

# An inversion approach for determining water storage changes from 3-D GPS coordinates time series in Europe

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# Outline

- Inversion algorithm
- Water storage determination in Amazon basin
- Water storage determination in Danube basin
- Conclusion

# Elastic responses of the Earth

Mass-loading Green's function [Farrel, 1972]

$$G_u(\theta) = \frac{a}{m_e} \sum_{n=0}^{\infty} h_n P_n(\cos \theta)$$

$$G_v(\theta) = \frac{a}{m_e} \sum_{n=1}^{\infty} l_n \frac{\partial P_n(\cos \theta)}{\partial \theta}$$

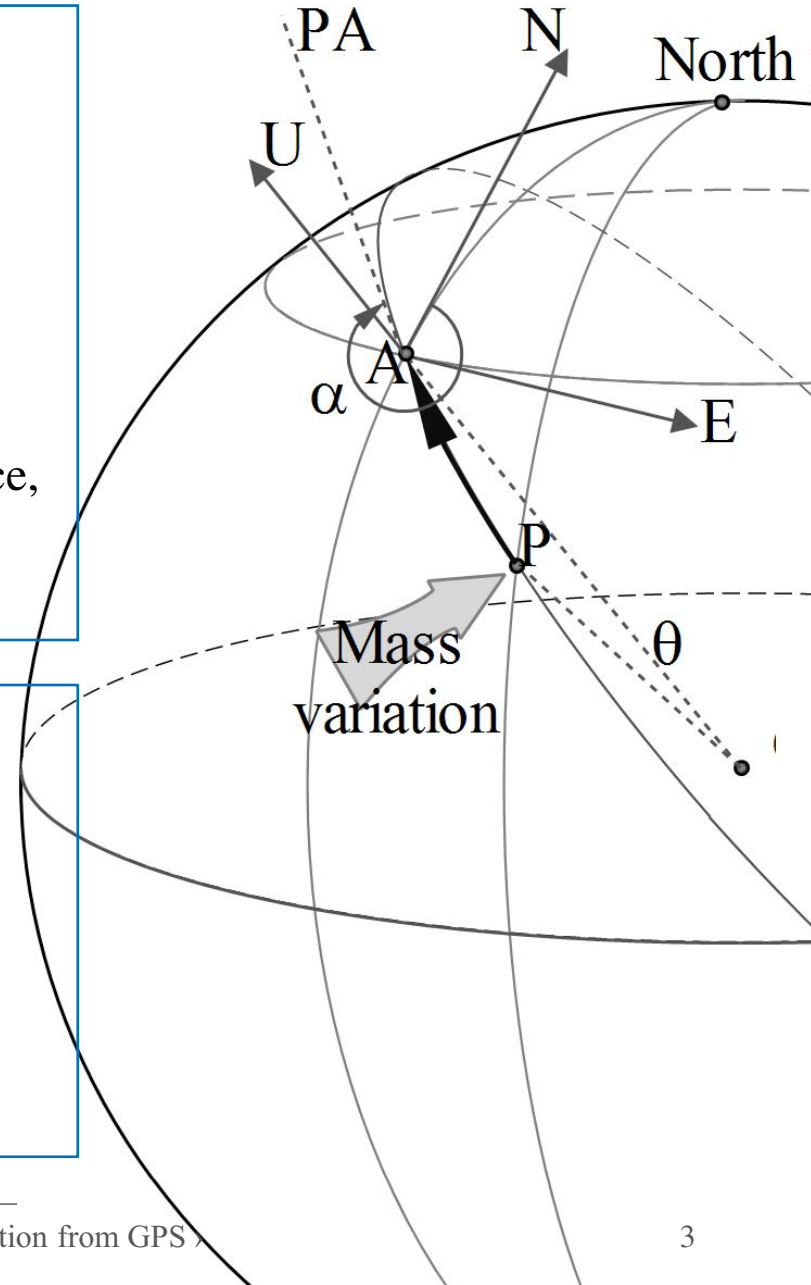
where  $h$  and  $l$  are love numbers,  $\theta$  is angular distance,  $P_n$  are the Legendre polynomials.  $a$  and  $m_e$  are radius and total mass of the Earth.

