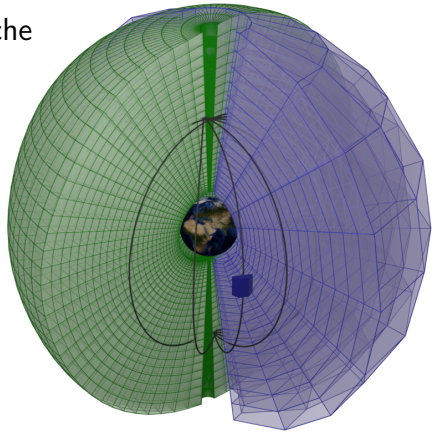
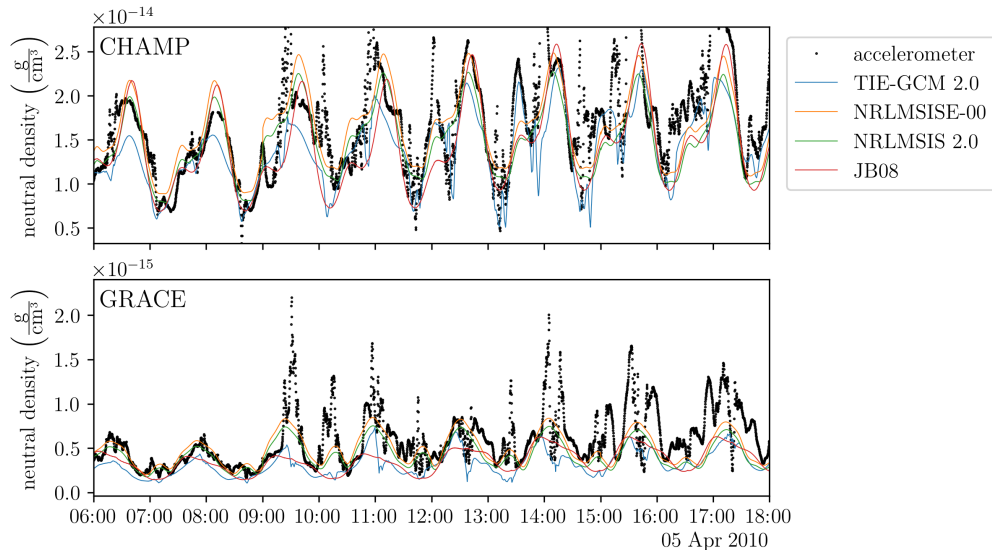
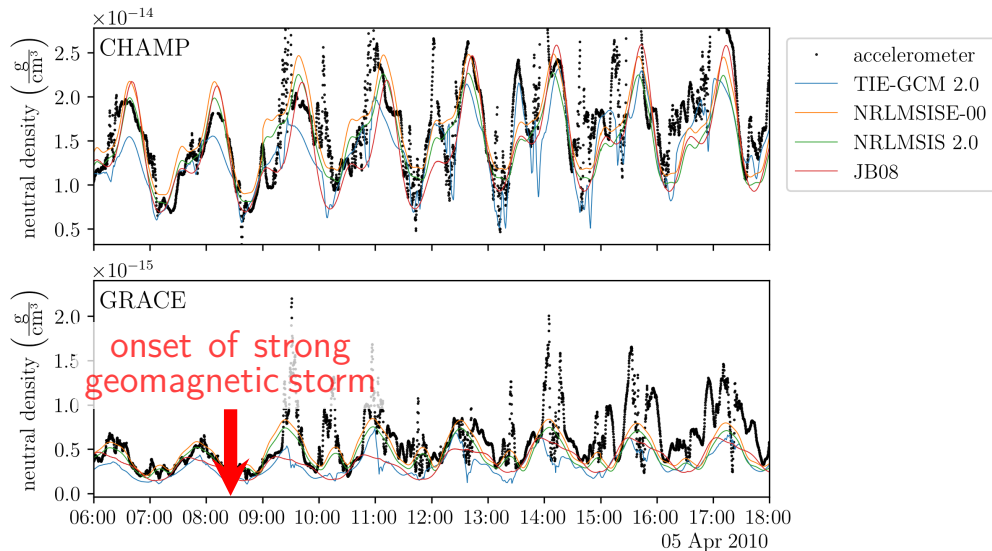


