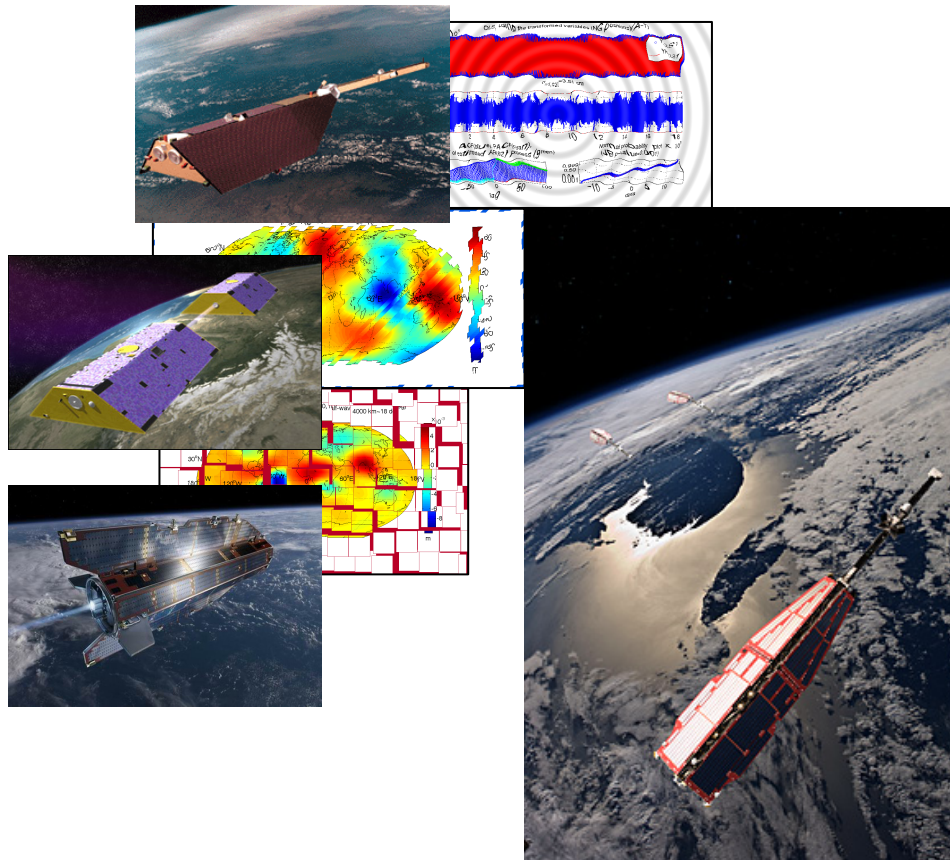


Calibration of Swarm accelerometers by means of kinematic orbits and gravity field models



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Calibration of Swarm accelerometers by means of kinematic orbits and gravity field models

- Background and objectives
- Calibration method
- Results using real data
- Contribution to SWARM validation activities

Forces acting on LEO satellites

- Satellites in **Low Earth Orbits** (LEO): altitudes 100-2000 km
- Dominant is the central gravitational field
- Other forces act as small perturbations

