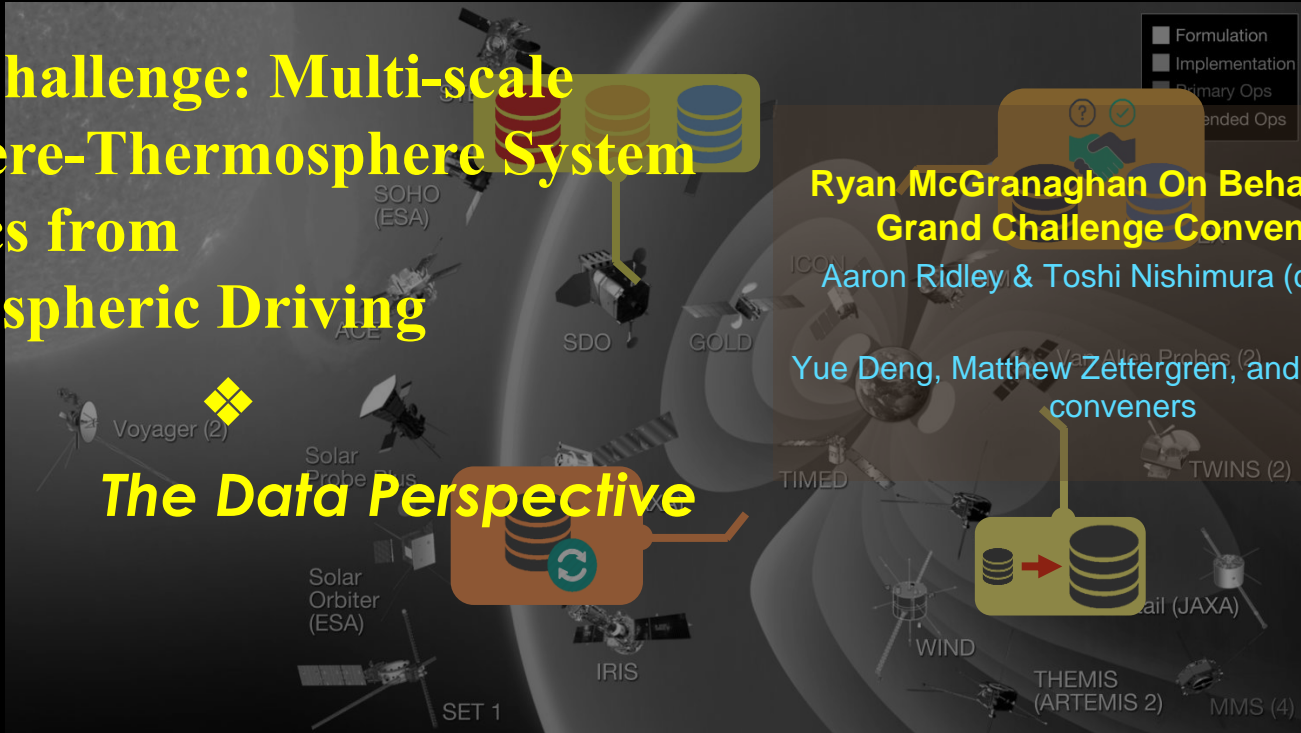


# Grand Challenge: Multi-scale Ionosphere-Thermosphere System Dynamics from Magnetospheric Driving

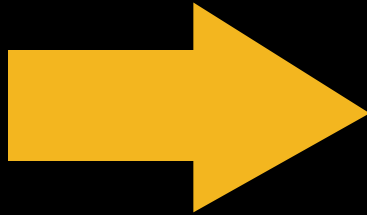
## The Data Perspective



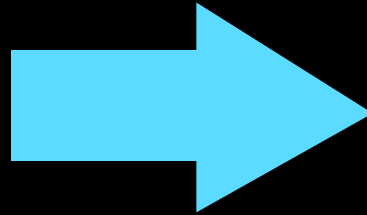
Ryan McGranaghan On Behalf of the  
Grand Challenge Conveners:

Aaron Ridley & Toshi Nishimura (co-leads)

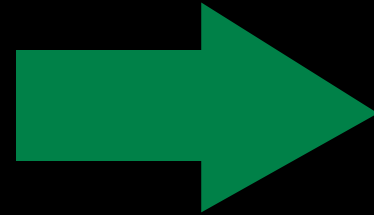
Yue Deng, Matthew Zettergren, and rest of GC  
conveners



**What is the current  
state of multi-scale  
geospace  
understanding?**



**Why is now the  
right time for a  
Grand Challenge  
with emphasis on  
data-driven  
approaches?**



**What approach  
will our Grand  
Challenge take  
from the data  
perspective?**

## What is the current state of multi-scale geospace understanding?

# Large-scale model

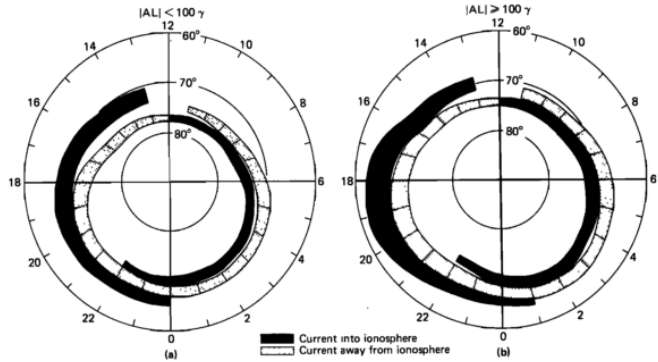


Fig. 13. A summary of the distribution and flow directions of large-scale field-aligned currents determined from (a) data obtained from 439 passes of Triad during weakly disturbed conditions ( $|AL| < 100 \gamma$ ) and (b) data obtained from 366 Triad passes during active periods ( $|AL| \geq 100 \gamma$ ).

*Iijima and Potemra [1978]*



Characteristics



Dependence on controlling parameters

# Large-scale model

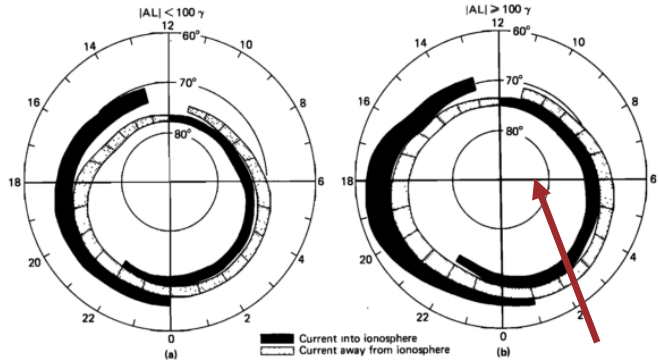


Fig. 13. A summary of the distribution and flow directions of large-scale field-aligned currents determined from (a) data obtained from 439 passes of Triad during weakly disturbed conditions ( $|AL| < 100 \gamma$ ) and (b) data obtained from 366 Triad passes during active periods ( $|AL| \geq 100 \gamma$ ).

*Iijima and Potemra [1978]*



Characteristics



Dependence on controlling parameters

# Large-scale model

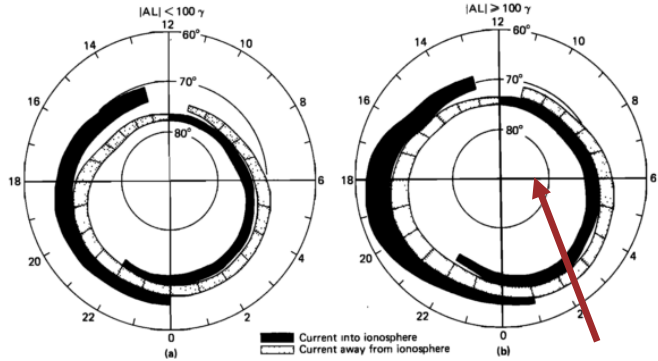


Fig. 13. A summary of the distribution and flow directions of large-scale field-aligned currents determined from (a) data obtained from 439 passes of Triad during weakly disturbed conditions ( $|AL| < 100 \gamma$ ) and (b) data obtained from 366 Triad passes during active periods ( $|AL| \geq 100 \gamma$ ).

