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# Assimilating Ground and Space-Based GPS Measurements Using JPL/USC GAIM To Monitor Space Weather

Attila Komjathy, Brian Wilson, Vardan Akopian, Xioaqing Pi,  
Byron Iijima, Miguel Dumett and Anthony J. Mannucci

*Jet Propulsion Laboratory  
California Institute of Technology  
M/S 238-600  
4800 Oak Grove Drive  
Pasadena CA 91109*

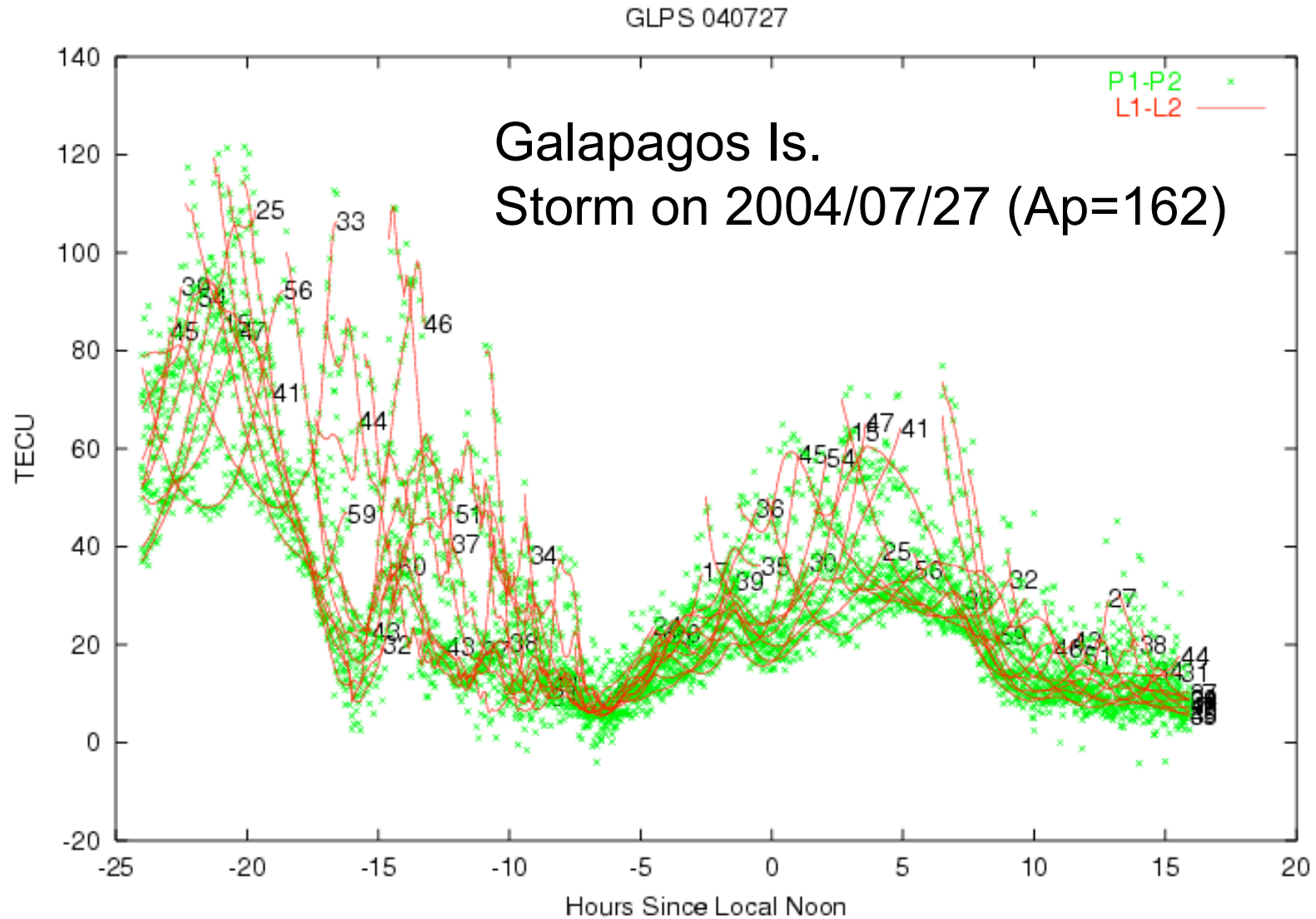
*Email: [Attila.Komjathy@jpl.nasa.gov](mailto:Attila.Komjathy@jpl.nasa.gov)*

# Outline

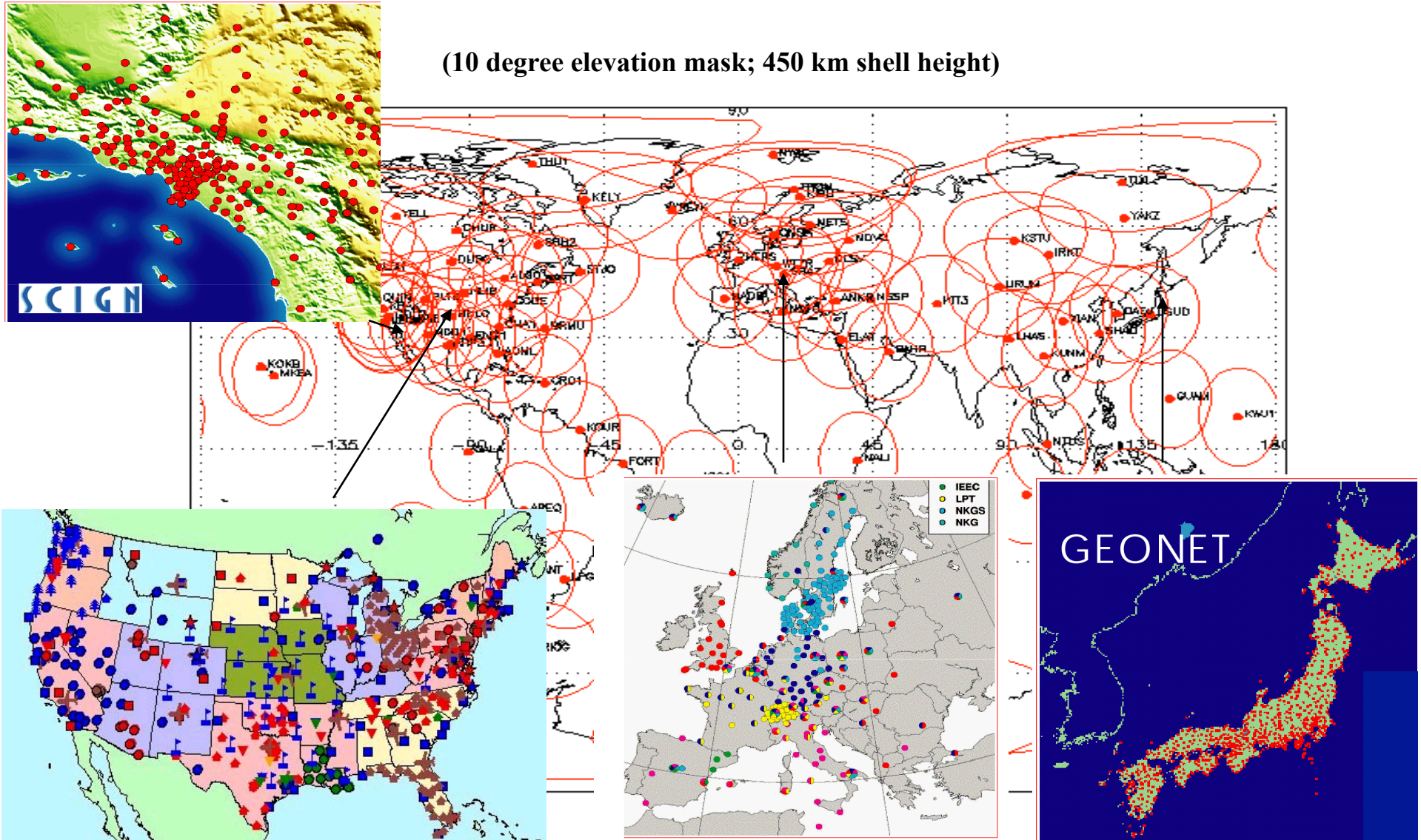
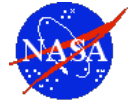


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- **Ionospheric Remote Sensing Using GPS:  
One Person's Signal Is Another Person's Noise**
    - Global ground GPS network: TEC mapping, storms, etc.
    - Space-based GPS Limb Scans: profiles & irregularities
  - **Global Assimilative Ionosphere Model (GAIM)**
    - First-principles physics model, with an adjoint
    - Assimilation: Kalman filter & 4DVAR
      - Estimate driver parameters and 3D density grid
    - Questions: What impact COSMIC data will have on estimated profile shapes, VTEC, NmF2 and HmF2 directly affecting space weather monitoring ?
    - Three case studies: Arecibo, Jicamarca and Millstone ISR

# Information Content of GPS Slant TEC: An Example for Low Latitude



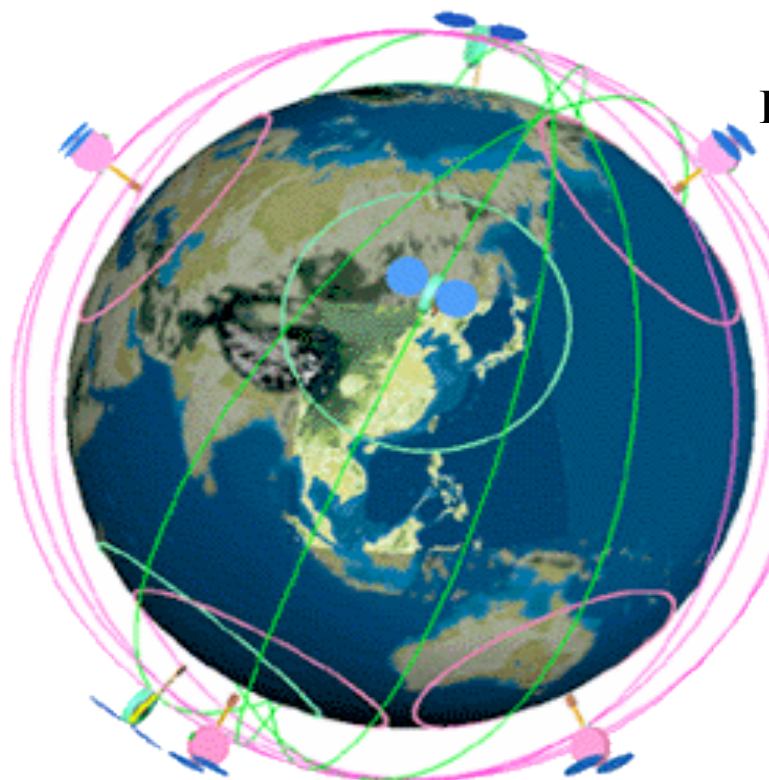
# Coverage of Daily IGS Network and Regional Networks



