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Data Ingestion in Ionospheric Electron Density Models

NAVA Bruno Abdus Salam International Centre For Theoretical Physics Telecommunications ICT for Development Laboratory (T/ICT4D) Via Beirut 7 Trieste ITALY



### Data Ingestion in Ionospheric Electron Density Models

Bruno Nava ICTP, Trieste, Italy

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- Review of the techniques developed to update NeQuick with experimental data
  - Description
  - Examples
  - Validation



- Empirical models like IRI and NeQuick have been developed as climatological models, able to reproduce the typical median condition of the ionosphere.
- For research purposes and practical applications, in order to pass from "climate" to "weather", there is a need to have models able to reproduce the current conditions of the ionosphere.
- Considering that there is an increasing availability of experimental data even in real time (ground and space-based GPS, ionosondes), several assimilation schemes have been developed. They are of different complexity and rely on different kinds of data.

# Assimilation schemes (example)

- Utah State University (USU) Global Assimilation of Ionospheric Measurements (GAIM) [Schunk et al., 2004] or the Jet Propulsion Laboratory (JPL)/University of Southern California (USC) Global Assimilative Ionospheric Model (GAIM) [Wang et al., 2004], for example, are based on assimilation of data originating from different sources and imply the use of first principle models.
- The Electron Density Assimilative Model (EDAM) [Angling and Khattatov, 2006] provides a means to assimilate ionospheric measurements into a background ionospheric model (that can be the IRI).
- Review paper: Bust, G. S., and C. N. Mitchell (2008), "History, current state, and future directions of ionospheric imaging, Rev. Geophys., 46,RG1003, doi:10.1029/2006RG000212.

### Effective parameters

- In the case of NeQuick, the methods used to adapt the model to experimental data in order to retrieve the 3D electron density of the ionosphere are intended to be simple and quick.
- Therefore they rely on the use of "effective" parameters, that are defined on the bases of model (e.g. NeQuick) and the experimental data used (e.g. foF2 or TEC).
- One of the first effective parameter that has been proposed is the "effective sunspot number" (SSNe). This parameter valid for a set of foF2 observations has been defined as the SSN value that, when used as input to the URSI foF2 model, gives a weighted zero-mean difference between the observed and the modeled foF2 values.

### Effective parameters

• IRI IG 12

http://gge.unb.ca/gauss/htdocs/grads/attila/papers/52am/ ion52am.pdf

• T-index

http://www.ips.gov.au/HF Systems/1/6 (The T index is an indicator of the highest frequencies able to be refracted from regions in the ionosphere).

 Klobuchar-Style Ionospheric Coefficients <u>http://aiuws.unibe.ch/ionosphere/#cgim</u> (Klobuchar-style alpha and beta coefficients best fitting VTEC <u>data</u>)

### Basic concepts

Model(s) features relevant to implement adaptation techniques.

- The model can be considered as profiler.
  - The profile formulation is based on anchor points modeled in terms of ionosonde parameters (e.g. foE, foF1, foF2 and M(3000)F2).
- For a given epoch & ray-path the model TEC is a monotonic function of the solar activity index, that can be regarded as an "effective ionization level" parameter.



### Adapting NeQuick model to vertical TEC maps



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grid points: lat.=-90°, 90° step 2.5° lon.=-180°, 180° step 5°



