

USU Data Assimilation Models

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**Presented at:
CCMC Workshop
November 4 - 8, 2007**

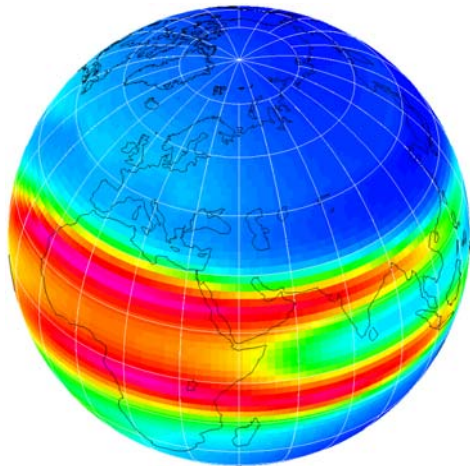
USU Physics-Based Data Assimilation Models

- 1. Kalman Filter Models of the Ionosphere**
 - o Gauss-Markov Model**
 - o Full Physics Model**
- 2. Ensemble Kalman Filter Model of High-Latitude Electrodynamics**
- 3. Ensemble Kalman Filter Model of the Thermosphere**

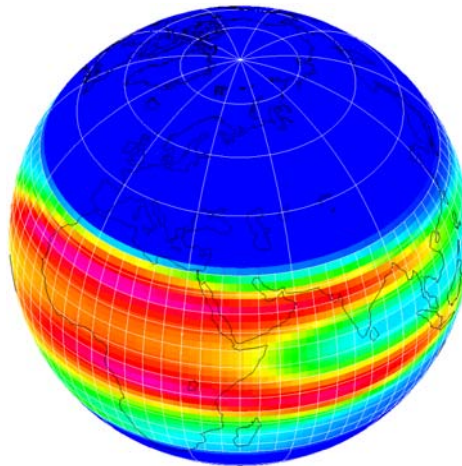
GAIM Basic Approach

We use a physics-based ionosphere or ionosphere-plasmasphere model as a basis for assimilating a diverse set of real-time (or near real-time) measurements. GAIM provides both specifications and forecasts on a global, regional, or local grid.

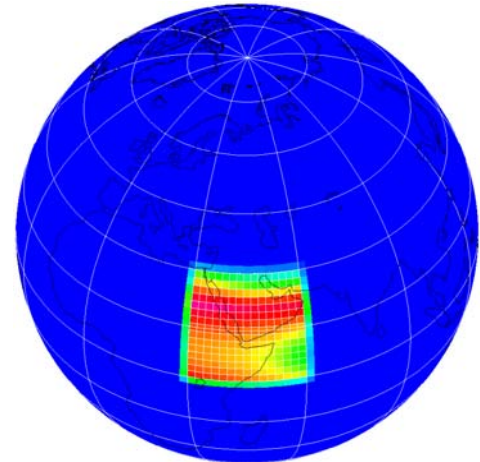
Global



Regional



Local



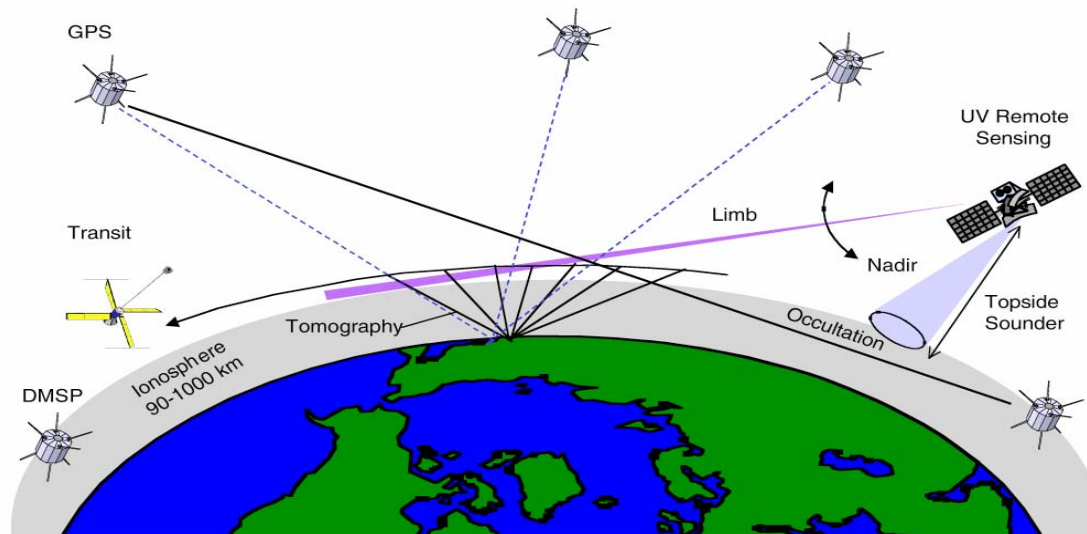
"Bringing the pieces together"

Global Assimilation of Ionospheric Measurements

Utah State University, (435) 797-2962, schunk@cc.usu.edu;

Universities of Colorado (Boulder), Texas (Dallas), and Washington

GAIM Assimilates Multiple Data Sources



- **Data Assimilated Exactly as They Are Measured**
 - Bottomside N_e Profiles from Digisondes (30)
 - Slant TEC from more than 1000 Ground GPS Receivers
 - N_e Along Satellite Tracks (4 DMSP satellites)
 - Integrated UV Emissions (LORAAS, SSULI, SSUSI, **GUVI**)
 - Occultation Data (CHAMP, IOX, SAC-C, COSMIC)



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Gauss-Markov Kalman Filter Model

Runs at the CCMC

Runs on 2 CPUs



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Gauss-Markov Kalman Filter Model

- **Ionosphere Forecast Model (IFM)**
- **Global physics-based model**
- **Provides background ionosphere**
- **90 - 1400 km**
- **15 - minute output cadence**
- **O^+ , H^+ , NO^+ , N_2^+ , O_2^+ , T_e , T_i**
 - **Only use N_e**
- **Kalman solves for deviations from background**