Accelerations of gravitational origin

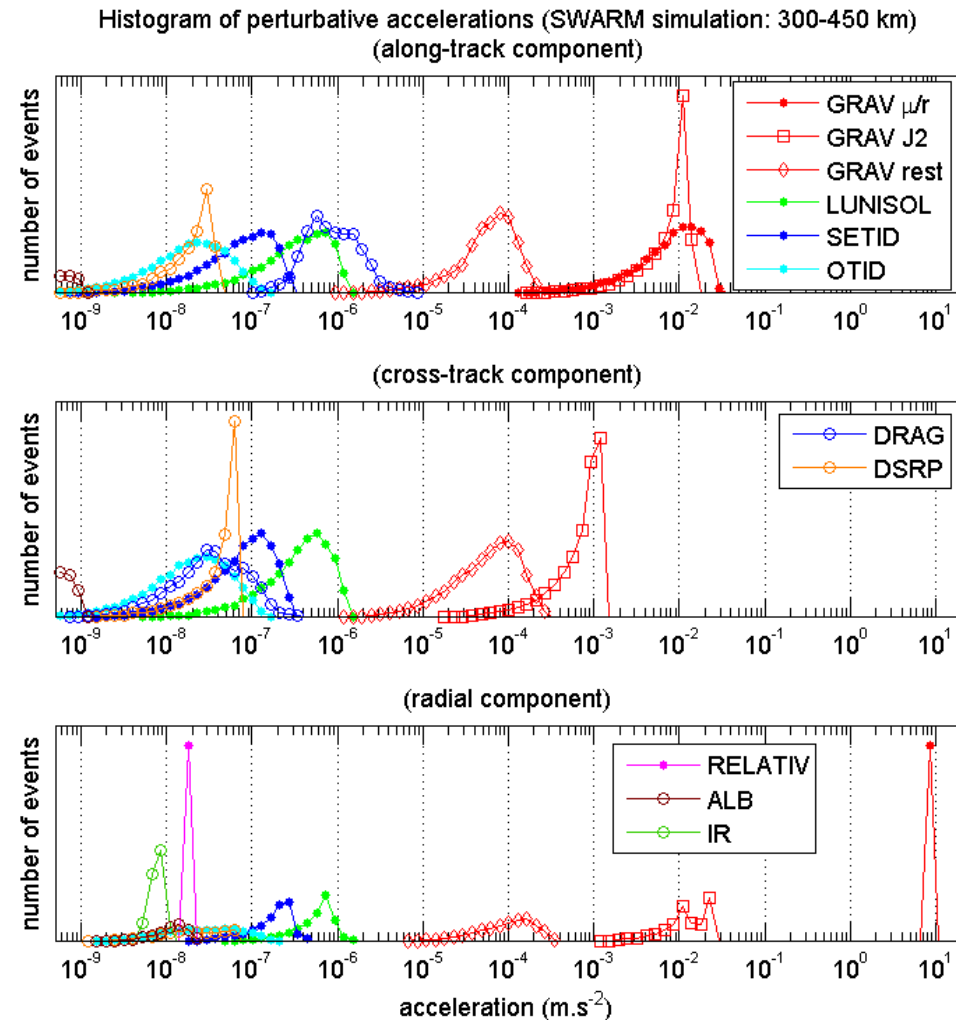
- central geopotential term
- noncentral geopotential terms
- lunisolar perturbations
- solid-Earth and ocean tides
- relativistic effects

Nongravitational accelerations

- atmospheric drag
- radiation pressures (direct solar, albedo, terrestrial infrared)

Magnitudes

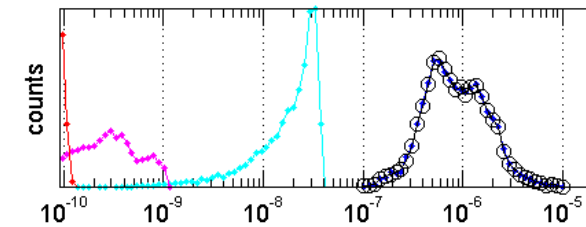
$\mu/r \gg J2 \gg \text{GRAV rest, DRAG, LUNISOL} > \text{SETID} > \text{OTID, DSRP} > \text{ALB, IR, RELAT}$



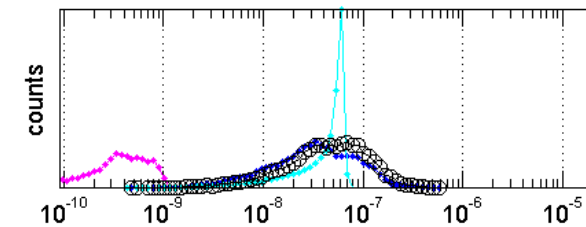
Space accelerometers

- Designed to measure tiny nongravitational accelerations
- Aboard the satellites: CHAMP, GRACE, GOCE
- Magnitude of nongravitational accelerations:
 - Along-track: $10^{-7} - 10^{-5} \text{ m.s}^2$
 - Cross-track: $10^{-9} - 10^{-6} \text{ m.s}^2$
 - Radial: $10^{-9} - 10^{-7} \text{ m.s}^2$
- Due to the smallness of the nongravitational signal compared to gravity, **space accelerometers cannot be calibrated on the ground.**

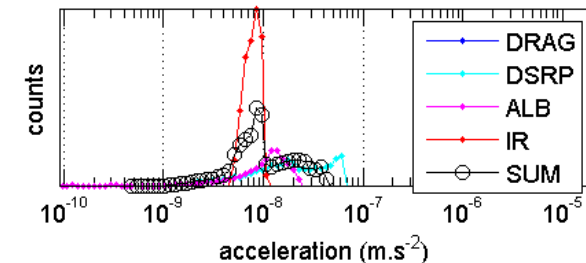
Histograms of NG acc. (SWARM simulation: 300-450 km)
(along-track component)



