



# Going Beyond the Terrestrial

## Space Weather Verification Using METplus

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# NCAR and SWPC Team

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NASA (Crew of STS-39)

# Overview

The **Space Weather Prediction Center Real-time Evaluation System (SWPC-RT)** is a platform-independent, container-based verification system whose purpose is to apply advanced methods and techniques to space weather verification

SWPC-RT provides:

- Ability to bring the **capabilities of METplus** to bear on space weather evaluation
- The capability to read analyses, model output, and forecasts in their **native data formats**
- Embedded support to conduct interactive interrogations of verification sets using **METViewer**
- The ability to use **other Python packages** to do complex calculations on geophysical datasets

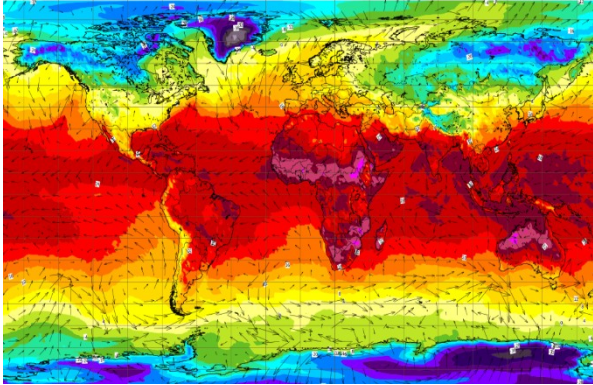


# Why METplus?

Forecasters

Operational Centers

Universities & national labs



## Comprehensive and Unified Verification Tools

**\*Make R2O more efficient \*Provide a consistent set of metrics**

Highly-configurable, state-of-the-art suite of verification tools, a suite of python wrappers, and other supporting capabilities allow for complex real-time and retrospective verification workflows to be simplified and codified for robustness and reproducibility.

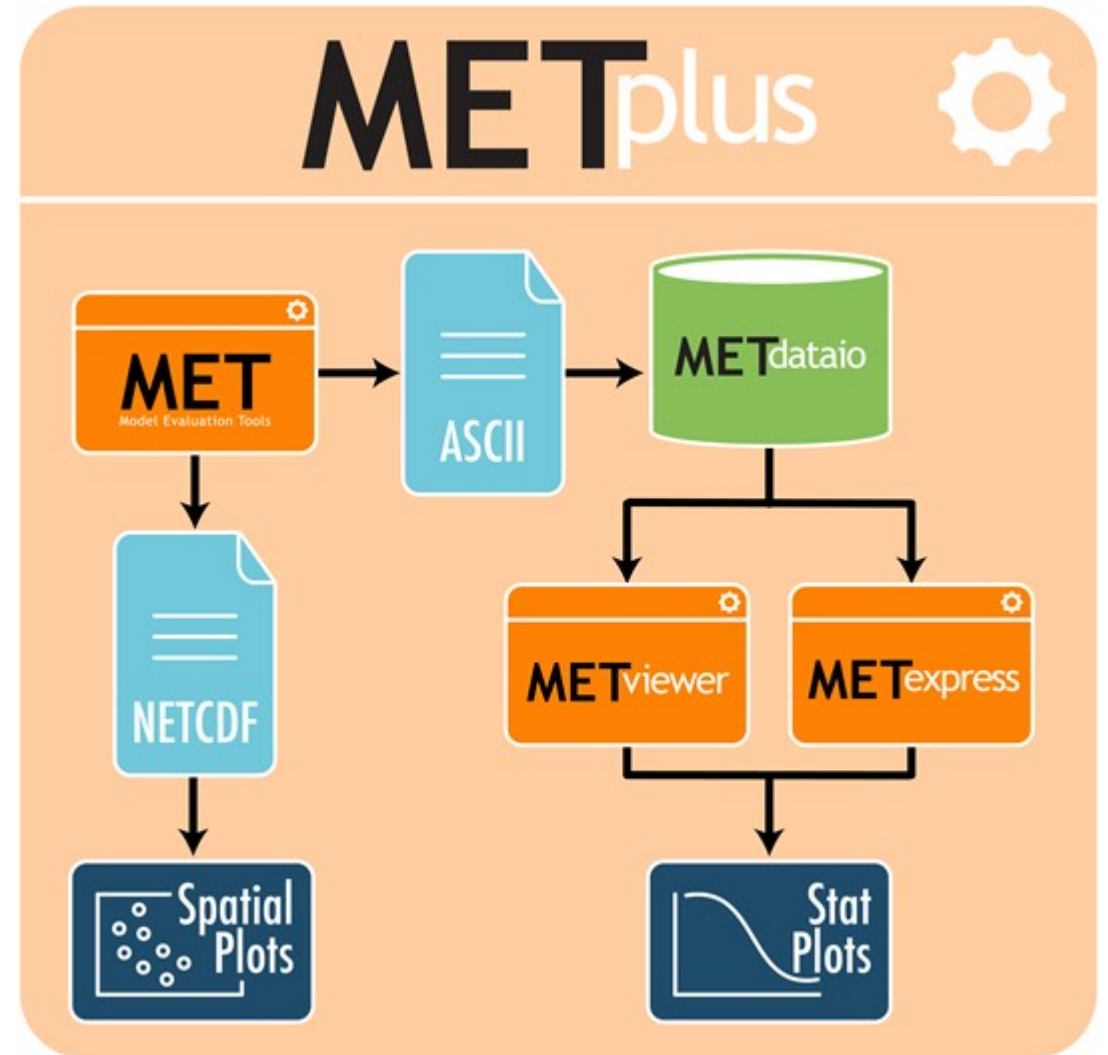
Allows researchers and operational scientists to speak a “common verification” language