Surface displacements ( $U$ ,  $V$ ):

$$\begin{bmatrix} \delta U \\ \delta V \end{bmatrix} = \begin{bmatrix} G_u \\ G_v \end{bmatrix} \delta M$$

with  $M$  is the mass variation

$V$  aligns to direction  $P \rightarrow A$ .



# Inversion methodology

- Block load mass: homogenous equivalent water height (EWH) variations,  $H_{1\dots n}$ , for predefined grids.

$$\begin{array}{c} \mathbf{I} \end{array} = \begin{array}{c} \mathbf{A} \end{array} \begin{array}{c} \mathbf{X} \end{array} + \boldsymbol{\varepsilon}.$$

The matrix  $\mathbf{A}$  is defined as:

$$\mathbf{A} = \begin{bmatrix} \sum_{\theta,\lambda}^{\Omega_1^1} \rho G_v \sin \alpha \cdot dS & \sum_{\theta,\lambda}^{\Omega_2^1} \rho G_v \sin \alpha \cdot dS & \dots & \sum_{\theta,\lambda}^{\Omega_n^1} \rho G_v \sin \alpha \cdot dS \\ \sum_{\theta,\lambda}^{\Omega_1^1} \rho G_v \cos \alpha \cdot dS & \sum_{\theta,\lambda}^{\Omega_2^1} \rho G_v \sin \alpha \cdot dS & \dots & \sum_{\theta,\lambda}^{\Omega_n^1} \rho G_v \cos \alpha \cdot dS \\ \vdots & \vdots & \ddots & \vdots \\ \sum_{\theta,\lambda}^{\Omega_1^m} \rho G_u \cdot dS & \sum_{\theta,\lambda}^{\Omega_2^m} \rho G_u \cdot dS & \dots & \sum_{\theta,\lambda}^{\Omega_n^m} \rho G_u \cdot dS \end{bmatrix}$$

$$\hat{\mathbf{X}} = (\mathbf{A}^T \mathbf{W} \mathbf{A})^{-1} \mathbf{A}^T \mathbf{W} \cdot \mathbf{I}$$

Where  $\mathbf{W}$  is the weight matrix, determined from GPS error information.

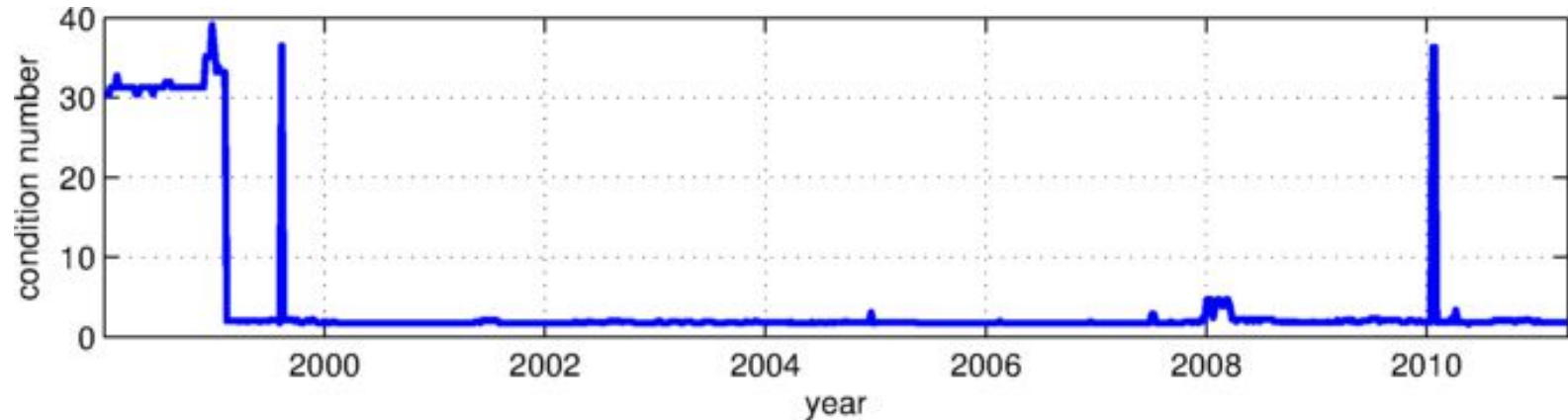
$\rho$  = water density

$\theta$  and  $\lambda$  are latitude and longitude

$S$  = surface area for block or cell

# Regularization methods

- Condition number 3-block inversion case in Danube:

