

# Discovering relationships between FAC and TEC

Ryan McGanaghan

CPAESS, University Corporation for Atmospheric Research (UCAR)  
NASA Jet Propulsion Laboratory, California Institute of Technology

Tony Mannucci, Olga Verkhoglyadova, Xing Meng

NASA JPL

NASA Data Science Group – Chris Mattmann

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## Main points

Gain understanding of possible TEC<->FAC relationship

1. Event studies
2. Expansive data study

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## Main points

Gain understanding of possible TEC<->FAC relationship

1. Event studies
2. Expansive data study

} Convergence enables new frontier...

Expand relationships with machine learning approaches

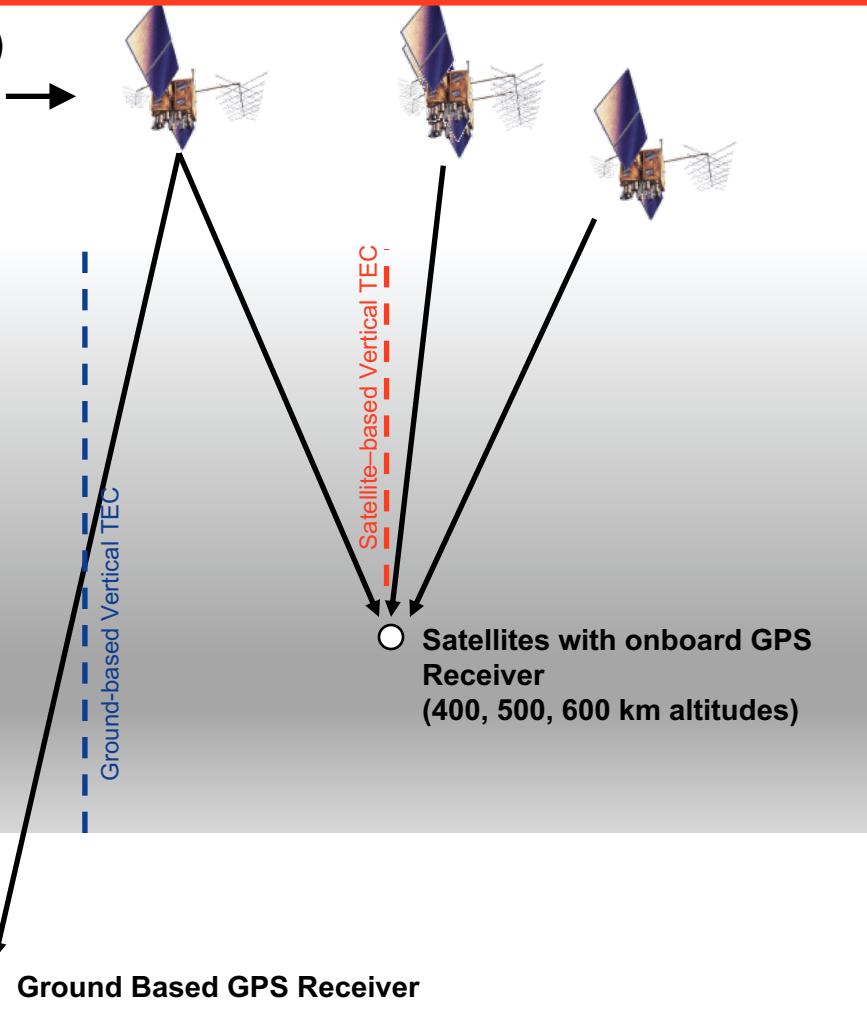
Large-scale relationship: AMPERE<->VTEC

Small-scale relationship: Swarm<->TEC variability

# Overview of TEC data: Technique

TEC Overview - Ground-based - Space-based - Causal Connection

**Global Navigation Satellites (GPS)  
(20,230 km altitude)**



Slide courtesy of Tony Mannucci

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**Global Navigation Satellites (GPS)**  
(20,230 km altitude)

1000 km

Verticalization requires projection  
Generally use elevation mask  
Important at high-latitudes since significant gradients exist

Ionosphere

100 km



Satellite-based Vertical TEC

Satellites with onboard GPS Receiver  
(400, 500, 600 km altitudes)

Ground Based GPS Receiver

Slide courtesy of Tony Mannucci

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**Global Navigation Satellites (GPS)**  
(20,230 km altitude)

1000 km

Ionosphere

100 km

What is the altitudinal  
 $N_e$  contribution?



Satellite-based Vertical TEC

Satellites with onboard GPS  
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(400, 500, 600 km altitudes)

Ground Based GPS Receiver

Slide courtesy of Tony Mannucci

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## MIT Haystack Madrigal Upper Atmospheric Science Database: Global ground-based GPS receivers

- Resolution: receiver network combined into  $1^\circ \times 1^\circ$  lat. x long. maps at 5-minute cadence

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- Actively working with:
  - ❖ Greenland Network of GNSS receivers ([GNET](#))
  - ❖ Canadian High Arctic Ionospheric Network ([CHAIN](#))
- New collaboration with [INGV](#) and [GRAPE](#)

# Overview of TEC data

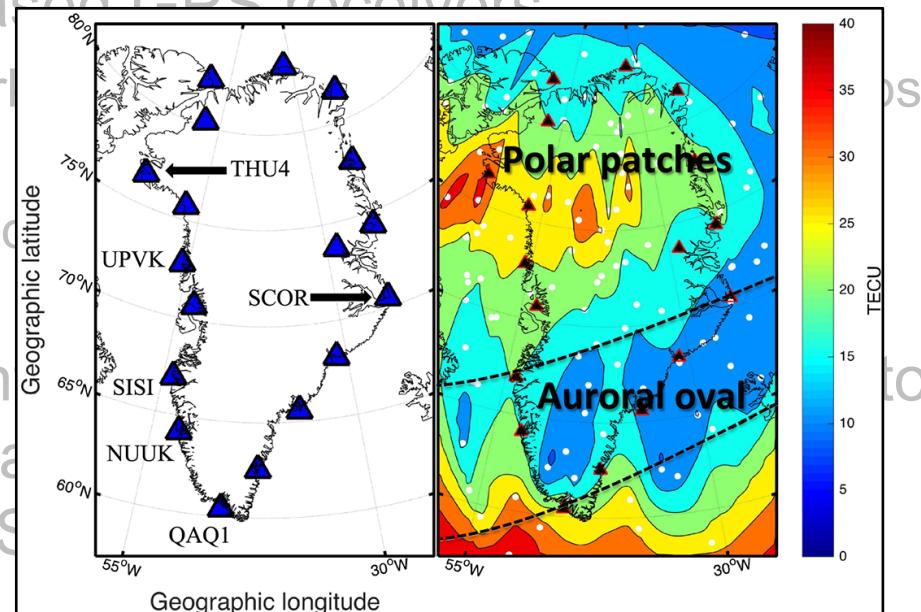
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- Relationship with Anthea Cores resolution individual station

Relationships with several international ground-based receivers capable of tracking constellation (GPS, GLONASS)

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**Important to involve JPL given their expertise with GNSS signals to study the ionosphere**

# Overview of TEC data

TEC Overview - Ground-based - **Space-based** - Causal Connection

Numerous satellite missions...

- TerraSAR-X (~500 km)
- Swarm constellation (~460 & 520 km)
- CASSIOPE (elliptical: 350x1500 km)
- GRACE (~400-450 km)
- CHAMP (~400 km)
- Numerous others

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- Numerous others

Variable resolutions dependent on satellite orbit and capability of onboard GNSS receiver

# Overview of TEC data

TEC Overview - Ground-based - Space-based - **Causal Connection**

“The key signature that shows the TEC increases [at high-latitude] to be due to auroral particle precipitation is the irregular and fluctuating nature of the pattern’ [*Mendillo, 2005*]

Key to distinguish:

- Local (M-I induced) and non-local (ionospheric horizontal transport-induced) TEC variations
- M-I induced and more regular solar radiation induced TEC structuring

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## Our foci

# Overview of TEC data

TEC Overview - Ground-based - Space-based - **Causal Connection**

## Possible M-I mechanisms relating TEC and FAC:

- Neutral composition change
- Particle precipitation from plasmasphere and ring current

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TEC Overview - Ground-based - Space-based - **Causal Connection**

## Possible M-I mechanisms relating TEC and FAC:

- Neutral composition change
- Particle precipitation from plasmasphere and ring current

**Strong likelihood of connection, so initial investigation focused here**

# Overview of TEC data

TEC Overview - Ground-based - Space-based - **Causal Connection**

## Possible M-I mechanisms relating TEC and FAC:

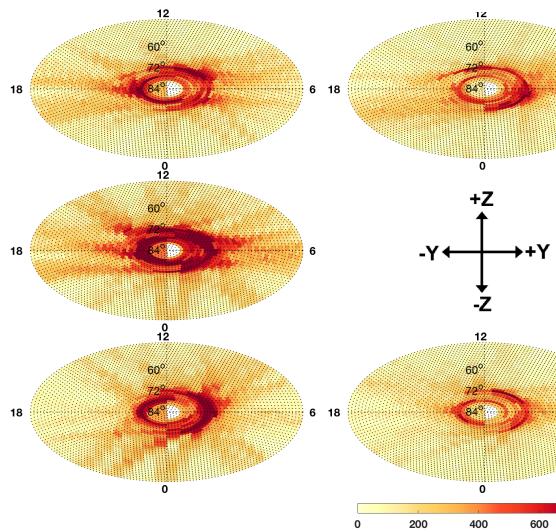
- Neutral composition change
- Particle precipitation from plasmasphere and ring current

**Any relationship found will also address lack of ability to specify high-latitude ionospheric drivers**

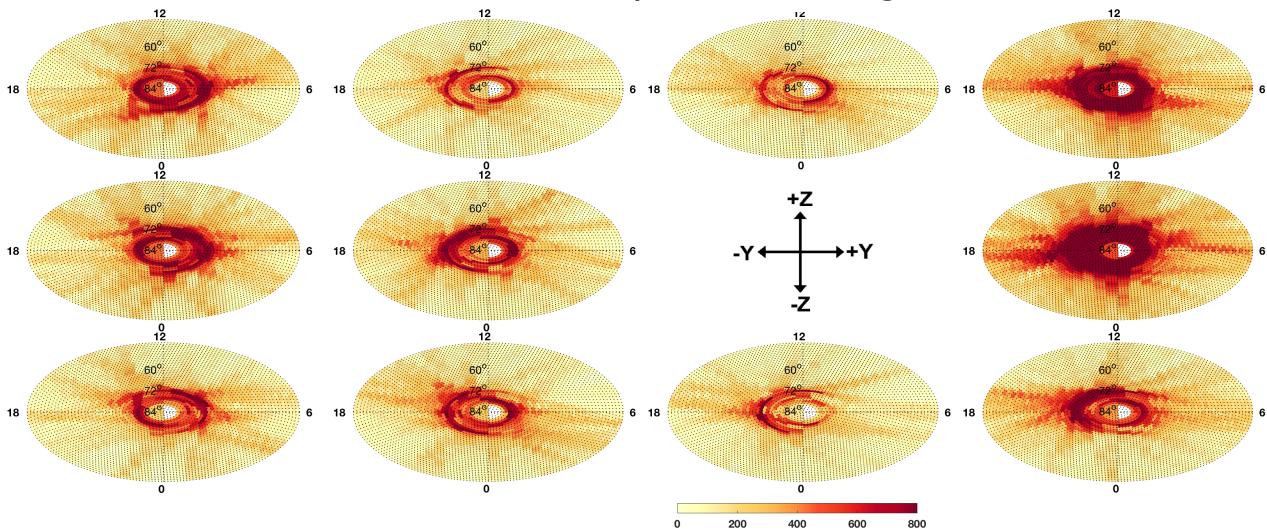
# Swarm FACs Multi-scale statistical results: Observation density