# METplus

User support of unified package provides greater opportunity to train all on verification best practices

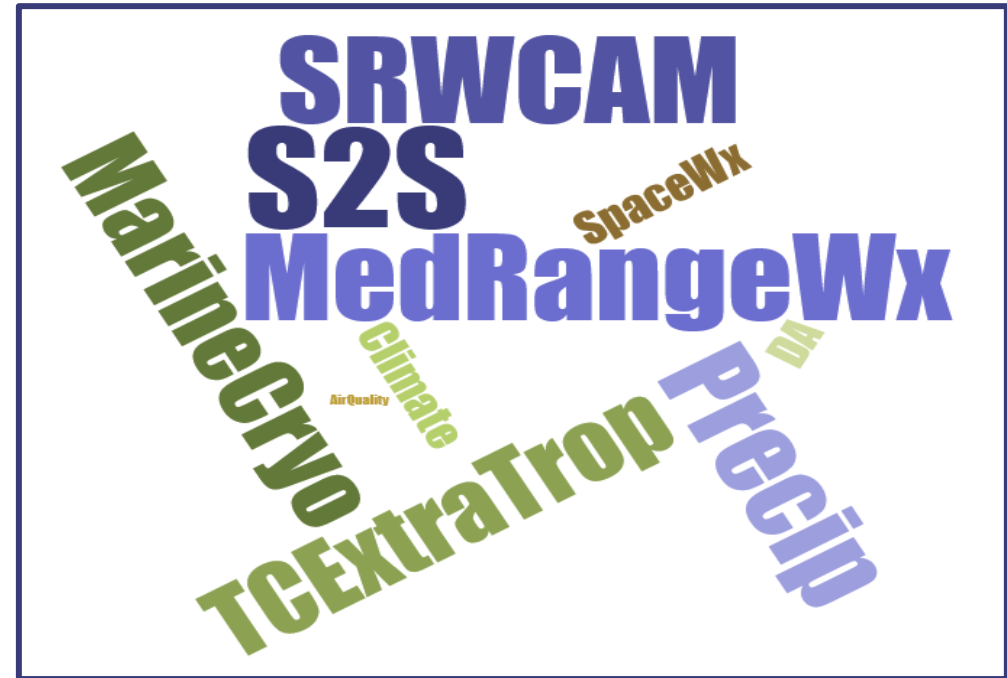
# What is METplus?

- Over 100 traditional statistics and diagnostic methods for both point and gridded datasets
- 15 interpolation methods
- Applied to many spatial and temporal scales
- Developed to allow for easy sharing of config files for reproducible results
- 3500+ users; US and International
- At the core of EMC Verification System for UFS



## What is METplus?, cont'd

- Suite of Python wrappers around:
  - MET tools (core)
    - Traditional statistics
    - Spatial methods
    - Additional diagnostics
  - Database and display systems
    - METviewer for deep dive data interrogation
    - METexpress for quick analysis
  - Analysis and plotting tools
    - Python tools support database and display systems
    - Developing command line option to run on HPCs and in containers



# Design of real-time system



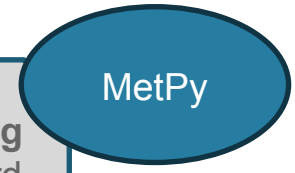
Supported platforms:

- Linux
- MacOSX
- WSL-2

**Datasets**

- GloTEC
- WAM-IPE
- CTIPe (coming soon)
- COSMIC-II
- MIT gnss

**Python Embedding**  
Reads non-standard data and format to pass to MET Tools



**Python driver + METplus**

**Configuration: Define use cases / dates to run**

- Gridded comparisons
- Object-oriented comparisons
- Verification of human forecasts
- Gradient comparisons

