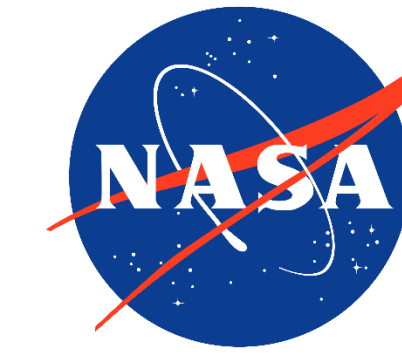




# GAIM driven by different Empirical Models: A Comparisons with Data Assimilation

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## Introduction/Motivation

The Ionosphere is a driven system with well defined climatological features that can show substantial day-to-day variability. Empirical models (EMs) are widely used to represent the significant drivers and they capture most large-scale variations. Data Assimilation (DA) methods have been leveraged in a variety of space weather studies and show promising applicability for capturing day-to-day variability, near-real time forecasting, and specific event studies [3].

### Why use DA for Ionospheric weather

- Physical processes governing ionospheric weather are not well understood (Forcing uncertainties).
- Advances in observational infrastructure allow for a variety of measurements to be assimilated.
- Operational/Scientific advantages such as driver estimation (variational methods)

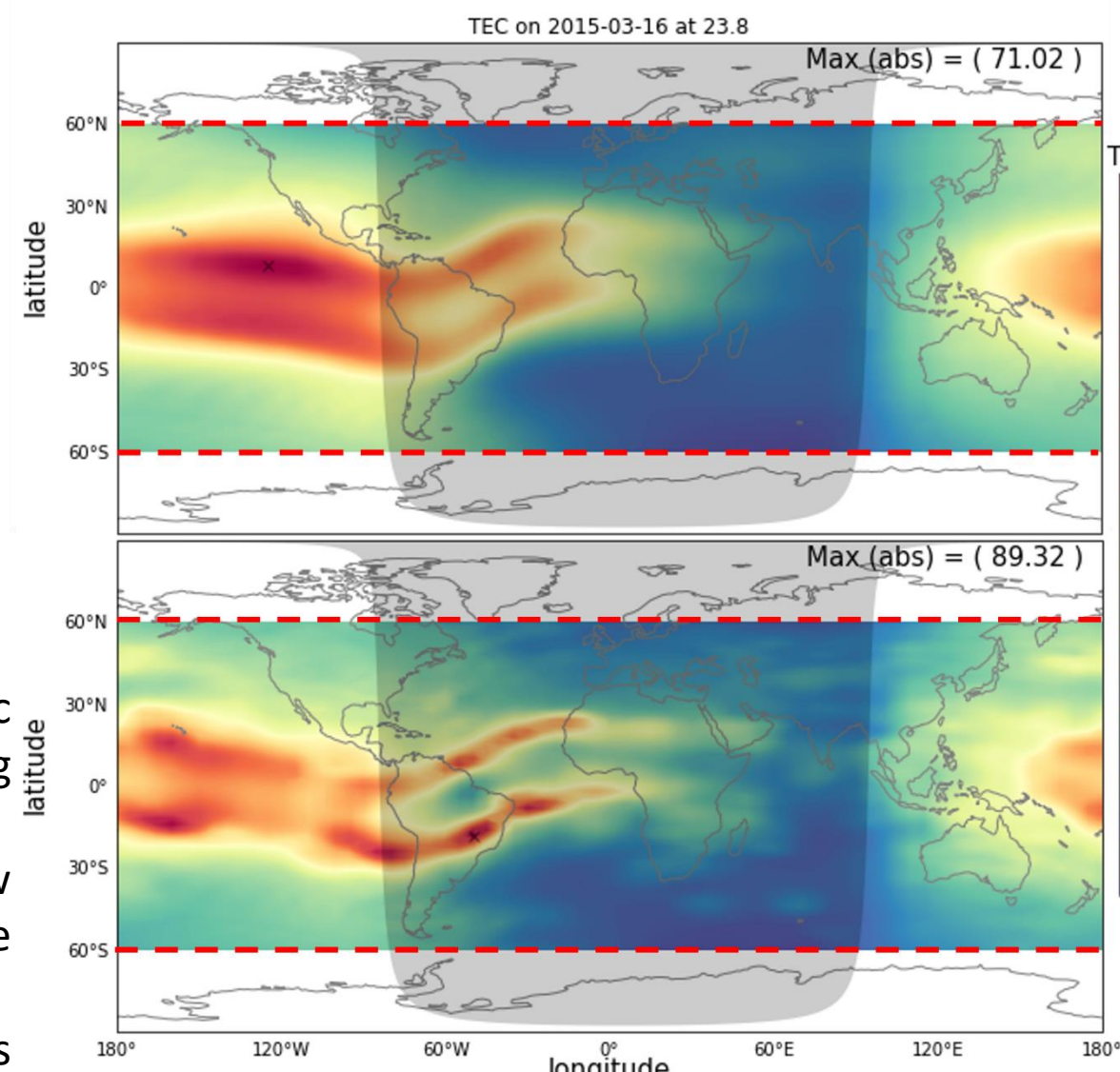


Fig 2. Example of physics-based model run (top) and DA run (bottom)

The focus of this study is to use the Global Assimilation of Ionospheric Measurements (GAIM) for two purposes:

1. Recommend empirical model options for the current development version of GAIM
  2. Investigate differences in QT and ST KF state estimations
- How: Compare GAIM forward model outputs using a different combination of empirical model options (EMO) to quiet-time (QT) DA outputs for March 16<sup>th</sup>, 2015.
- How: DA outputs are compared for March 16<sup>th</sup> and March 17<sup>th</sup>, 2015