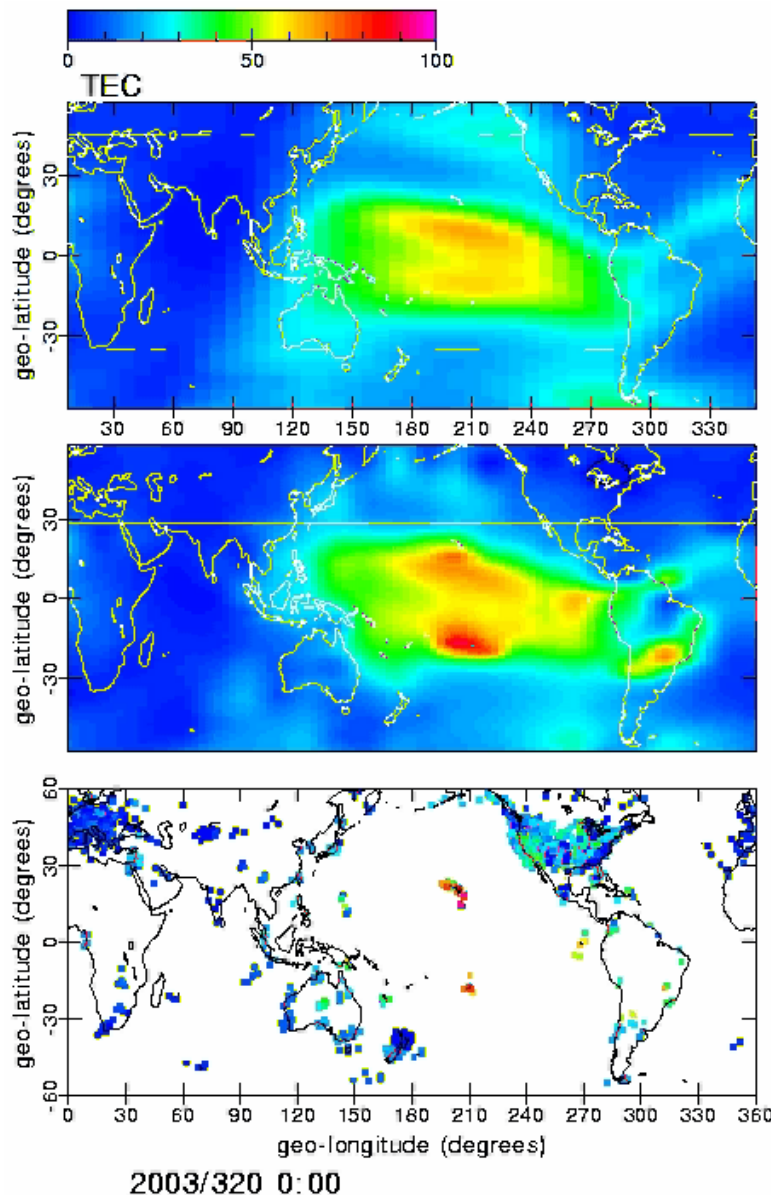
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Gauss-Markov Kalman Filter Reconstruction



**Physics-Based Model
Without Data**

Kalman Filter

**More than 3000 Slant
TEC Measurements
are assimilated every
15 minutes.**

What is it like to work with the CCMC?

- **Easy**
- **Efficient**
- **Rewarding**



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What is next for the CCMC?

- **Run GAIM in Real Time**
- **Add COSMIC and UV Data**
- **Install Full Physics GAIM**



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Full Physics Data Assimilation Model

Ensemble Kalman Filter

Runs on 30 CPUs



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Global Ionosphere-Plasmasphere Model (IPM)

- **3-D Time-Dependent Parameters**
 - $\text{NO}^+, \text{O}_2^+, \text{N}_2^+, \text{O}^+, \text{H}^+, \text{He}^+$
 - T_e, T_i
 - u_{\parallel}, u_{\perp}
- **Auxiliary Parameters**
 - $N_m F_2$
 - $h_m F_2$
 - $N_m E$
 - $h_m E$
 - TEC
- **Grid System**
 - Global
 - Regional
 - Localized
 - 90-30,000 km
 - Realistic Magnetic Field (IGRF)
- **Spatial Resolution Along B**
 - 0.9 km in E-Region
 - 1.3 km in F-Region
 - 3.8 km in Topside
 - 240 km at 17,000 km



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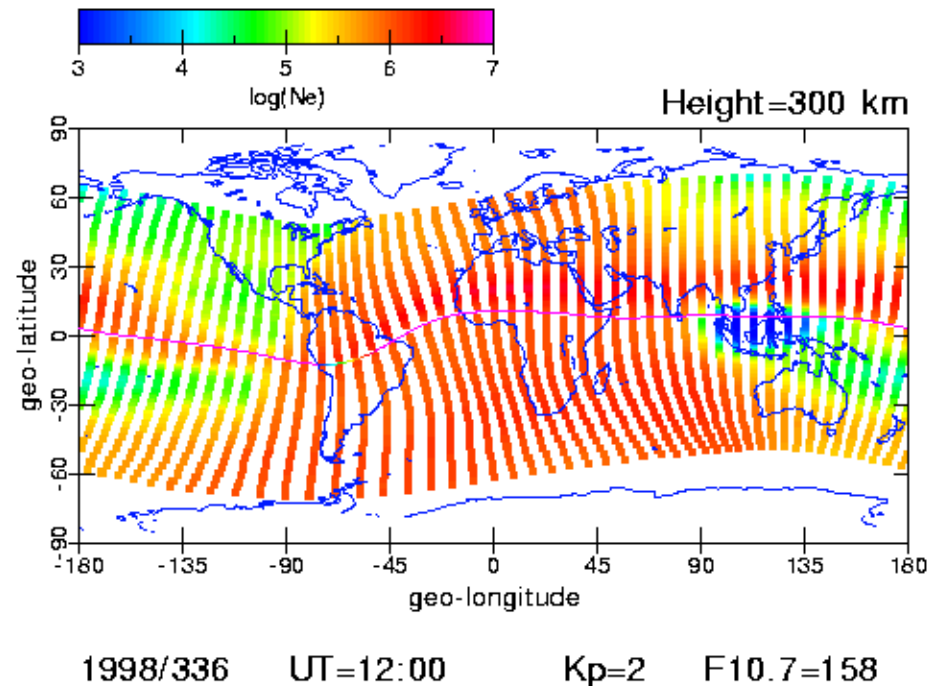
Longitudinal Resolution