LP 15 04 2002 UT 2100

vTEC map La Plata

### Reconstructed foF2 map



grid points: lat.=-90°, 90° step 2.5° lon.=-180°, 180° s<u>tep 5</u>°

### vTEC map USTEC



grid points: lat.=10°, 60° step 1° lon.= -150°, -50° step 1°

### Reconstructed foF2 map



grid points: lat.=10°, 60° step 1° <u>lon.= -150°, -50° step 1°</u>



grid points: lat.=10°, 60° step 1° <u>lon.=</u>-150°, -50° step 1°



grid points: lat.=10°, 60° step 1° <u>lon.= -150°, -50° s</u>tep 1°



grid points: lat.=10°, 60° step 1° <u>lon.= -150°, -50° step 1°</u>



grid points: lat.=10°, 60° step 1° <u>lon.=</u>-150°, -50° step 1°



grid points: lat.=10°, 60° step 1° <u>lon.=</u>-150°, -50° step 1°



lat.=10°, 60° step 1° lon.= -150°, -50° step 1°

### vTEC map data ingestion

### At a given epoch



### vTec map ingestion scheme validation (1)

- using LaPlata global vTEC maps and manually scaled foF2 values
- hourly data for Apr. 2000 (HSA) and Sep. 2006 (LSA) have been used
- statistics on: ΔfoF2=foF2<sub>NeQ2</sub>-foF2<sub>exp</sub>

Notice: validation is on sTEC calibration + mapping function + spherical harmonics expansion + ITU-R coeff + model formulation + vTEC data ingestion technique.



### Apr 2000



Location of the lonosondes used for the validation

### Sep 2006



Location of the lonosondes used for the validation

# Global statistics (effective F10.7)



### Global statistics (daily f10.7)



# Global statistics (R12)



The ingestion technique requires that the model vertical TEC has to "match" the experimental vertical TEC at any given location and time. Therefore when the retrieved foF2 are different from the ground-truth values it can be said that NeQuick is not able to perfectly reproduce the experimental slab thickness.

Weakness in the NeQuick slab thickness formulation







### Statistics 3763 (Apr 2000)



# Statistics AS00Q (Apr 2000)



## Statistics 3763 (Sep 2006)



### Statistics AS00Q (Sep 2006)



## Validation statistics (HSA)

**Table 1.** April 2000: Statistics of the Differences Between Modeled and Experimental foF2 Data (in MHz) Considering All Ionosondes, Only the Mid-Latitude Ionosondes and Only the Low Latitude Ionosondes<sup>a</sup>

Mid Lat. Low Lat. All Lat. Data 11625 Data 9556 Data 2069 R12 F107 R12 Az F107 R12 Az F107 Az -0.770.04 -0.710.26 Aver 0.24 0.02 0.23 -0.05-1.061.09 1.46 1.27 0.90 1.34 1.92 St dev 1.10 1.74 1.86 RMS 1.12 1.46 1.49 0.93 1.34 1.31 1.76 1.92 2.140.66 0.88 0.94 0.60 0.84 0.89 1.20 50% 1.18 1.17 1.32 68% 1.01 1.36 0.90 1.25 1.30 1.70 1.78 1.74 2.82 95% 2.202.79 1.82 2.612.53 3.19 3.77 4.49 3.20 6.16 99% 5.22 7.47 4.35 4.49 2.52 3.82 3.49

**Table 5.** April 2000: Statistics of the Ratio [IDW of NeQuick 2 Errors]/[IDW of Experimental foF2] Considering All Ionosondes, Only the Mid-Latitude Ionosondes and Only the Low Latitude Ionosondes<sup>a</sup>

	All Lat, Data 488		Mid Data	l Lat, a 395	Low Lat, Data 93	
	Az	F107	Az	F107	Az	F107
Aver	0.68	1.35	0.64	1.36	0.82	1.30
St dev	0.26	0.41	0.26	0.42	0.19	0.37
RMS	0.72	1.41	0.69	1.42	0.84	1.35
50%	0.64	1.28	0.59	1.29	0.81	1.24
68%	0.75	1.42	0.68	1.42	0.90	1.40
95%	1.05	2.03	1.03	2.05	N/A	N/A
99%	1.79	3.14	1.81	3.17	N/A	N/A

**Table 3.** April 2000: Statistics of the Differences Between Modeled and Experimental foF2 Median Data (in MHz) Considering All Ionosondes, Only the Mid-Latitude Ionosondes and Only the Low Latitude Ionosondes<sup>a</sup>

