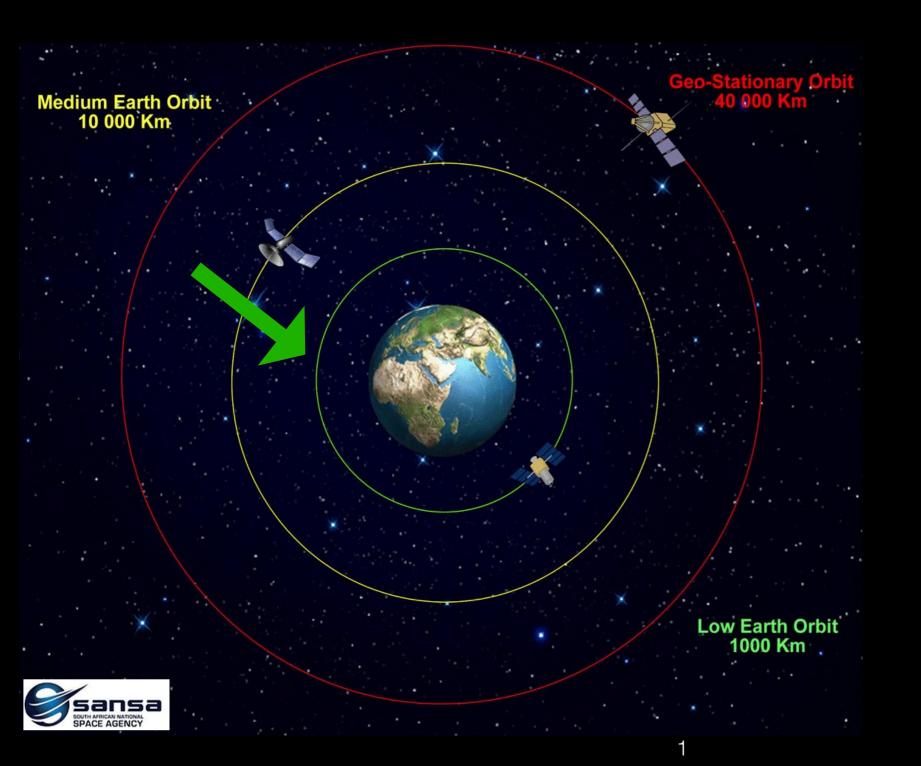
Perspectives on the use of data assimilation for improving thermospheric empirical models: Focus on extreme magnetic storms

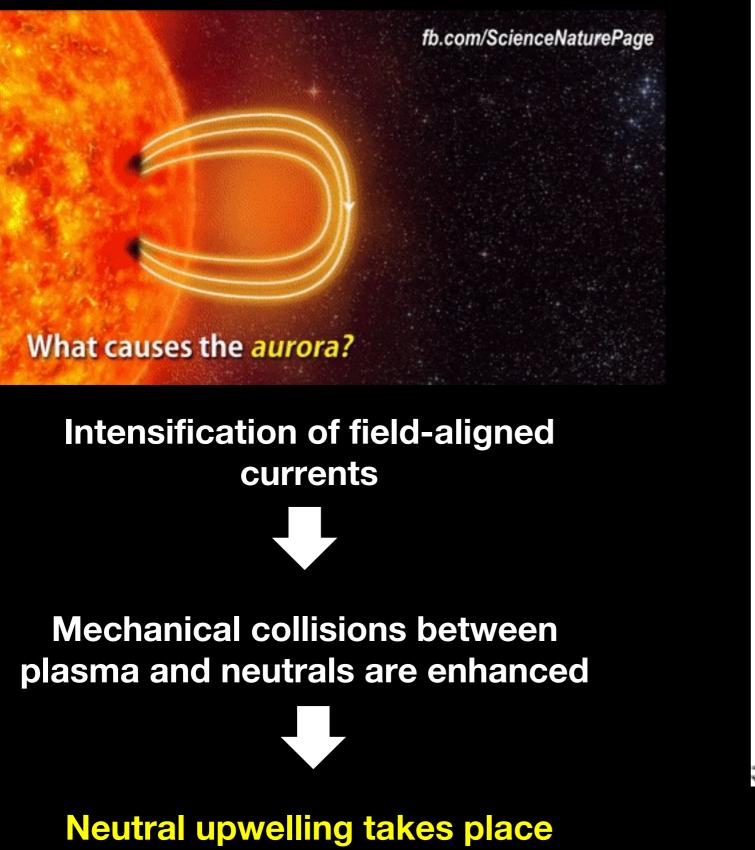


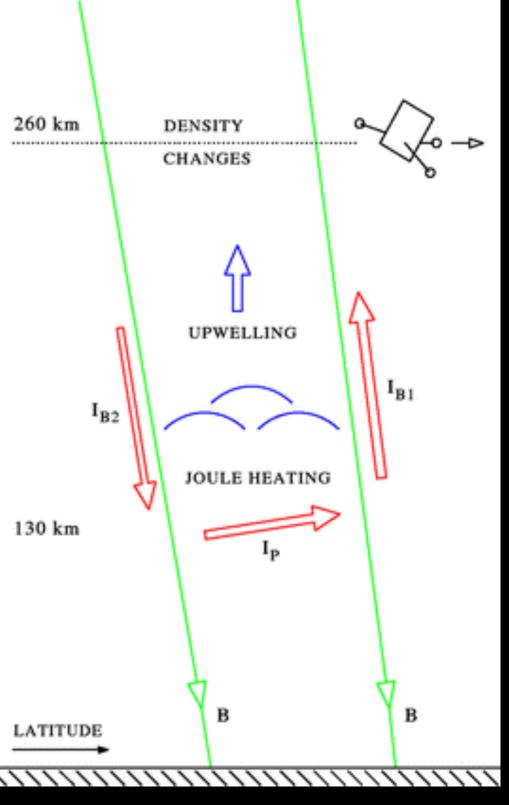
Denny M. Oliveira UMBC NASA/GSFC

> Eftyhia Zesta NASA/GSFC

and collaborators

Physical Process: Upwelling of neutral particles





Prölss (2011)