## Statistical Results - April 22, 2014 Event - Extension

Northern Hemisphere  
Nov 2014 – Mar 2015



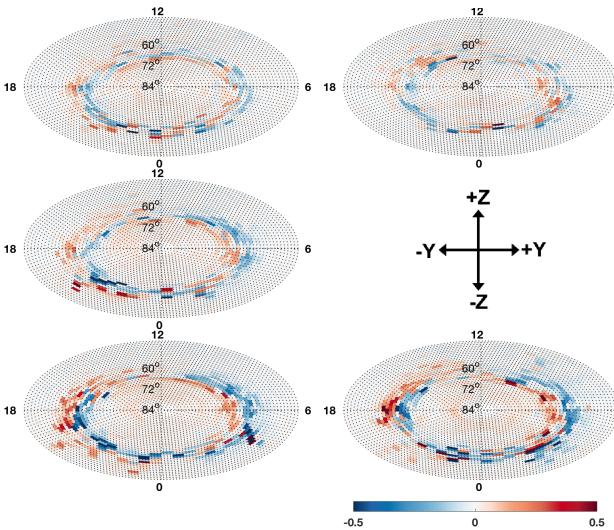
Northern Hemisphere  
Apr 2015 – Aug 2015



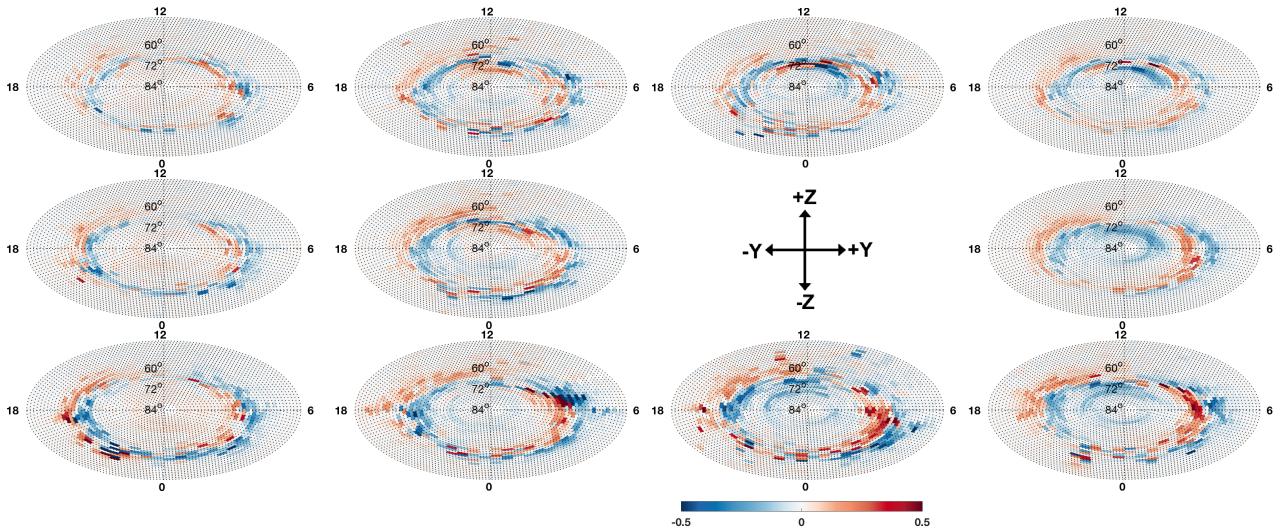
# Swarm FACs Multi-scale statistical results: 50 km MLAT scale size medians

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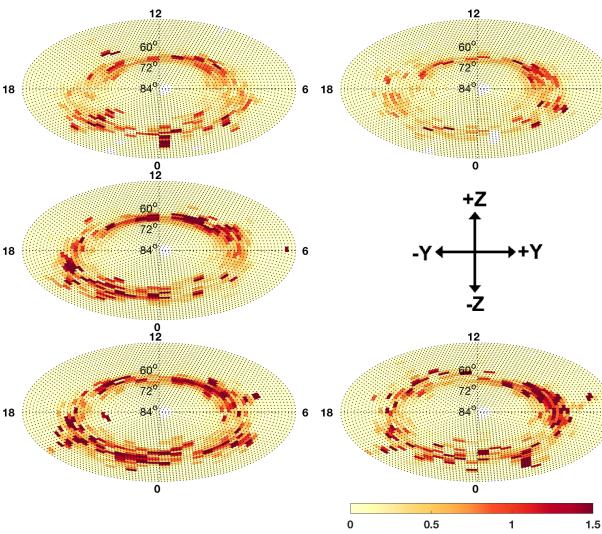


# Swarm FACs Multi-scale statistical results:

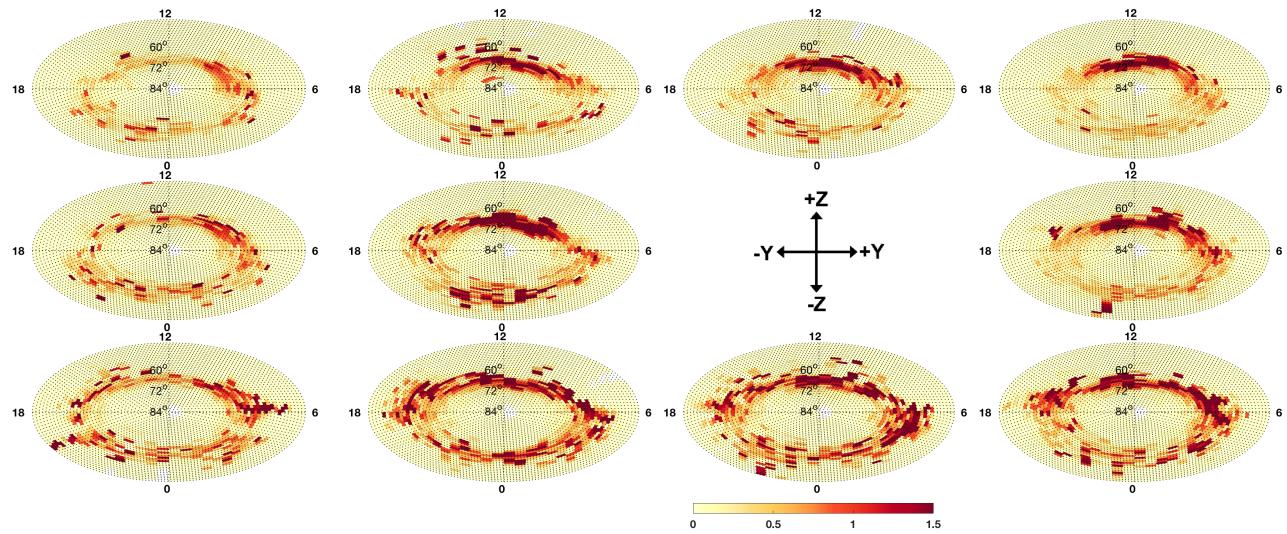
50 km MLAT scale size bin variances

## Statistical Results - April 22, 2014 Event - Extension

Northern Hemisphere  
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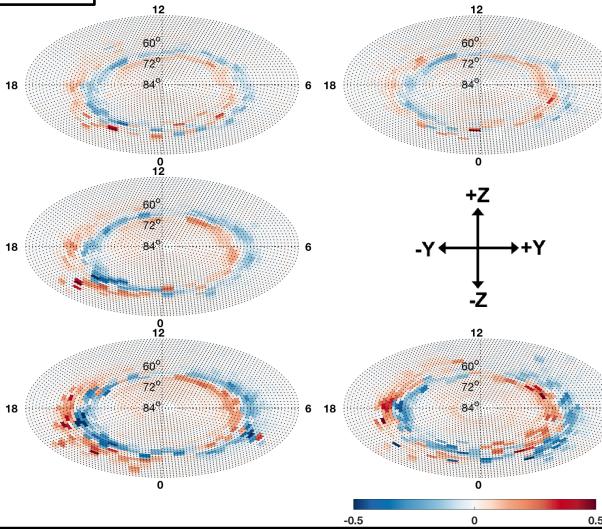
# Swarm FACs Multi-scale statistical results:

400 km MLAT scale size medians

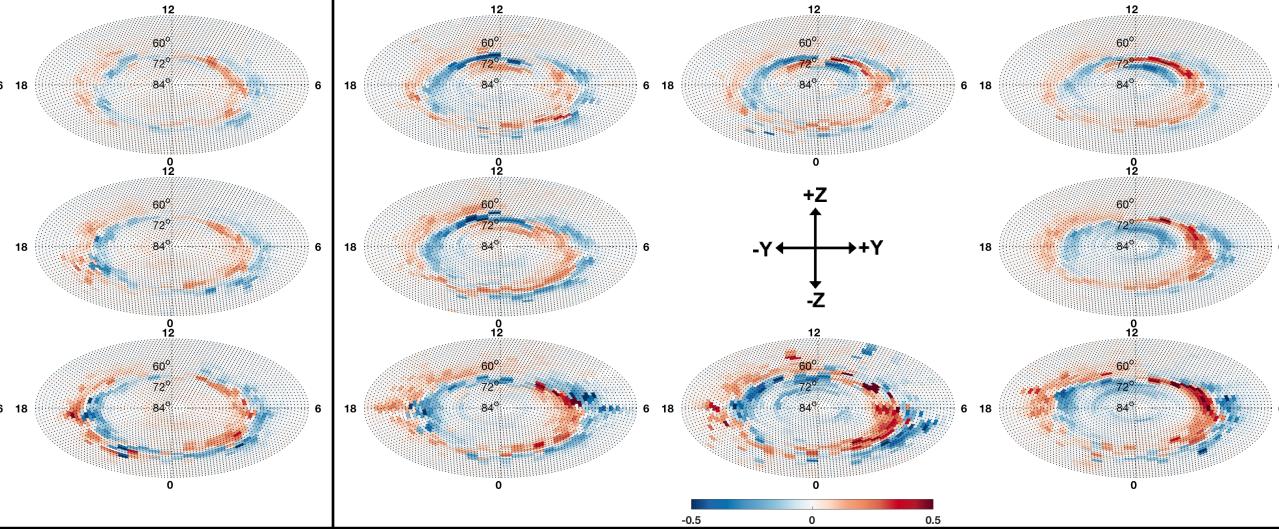
## Statistical Results - April 22, 2014 Event - Extension

NH

Winter

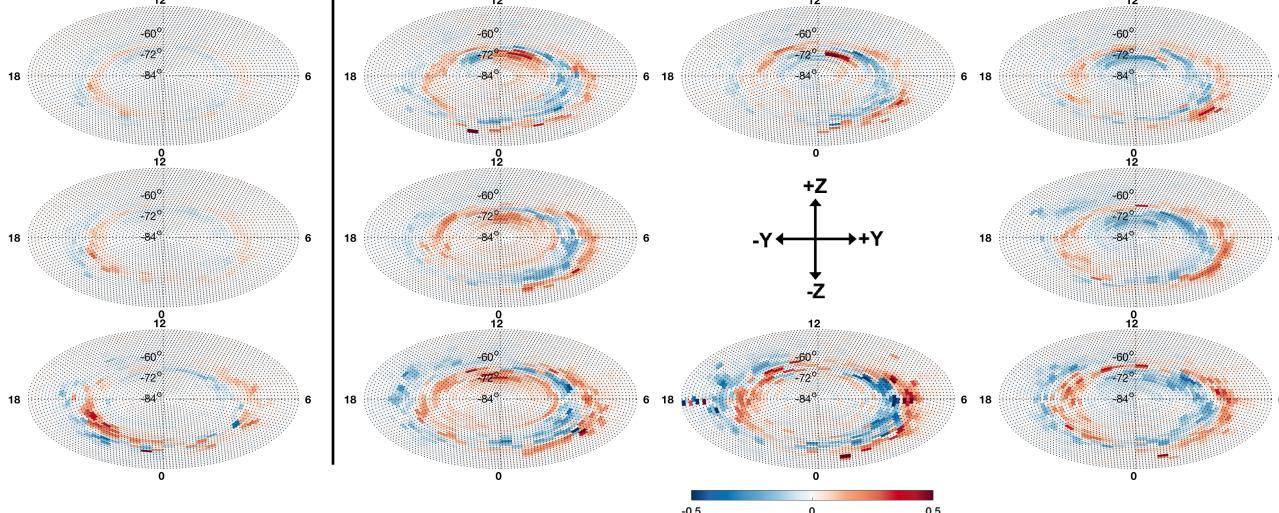
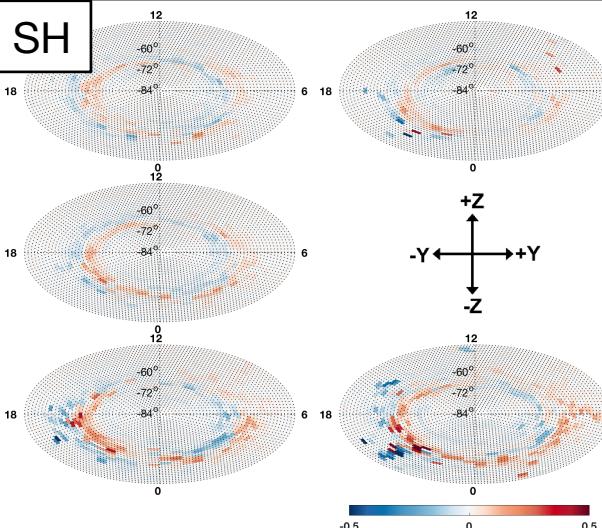


