

# Modeling the evening ionosphere with data assimilation techniques during pre-storm and storm days of March 2015

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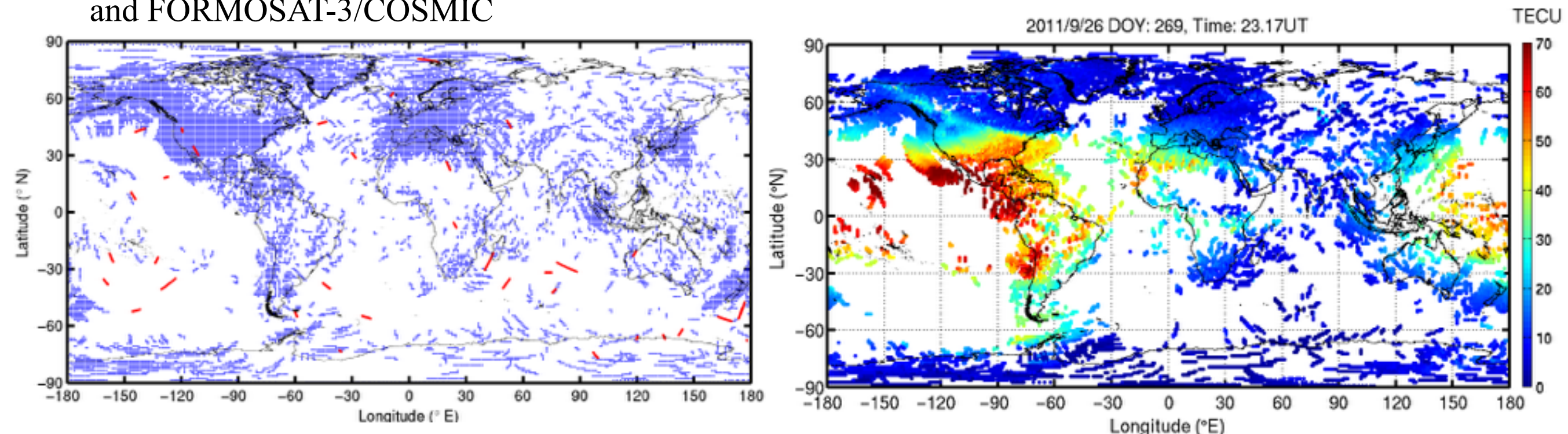
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Global distribution of ground-based GNSS and FORMOSAT-3/COSMIC

26 September 2011 Geomagnetic Storm



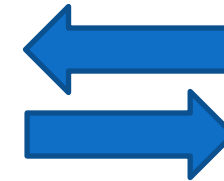
# Ionospheric Data Assimilation Models

## Observations

- Ionosonde/digisonde
- ISR
- GPSTEC
- GPS RO
- IVM
- Airglow/EUV Imager

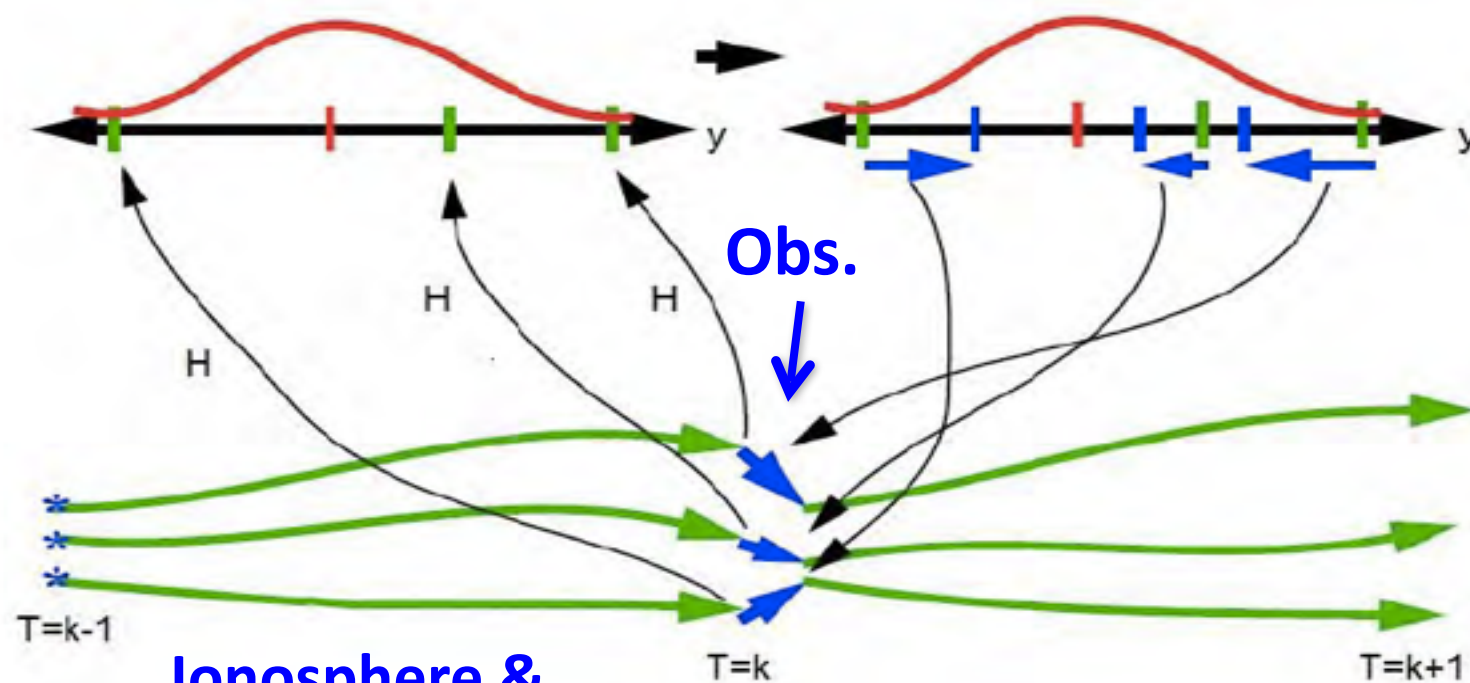
## Method

- 3D-Var
- 4D-Var
- KF
- EnKF
- LETKF



## Model

- [O]
- [U]
- [V]
- [TN]
- [O<sup>+</sup>]
- [Ne]
- FPFIM
- IFM
- IPM
- TIEGCM
- SAMI-3
- GAIA



Ionosphere &  
thermosphere  
model

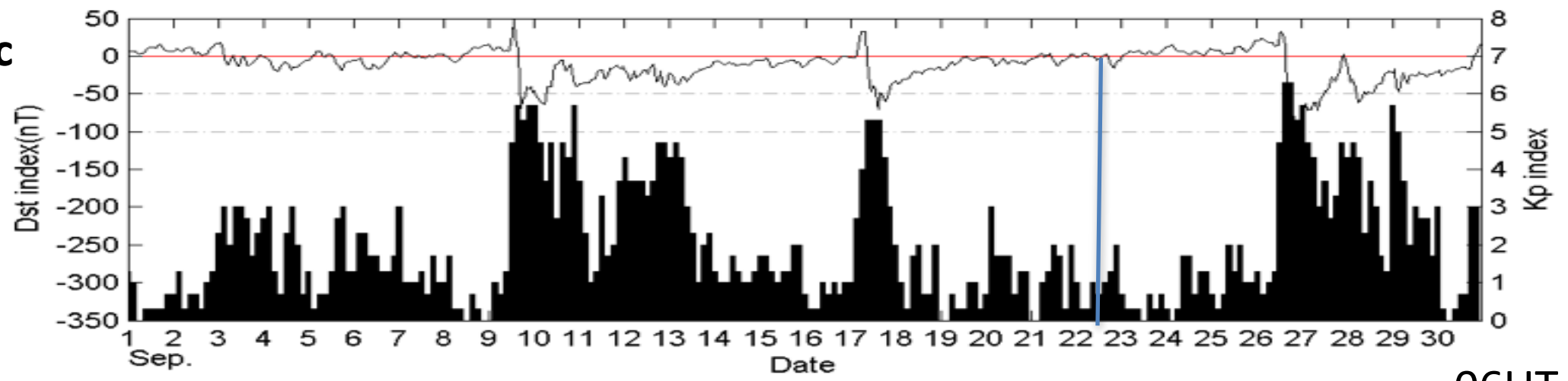
### State variables:

neutral temperature (TN),  
oxygen density (O),  
neutral zonal wind (U),  
meridional wind (V),  
[O<sup>+</sup>] ion density

### DART-TIEGCM:

90 theoretical ensemble model runs:  
solar flux (F10.7),  
cross-tail potential  
hemispheric power (Kp)