One main configuration file

**MET: Grid-Stat**

**MET: MODE**

**MET: Point-Obs (coming soon)**

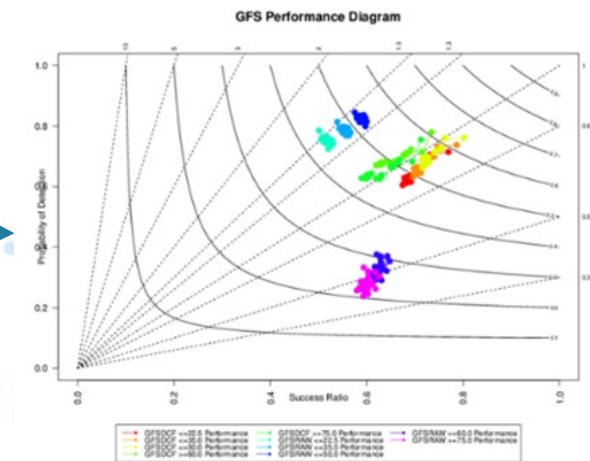
**MET: Stat-Analysis**

**Statistics**

**METdataio**

**METviewer**

Graphical Products & Scorecards

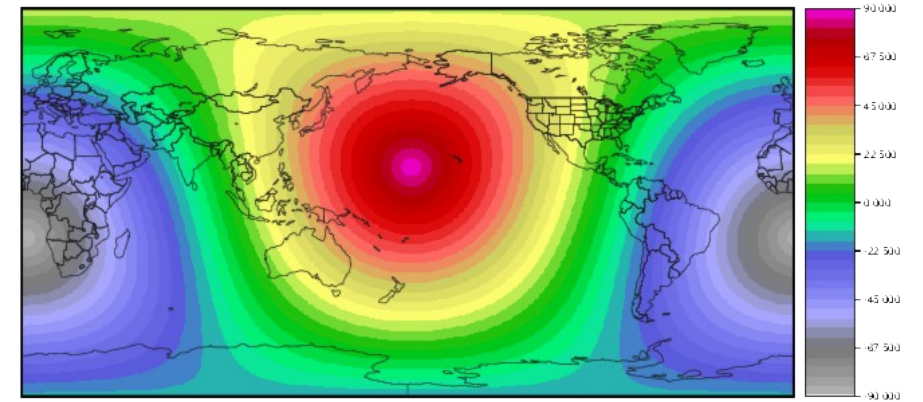


# Gridded Comparisons

SWPC-RT uses METplus' GridStat tool to undertake gridded comparisons of models with analyses.

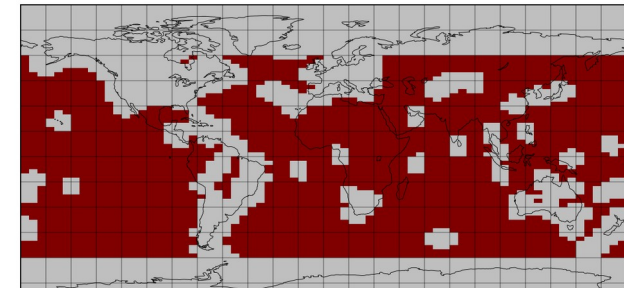
Key adaptations for the space-weather domain include:

- Adaptation for **space weather variables** like Total Electron Content (TEC)
- **Custom masks**, e.g., distance from ionospheric ground stations
- **Time-dependent masking** by
  - *azimuthal solar angle*
  - *quality flag based on the # of Radio Occultation (RO) rays*
- **Python embedding scripts** to read data in its native format