Resolution is Externally Adjustable

- **Operational Mode:**

- ➔ **Global: ~ 7.5°**
- ➔ **Regional: ~ 1°**

**30 Global Simulations
are Launched at Each
Assimilation Time Step**



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Full Physics GAIM Output

- **Continuous Reconstruction of Global N_e Distribution**
 - **Ionosphere-Plasmasphere**
 - **90-30,000 km**
- **Quantitative Estimates of the Accuracy of Reconstruction**
- **Auxiliary Parameters**
 - $N_m F_2$, $h_m F_2$, $N_m E$, $h_m E$
 - **Slant and vertical TEC**
- **Model Drivers**
 - **Electric Fields**
 - **Neutral Winds**
 - **Neutral Composition**



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Full Physics-Based GAIM Model

- **Ionospheric Drivers are determined via an Ensemble Kalman Filter**
- **Regional Run Over United States**
- **3-D Electron Density**
- **Meridional Neutral Wind**



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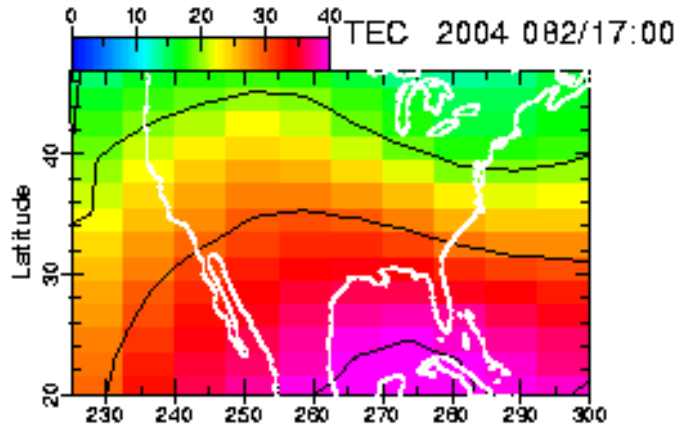
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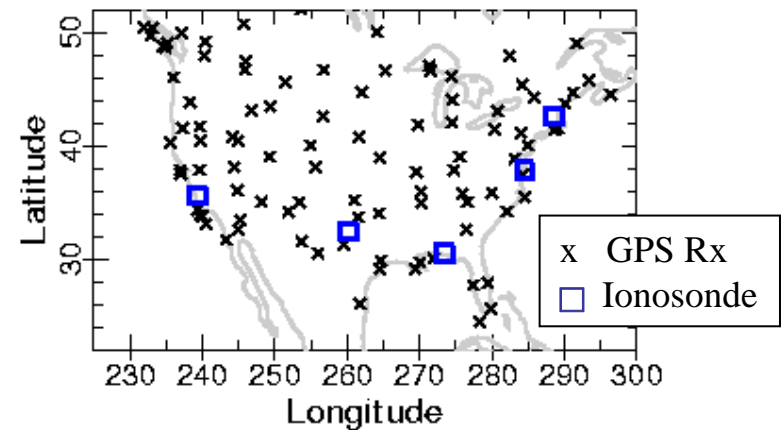
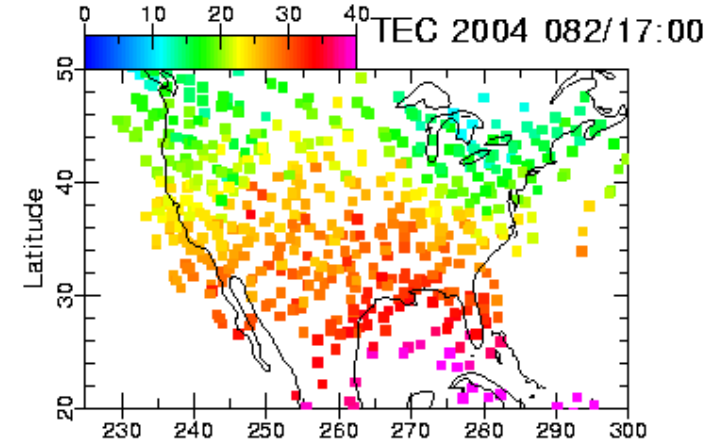
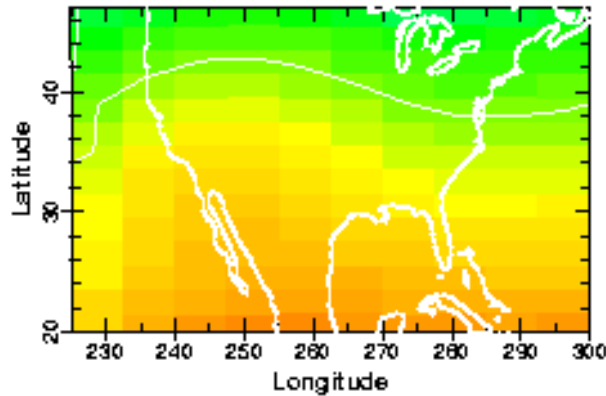
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Example of Full Physics-Based GAIM Model Reconstructions