# Moderate Magnetic Storm September 2011



00UT

2011.269 UT:00

2011.269 UT:02

2011.269 UT:04

2011.269 UT:06

06UT

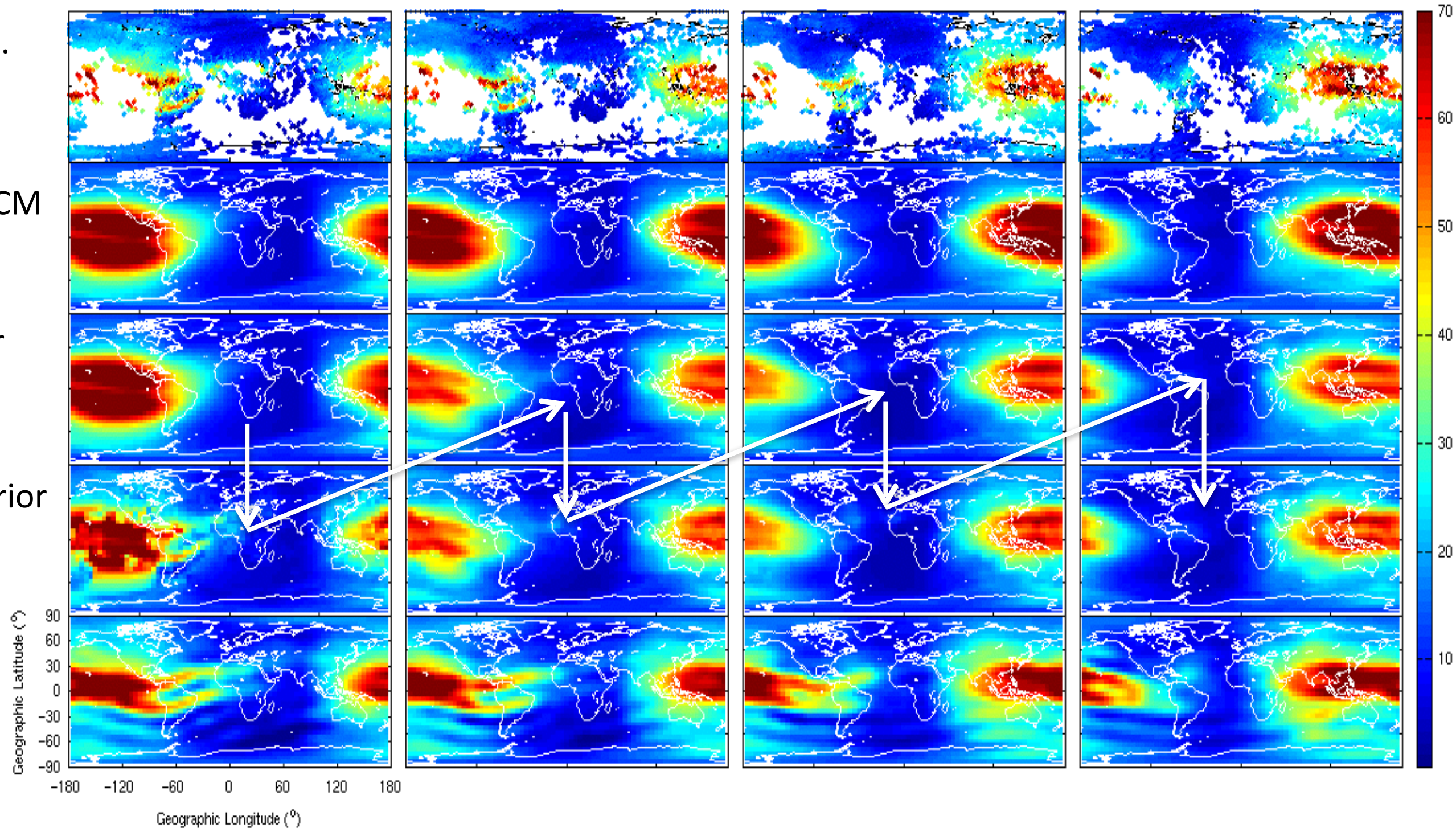
Obs.

TIE-GCM

Prior

Posterior

GIM

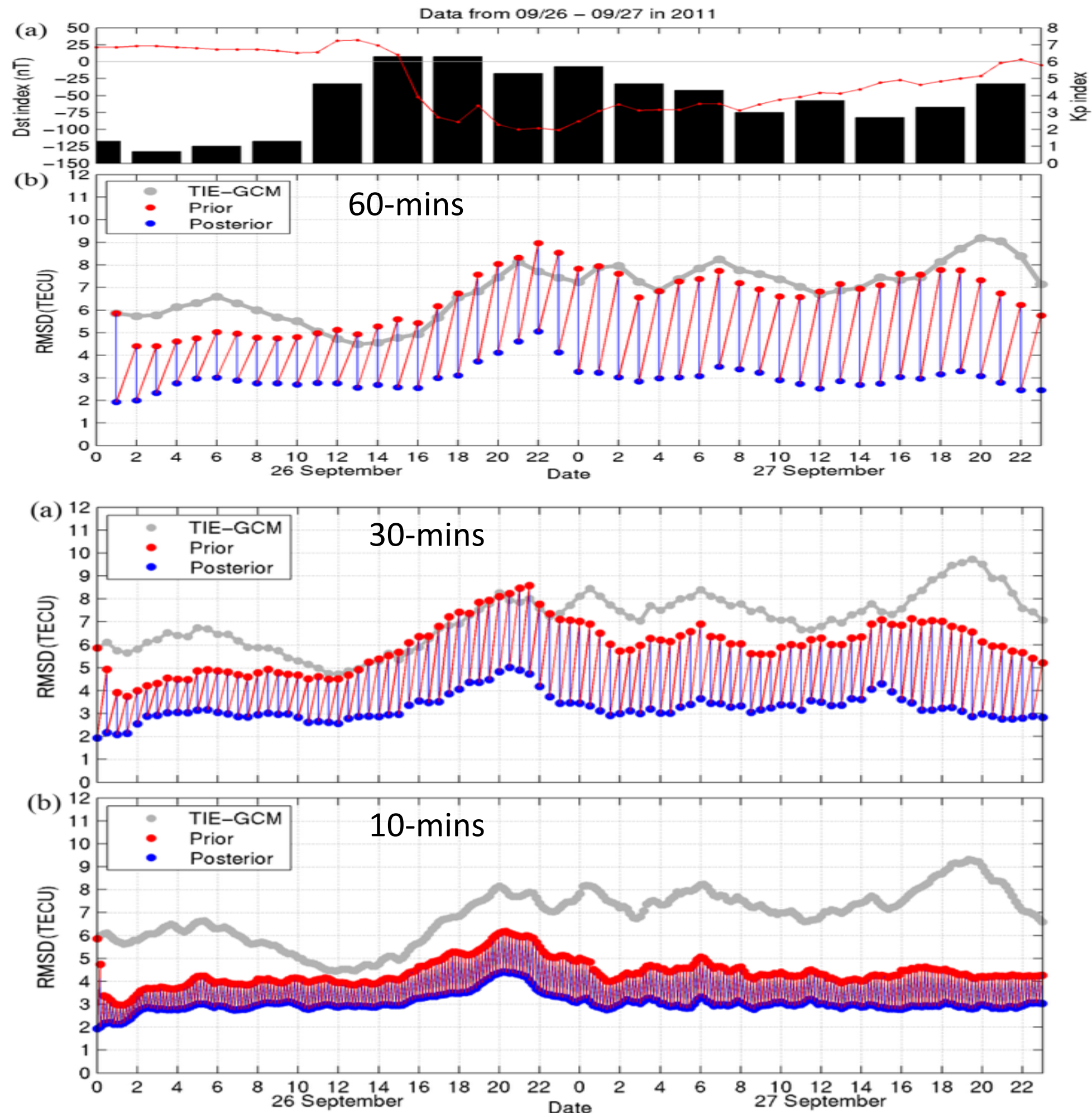


**90 ensembles:**  
 F10.7,  
 Cross-tail Potential,  
 hemispheric Power  
 (Kp)  
 → **Random**

**State variables:**  
 (TN),  
 (O),  
 (U),  
 (V),  
 [O<sup>+</sup>]

*if the assimilation  
 cycle is 60 mins.,  
 the result is similar  
 to or worse than NO  
 assimilation.*

