# AUTOREGRESSIVE PROCESS IN HOMOGENIZATION OF GNSS TROPOSPHERIC DATA

### **MAIN OBJECTIVES**

- 1. To analyse the Integrated Water Vapour (IWV) time series derived from IGS "repro1" reprocessing to end with estimates of trend, seasonal part and a character of noise.
- 2. To use these parameters to create a synthetic benchmark dataset to be homogenized with different statistical tools.
- 3. To decide on the most appropriate tool to be used for homogenization of tropospheric data.

#### DATASET

Data: 1-day sampled differences of Integrated Water Vapour (IWV) from GPS and ERA-Interim for period from January 1<sup>st</sup>, 1995 to December 31<sup>st</sup>, 2010 (Figure 1). Author: Olivier Bock.

Brief description of processing and post-processing:

- GPS Zenith Total Delay (ZTD) source: for 1995-2007: IGS repro1 (reprocessed by JPL with GIPSY OASIS software in May 2010), for 2008-2010: IGS tropo\_new (reprocessed by JPL with GIPSY OASIS software in July 2010);
- GPS ZTD screening based on range check and outliers check of ZTD and formal errors at 5 min resolution:
- GPS ZTD resampling to 1 hour interval (mean of all values in the interval t-0.5h to t+0.5h, with at least 4 values):
- GPS ZTD to IWV conversion: ZHD & Tm computed from ERA-Interim pressure level data (with bi-linear horizontal interpolation from 4 grid points);
- IWV differences computed when time-match is within +/-1 hour;
- IWV differences screened with normality test;
- IWV differences resampled to daily mean values when all 6-hourly values are available (mean computed with weights [0.51110.5] for values at 00, 06, 12, 18, 24UTC).

## **METHODOLOGY**

1. We manually homogenized IWV differences from IGS "repro1" solution.

- 2. We employed Maximum Likelihood Estimation (MLE) to derive parameters of trend, seasonal part and noise character.
- 3. We used spectral analysis to clearly demonstrate the differences between different noise models.
- 4. We used station-by-station parameters to create three synthetic benchmark datasets: EASY, LESS COMPLICATED and FULLY COMPLICATED to be tested with different tools.

#### **CHARACTERISTICS OF IWV DIFFERENCES**

Homogenisation of IWV differences:

- 1028 epochs reported in IGS log files (ftp://igs.ign.fr/pub/igs/igscb/station/log/ and ftp://igs.ign.fr/pub/igs/igscb/station/oldlog/) arising from changes in receiver, antenna or radome. We averaged them using 30-day window and ended with 970 epochs. These were validated manually: 174 offsets remained;
- 54 offsets reported manually in differences of IWV (ERAI-GPS) (Figure 2a);
- few stations included in a special class: cases where visual detection of offsets is not reliable (GOPE: Czech Republic, KOUR: French Guiana, LONG: USA and MCM4: Antarctica) (Figure

A model fitted to IWV differences:

$$IWV(t_i) = a + b \cdot (t_i - t_0) + c \cdot \sin(2\pi \cdot (t_i - t_0)) + d \cdot \cos(2\pi \cdot (t_i - t_0)) + e \cdot \sin(4\pi \cdot (t_i - t_0)) + f \cdot \cos(4\pi \cdot (t_i - t_0)) + g \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + h \cdot \cos(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi \cdot (t_i - t_0)) + e \cdot \sin(6\pi$$

$$+ i \cdot \sin\left(8\pi \cdot (t_i - t_0)\right) + j \cdot \cos\left(8\pi \cdot (t_i - t_0)\right) + \sum_{j=1}^n d_j H + \varepsilon_{IWV_i}$$

We examined on amplitudes of seasonal changes c, d: annual + e, f: semi-annual + g, h: 3 months + I, j : 4 months), values of trend: b and character of stochastic part  $\varepsilon_{IWV}$ : AR(1)+WN with Maximum Likelihood Estimation (Figure 5) in Hector Software (Bos et al., 2013). The amplitudes of offsets are estimated along with above mentioned parameters in a least-squares procedure.

Autoregressive of first order plus white noise (AR(1)+WN) chosen as a most appropriate for daily IWV data, basing on AIC criterion plus time of computation:

$$\varepsilon_{IWV_t} = \phi_1 \varepsilon_{IWV_{t-1}} + a_t$$

#### GENERATING OF THE BENCHMARK DATASET

We simulated three types of data. The first, referred to as EASY, includes pure white noise, seasonal terms, trend and offsets. The second, referred to as LESS COMPLICATED, includes all above mentioned characteristics plus an autoregressive process of the first order. Finally, the FULLY COMPLICATED dataset includes all the above mentioned characteristics from "less complicated" plus gaps. All these 3 datasets provide a nice amount of series (360 series) to be tested with different homogenization tools. The homogenization group can examine on the effectiveness of different approaches when white noise prevails in stochastic part and when autoregressive behavior is added to a series. Also, they can study the impact of the gaps on their approach.

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Figure 1. Stations used in a WG3 sub-working group "Data Homogenisation" activity.



Figure 2. A manual homogenization of IWV differences. 54 epochs in total were discovered manually in differences of IWV (ERAI-GPS). An example of 4 offsets reported in DAV1 station (a).

*Time series from MCM4 station included to a special class (b).* 



Figure 3. Annual amplitudes derived from IWV differences between ERA-Interim model and GPS.

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Klos A., Hunegnaw A., Teferle F.N., Abraha K.E., Ahmed F., Bogusz J.: "Noise characteristics in Test different statistical approaches to give a clear answer if we are able (or not) to report Zenith Total Delay from homogeneously reprocessed GPS time series". Submitted to the offsets with statistical approaches, being aware of the autoregressive noise in a stochastic Atmospheric Measurement Techniques. part of the IWV data.



Figure 6. Parameters of autoregressive noise derived for differences of IWV. Left: histograms of fraction, coefficients and amplitude of white and autoregressive processes, right: coefficient and fraction of autoregressive noise.

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