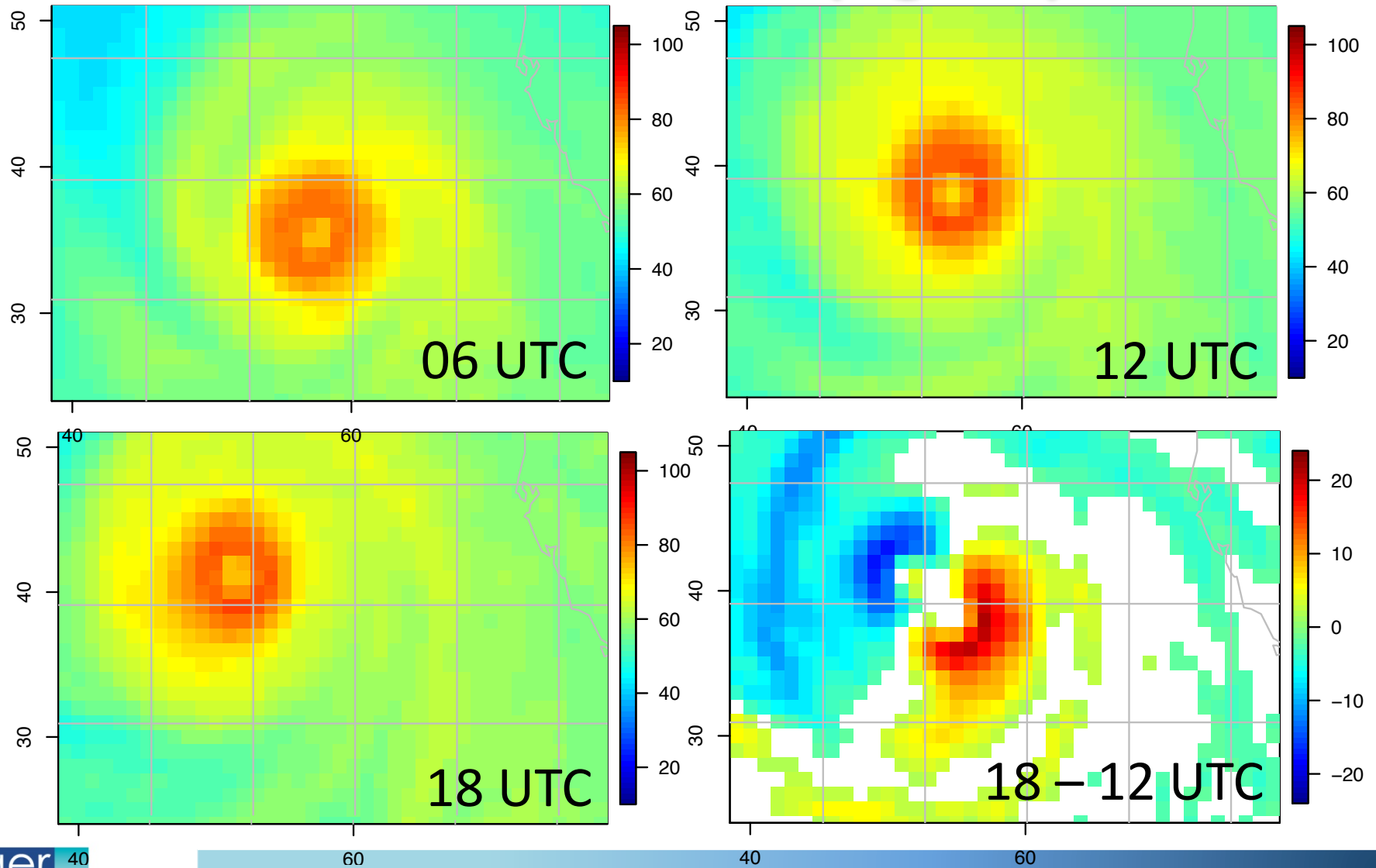
- Adjusting forecast IC in perfect model case
  - 2d fields: IWV in a TC case
  - 3d fields: pseudo-radiosondes (same TC case)
- Effect of removing alignment errors on covariance matrix
- Adjusting background using AIRS window channel BTs in a cloudy case.