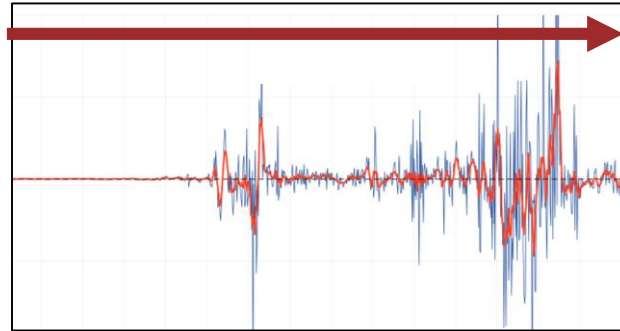
Iijima and Potemra [1978]



Characteristics



Dependence on controlling parameters



Small-scale reality

# Large-scale model

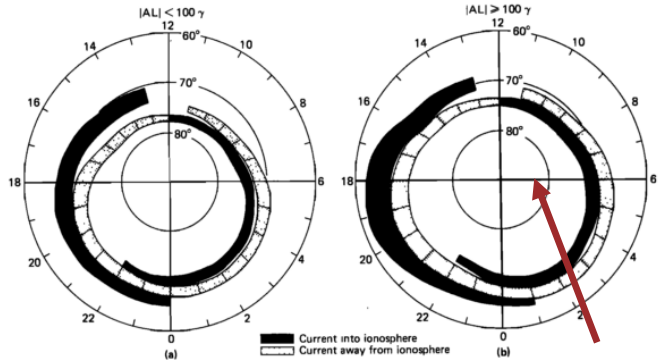
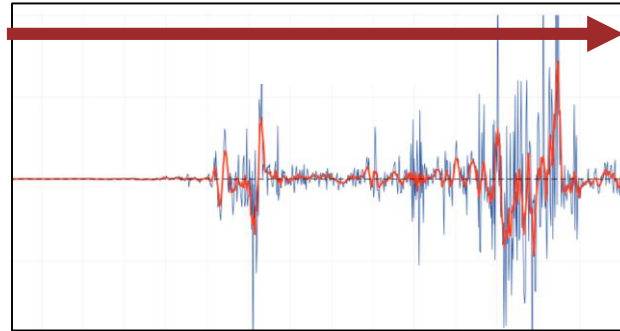


Fig. 13. A summary of the distribution and flow directions of large-scale field-aligned currents determined from (a) data obtained from 439 passes of Triad during weakly disturbed conditions ( $|AL| < 100 \gamma$ ) and (b) data obtained from 366 Triad passes during active periods ( $|AL| \geq 100 \gamma$ ).

Iijima and Potemra [1978]

- X Characteristics
- X Dependence on controlling parameters
- X Relationship between scales



Small-scale reality

# Large-scale model

## Large-scale model

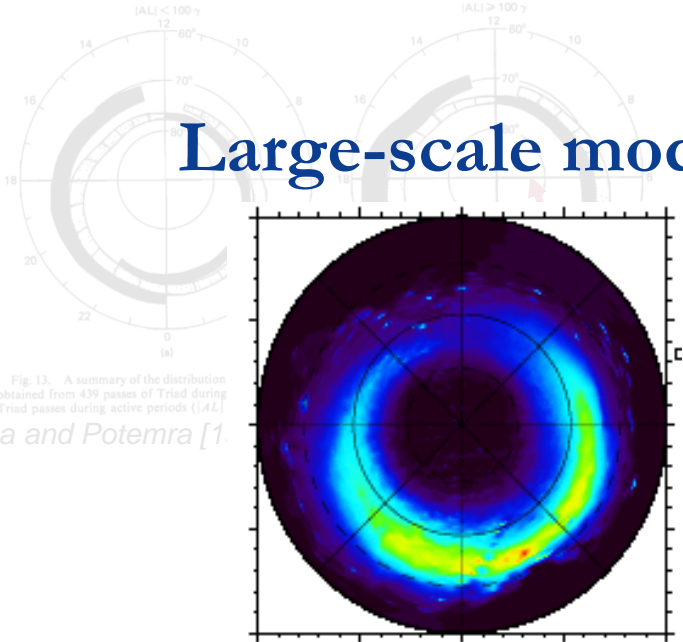


Fig. 13. A summary of the distribution obtained from 439 passes of Triad during Triad passes during active periods ( $|AL|$ )

Iijima and Potemra [1]

