

# Using Data Assimilation to Understand the Systematic Errors of CHAMP Accelerometer-Derived Neutral Mass Density Data

Timothy Kodikara<sup>1</sup>, Isabel Fernandez-Gomez<sup>1</sup>, Ehsan Forootan<sup>2</sup>, W. Kent Tobiska<sup>3</sup>, and Claudia Borries<sup>1</sup>

1. German Aerospace Center (DLR), Germany

2. Aalborg University, Denmark

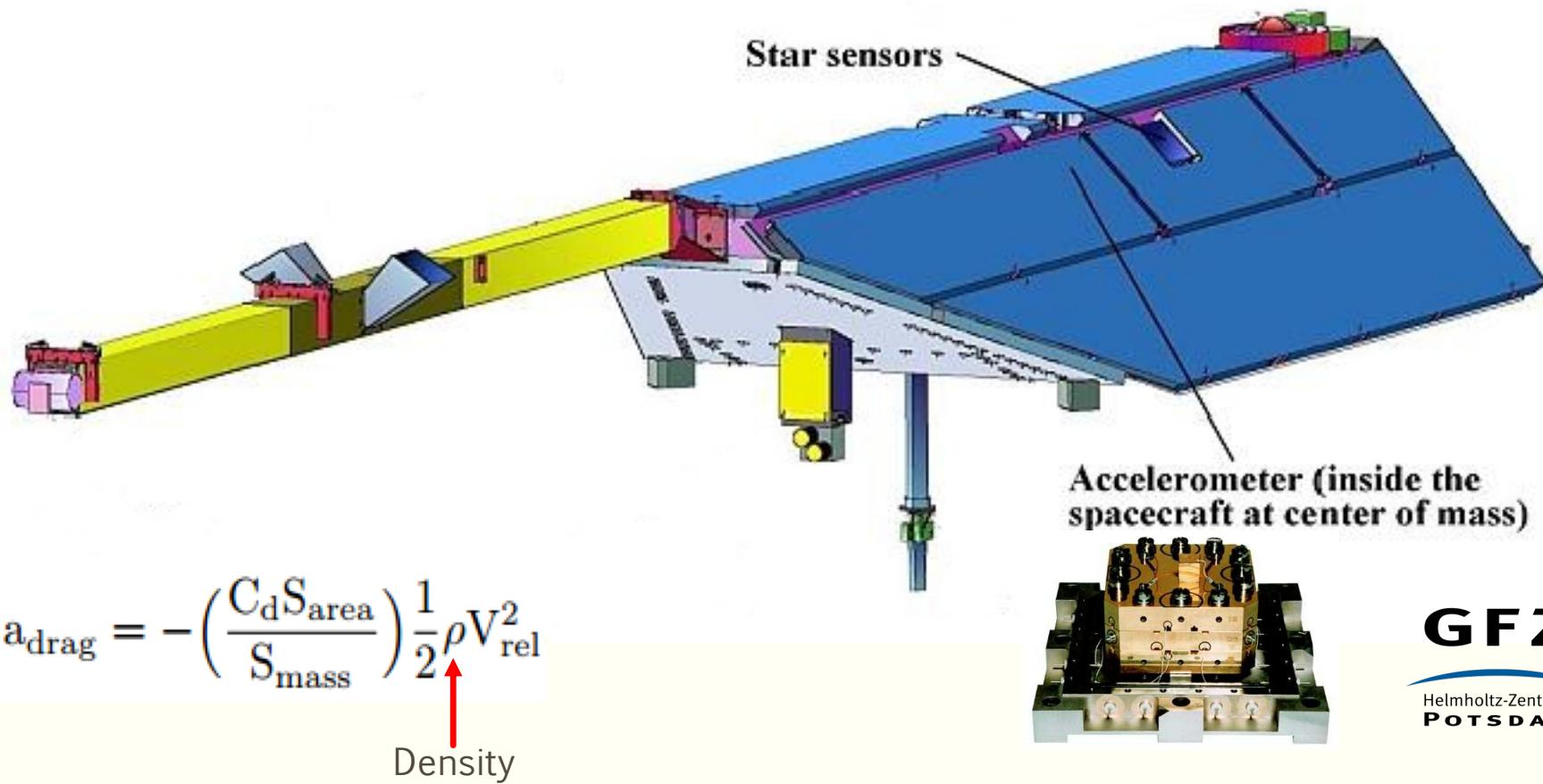
3. Space Environment Technologies, USA

timothy.kodikara@dlr.de



Neutral mass density can be derived from accelerometer measurements onboard CHAMP