GAIM



IPM



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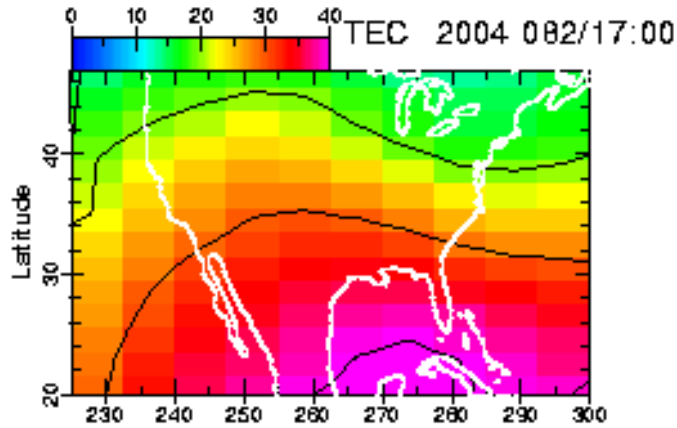
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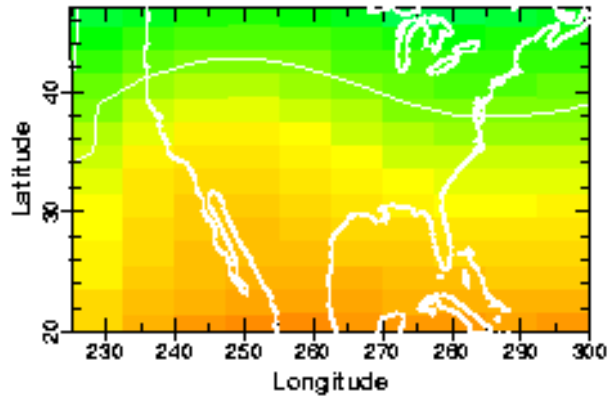
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Example of Full Physics-Based GAIM Model Reconstructions

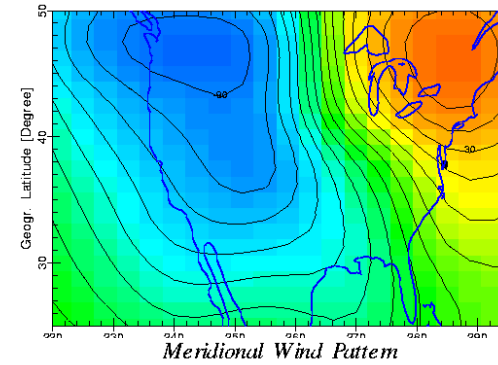
GAIM



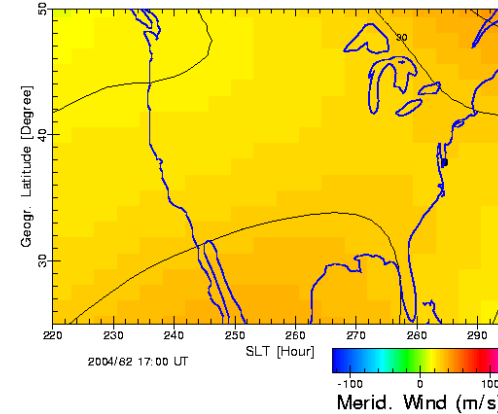
IPM



Meridional Wind



GAIM



HWM



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Full Physics-Based GAIM Model

- **Ionospheric Drivers are determined via an Ensemble Kalman Filter**
- **Global Run at Mid and Low Latitudes**
- **3-D Electron Density**
- **Neutral Wind and Electric Field**



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Full Physics-Based GAIM Model

- **Several Days in March/April of 2004**
- **Geomagnetically Quiet Period**
- **Data Assimilated**
 - **Slant TEC from 162 GPS Ground Receivers**
- **Use Ionosonde Data for Validation**



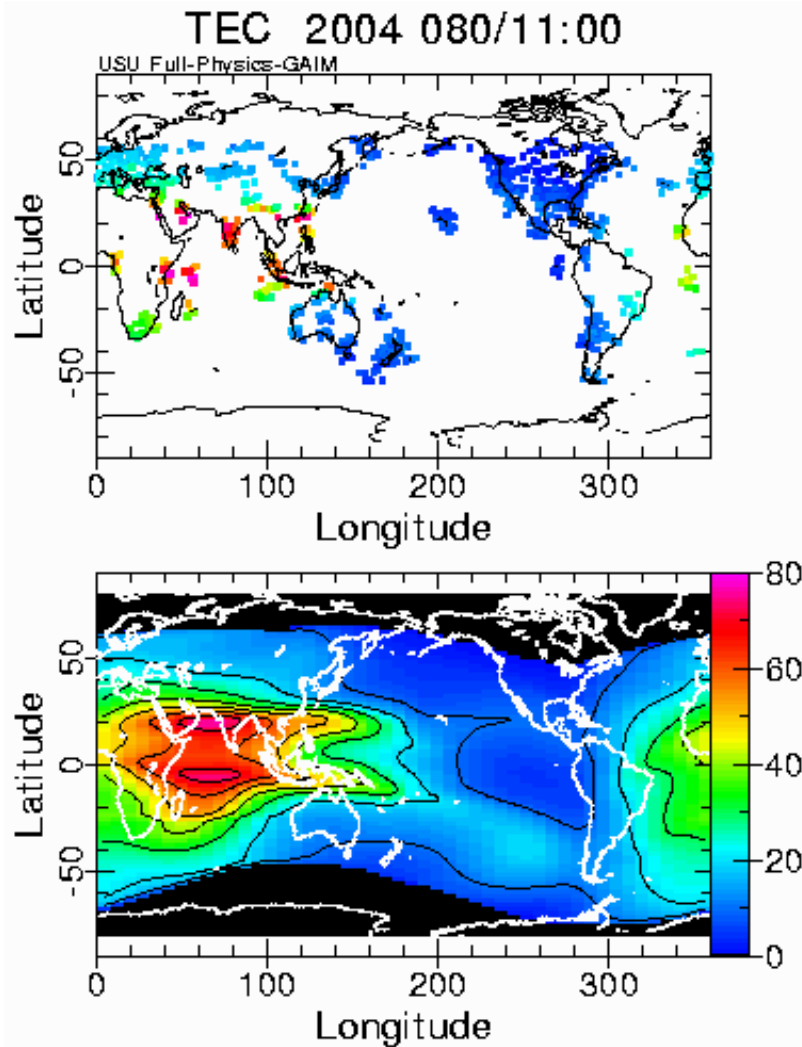
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Full-Physics-Based Kalman Filter Example