- X Characteristics
- X Dependence on controlling parameters
- X

## Small-scale reality

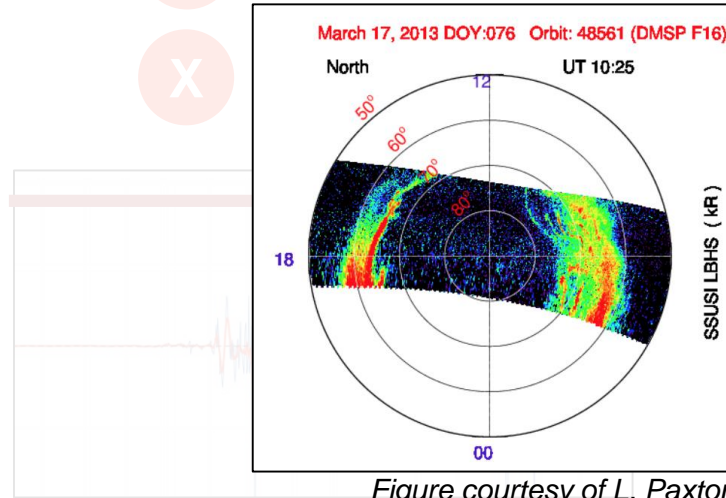


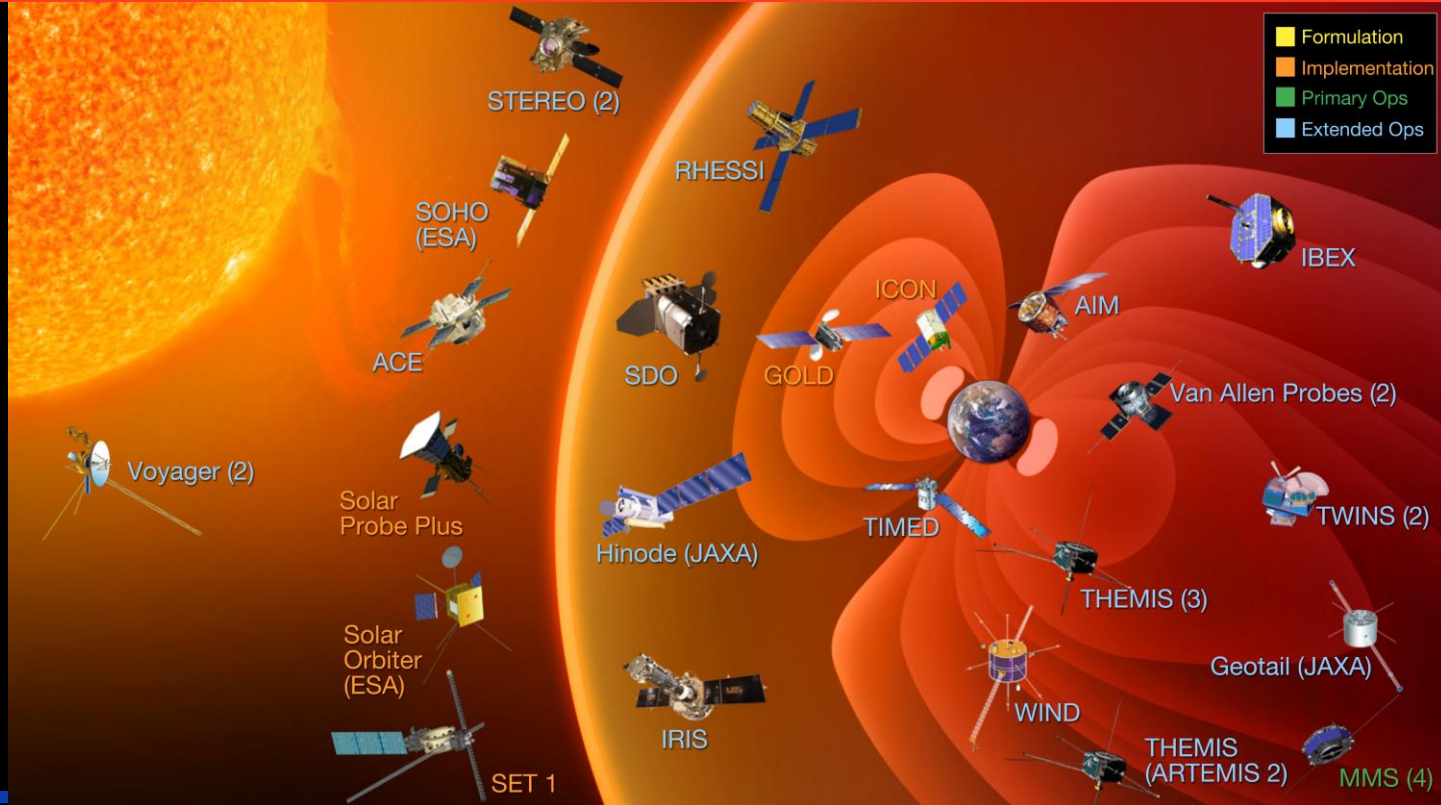
Figure courtesy of L. Paxton

## Small-scale reality

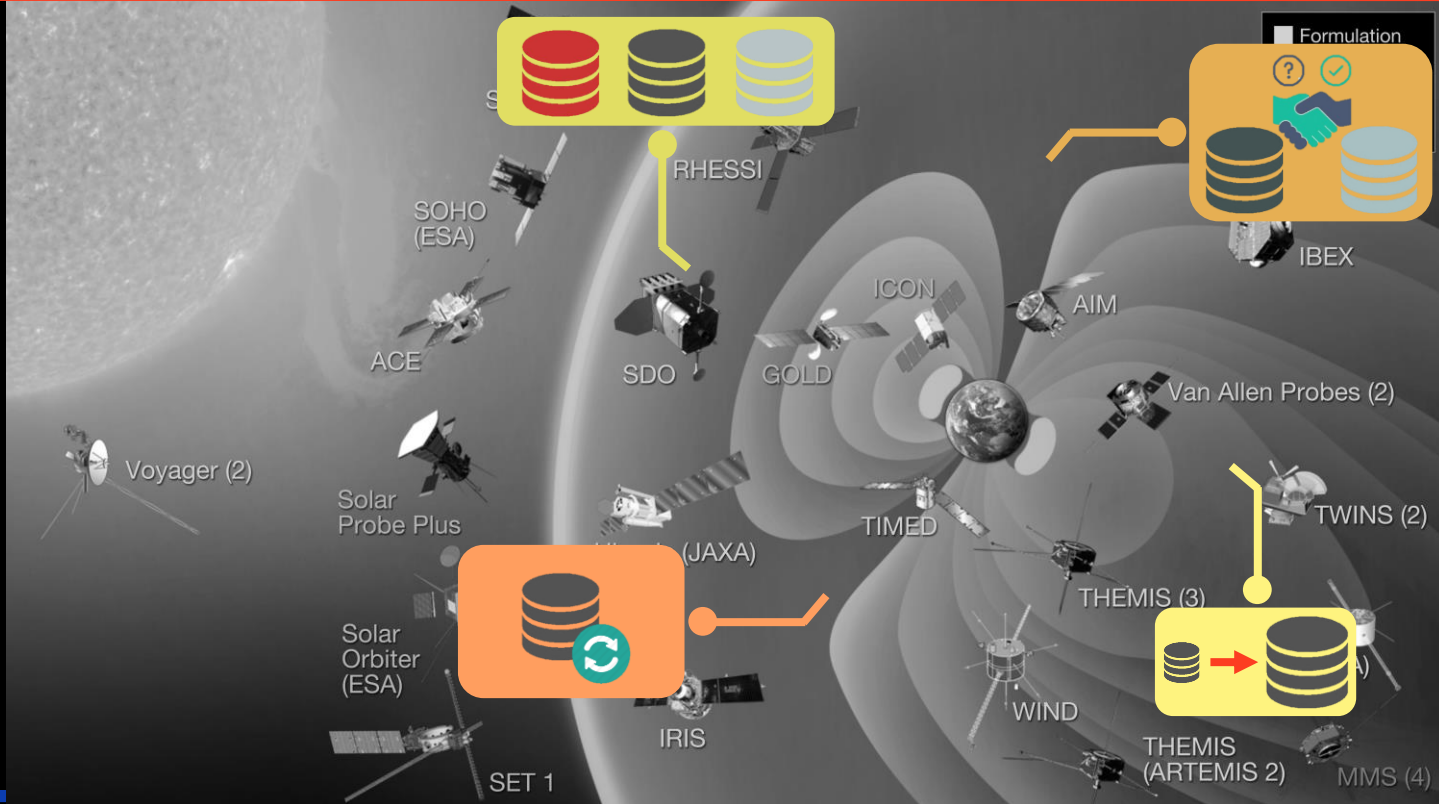


## **Why is now the right time for a Grand Challenge with emphasis on data-driven approaches?**

Multi-scale geospace - Data-driven approach - GC from the data perspective



Multi-scale geospace - Data-driven approach - GC from the data perspective



# Multi-scale highlight #1: Flow channels

*Zou et al., [2016]*

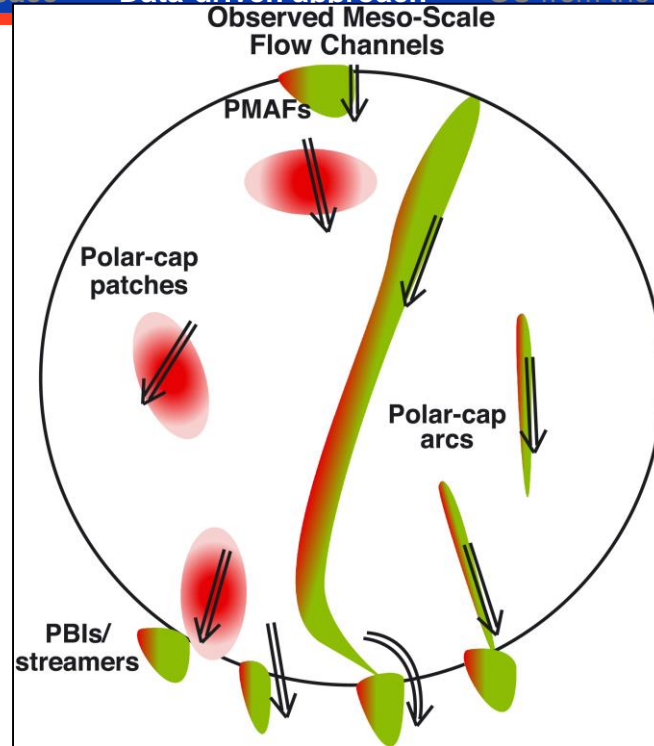


Multi-scale geospace - Data-driven approach - GC from the data perspective

# Multi-scale highlight #1: Flow channels

Zou et al., [2016]

Multi-scale geospace - Data-driven approach - GC from the data perspective

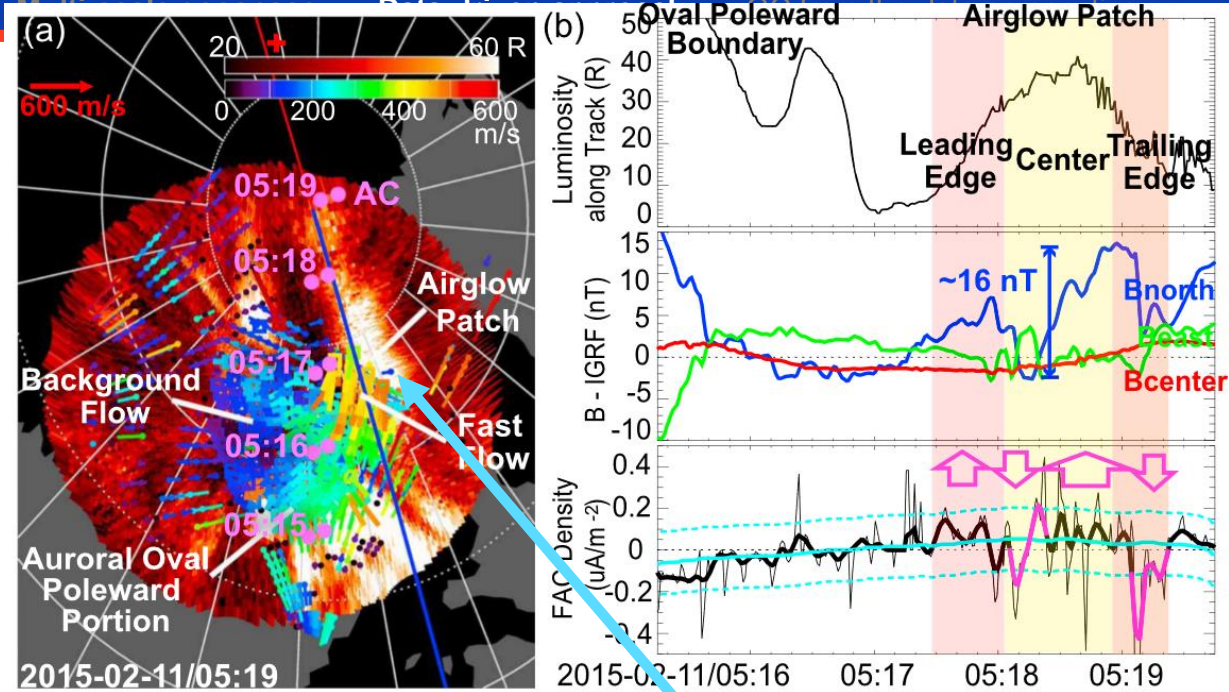


Lyons et al., [2016]

Mesoscale  $\equiv \sim 100 - 500$  km

# Multi-scale highlight #1: Flow channels

Zou et al., [2016]

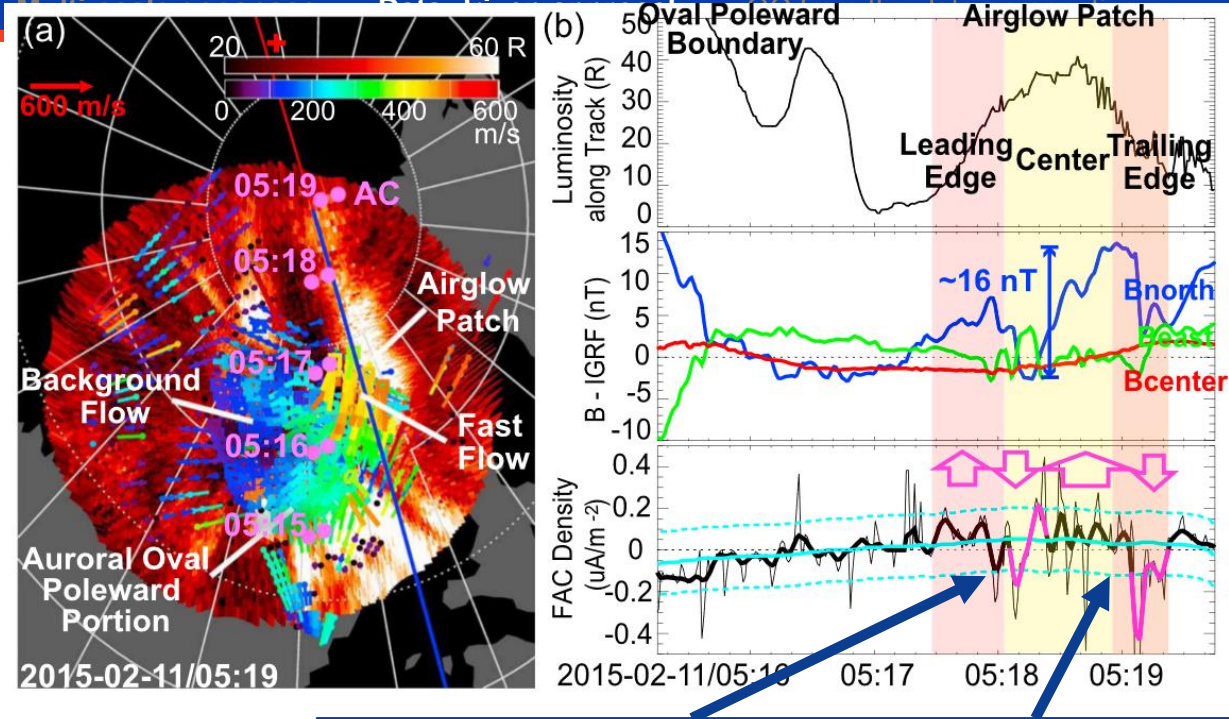


Plasma patches transported across the polar cap by flow channels



# Multi-scale highlight #1: Flow channels

Zou et al., [2016]



