

# Coupled Thermosphere-Ionosphere Data Assimilation

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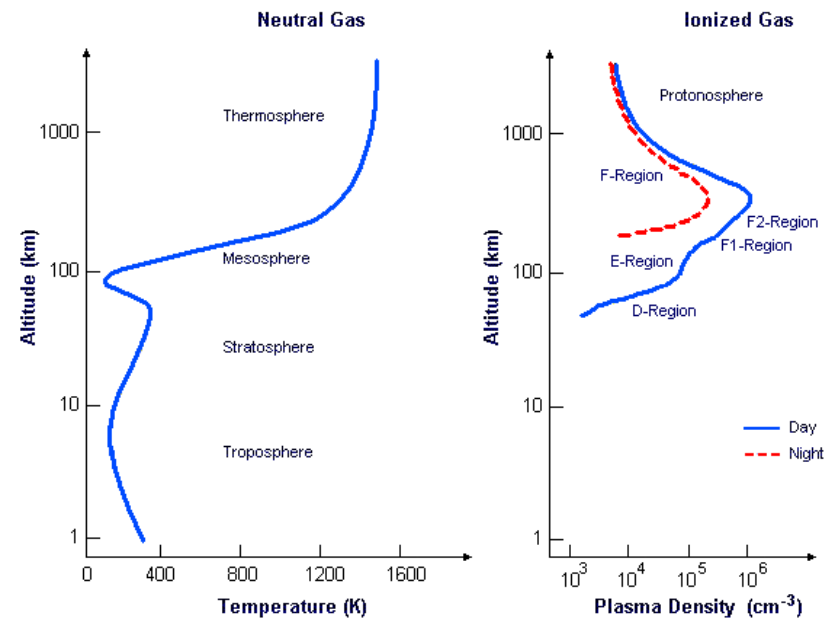
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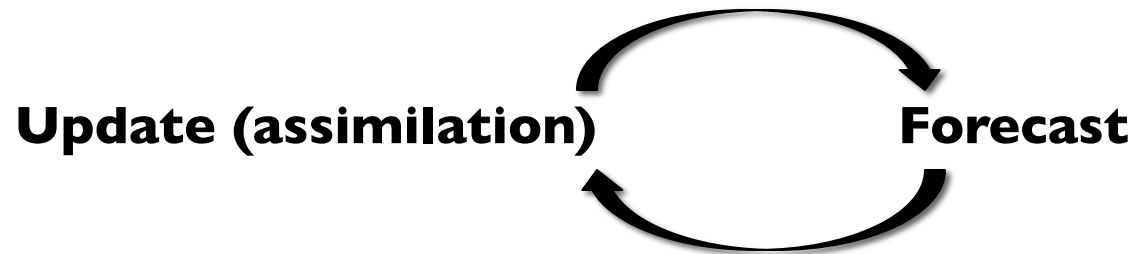
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NCAR-Institute for Mathematics Applied to Geosciences



*Hsu et al., JGR under review, 2014; Chartier et al., to be submitted, 2014; Lee et al., JGR 2012; Lee et al., JGR 2013; Matsuo et al., 2013; Matsuo and Araujo-Pradere, RS 2011; Matsuo et al., to be submitted, 2014; Matsuo et al., JGR 2013; Matsuo, AGU monograph 2013; Matsuo and Araujo-Pradere, RS 2011*

# Thermosphere-Ionosphere Coupled Data Assimilation



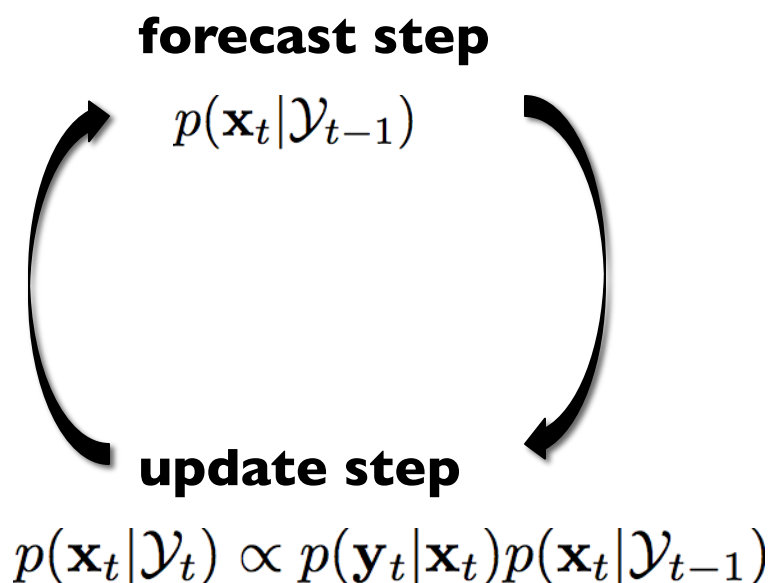
***WEAK COUPLING*** – only through forecast cycles

***STRONG COUPLING*** – through both assimilation/forecast cycles

## Advantages of strongly coupled data assimilation

- 1) Infer unobserved thermospheric states from abundant ionospheric observations and facilitate ionospheric forecasts
- 2) Inform model dynamics through self-consistent assimilation increments among model states (e.g., winds, temperature, plasma and neutral constituents, etc...)