# Hurricane Katrina (2005) simulation





# Katrina simulation IWV ( $\text{kg}/\text{m}^2$ )



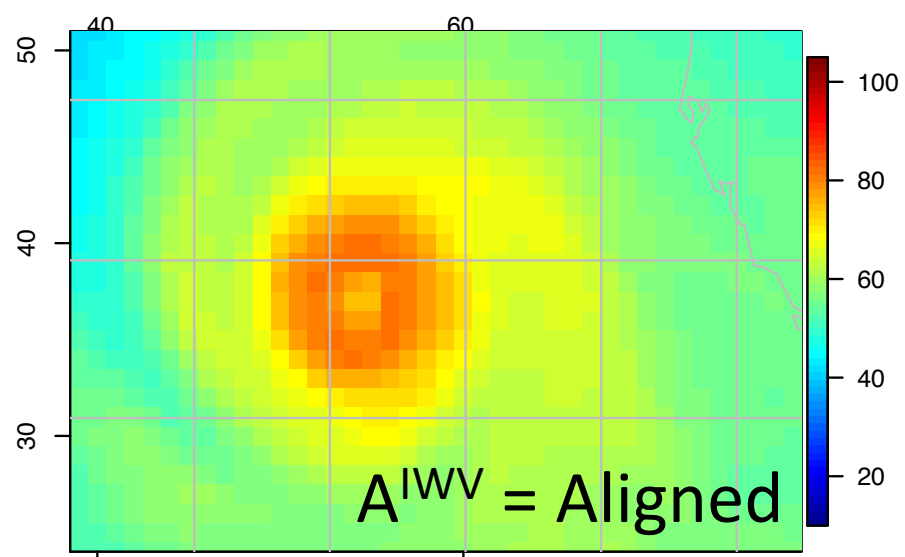
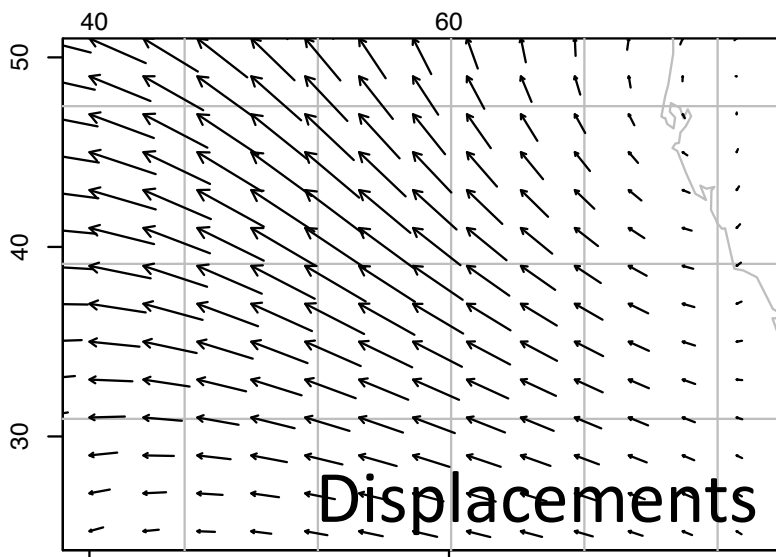
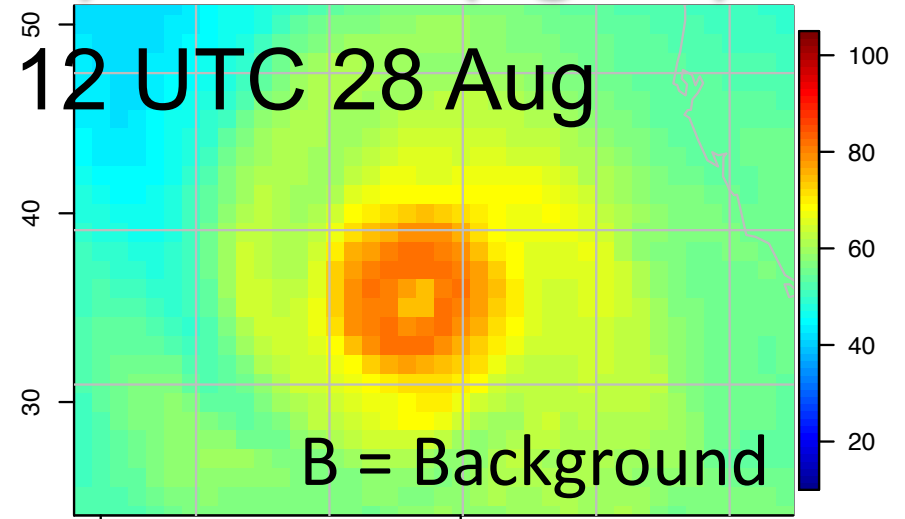
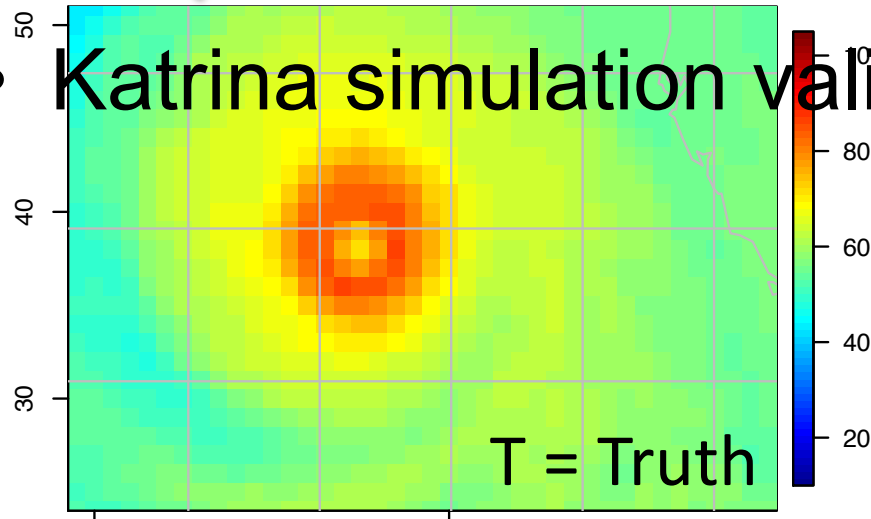
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# Grassotti et al. 1999 FCA

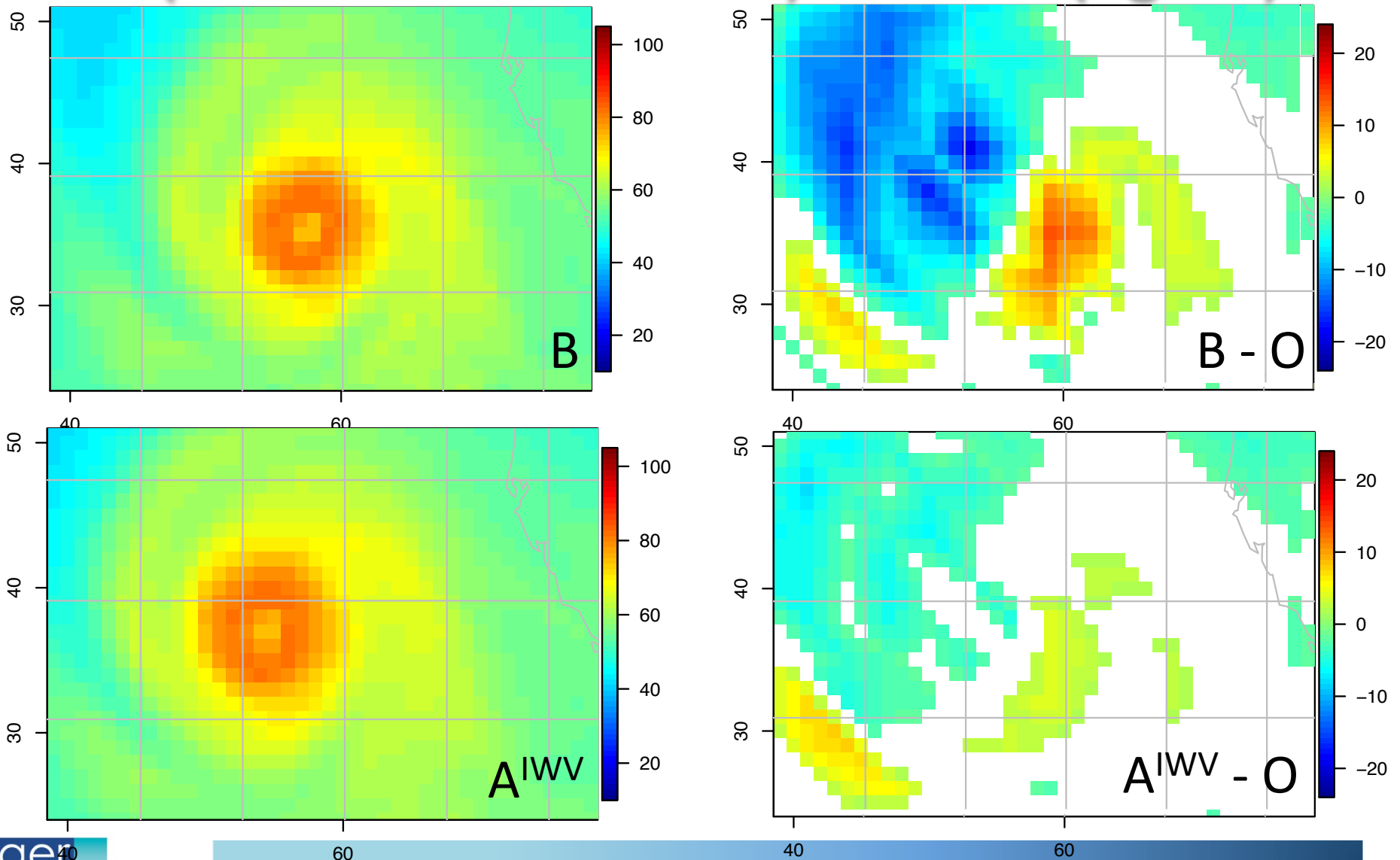
- Compare two-dimensional forecast field(s) and corresponding observations
- Derive a set of two-dimensional displacement vectors that improves the alignment of features in the 2-d forecast field and observations
  - minimize misfit to observations
  - use nonlinear optimization, cost function gradient from adjoint of displacement
  - impose additional constraints on displacements: smoothness, non-divergence, etc.