First satellite in space: Sputnik (4 October 1957)



Extracted from the NOVA documentary on Sputnik: https://www.youtube.com/watch?v=0MayNS7ZF68

First observations of density perturbations caused by a storm in LEO: Sputnik observations

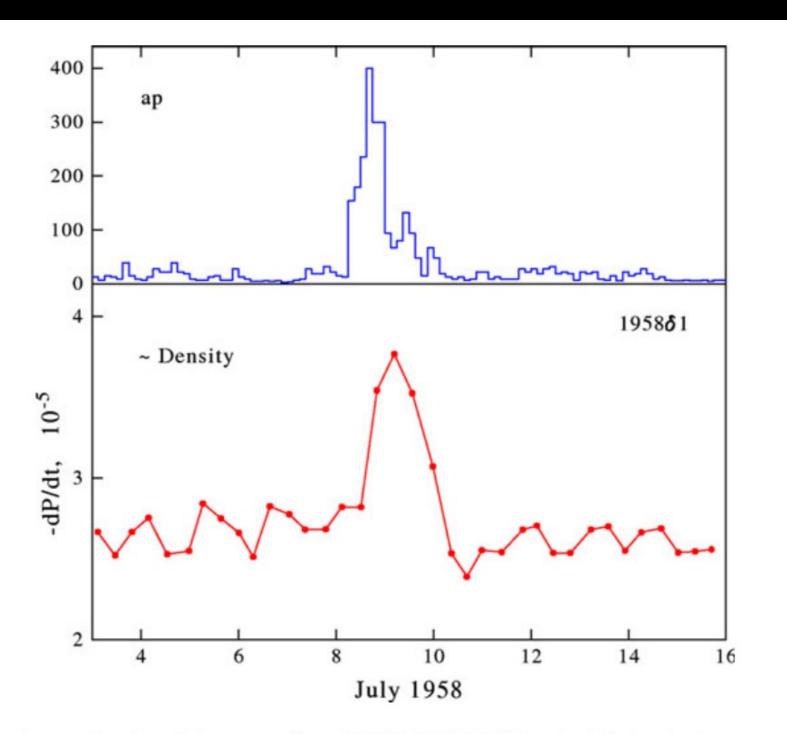


Figure from Prölss (2011)

Data from Jacchia (1959)

Fig. 3 Secular acceleration of the space object $1958\delta 1$ (SPUTNIK 3 rocket) during the large geomagnetic storm of July 8, 1958. The *upper panel* shows the *ap* index, the *lower* the rate of decrease in the orbital period, -dP/dt. This latter quantity is proportional to the atmospheric mass density along the orbit of the space object. (Based on data published by Jacchia 1959)

1. The development of many thermospheric empirical models for density determinations such as the Jacchia model series, and the MSIS models by the NRL

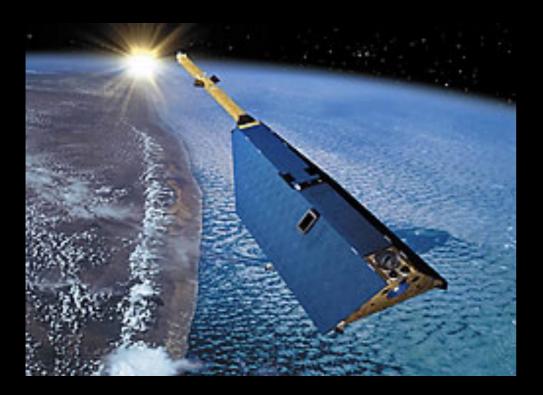
2. The launch of satellites equipped with mass spectrometers, such as the EXPLORER series and DE satellites (before 2000)

Surv Geophys (2011) 32:101–195 DOI 10.1007/s10712-010-9104-0

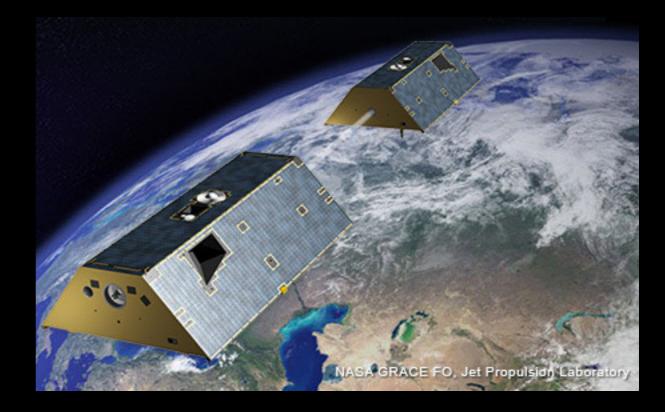
Density Perturbations in the Upper Atmosphere Caused by the Dissipation of Solar Wind Energy