# Ensemble Kalman filtering with NCAR-TIECGM



## MODEL - TIEGCM

$$\mathbf{x}_t^{(k)} = M_t(\mathbf{x}_{t-1}^{(k)}, F_t + \epsilon^{(k)})$$

$$\mathbf{x} = \{U, V, T, [O], [O_2], Ne, \dots, F\}$$

*dissipative forced dynamics*  
*high-dimension*

## OBSERVATIONS

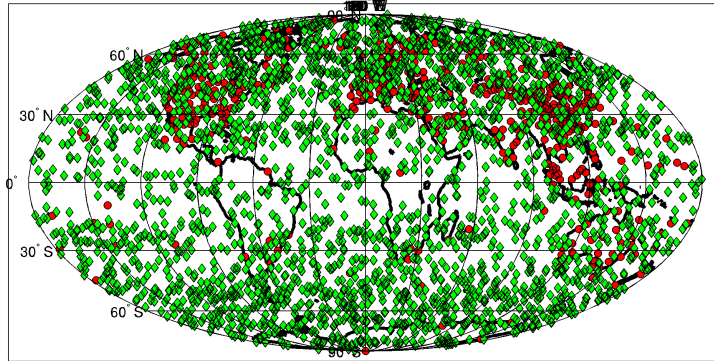
$$\mathbf{y}_t = H(\mathbf{x}_t) + \epsilon_t$$