# FCA (Grassotti et al. 1999) for IWV ( $\text{kg}/\text{m}^2$ )

- Katrina simulation valid 12 UTC 28 Aug



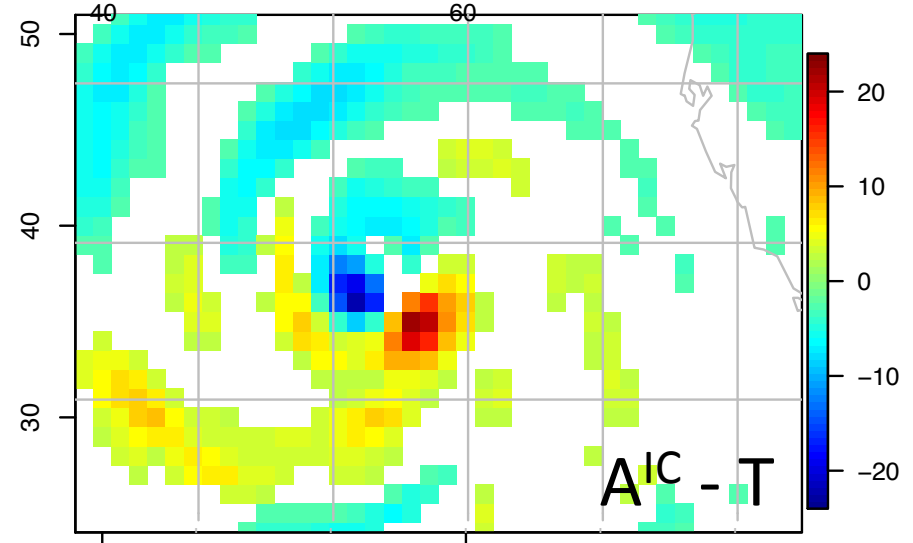
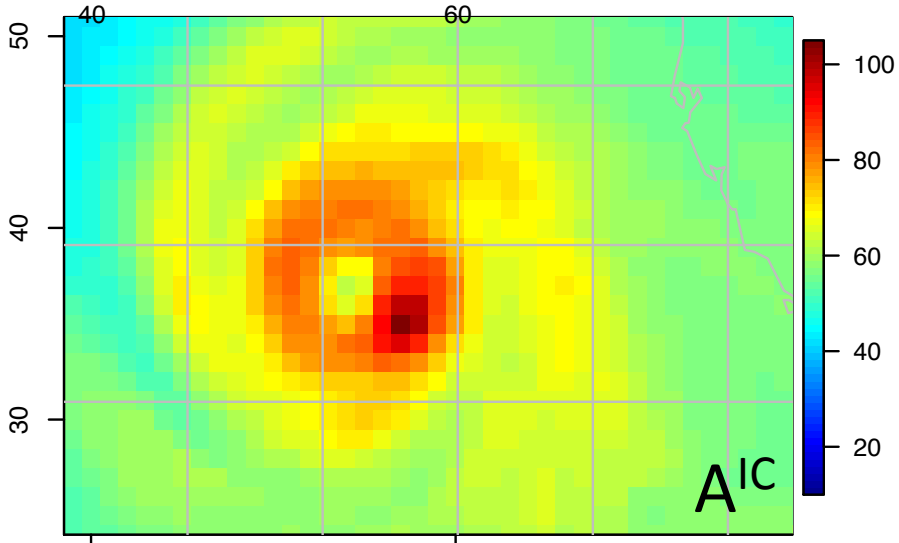
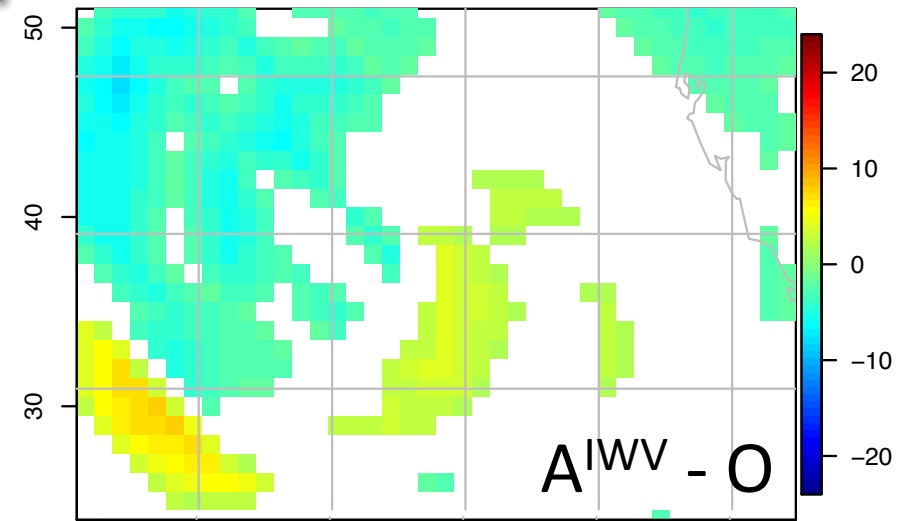
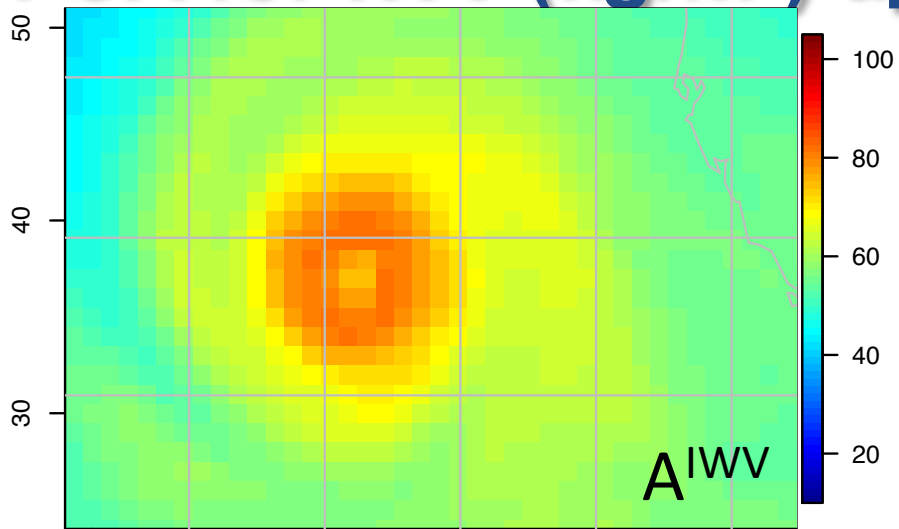
# FCA (Grassotti et al. 1999) for IWV ( $\text{kg}/\text{m}^2$ )



## Extend Hsiao et al. (2010) displacement algorithm for 3d model IC

- Goal is to apply 2d displacement vectors to 3d model fields without disturbing model balance
- Direct displacement of: winds (u,v,w), SLP, RH, hydrometeor mixing ratios, potential temperature
  - All along model surface, except
  - Potential temperature along constant height surfaces
- Recalculate derived quantities: pressure, specific humidity, temperature, hydrostatic geopotential, dry air mass
- Nonhydrostatic geopotential is not displaced