---

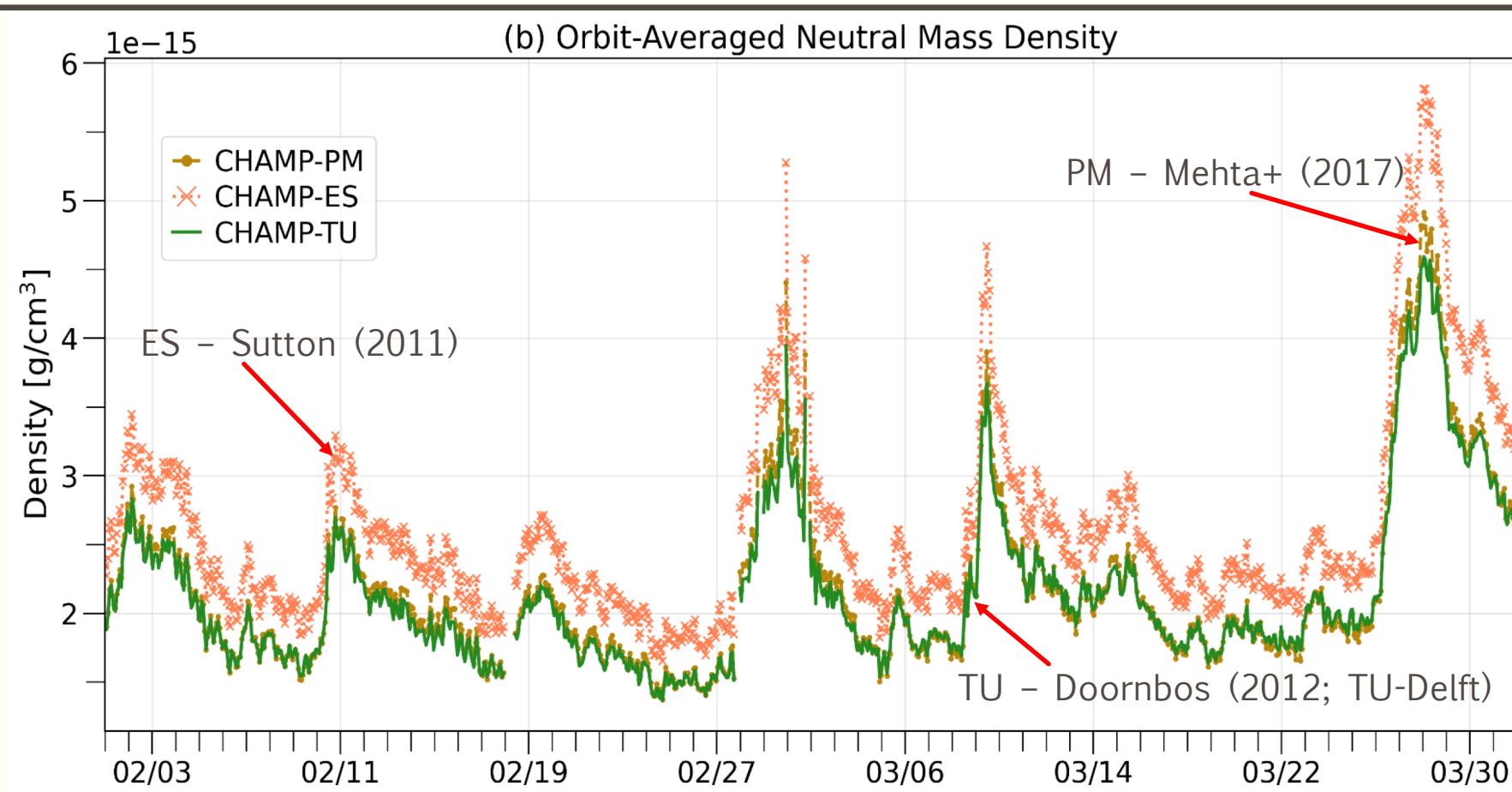


$$a_{\text{drag}} = - \left( \frac{C_d S_{\text{area}}}{S_{\text{mass}}} \right) \frac{1}{2} \rho V_{\text{rel}}^2$$