NG acc. (cross-track component)

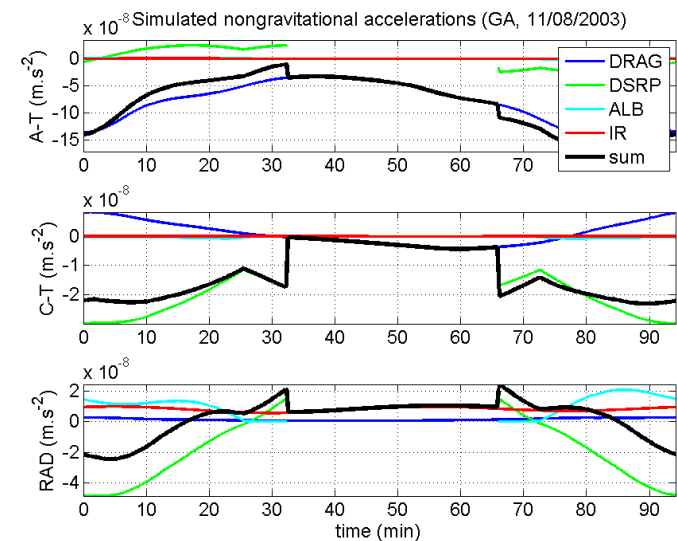
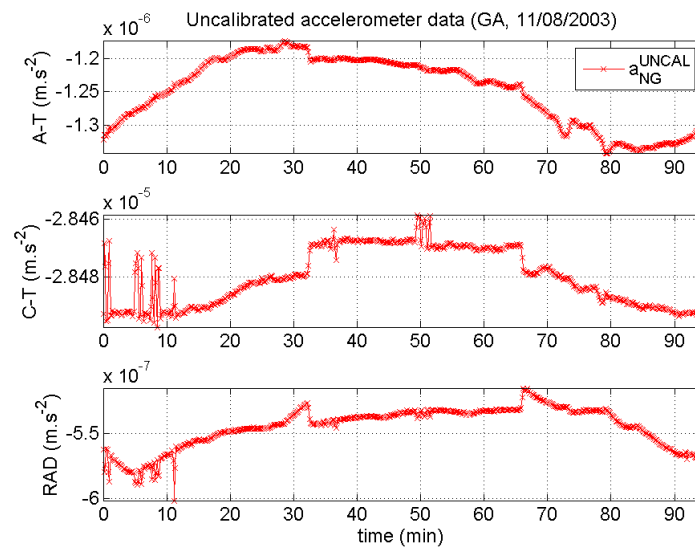


NG acc. (radial component)



Uncalibrated ACC data

- **Waveforms** of uncalibrated ACC signal and simulated NG accelerations are quite **similar**.
- **Spikes** in cross-track and radial components correspond to cold-gas **thruster firings**.
- RAD component
 - Orbit geometry → passage through zero
 - ACC data have **offset**
- Comparison of range on y-axes
 - ACC data are orders of magnitude out
- **Need to calibrate the ACC readouts**



Acceleration approach

- GPS positions \mathbf{r} with constant time step \rightarrow **numerical second derivative** of $\mathbf{r}(t)$
 \rightarrow **GPS-based accelerations** $d^2\mathbf{r}/dt^2 \approx \mathbf{a}^{(\text{GPS})}$

Newton's second law: $\mathbf{a}^{(\text{GPS})} \approx d^2\mathbf{r}/dt^2 = \mathbf{a}_{\text{geop}} + \mathbf{a}_{\text{LS}} + \mathbf{a}_{\text{TID}} + \mathbf{a}_{\text{REL}} + \mathbf{a}_{\text{NG}}$

$\mathbf{a}_{\text{geop}}(\mathbf{r}) \equiv \sum \text{GC} \times \nabla \text{SSH}(r, \theta, \varphi)$... geopotential in spherical harmonics

\mathbf{a}_{LS} , \mathbf{a}_{TID} , \mathbf{a}_{REL} , \mathbf{a}_{NG} ... lunisolar action, tides, relativity, nongravitational forces

Two applications:

- 1) Assume the geopotential is known and define GPS-based NG accelerations

$$\mathbf{a}_{\text{NG}}^{(\text{GPS})} = \mathbf{a}^{(\text{GPS})} - (\mathbf{a}_{\text{geop}} + \mathbf{a}_{\text{LS}} + \mathbf{a}_{\text{TID}} + \mathbf{a}_{\text{REL}})$$

$$\mathbf{a}_{\text{NG}}^{(\text{GPS})} = \mathbf{B} + \mathbf{S} \cdot \mathbf{a}_{\text{ACC}}^{(\text{UNCAL})} + \boldsymbol{\varepsilon} \quad (*)$$

Calibration parameters B/S for ACC are obtained by solving linear system (*).