*Chen et al., (2016)*

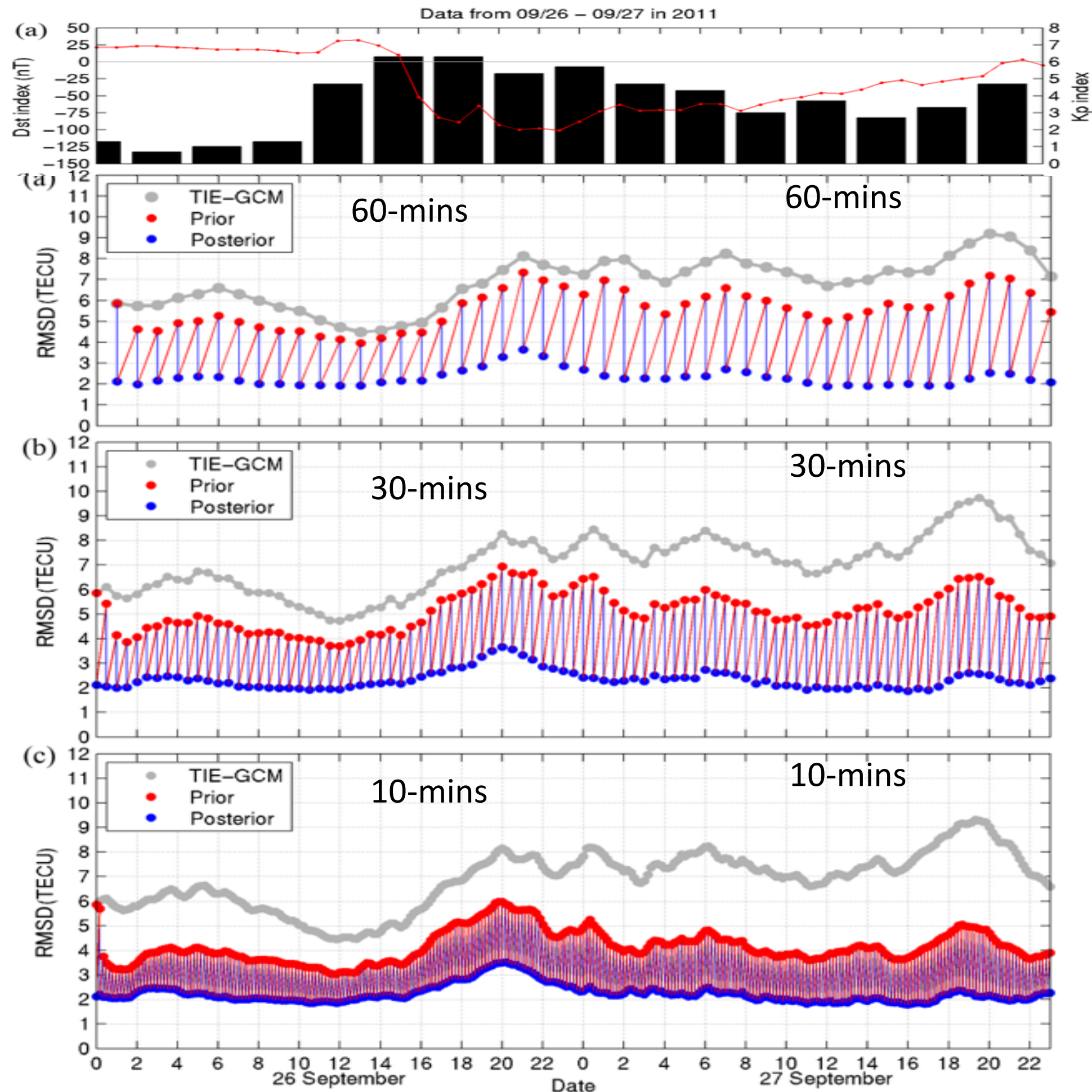


**90 ensembles:**  
 F10.7,  
 Cross-tail Potential,  
 hemispheric Power (Kp)  
 → **Random**

**State variables:**  
 $[O^+]$

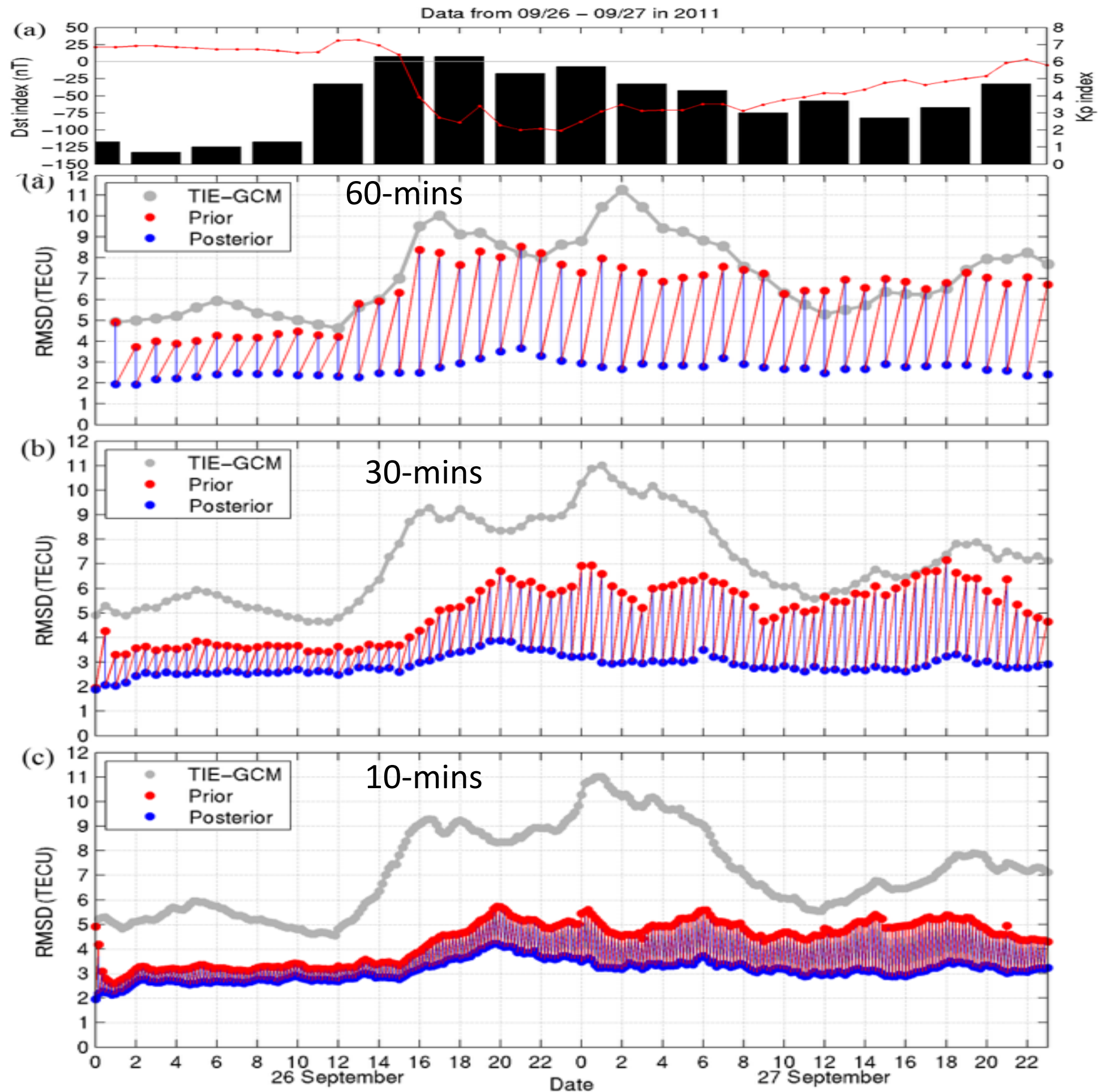
*if the state variable  
 is only  $[O^+]$ , the  
 variations of  
 forecast/nowcast  
 follows the  
 background model.*

*Chen et al., (2016)*



**90 ensembles:**  
 F10.7,  
 Cross-tail Potential,  
 hemispheric Power (Kp)  
 → **Realistic +  
 small perturbation**