electron density      $\mathbf{y} = \{Ne\}$

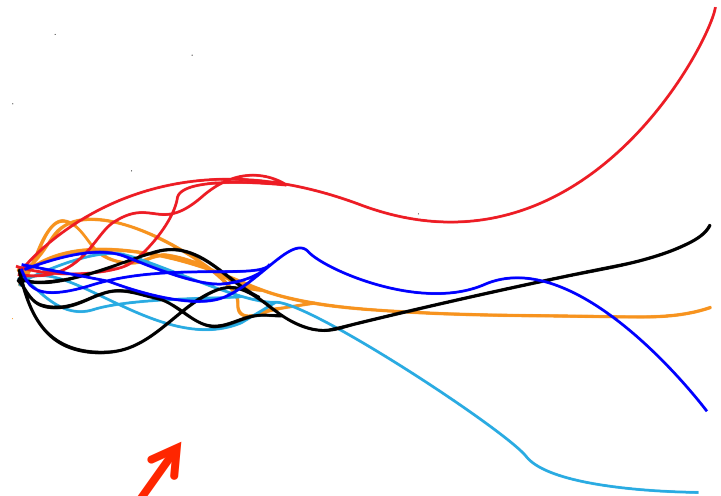
*irregular and sparse*

# COSMIC Electron Density

Occultation Locations for COSMIC, 6 S/C, 6 Planes, 24 Hrs



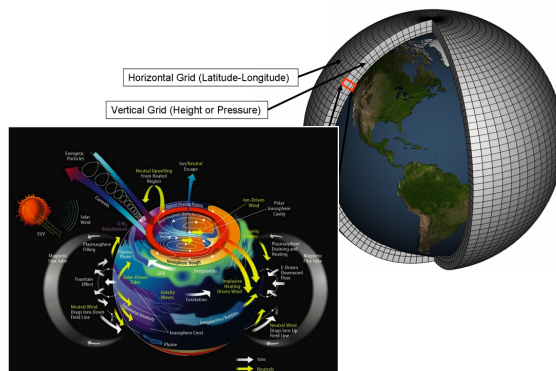
## Ensemble Forecast



data assimilation



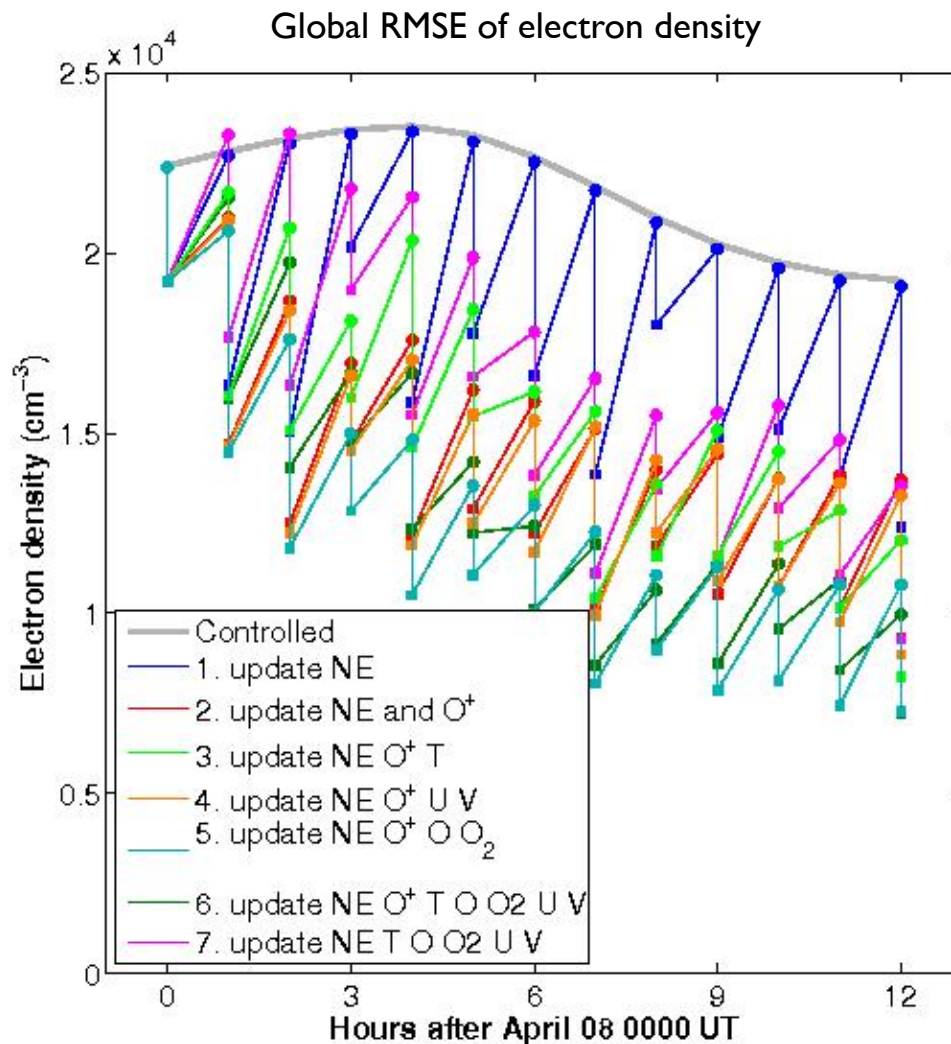
Coupled T-I Model



Initialization with assimilation analyses