- 2) On rearranging the observation equations:

$$\sum \text{GC} \times \nabla \text{SSH}(r, \theta, \varphi) + \boldsymbol{\varepsilon} = \mathbf{a}^{(\text{GPS})} - (\mathbf{a}_{\text{LS}} + \mathbf{a}_{\text{TID}} + \mathbf{a}_{\text{REL}} + \mathbf{a}_{\text{NG}})$$

Now **Geopotential coefficients GC** can be solved for.

ACC calibration by acceleration approach: ASU¹ version

Linear system of observation equations to estimate **calibration parameters B/S**:

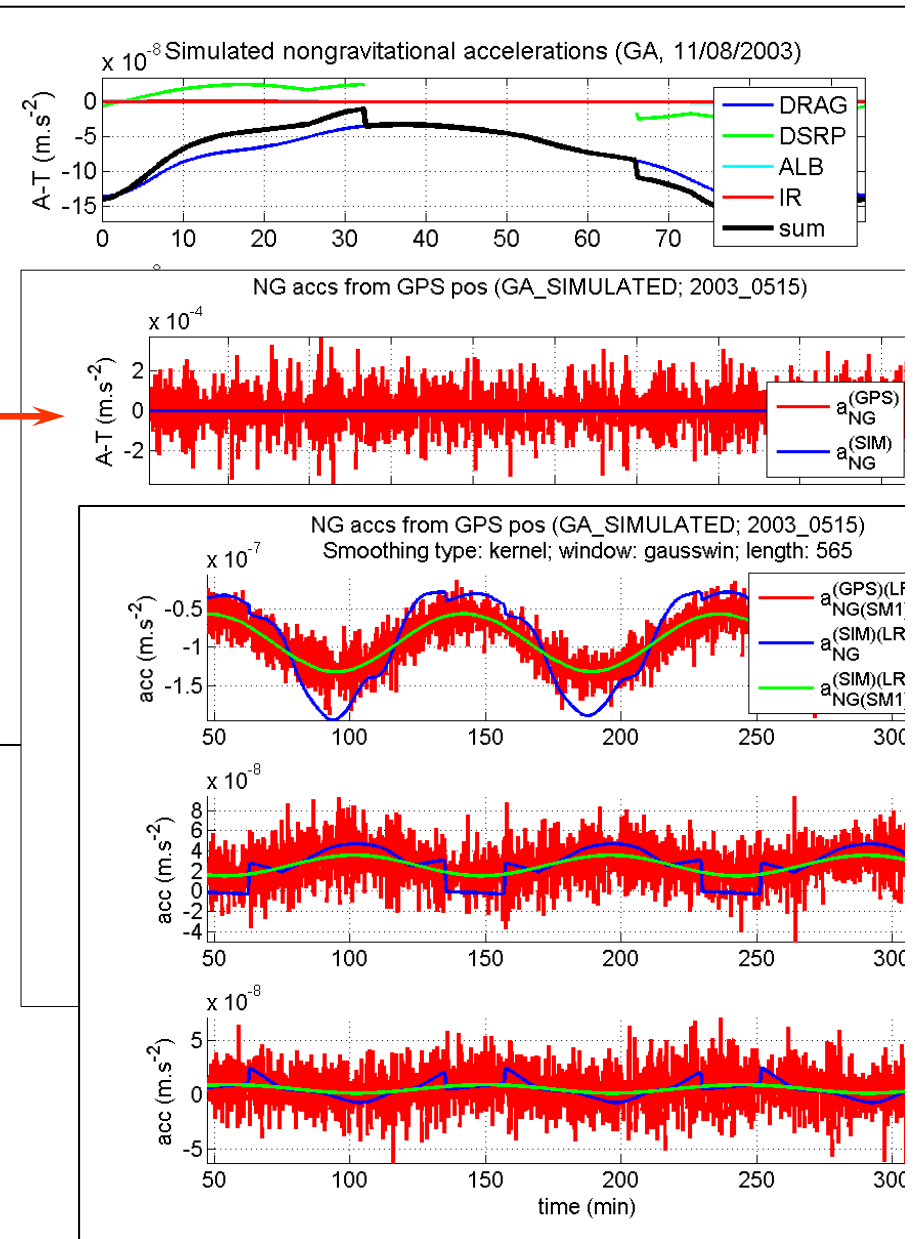
$$\mathbf{a}_{\text{NG}}^{(\text{GPS})} = \mathbf{B} + \mathbf{S} \cdot \mathbf{a}_{\text{ACC}}^{(\text{UNCAL})} + \boldsymbol{\varepsilon} \quad (*)$$