# FCA for IWV ( $\text{kg}/\text{m}^2$ ) applied to IWV and IC

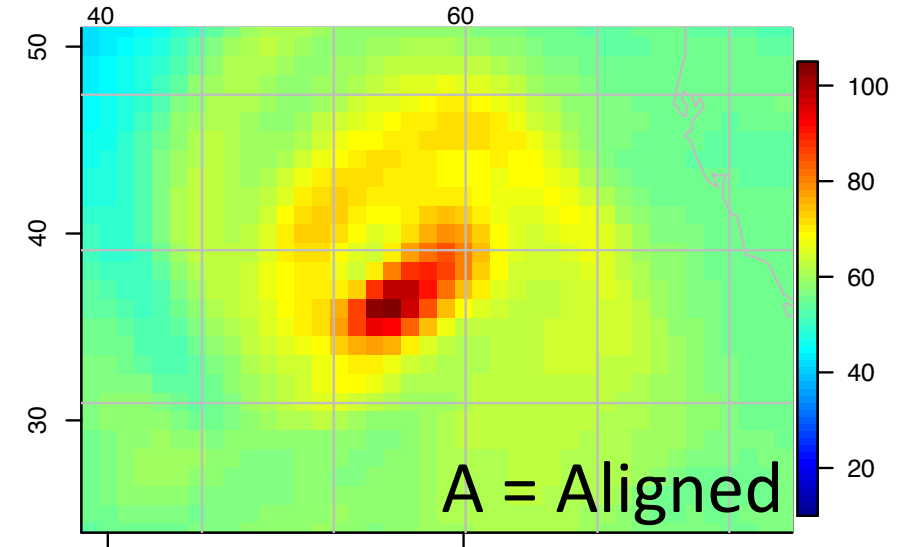
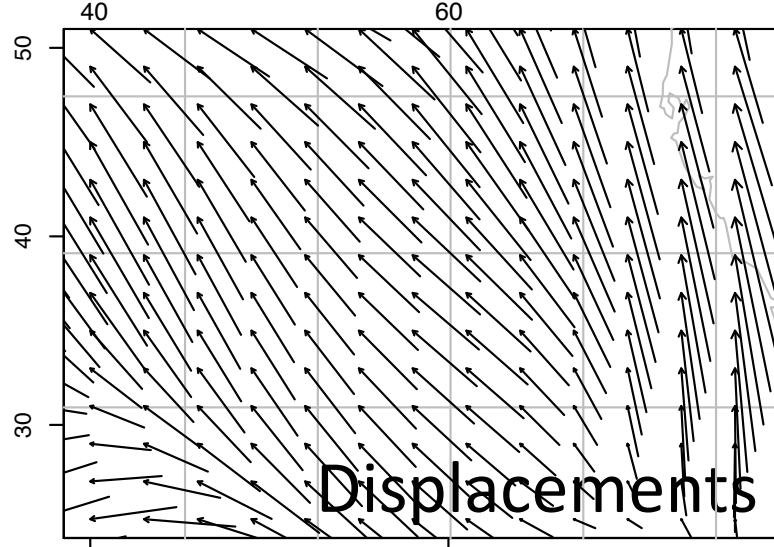
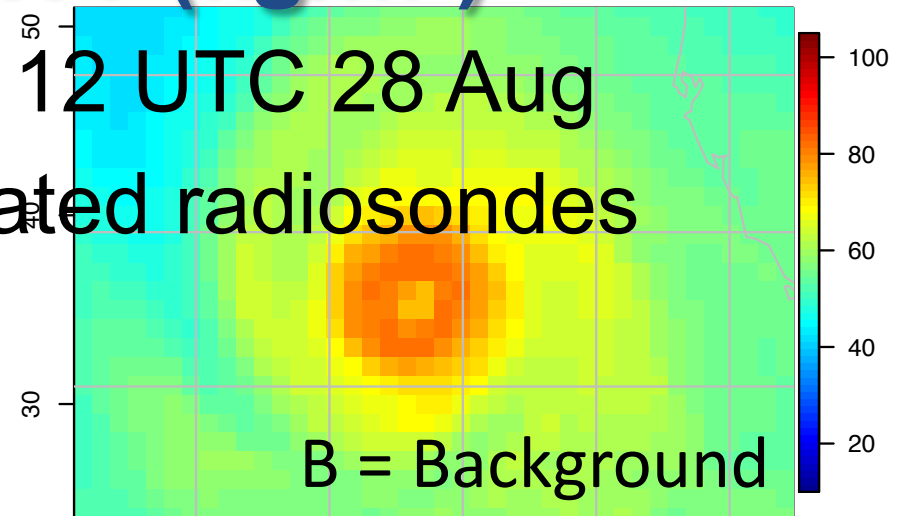
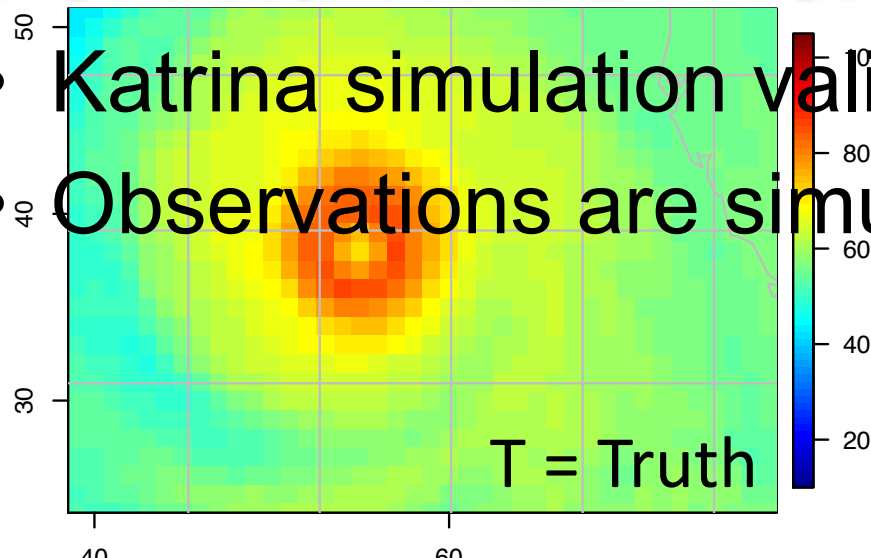


# WRFDA preprocessor implementation

- Hijack u and v for displacements
  - Background function measures size of displacements
- Apply displacement to 3-d model fields
  - Parallel implementation, inner loop linearized about current estimate of the displacements
- Otherwise standard 3dvar
  - Usual control variable, but only mid-level u, v are active
  - Existing minimization
    - Conjugate gradient in inner loop with linearized displacements; nonlinear adjustments in outer loop
  - Existing obs operators
    - Therefore this approach is applicable to all obs types supported by WRF Variational DA
    - Following example uses simulated “radiosondes”