**State variables:**  
 (TN),  
 (O),  
 (U),  
 (V),  
 [O<sup>+</sup>]



# Assimilation for 2015 St. Patrick Storm

- Diff. high lat. forcing
- Heelis & Weimer
- 10-mins cycle

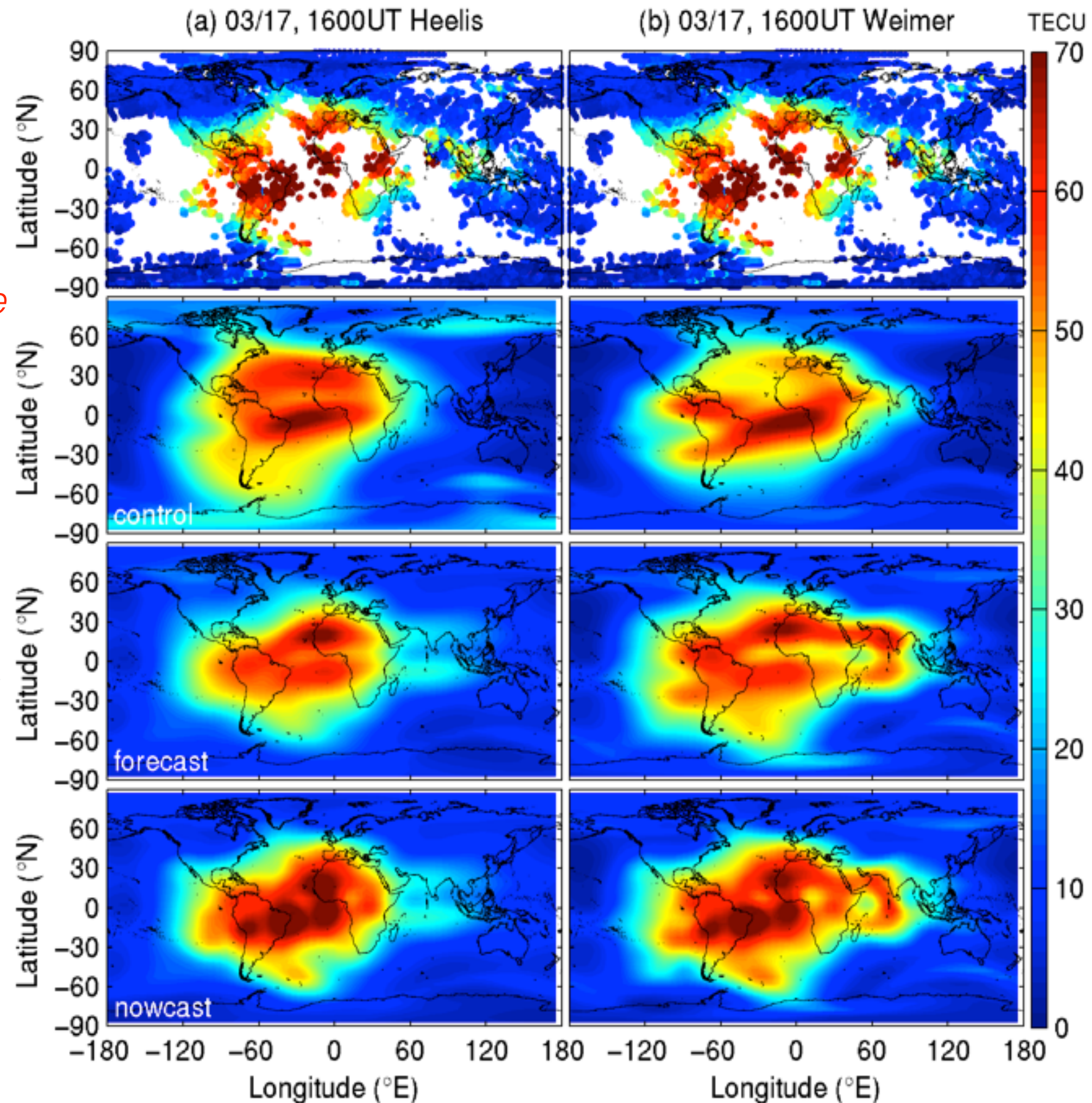
*Chen et al., 2016 shows that if assimilation cycle is 60 mins., the result is similar to or worse than NO assimilation.*

- Un-obs. state var.  
Tn, V, U, [O], [O<sub>2</sub>]  
adjusted based on each of  
their relationships with TEC  
*[Matsuo et al., 2012; Lee et al.,  
2012; Hsu et al., 2015; Chen et al.,  
2016]*

- Indicating importance of  
driving force of the  
background model

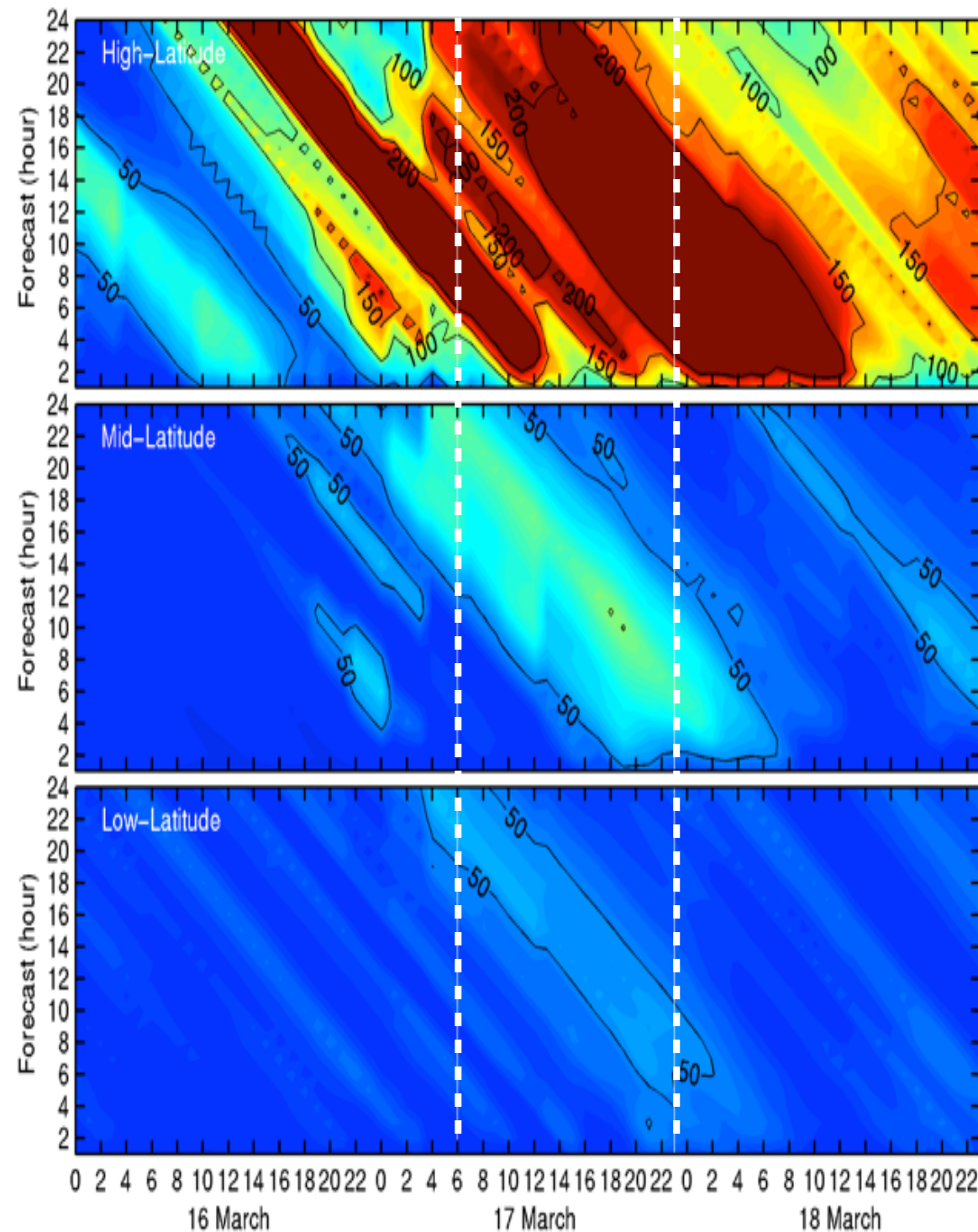
## High Lat. Forcing

### Heelis Weimer



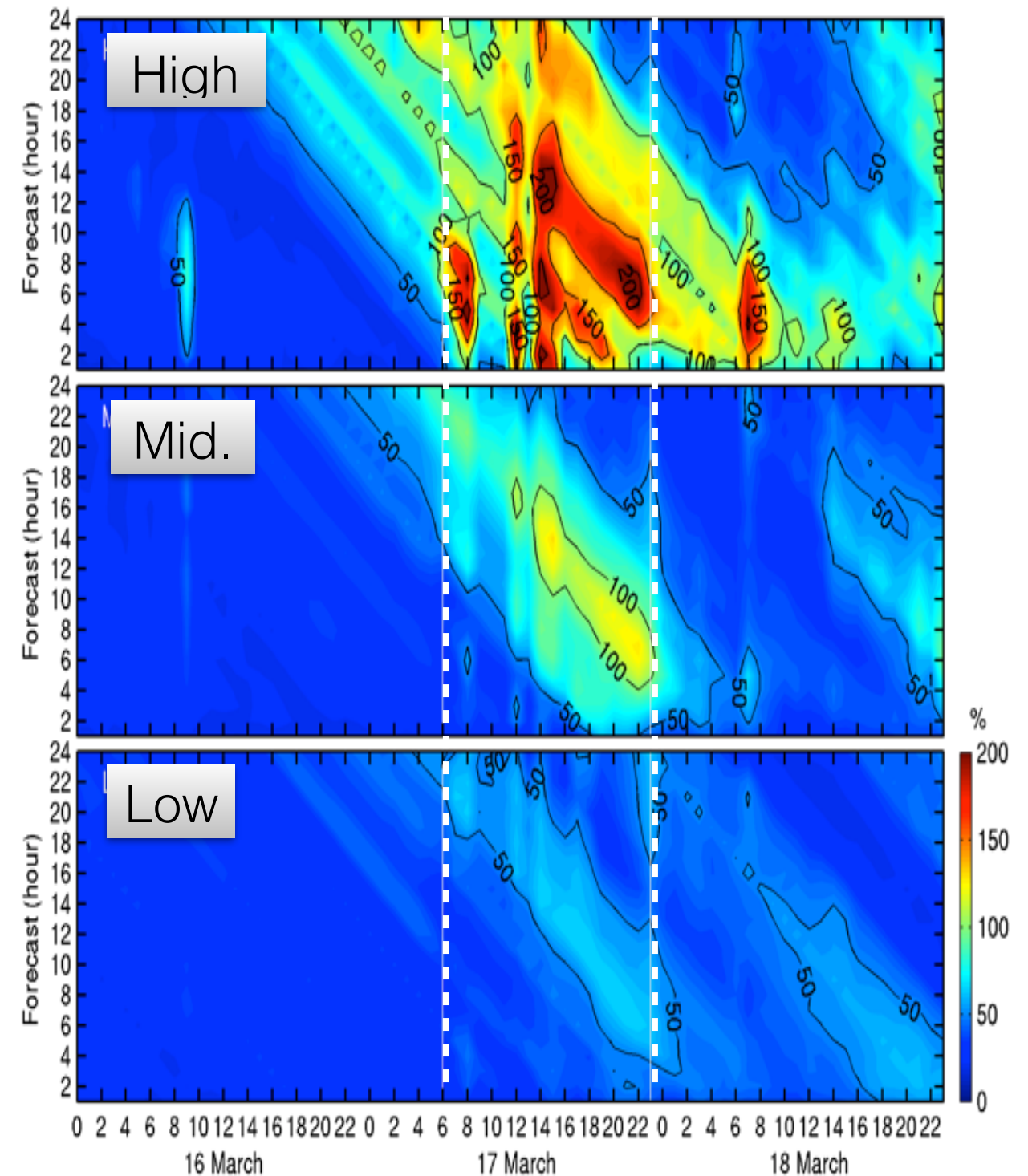
# 12-hour forecast time/error @ various latitudes