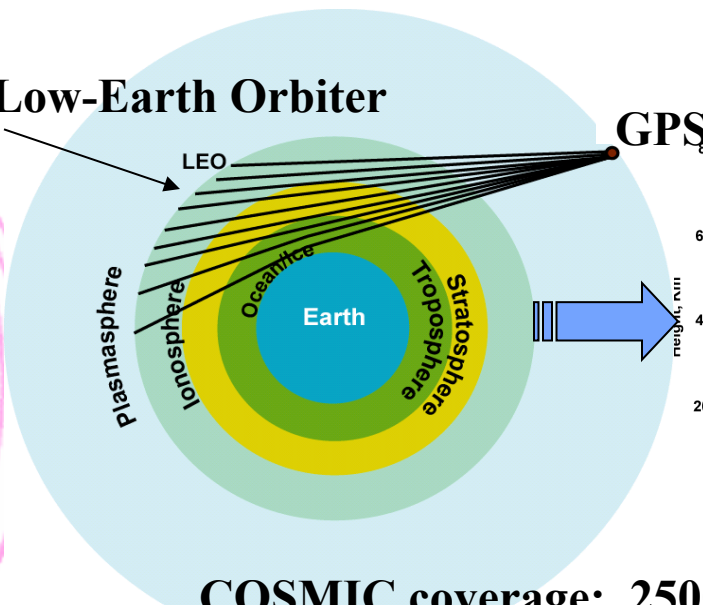
January 26-28, 2009

Presented at the ION 2009 International Technical Meeting, Anaheim, CA

# COSMIC Ionospheric Weather Constellation

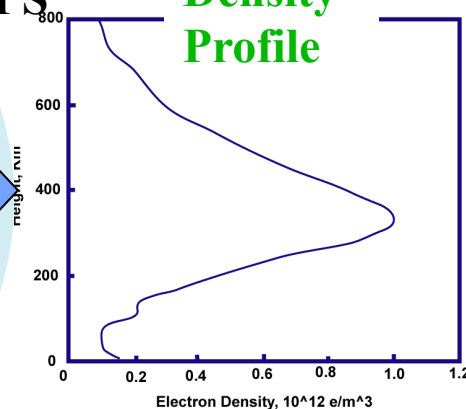


Low-Earth Orbiter

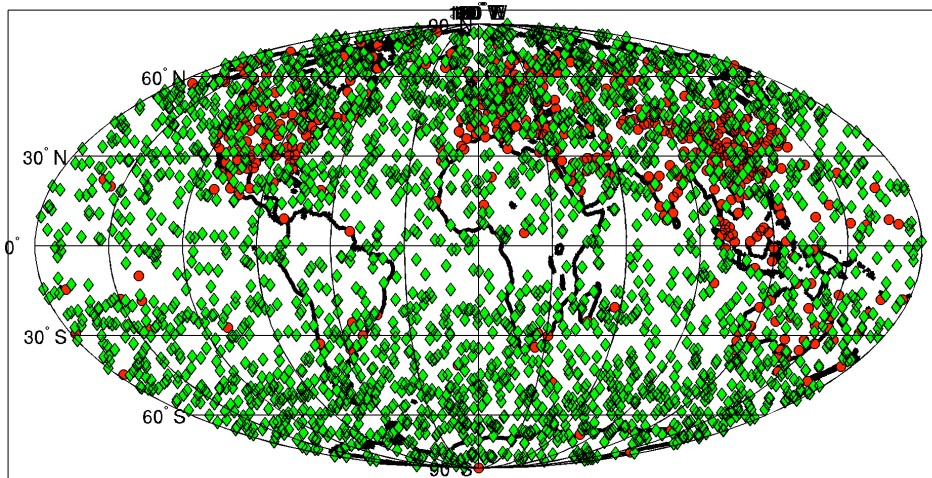


GPS

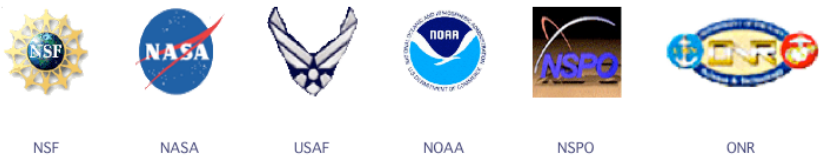
Electron  
Density  
Profile



**COSMIC coverage: 2500 profiles/day**  
Occultation Locations for COSMIC, 6 S/C, 6 Planes, 24 Hrs



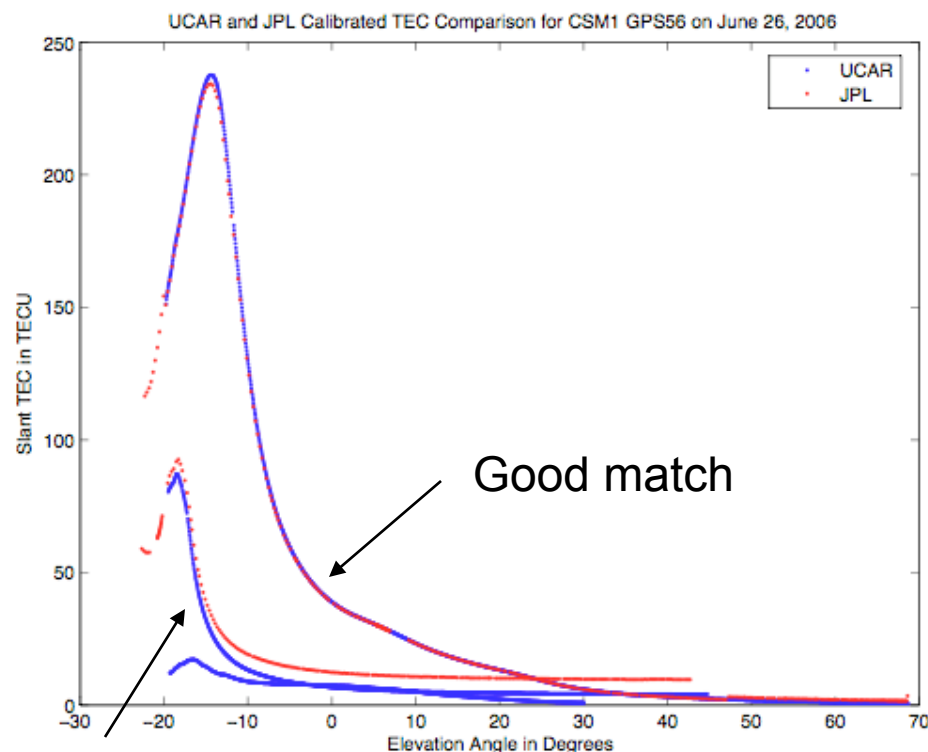
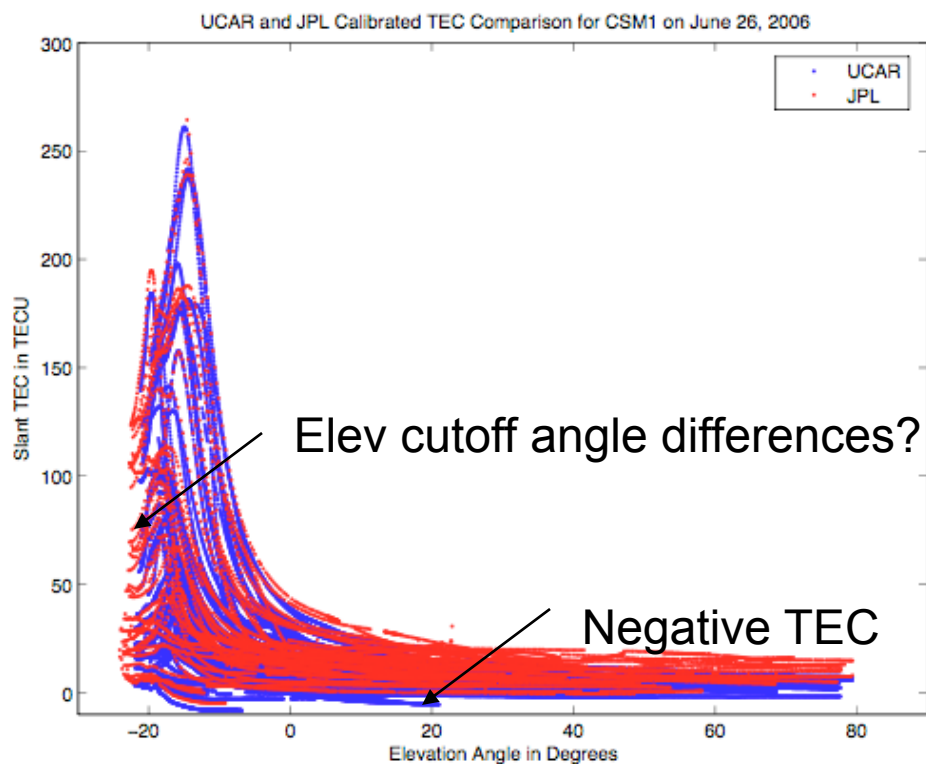
**Six-satellite COSMIC constellation  
Launched April 14, 2006**



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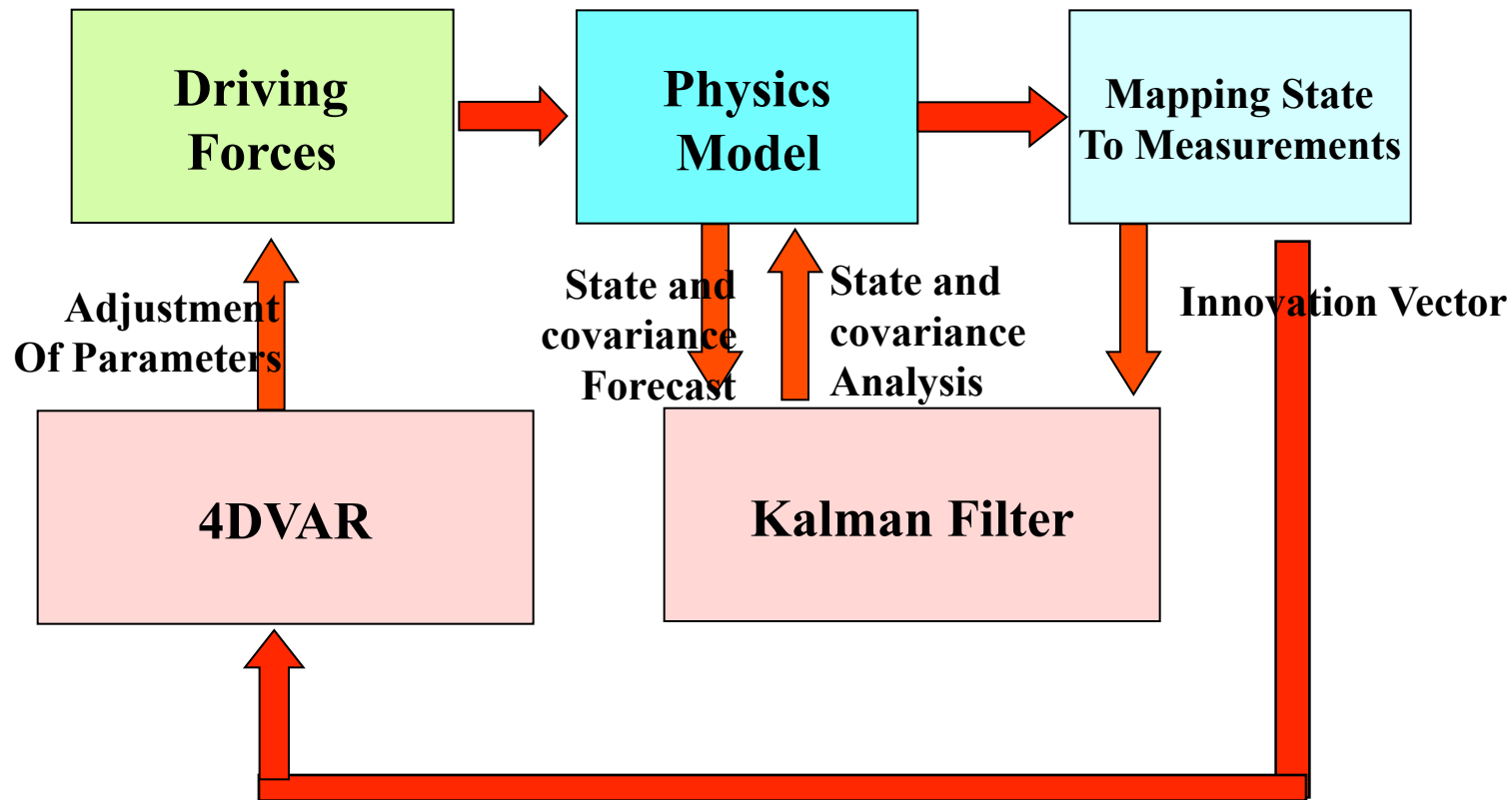
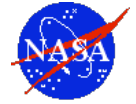
# Comparison of Calibrated Slant TEC Measurements: An Example



Calib. Different

- An example of comparison of calibrated TEC between JPL and UCAR
- Currently there appears to be a 1-2 TECU bias between JPL and UCAR slant TEC
- Similar data volumes between JPL and UCAR

# Global Assimilative Ionospheric Model Data Assimilation Process



- 4-Dimensional Variational Approach

- **Minimization of cost function by estimating driving parameters**
- Non-linear least-square minimization
- Adjoint method to efficiently compute the gradient of cost function
- Parameterization of model “drivers”