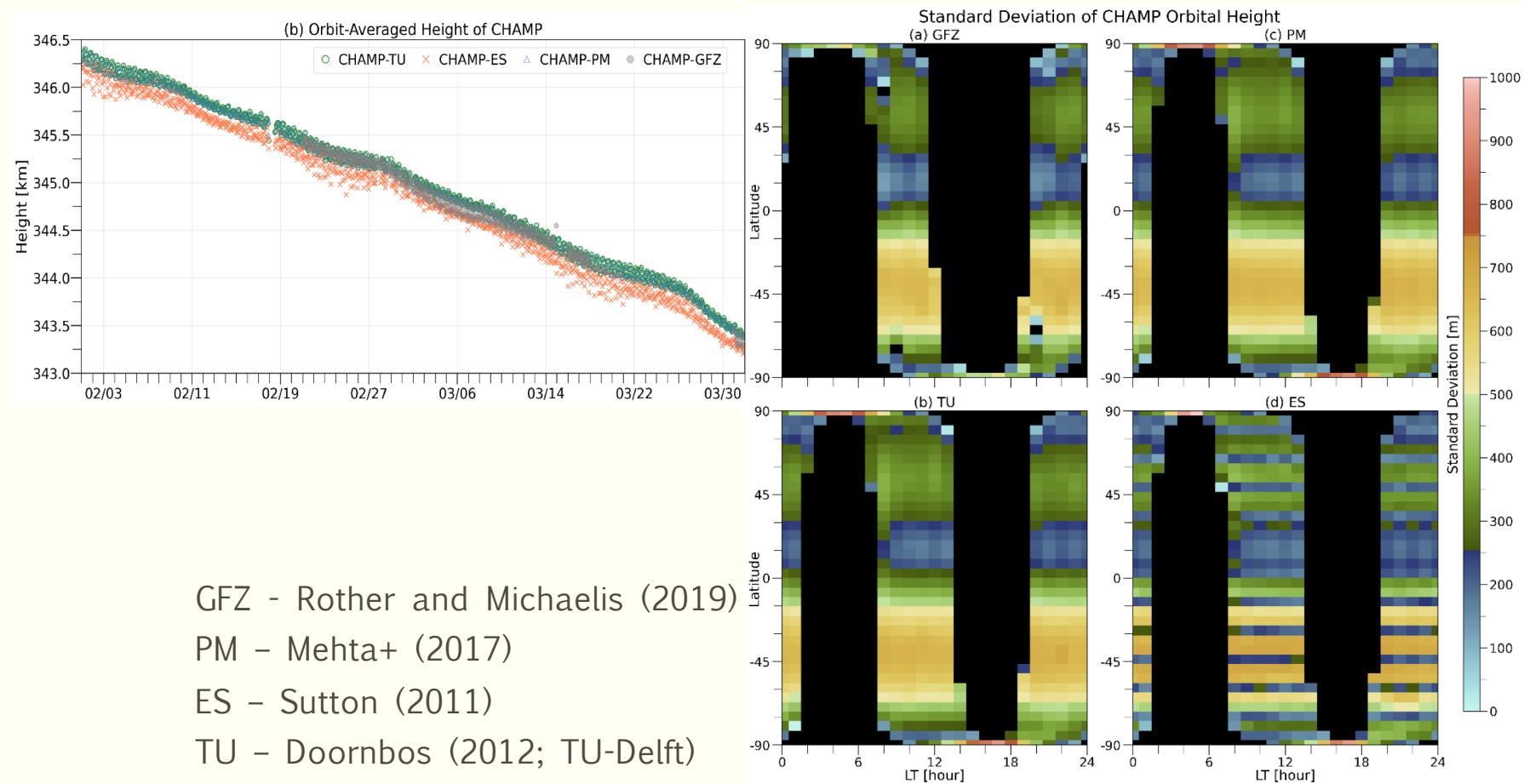
Density



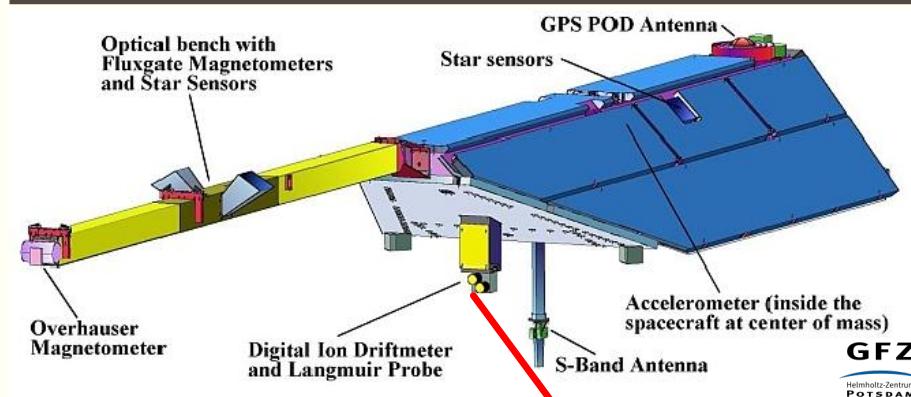
# The uncertainties of accelerometer-derived NMD are not fully understood



# Some discrepancies exist in the published CHAMP height



# Assimilate observations along CHAMP to understand the