- **Calibration standard**: GPS-based NG accelerations, $\mathbf{a}_{\text{NG}}^{(\text{GPS})} = \mathbf{a}^{(\text{GPS})} - \mathbf{a}_{\text{GRAV}}$
- Assumption: uncertainty in modelled accelerations of gravitational origin
$$\mathbf{a}_{\text{GRAV}} = \mathbf{a}_{\text{geop}} + \mathbf{a}_{\text{LS}} + \mathbf{a}_{\text{TID}} + \mathbf{a}_{\text{REL}}$$
 is negligible relative to that of $\mathbf{a}^{(\text{GPS})}$
- Problem: Numerical derivative amplifies noise in GPS positions
 - Solution: **Generalized least squares (GLS)**
→ linear transformation of system (*)
- Problem: Real data → GPS positions have correlated errors
 - Solution: **partial autocorrelation function (PACF) → autoregressive model (AR)**
→ linear transformation of system (*)
- Solving transformed system (*) we get calibration parameters **B/S** by ordinary least squares.

¹ASU...Astronomical Institute ASCR

Problem of amplified noise

- Accelerations: $d^2\mathbf{r}/dt^2 \approx \mathbf{a}^{(\text{GPS})} \equiv \mathbf{F} * \mathbf{r}$
- The **second derivative filter F** amplifies the noise in the GPS positions, especially **high-frequency noise**
- Figs: example for nongravitational forces, the “true” signal $\mathbf{a}^{(\text{SIM})}_{\text{NG}}$ is buried in noise
- Moreover, through the action of filter **F**, the noise become also **autocorrelated**
- **Smoothing** is a possible way out, but:
 - further autocorrelation of residuals
 - signal is heavily smoothed too

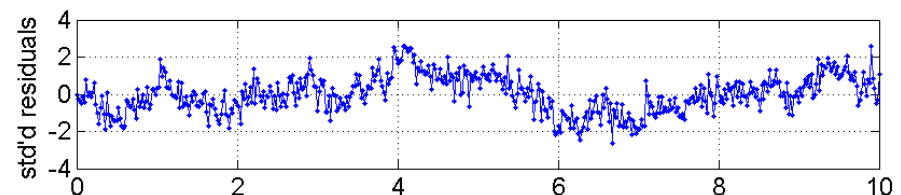
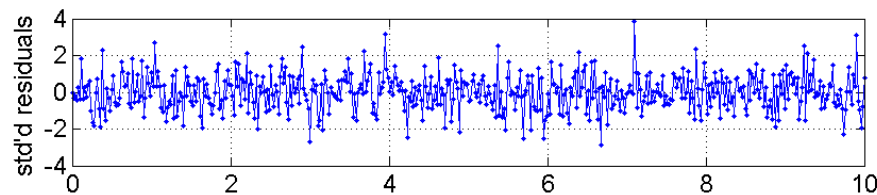


Problem of autocorrelated noise

Linear system of observation equations to estimate calibration parameters B/S:

$$\mathbf{a}_{\text{NG}}^{(\text{GPS})} = \mathbf{B} + \mathbf{S} \cdot \mathbf{a}_{\text{ACC}}^{(\text{UNCAL})} + \boldsymbol{\varepsilon} \quad (*)$$

- **Ordinary least squares** (OLS) provide **correct** uncertainty estimates for the fitted parameters (usual "3- σ rule"), if the errors $\boldsymbol{\varepsilon}$ are **independent** and **normally** distributed
- If the random **errors** are **positively correlated**
 - **uncertainty** in the fitted parameters is **underestimated**
 - overly optimistic accuracy estimates
- In Eq. (*) filter **F** generates a correlation structure of random noise in $\mathbf{a}_{\text{NG}}^{(\text{GPS})}$



Generalized least squares (GLS)

- Autocorrelated errors in OLS problem → non-diagonal covariance matrix $C \neq \sigma^2 I$
- **GLS** defines **linear transformation**: $W = T^{-1}$, where $C = TT'$ (T ... “square root” of C)
→ new covariance matrix is diagonal
- In transformed variables, OLS may now be used
 - correct estimates of mean values and uncertainties of the parameters
 - correct estimates of confidence intervals
- In statistics, GLS estimator is also called the **Aitken estimator**
- Sometimes the GLS method is already “contained” in **Gauss-Markov theorem** when using weight matrix $P = C^{-1}$