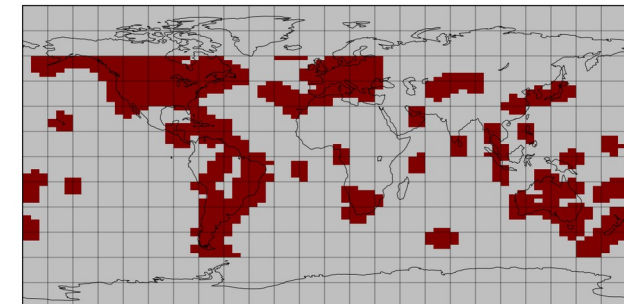


solar\_alt\_00.nc

DATA SPARSE REGIONS masking region



DATA RICH REGIONS masking region

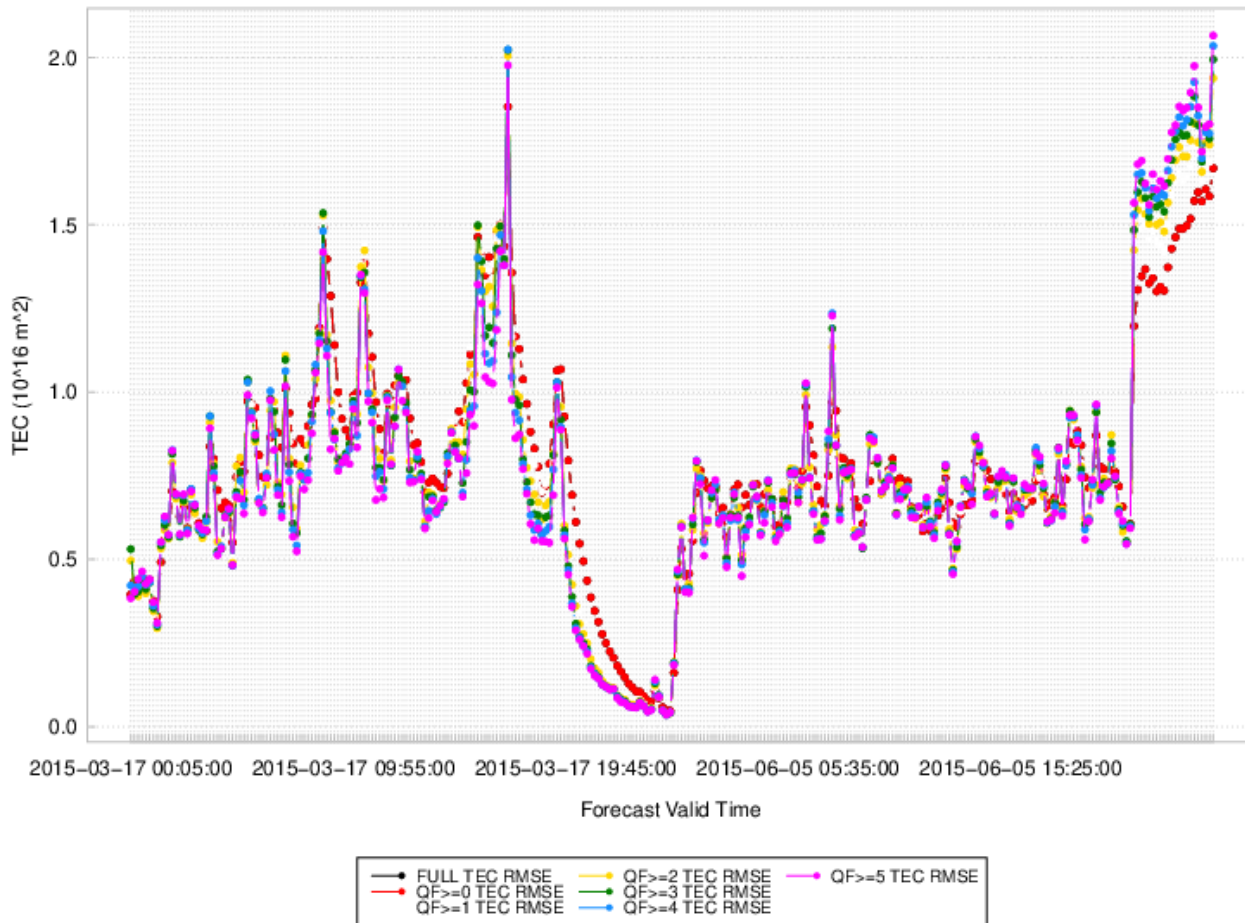


DATA RICH REGIONS masking region (I)  
Data Min = 0.0, Max = 1.0, Mean = 0.2

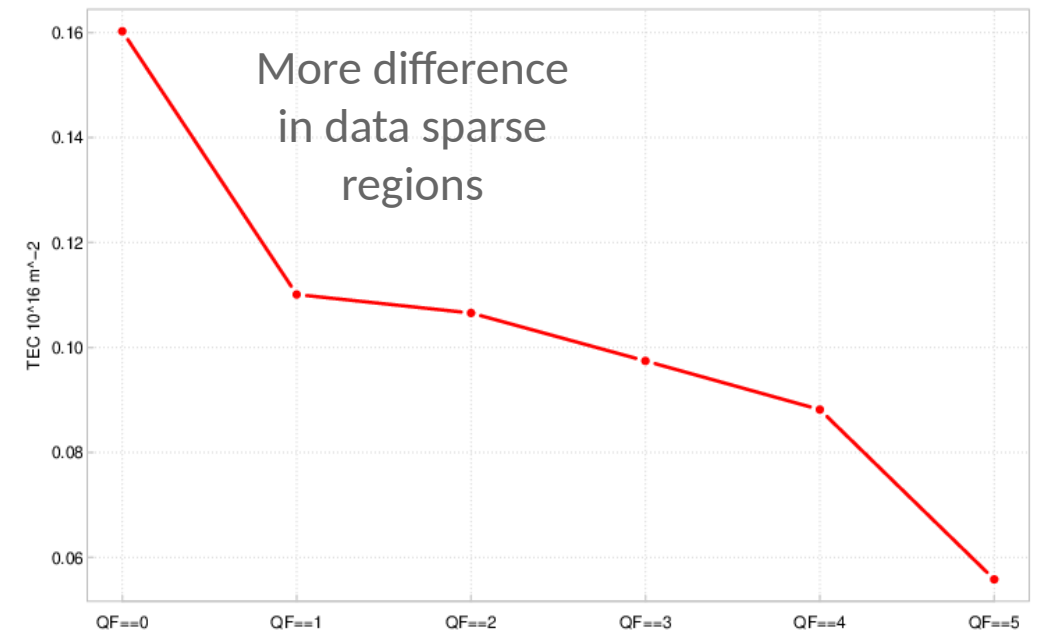


# Examples of Gridded Comparisons

GloTEC w/COSMIC vs. w/o – RMSE



Evaluation of impact of Radio Occultation (RO) data on GloTEC analyses



Less difference when ground-based observations available

SWPC has been using these capabilities to evaluate real-time RO data from vendors for the Commercial Weather Data Program (CWDP)

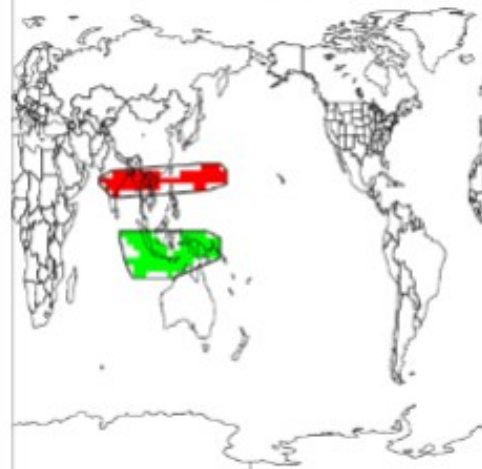
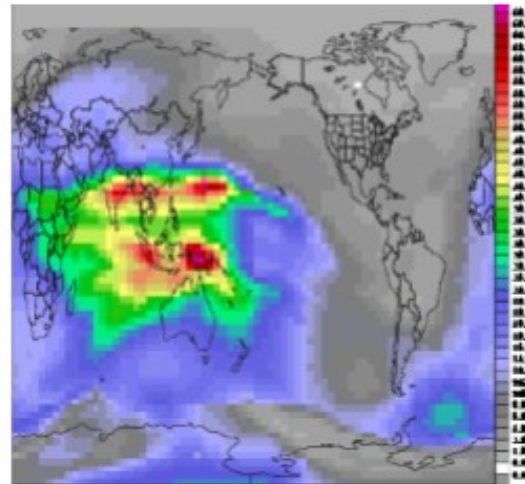
# Object-Oriented Comparisons