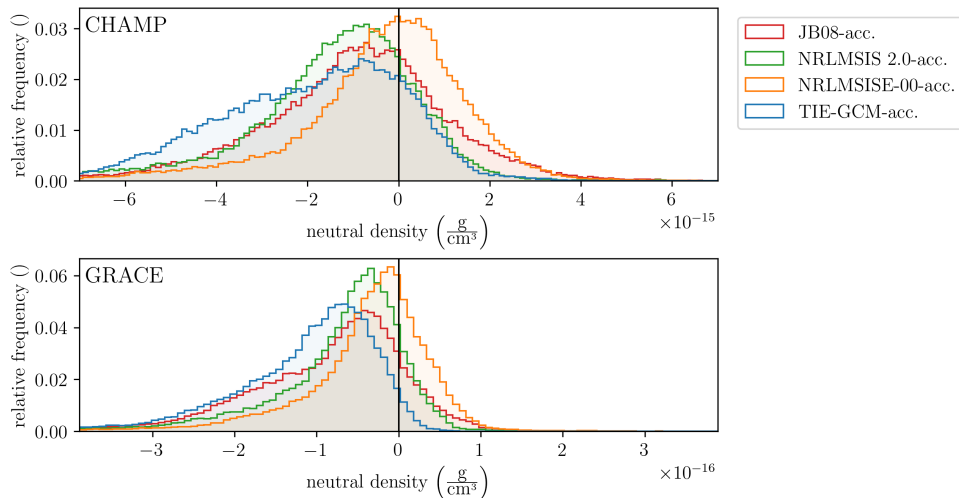
# An Assimilative Version of TIE-GCM using PDAF

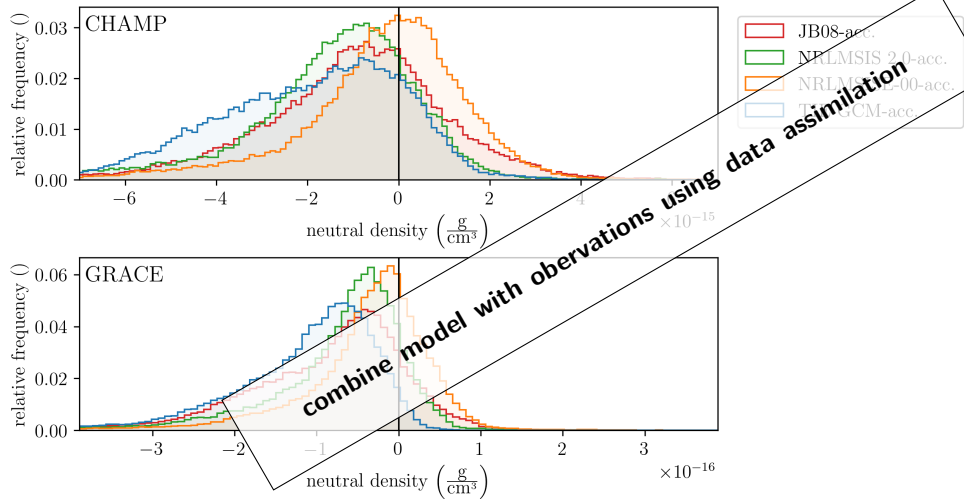
**Armin Corbin**, Kristin Vielberg, Jürgen Kusche  
May 23 2022











Observations that have been assimilated into the TIE-GCM

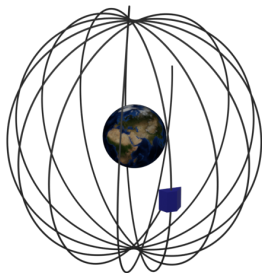
- ▶ electron density profiles<sup>1</sup>
- ▶ along track accelerometer derived neutral densities<sup>2</sup>

## Problem

How can we **globally improve** the prediction of the neutral mass density of the TIE-GCM by assimilating **sparse along track** observations without relying on the correct representation of **long-range correlations** within the ensemble?

<sup>1</sup>e.g., Lee et al., 2012; Matsuo, Lee, and Anderson, 2013; Hsu et al., 2014; Kodikara et al., 2021.

<sup>2</sup>e.g., Matsuo, Lee, and Anderson, 2013; Murray et al., 2015; Sutton, 2018.



not to scale

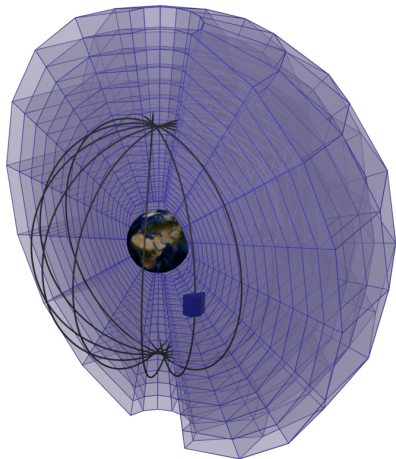
image of Earth: Reto Stöckli, NASA Earth Observatory