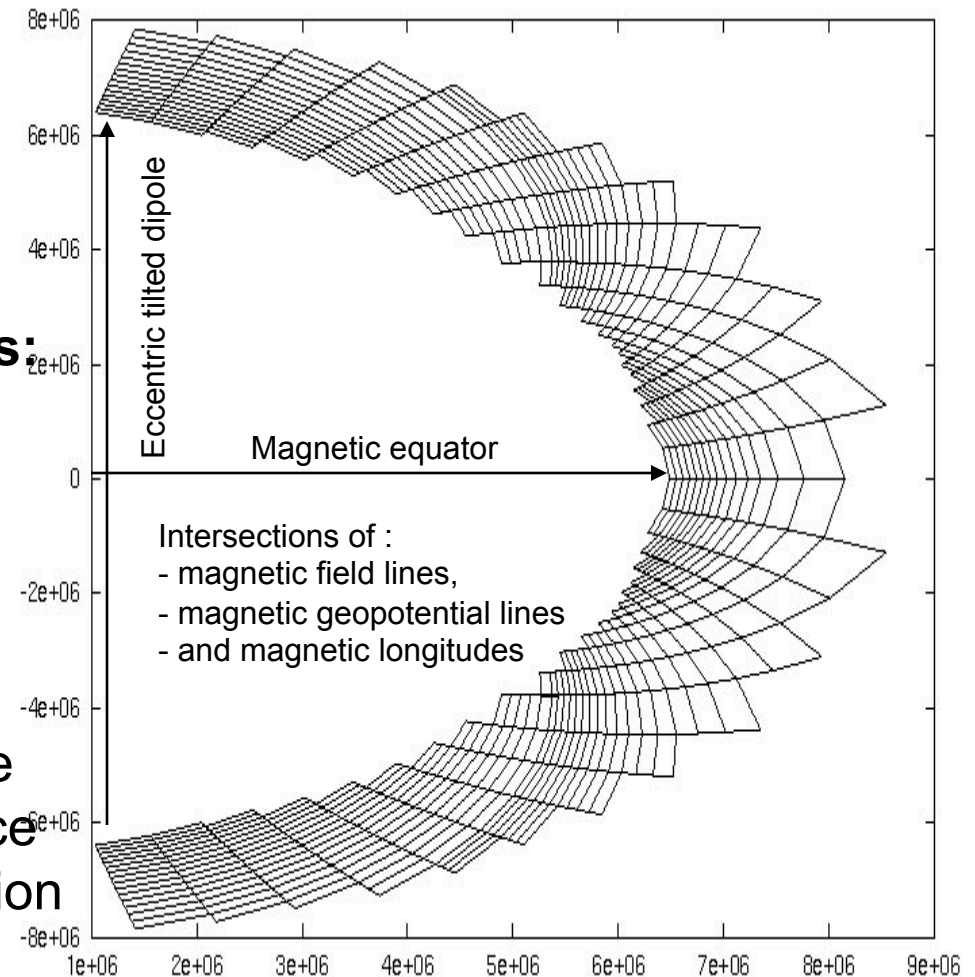
- Kalman Filter

- **Recursive Filtering**
- **Covariance estimation and state correction**
- Optimal interpolation
- Band-Limited Kalman filter

# Kalman Assimilation Runs: Three Case Studies



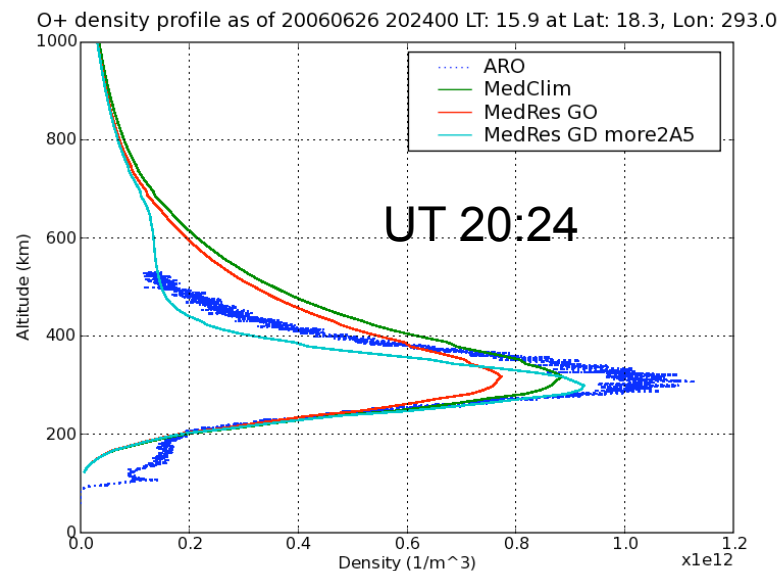
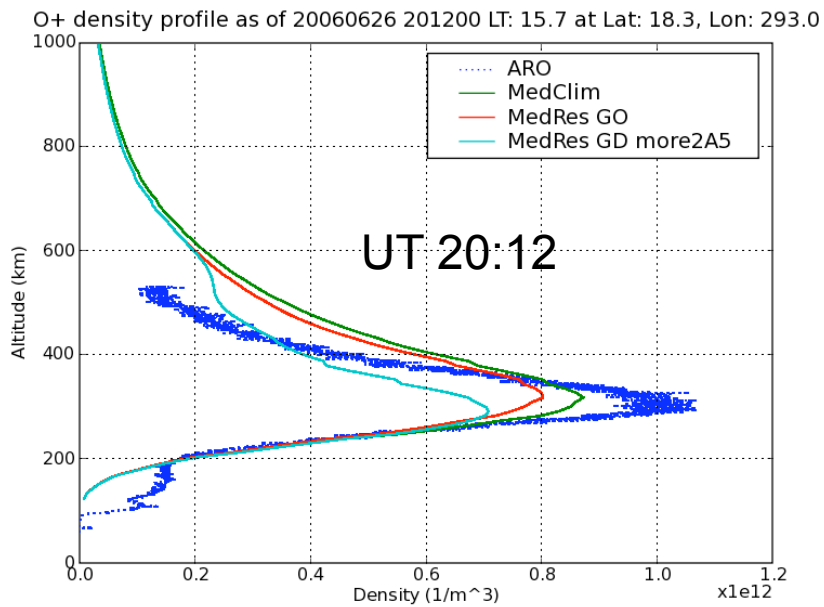
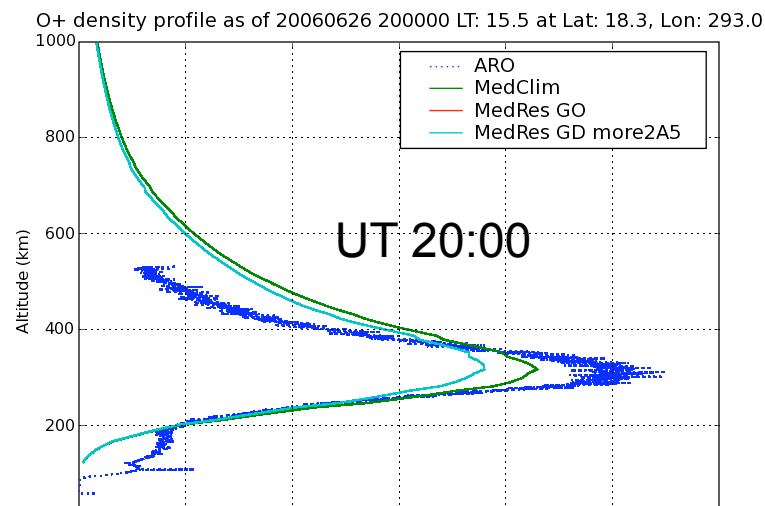
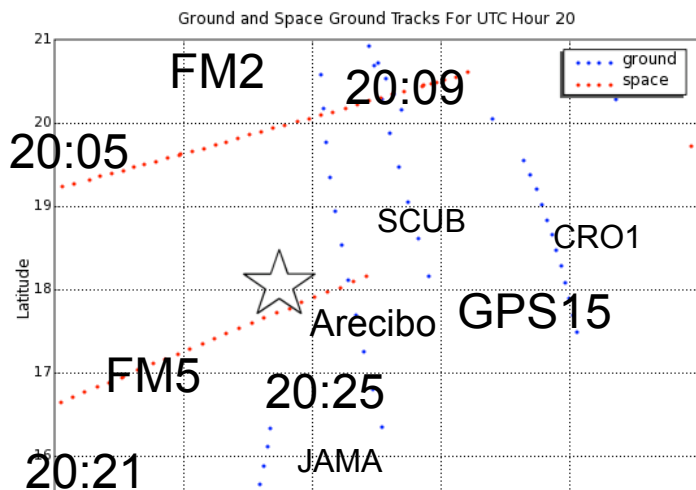
- Three runs:
  - GAIM Climate (no data)
  - Ground GPS TEC (200 sites)
  - Ground + COSMIC links (upward & occultation)
- **Medium and Low Resolution runs:**
  - 2.5 Vs. 5.0 Lat. In Deg.**
  - 10.0 Vs. 15.0 Lon. in Deg.**
  - 40 Vs. 80 Alt. in km**
  - 100,000 Vs. 18,000 voxels**
- Sparse Kalman filter:
  - Update & propagate covariance
  - Truncate off-diagonal covariance that is beyond physical correlation lengths