impact on NMD

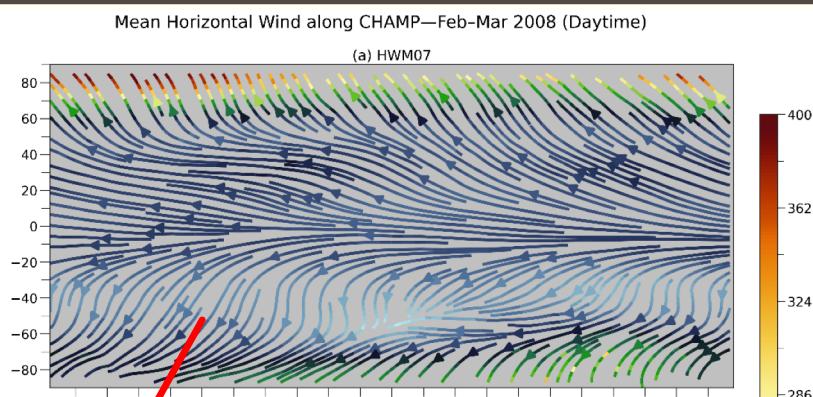


electron density +  
electron temperature  
Rother and Michaelis (2019)

E1-10%: CHAMP-Ne-Te  
with 10% uncertainty

E2-100%: CHAMP-Ne-Te  
with 100% uncertainty

TIE-GCM  
+  
DART



Horizontal wind model 2007  
Drob+ (2008)