## MET Tool: MODE

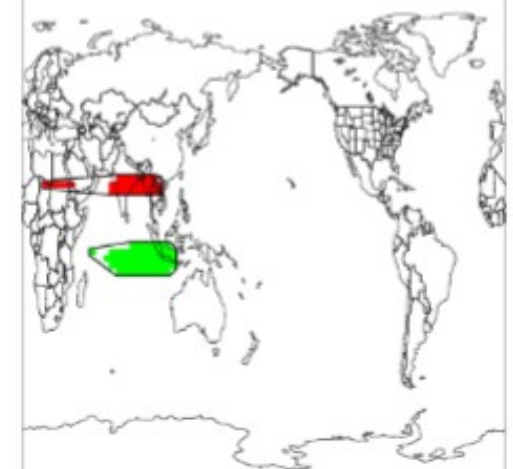
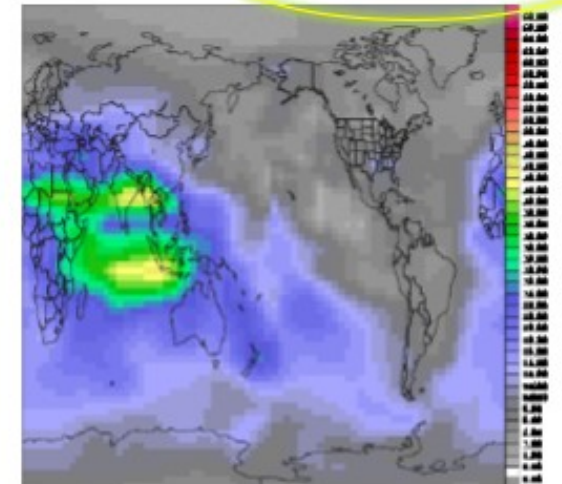
- METplus' MODE tool allows object-oriented comparisons of gridded the physical models (e.g., WAM-IPE) with an empirical model analysis (GloTEC)
- This allows examination of object attributes such as:
  - centroid distance
  - area ratio
  - axis angle
  - intensity ratio

*Object-oriented comparisons helped SWPC identify a bias in WAM-IPE in which TEC in high regions was ~10 TEC units greater than GloTEC*