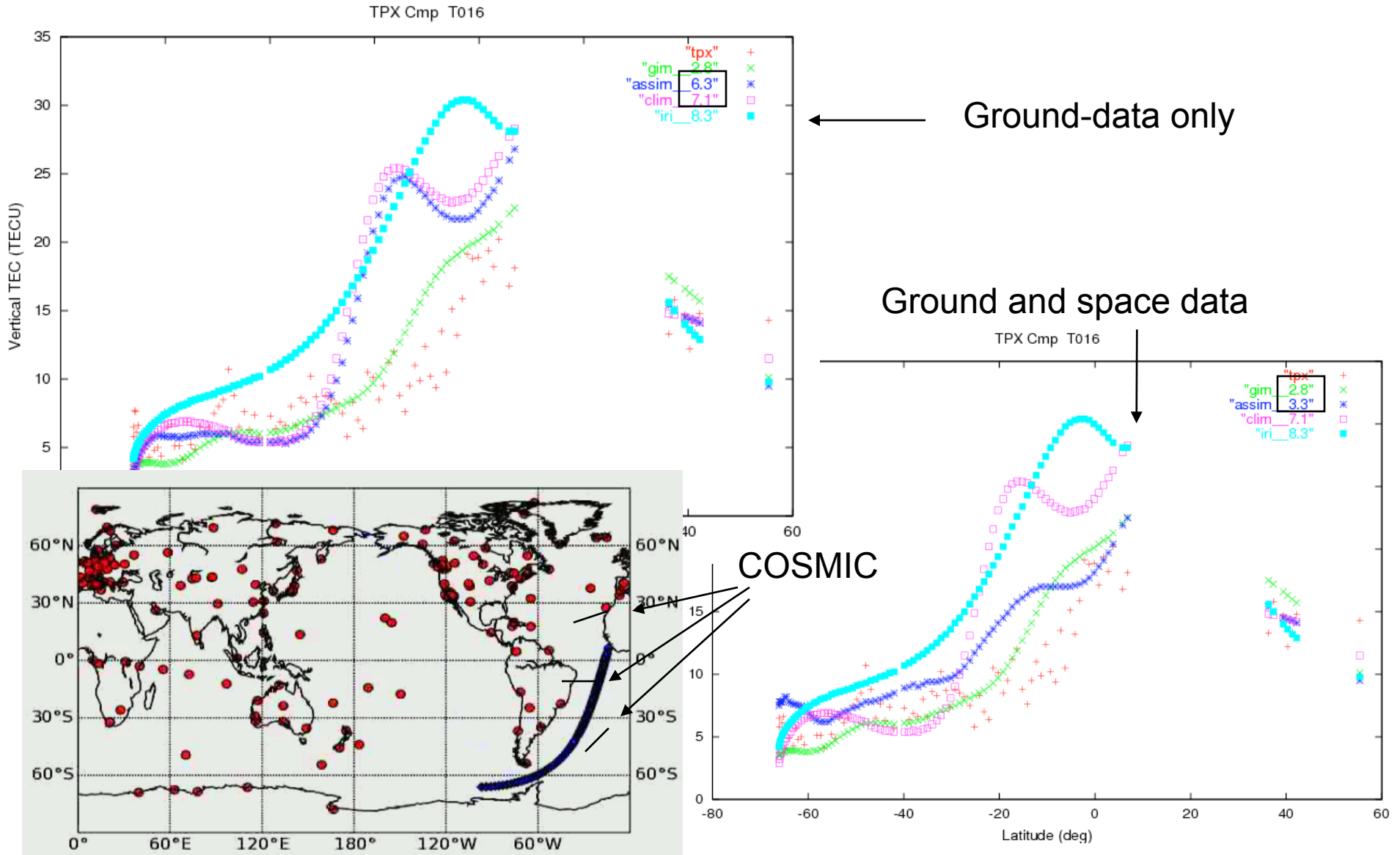




# Case 1: Arecibo ISR Study for June 26, 2006



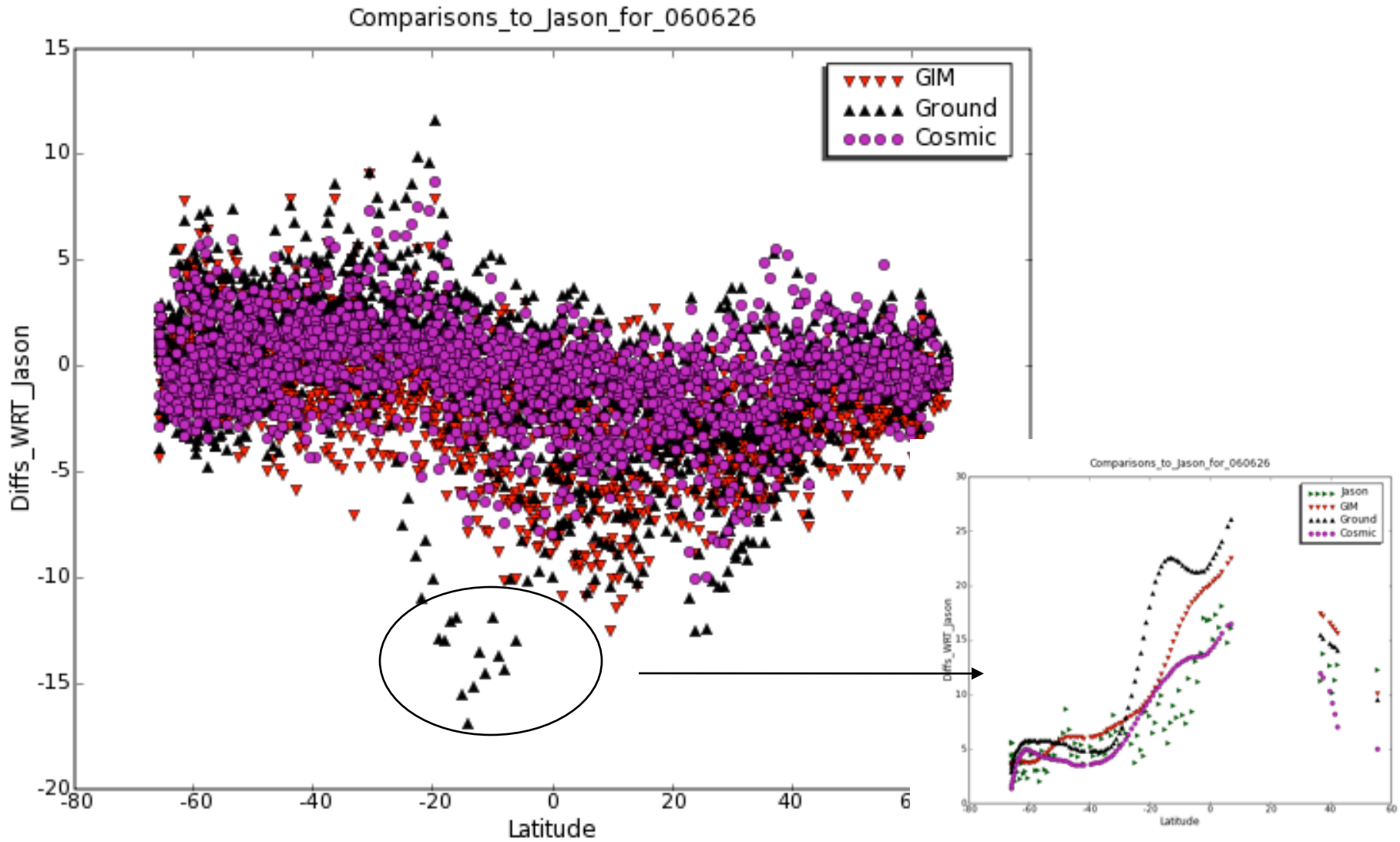
# GAIM Validation Using Jason-2 Vertical TEC for June 26



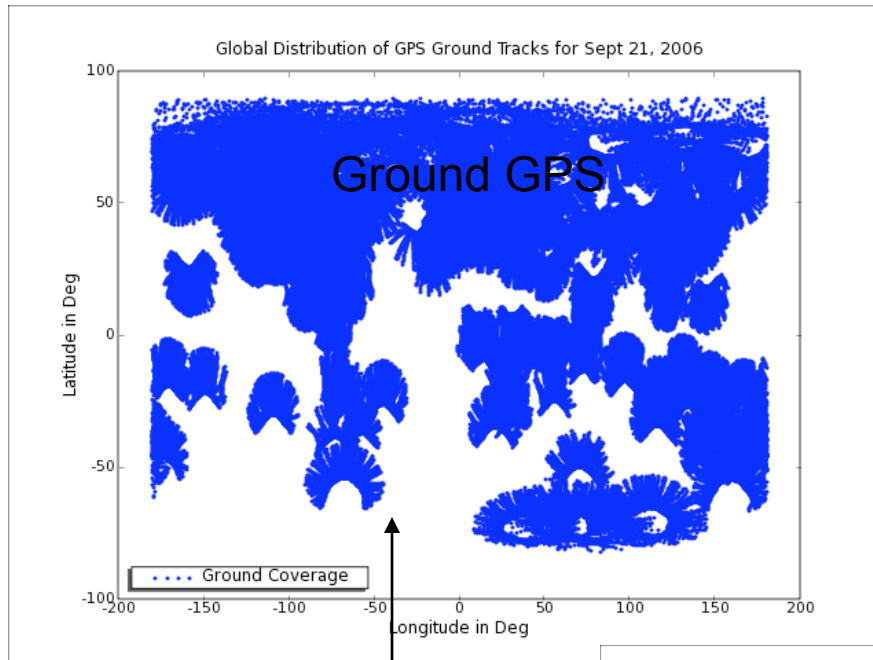
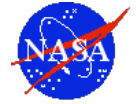
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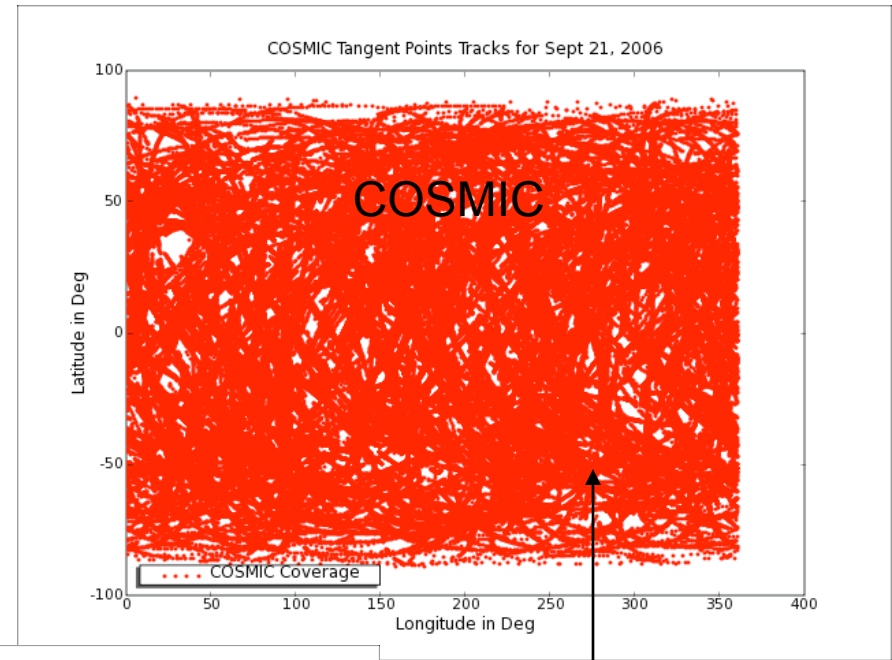
# Comparison of Jason VTEC with Ground-only and COSMIC Assimilation for June 26, 2006



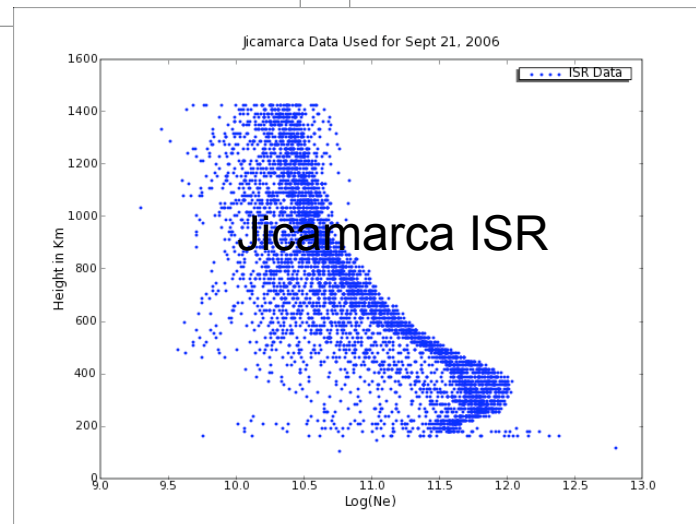
# Case 2: Ground, COSMIC and Jicamarca ISR Coverage for Sept 21, 2006



dense but  
unevenly distributed  
coverage

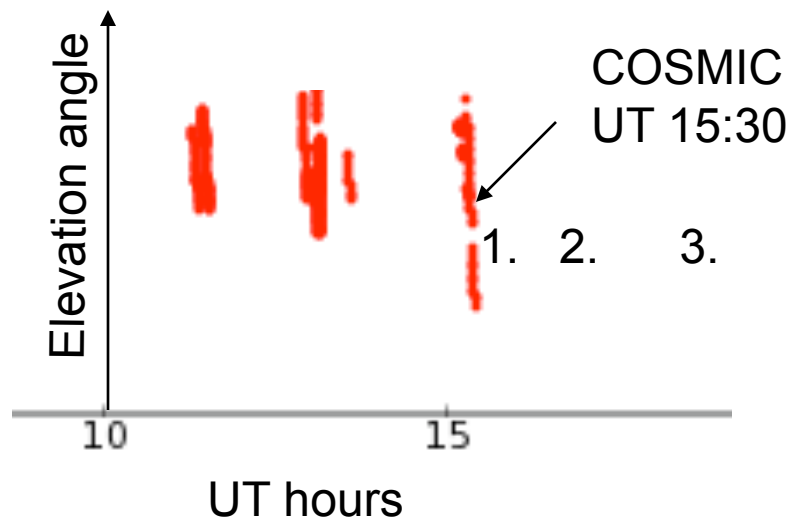
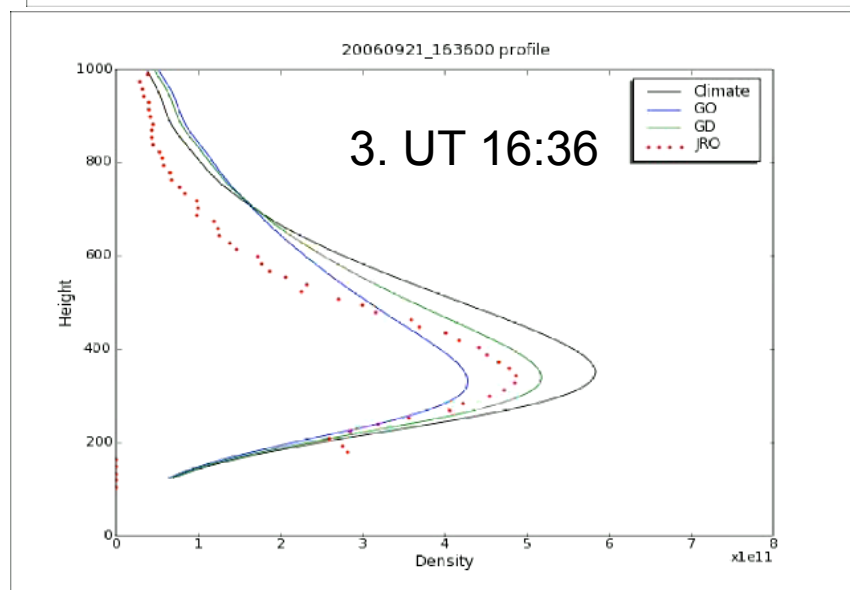
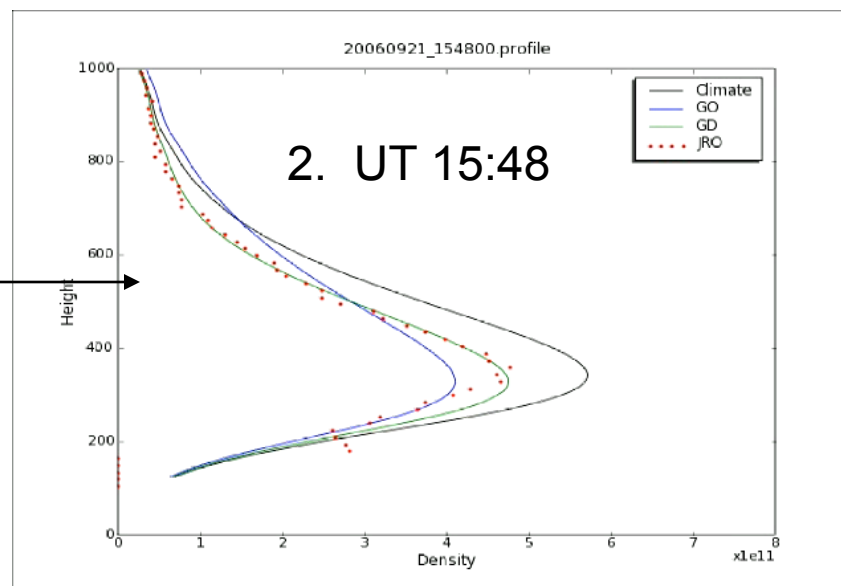
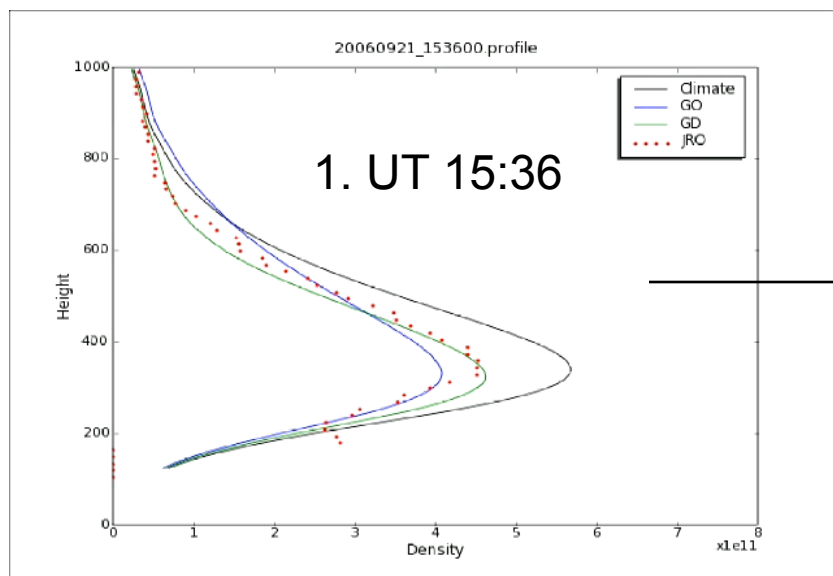