DART/TIEGCM-Heelis

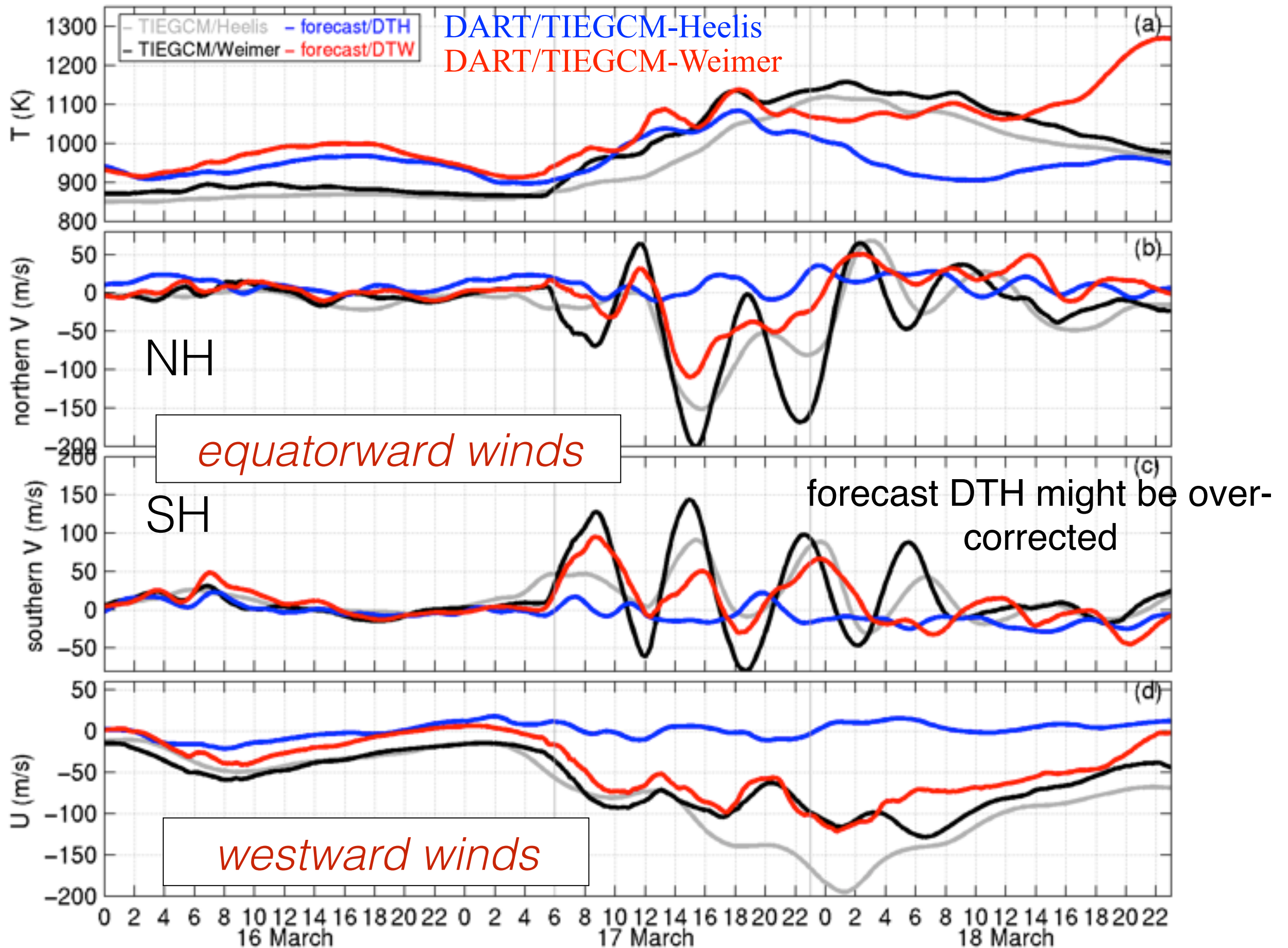


$$RMSD = \sqrt{\frac{\sum_{i=1}^n (x_{obs,i} - x_{model,i})^2}{n}}$$

DART/TIEGCM-Weimer



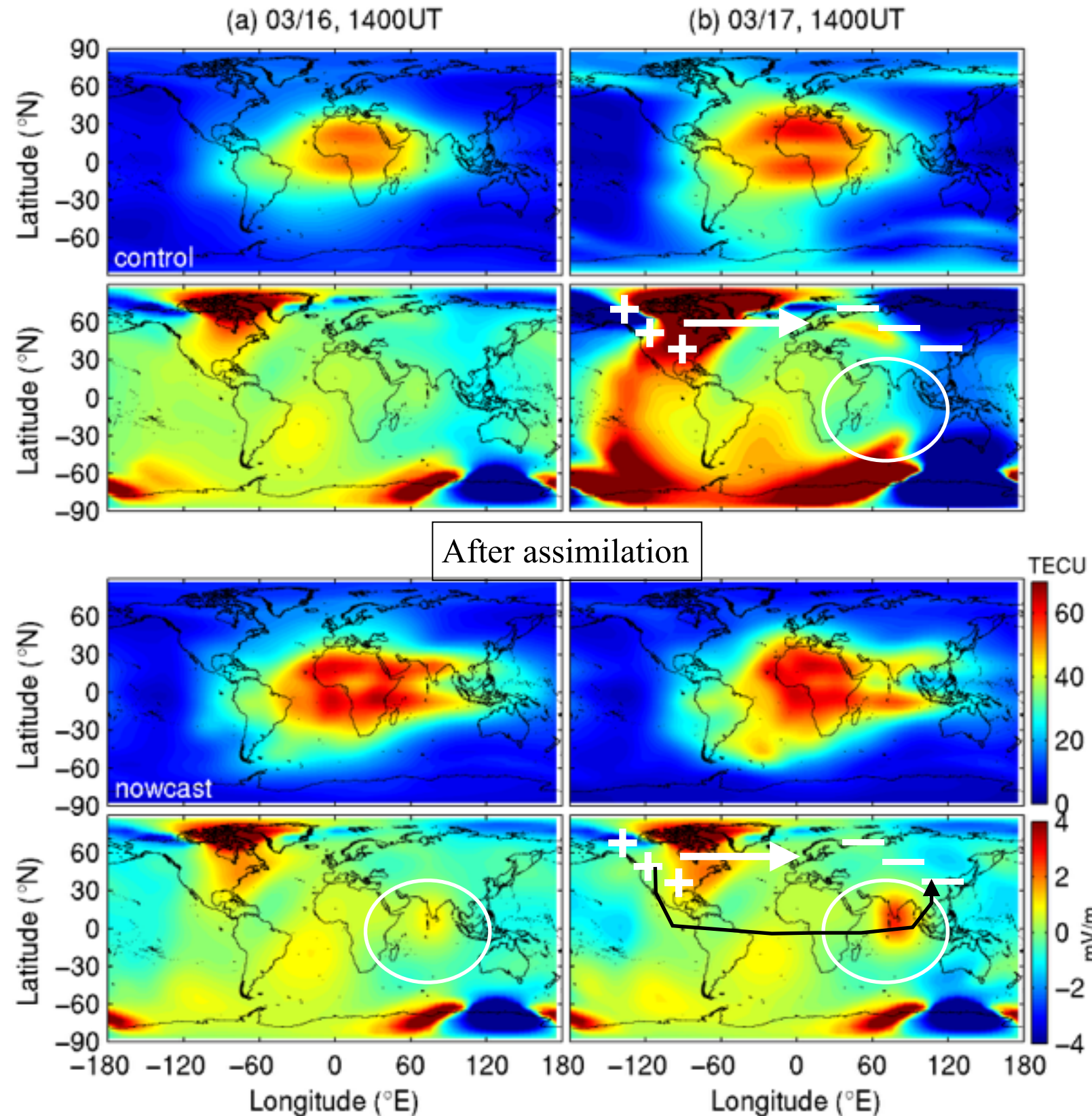
# Adjustments of un-observed state variables