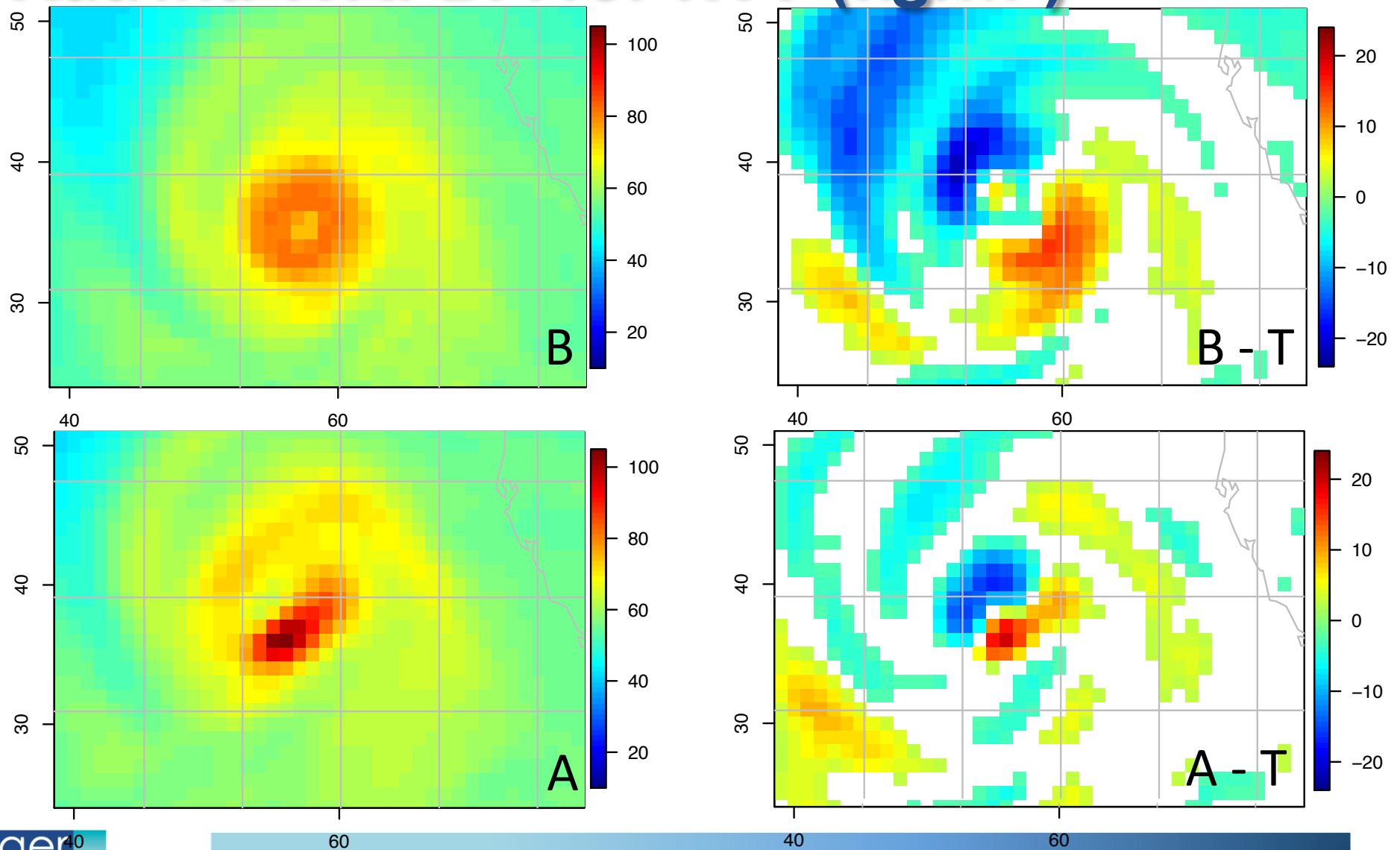
# FCA via WRFDA for IWV ( $\text{kg}/\text{m}^2$ )

- Katrina simulation valid 12 UTC 28 Aug
- Observations are simulated radiosondes

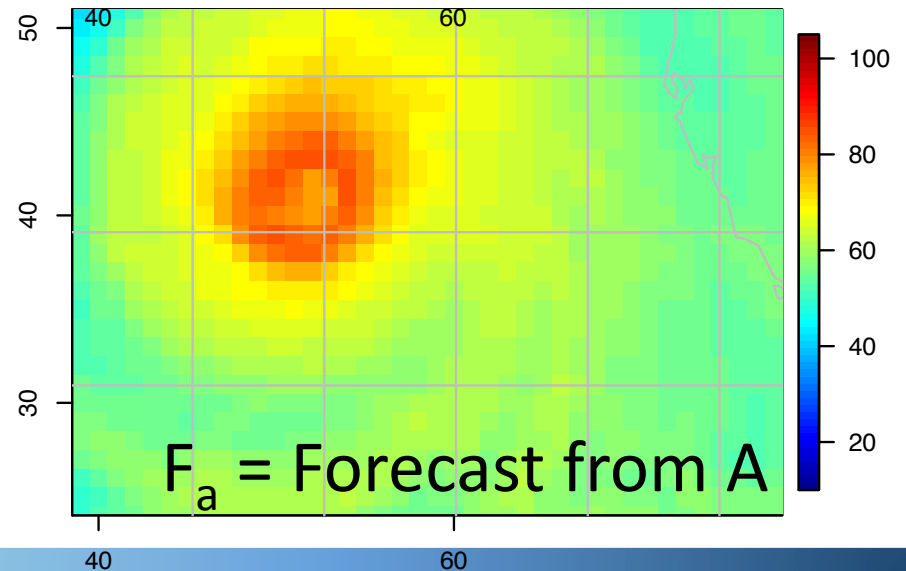
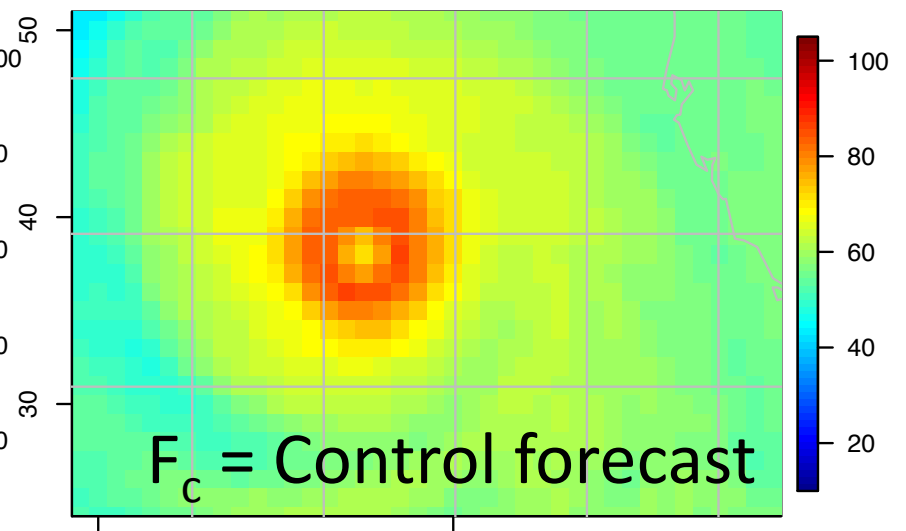
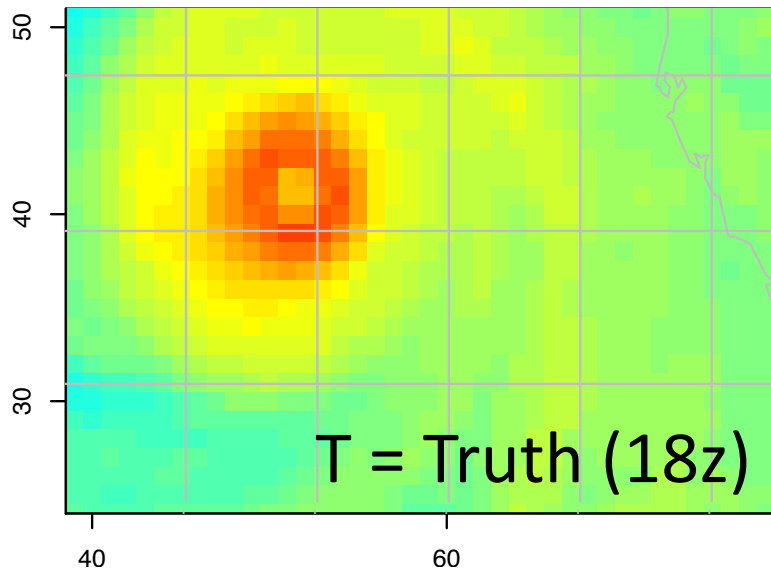