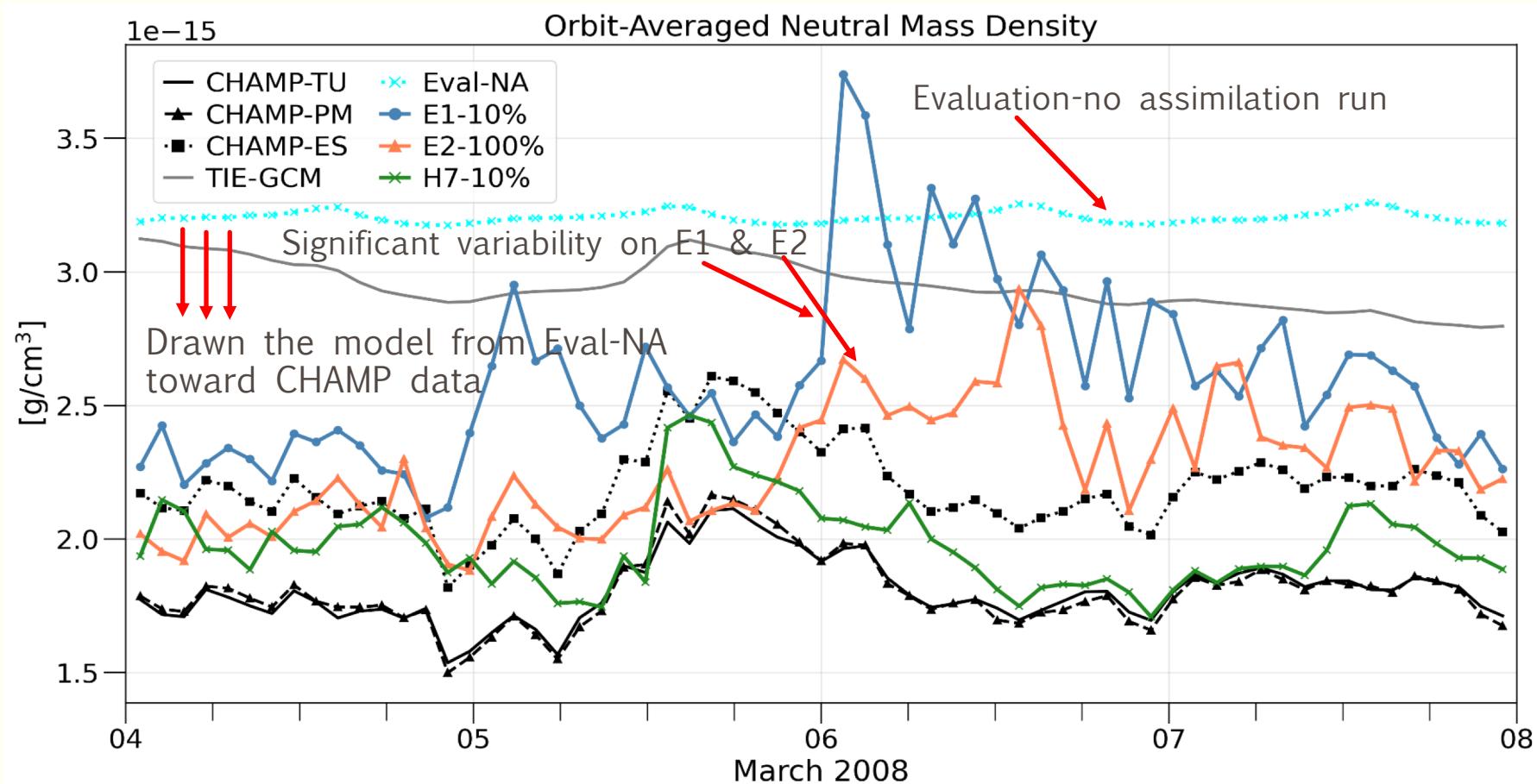
H7-10%: HWM07  
with 10% uncertainty

HWM07 was partly used to  
derive CHAMP-TU



ncar.ucar.edu  
NCAR | National Center for  
UCAR Atmospheric Research

# Assimilation of HWM07 neutral winds greatly improves TIE-GCM's agreement with CHAMP neutral mass density



## Estimating the Error Variance using the Grubbs' method

---

Grubbs (1948) "On Estimating Precision of Measuring Instruments and Product Variability", Journal of the American Statistical Association

Four instruments A, B, C, D measuring the same physical qty

$$A = T + E_A$$

$$B = T + E_B$$

$$C = T + E_C \quad \text{Var}(A - B) = \frac{1}{n} \sum_{i=1}^n (A_i - B_i)^2 - \langle A - B \rangle^2,$$

$$D = T + E_D$$

Error variance can be estimated independent of true value T

$$\sigma(E_A) = \sqrt{\text{Var}(E_A)} = \left\{ \frac{1}{3} \left( \text{Var}(A - B) + \text{Var}(A - C) + \text{Var}(A - D) \right) - \frac{1}{6} \left( \text{Var}(B - C) + \text{Var}(B - D) + \text{Var}(C - D) \right) \right\}^{\frac{1}{2}}.$$

# Estimating the Error Variance using the Grubbs' method

Grubbs (1948) "On Estimation of the American Statistical Association"