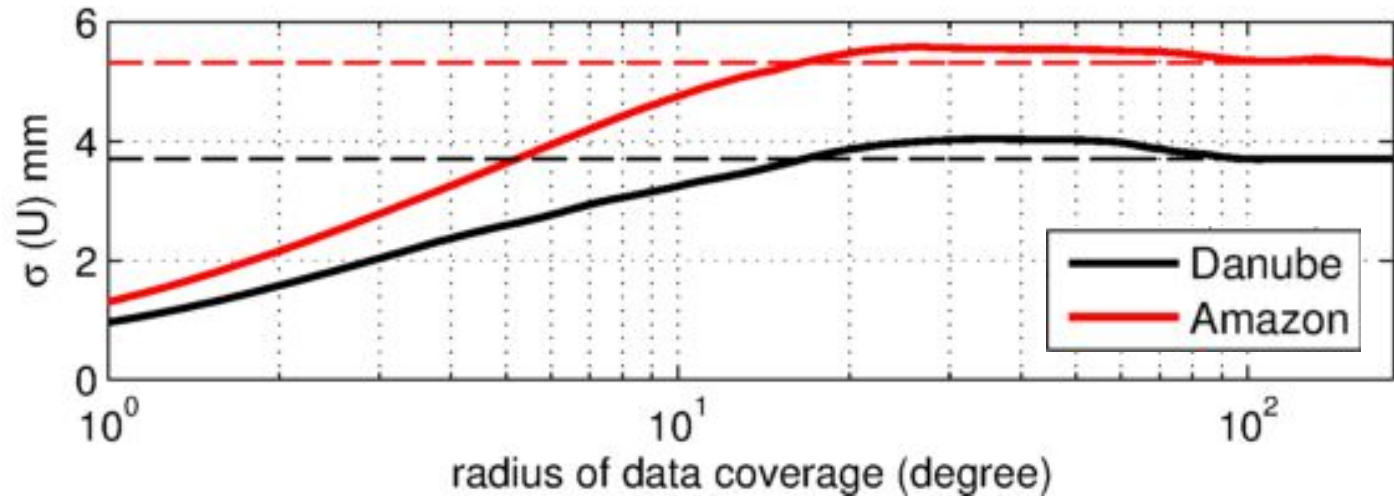
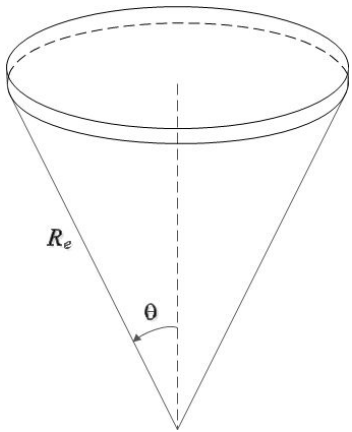


- GPS availability
  - Signal-to-noise ratio
  - Distribution
  - Leakage effects
- Tikhonov Regularization in its most general form:
$$\min \left\{ \|\mathbf{Ax} - \boldsymbol{\varepsilon}\|^2 + \lambda^2 \mathbf{I}^2 \right\}$$
    - $\lambda$  from L-curve corner determination [Hansen and O’Leary, 1993]

# Data preparation

- Weekly GPS 3-D coordinate time series [Collilieux et al., 2012]
  - Linear trends are removed
  - 3-month moving average
- GRACE gravity fields
  - CSR Release 5
  - Degree-1 coefficients from Swenson [2008]
  - $C_{2,0}$  from Cheng [2005]
  - GAC de-aliasing product is restored
  - De-stripping
  - No Gaussian smoothing
- Water storage from GLDAS NOAH model
  - Soil moisture
  - Snow/ice depth