less dense yet  
evenly distributed  
coverage

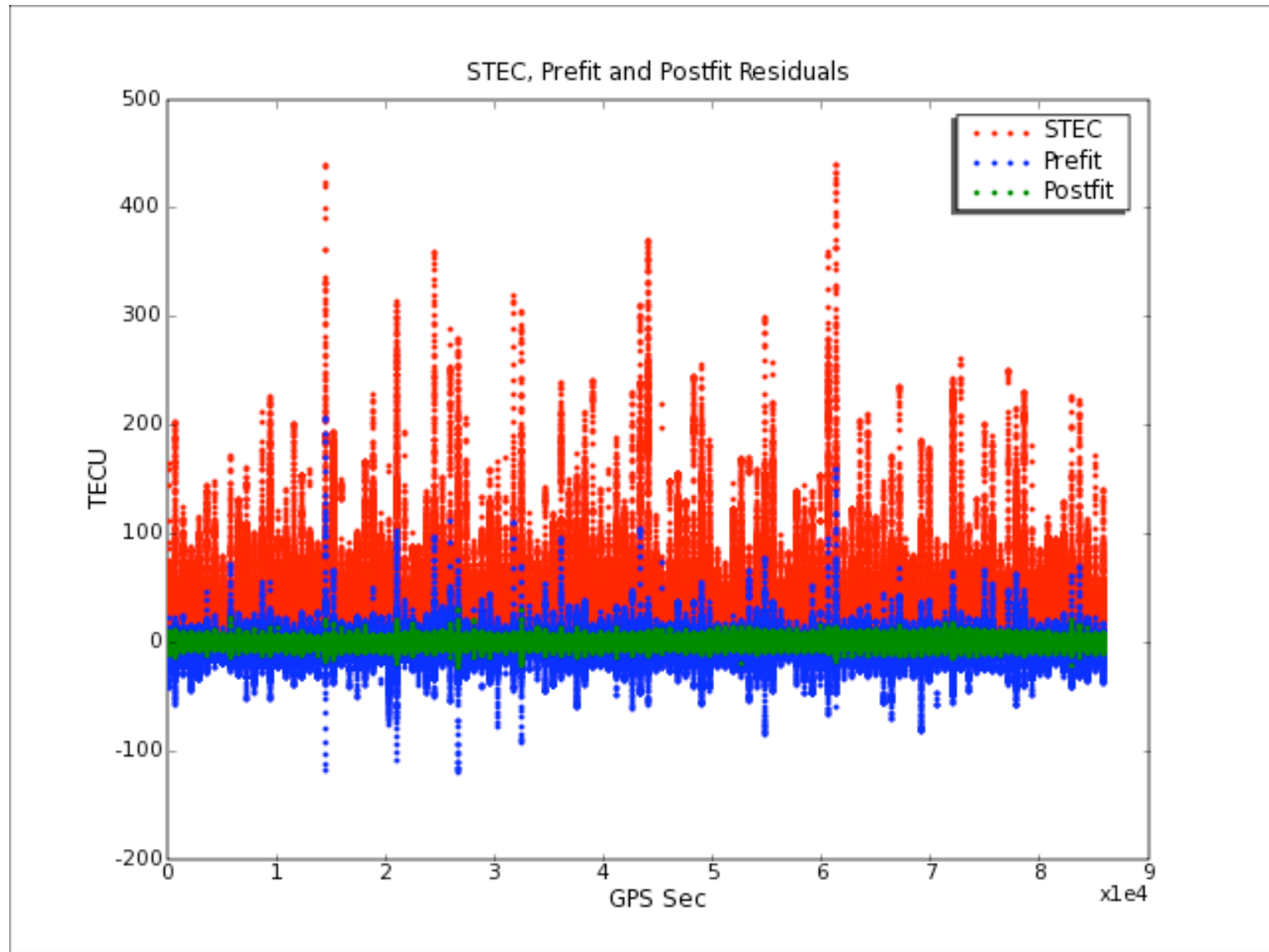
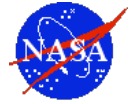




# An Example of COSMIC Impact on Profile Shape



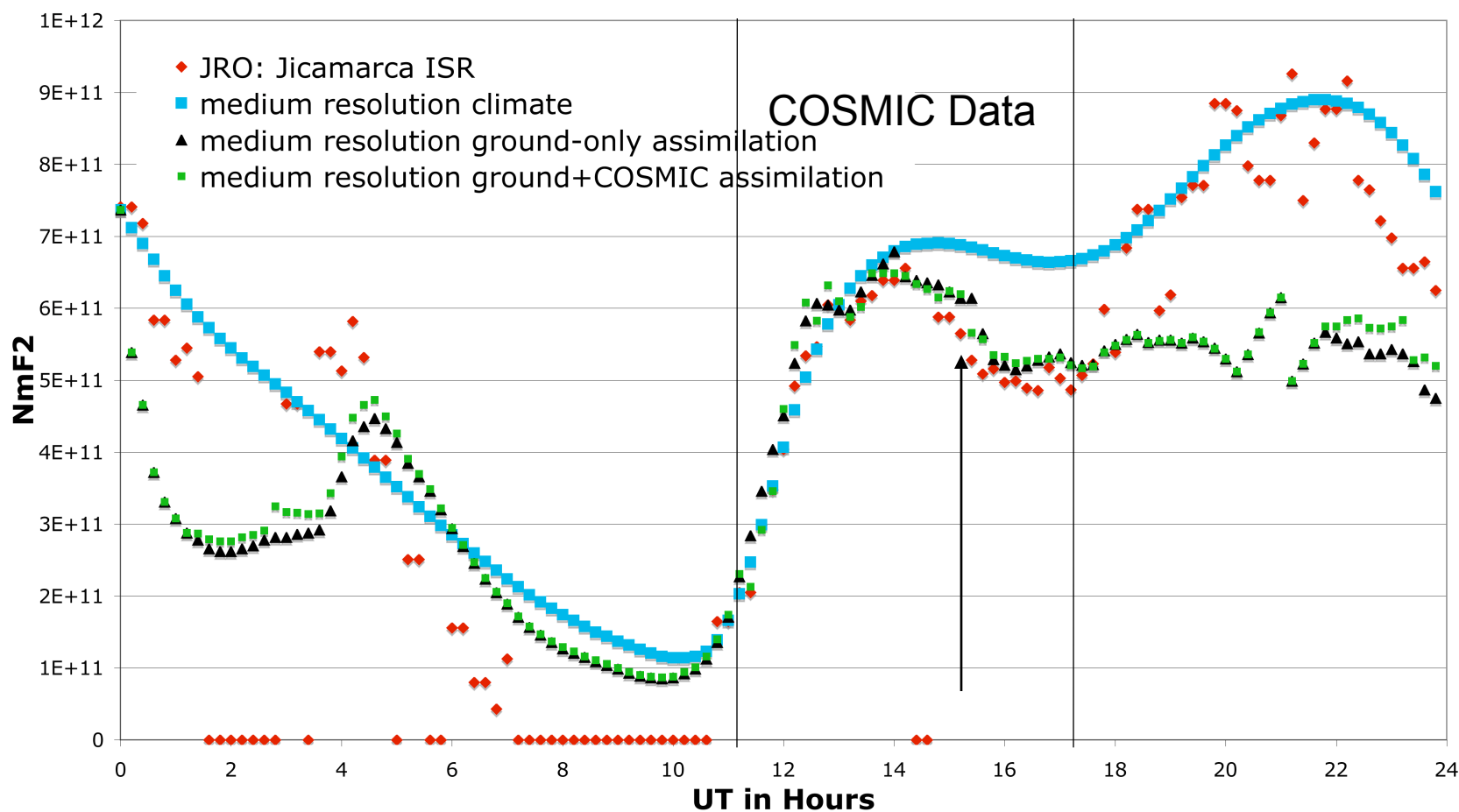
# Illustration for TEC data, GAIM Prefit and Postfit Residuals





# NmF2 Comparison with Jicamarca ISR

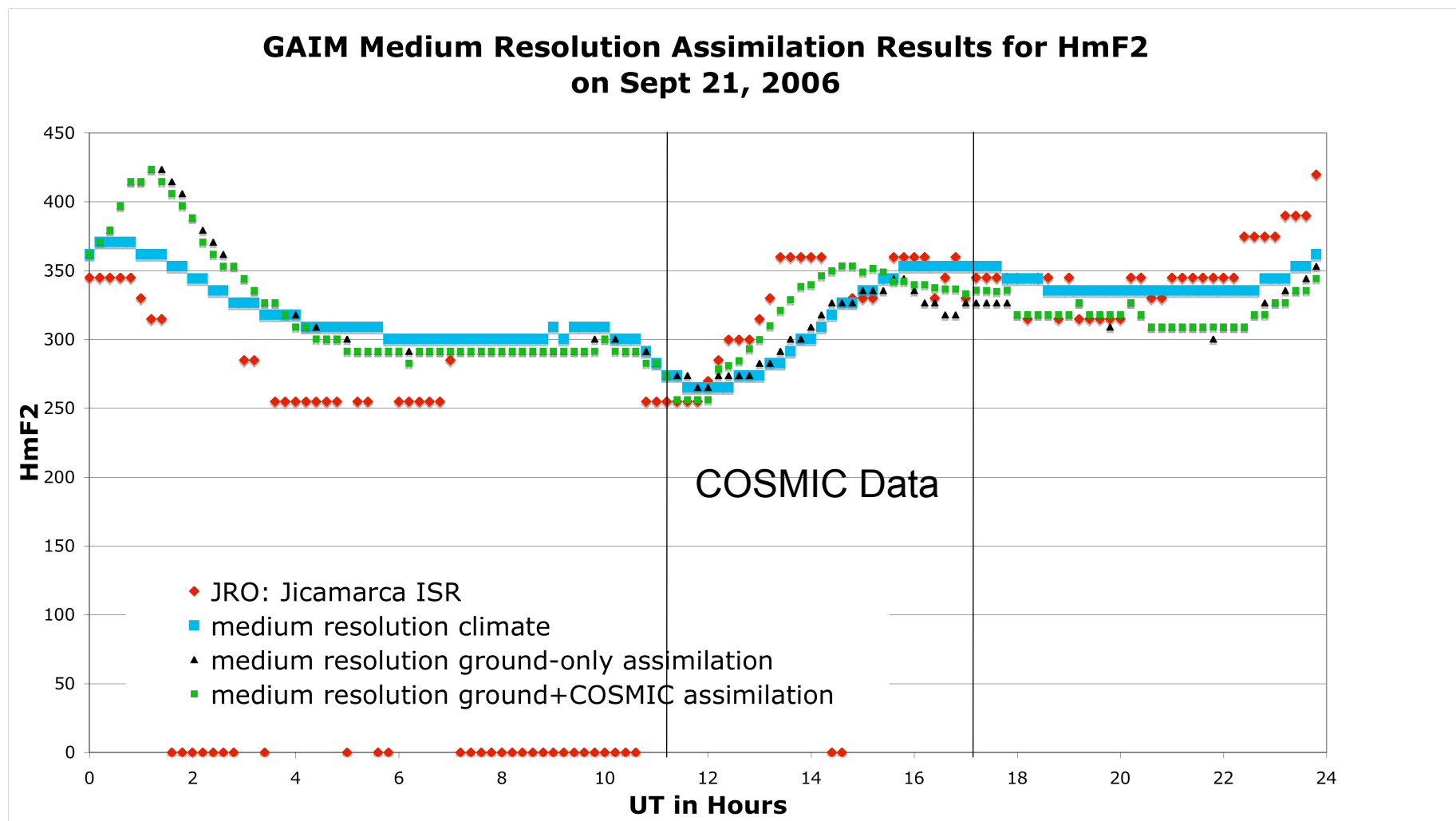
## GAIM Medium Resolution Assimilation Results for Sept 21, 2006