## Part 1 : GAIM Empirical Model Study

### Comparison of Fwd model Outputs w/EMOs and QT DA outputs

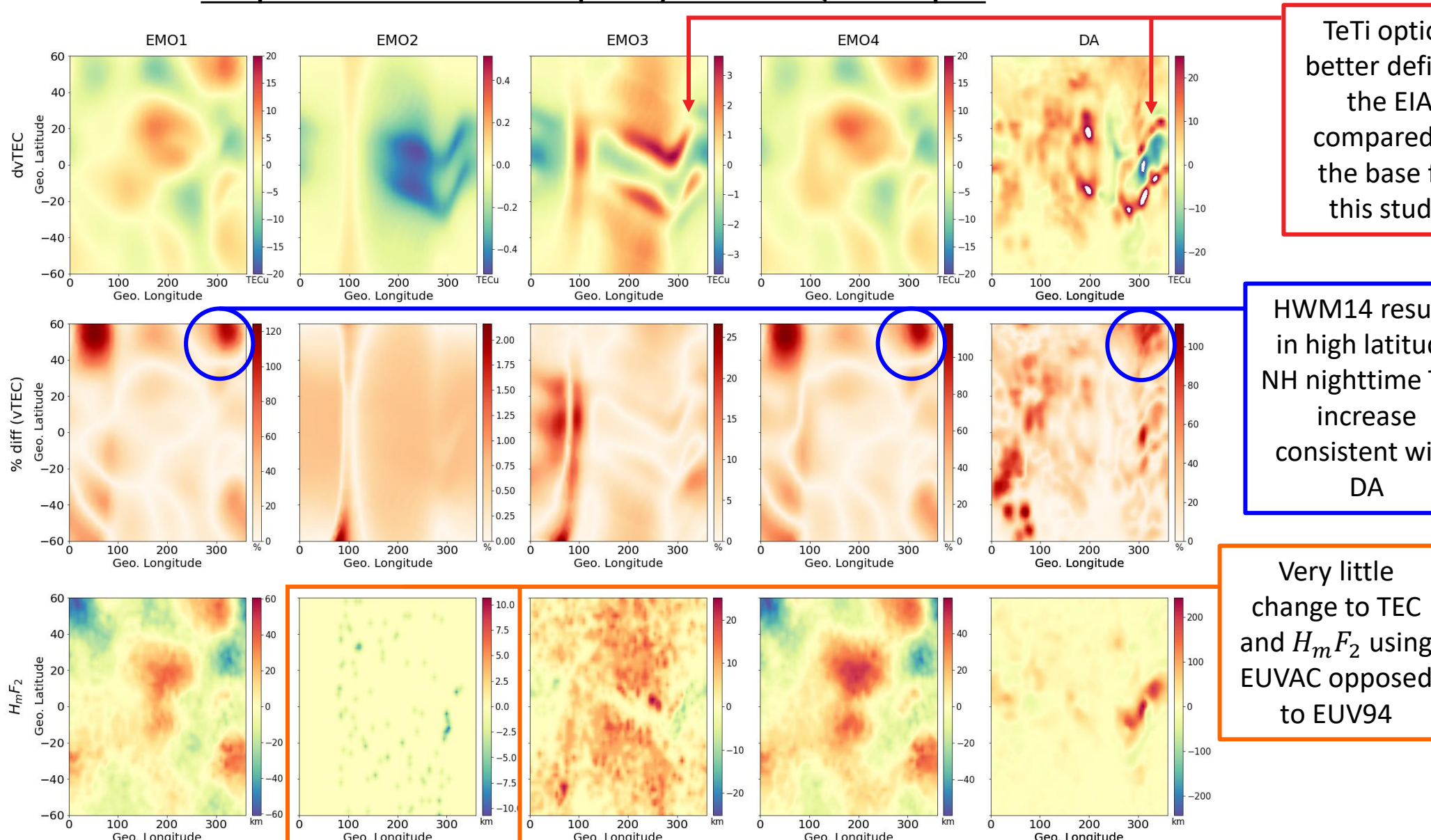


Fig 4. EMO comparison to QT DA

- HWM results in the largest TEC changes.
- TeTi option results in consistent increases in TEC on dayside high latitude boundary.
- HWM14 option creates high latitude % diff compared to base, more so in the NH.
- TEC more sensitive to Neutral wind than ion/electron Temp? (TeTi affects higher altitudes)
- All EMOs underestimate the magnitude changes associated with this QT day.