Summer



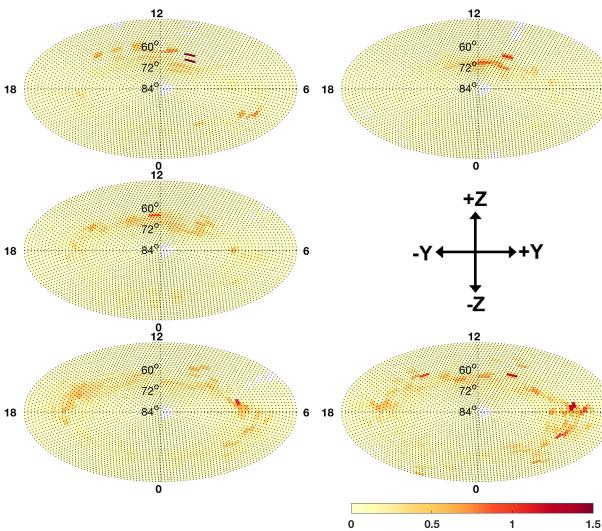
SH

Winter

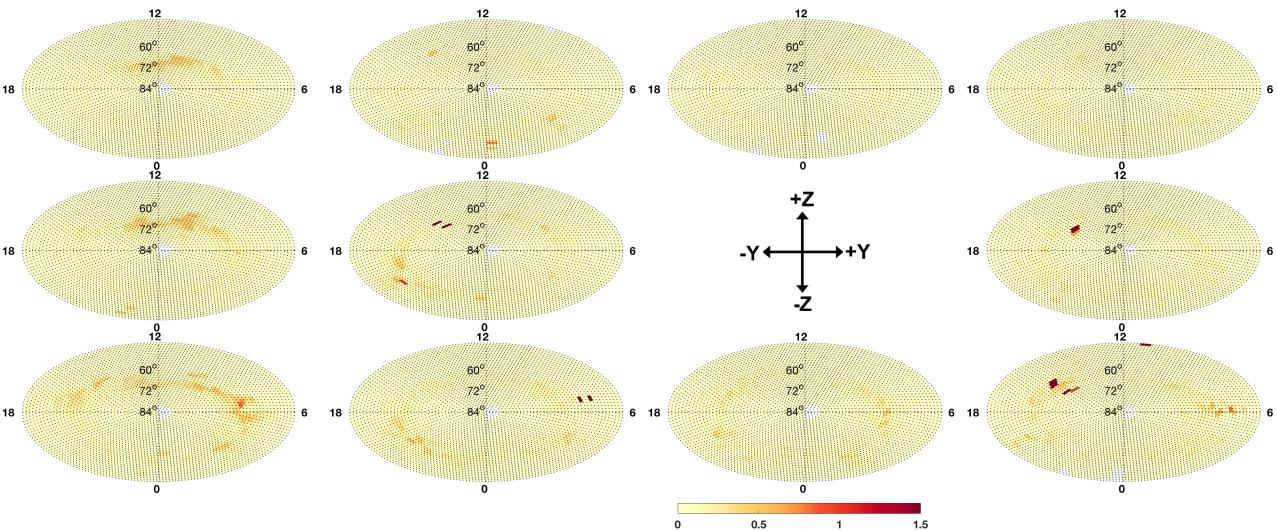


### Statistical Results - April 22, 2014 Event - Extension

Northern Hemisphere  
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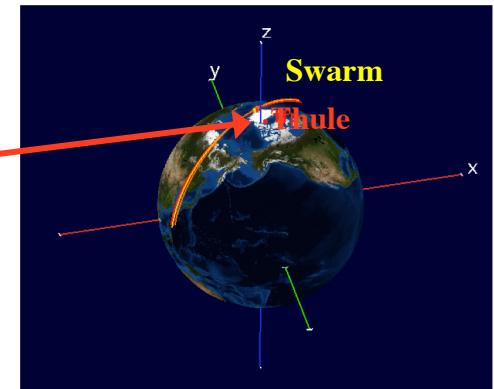
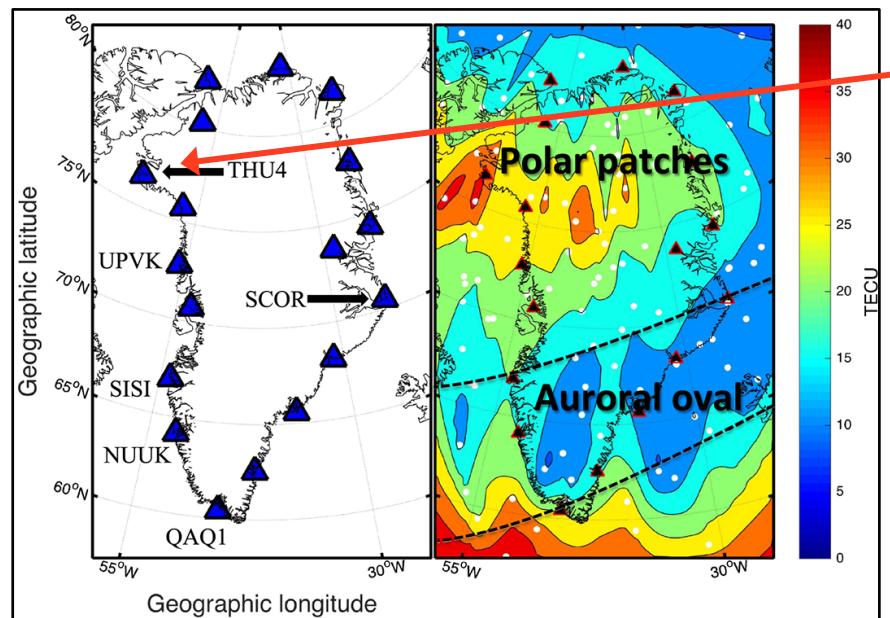


Northern Hemisphere  
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# How to examine observable signatures of FAC in TEC?

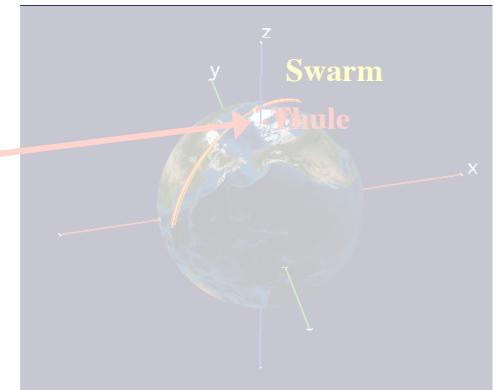
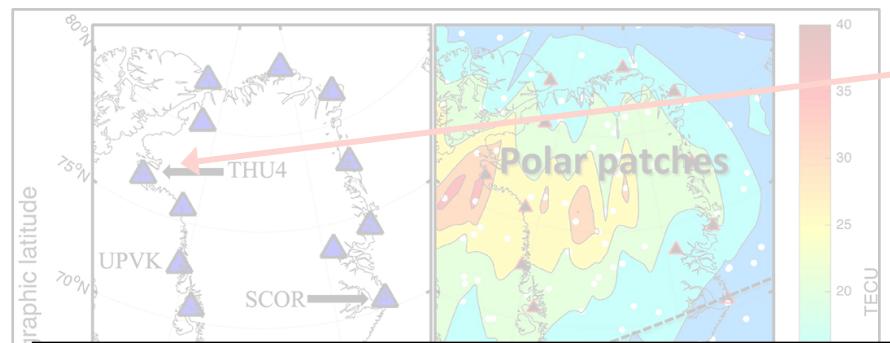
Statistical Results - April 22, 2014 Event - Extension



Dunlop, M. W., J.-Y. Yang, Y.-Y. Yang, C. Xiong, H. Lühr, Y. V. Bogdanova, C. Shen, N. Olsen, Q.-H. Zhang, J.-B. Cao, H.-S. Fu, W.-L. Liu, C. M. Carr, P. Ritter, A. Masson, and R. Haagmans (2015), Simultaneous field-aligned currents at Swarm and Cluster satellites. Geophys. Res. Lett., 42, 3683–3691. doi: [10.1002/2015GL063738](https://doi.org/10.1002/2015GL063738).

# How to examine observable signatures of FAC in TEC?

Statistical Results - April 22, 2014 Event - Extension



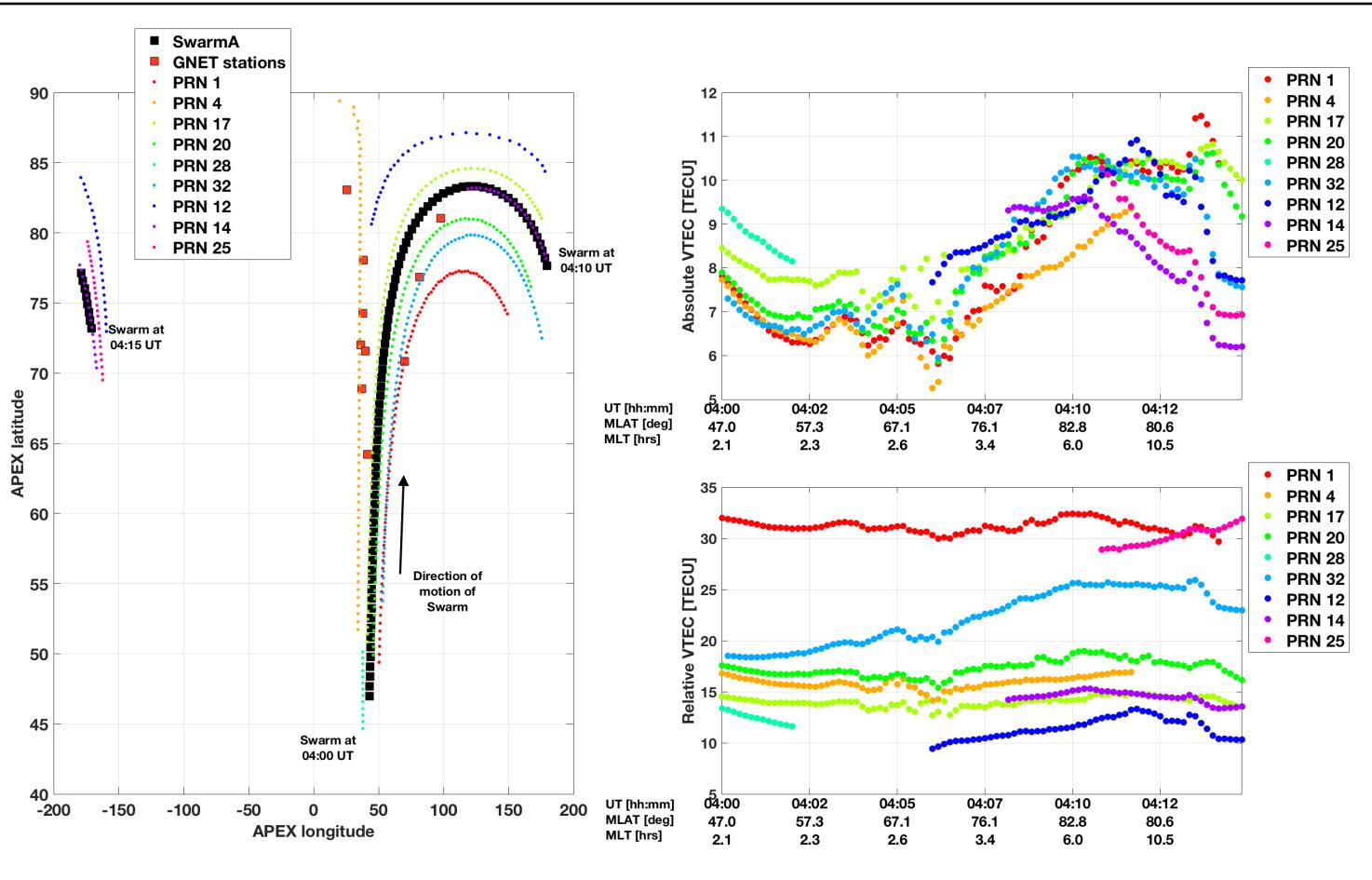
## Study objectives:

1. Identify where strong signatures exist in Swarm and ground-based TEC data
2. Determine synergies between Swarm (both FAC and TEC) and ground-based TEC data. Understand where additional data are most impactful (AMPERE, CASSIOPE RO, high-latitude LEO-based TEC)

Kiong, H. Lühr, Y. V. Bogdanova, C. Shen, N. Olsen, Q.-H. Zhang, J.-B. Cao, H.-S. Fu, W.-L. Liu, C. M. Carr, P. Ritter, A. Masson, and R. Haagmans (2015), Simultaneous field-aligned currents at Swarm and Cluster satellites. Geophys. Res. Lett., 42, 3683–3691. doi: [10.1002/2015GL063738](https://doi.org/10.1002/2015GL063738).