GPS/TEC Data: Slant TEC Values have been mapped to the Vertical Direction

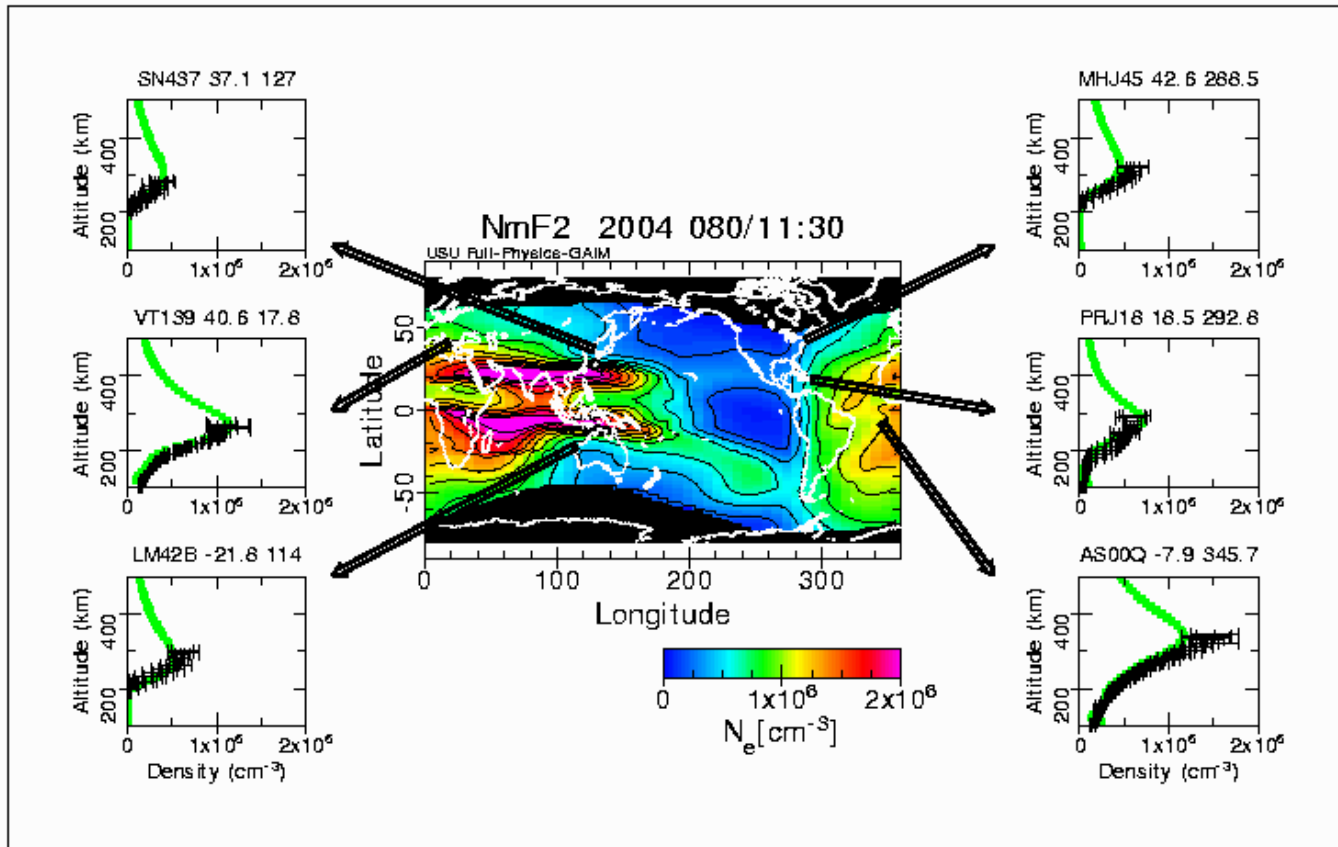
GAIM Specification of Global TEC Distribution