Gerd W. Prölss

Density is measured by low-Earth orbit (LEO) satellites



CHAMP

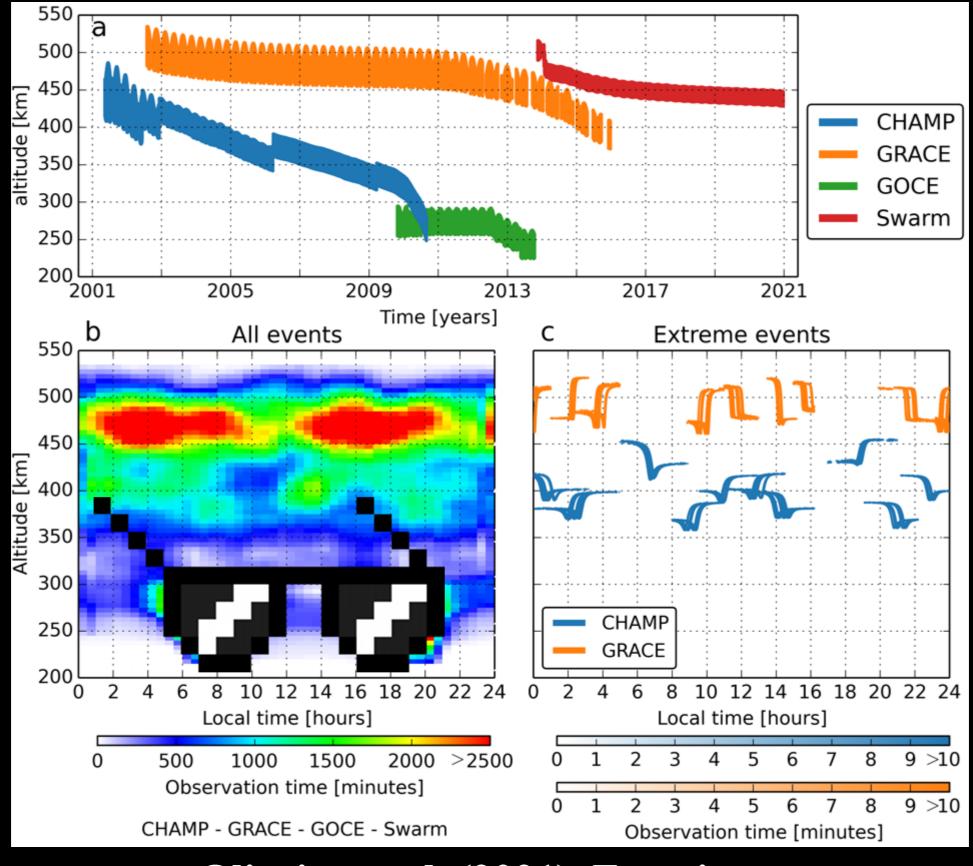


GRACE

High-accuracy accelerometers measure accelerations due to drag forces

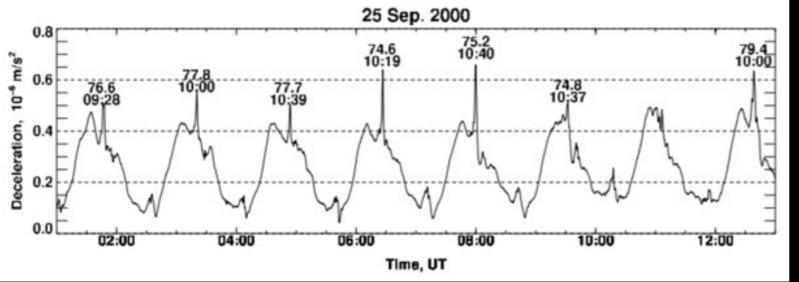
$$a_d = -\frac{1}{2}\rho C_D \frac{S}{m} V^2, \quad V = |\vec{V}_{s/c} + \vec{V}_{wind}|$$

LEO satellite coverage in LEO after 2000



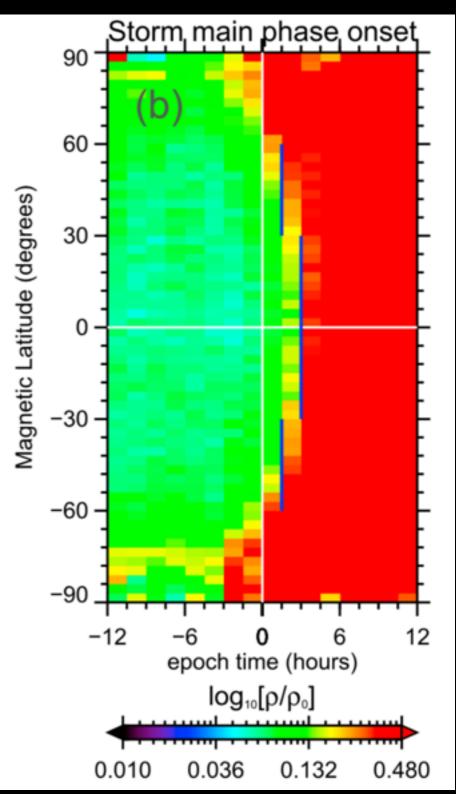
Oliveira et al. (2021), Frontiers

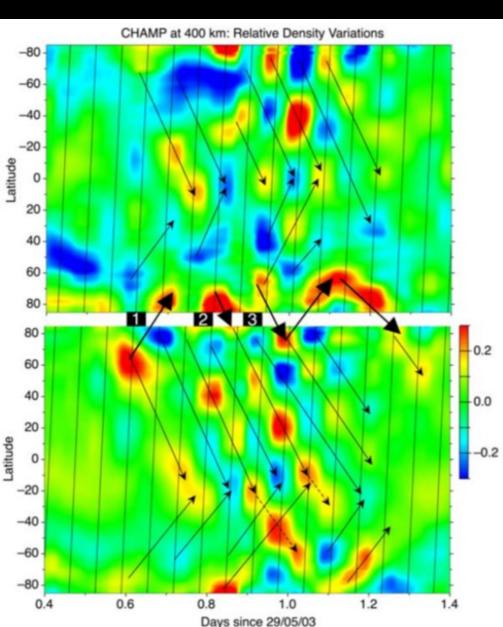
A few discoveries performed with CHAMP and GRACE data