# Amplitude of displacements w.r.t. the spatial extent of the data



- 5-years GLDAS
- Displacements result from mass change within coverage
- 180° = global coverage
- Location dependent
- Displacements in radial direction present the loading mass up to radius of 10°-20°

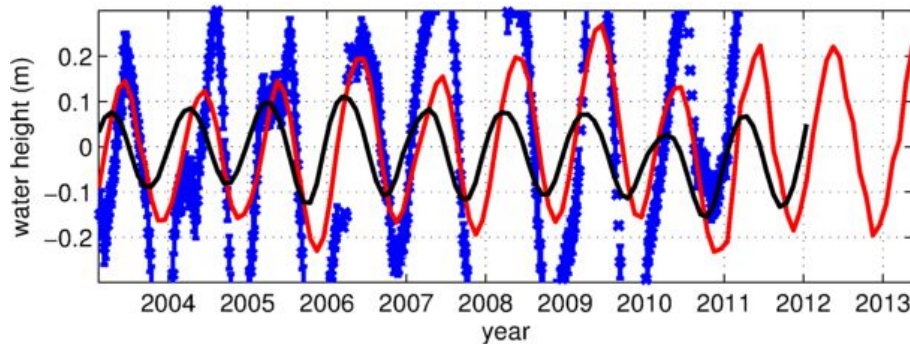
- Amazon basin



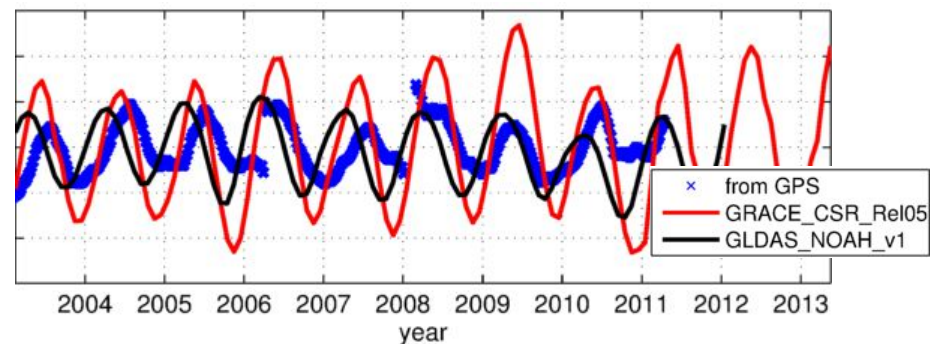
# Inversion for a single disk in the Amazon Basin

- Most simple case
- Invert for mean CWS for a disk with a radius of  $\sim 12.5^\circ$  (same surface area as basin grid)

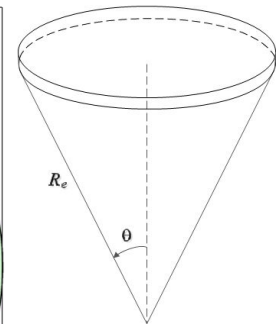
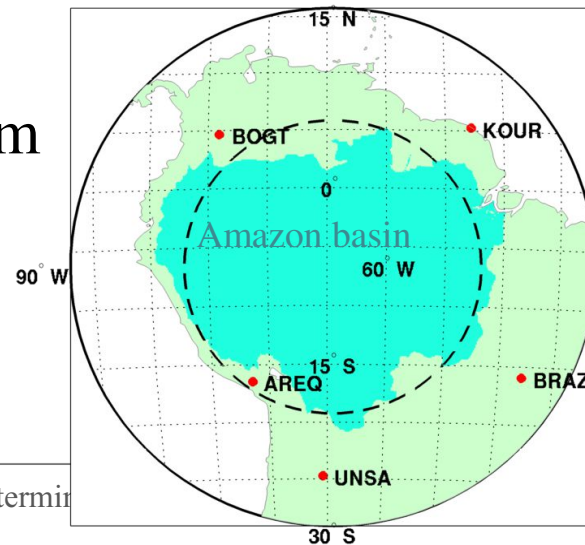
CWS from radial displacements