Medium resolution GAIM NmF2 with COSMIC data matches well during the dense data period 11-17 UT



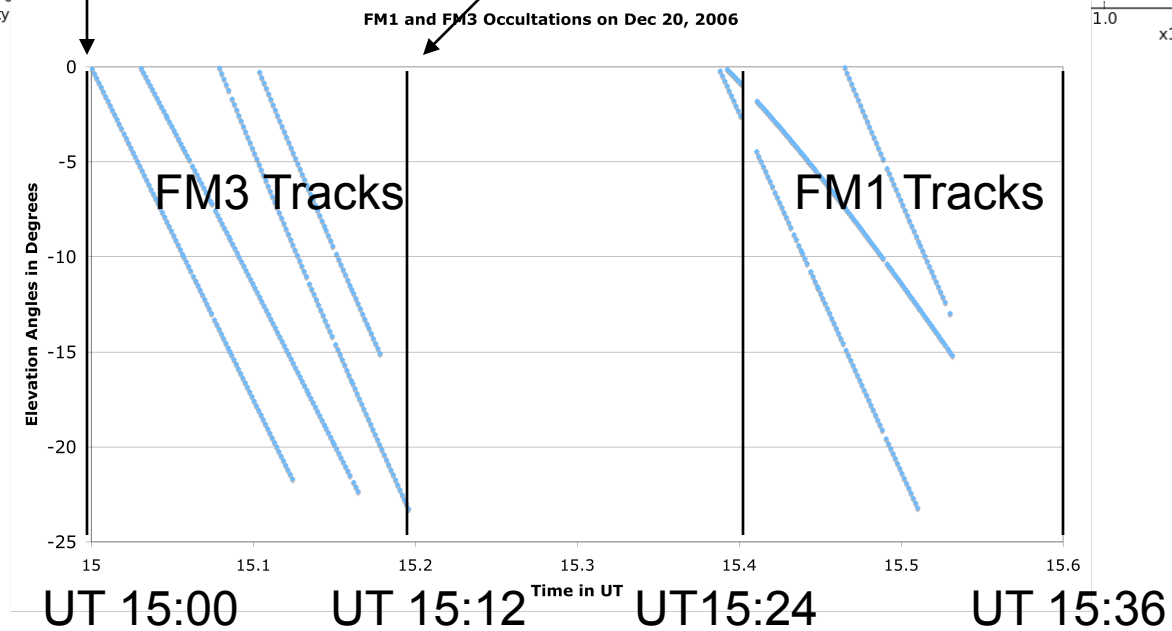
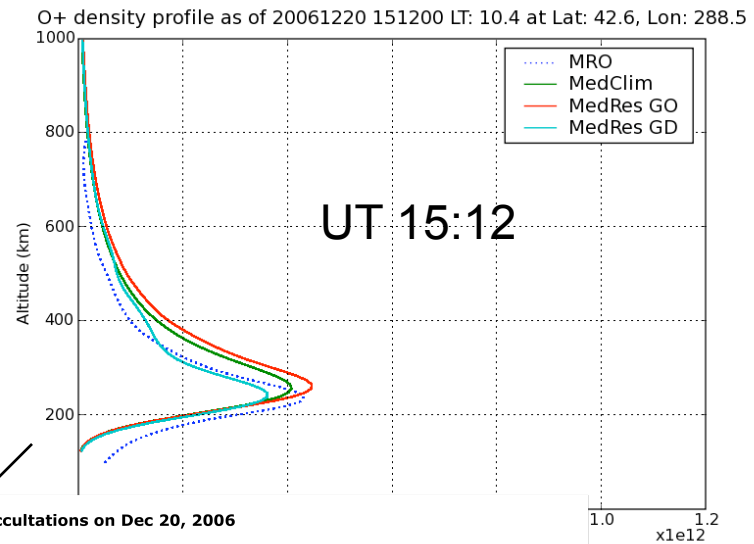
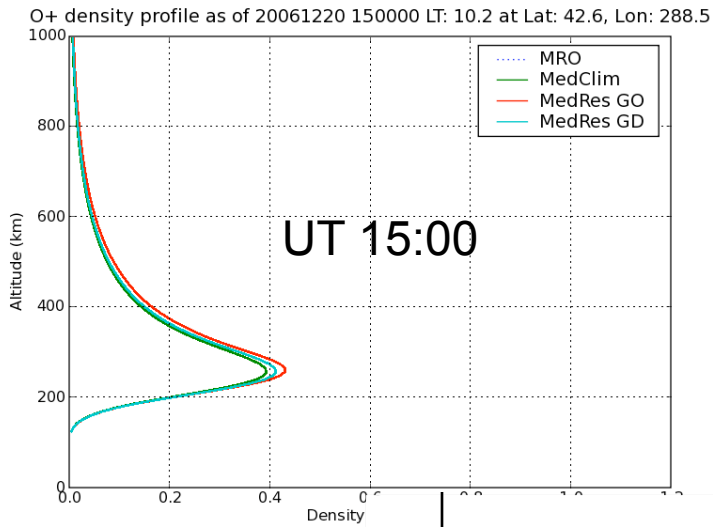
# HmF2 Comparison with Jicamarca ISR