Four instruments A, B, C, D

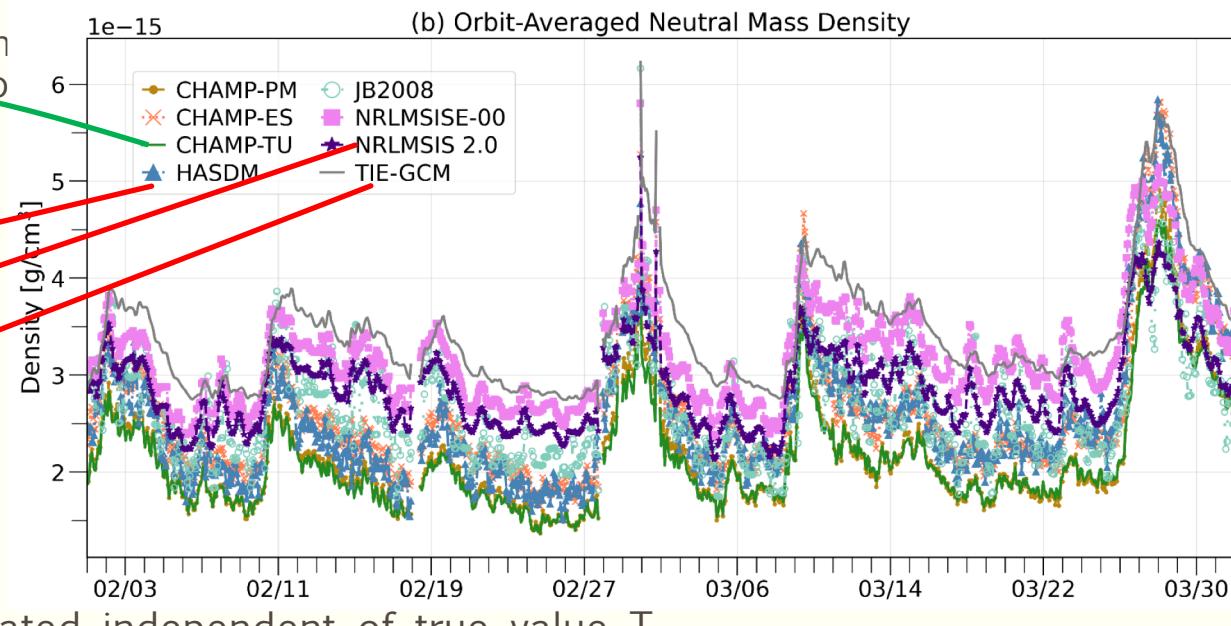
qty

$$A = T + E_A$$

$$B = T + E_B$$

$$C = T + E_C$$

$$D = T + E_D$$



Error variance can be estimated independent of true value  $T$

$$\begin{aligned} \sigma(E_A) = \sqrt{\text{Var}(E_A)} &= \left\{ \frac{1}{3} \left( \text{Var}(A - B) + \text{Var}(A - C) + \text{Var}(A - D) \right) \right. \\ &\quad \left. - \frac{1}{6} \left( \text{Var}(B - C) + \text{Var}(B - D) + \text{Var}(C - D) \right) \right\}^{\frac{1}{2}}. \end{aligned}$$

## Grubbs' method provide reliable estimates of the error

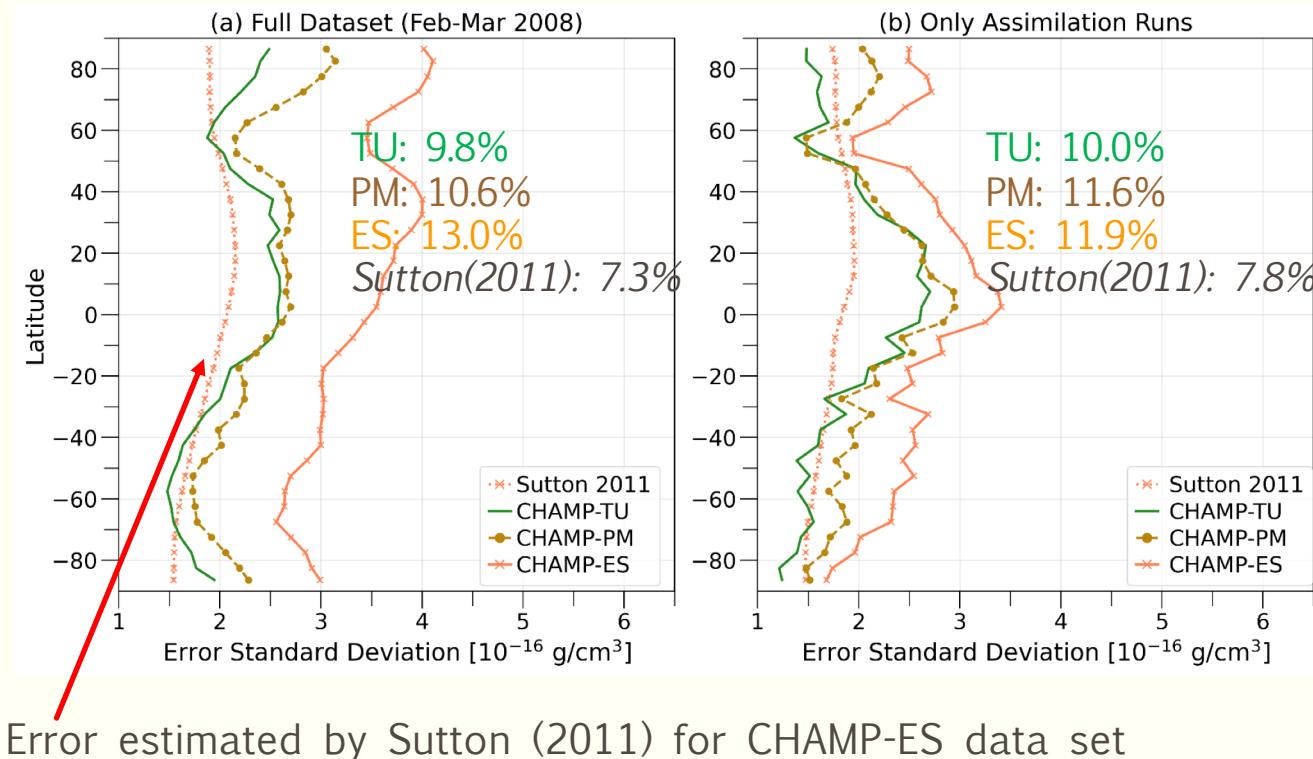
(b) uses only assim runs to estimate error (E1, E2, H7 as B, C, D instruments)