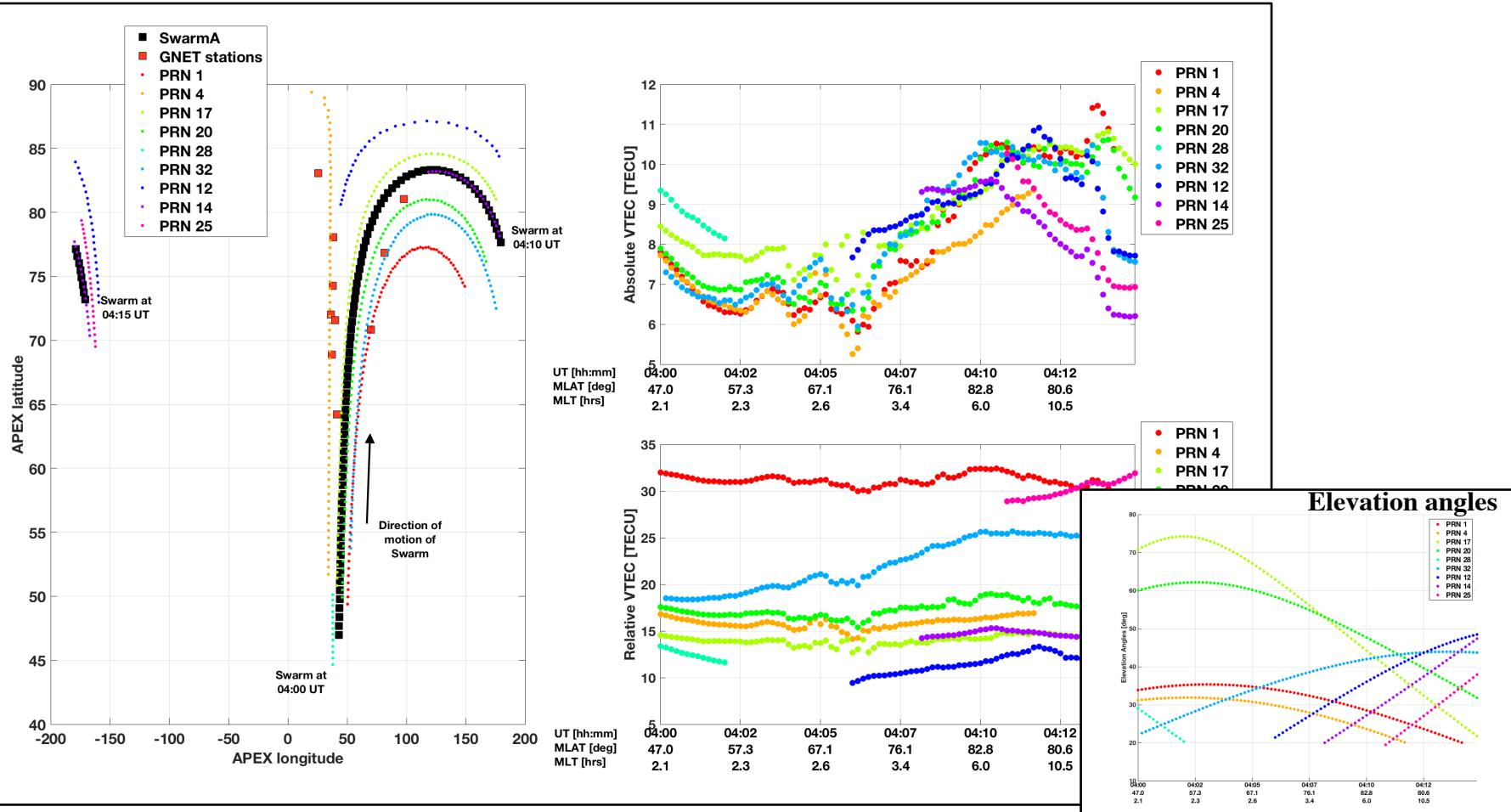
# April 22, 2014: Qualitative analysis

## Statistical Results - April 22, 2014 Event - Extension



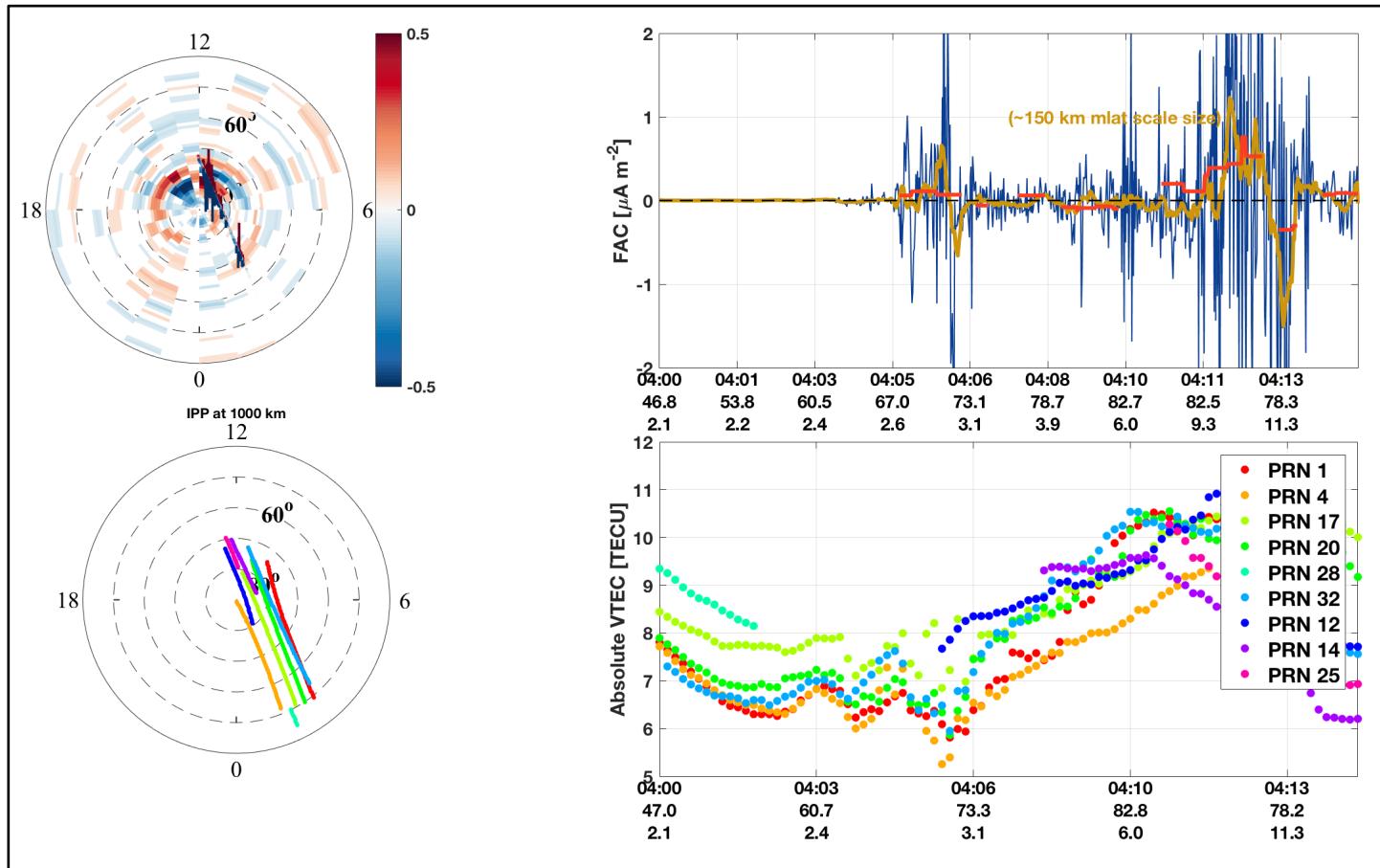
# April 22, 2014: Qualitative analysis

## Statistical Results - April 22, 2014 Event - Extension



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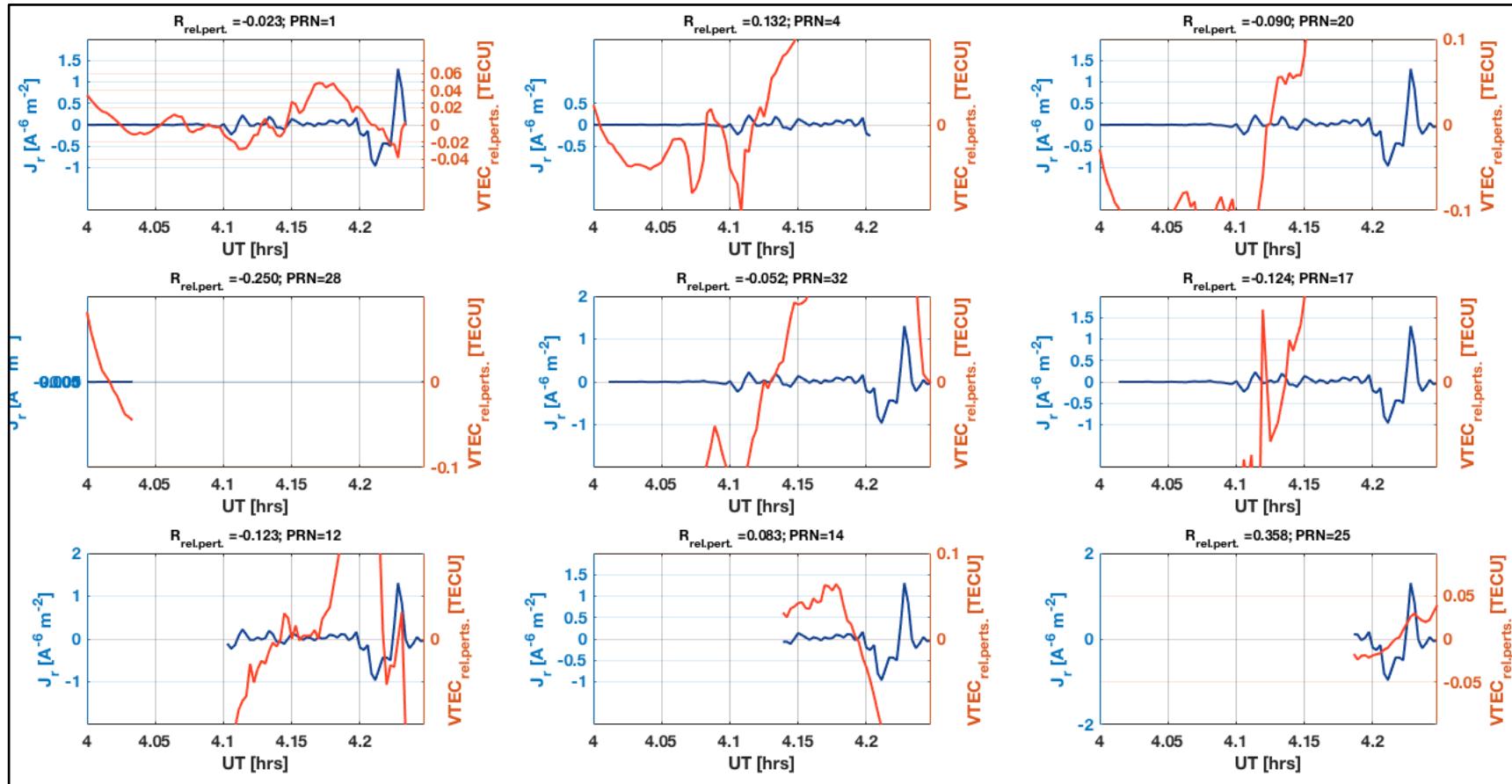
## Statistical Results - April 22, 2014 Event - Extension