Medium resolution GAIM HmF2 with COSMIC matches best with truth

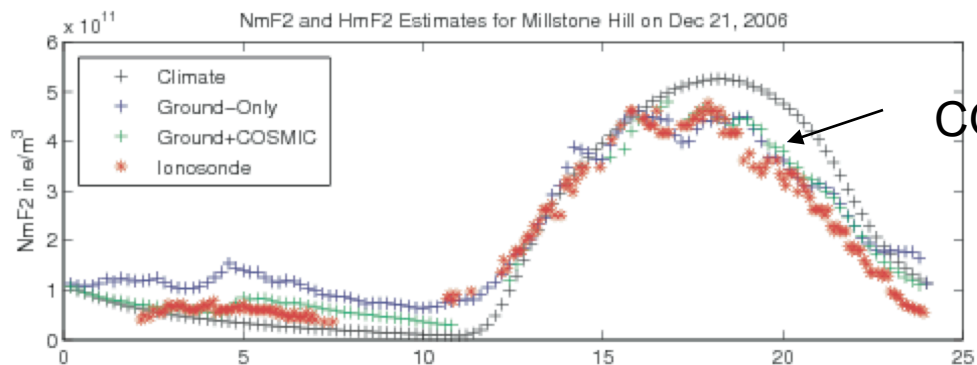


# Case 3: GAIM Millstone Hill Radar Validation for Dec 20, 2006



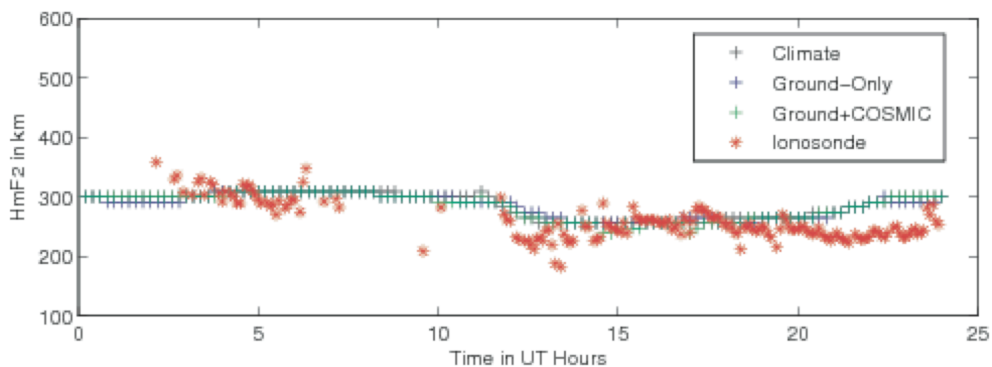


# Ionosonde Comparison for Dec 21, 2006

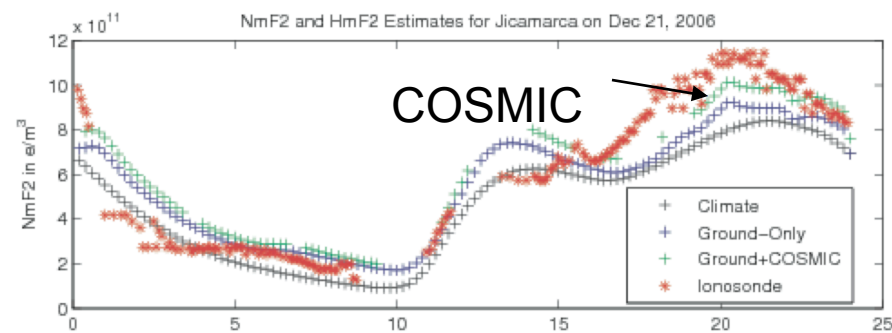


COSMIC

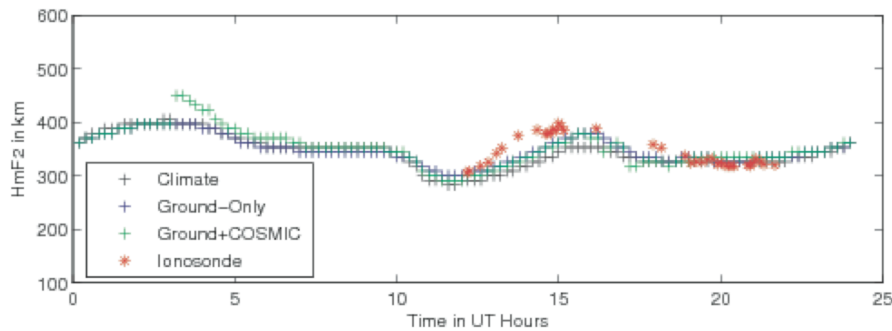
Millstone Hill Ionosonde



Jicamarca Ionosonde



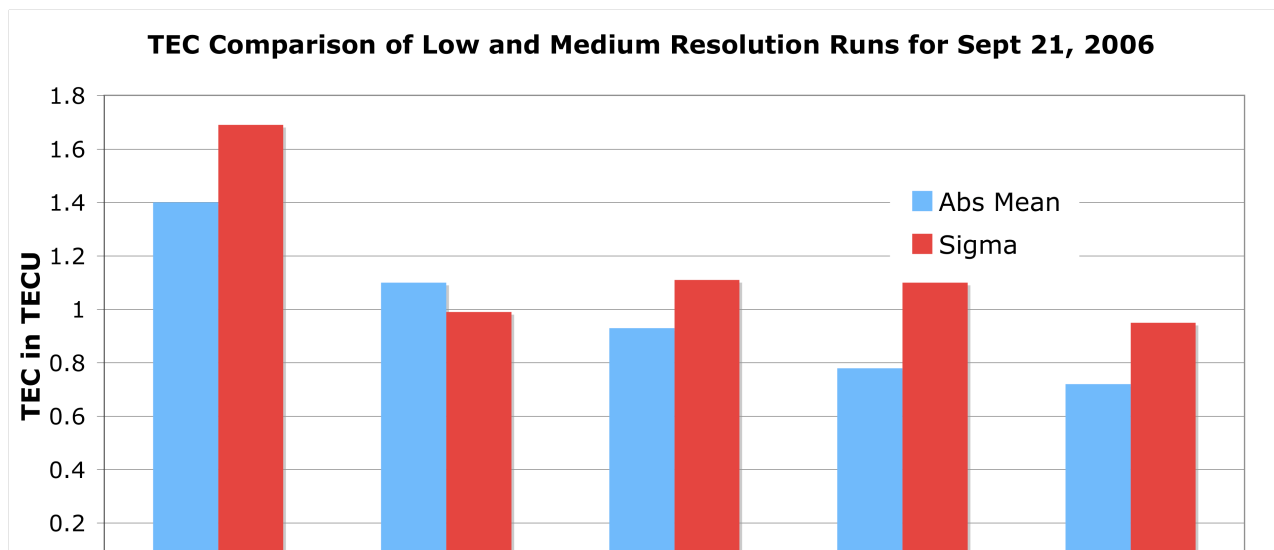
COSMIC



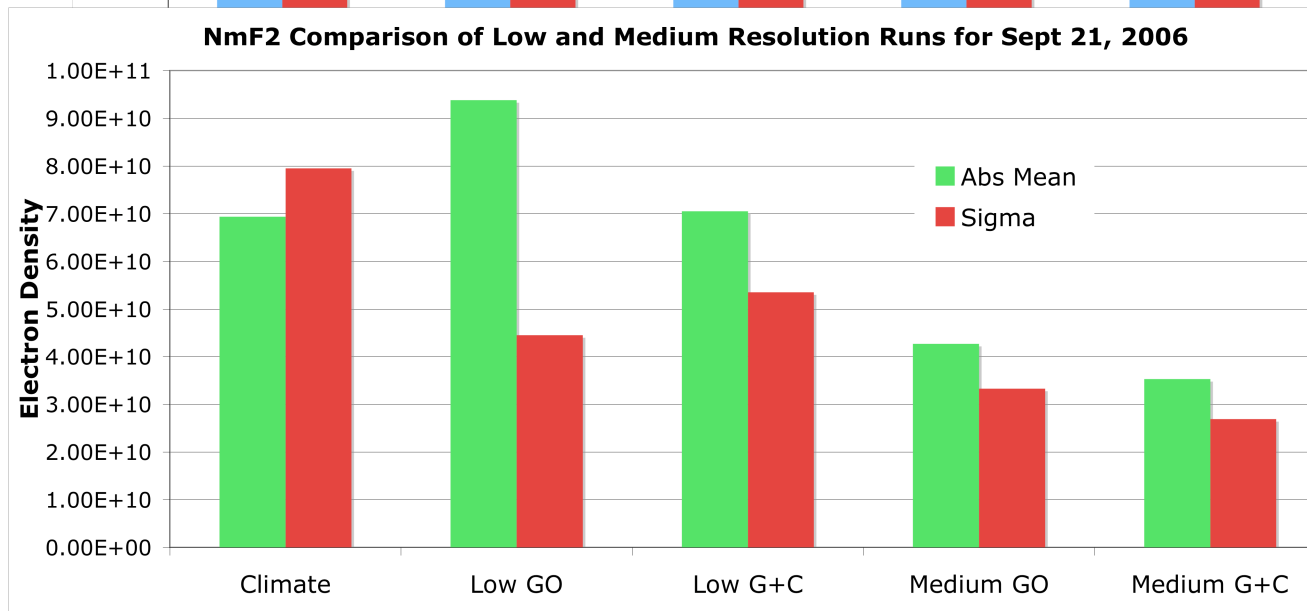


# Summary of Results Using ISR

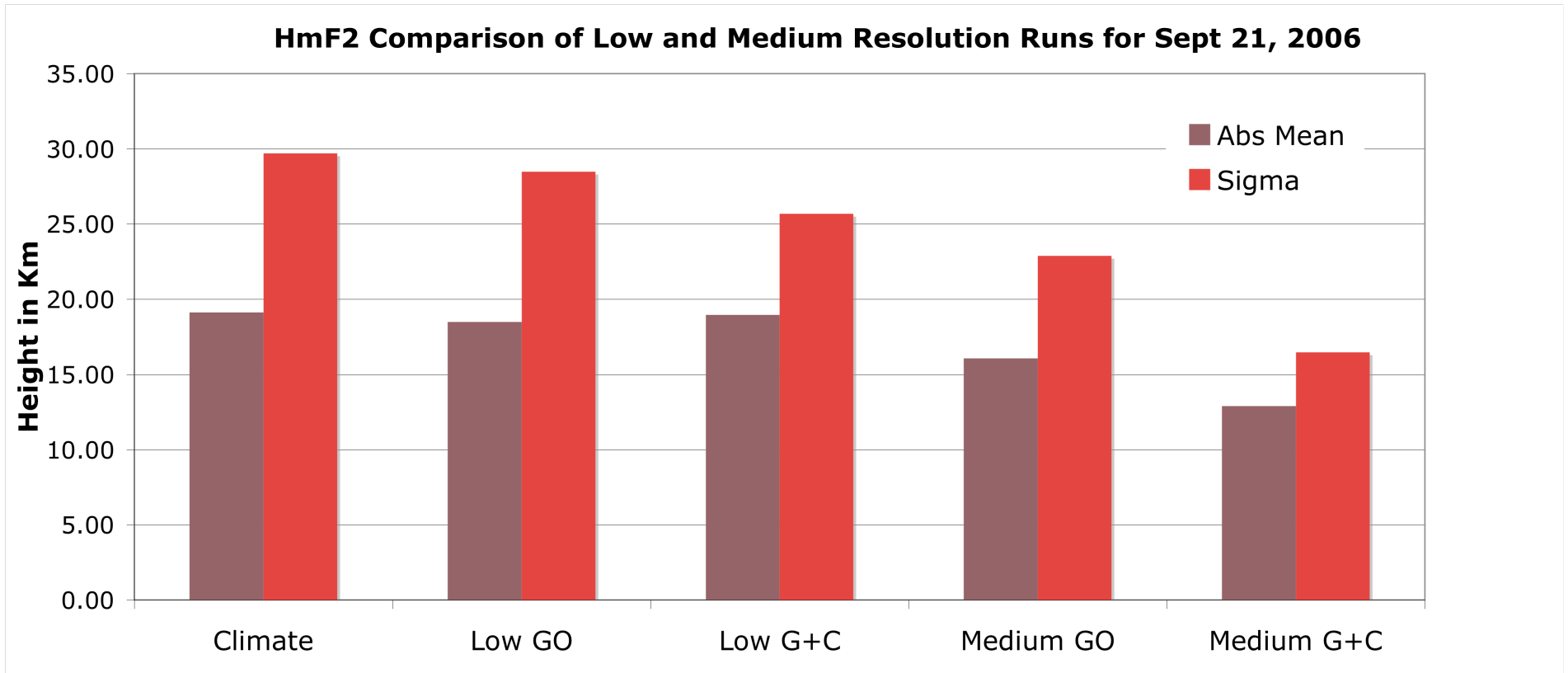
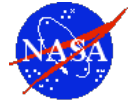
TEC



NmF2



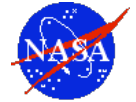
# Summary of Results Using ISR



GO = Ground-GPS only

GD = Ground + down-looking COSMIC

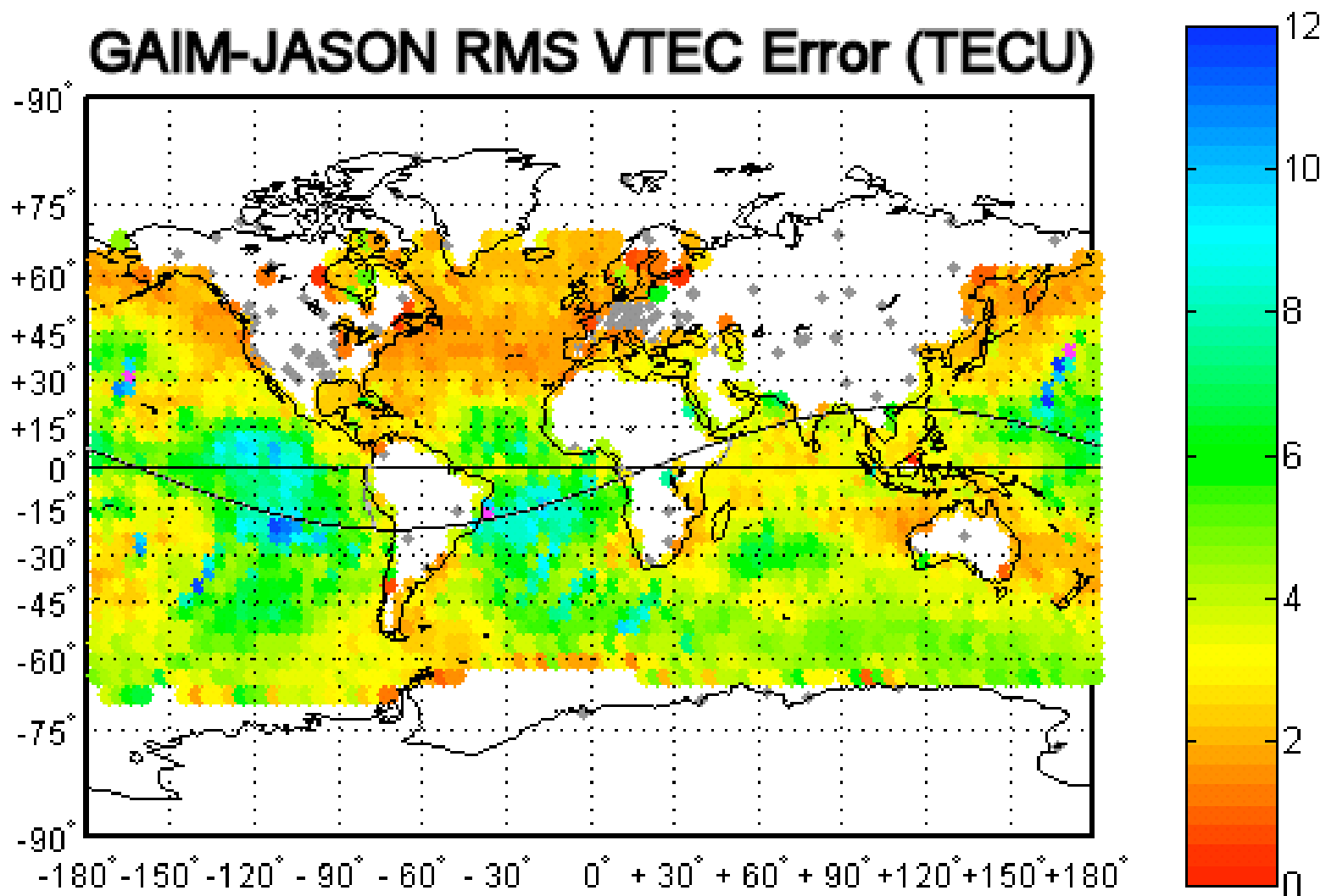
## Three-Day Comparison with Jason VTEC

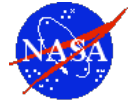


		Mean	Sigma	RMS	Min	Max
06/26/06	GIM	-1.61	2.88	3.31	-12.5	9.1
	Ground	-0.24	3.26	3.27	-17.26	11.7
	Ground+COSMIC	-0.29	2.26	<b>2.28</b>	-10	8.72
		Mean	Sigma	RMS	Min	Max
09/21/06	GIM	-2.01	3.48	4.02	-13	11.2
	Ground	-1.08	3.45	3.62	-13	11.2
	Ground+COSMIC	-0.31	2.66	<b>2.67</b>	-10.16	11.36
		Mean	Sigma	RMS	Min	Max
12/21/06	GIM	-1.95	2.58	3.24	10.7	8.2
	Ground	-1.3	4.32	4.51	-17.9	10.8
	Ground+COSMIC	0.49	2.45	<b>2.54</b>	-18.8	9.36

The use of COSMIC+ground-GPS data over ground-GPS only significantly improved TEC predictions for all 3 days processed: 30, 28 and 44% respectively.