# OSSE – COSMIC electron density profiles

2437 profiles/day; Apr 8 2008; 60 min assimilation cycle; 90 ensemble member



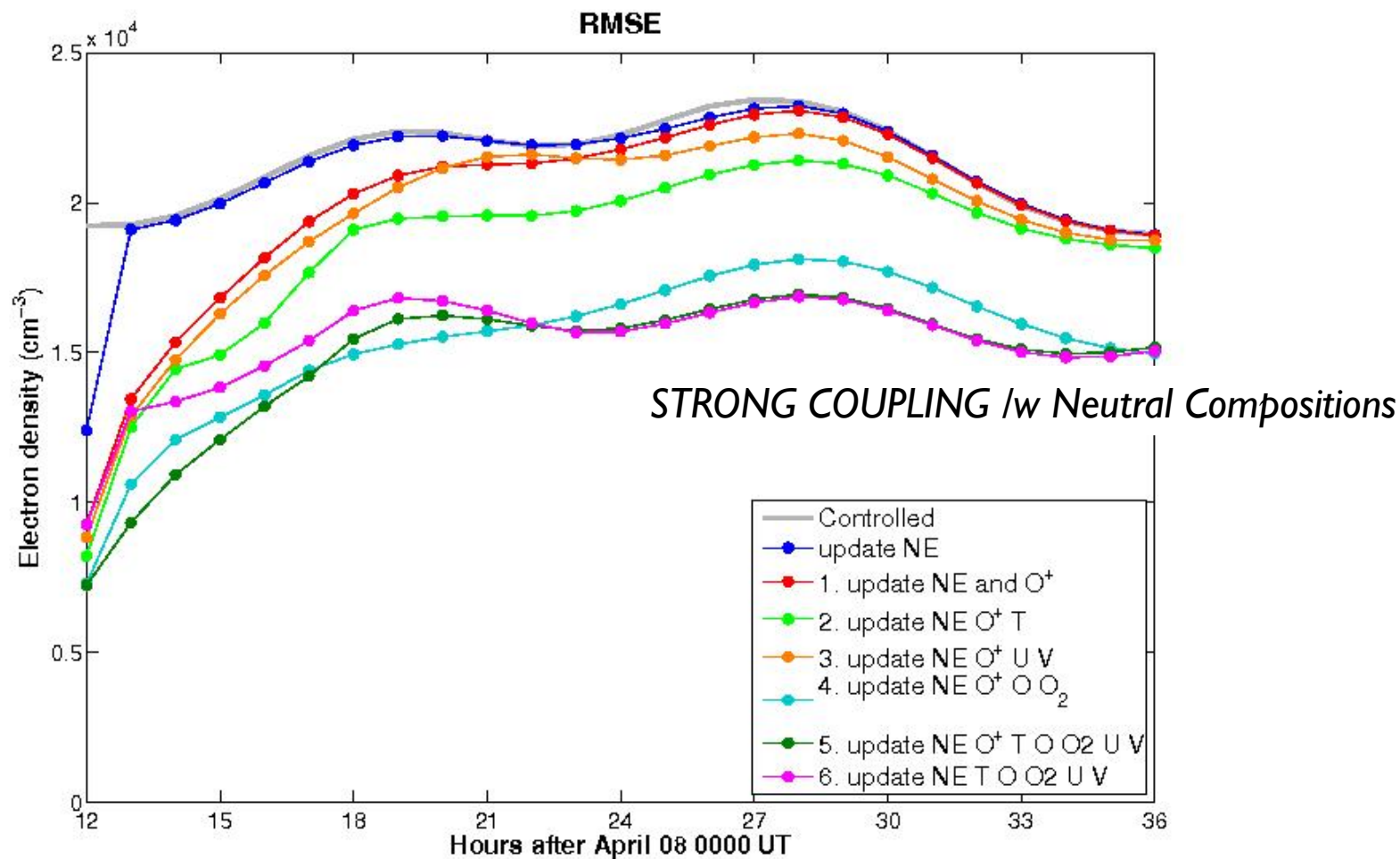
WEAK COUPLING

STRONG COUPLING

[Hsu et al., 2014]

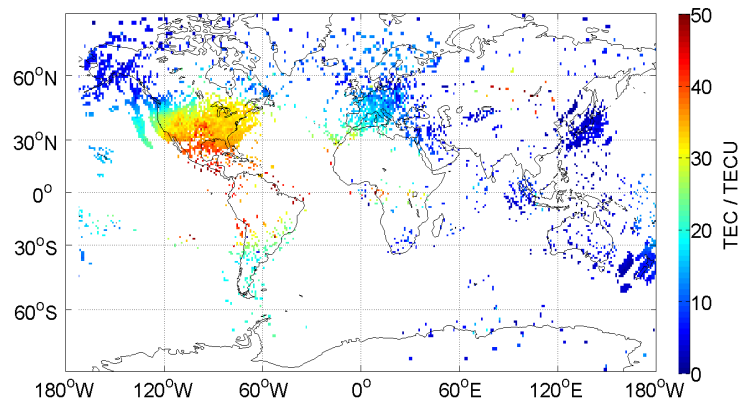
# OSSE – 24-hour Ensemble Forecast Experiment Initialized by Data Assimilation Analysis

Global RMSE of electron density forecast computed from 90 ensemble members

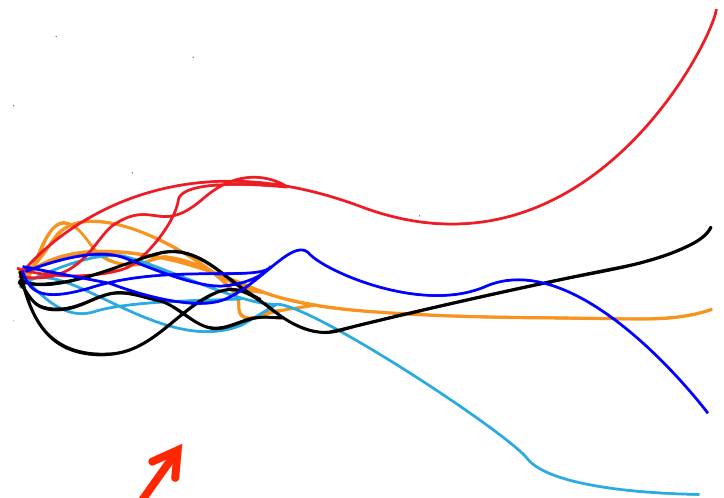


[Hsu et al., 2014]