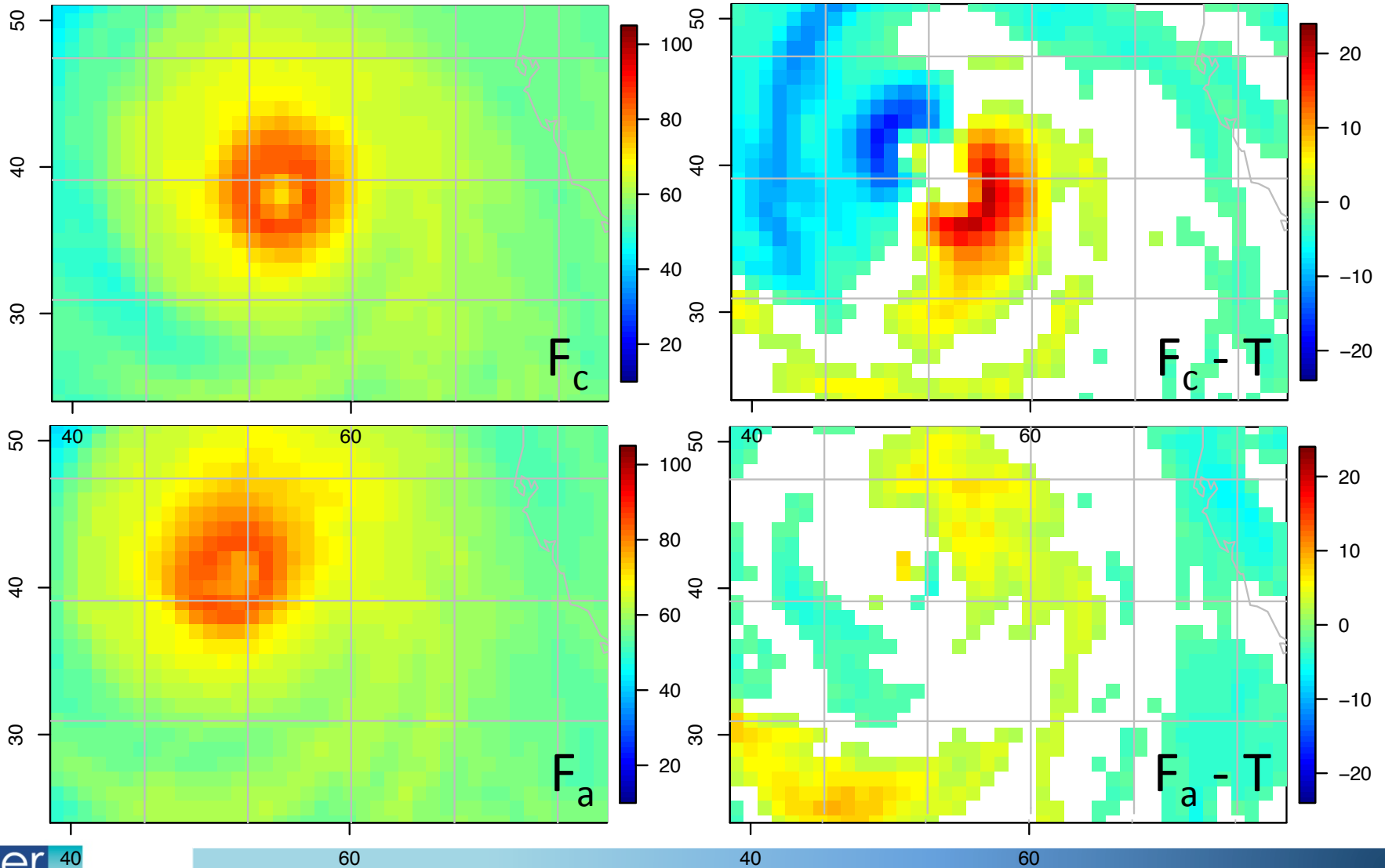
# Katrina WRFDA for IWV ( $\text{kg}/\text{m}^2$ )