General agreement with previous estimates:

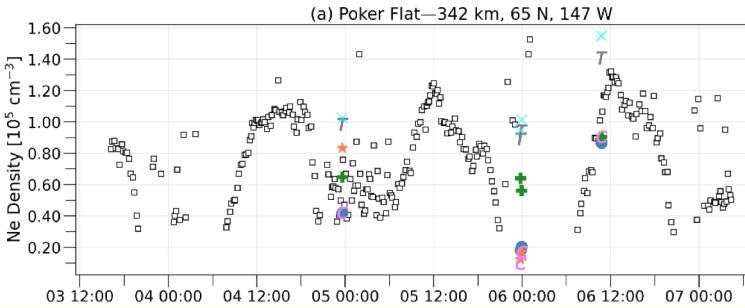
Bruinsma+(2004): 10-15%

Sutton+(2007): 6-15.6%

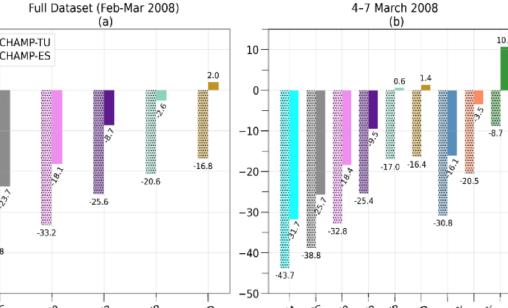
Reveals latitudinal characteristics of error



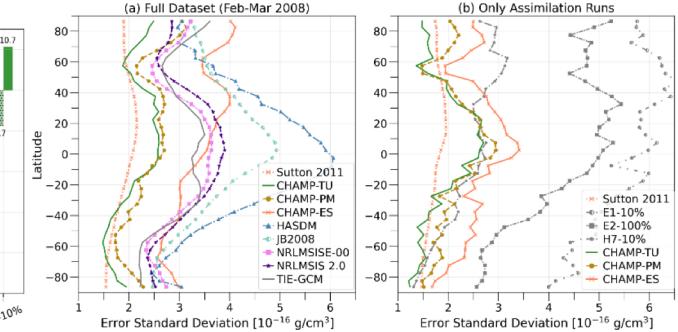
## Validation with ISR data



## Model Performance



## Error Estimates



# Using Data Assimilation to Understand the Systematic Errors of CHAMP Accelerometer-Derived Neutral Mass Density Data

Timothy Kodikara<sup>1</sup>, Isabel Fernandez-Gomez<sup>1</sup>, Ehsan Forootan<sup>2</sup>, W. Kent Tobiska<sup>3</sup>, and Claudia Borries<sup>1</sup>

1. German Aerospace Center (DLR), Germany

2. Aalborg University, Denmark

3. Space Environment Technologies, USA

timothy.kodikara@dlr.de