**Flow channels are associated with localized field-aligned currents**

# Multi-scale highlight #2: Localized precipitation and FACs

*McGranaghan et al., [2017]*



Multi-scale geospace - Data-driven approach - GC from the data perspective



# Multi-scale highlight #2: Localized precipitation and FACs

McGranaghan et al., [2017]



Multi-scale geospace - Data-driven approach - GC from the data perspective

Small-scale reality

—

Large-scale model

=

Degree of  
departure

# Multi-scale highlight #2: Localized precipitation and FACs

McGranaghan et al., [2017]

Multi-scale geospace - Data-driven approach - GC from the data perspective

Small-scale reality

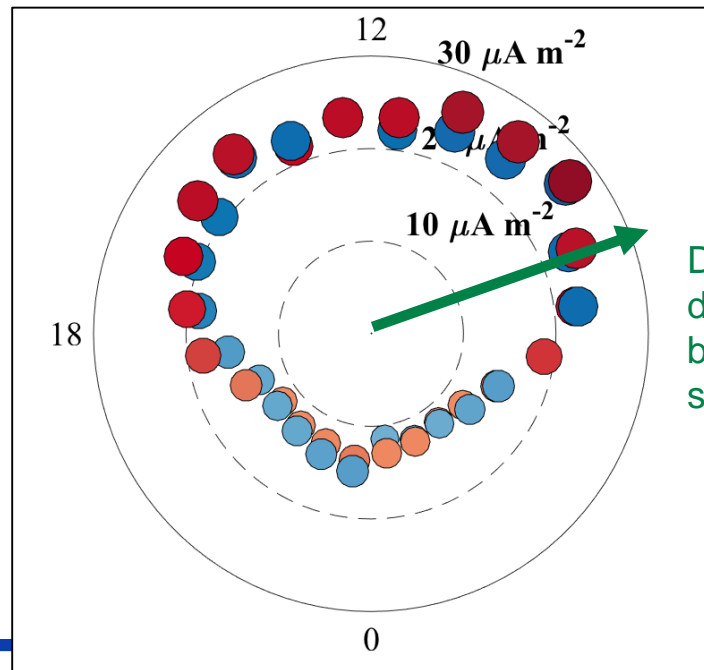
—

Large-scale model

=

Degree of departure

- Away from ionosphere (upward FAC)
  - Toward ionosphere (downward FAC)
- Size indicates magnitude



Direction of increasing departure (difference between large and small scales)

# Multi-scale highlight #2: Localized precipitation and FACs

McGranaghan et al., [2017]

Multi-scale geospace - Data-driven approach - GC from the data perspective

Small-scale reality

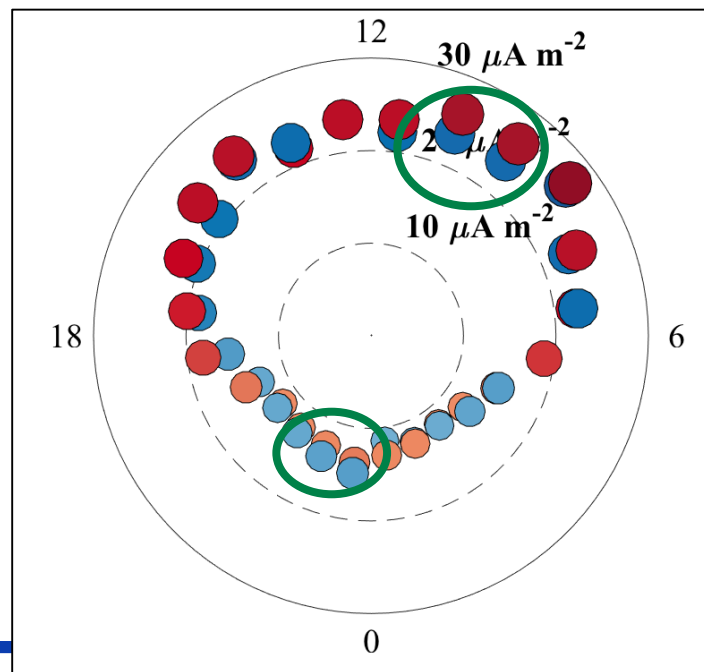
—

Large-scale model

=

Degree of departure

- Away from ionosphere (upward FAC)
  - Toward ionosphere (downward FAC)
- Size indicates magnitude



McGranaghan et al., [2017]

Multi-scale geospace - Data-driven approach - GC from the data perspective

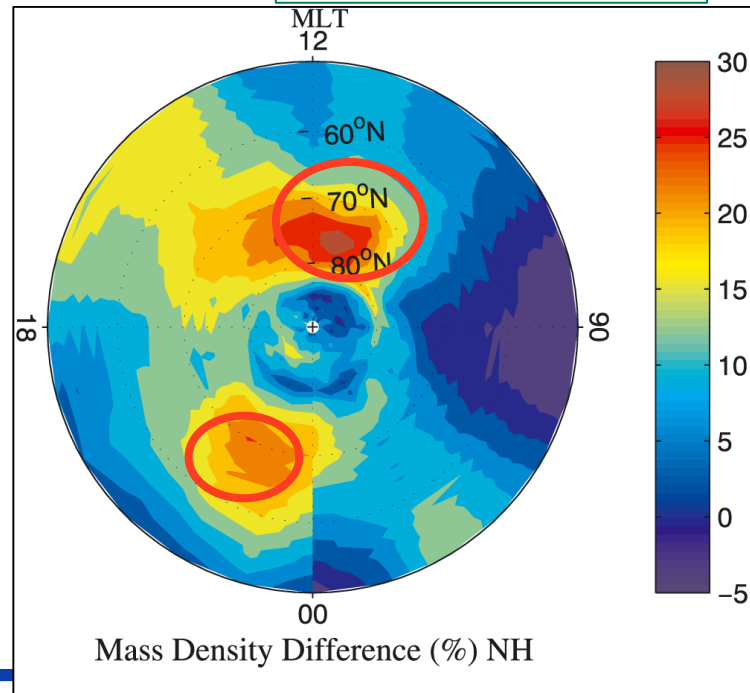
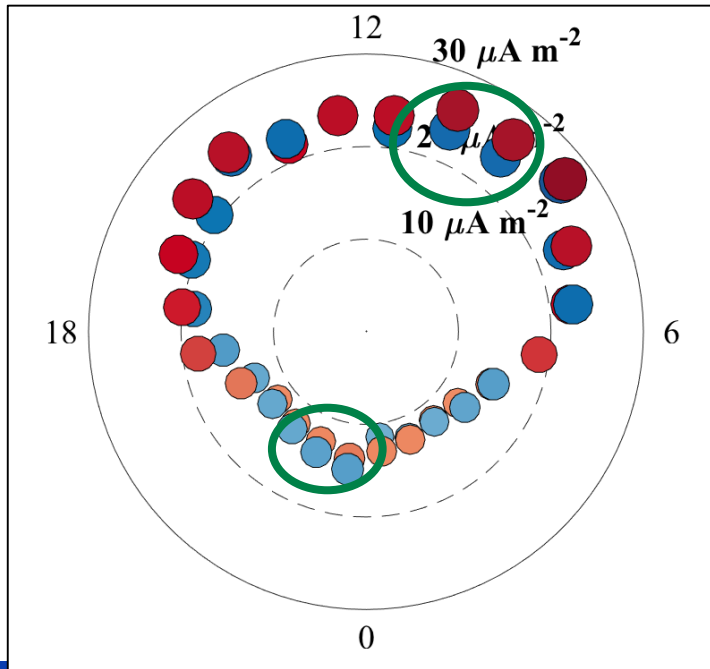
Small-scale reality