	All Lat, Data 488		Mid Lat, Data 395			Low Lat, Data 93			
	Az	F107	R12	Az	F107	R12	Az	F107	R12
Aver	0.17	-0.12	-0.83	0.16	-0.11	-0.78	0.22	-0.16	-1.07
St dev	0.89	0.76	0.82	0.68	0.55	0.55	1.48	1.32	1.48
RMS	0.91	0.77	1.17	0.70	0.56	0.95	1.49	1.32	1.81
50%	0.53	0.44	0.83	0.47	0.39	0.81	1.05	0.78	0.94
68%	0.81	0.61	1.05	0.72	0.54	1.01	1.45	1.00	1.44
95%	1.71	1.32	1.84	1.31	1.12	1.60	N/A	N/A	N/A
99%	2.44	2.84	4.26	1.87	1.65	2.18	N/A	N/A	N/A

global <u>per</u>formance "climate" performance

### "weather" performance

# Validation statistics (LSA)

**Table 2.** September 2006: Statistics of the Differences Between Modeled and Experimental foF2 Data (in MHz) Considering All Ionosondes, Only the Mid-Latitude Ionosondes and Only the Low Latitude Ionosondes<sup>a</sup>

Mid Lat. Low Lat. All Lat. Data 12207 Data 8814 Data 3393 R12 Az F107 R12 Az F107 R12 Az F107 0.20 0.17 0.05 0.15 0.03 -0.080.35 0.52 0.38 Aver 0.73 0.85 0.83 0.57 0.67 0.69 1.03 1.1 1.08 St dev RMS 0.76 0.87 0.83 0.59 0.69 0.68 1.09 1.22 1.15 0.46 0.50 0.40 0.42 0.74 0.80 0.73 50% 0.48 0.43 1.11 68% 0.68 0.76 0.74 0.58 0.63 0.63 1.11 1.19 1.37 1.35 2.05 2.27 95% 1.57 1.81 1.73 1.16 2.44 99% 1.98 3.12 2.16 2.67 2.49 1.57 1.93 2.783.05

**Table 6.** September 2006: Statistics of the Ratio [IDW of NeQuick 2 Errors]/[IDW of Experimental foF2] Considering All Ionosondes, Only the Mid-Latitude Ionosondes and Only the Low Latitude Ionosondes<sup>a</sup>

	All Lat, Data 460		Mid Data	l Lat, a 328	Low Lat, Data 132	
	Az	F107	Az	F107	Az	F10
Aver	0.82	1.05	0.78	1.05	0.92	1.05
St dev	0.21	0.17	0.18	0.18	0.23	0.15
RMS	0.85	1.07	0.80	1.07	0.95	1.06
50%	0.80	1.03	0.77	1.02	0.89	1.04
68%	0.88	1.11	0.85	1.11	0.98	1.12
95%	1.22	1.38	1.13	1.39	1.36	1.35
99%	1.44	1.51	1.26	1.52	1.48	1.42

**Table 4.** September 2006: Statistics of the Differences Between Modeled and Experimental foF2 Median Data (in MHz) Considering All Ionosondes, Only the Mid-Latitude Ionosondes and Only the Low Latitude Ionosondes<sup>a</sup>

	All Lat, Data 460		Mid Lat, Data 328			Low Lat, Data 132			
	Az	F107	R12	Az	F107	R12	Az	F107	R12
Aver	0.20	0.17	0.06	0.14	0.02	-0.07	0.35	0.53	0.39
St dev	0.54	0.58	0.57	0.41	0.42	0.41	0.75	0.73	0.76
RMS	0.57	0.60	0.58	0.43	0.42	0.42	0.82	0.90	0.85
50%	0.33	0.34	0.33	0.30	0.28	0.29	0.59	0.62	0.56
68%	0.49	0.51	0.49	0.40	0.39	0.41	0.86	0.87	0.86
95%	1.21	1.22	1.13	0.84	0.86	0.80	1.63	1.80	1.66
99%	1.66	1.96	1.79	1.17	1.17	1.07	1.77	2.35	2.22

global performance "climate" performance

### "weather" performance

### Remark



### vTec map ingestion scheme "internal" consistency check

- using ground-based GPS-derived sTec from ~ 200 GPS receivers
- hourly data for Sep. 21<sup>st</sup>, 2006
- statistics on: ΔsTec=sTec<sub>NeQ2</sub>-sTec<sub>exp</sub>

sTecexp are the same data used to produce the vTec maps


#### vTec map ingestion scheme validation (2)

- using space-based GPS-derived sTec from ~ 500 occultation (COSMIC)
- hourly data for Sep. 21<sup>st</sup>, 2006
- statistics on: ΔsTec=sTec<sub>NeQ2</sub>-sTec<sub>exp</sub>