## Ground-based GPS TEC

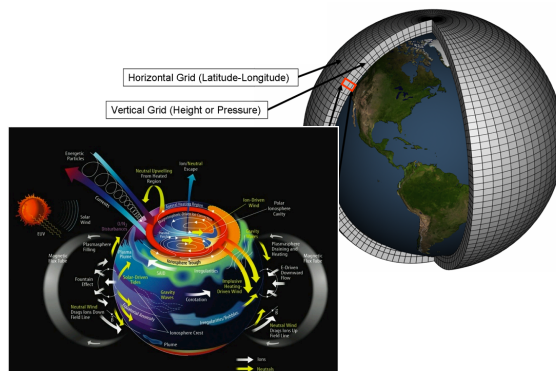


## Ensemble Forecast



data assimilation

## Coupled T-I Model

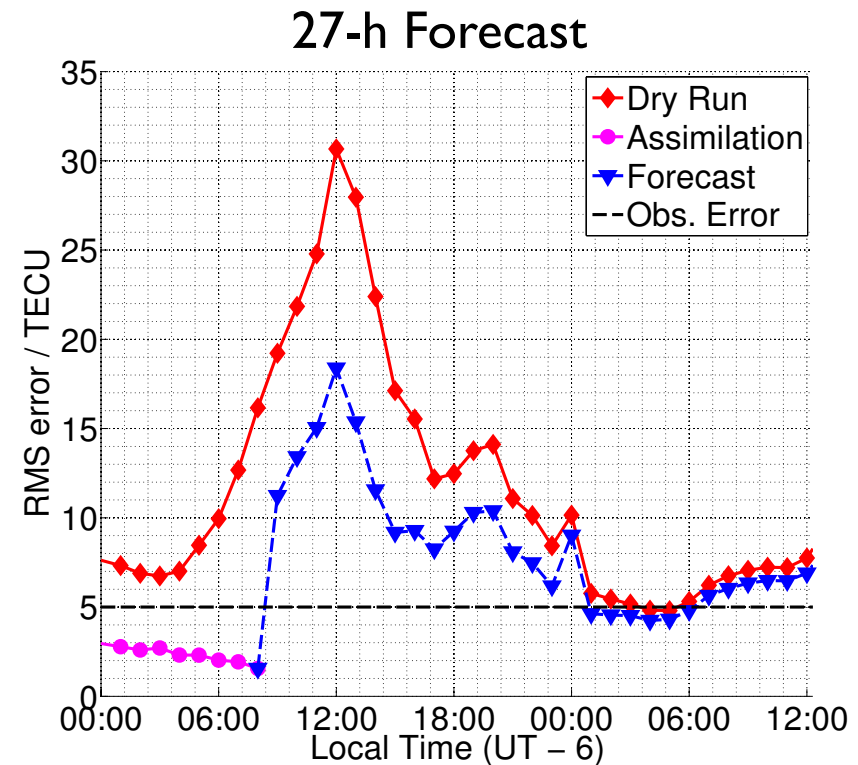
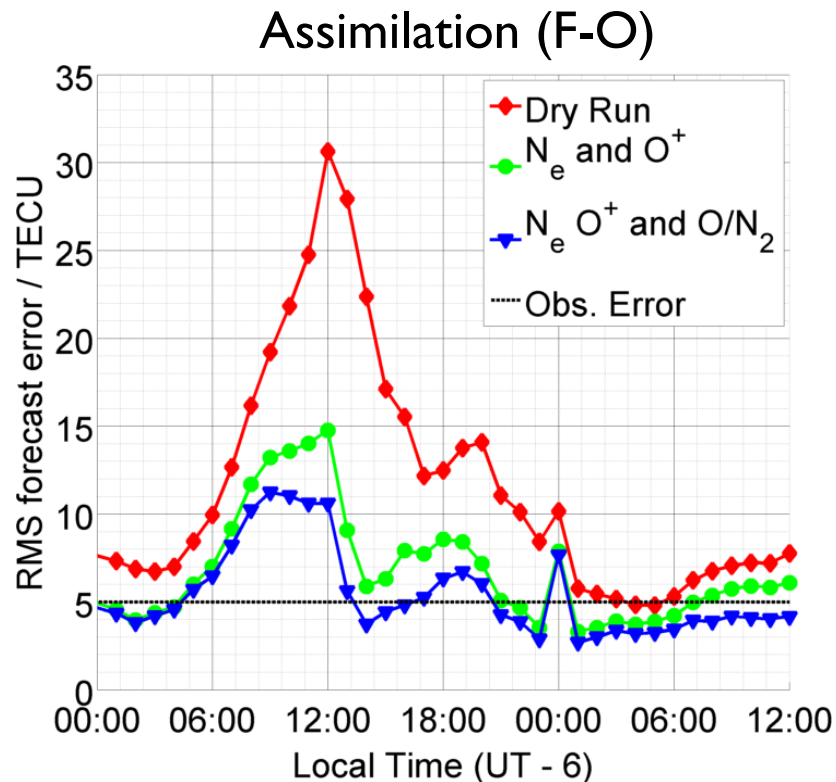


Initialization with assimilation analyses



# ASSIMILATION and FORECAST – Ground-based TEC

4000 GPS stations; Sep 10-11 2005 (**Kp 7-8**); 60 min assimilation cycle; 90 ensemble member

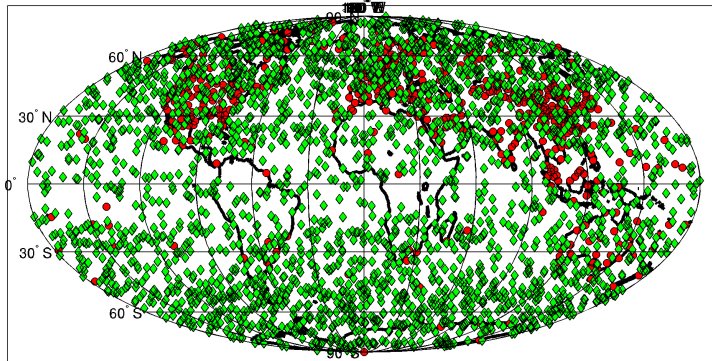


Comparison with GUVI/SSUSI data confirmed that  $O/N_2$  was successfully inferred by GPS-TEC