Oliveira et al. (2017): 3-hour average time For energy → globaliation

Lühr et al. (2004): <-- Density enhancements at The cusp region





8

The background density is obtained by the Jacchia-Bowman 2008 model

The JB08 model obtains density from the exospheric temperature T_{∞}

$$T_{\infty} = T_{\ell}(\theta, \delta_{\odot}, H) + \Delta T_{LST}(H, \theta, z) + T_{UV}(\chi) + T_{GA}(Dst)$$

Quiet density (ρ_0) is obtained when there is no storm contribution, or $T_{GA} = 0$ (Oliveira et al., JGR, 2017)

Following Oliveira and Zesta, SW, 2019:

Orbital decay rate ($\Delta \rho = \rho - \rho_0$)

$$\frac{da}{dt} = -C_D \frac{S}{m} \sqrt{GM\langle a \rangle} \Delta \rho$$

Total orbital decay

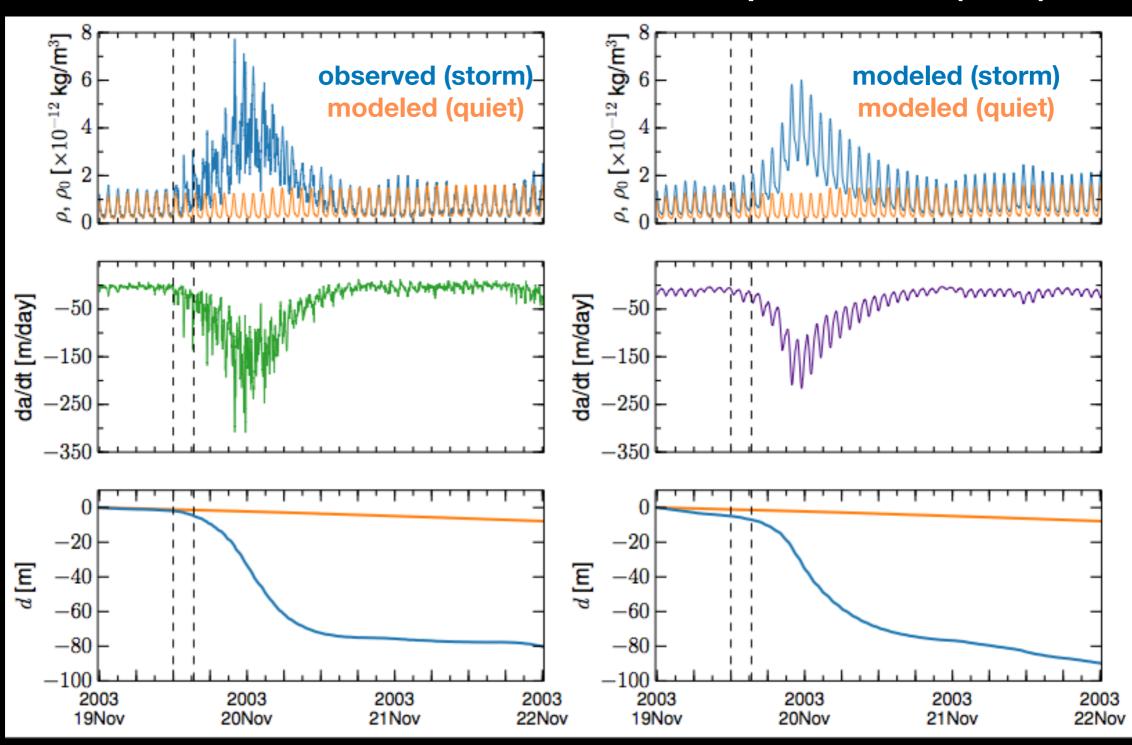
$$d(t) = \int_{t1}^{t2} a'(t) dt$$

20 November 2003 storm [GRACE: h = 480 km]

Oliveira & Zesta, Space Weather, (2019)

Data

Empirical model (JB08)