Comparison with Ionosonde Data

K

I

A



MH

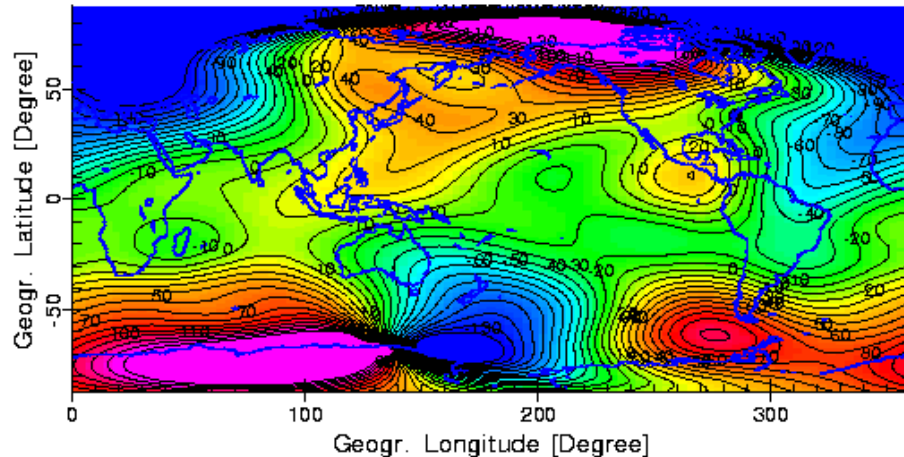
PR

AI

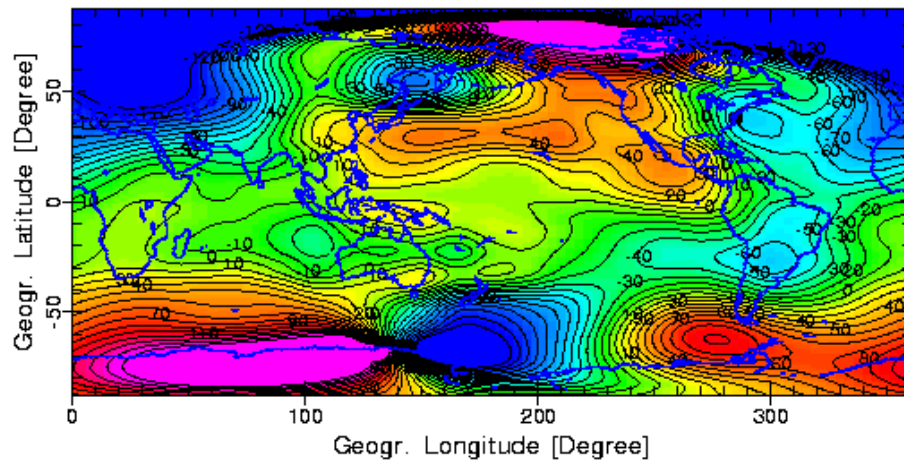
Ionosonde Data were NOT assimilated!

Global Meridional Wind Obtained from GAIM

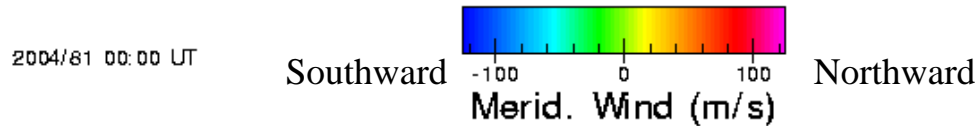
Meridional Wind Pattern



**Horizontal Wind Model
(HWM)**



**Full Physics-Based
Data Assimilation Model**



2. Ensemble Kalman Filter for High-Latitude Electrodynamics

**High-Resolution Specification of
Convection, Precipitation & Currents**

Runs on 30 CPUs

Physics-Based Model of High-Latitude Electrodynamics

Time-Dependent Ionosphere Model

- 0 **3-D Density Distributions (NO^+ , O_2^+ , N_2^+ , O^+ , H^+ , He^+)**
- 0 **3-D T_e and T_i Distributions**
- 0 **Ion Drifts Parallel & Perpendicular to \mathbf{B}**
- 0 **Hall & Pedersen Conductances**

M-I Electrodynamics Model

- 0 **MHD Transport Equations & Ohm's Law**
- 0 **Alfven Wave Propagation**
- 0 **Active Ionosphere**
- 0 **10 km & 5 sec Resolutions**
- 0 **Potential, E-field, Currents, Joule Heating**

Magnetic Induction Model

- 0 **Calculates \mathbf{B} Perturbations in Space & on Ground**
- 0 **Includes Earth's Induction Effect**

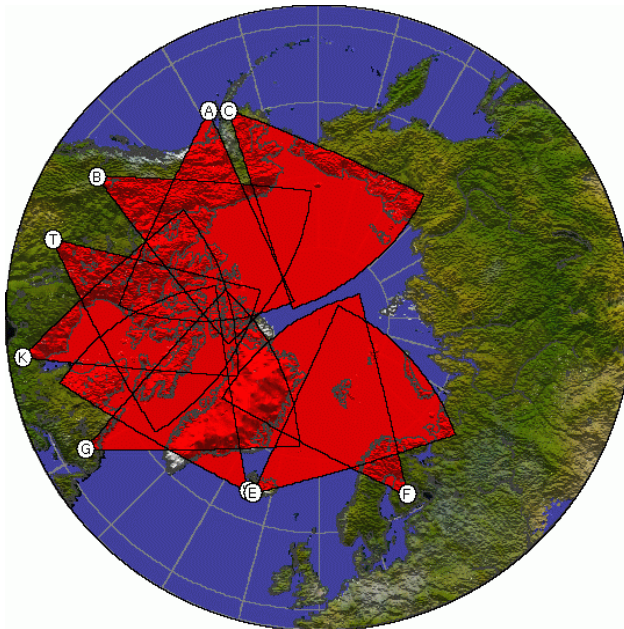
Data Assimilated

- **Ground Magnetic Data from 100 Sites**
- **Cross-Track Velocities from 4 DMSP Satellites**
- **Line-of-Sight Velocities from the SuperDARN Radars**
- **In-situ Magnetic Perturbations from the 66 IRIDIUM Satellites**

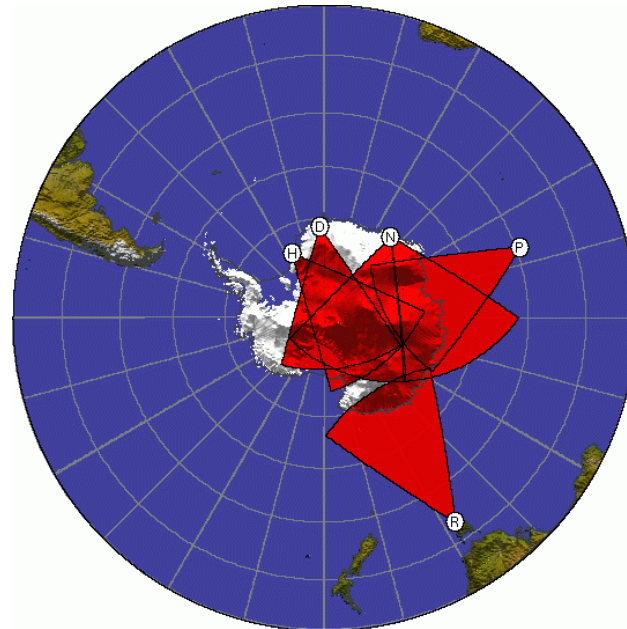
Assimilation of SuperDARN Data

- **9 Coherent Scatter Radars in the Northern High Latitudes**
- **70% Coverage of Area**
- **Measures Line-of-Sight Velocities of Plasma Irregularities**
- **Line-of-Sight Velocities are Assimilated**