## Step 1: Calibration of NRLMSIS 2.0

- ▶ compute **NRLMSIS 2.0** neutral densities along orbit of **CHAMP**
- ▶ calculate **scale factors** between CHAMP accelerometer derived densities<sup>a</sup> and NRLMSIS 2.0 densities
- ▶ apply low pass filter to scale factors

---

<sup>a</sup>Vielberg et al., 2021.



not to scale

image of Earth: Reto Stöckli, NASA Earth Observatory

## Step 1: Calibration of NRLMSIS 2.0

- ▶ compute **NRLMSIS 2.0** neutral densities along orbit of **CHAMP**
- ▶ calculate **scale factors** between CHAMP accelerometer derived densities<sup>a</sup> and NRLMSIS 2.0 densities
- ▶ apply low pass filter to scale factors

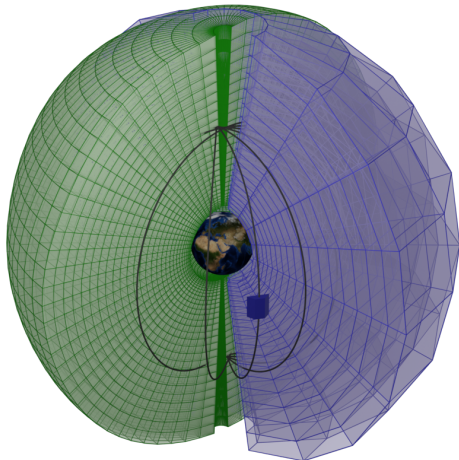
## Step 2: Assimilation of Calibrated Model

- ▶ evaluate calibrated **NRLMSIS 2.0** on regular grid

---

<sup>a</sup>Vielberg et al., 2021.





not to scale

image of Earth: Reto Stöckli, NASA Earth Observatory

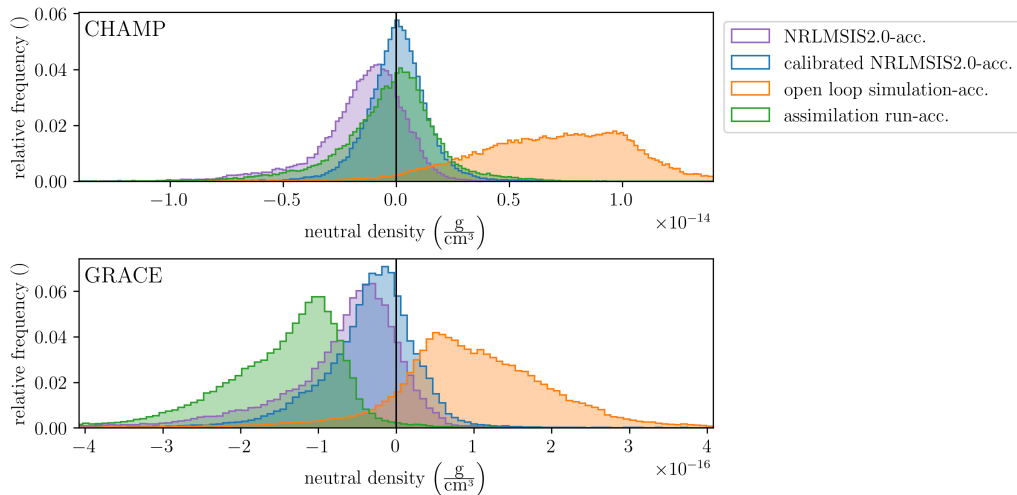
## Step 1: Calibration of NRLMSIS 2.0

- ▶ compute **NRLMSIS 2.0** neutral densities along orbit of **CHAMP**
- ▶ calculate **scale factors** between CHAMP accelerometer derived densities<sup>a</sup> and NRLMSIS 2.0 densities
- ▶ apply low pass filter to scale factors

## Step 2: Assimilation of Calibrated Model

- ▶ evaluate calibrated **NRLMSIS 2.0** on regular grid
- ▶ assimilate this into TIE-GCM

<sup>a</sup>Vielberg et al., 2021.



The histograms were calculated using data between April 27, 2010 and May 10, 2010.

- ▶ **average difference** between TIE-GCM and accelerometer derived densities along CHAMP orbit is **reduced by two orders of magnitude**
- ▶ two-step approach enables **global update of the model state** and localization
- ▶ above about 350 km the density is not improved (correction of the first analysis step overshoots the innovation)
- ▶ we suspect that **co-estimating calibration parameters** helps to improve the predictions above that altitude

## Learn More

Armin Corbin, Jürgen Kusche. *Improving the estimation of thermospheric neutral density via two-step assimilation of in-situ neutral density into a numerical model*, 11 May 2022, PREPRINT (Version 1) available at Research Square [ <https://doi.org/10.21203/rs.3.rs-1616740/v1> ]



Emmert, J. T. et al. (2021). "NRLMSIS 2.0: A Whole-Atmosphere Empirical Model of Temperature and Neutral Species Densities". In: *Earth and Space Science* 8.3, e2020EA001321. ISSN: 2333-5084. DOI: 10.1029/2020EA001321.