10

Jacchia-Bowman 2008 (JB2008) empirical model

 \rightarrow solar indices and geomagnetic indices as input data

 \rightarrow used as a forecasting/prediction model

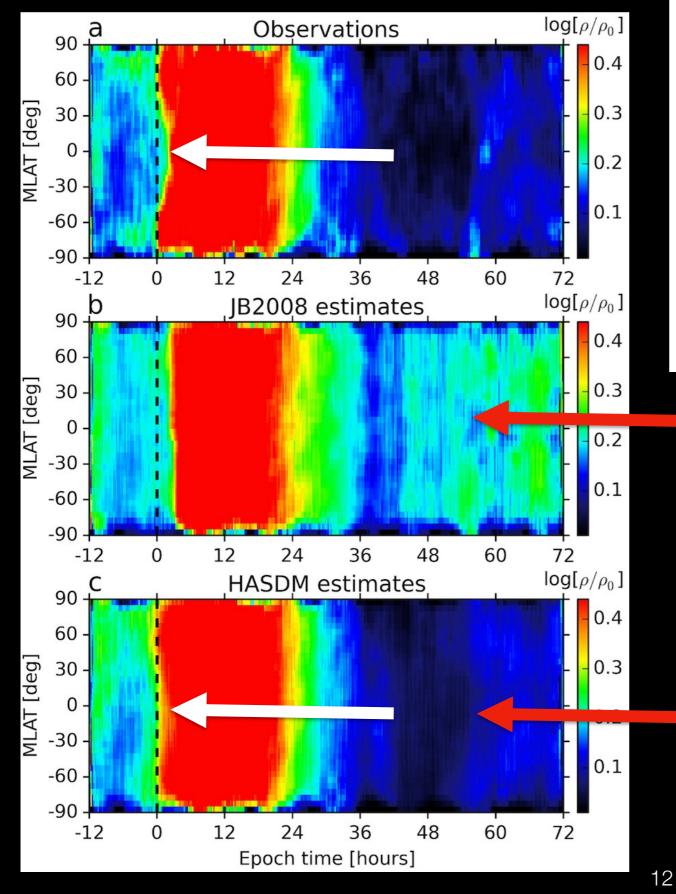
Bowman et al. (2008)

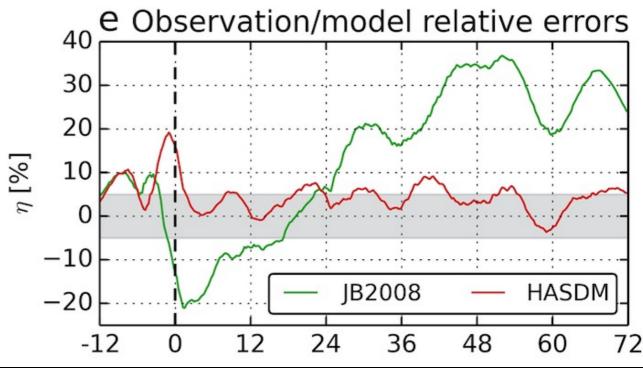
→ High Accuracy Satellite Drag Model (HASDM)
→ the model, property of the U.S. Space Force, is classified, but its outputs have been recently released to the public

→ JB2008 assimilates data from ~75 specification satellites to correct for densities

Tobiska et al. (2021)