WAM-IPE >45 TECunits



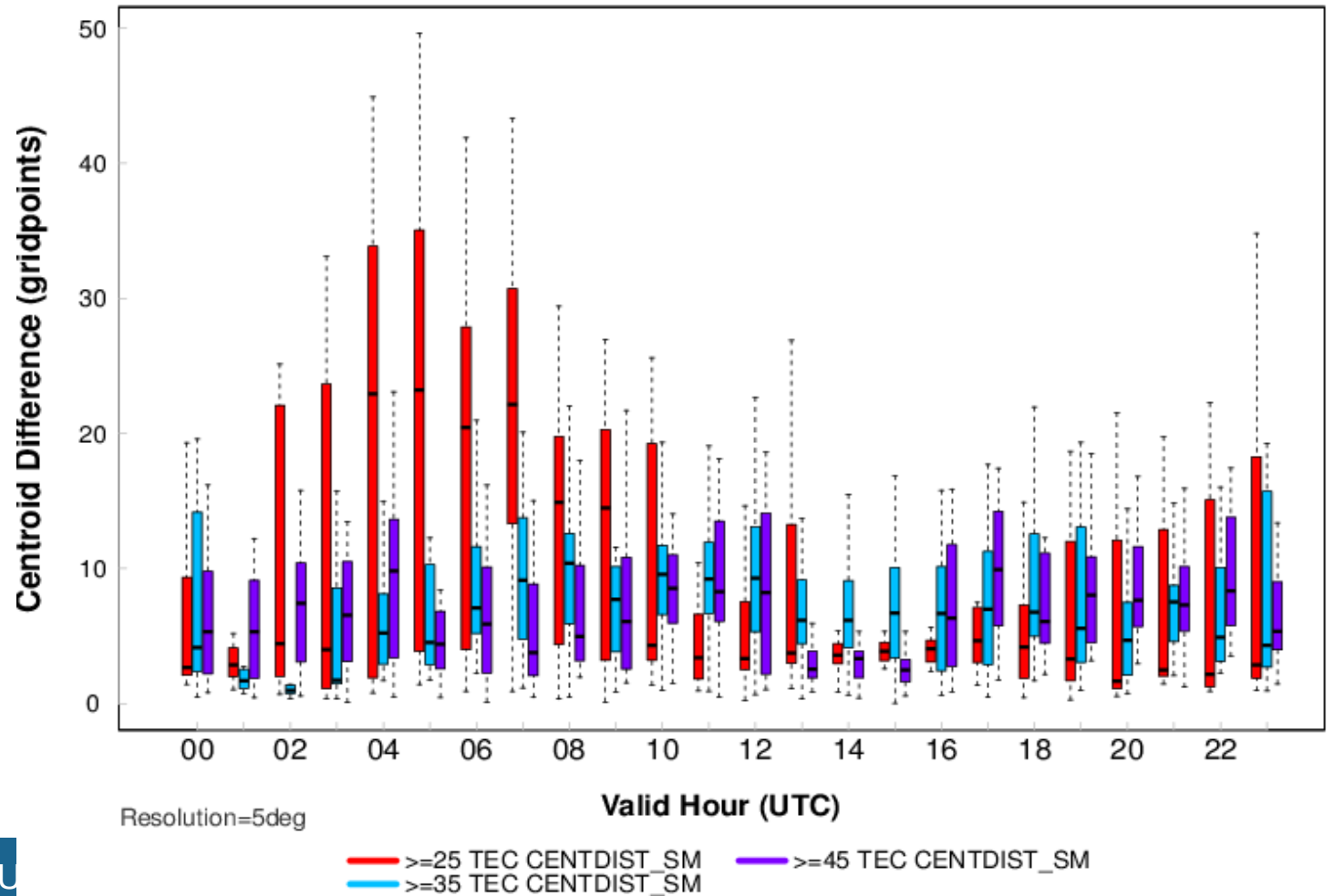
GloTEC >35 TECunits



# MODE Example

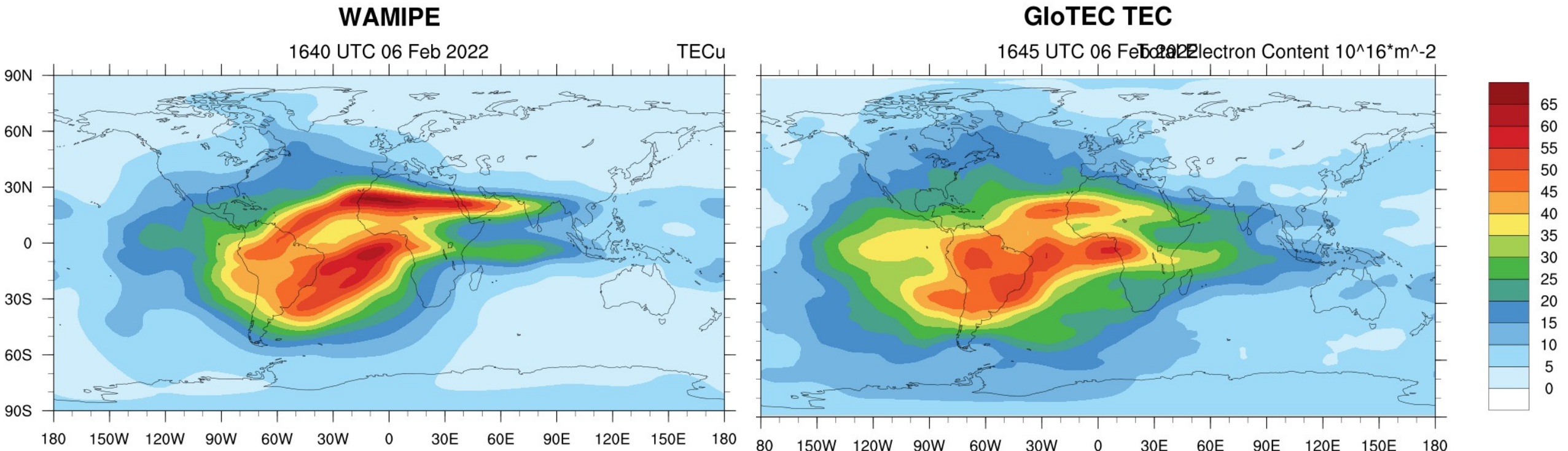
- Distribution of differences in centroid difference between objects in the two models by valid hour for different object thresholds
- Differences are relatively small for the high-value TEC objects. There is quite a bit of diurnal variation at the lower TEC thresholds

WAM-IPE MODE Centroid Difference – Hourly – Matched Only



# TEC gradient comparisons

- TEC gradients lead to instability which can cause ionospheric irregularities
- The resulting undulations can lead to scintillation, which can significantly impact radio communications
- A new use case allows SWPC-RT to compute the gradient magnitude of TEC and compare these between model and analysis



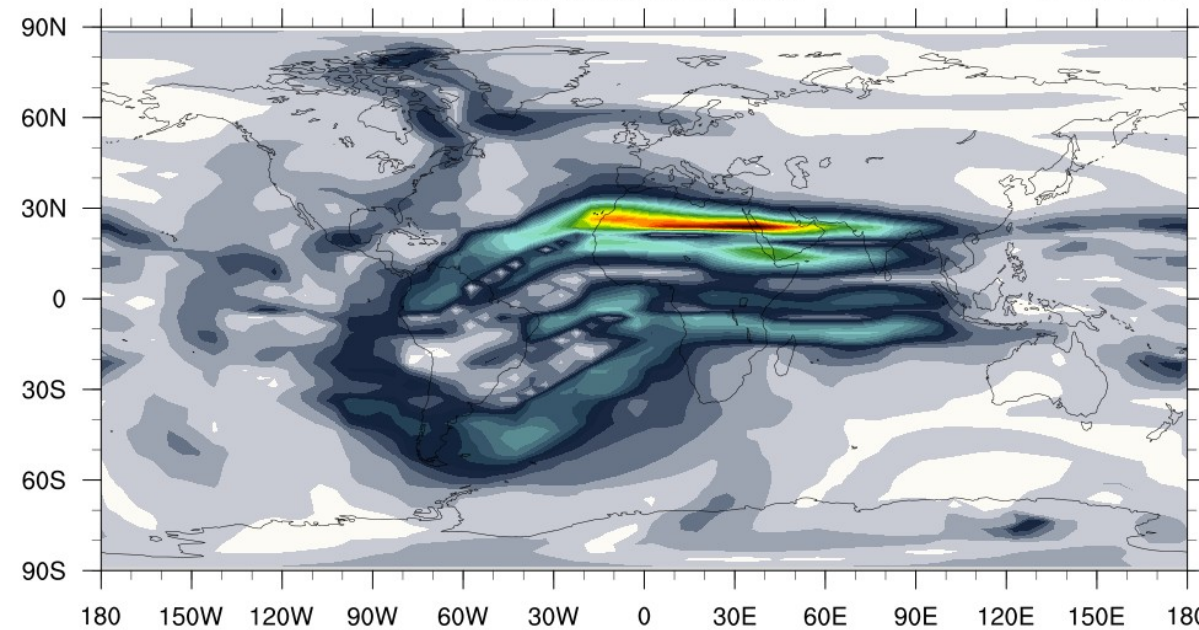
# TEC gradients

- MetPy's *geospatial\_gradient* function used to calculate the gradient magnitude for each field
- Computation is done at the time it is read into the system using python embedding
- This function computes the gradient accurately on the sphere using map factors.