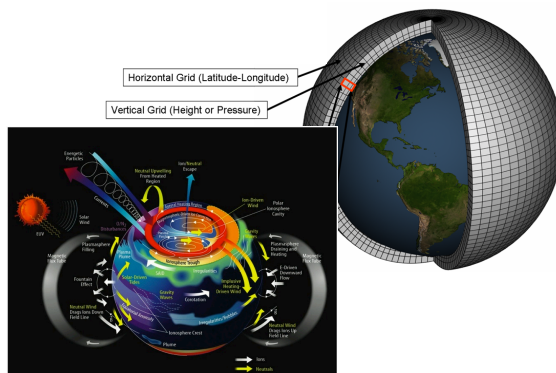


# COSMIC electron density

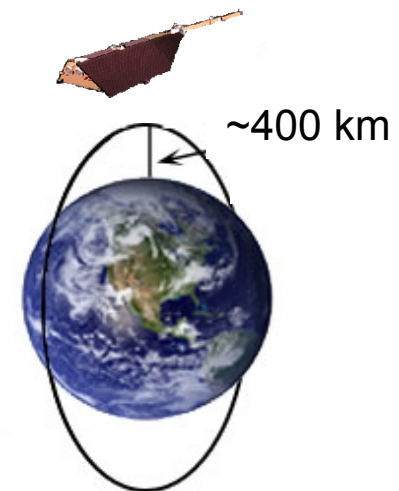
Occultation Locations for COSMIC, 6 S/C, 6 Planes, 24 Hrs