# Storm-time eastward E-field adjustments

2015 St. Patrick's Day storm (17 March)

without assimilation

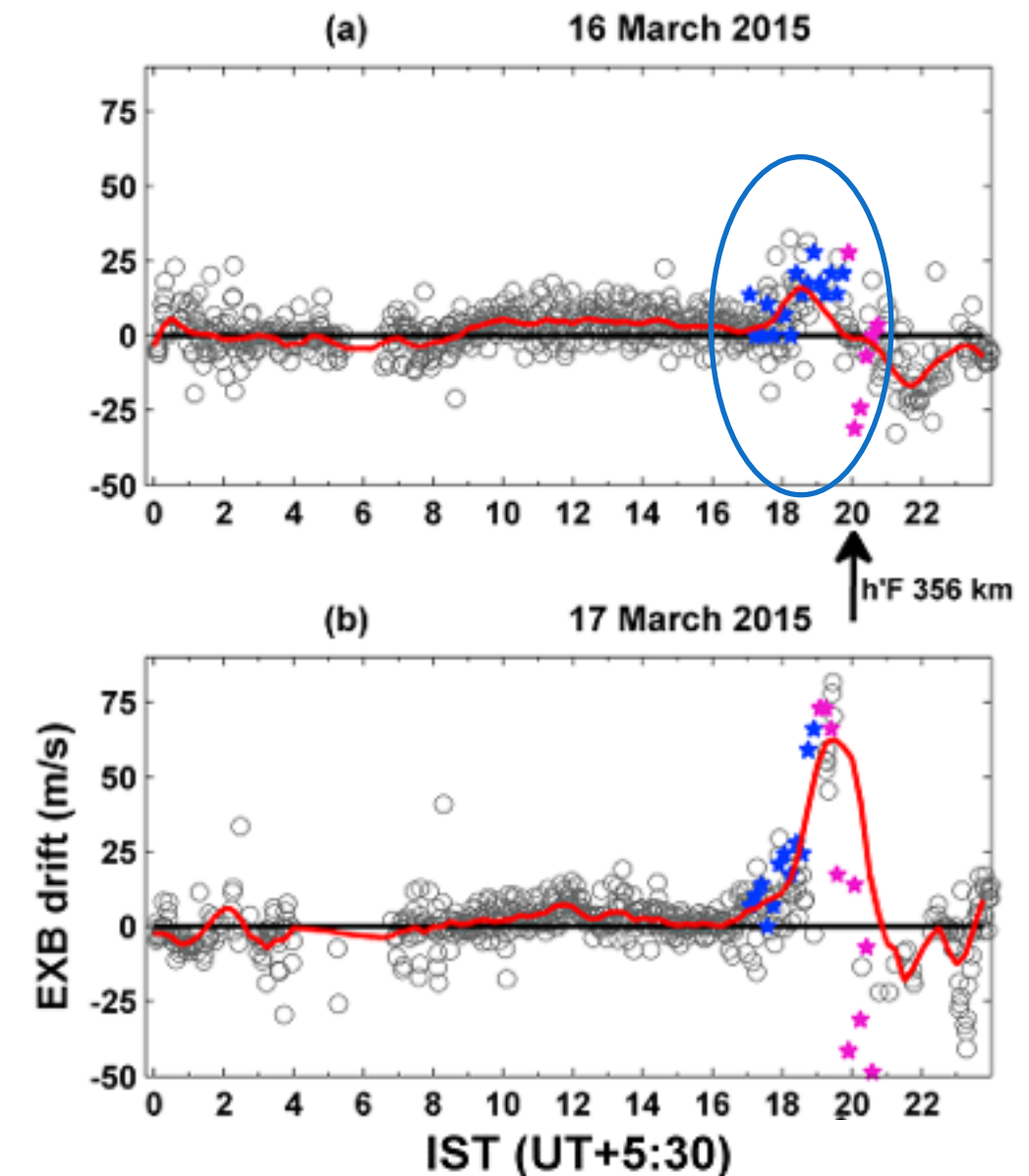


After assimilation

Ionosonde-derived PRE vertical drifts

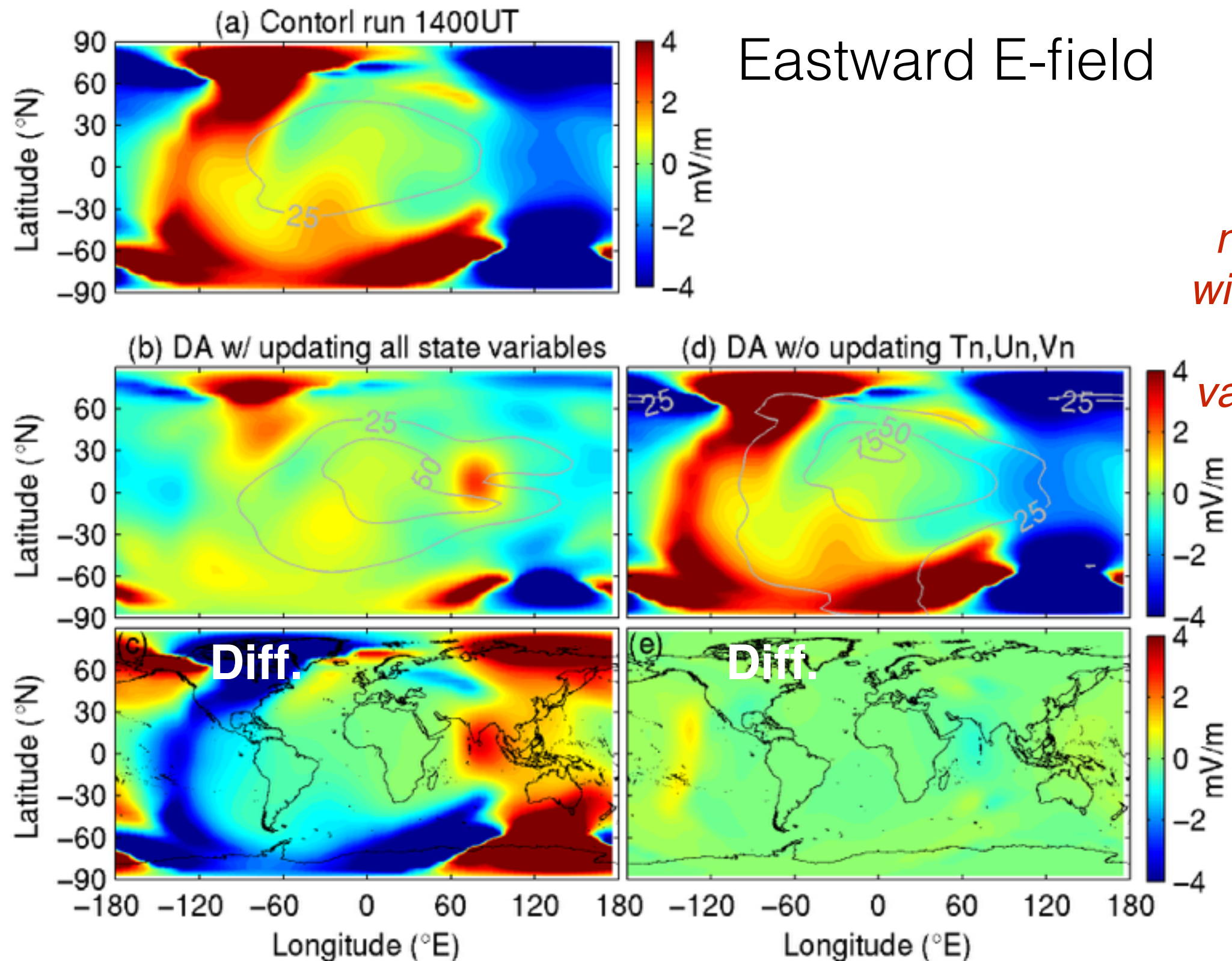
Joshi et al., [2016]