# GAIM Driven By Ground GPS Only versus JASON VTEC





# Summary and Conclusions

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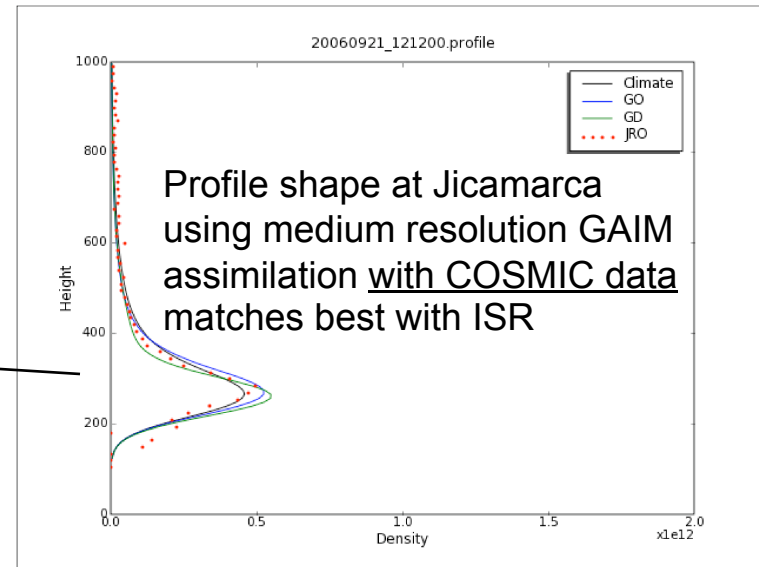
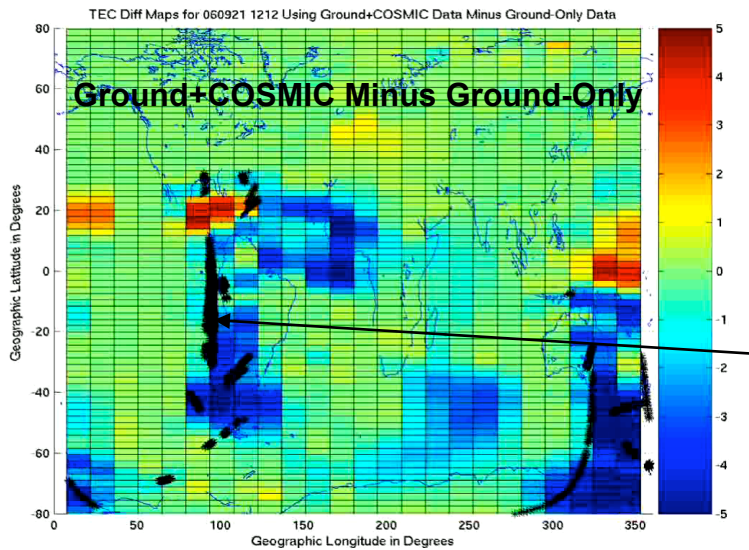
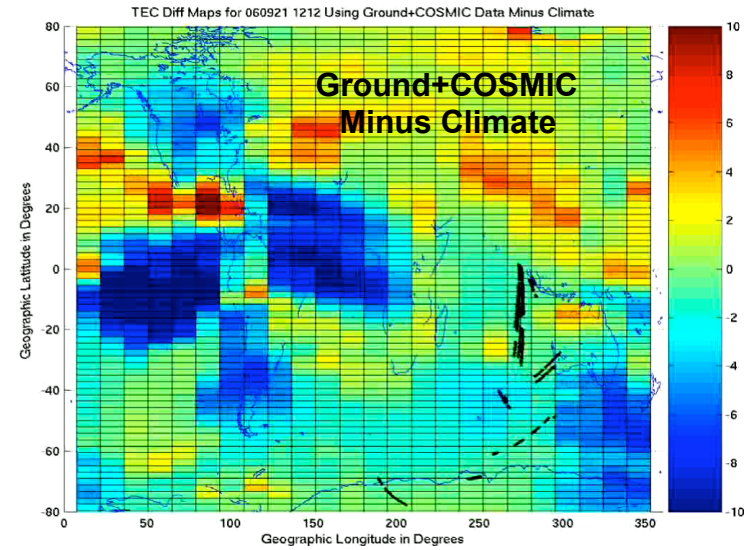
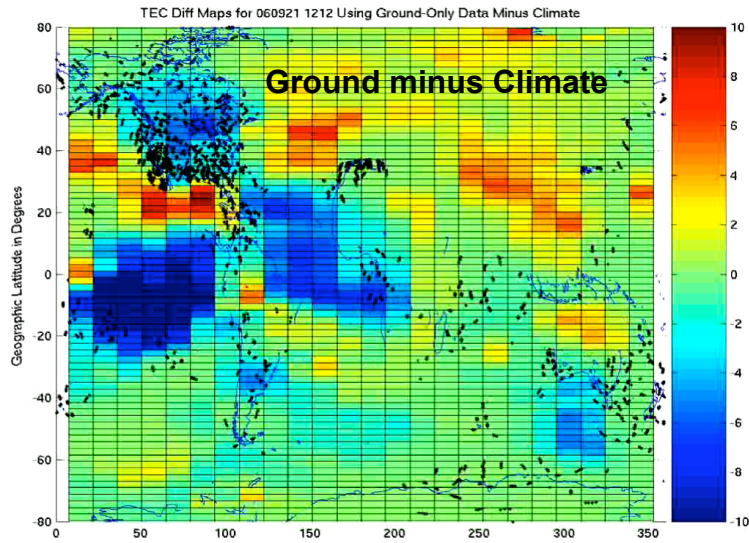
- JPL now routinely generates calibrated TEC and electron density profiles using COSMIC data.
- Performed GAIM assimilation using data from 200 ground-based GPS and six COSMIC satellites for World Days June 26, Sept 21 and Dec 20, 2006.
  - Ground-only, ground+COSMIC and climate GAIM runs performed.
  - GAIM profiles are validated using GIM, Arecibo, Jicamarca, Millstone Hill ISR, ionosonde, Jason VTEC.
- ISR validation results show that assimilating COSMIC data improves **NmF2** and **Hmf2**: i.e., resulting in **improved profiles shapes**. Assimilating COSMIC does seem to show marginal improvement in TEC accuracy at the ISR sides.
- Jason validation indicates significant improvement in **VTEC** space **globally** when assimilating COSMIC data



# Backup Slides

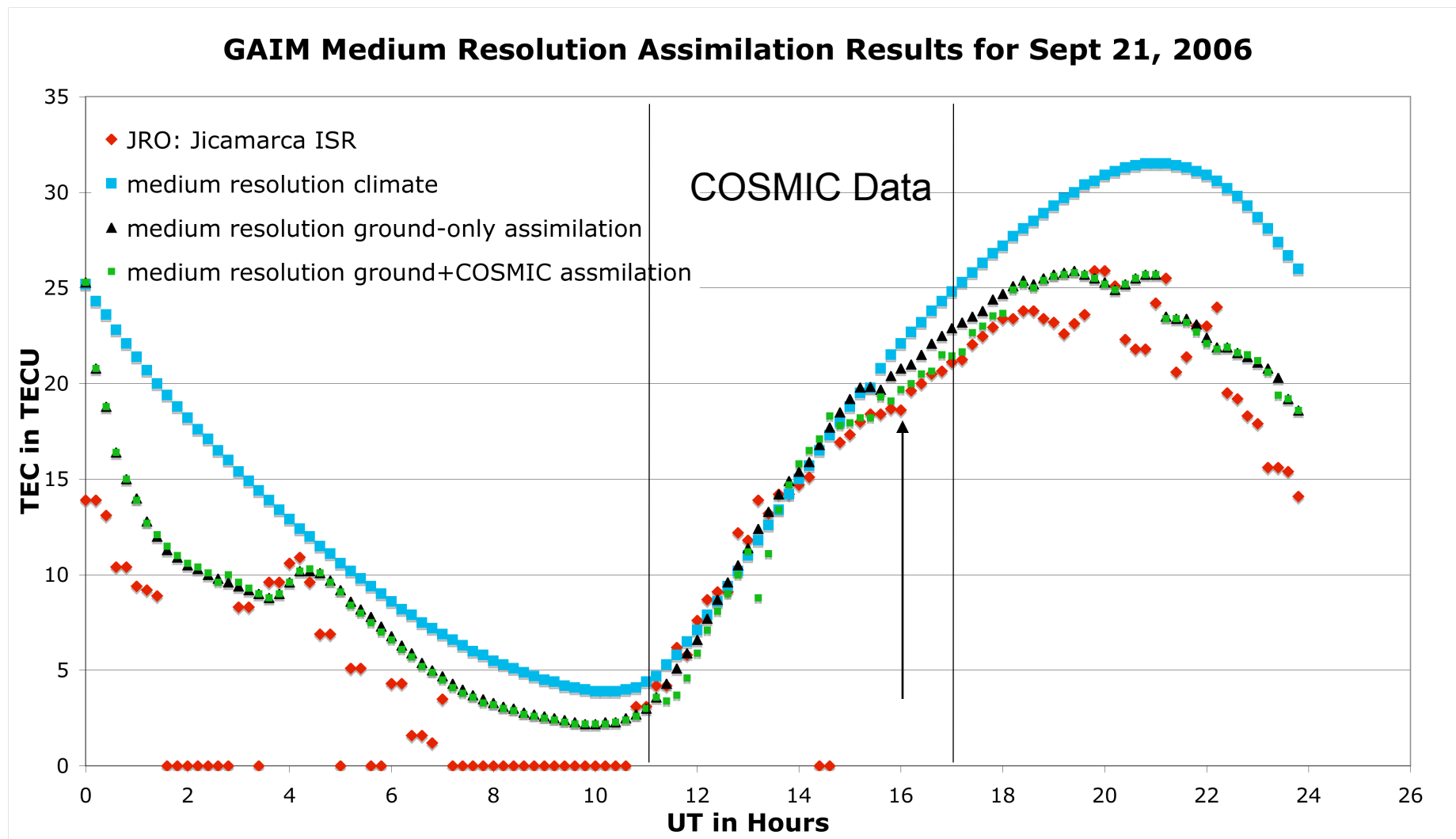


# Medium Resolution GAIM VTEC Difference Maps for Case 2

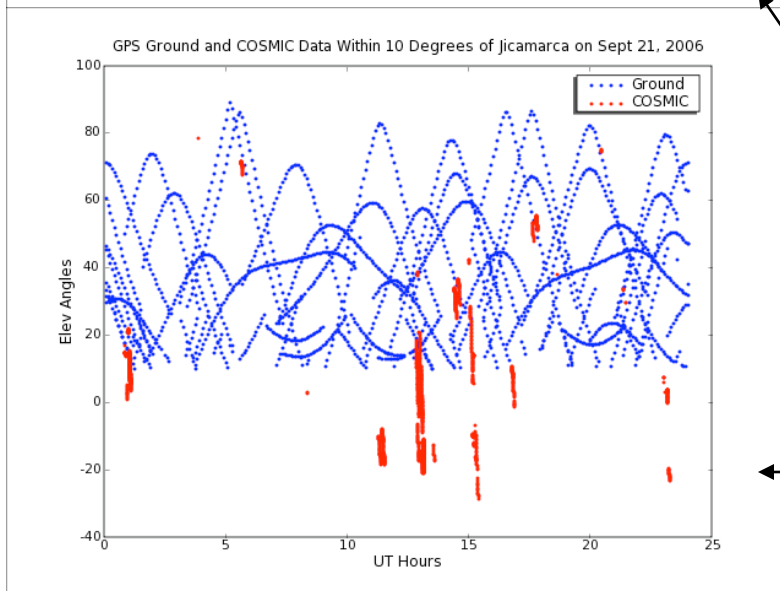
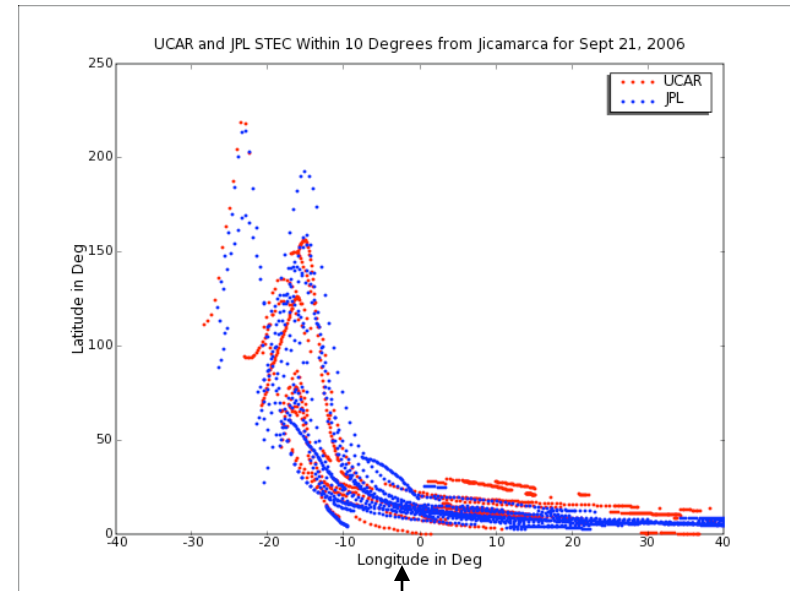
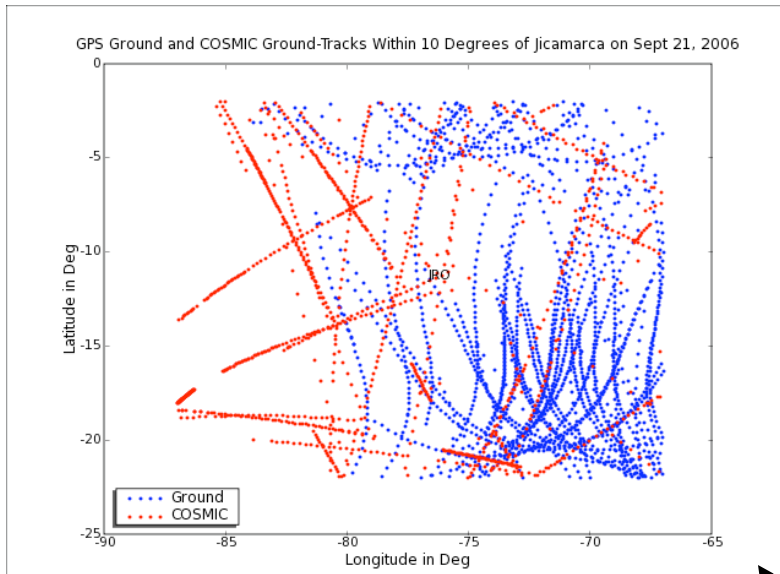




# TEC Comparison with Jicamarca ISR



# UCAR and JPL Raw GPS Data Processing Results for Sept 21, 2006



Comparison of UCAR and JPL calibrated TEC near Jicamarca

Ground and COSMIC ground tracks near Jicamarca

Ground and COSMIC data availability near Jicamarca