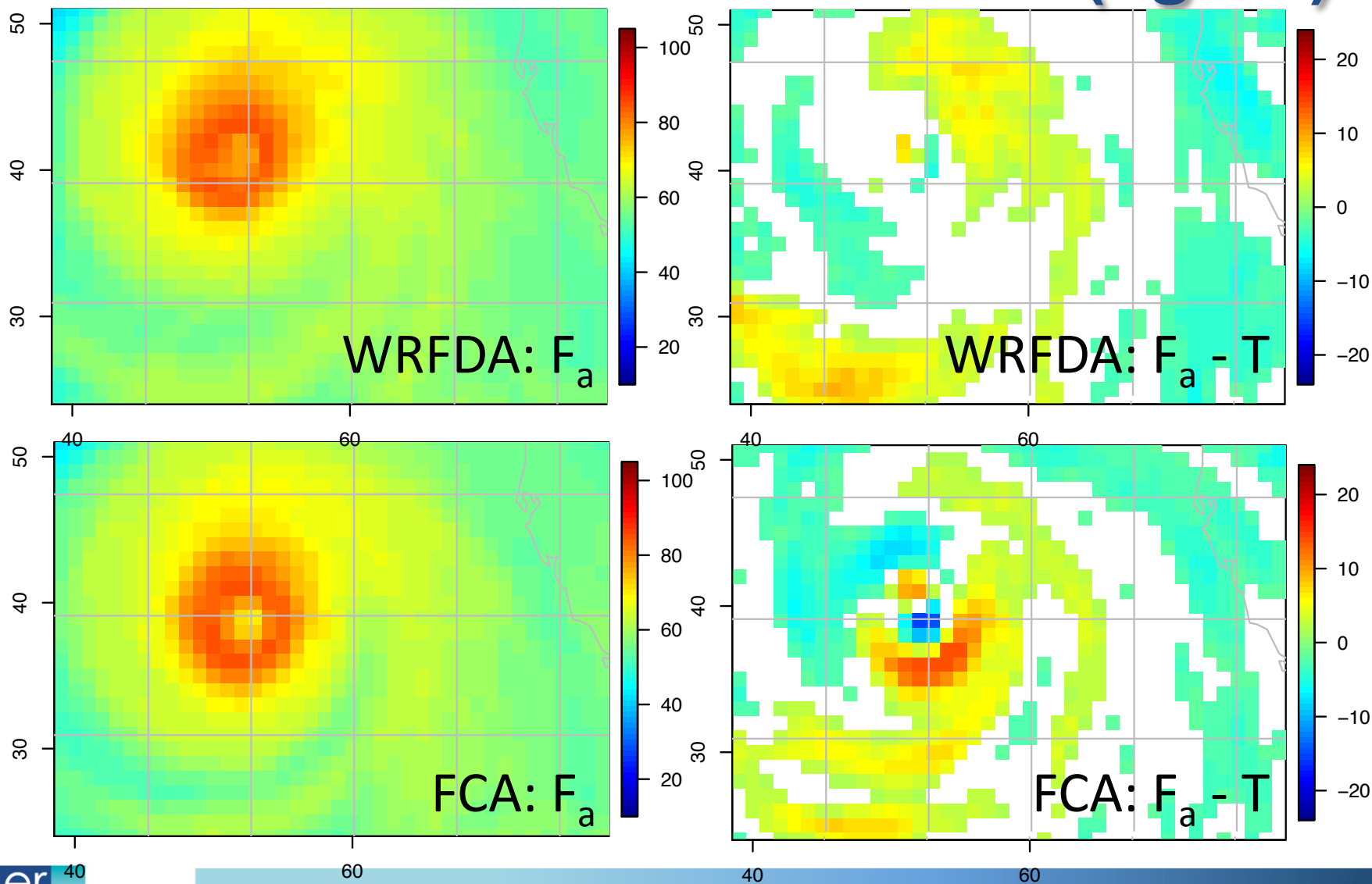
# Katrina WRFDA 6-h forecasts IWV ( $\text{kg}/\text{m}^2$ )



# Katrina WRFDA 6-h forecasts IWV ( $\text{kg/m}^2$ )

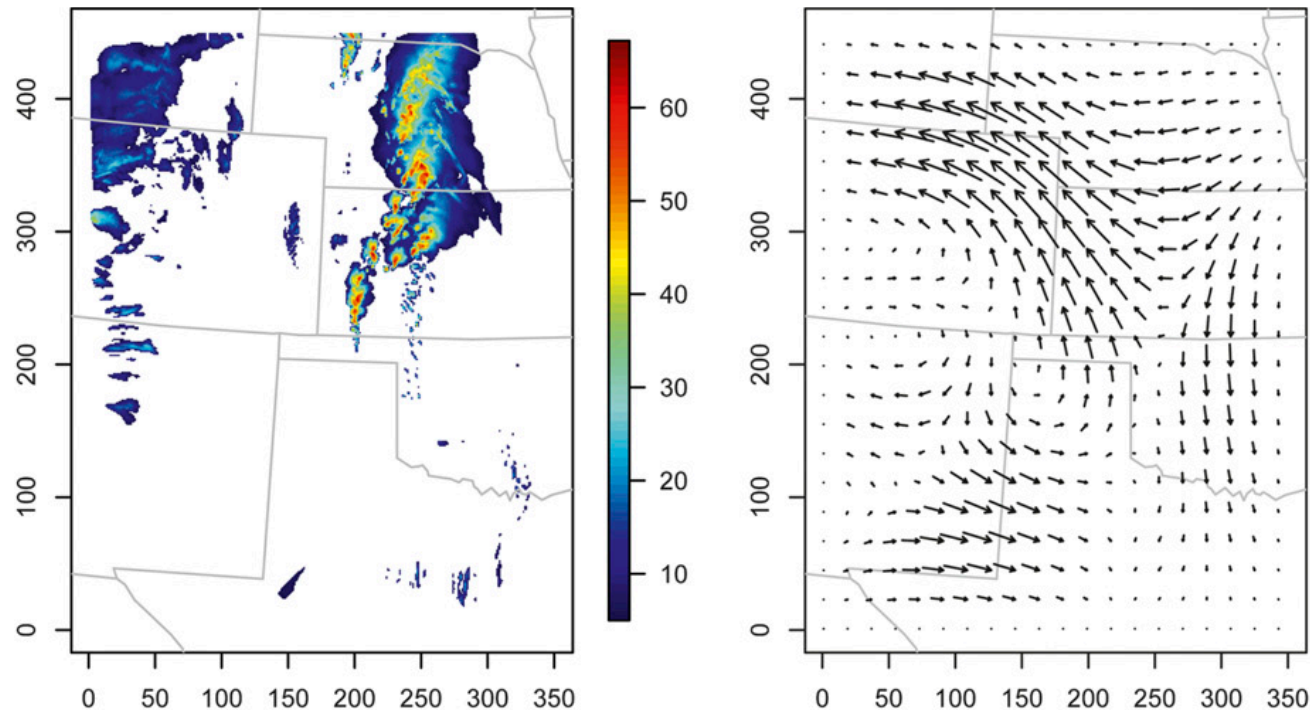


# Katrina FCA 6-h forecasts IWV ( $\text{kg}/\text{m}^2$ )



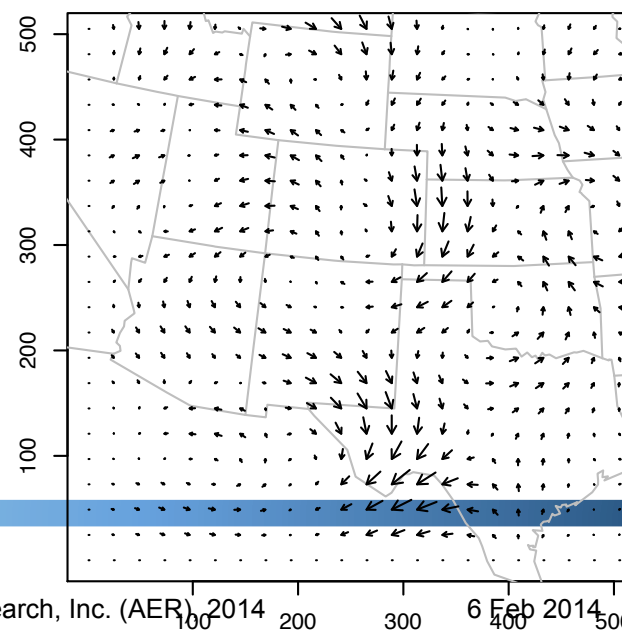
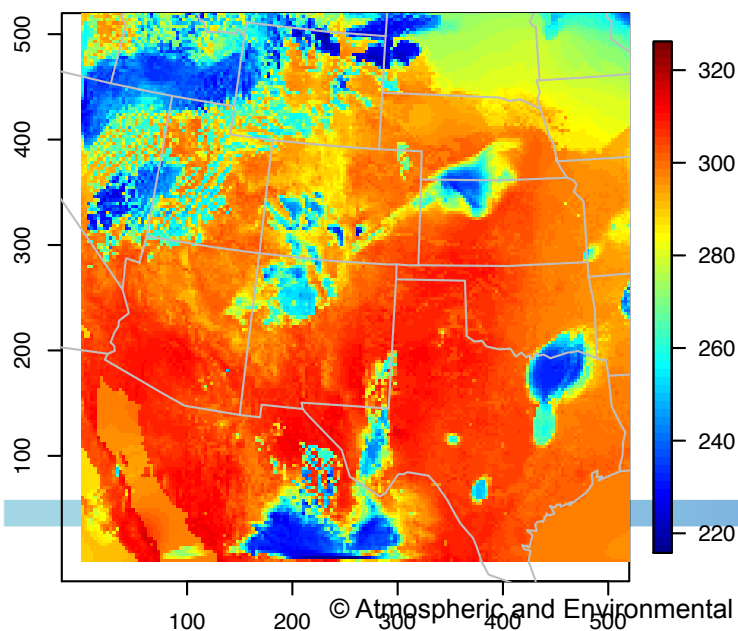
## FCA and ensemble errors for composite reflectivity (dBZ)