- Heelis model as high latitude convection specifications.
- Dusk eastward E-field appears after assimilation of TECs.
- **ExB @ dusk of 16/17 March**  
Heelis ~ 31 / 78.8 m/s  
Weimer ~ 25 / 129.4 m/s



*Storm-time eastward E-field adjustments are affected when  
**neutral winds** are state variables*

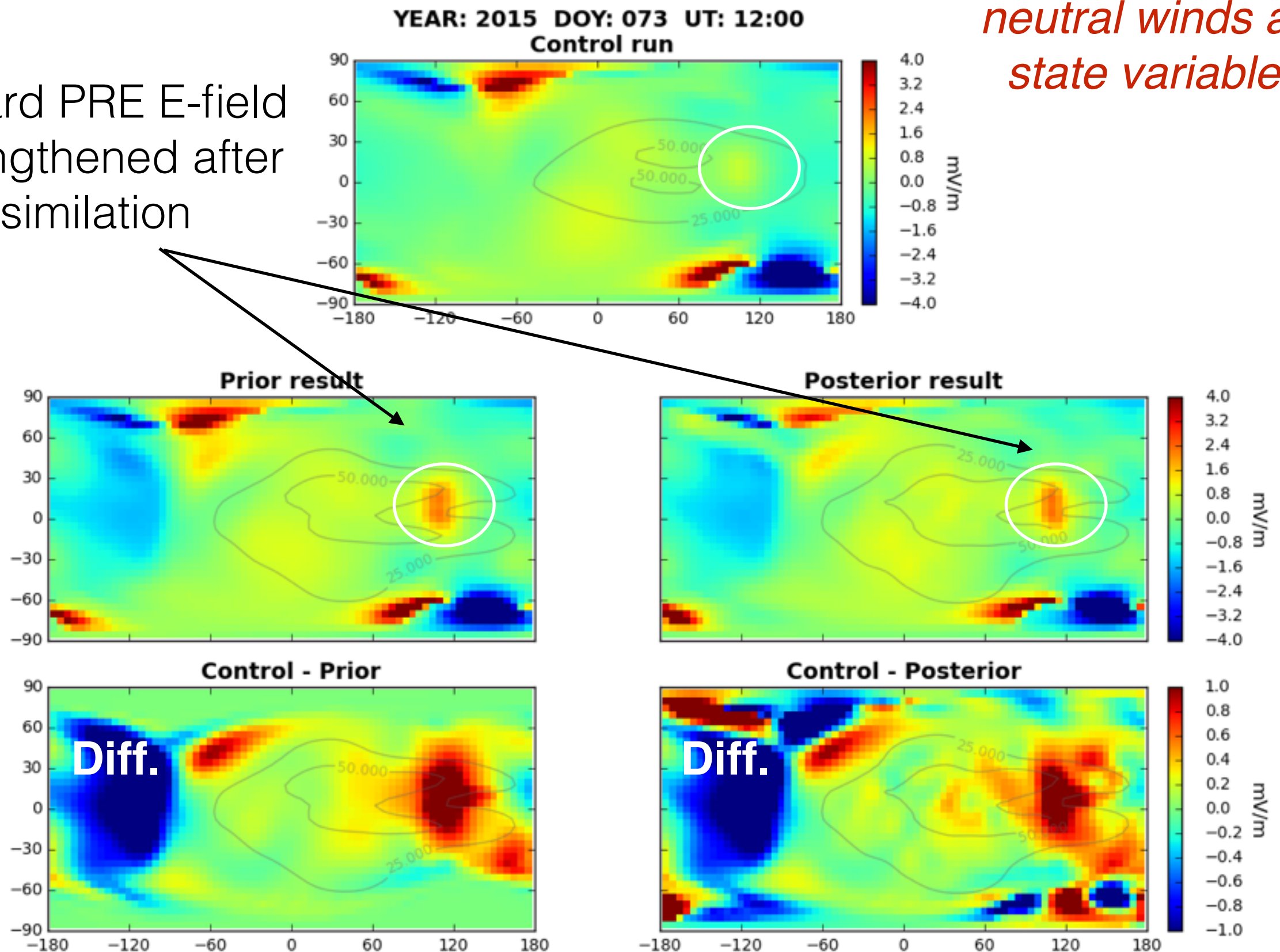
*neutral  
winds are  
state  
variables*



3-days before the storm, **during quiet time** (14 March 2015)

Eastward PRE E-field  
is strengthened after  
assimilation

*neutral winds are  
state variables*

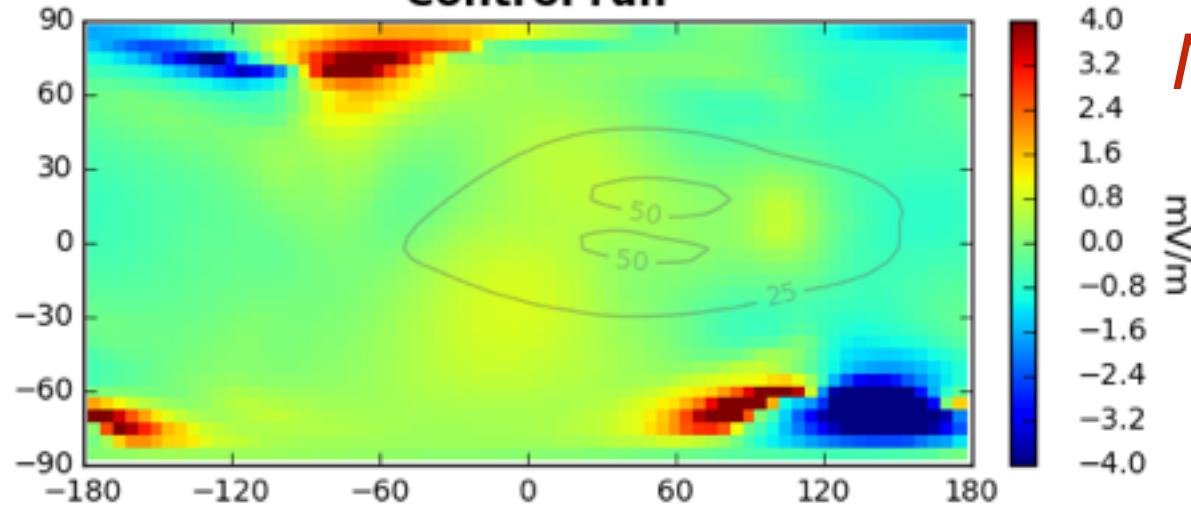


3-days before the storm, **during quiet time** (14 March 2015)

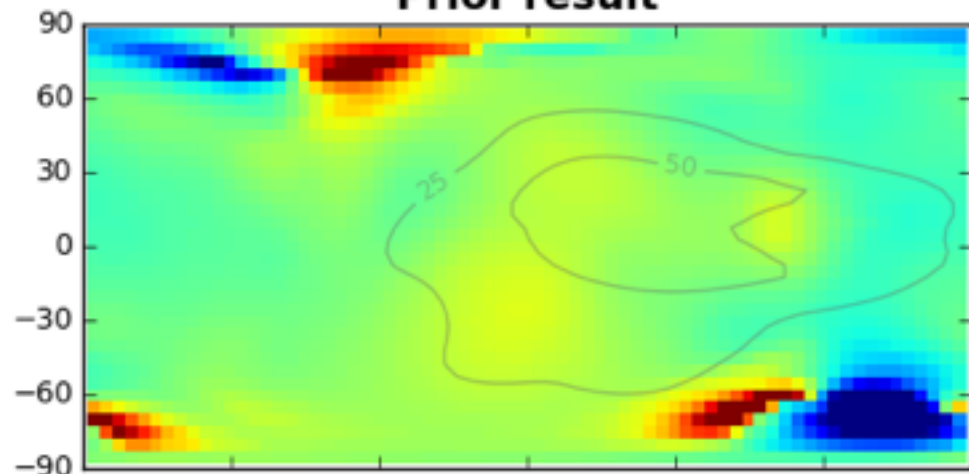
Eastward PRE E-field  
remains weak after  
assimilation

*neutral winds are  
NOT state variables*

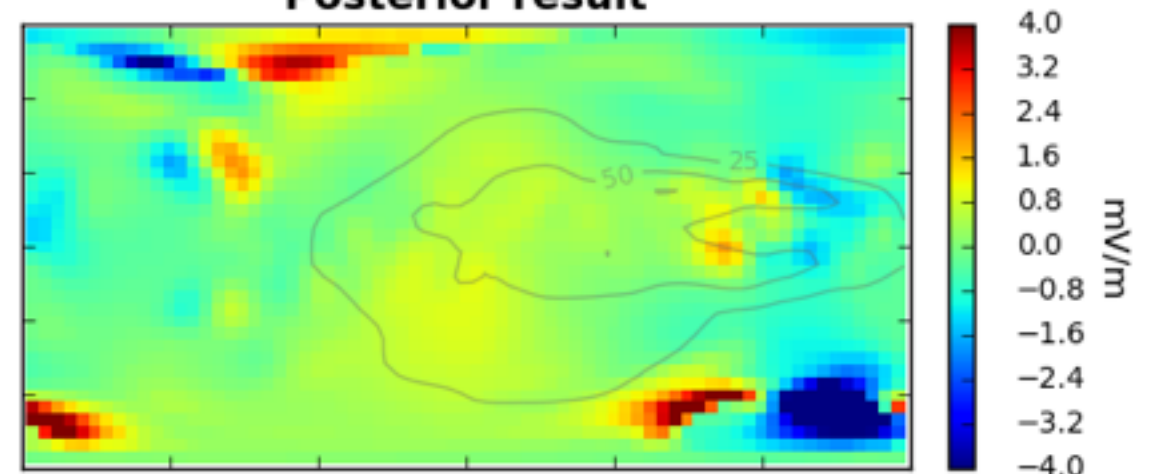
YEAR: 2015 DOY: 073 UT: 12:10  
Control run