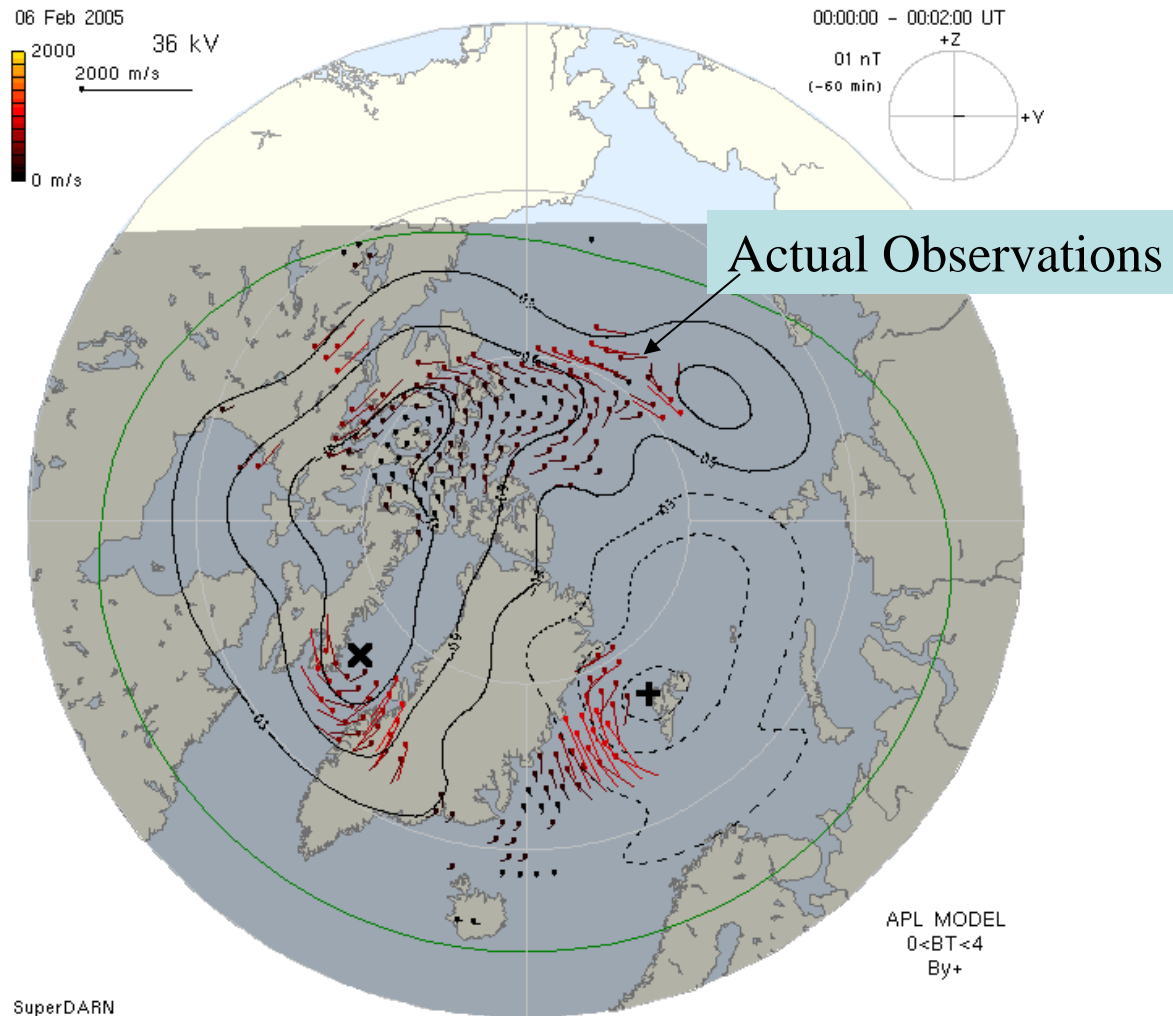
North



South



SuperDARN Data Coverage



SuperDARN Data Coverage

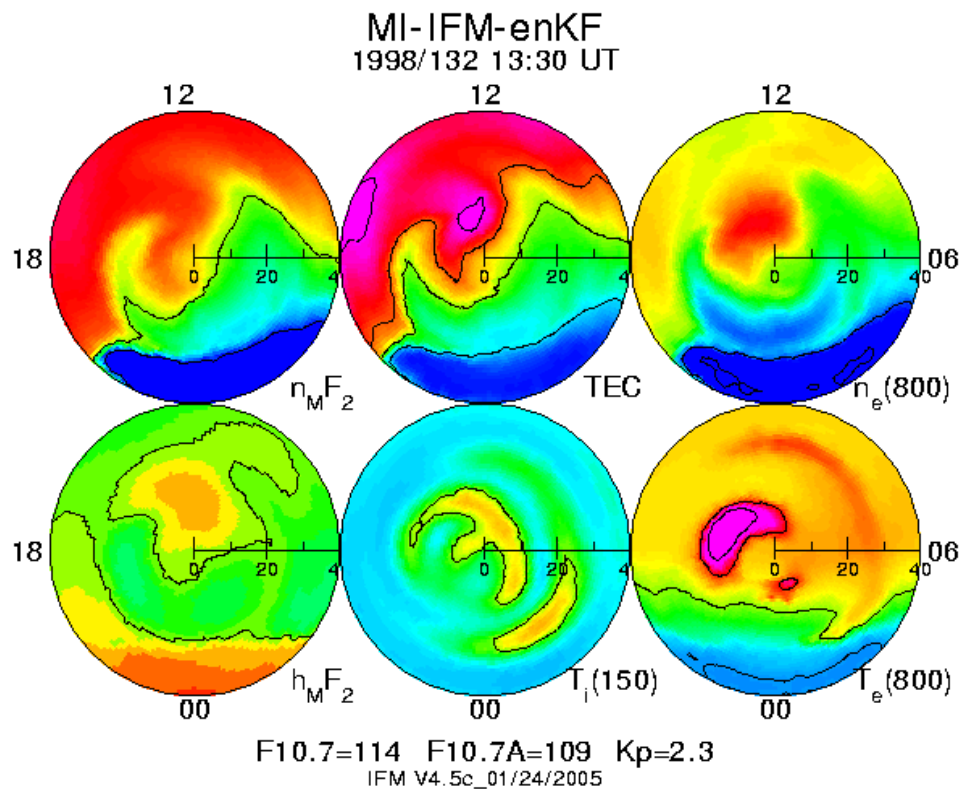
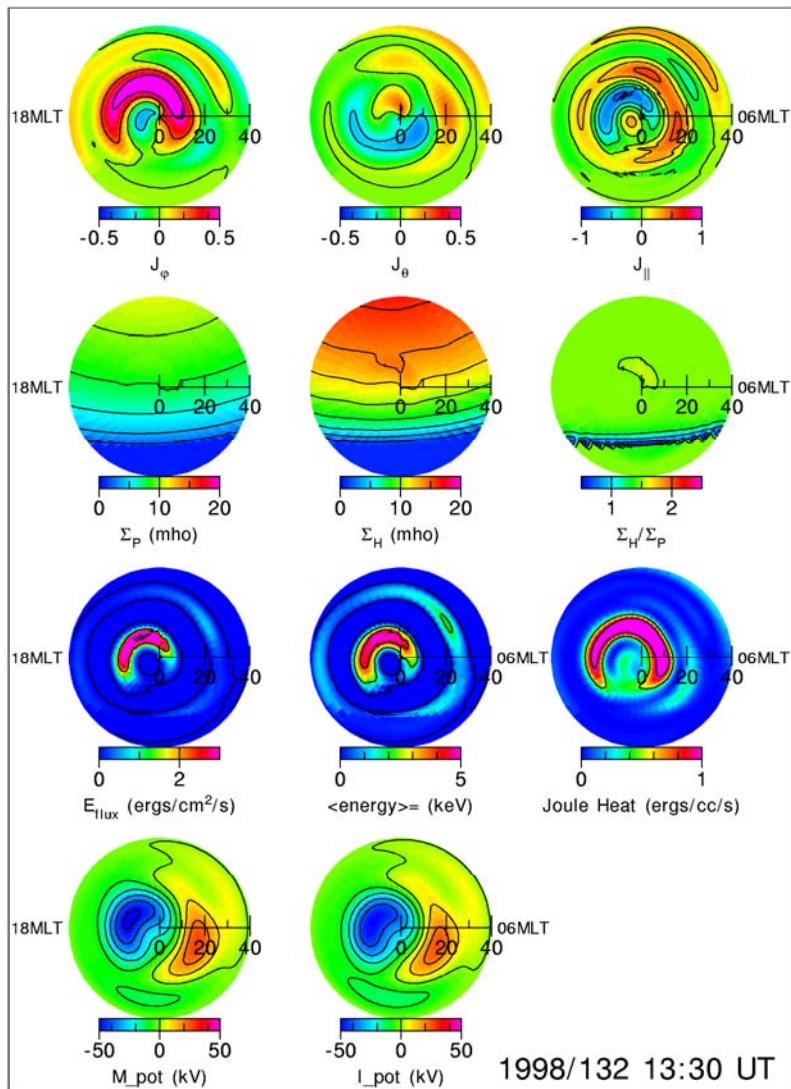
The actual data coverage is constantly changing

QuickTime™ and a
Cinepak decompressor
are needed to see this picture.

Output of the Electrodynamics Model (High Resolution)

- **Electric Potential**
- **Convection Electric Field**
- **Energy Flux and Average Energy of Precipitation**
- **Field-Aligned and Horizontal Currents**
- **Hall and Pedersen Conductances**
- **Joule Heating Rates**
- **3-D Electron and Ion Densities**
- **3-D Electron and Ion Temperatures**
- **TEC**
- **Ground and Space Magnetic Disturbances**

High-Latitude Electrodynamic Environment



QuickTime™ and a
GIF decompressor
are needed to see this picture.

Ensemble Kalman Filter

QuickTime™ and a
GIF decompressor
are needed to see this picture.

Ensemble Kalman Filter

3. Ensemble Kalman Filter for the Global Thermosphere

High-Resolution Specification of Neutral Densities, Temperatures & Winds

Runs on 30 CPUs

Physics-Based Model of the Thermosphere

- Numerical Solution of Neutral Gas Continuity, Momentum, and Energy Equations
- Time-Dependent, High-Resolution, Global Model
- 49, **98** Non-Uniform Altitude Layers from 90-600 km
- 0.5, **0.1** deg in latitude, 3 deg in longitude
- 50 km resolution in polar region
- Flux-Corrected-Transport (FCT) Numerical Method
- Rotating Coordinate System fixed to Earth
- **Tidal and Gravity Wave Forcing from Below**

Ma and Schunk (1995)

Data Assimilated

- Will be able to Assimilate
 - In situ Densities & Winds
 - **Satellite Drag Data**
 - **UV Emissions From Satellites**
 - **Deduced Neutral Parameters from ISR**

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- 1. Kalman Filter Models of the Ionosphere**
 - o **Gauss-Markov Model**
 - o **Full Physics Model**
- 2. Ensemble Kalman Filter Model of High-Latitude Electrodynamics**
- 3. Ensemble Kalman Filter Model of the Thermosphere**