- FCA reduces variance and increases spatial scales of errors
- Use ensemble median in place of ensemble mean to preserve small scale detail
- 30 member background ensemble of 6-h 3-km WRF forecasts valid 04 UTC 28 Mar 2007



# FCA for AIRS (window) channel 787

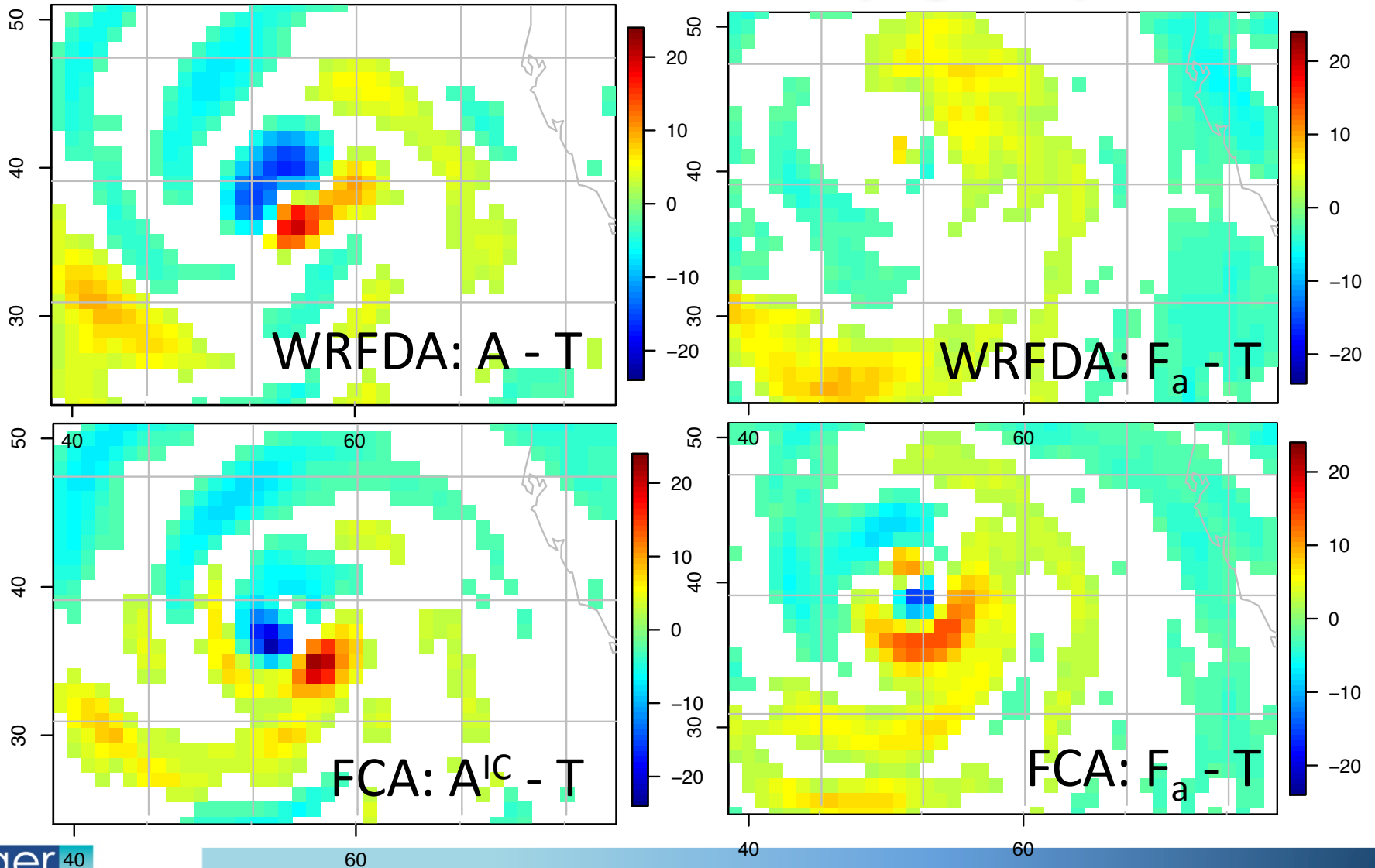
- Clouds stand out as cold in this channel
- Background is 2-h 4-km WRF forecast with explicit convection valid 20 UTC 6 Jun 2009
- Brightness temperatures derived from CRTM using the WRF forecast variables, including CLW, ice, rain, etc.
- After adjustment background and obs have stronger correlations for window channels



# Conclusions

- 2d FCA displacements can be applied to a full model state
- Standard 3dVAR of  $u$  and  $v$  can be hijacked to yield displacements
  - Nominal covariances for  $u$  and  $v$  are satisfactory in TC case
- Using 3d “radiosonde” data in WRFDA improves forecast relative to using IWV in stand alone FCA
  - Even though IC for IWV are poorer
- FCA can explain a sizeable fraction ( $>10\%$ ) of variance for a background ensemble of radar observations (dBZ)
- For real data cloudy window radiances FCA noticeably reduces errors, but is limited by the background accuracy

# Katrina differences IWV ( $\text{kg}/\text{m}^2$ )





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## Future work

- Tune / Derive background error covariances for displacement vectors
- Extend control vector for simultaneous application of additive/displacement corrections
- Improve short-term cloud forecasting with 2-h cycle of WRFDA using GEO imagery in FCA

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# Thank you

- Support from USAF as part of NCAR's advanced cloud analysis and forecast system (ACAPS)
- Grassotti et al., 1999, JAMC, [doi:10/fprb35](https://doi.org/10.1029/1998JD10335)
- Hsiao et al., 2010, MWR, [doi:10/bktnst](https://doi.org/10.1175/2009JCLI3688)
- Nehr Korn et al., 2014, MWR, [doi:10/p5d](https://doi.org/10.1175/JCLI12092500)
- [ross.n.hoffman@aer.com](mailto:ross.n.hoffman@aer.com)