CWS from 3-D displacements



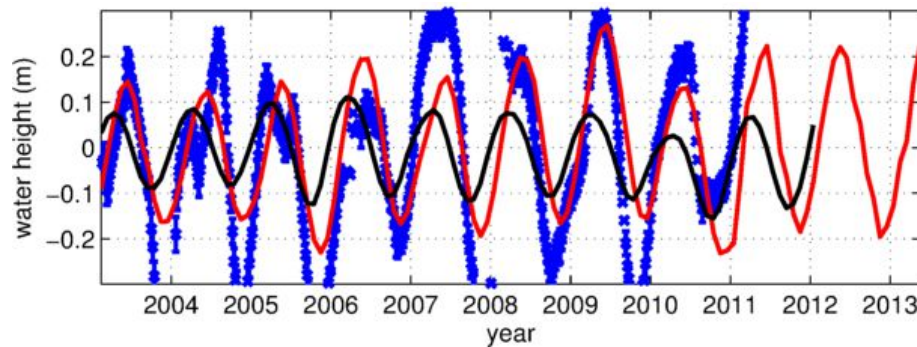
- Simple disk inversion provides reasonable results using data from only 5 GPS stations



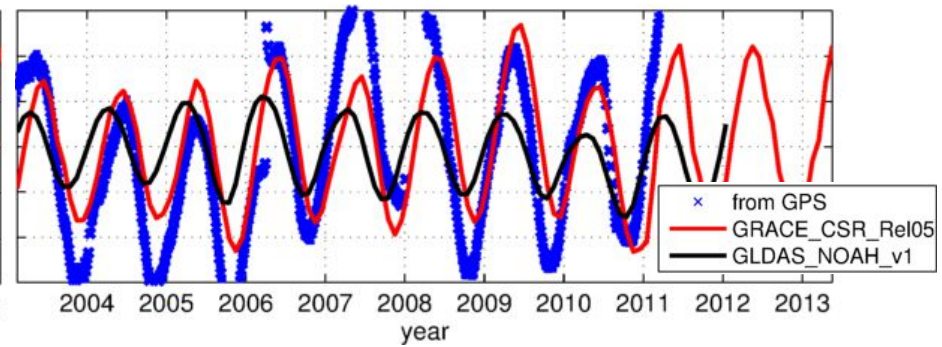
# Inversion for a single CWS value in Amazon Basin

- Invert for mean CWS for the true area of the Amazon basin

CWS from radial displacements

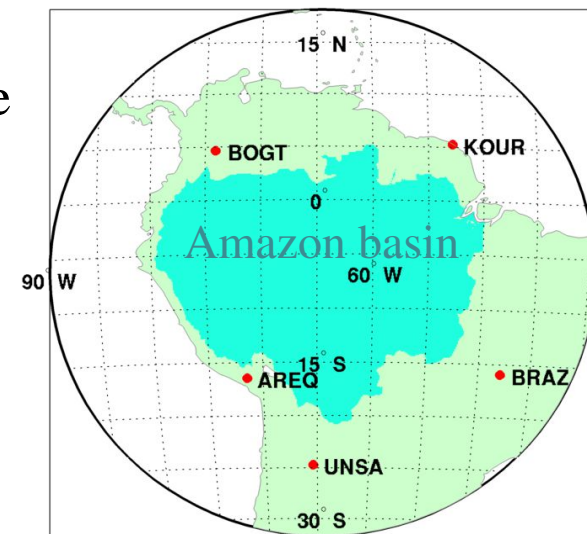


CWS from 3-D displacements



- Water storage variations determined from GPS have higher correlation to GRACE data than to GLDAS