Hsu, Chih-Ting et al. (2014). "Effects of Inferring Unobserved Thermospheric and Ionospheric State Variables by Using an Ensemble Kalman Filter on Global Ionospheric Specification and Forecasting". In: *Journal of Geophysical Research: Space Physics* 119.11, pp. 9256–9267. ISSN: 2169-9402. DOI: 10.1002/2014JA020390.



Kodikara, Timothy et al. (2021). "The Impact of Solar Activity on Forecasting the Upper Atmosphere via Assimilation of Electron Density Data". In: *Space Weather* 19.5, e2020SW002660. ISSN: 1542-7390. DOI: 10.1029/2020SW002660.



Lee, I. T. et al. (2012). "Assimilation of FORMOSAT-3/COSMIC electron density profiles into a coupled thermosphere/ionosphere model using ensemble Kalman filtering". In: *Journal of Geophysical Research: Space Physics* 117.A10. DOI: <https://doi.org/10.1029/2012JA017700>. eprint: <https://agupubs.onlinelibrary.wiley.com/doi/pdf/10.1029/2012JA017700>. URL: <https://agupubs.onlinelibrary.wiley.com/doi/abs/10.1029/2012JA017700>.



Matsuo, Tomoko, I-Te Lee, and Jeffrey L. Anderson (2013). "Thermospheric mass density specification using an ensemble Kalman filter". In: *Journal of Geophysical Research: Space Physics* 118.3, pp. 1339–1350. DOI: <https://doi.org/10.1002/jgra.50162>. eprint: <https://agupubs.onlinelibrary.wiley.com/doi/pdf/10.1002/jgra.50162>. URL: <https://agupubs.onlinelibrary.wiley.com/doi/abs/10.1002/jgra.50162>.



Murray, S. A. et al. (2015). "Assessing the Performance of Thermospheric Modeling with Data Assimilation throughout Solar Cycles 23 and 24". In: *Space Weather* 13.4, pp. 220–232. ISSN: 1542-7390. DOI: 10.1002/2015SW001163.



Nerger, Lars, Qi Tang, and Longjiang Mu (Sept. 2020). "Efficient Ensemble Data Assimilation for Coupled Models with the Parallel Data Assimilation Framework: Example of AWI-CM (AWI-CM-PDAF 1.0)". In: *Geoscientific Model Development* 13.9, pp. 4305–4321. ISSN: 1991-959X. DOI: 10.5194/gmd-13-4305-2020.



Qian, Liying et al. (2014). "The NCAR TIE-GCM: A Community Model of the Coupled Thermosphere/Ionosphere System". In: *Modeling the Ionosphere–Thermosphere System*. Ed. by Joseph Huba, Robert Schunk, and Khazanov George. 1st ed. Geophysical Monograph Series. American Geophysical Union (AGU), pp. 73–83. DOI: 10.1002/9781118704417. eprint: <https://agupubs.onlinelibrary.wiley.com/doi/pdf/10.1002/9781118704417>.



Sutton, Eric K. (2018). "A New Method of Physics-Based Data Assimilation for the Quiet and Disturbed Thermosphere". In: *Space Weather* 16.6, pp. 736–753. ISSN: 1542-7390. DOI: 10.1002/2017SW001785.



Vielberg, Kristin et al. (2021). *TND-IGG RL01: Thermospheric neutral density from accelerometer measurements of GRACE, CHAMP and Swarm. data set*. DOI: 10.1594/PANGAEA.931347. URL: <https://doi.org/10.1594/PANGAEA.931347>.

## Thermosphere Ionosphere Electrodynamics General Circulation Model<sup>3</sup>(TIE-GCM)

- ▶ global, physics based model of the upper atmosphere
- ▶ ranges from 97 km to about 600 km altitude

## Parallel Data Assimilation Framework<sup>4</sup>(PDAF)

- ▶ software environment for ensemble data assimilation
- ▶ fast since ensemble members are forecasted in parallel

## Naval Research Laboratory Mass Spectrometer Incoherent Scatter radar<sup>5</sup>(NRLMSIS 2)

- ▶ empirical model of the entire atmosphere
- ▶ constructed from observations mainly below 105 km

<sup>1</sup>Qian et al. (2014), <sup>2</sup>Nerger, Tang, and Mu (2020), <sup>3</sup>Emmert et al. (2021)