# April 22, 2014: Quantitative analysis

## Statistical Results - April 22, 2014 Event - Extension

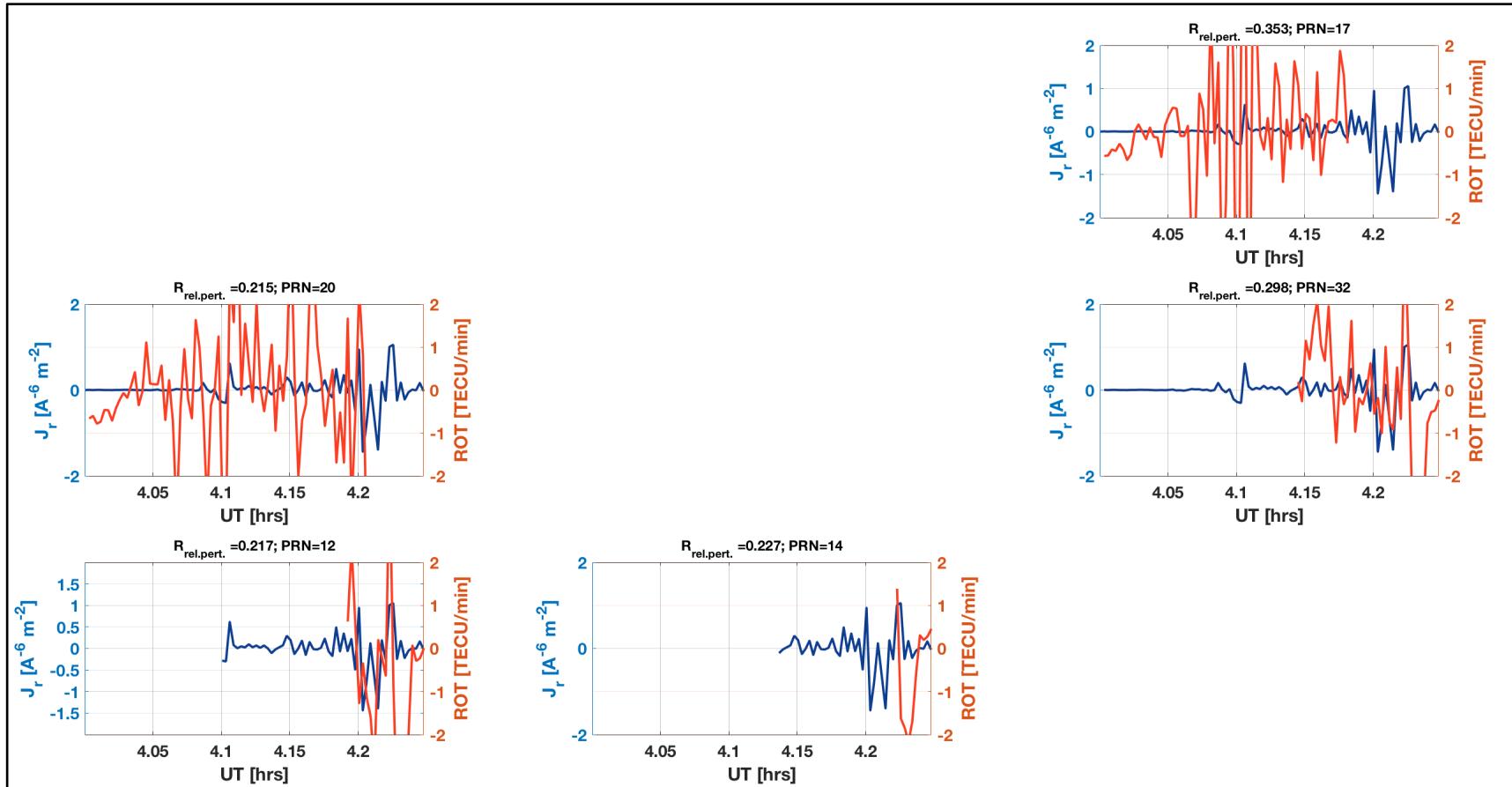
### Linear correlations between Swarm A 50 km MLAT scale sizes and TEC relative perturbations



# April 22, 2014: Quantitative analysis

## Statistical Results - April 22, 2014 Event - Extension

### Linear correlations between Swarm A 50 km MLAT scale sizes and Rate of TEC (ROT)

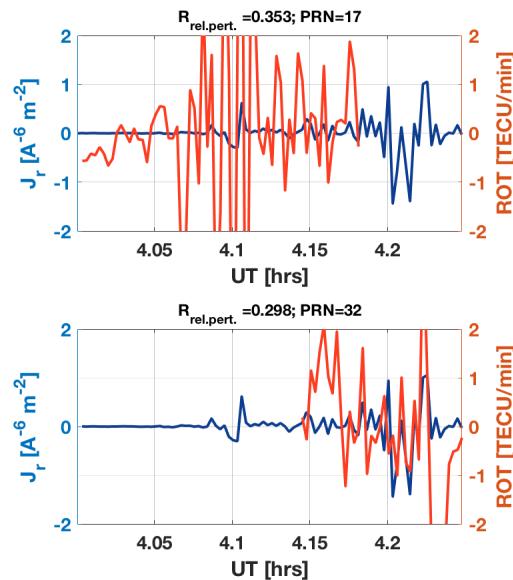
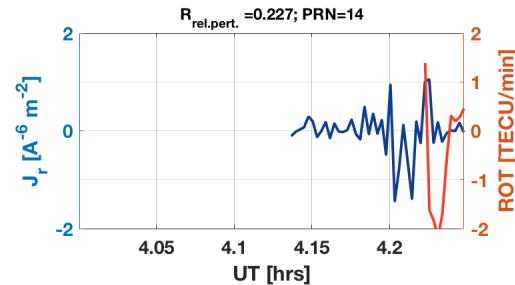
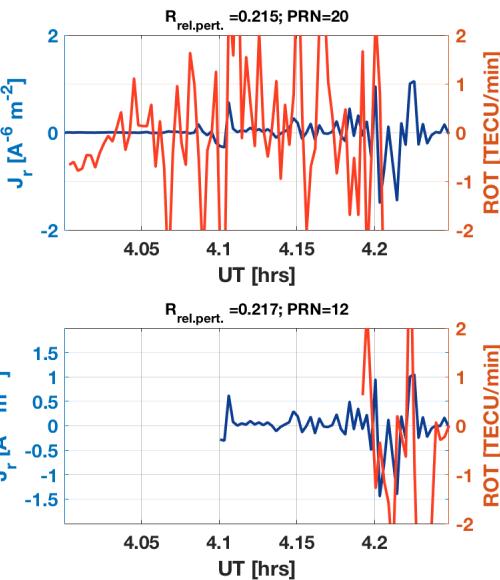


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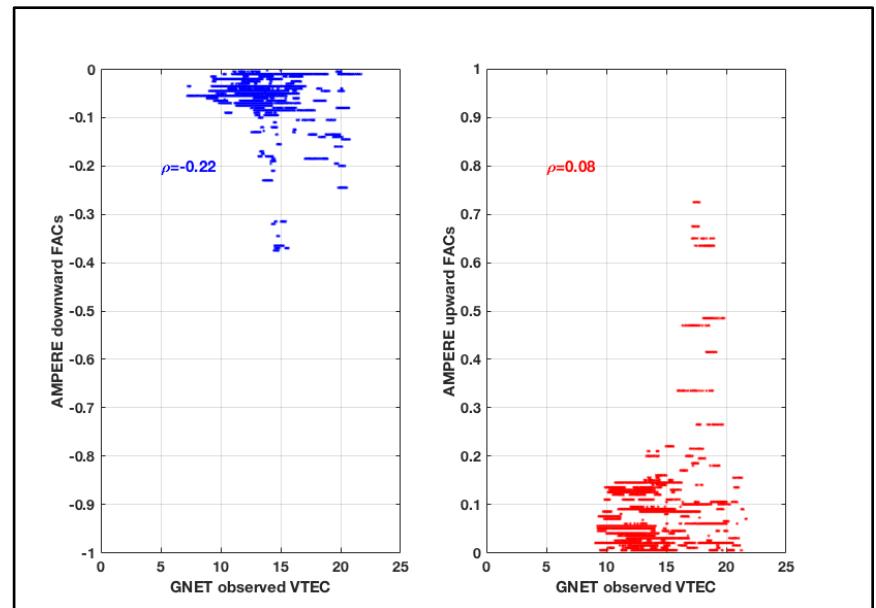
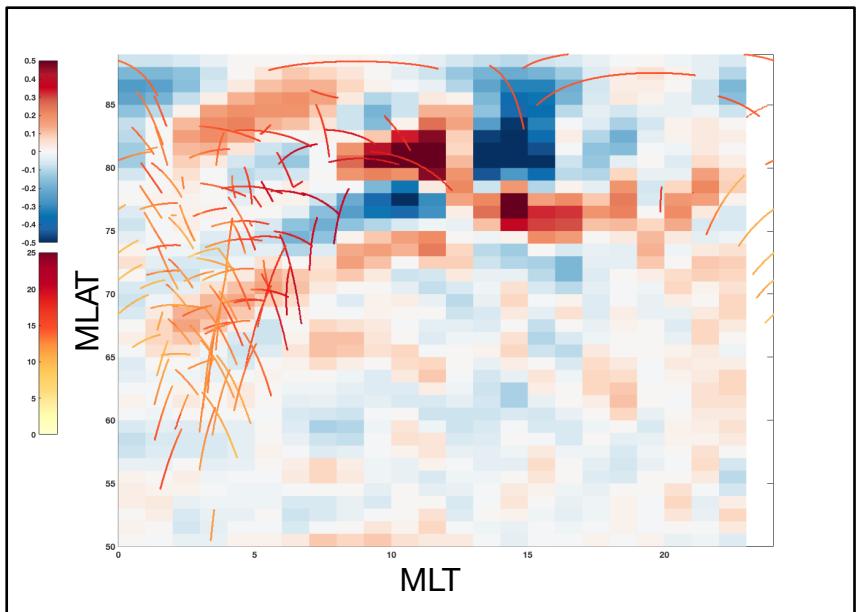
**Elevation mask of 40° applied**  
**Increased correlations with ROT**  
**Expanded statistics needed**