 $sTec_{exp}$  and  $sTec_{NeQ2}$  correspond to the part of the LEO -> GPS link below the LEO orbit

### RO geometry



### 2006 09 21



#### Location of the GPS receivers used for the consistency check



### TEC & ΔTEC Statistics: 2006 09 21



### TEC & ΔTEC Statistics: 2006 09 21



### **TEC/ΔTEC Statistics: 2006 09 21**



Comparing ground-based and space-based TEC statistics it is possible recognize that:

TEC/ $\Delta$ TEC is remarkably bigger for RO than for ground-based TEC

Possible NeQuick slab thickness weak formulation and/or incorrectly retrieved hmF2



## Adapting NeQuick model to experimental slant TEC data at a given location

(For possible near real time applications)



### sTEC data ingestion, single stat.

At a given epoch



# Adapting NeQuick model to experimental slant TEC data at 6 given locations

(Validation)



### Stations & ionosondes locations



GPS receivers

— Modip isolines

Ionosondes

### (6) Single station statistics (000405)



# Adapting NeQuick model to experimental slant TEC data at several locations



### sTEC data ingestion, multi stat.

At a given epoch



### Multiple station statistics (000405)



#### Using NeQuick model in a standard way (F10.7 input -> no adaptation)



### Flux of the day statistics (000405)



### Remark

#### Model is adapted to TEC but foF2 is not always adequately retrieved.



The results of these studies have indicated that there is the need to further improve the model formulation in terms of slab thickness.

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# Adapting NeQuick model to experimental slant TEC and foF2 data at a given location

(Use of slab thickness to constrain the NeQuick profile shape parameter)





### Remarks

- The use of two effective parameters has been considered in order to use the ITUR coefficients to estimate foF2 and hmF2 in a region surrounding the ground station.
- In this way the peak parameter values can be estimated for a slant TEC computation.

Use JRO profiles to simulate the process of adapting NeQuick to GPS derived TEC and ionosonde peak parameters data.

TEC and peak parameters are known from the profile.

After model adaptation it is possible to compare profiles in order to evaluate the adaptation technique effectiveness.





Jicamarca Radio Observatory (JRO) location

Difference international centre for theoretical physics





JRO 2006 09 22 UT: 10.80 Exp Std Tec F2 peak F2 peak & TEC

JRO 2006 09 22 UT: 11.55 Exp Std Tec F2 peak F2 peak & TEC



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### Adaptation method effectiveness

- In order to evaluate the adaptation technique effectiveness, the IRI model has been used instead of the NeQuick and the same data have been used for the adaptation.
- (Not so easy as in the case of NeQuick)





JRO 2006 09 22 UT: 10.80 JRO 2006 09 22 UT: 11.55 Exp Std Tec F2 peak F2 peak & TEC Exp Std Tec F2 peak F2 peak & TEC 1400 1400 1200 1200 1000 1000 h [km] h [km] 800 800 600 600 400 400 200 200 0 0 0.2 0 0.1 0.3 0.4 0.5 0 0.1 0.2 0.3 0.4 0.5 Ne  $[10^{12} \text{ m}^{-3}]$ Ne  $[10^{12} \text{ m}^{-3}]$ Model: IRI

Solution: The **abdus salam** international centre for theoretical physics

#### Use of Radio Occultation data



### Radio Occultation data ingestion

- a) RO data inversion through specific algorithms
  - Abel Inversion (bending angles).
  - A simple way to invert RO data (only) in the lonosphere is to apply the "Onion Peeling" algorithm.
  - If additional data are available (e.g. TEC from ground GPS receivers), improved inversion techniques can be applied (e.g. variable separation).