Observation/model comparisons for the 7 extreme storms



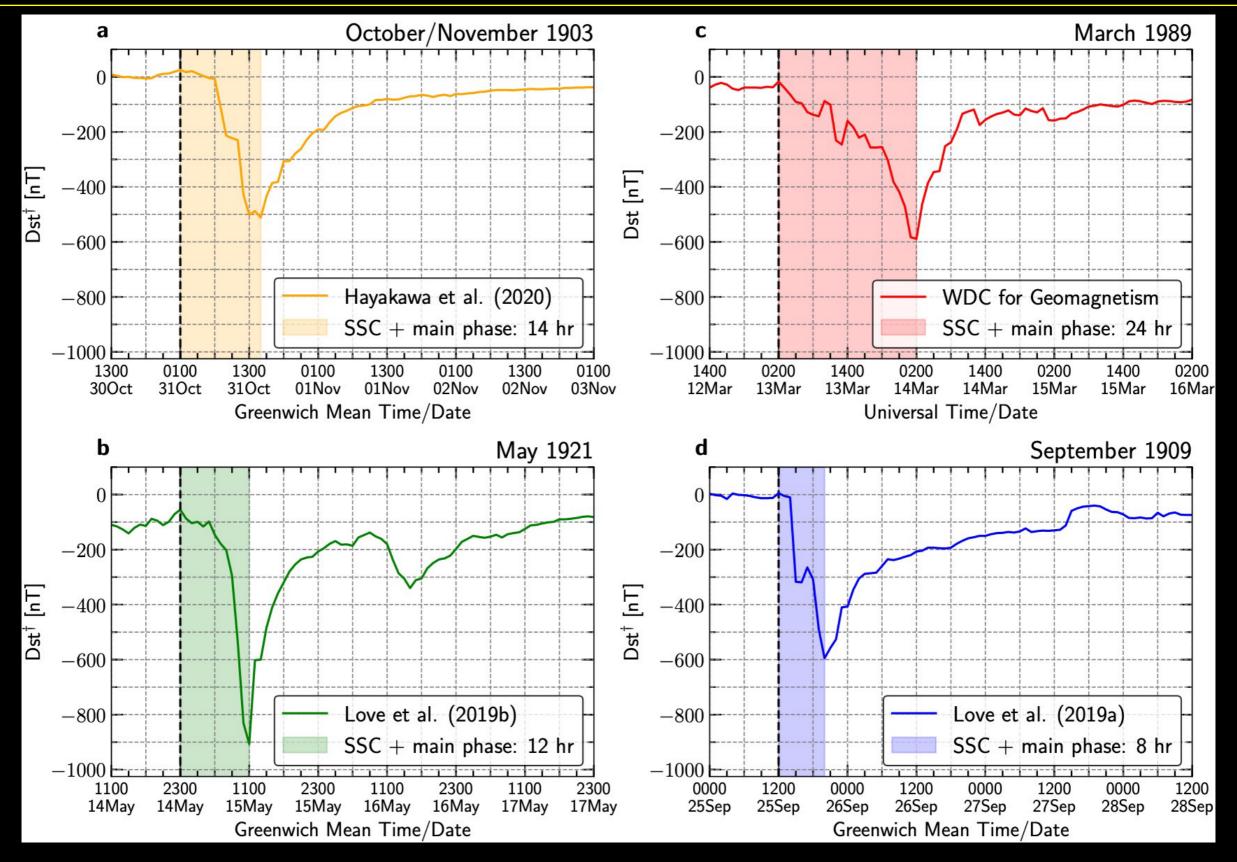


The empirical model overestimates density during storm recovery

Oliveira et al. (2021), Frontiers

The assimilation model (with ~75 specification satellites) perform better

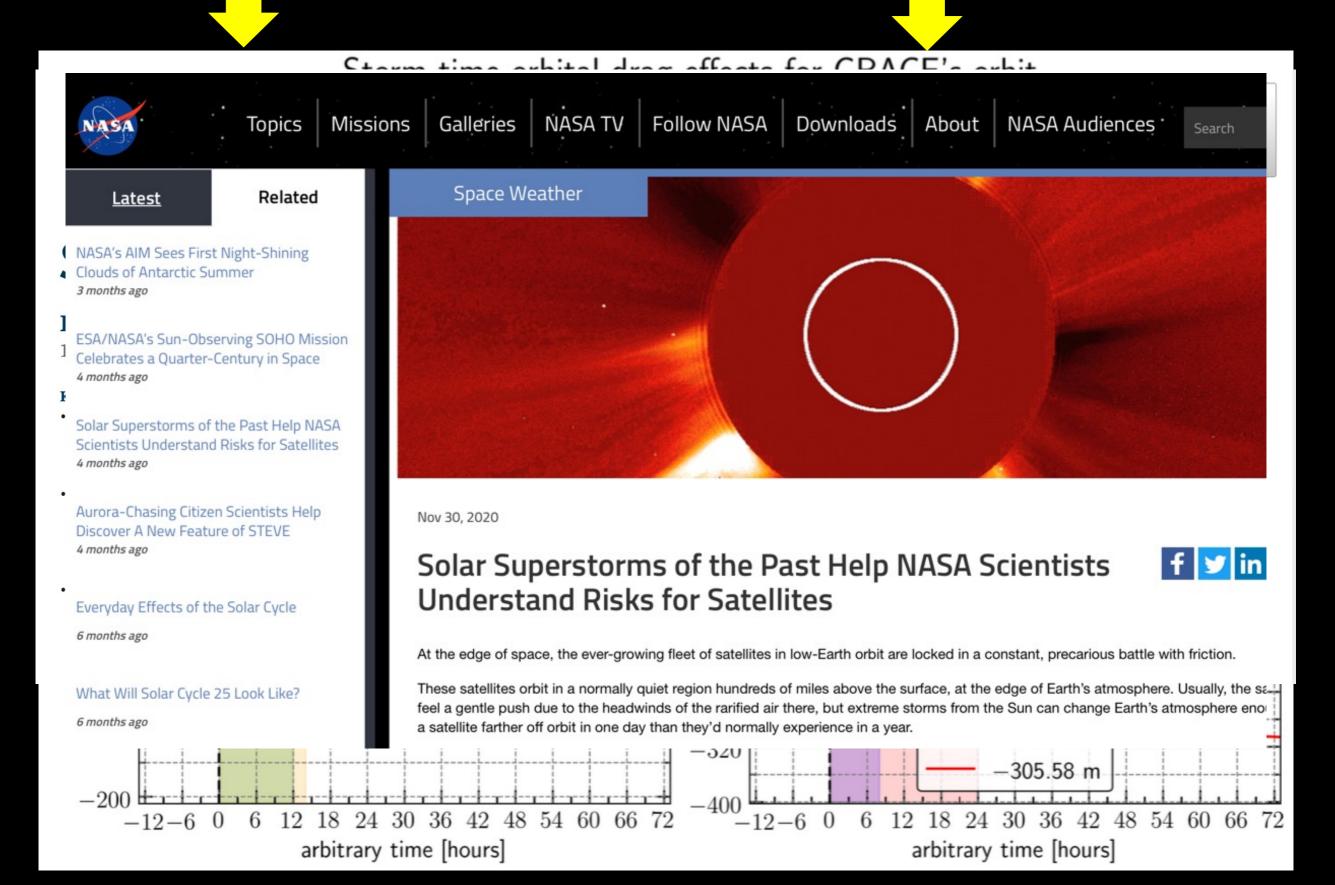
Four historical superstorms with different intensities and durations



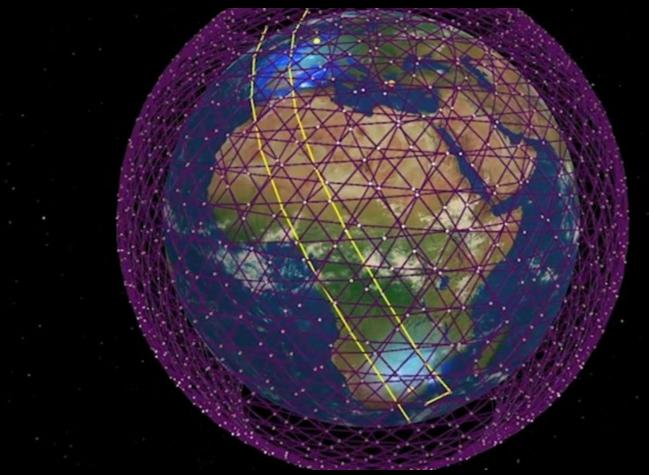
Oliveira et al., Space Weather, (2020)