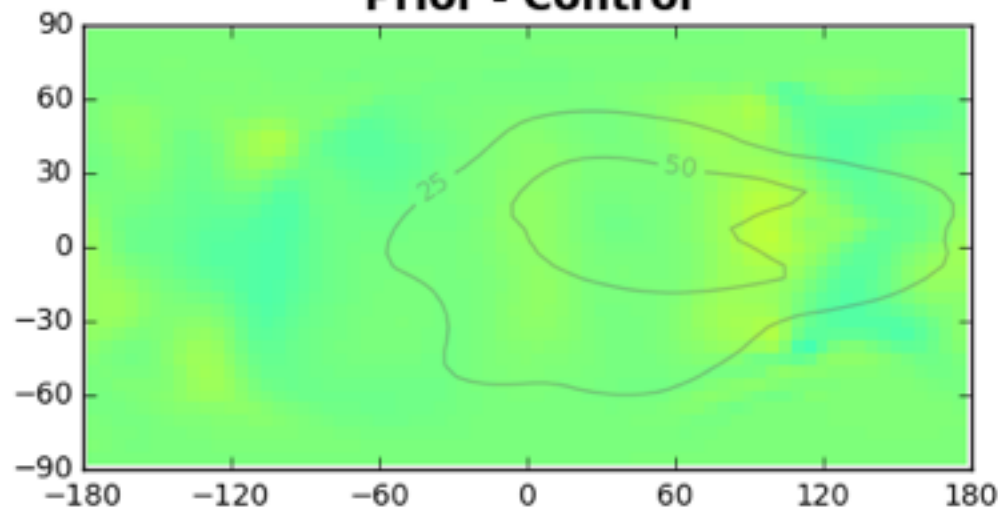
Prior result



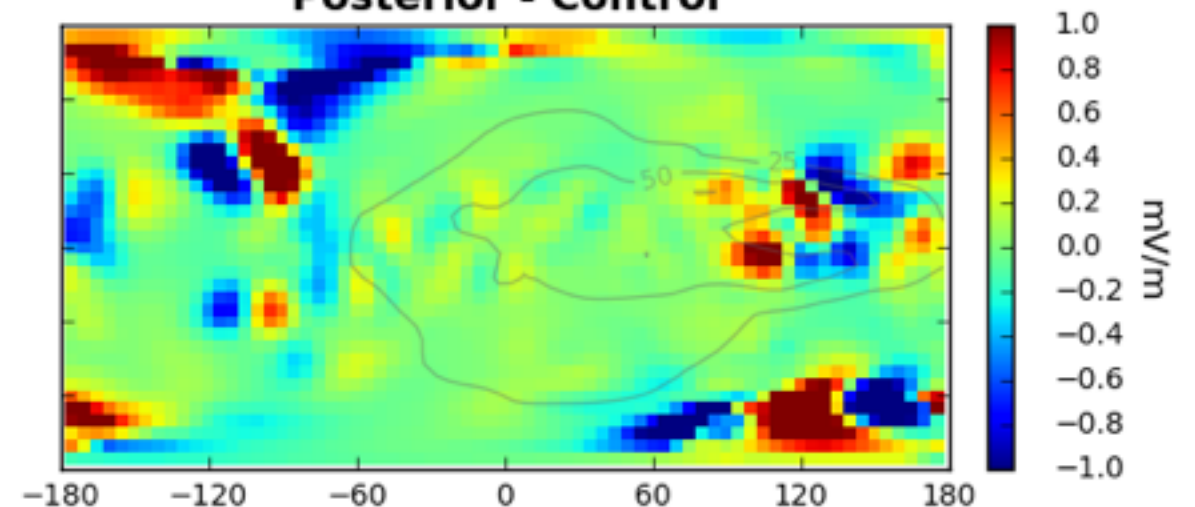
Posterior result



Prior - Control



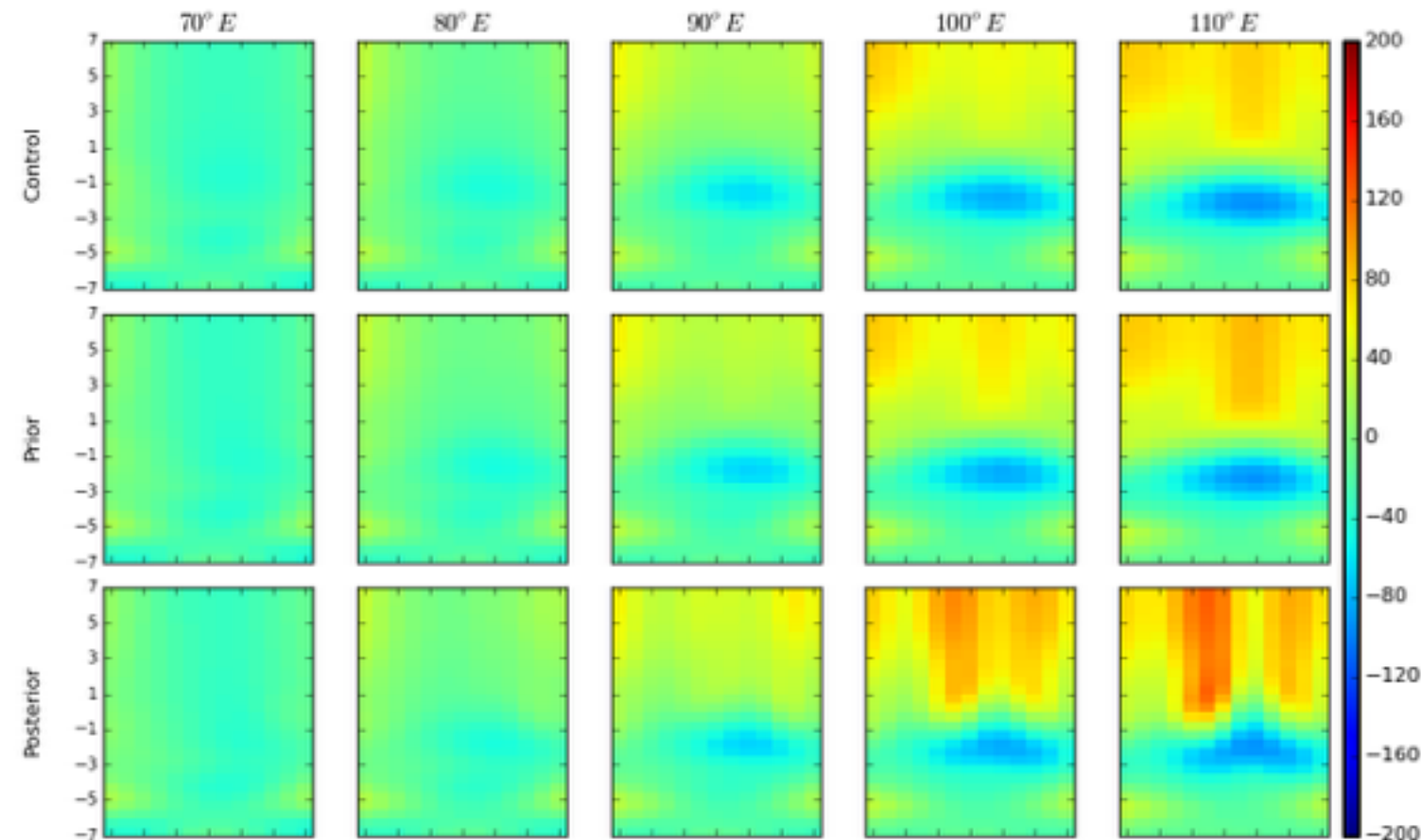
Posterior - Control



## Summary:

1. Thermosphere model is important for forecast capability.
2. The 12-h forecast shows that the low- and mid-latitude ionosphere forecast are acceptable ( $< 70\%$  RMSE) for several hours, where as high latitude forecast is very limited.
3. Assimilation of TEC improves evening E-field modeling through changing the neutral winds for both quiet and storm times.

## Un for NO wind as the state variables



## Un for winds as the state variables