—

Large-scale model

=

Degree of departure



# Multi-scale highlight #3: Thermospheric response

*Kervalishvili and Lühr, [2013]*

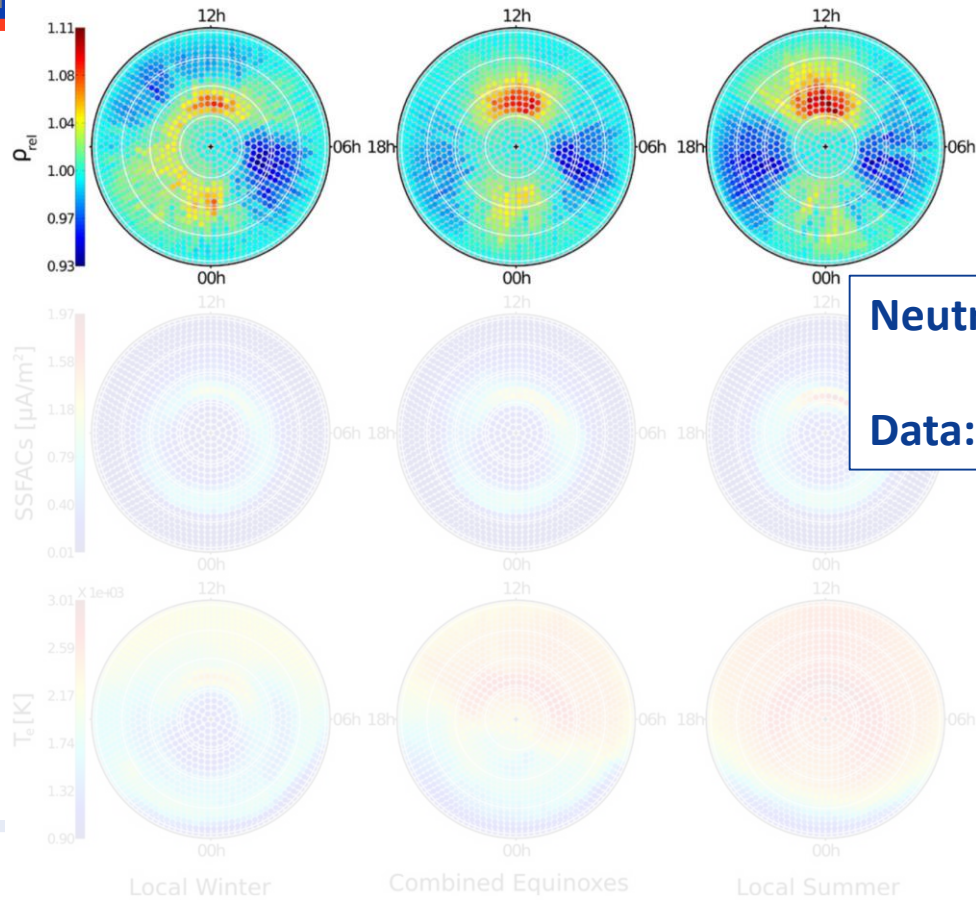


Multi-scale geospace - Data-driven approach - GC from the data perspective

# Multi-scale highlight #3: Thermospheric response

*Kervalishvili and Lühr, [2013]*

Multi-scale geospace Data-driven approach GC from the data perspective



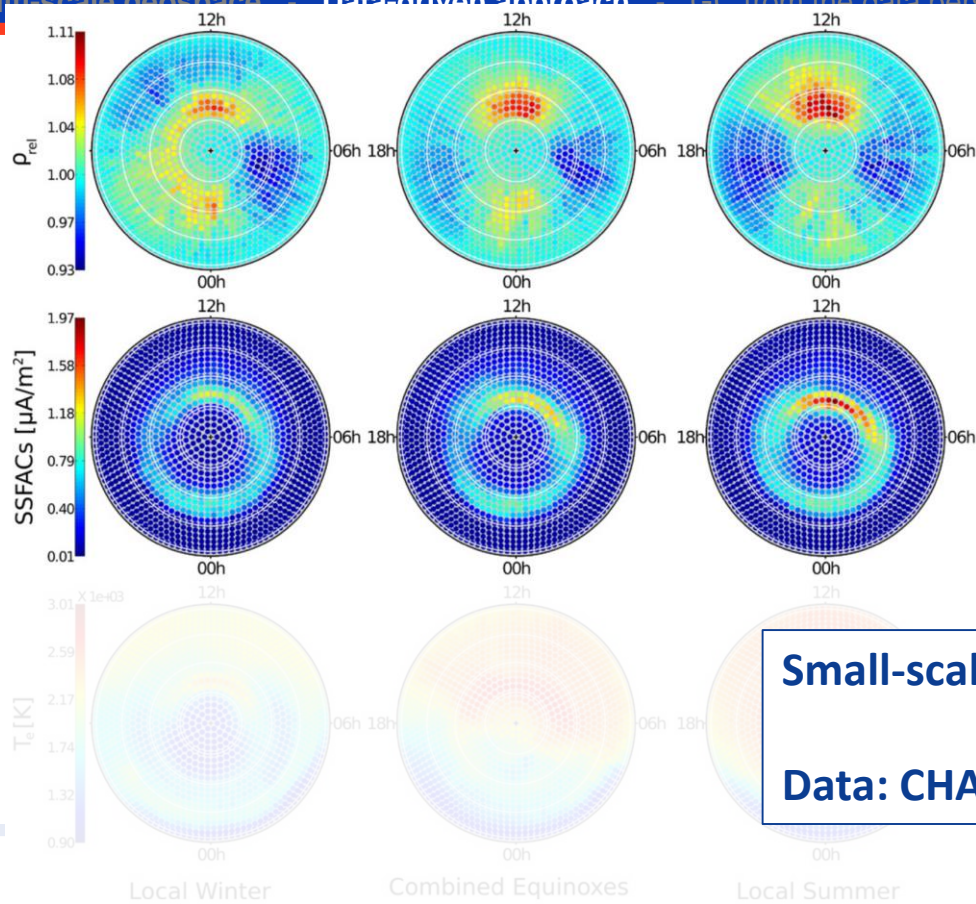
Neutral density anomalies

Data: CHAMP

# Multi-scale highlight #3: Thermospheric response

*Kervalishvili and Lühr, [2013]*

Multi-scale geospace    Data-driven approach    GC from the data perspective



Small-scale FACs ( $\sim 10$  km scale)

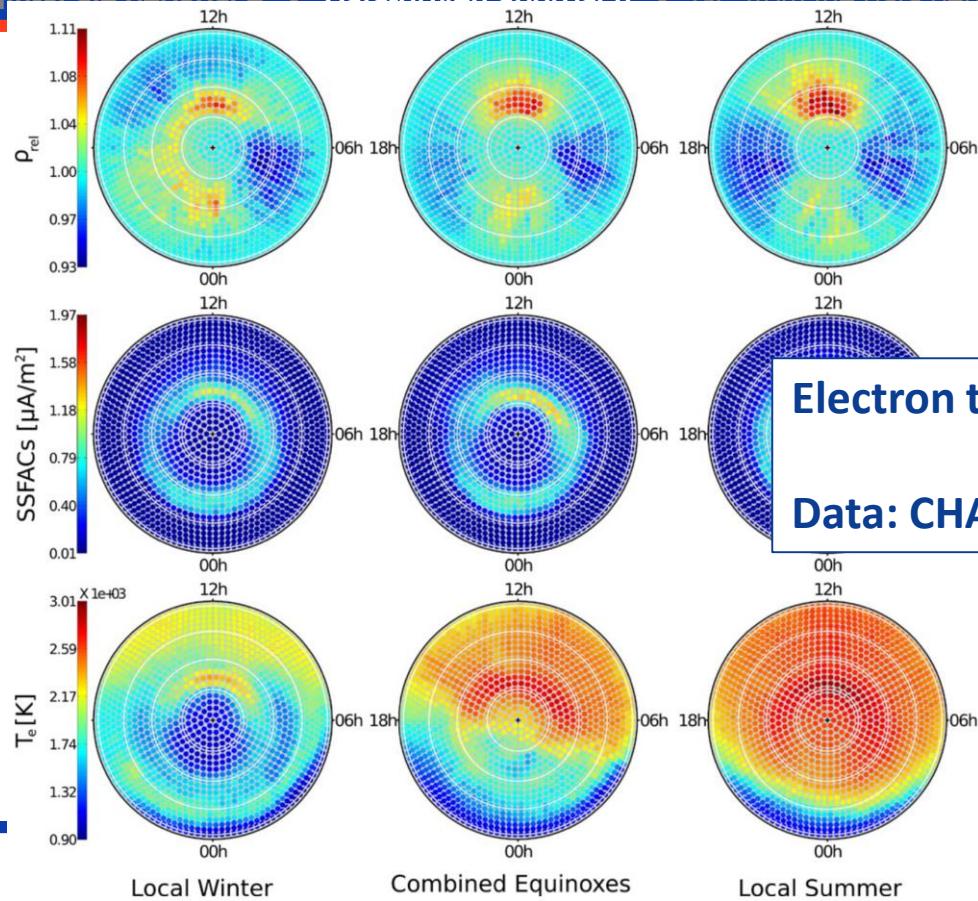
Data: CHAMP



# Multi-scale highlight #3: Thermospheric response

*Kervalishvili and Lühr, [2013]*

Multi-scale geospace Data-driven approach GC from the data perspective

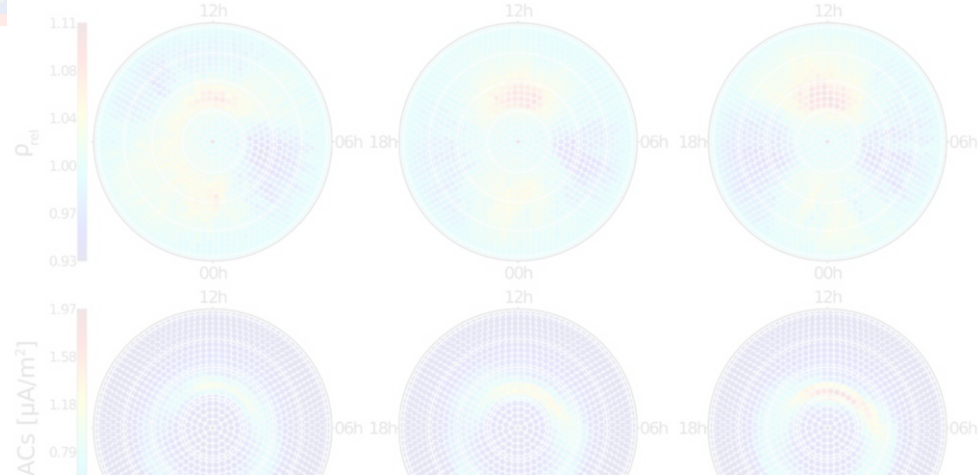


Electron temperature  
Data: CHAMP



# What's next?

Multi-scale geospace    Data-driven approach    GC from the data perspective



- 1. What are the characteristics of the small- and meso-scales?**
- 2. What are the feedbacks between small-, meso-, and large-scales?**
- 3. What is the impact on the global geospace system?**