~ The same storm time, different Dst min

Different storm time, the same Dst min



Future LEO satellite megaconstellations for internet service



Hundreds and thousands satellites

Starlink (by SpaceX)

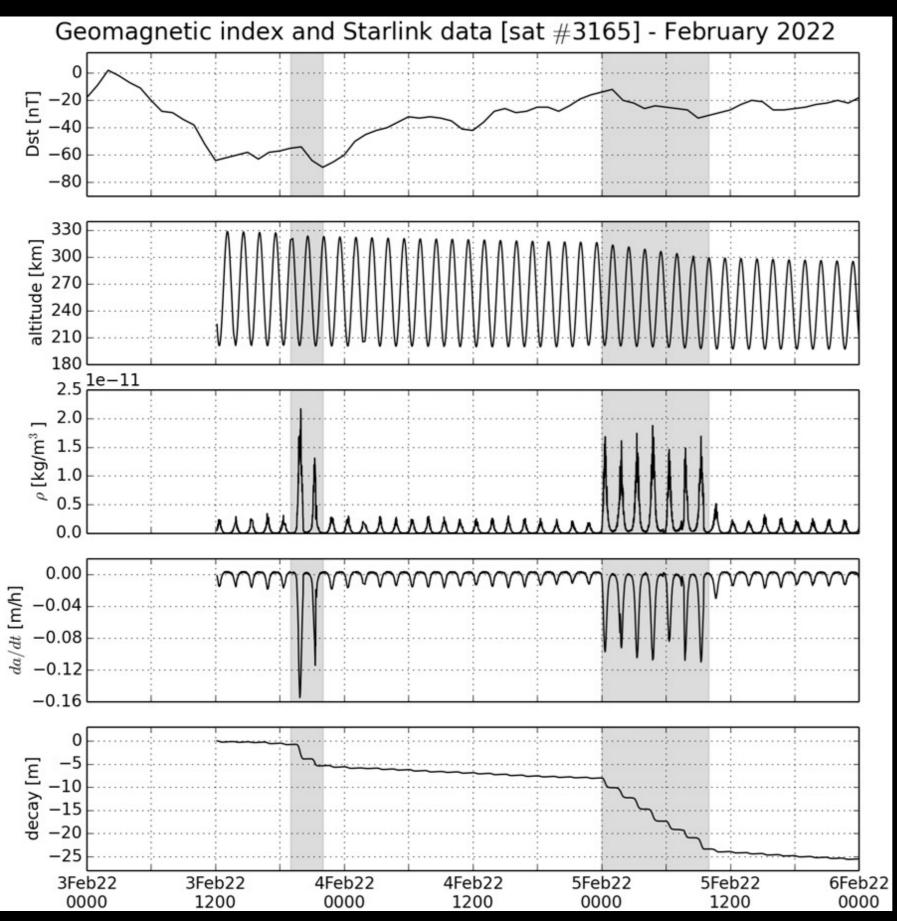
Other companies:

OneWeb Amazon Telesat

Data assimilation and Machine Learning



Starlink satellite #3165 survived the Feb 2022 magnetic storm

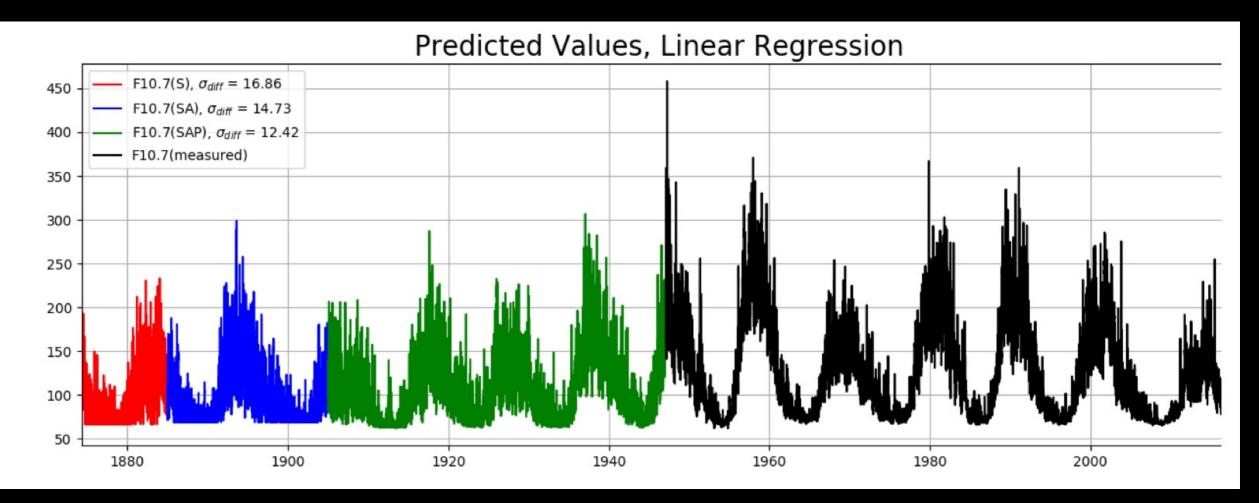


Lesson learned by SpaceX:

A weak magnetic storm can knock down a satellite from LEO. In fact, it brought down 38 out 49 satellites launched on 3 Feb 2022!