data assimilation



# CHAMP neutral density



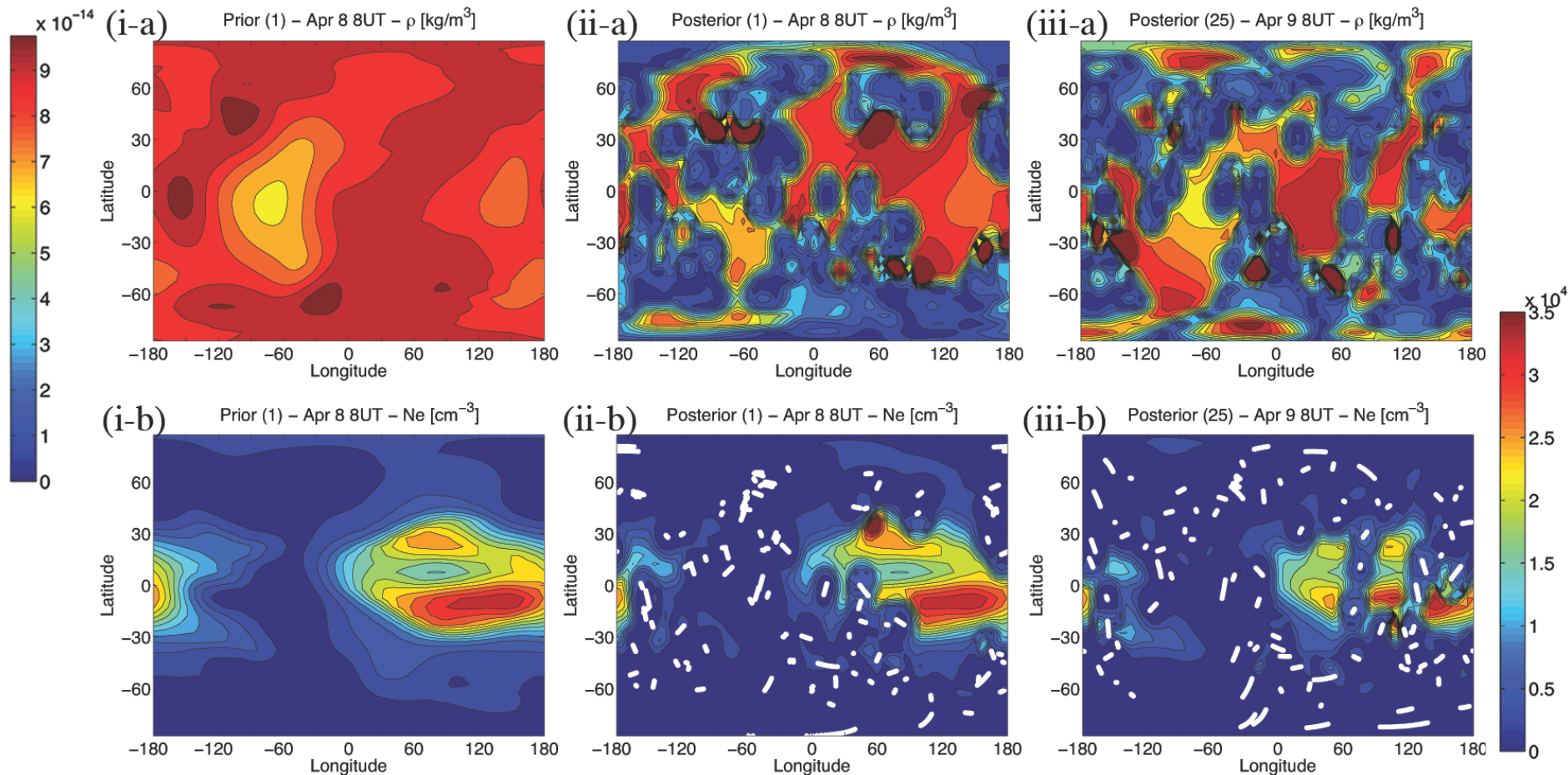
Infer unobserved thermosphere states

# OSSE – COSMIC electron density profiles

2437 profiles/day; Apr 8 2008; 60 min assimilation cycle; 90 ensemble member

RMSE of neutral (top) and electron density (bottom) (pressure level 10-29; 150-500km)

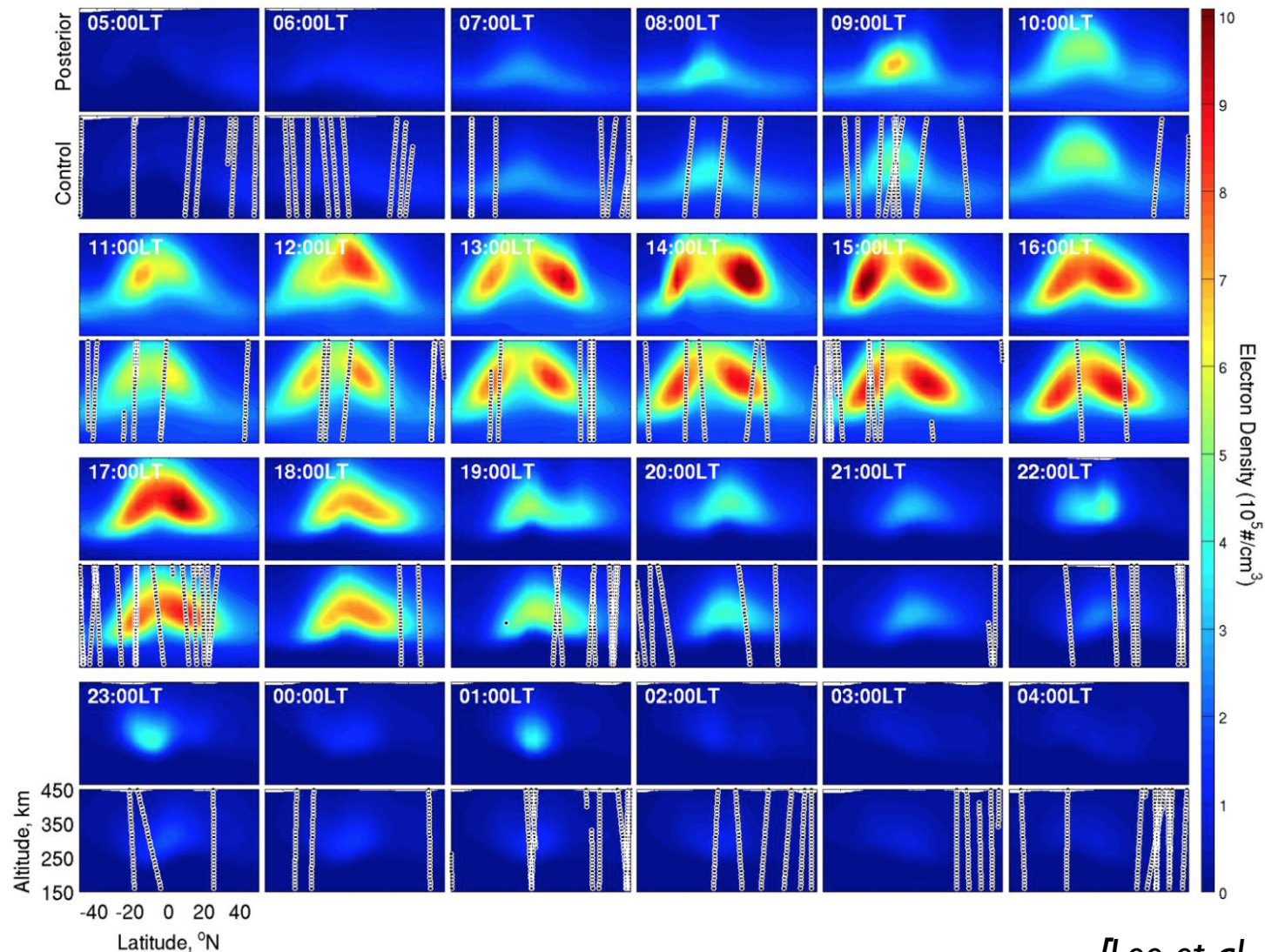
**STRONG COUPLING**  $\mathbf{x} = \{U, V, T, [O], [O_2], Ne\}$