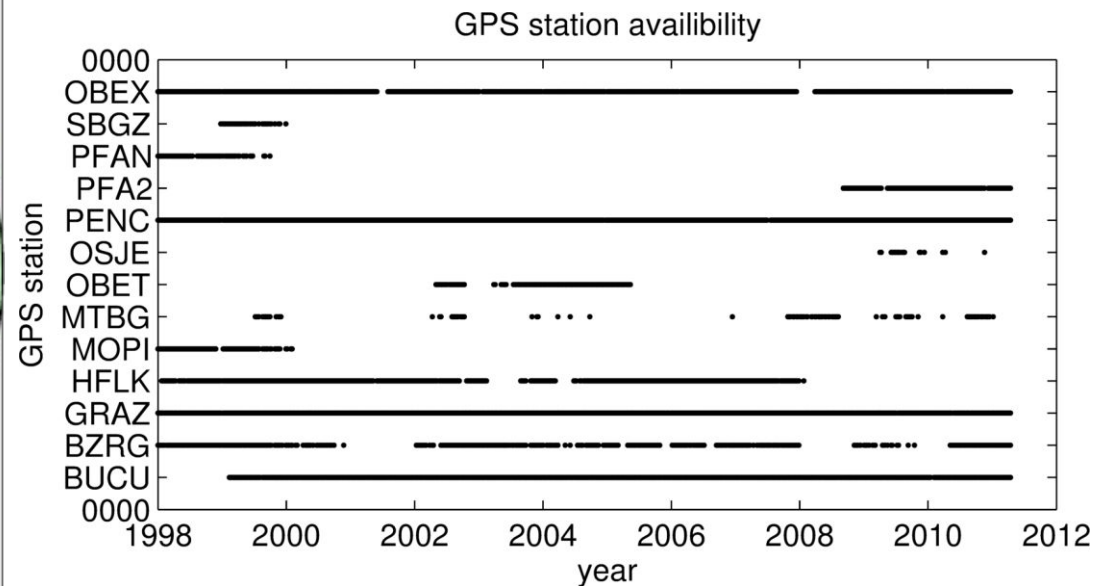
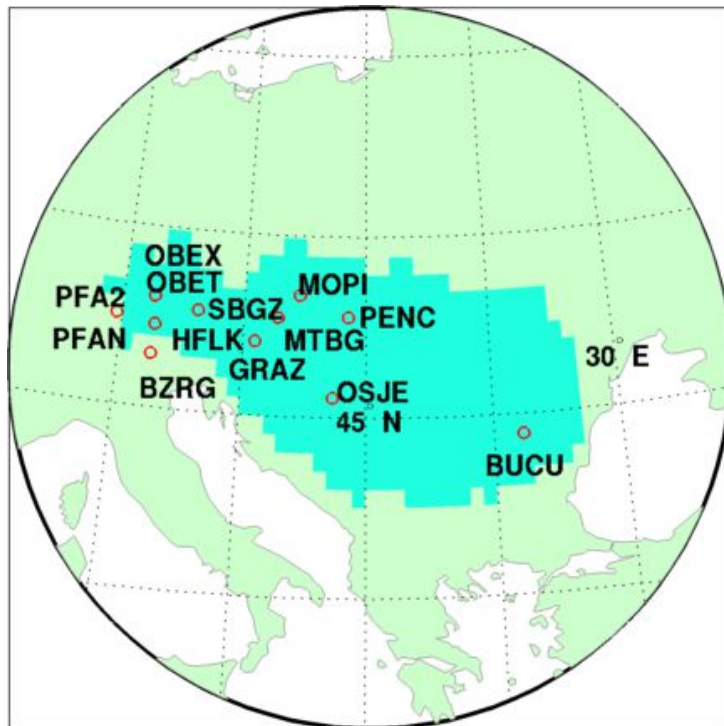
	$\rho_{GRACE,GPS}^{EWH}$	$\rho_{GLDAS,GPS}^{EWH}$
inv. Radial	0.76	0.55
inv. 3-D	0.78	0.63