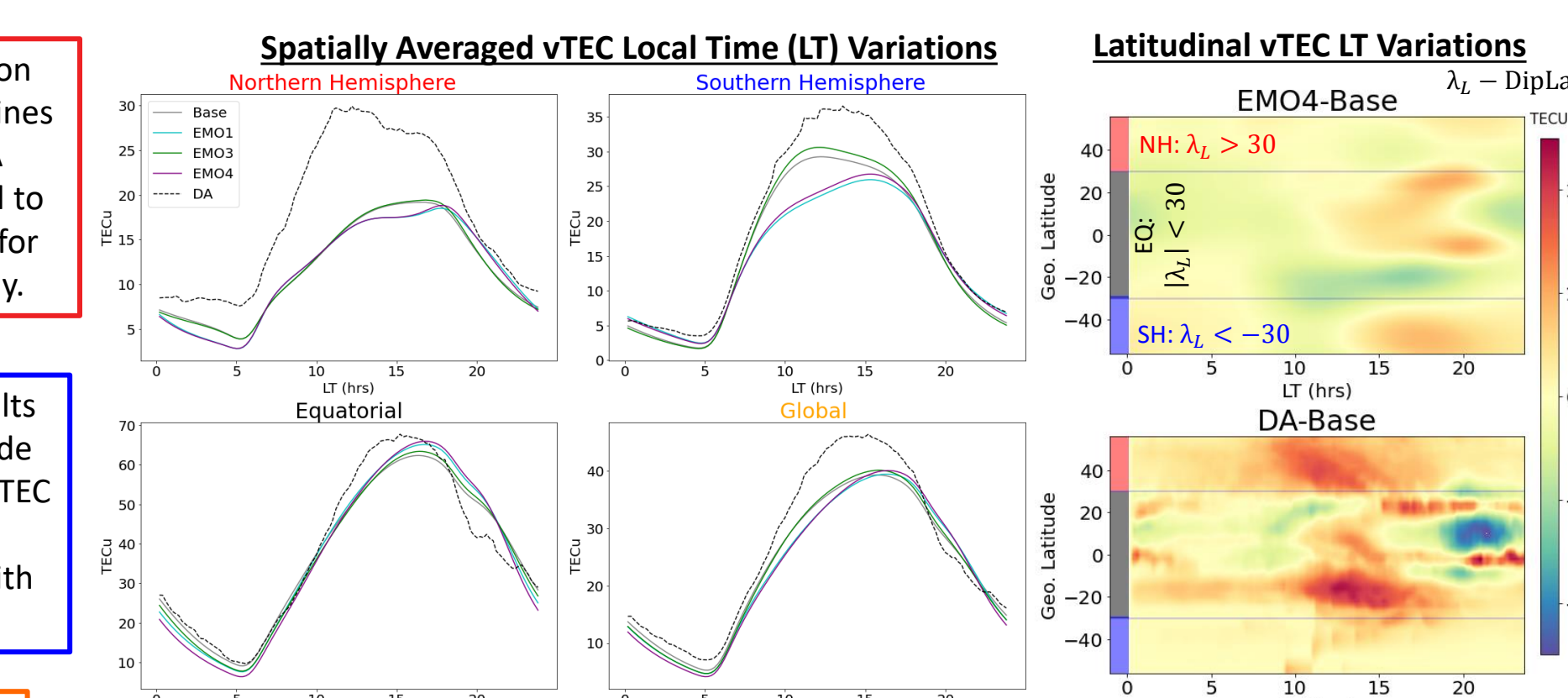


Fig 5. Local Time (Lon = 0) vTEC Variation for different latitude sectors

- Comparisons for all EMOs are worse in the NH and best in the EQ region.
- Similarity to SH could be due to lack of data compared to NH
- EMO1 slightly improves EQ DA comparison and slightly worsens comparison in NH/SH.
- EMO3 slightly improves upon the base in all comparisons.
- EQ region between 0°-20° show some similarities in Lat/LT variations potentially due to non-migrating tidal structure included in HWM14.

### Recommendations for Part 1:

- EMO2 is more flexible and only results in small changes (use).
- EMO3 appears to enhance DA comparison (use).
- EMO1 makes large changes in TEC but it is unclear if it will improve upon the base (inconclusive).

## Methodology

### Global Assimilation of Ionospheric Measurements (GAIM)[4]

- Time-dependent physics-based model of ionosphere-plasmasphere (IPM).
- Band-limited Kalman filter is used for DA of ion & electron densities
- Computational grid follows magnetic flux tubes
- Outputs: global  $N_e$ ,  $h_m F_2$ ,  $N_m F_2$

### Simulation Set up

- Single Ion
- Std output grid has resolution (2° x 5°) (lat x lon)
- 110-1100 km altitude ( $\Delta z = 10$  km)