### WAMPE TEC Gradient Magnitude

1645 UTC 06 Feb 2022

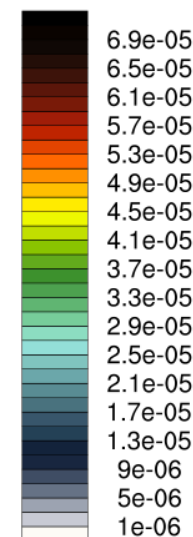
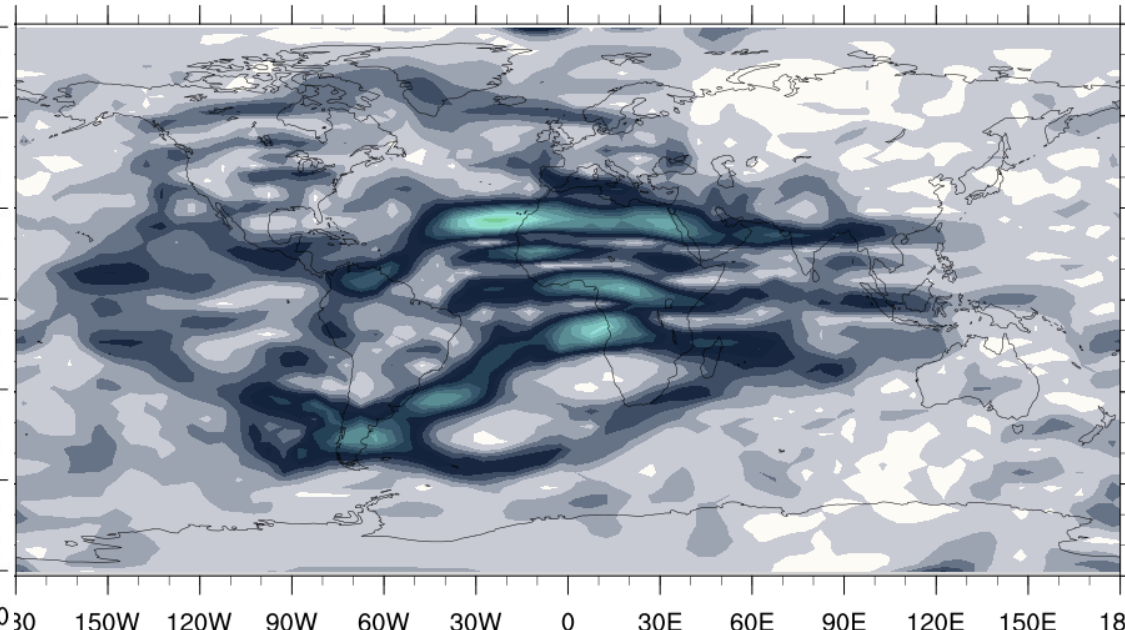
$10^{16} \text{m}^{-2}$