- Danube basin

# Danube basin

- 13 stations within/nearby the Danube basin are selected

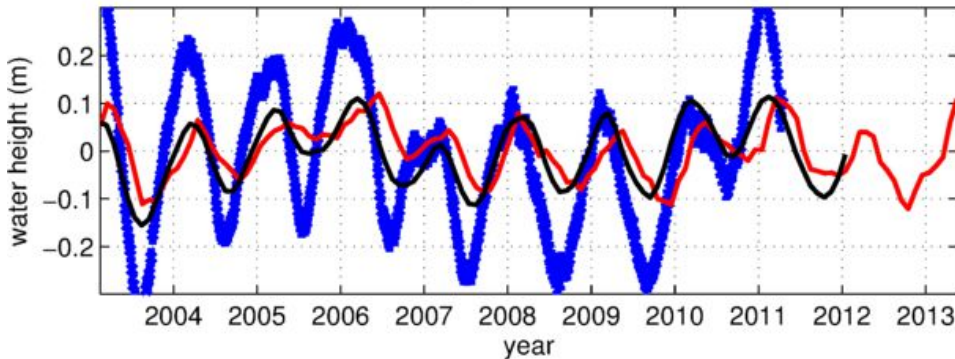


- On average, there are ~7 stations available for all epochs

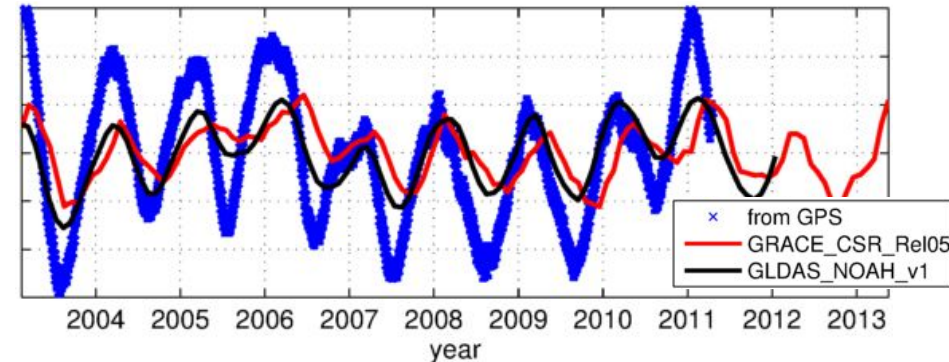


# Inversion for a single block in Danube basin

CWS from radial displacements



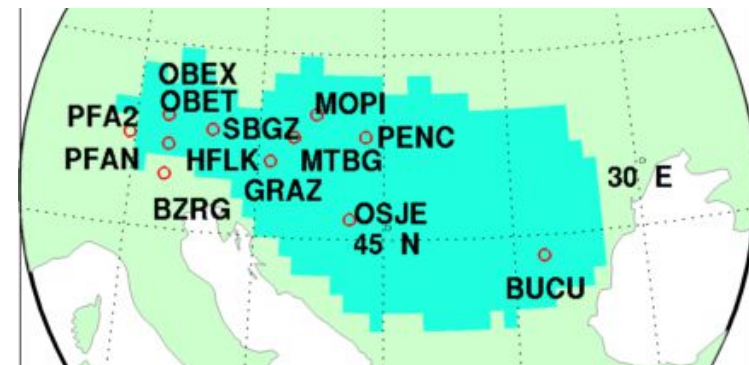
CWS from 3-D displacements



- The CWS amplitude determined from GPS is significant larger than from reference.

– Why ?

- Mass changes from outside of the Danube basin
- Mass variations in smaller scale are detected by GPS

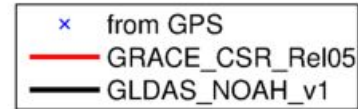
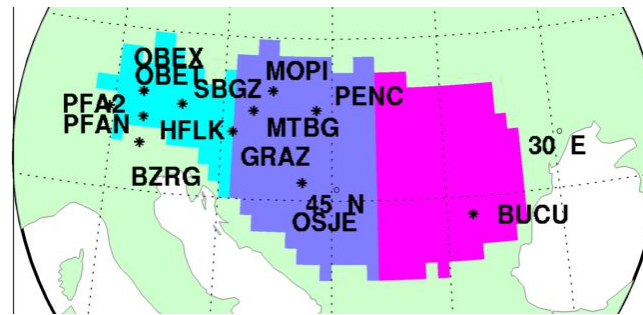
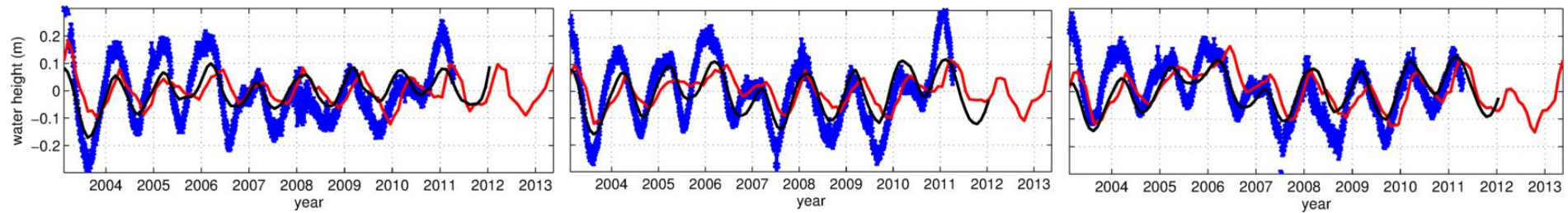