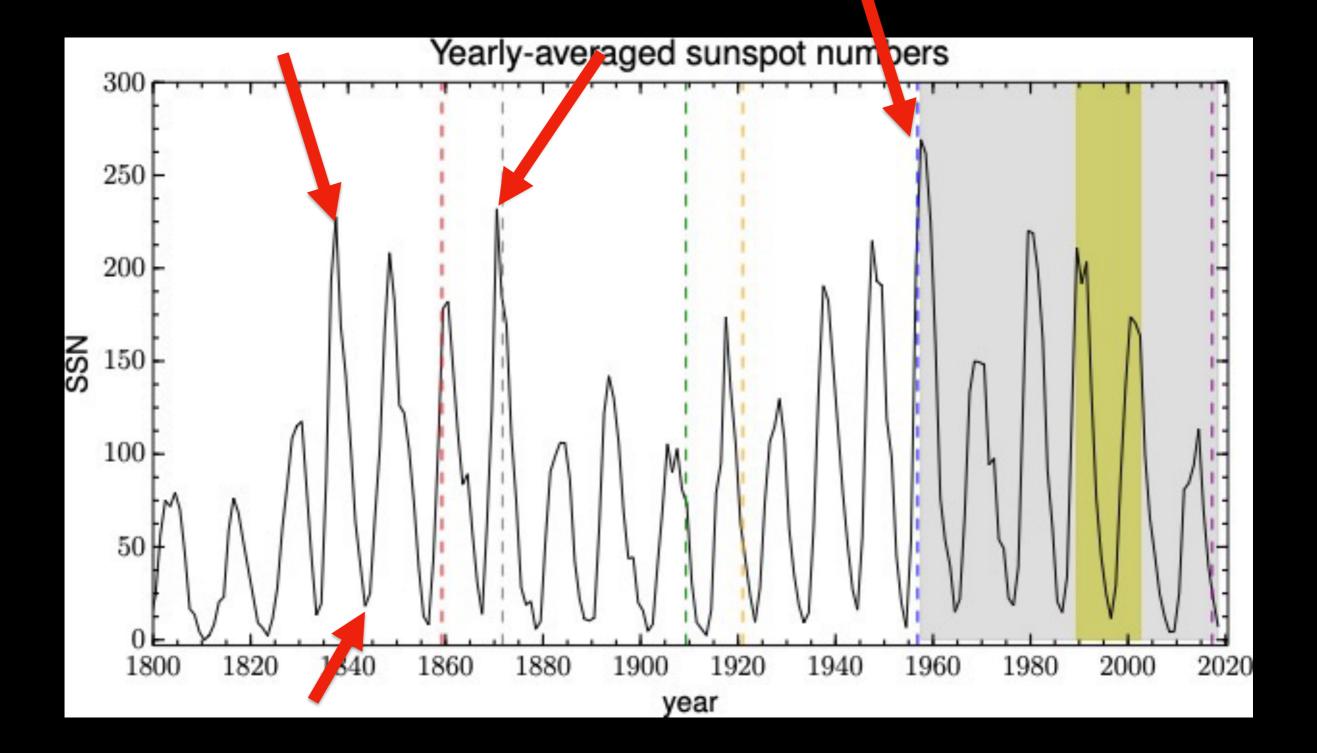
> Starlink data kindly provided by David Goldy from SpaceX

Predicting solar indices in the past using ML techniques



Black: observations Red: only SSN Blue: SSN + area Green: SSN + area + solar plage

The Gleissberg cycle will play a role



Gleissberg, Solar Physics, (1967)

Conclusions

1. A new method to extract background density effects during storm times has been developed

2. Historical archives can be used to assess thermosphere and drag response induced by past extreme storms and superstorms

3. In the future, there will be many megaconstellations of LEO satellites and most likely increased solar activity

4. These large-scale datasets can be assimilated with ML techniques, and increased solar activity will provide more extreme storms to help improve our empirical models



Bowman, B. R., Tobiska, W. K., Marcos, F. A., Huang, C. Y., Lin, C. S., & Burke, W. J. (2008). A new empirical thermospheric density model JB2008 using new solar and ge- omagnetic indices. In AIAA/AAS Astrodynamics Specialist Conference, AIAA 2008–6438 (p. 1-19). Honolulu, HI: American Institute of Aeronautics and Astronautics (AIAA) and American Astronautical Society (AAS).

Gleissberg, W. (1967). Secularly smoothed data on the minima and maxima of sunspot frequency. Solar Physics , 2 (2), 231-233. https://doi.org/10.1007/BF00155925

Oliveira, D. M., & Zesta, E. (2019). Satellite Orbital Drag During Magnetic Storms. Space Weather, 17(11), 1510-1533. https://doi.org/10.1029/2019SW002287

Oliveira, D. M., Zesta, E., Hayakawa, H., & Bhaskar, A. (2020). Estimating satellite orbital drag during historical magnetic superstorms. Space Weather , 18 (11), e2020SW002472. https://doi.org/10.1029/2020SW002472

Prölss, G. (2011). Density perturbations in the upper atmosphere caused by the dissipation of solar wind energy. Surveys in Geophysics , 32 (2), 101–195. https://doi.org/10.1007/s10712-010-9104-0

Tobiska, W. K., Bowman, B. R., Bouwer, D., Cruz, A., Wahl, K., Pilinski, M., Mehta, P. M., & Licata, R. J. (2021). The SET HASDM density database. Space Weather, 19(19), e2020SW002682. https://doi.org/10.1029/2020SW002682 20



Bruce Bowman (Feb 4, 1945 - Dec 31, 2020)

U.S. Air Force Command Scientist and developer of the JB08 empirical model