# April 22, 2014: Quantitative analysis

## Statistical Results - April 22, 2014 Event - Extension

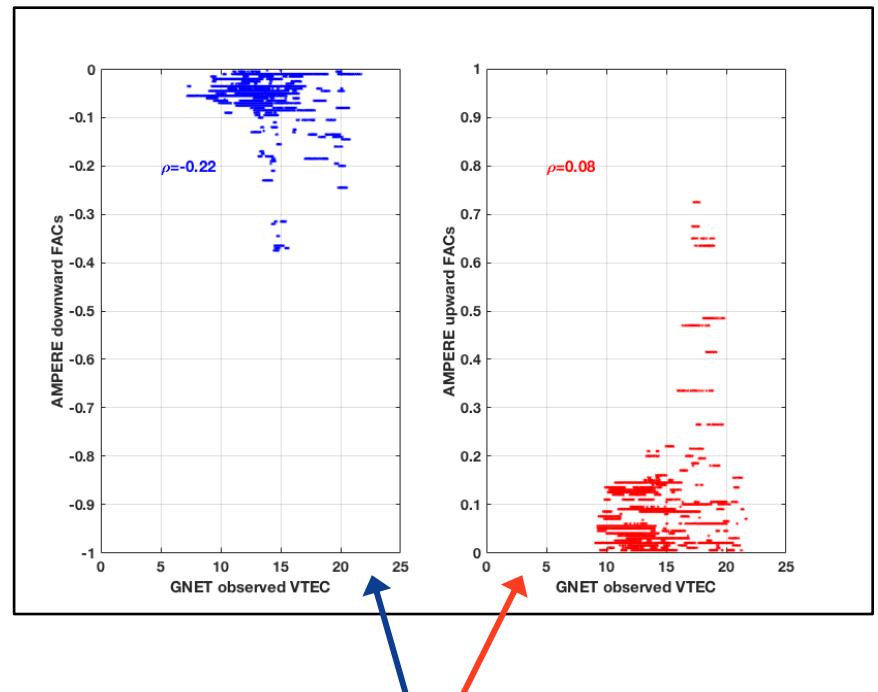
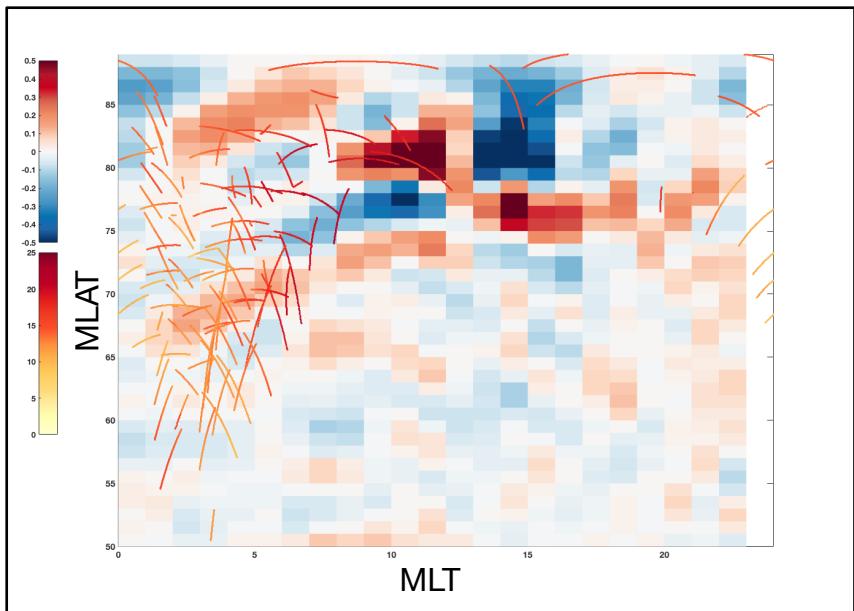
### Examination of AMPERE FACs and ground-based VTEC



# April 22, 2014: Quantitative analysis

## Statistical Results - April 22, 2014 Event - Extension

### Examination of AMPERE FACs and ground-based VTEC



Relationships likely not linear

## Additional event studies

Statistical Results - April 22, 2014 Event - Extension

### Would also like to examine Juusola et al. [2016] event

Spoke with Kirsti Kauristie and Heikki Vanhamäki at Swarm meeting regarding this event

Juusola, L., W. E. Archer, K. Kauristie, J. K. Burchill, H. Vanhamäki, and A. T. Aikio (2016), Ionospheric conductances and currents of a morning sector auroral arc from Swarm-A electric and magnetic field measurements, Geophys. Res. Lett., 43,

# Extension

Statistical Results - April 22, 2014 Event - Extension

**Broader context: Wide-ranging exploration of high-latitude TEC and relationships with important variables of high-latitude MIT system**

SQ #1: What observable signatures exist?

SQ #2: Can available TEC data be used to understand multi-scale ionosphere?

# Extension

Statistical Results - April 22, 2014 Event - Extension

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SQ #1: What observable signatures exist?

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With this broader context, how do we expand?

- Explore potential nonlinear correlations (network analysis?)
- Machine learning approach with large amounts of data

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Statistical Results - April 22, 2014 Event - **Extension**

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**Correlations to explore:**

Large-scales → AMPERE—VTEC

Small-scales → Swarm—TEC variability

# Extension

Statistical Results - April 22, 2014 Event - Extension

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Convergence of data-intensive and event-specific approaches

# Expansive study of Swarm FAC-TEC data

Statistical Results - April 22, 2014 Event - Extension

Based on extensive investigation of 2015 Swarm data

Do general FAC-TEC relationships exist?

How do we allow signals in these data to emerge?

# Candidates for characteristic cases of FAC-TEC connection in Swarm data

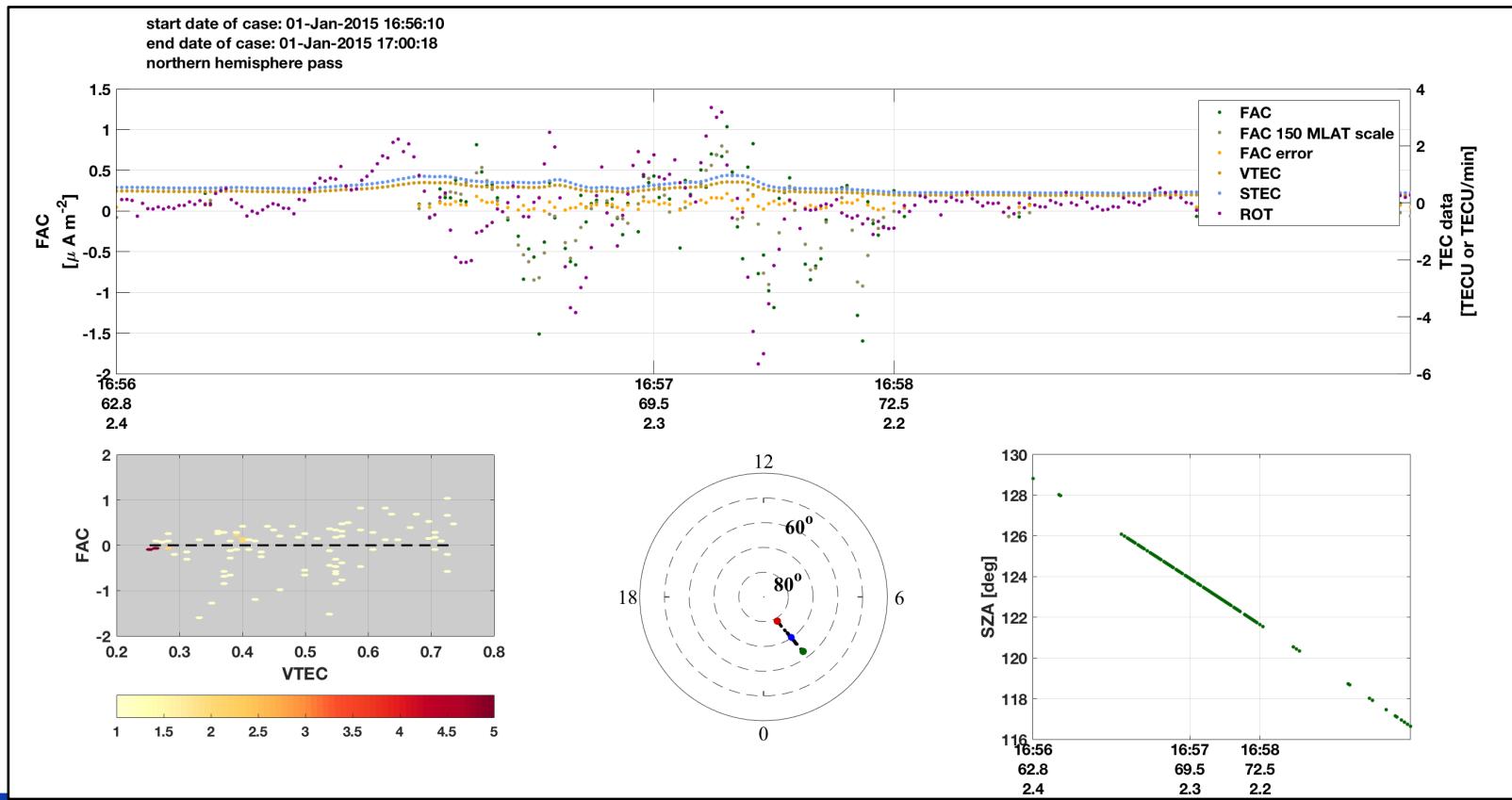


Statistical Results - April 22, 2014 Event - Extension

# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results - April 22, 2014 Event - Extension

**Case 1:** Large SZA (e.g. nightside), moderate FAC dynamic range, located primarily in auroral zone



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results

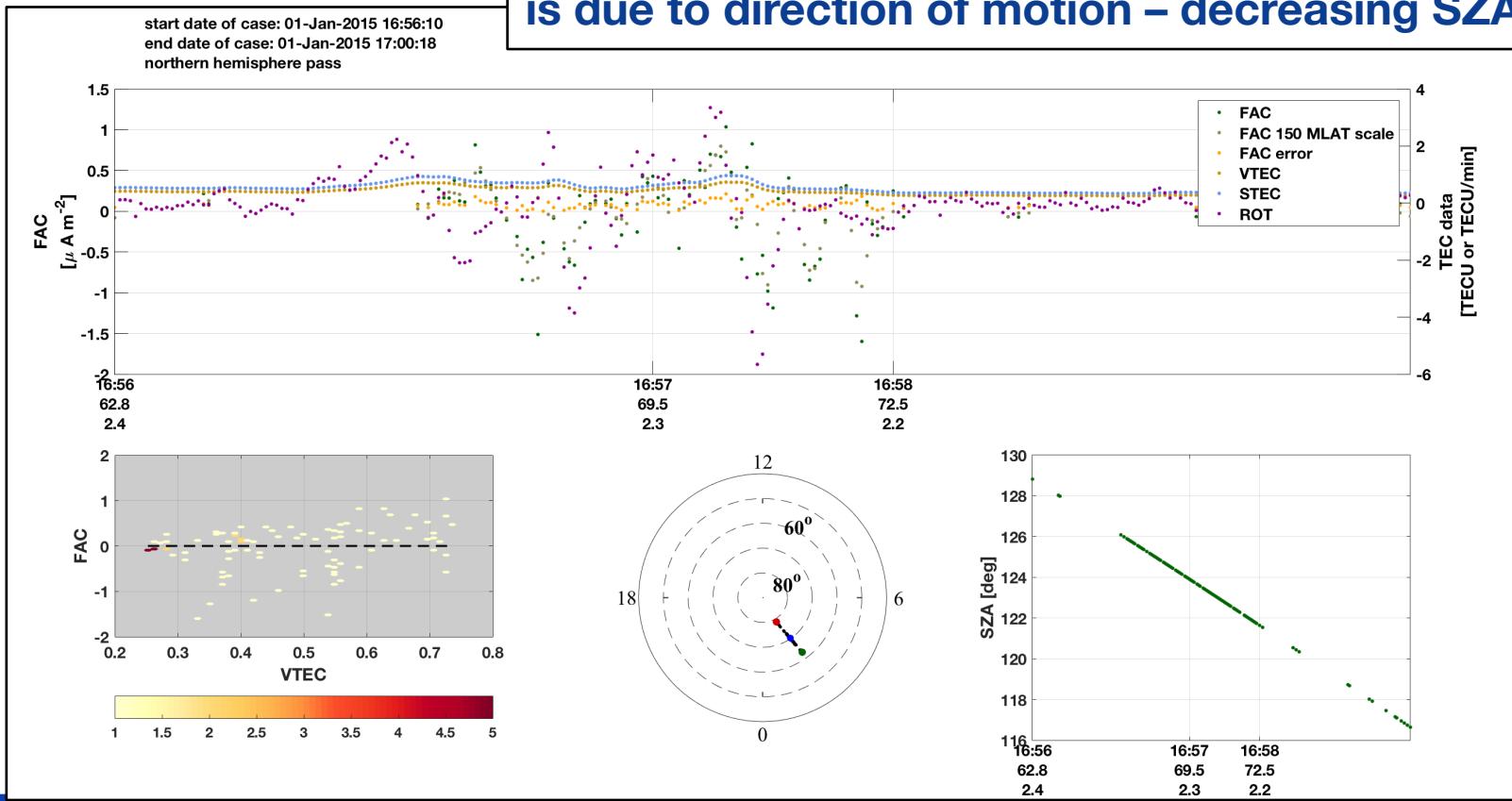
April 22, 2014 Event

Extension

**Case 1:** Large SZA (e.g. 70-80°) primarily in auroral zone

Correlations are considered high for highly dynamic unfiltered Swarm data (~0.2-0.3)