**How do these unknowns dictate our approach?**

**What approach will our Grand Challenge  
take from the data perspective?**

## Coordinated and fused observations: *A network of data*

- RISR-C & RISR-N
- Imagers
- Global Navigation Satellite Systems (GNSS) signals
- SuperDARN
- SuperMAG
- Satellite—based data

## Coordinated and fused observations: *A network of data*

- RISR-C & RISR-N
- Imagers
- Global Navigation Satellite Systems (GNSS) signals
- SuperDARN
- SuperMAG
- Satellite—based data

### Timely integration with:

- Cusp Grand Challenge Initiative
- ICON & GOLD
- Increased access to space (e.g., cubesats)

# Challenges (opportunities) for data-driven approach to multi-scale studies



Multi-scale geospace - Data-driven approach - GC from the data perspective

## Data `wrangling`

- Often the most time consuming portion of research
- 'Re-inventing the wheel' and a lack of re-usability of analysis tools and prepared data

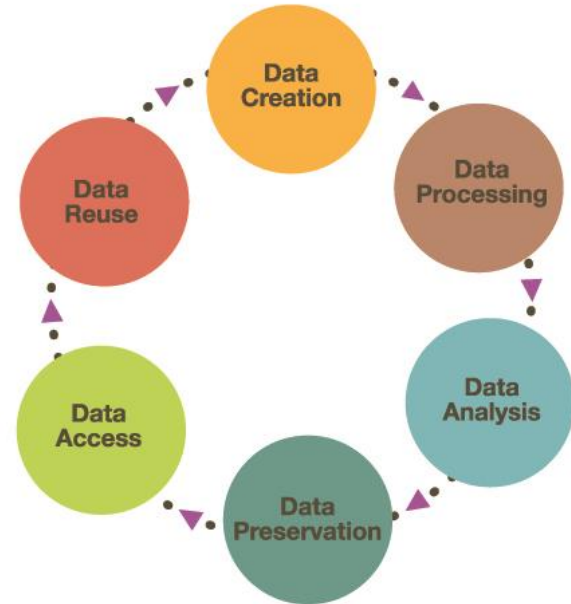
## Handling the diversity of data

- Uncertainties need to be robustly incorporated into analyses
- Requirement to perform robust multi-observation studies and for model-data fusion

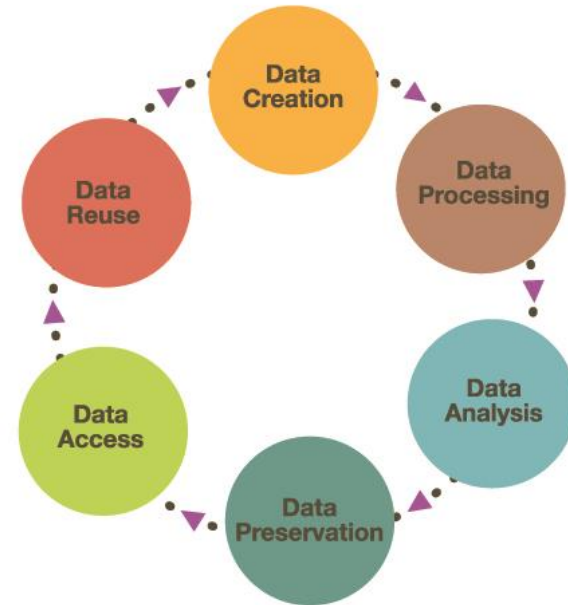
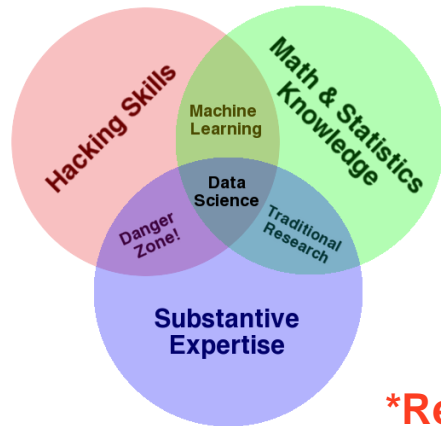
## Available and transparent analysis tools

- Critical to facilitate interdisciplinary collaboration
- Conducive to more rapid progress

## Data Science paradigm: Address the *full data lifecycle*

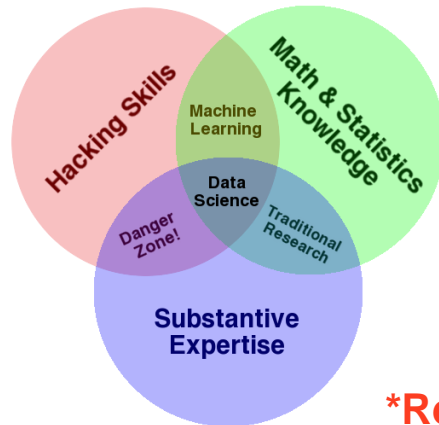


## Data Science paradigm: Address the *full data lifecycle*




**\*Requires radically interdisciplinary approach**

## Data Science paradigm: Address the *full data lifecycle*



**\*Requires radically interdisciplinary approach**



Please bring thoughts, ideas, and discussion items to 1<sup>st</sup> workshop session  
**today 1:30-3:30 PM in Mesa A/Hilton**



# Concluding remarks



Multi-scale geospace - Data-driven approach - GC from the data perspective

We have briefly overviewed multi-scale geospace from the data perspective

- Previous data-driven efforts illustrate potential to create new understanding

Massive potential through data-driven science, but achieving success is challenging

- Data Science paradigm offers potential solution
- Requires improvement to the *entire data lifecycle*

We have briefly overviewed multi-scale geospace from the data perspective

- Previous data-driven efforts illustrate potential to create new understanding

Massive potential through data-driven science, but achieving success is challenging

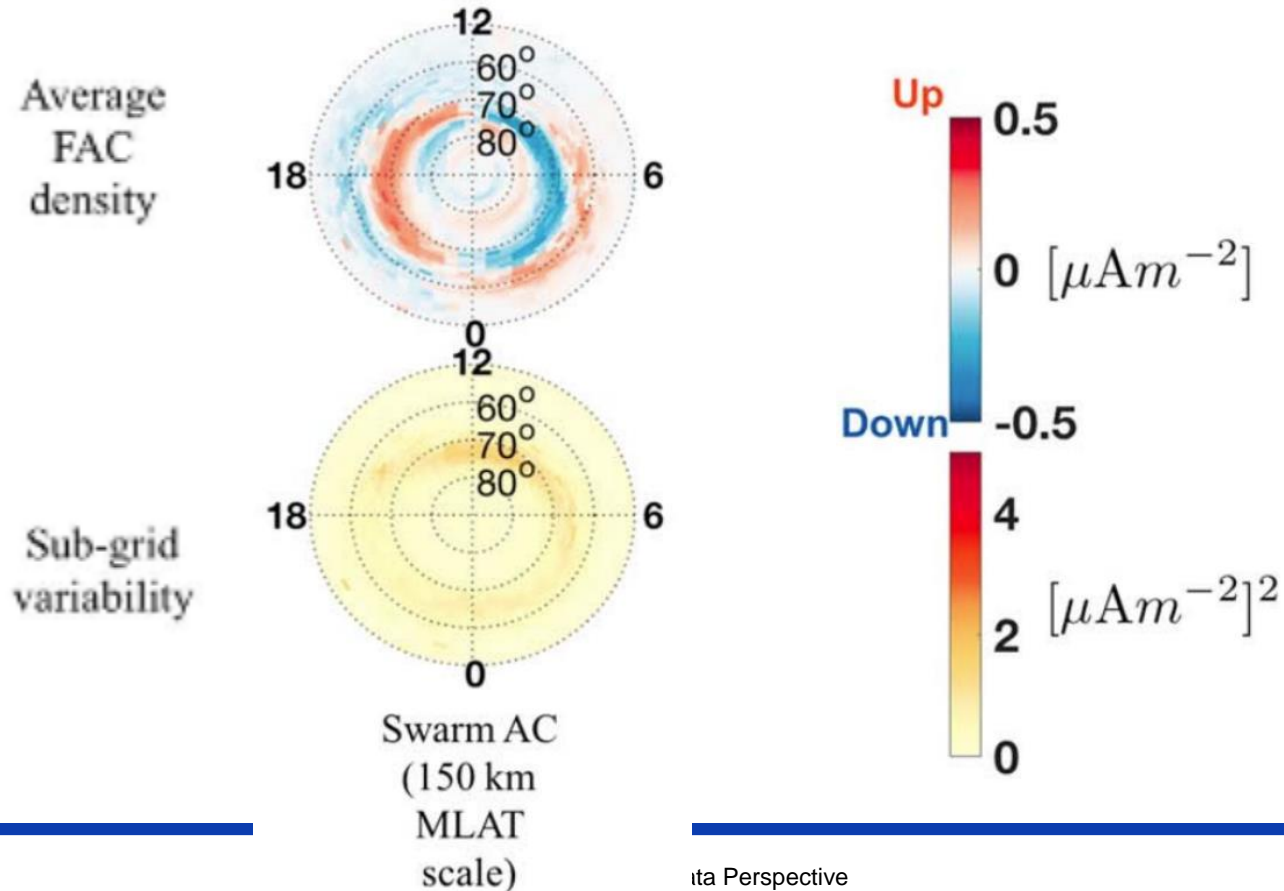
- Data Science paradigm offers potential solution
- Requires improvement to the *entire data lifecycle*