(Hernandez-Pajares M, Juan JM, Sanz J (2000); "Improving the Abel inversion by adding ground data to LEO radio occultations in the ionospheric sounding", Geoph Res Lett 27(16):2743–2746).

- b) Adaptation to electron density profile
  - Using multiple effective parameters approach
- Direct TEC assimilation into a background model.
  - EDAM
  - NeQuick (first results)

## Adapting NeQuick model to RO-derived slant TEC (corresponding to the LEO -> GPS link below the LEO orbit)

First results



### RO-derived TEC data ingestion

At a given epoch

C005.2006.264.15.03.G04\_2007.3200\_n

Peak Hei: 219.620 km Peak dens: 0.28238263\*10^12 m^-3 Peak freq: 4.772 MHz

 $4 \times 10^{11}$ 

N(h) [m-3]

Peak LT: 7.815

8×10<sup>11</sup>

6×10<sup>11</sup>

Peak Lat: 39.122° Peak Lon: -108.435° Peak UT: 15.040

 $2 \times 10^{11}$ 

600

200

 $-2 \times 10^{11}$ 

H kil



### **RO-derived TEC data ingestion**



Using NeQuick with Az\_hmF2 Minimize the RMS of the RO-derived

TEC\* mismodelings as a function of b2bot modulating factor and F10.7

Az\_foF2 (effective parameter related to foF2) b2bot\_mod

Drive NeQuick with Az\_hmF2, Az\_foF2, b2bot\_mod to retrieve the 3D electron density

### NeQuick adaptation to RO TEC




#### Adapt NeQuick model to LISN TEC data (days 11-12-13 Mar 2011)

Reconstruct foF2 values

Validate the results (where possible) with:

- JRO data and
- manually scaled foF2 data from Tucumán ionosonde











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hysics



2011 03 13 TUCU



2011 03 13 TUCU



#### Adapting NeQuick model to RO-derived TEC

# Retrieve foF2



# Validation example 5 (RO profile)

ionPhs\_C001.2011.072.20.55.G03\_2010.2640\_nc NeQ\_Rec R0\_oni Exp\_data



### Validation example 5 (RO geom.)



- projections of the LEO -> GPS links below the LEO orbit
- tangent points of the LEO -> GPS links

#### Least Square Estimation

Best Linear Unbiased Estimator (BLUE)\*

y vector of observations
x<sub>b</sub> background model state
x<sub>a</sub> analysis model state
H observation operator
R covariance matrix of observation errors
B covariance matrix of background errors

\*<u>http://www.ecmwf.int/newsevents/training/rcourse\_notes/DATA\_ASSIMILATION/</u> <u>ASSIM\_CONCEPTS/Assim\_concepts2.html#</u>962570

#### Least Square Estimation

The optimal least-square estimator (BLUE analysis) is defined by

 $x_a = x_b + K (y - Hx_b)$  $K = BH_T (HBH^T + R)^{-1}$ 

K is called gain of the analysis

e.g.  $bckg_TEC = Hx_b$ 







#### RO geometry



- projections of the LEO -> GPS links below the LEO orbit
- tangent points of the LEO -> GPS links

## Conclusion

- Data ingestion into NeQuick improves the model performance when it is used to provide 3D specifications of the electron density of the ionosphere.
- The adaptation to vTEC maps improves the NeQuick capabilities to follow the day-to-day variability of the ionosphere.
- The studies carried out with JRO profiles have indicated that the contemporary availability of TEC and foF2 (plus hmF2) data can be considered as a "minimum requirement" for the implementation of an effective electron density retrieval technique based on NeQuick adaptation to experimental data (RO-derived profiles included).
- The approach based on multiple parameters also allows to use ROderived TEC data to obtain realistic electron density values for the area of interest.



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## Thank you for your attention