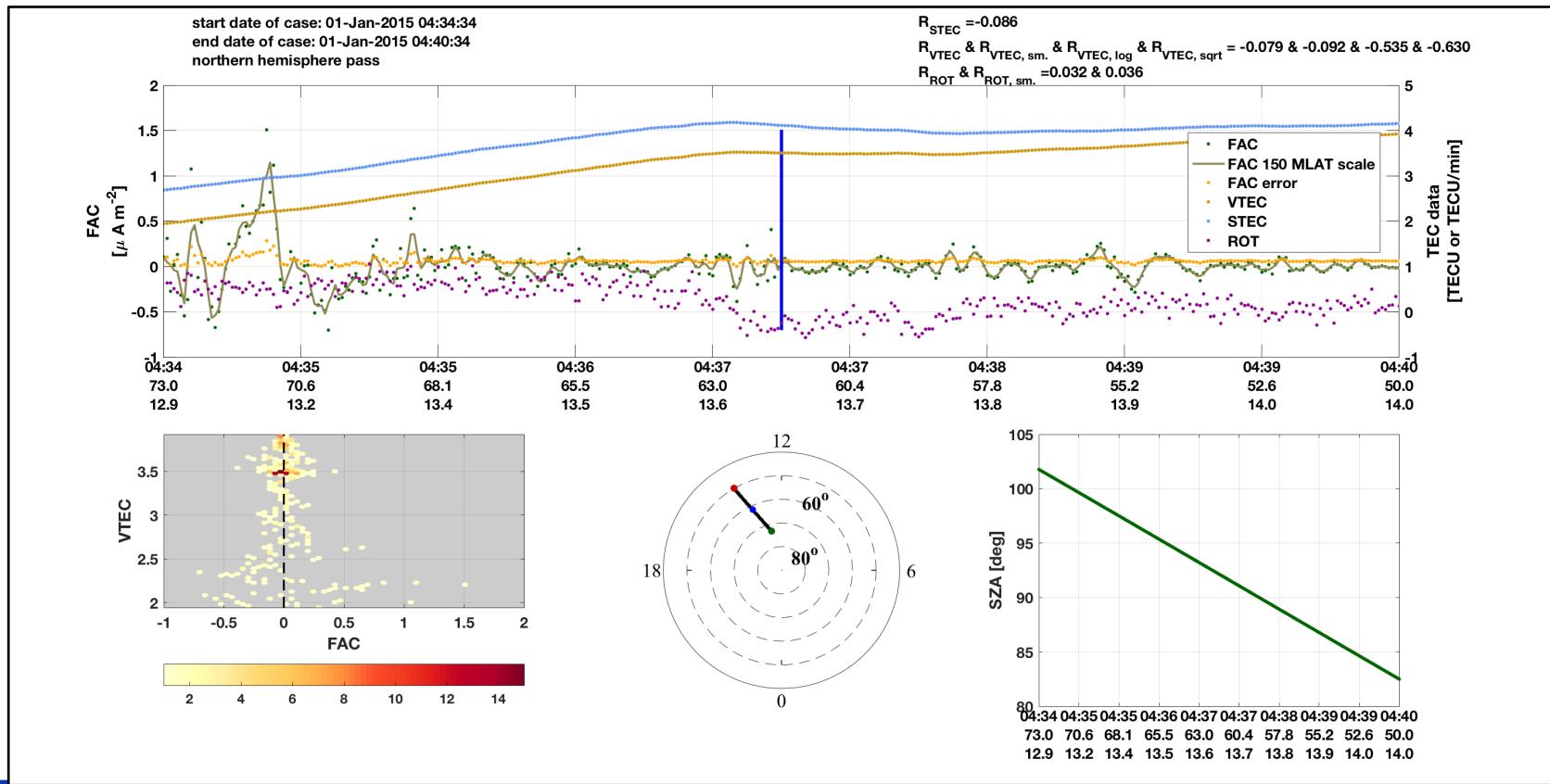
Negative correlation of ROT with FAC (maybe this is due to direction of motion – decreasing SZA?)



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results - April 22, 2014 Event - Extension

**Case 2:** Solar illuminated pass (SZA < 100 throughout), small-to-moderate FAC dynamic range, relationship likely not causal but instead TEC enhanced as illumination increases and FAC not playing large role)



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results

April 22, 2014 Event

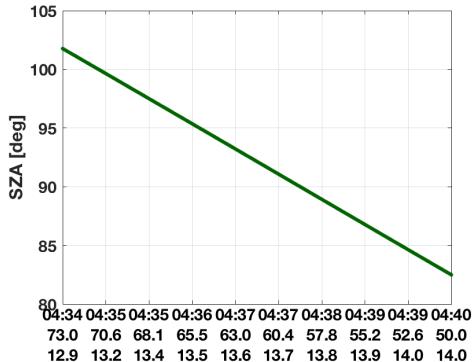
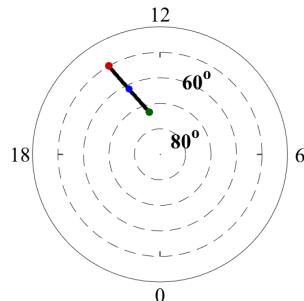
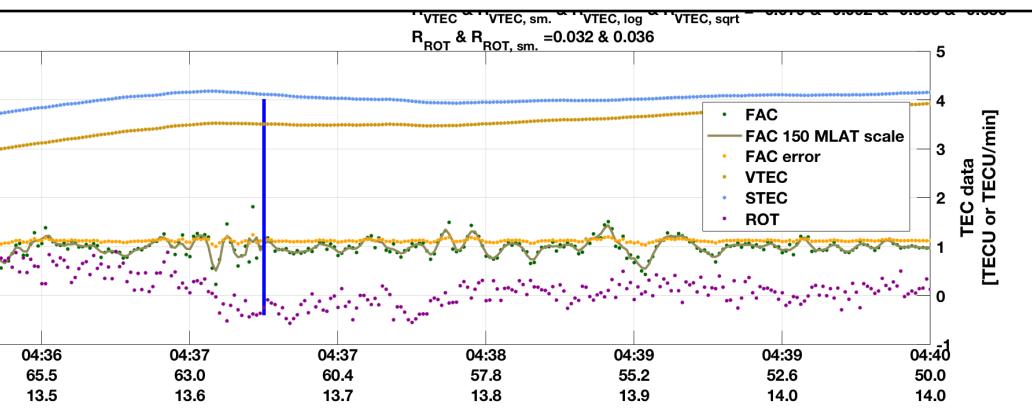
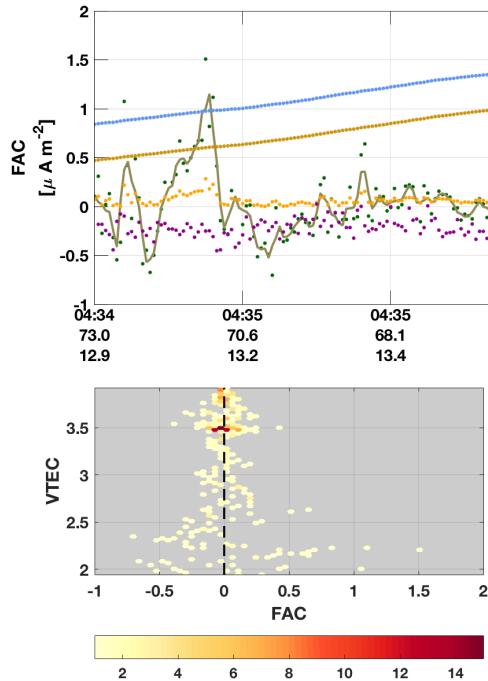
Extension

**Case 2:** Solar illuminated dynamic range, n enhanced as illum

**Negative correlation of abs(FAC) indicative of motion into areas of greater solar illumination**

**Likely would obfuscate broad statistical patterns we are attempting to identify – attempt to remove?**

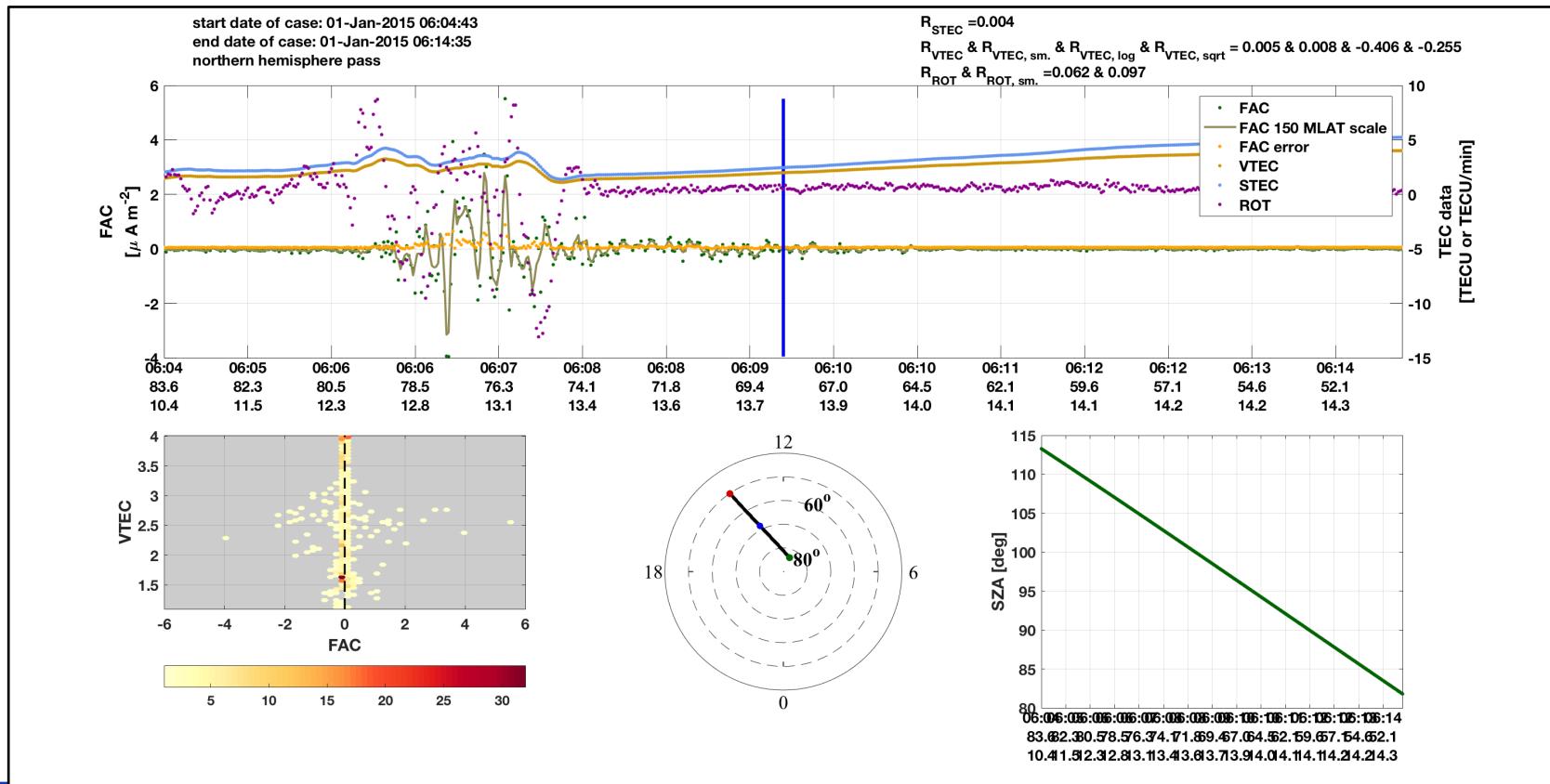
start date of case: 01-Jan-2015 04:34:34  
end date of case: 01-Jan-2015 04:40:34  
northern hemisphere pass



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results - April 22, 2014 Event - Extension

**Case 3:** Dual-influence (both illumination effect and additional effect generating FAC and TEC variability) variable FAC dynamic range, convoluted relationship