**`New Frontier` in multi-scale geospace possible at intersection of traditional approaches and state-of-the-art data-driven sciences and technologies**

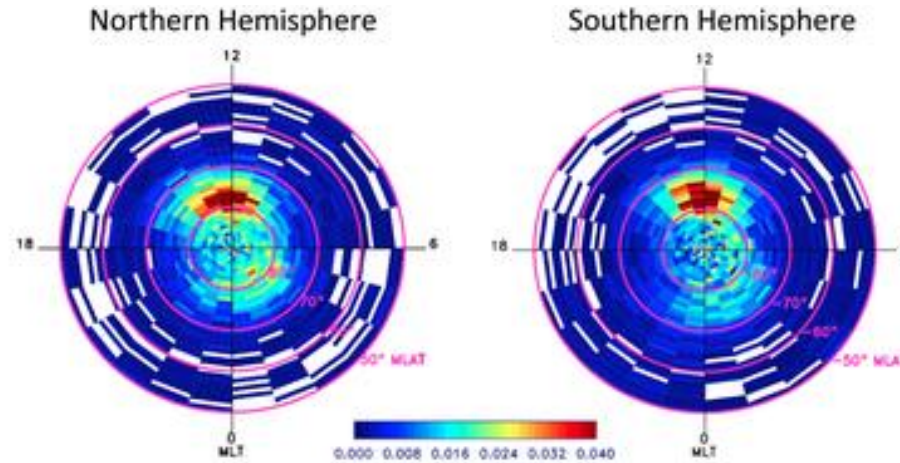
McGranaghan, R. M., Bhatt, A., Matsuo, T., Mannucci, A. J., Semeter, J. L., & Datta-Barua, S. (2017). Ushering in a new frontier in geospace through data science. *Journal of Geophysical Research: Space Physics*, 122, 12,586–12,590. <https://doi.org/10.1002/2017JA024835>

## Backup slides

# Distribution of 150-km scale field-aligned currents over the globe



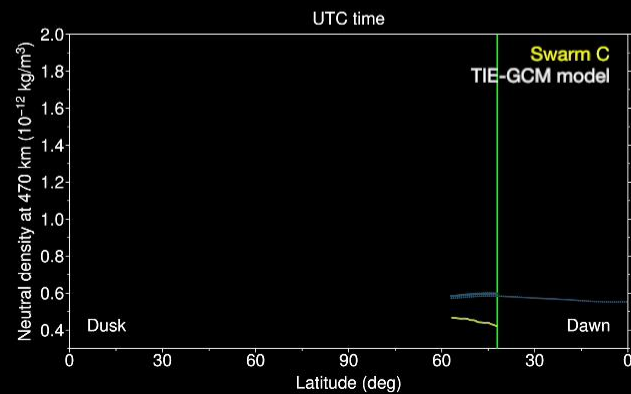
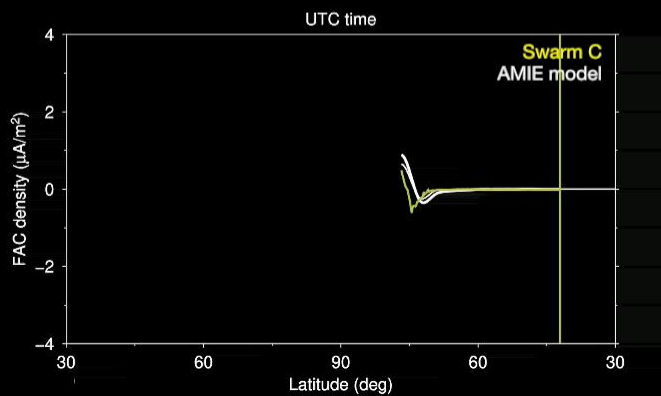
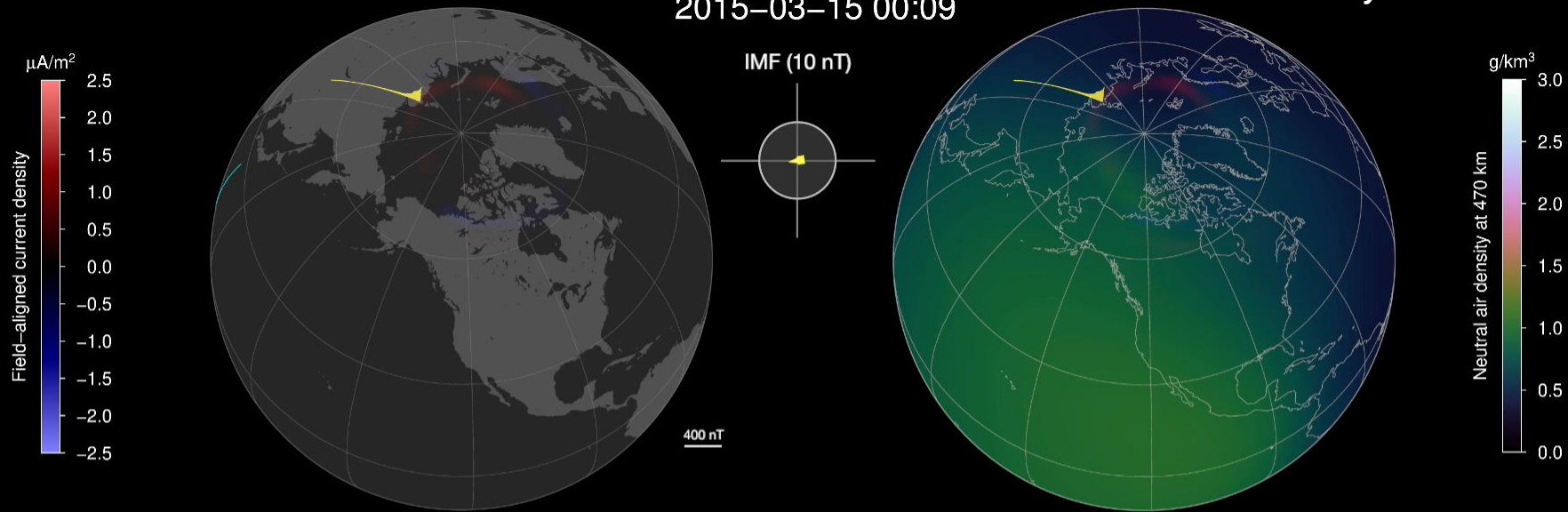
# CHAMP neutral density maxima occurrences