### Assimilated Data

- GPS TEC
- Cosmic

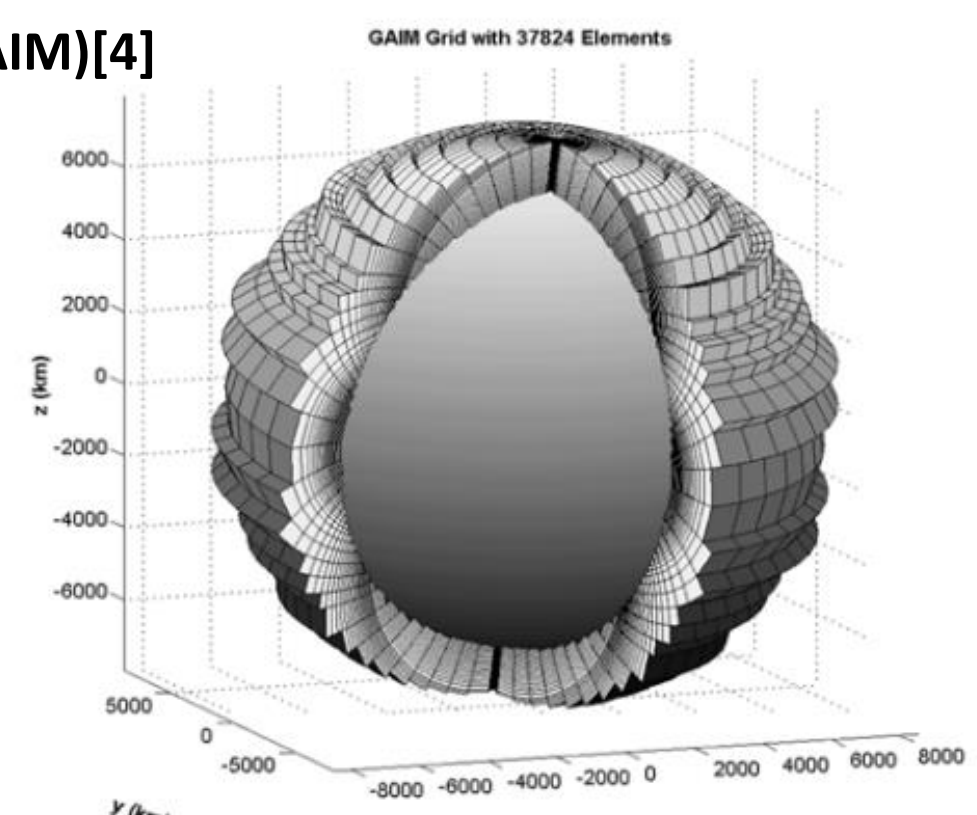


Fig 2. Example of GAIM fwd. model computation domain [4]

### Empirical Model Options (EMOs)

Run	HWM	EUV	TeTi
Base	93	94	SLR
EMO1	14	94	SLR
EMO2	93	VAC	SLR
EMO3	93	94	EM
EMO4	14	VAC	EM

### Basic Difference between Ems at $H_m F_2$

	TeTi	HWM	EUV
	SLR	93	94
	EM	14	AC
Simple Linear Relation	TBT-2012 (Te) TBKST-2021 (Ti) (ISR data)	Simple f10.7 dependence	Proxy F10.7 as only input
Forcing Difference (F2):	Large	Large	Small