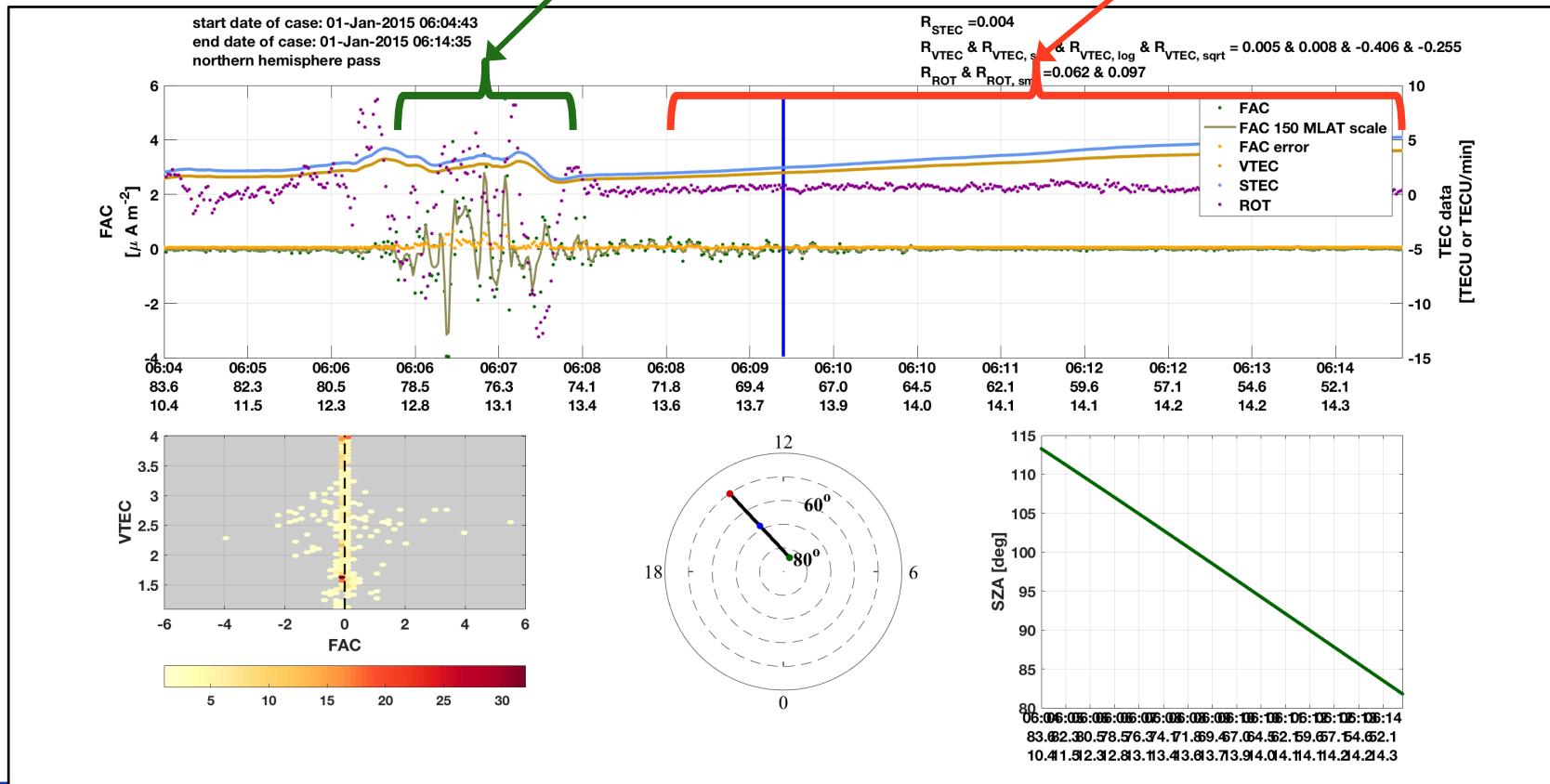


# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results   April 22, 2014 Event   Extension

**Case 3:** Dual-influence (both FAC and TEC vary) relationship

Polar Cap causes one relationship, solar illumination causes another (convoluted result)



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

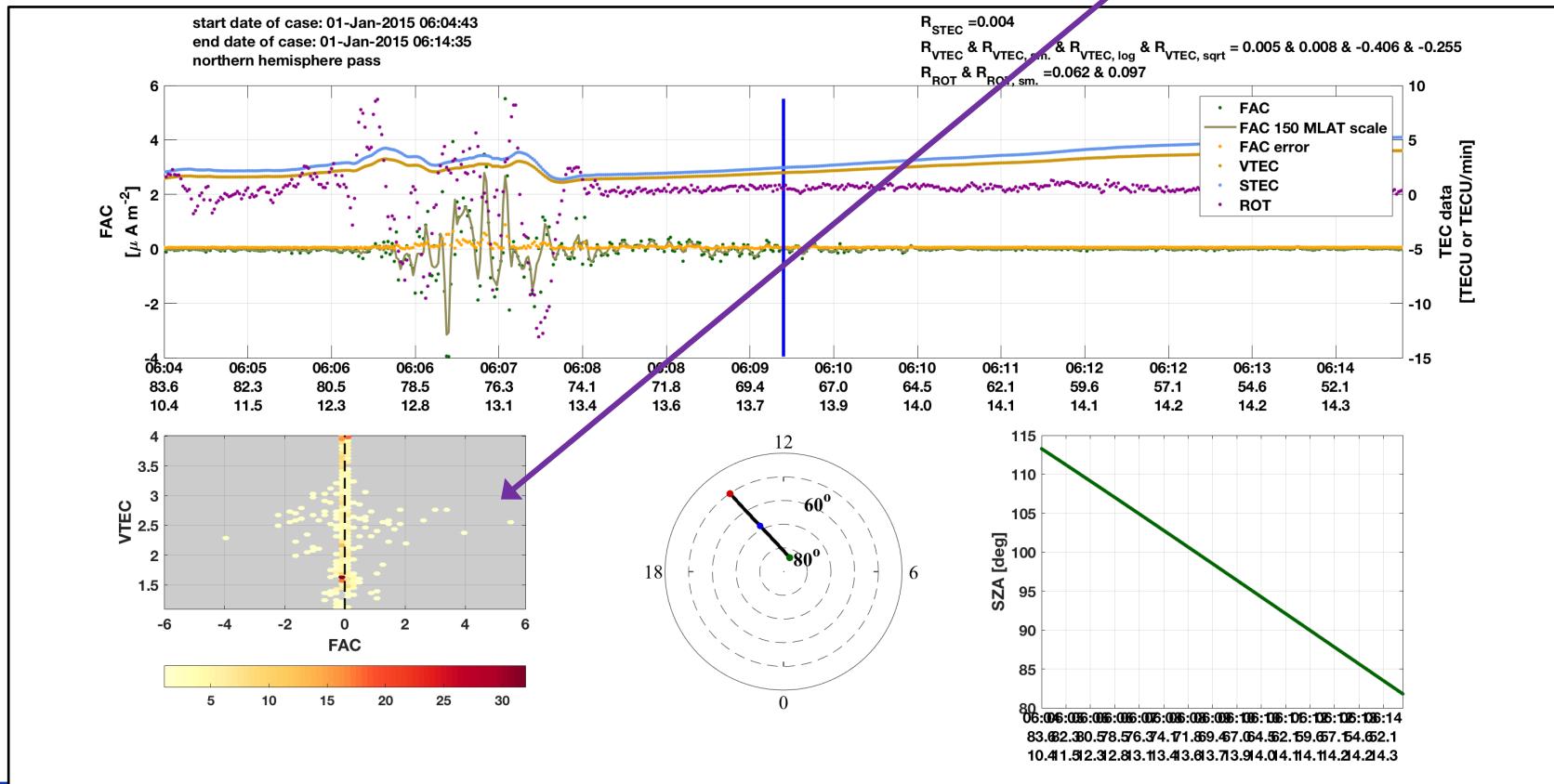
## Statistical Results

April 22, 2014 Event

## **Extencion**

# Case 3: Dual-influence (b) FAC and TEC va relationship

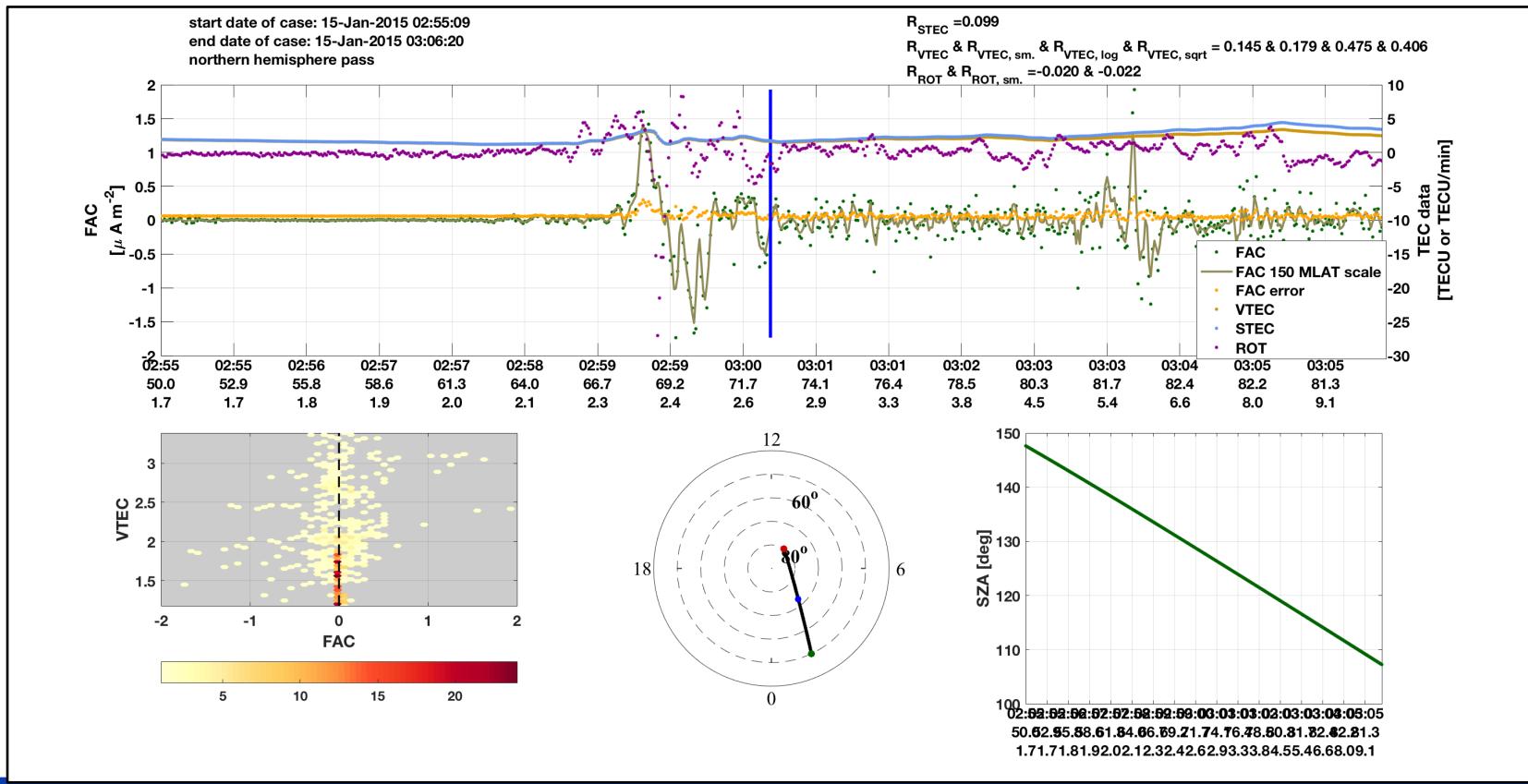
**Polar Cap causes one relationship, solar illumination causes another (convoluted result)**



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results - April 22, 2014 Event - Extension

**Case 4:** Nightside auroral oval and negligible solar influences, expected FAC relationship



# Candidates for characteristic cases of FAC-TEC connection in Swarm data

Statistical Results - April 22, 2014 Event - Extension

**Case 4:** Nightside auroral oval and negligible solar influences, expected FAC relationship