### GloTEC TEC Gradient Magnitude

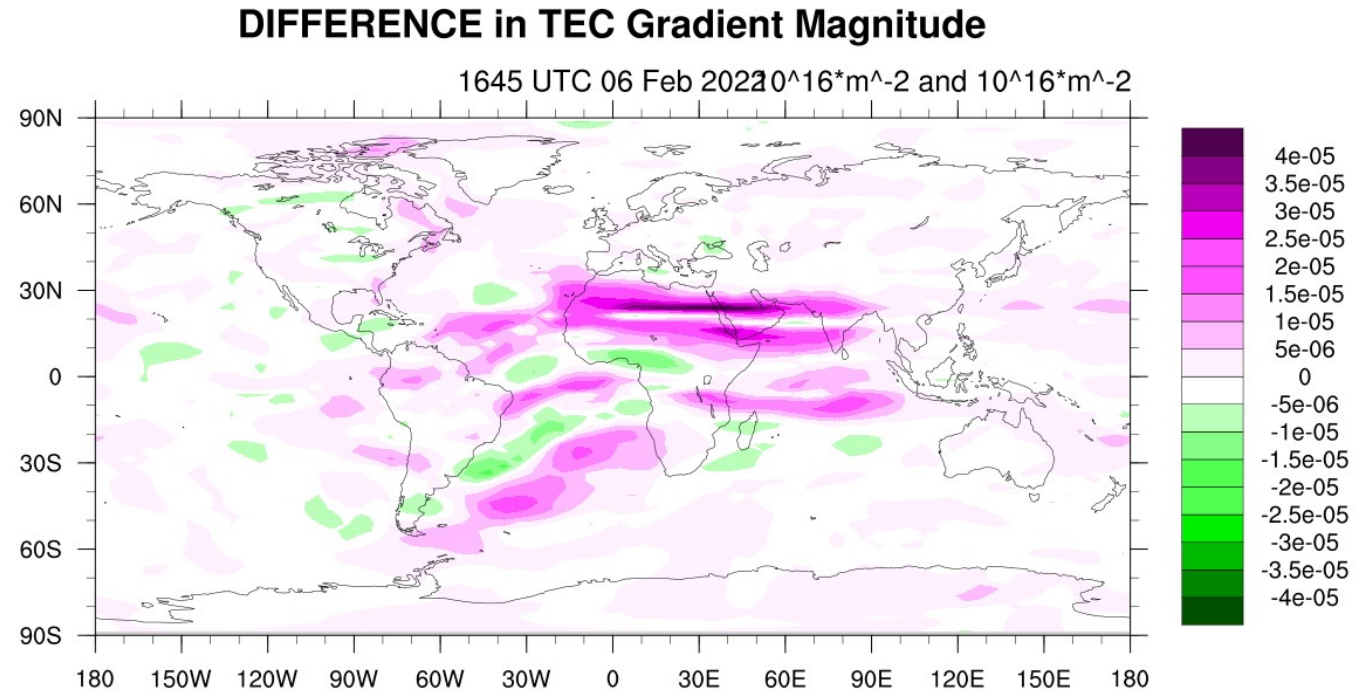
1645 UTC 06 Feb 2022

$10^{16} \text{m}^{-2}$



# Scintillation

- Scintillation is likely near areas of high TEC gradients
- Goal of future development is to explore the relationship between TEC gradients and point observations of scintillations

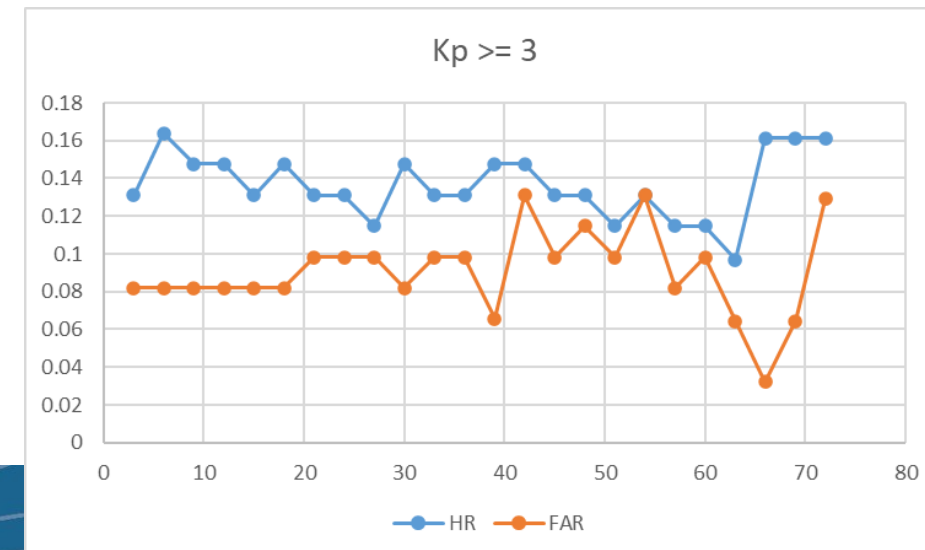


# Verification of human forecasts

- SWPC's human forecasters provide forecast the Kp index
- The input data are in Json format
- This use case computes contingency tables by forecast lead time
- Event being forecast is a threshold of  $Kp \geq 3$
- Each line is a separate contingency table for the respective forecast lead time
- FY\_OY means the event was forecast and it was also observed (a "hit")
- FY\_ON gives the number of times that the event was forecast but not observed (a "false alarm"), etc.

## Event: $Kp \geq 3$

COL_NAME:	FCST_LEAD	TOTAL	FY_OY	FY_ON	FN_OY	FN_ON	EC_VALUE
CTC: 12		61	9	5	5	42	0.5
CTC: 15		61	8	5	6	42	0.5
CTC: 18		61	9	5	5	42	0.5
CTC: 21		61	8	6	6	41	0.5
CTC: 24		61	8	6	6	41	0.5
CTC: 27		61	7	6	7	41	0.5
CTC: 3		61	8	5	6	42	0.5
CTC: 30		61	9	5	5	42	0.5
CTC: 33		61	8	6	6	41	0.5
CTC: 36		61	8	6	6	41	0.5
CTC: 39		61	6	6	7	42	0.5
CTC: 42		61	9	8	4	40	0.5
CTC: 45		61	8	6	5	42	0.5
CTC: 48		61	8	7	5	41	0.5
CTC: 51		61	7	6	6	42	0.5
CTC: 54		61	8	8	5	40	0.5
CTC: 57		61	7	5	6	43	0.5
CTC: 6		61	10	5	4	42	0.5
CTC: 60		61	7	6	6	42	0.5
CTC: 63		31	3	2	4	22	0.5
CTC: 66		31	5	1	2	23	0.5
CTC: 69		31	5	2	2	22	0.5
CTC: 72		31	5	4	2	20	0.5
CTC: 9		61	9	4	5	43	0.5



# Thank you for your attention

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- Terry Onsager, [terry.onsager@noaa.gov](mailto:terry.onsager@noaa.gov)
- METplus Resources
  - METplus home page: <https://dtcenter.org/community-code/metplus>
  - METplus discussions support: <https://github.com/dtcenter/METplus/discussions>
  - METplus documentation: [https://metplus.readthedocs.io/en/latest/Users\\_Guide/](https://metplus.readthedocs.io/en/latest/Users_Guide/)

# METplus



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