## Preliminary ST/QT DA output comparisons

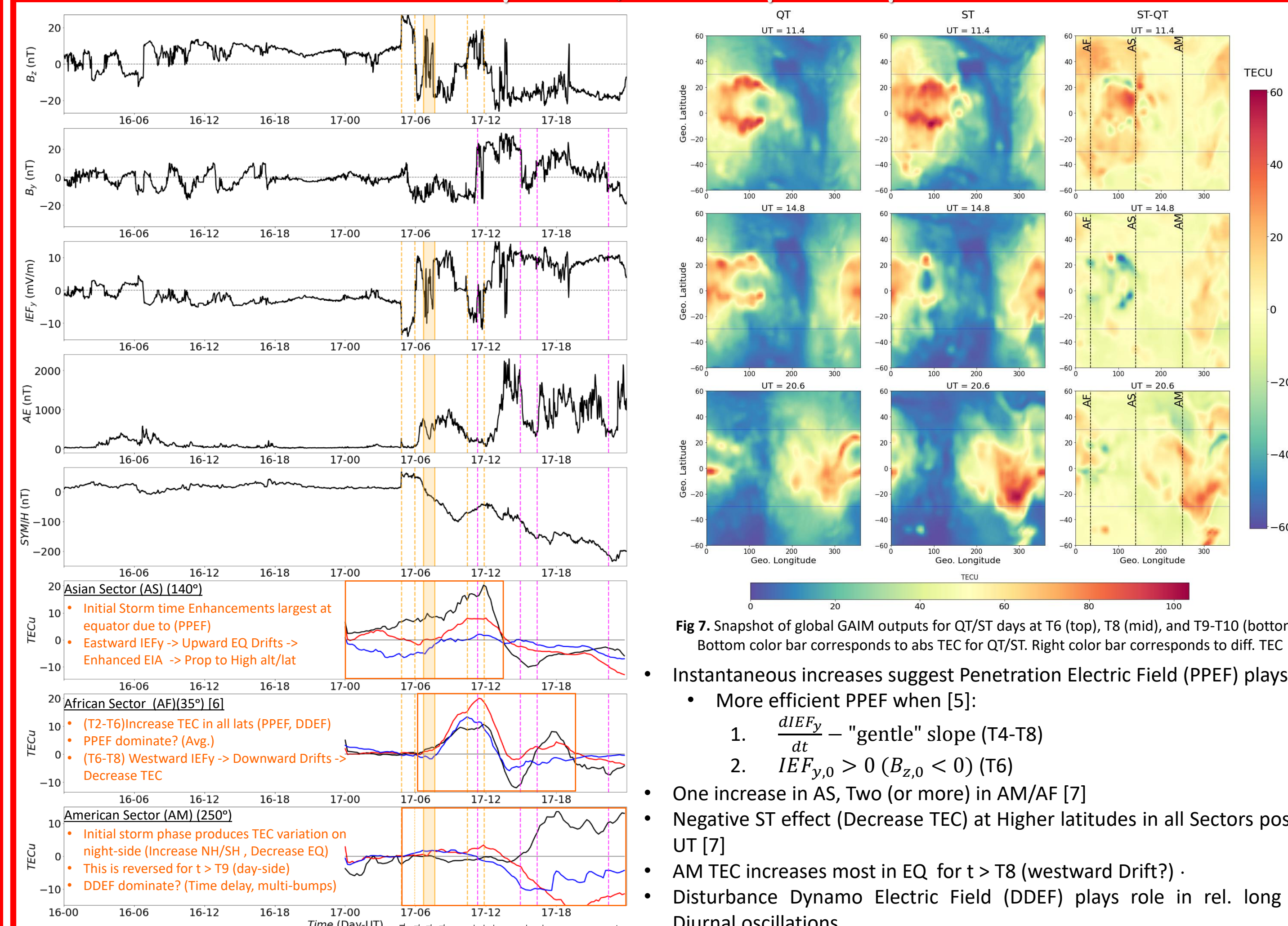


Fig 7. Comparison of QT/ST chronology and Averaged TEC difference field in differ latitude sectors

## Summary/Future Work

### Part 1

- HWM option resulted in the largest deviations
- TeTi option appears to improve DA comp. and consistently increases TEC at high lats.
- KF DA approaches may help improve studies where ionospheric day-to-day variability is high.
- The Following recommendations were made:
  - Use EMO2 & EMO3 in dev. GAIM.
  - EMO1 currently inconclusive.

### Part 2

- GAIM averaged DA runs reproduce observed trends in other publications
- Identified times of potential PPEF dominance to TEC changes for AS/AF and DDEF dominance to TEC changes for AM.
- Demonstrated the Potential for GAIM to infer physics-based understanding of storm-time event impact on IT.

### Future Work

- Comparisons to data (DMSP) and IRI2020
- GAIM with 4DVAR estimation of E field and Neutral wind.

## References

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