# L-curve Tikhonov regularization

CWS from radial displacements in 1<sup>st</sup> blk

CWS from radial displacements in 2<sup>nd</sup> blk

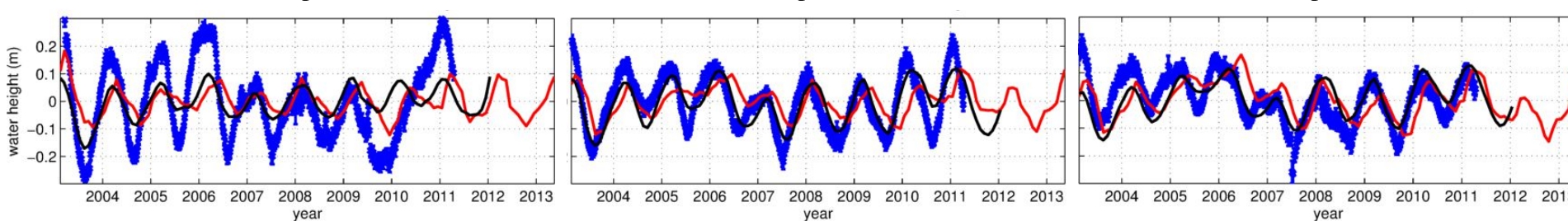
CWS from radial displacements in 3<sup>rd</sup> blk



CWS from 3-D displacements in 1<sup>st</sup> blk

CWS from 3-D displacements in 2<sup>nd</sup> blk

CWS from 3-D displacements in 3<sup>rd</sup> blk



# Conclusions

- GPS coordinates represent regional ( $10^{\circ}$ - $20^{\circ}$ ) mass variations.
- GPS can be used for CWS determination.
- Reasonable CWS estimates obtained for inverted GPS.
- The loading effects from outside of the study basin can not be neglected.
  
- To-do list:
  - Correlation between areas
  - Correlation of GPS time series
  - Introduce larger coverage
  - Validations
  - Combination of other data sources (GRACE, in-situ observations, etc.)

# Bibliography

- Cheng, M., and B. D. Tapley (2005), Variations in the Earth's oblateness during the past 28 years, *Journal of Geophysical Research: Solid Earth*, 109(B9), B09402, doi:10.1029/2004JB003028.
- Collilieux, X., T. Dam, J. Ray, D. Coulot, L. Métivier, and Z. Altamimi (2012), Strategies to mitigate aliasing of loading signals while estimating GPS frame parameters, *Journal of Geodesy*, 86(1), 1–14, doi:10.1007/s00190-011-0487-6.
- Farrell, W. E. (1972), Deformation of the Earth by surface loads, *Reviews of Geophysics*, 10(3), 761, doi:10.1029/RG010i003p00761.
- Hansen, P., and D. O'Leary (1993), The Use of the L-Curve in the Regularization of Discrete Ill-Posed Problems, *SIAM J. Sci. Comput.*, 14(6), 1487–1503, doi:10.1137/0914086.
- Swenson, S., D. Chambers, and J. Wahr (2008), Estimating geocenter variations from a combination of GRACE and ocean model output, *Journal of Geophysical Research: Solid Earth*, 113(B8), B08410, doi:10.1029/2007JB005338.



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**Thank you for your attention!**