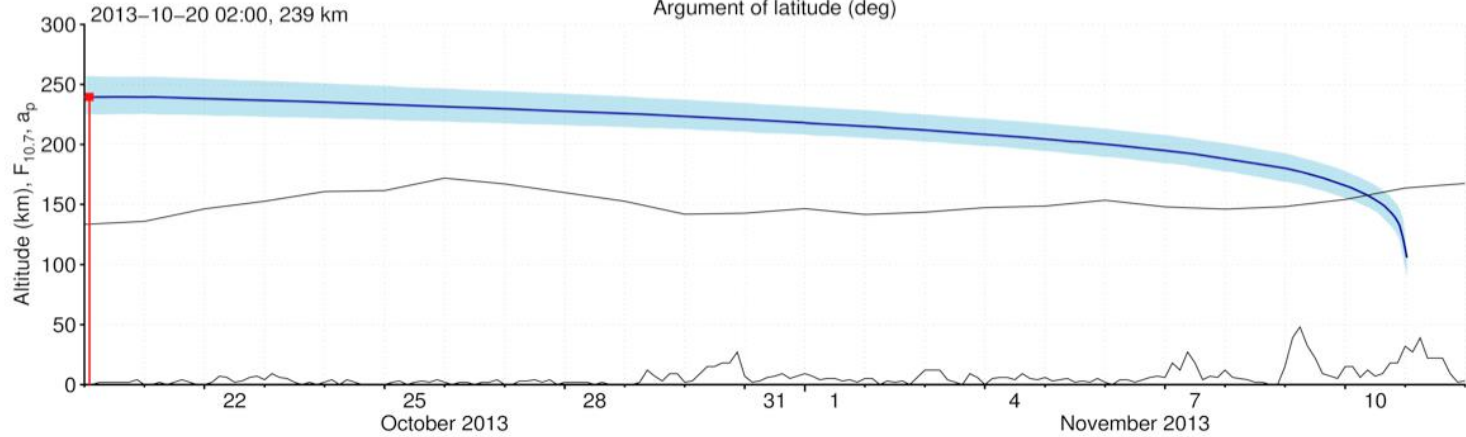
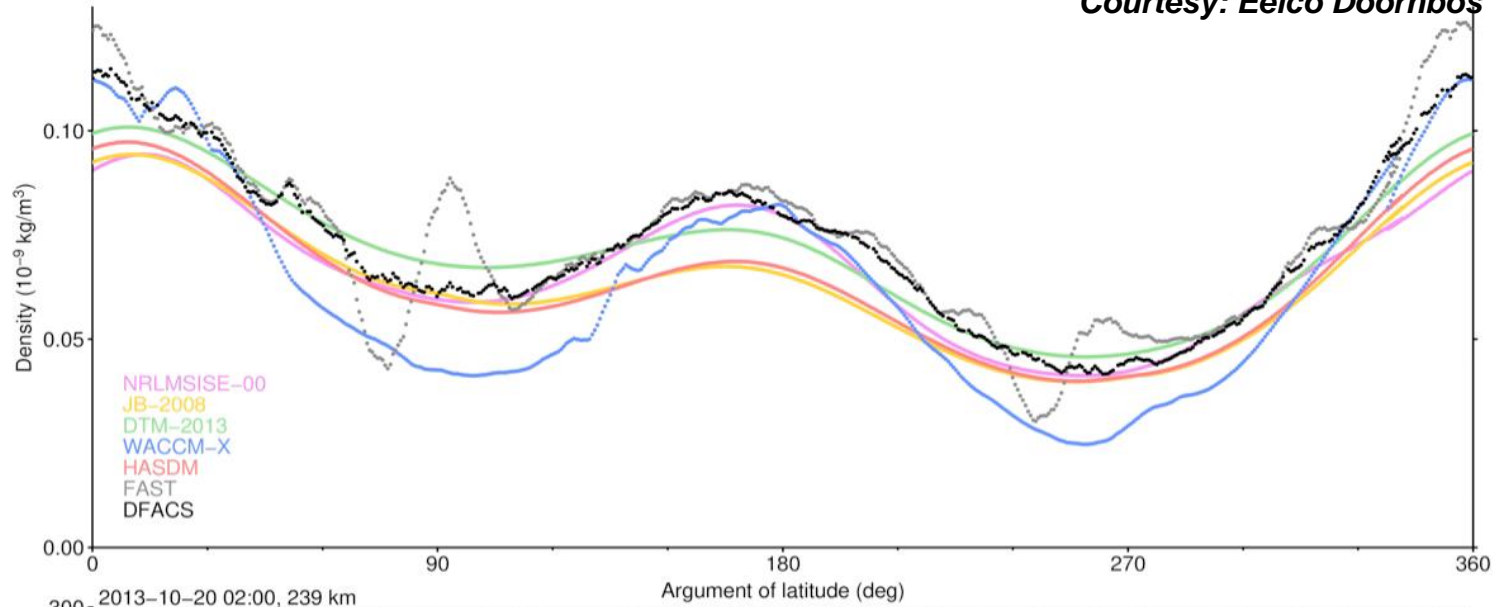


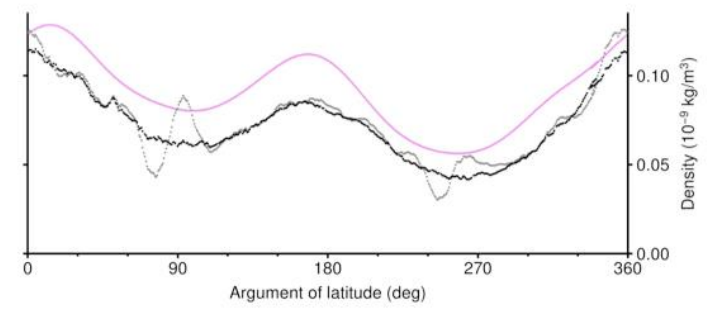
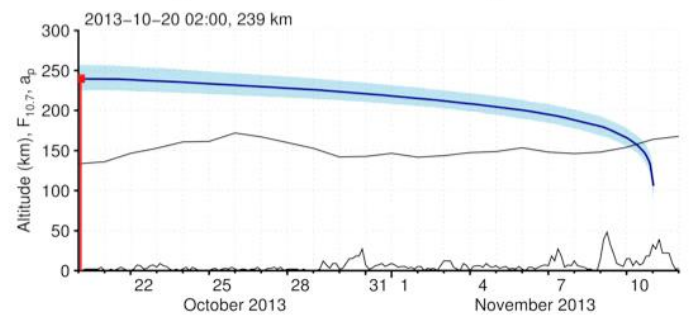
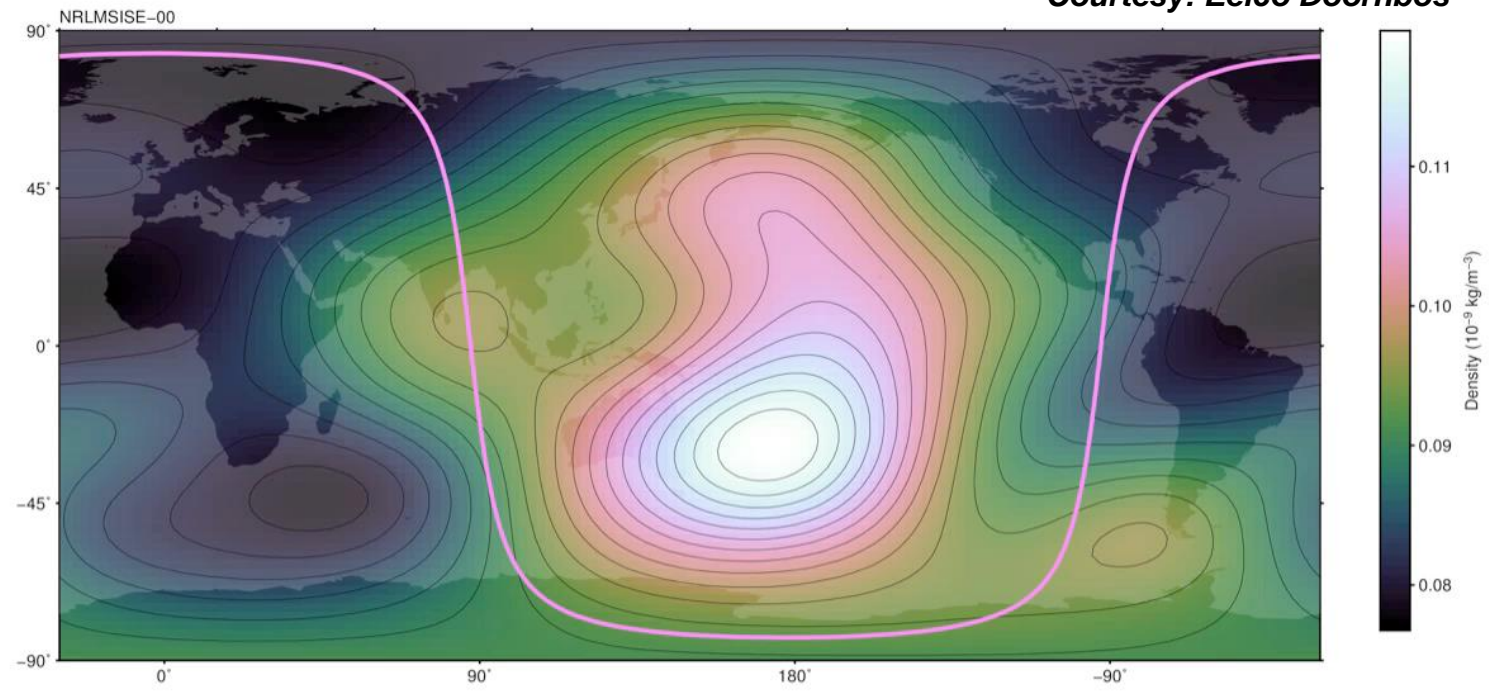
*Huang et al., [2017]*

2015-03-15 00:09

Courtesy: Eelco Doornbos









## Coordinated and fused observations: *A network of data*

- RISR-C & RISR-N
- Imagers
- Global Navigation Satellite Systems (GNSS) signals
- SuperDARN
- SuperMAG
- Satellite—based data

**How can model output and observations be used cooperatively?**

Timely integration with Cusp Grand Challenge initiative, ICON, and GOLD

## Coordinated and fused observations: A *network* of data

- RISR-C & RISR-N
- Imagers
- Global Navigation Satellite Systems (GNSS) signals
- SuperDARN
- SuperMAG
- Satellite-based data

### Data Science Approach

Data archives



Data workflows

## Coordinated and fused observations: A *network* of data

- RISR-C & RISR-N
- Imagers

### Consider the full data lifecycle:

Collection -> Processing -> Analysis -> Visualization -> Accessibility

- Satellite-based data

## Data Science Approach

Data archives



Data workflows

# Data Science Approach

**Front-end**

Analysis tools

Interactive analysis (e.g., visualization)

Analytics-as-a-Service (Statistics, Machine learning, Search)



Archives,  
Databases, and  
Data models

Information Models



Analytical  
Databases

Workflows

Scalable Computing Infrastructure

**Back-end**