[Matsuo et al., 2012]

# ASSIMILATION – COSMIC electron density profiles

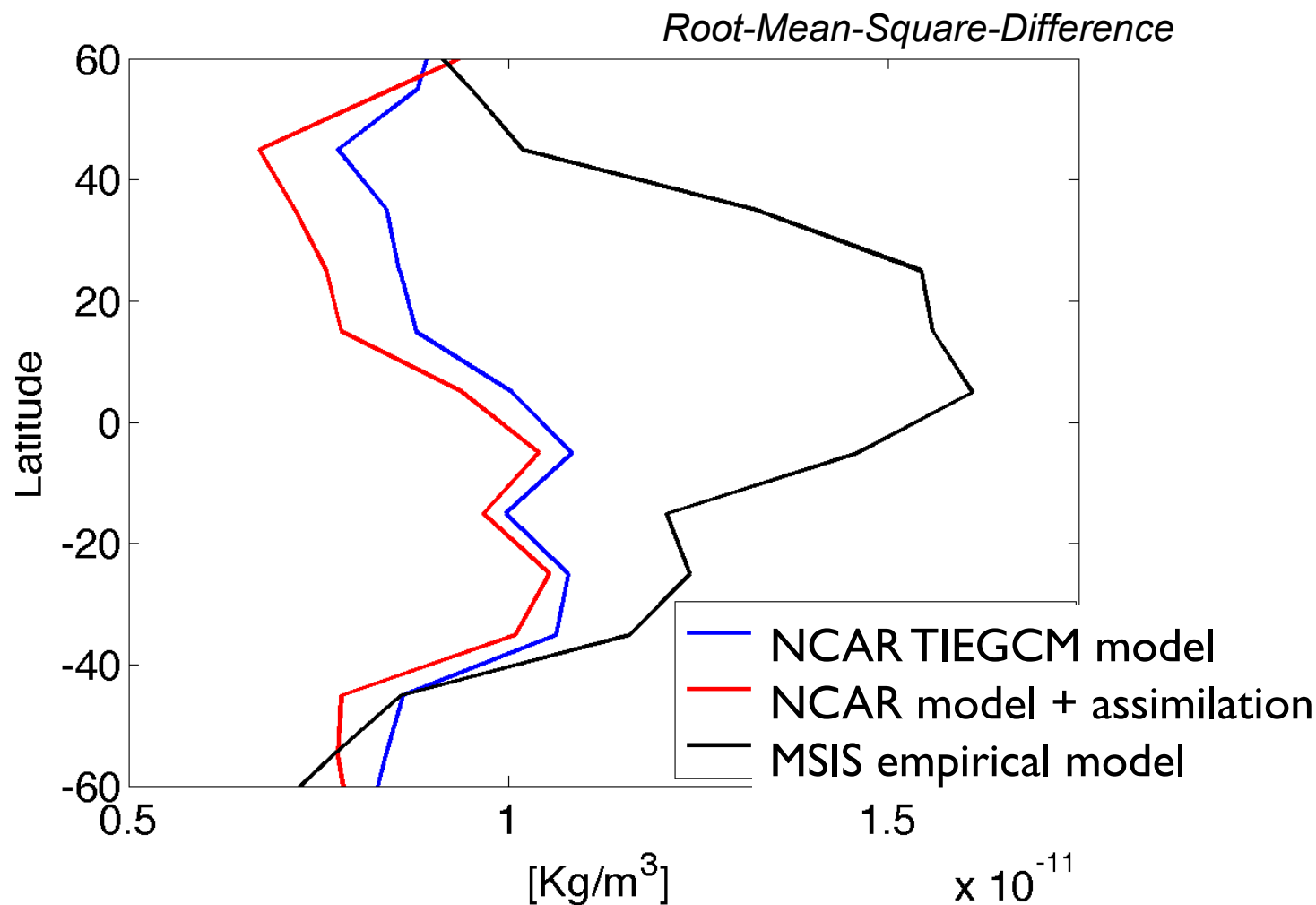
*April 8-9 2008; 60 min assimilation cycle; 90 ensemble member*



[Lee et al., JGR, 2012]

# Mass Density Prediction vs. CHAMP Observation

*STRONG COUPLING*  $\mathbf{x} = \{U, V, T, [\text{O}], [\text{O}_2], [\text{Ne}]\}$



[Matsuo et al., 2014]

# Summary - Coupled Data Assimilation

*WEAK COUPLING – only through forecast cycles*

*STRONG COUPLING – through both assimilation/forecast cycles*

- 1) Inform model dynamics through self-consistent assimilation increments among model states (e.g., winds, temperature, plasma and neutral constituents, etc...)
- 2) Improve our capability to forecast the ionosphere forecast
- 3) Infer unobserved thermospheric states from abundant ionospheric observations
- 4) Increase geophysical information content of RO and ground-based GPS observations

All the DART/TIEGCM assimilation tools used in this work are available from <http://www.image.ucar.edu/DAReS/DART>