Use of GLS to remove autocorrelation and HF noise

Linear system of observation equations to estimate calibration parameters B/S:

$$\mathbf{a}_{\text{NG}}^{(\text{GPS})} = \mathbf{B} + \mathbf{S} \cdot \mathbf{a}_{\text{ACC}}^{(\text{UNCAL})} + \boldsymbol{\varepsilon} \quad (*)$$

- In fact, **non-diagonal covariance** matrix was **generated by** the second derivative **filter** F : $C = \sigma^2 FF'$, where σ^2 is the variance of the white noise in GPS positions
 - finding the **GLS transformation matrix** is straightforward: $\mathbf{W} = \mathbf{F}^{-1}$
- $\mathbf{W} = \mathbf{F}^{-1}$ is inverse to second derivative filter → application of \mathbf{W} is “double integral”
- Effectively, we got back into the positions, but now with known part of signal removed
- After applying the GLS transformation \mathbf{W} to eq. (*):
 - the residuals become again uncorrelated
 - the variance σ^2 of **noise in GPS positions** may be **estimated**
 - high-frequency **noise amplification** is **eliminated**

Decorrelation of GPS position errors using AR process

Problem: Real GPS positions have correlated errors

- Indicated by sample autocorrelation function ACF

Partial autocorrelation function PACF

Rapid decay of PACF → suitability of AR model to represent the correlation structure

- In figure, fitted **autoregressive model AR** of order 4 approximates ACF of residuals

Decorrelation of residuals using fitted AR models

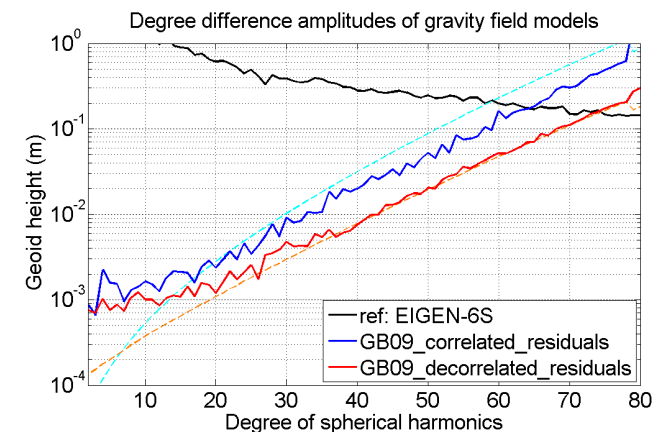
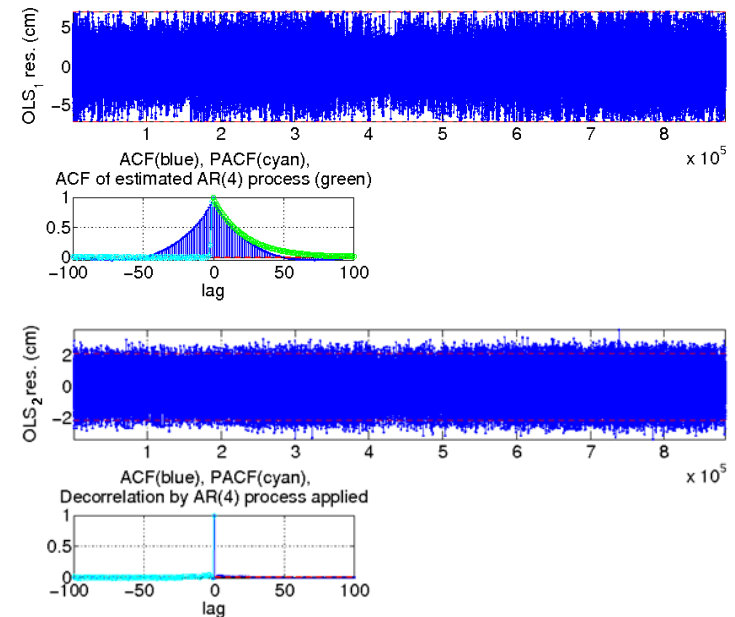
- by linear transformation of calibration system (*)
- ACF and PACF become approx. delta functions

Calibration parameters B/S have realistic error bars

- **Correct** estimates of **ACC data uncertainty!**

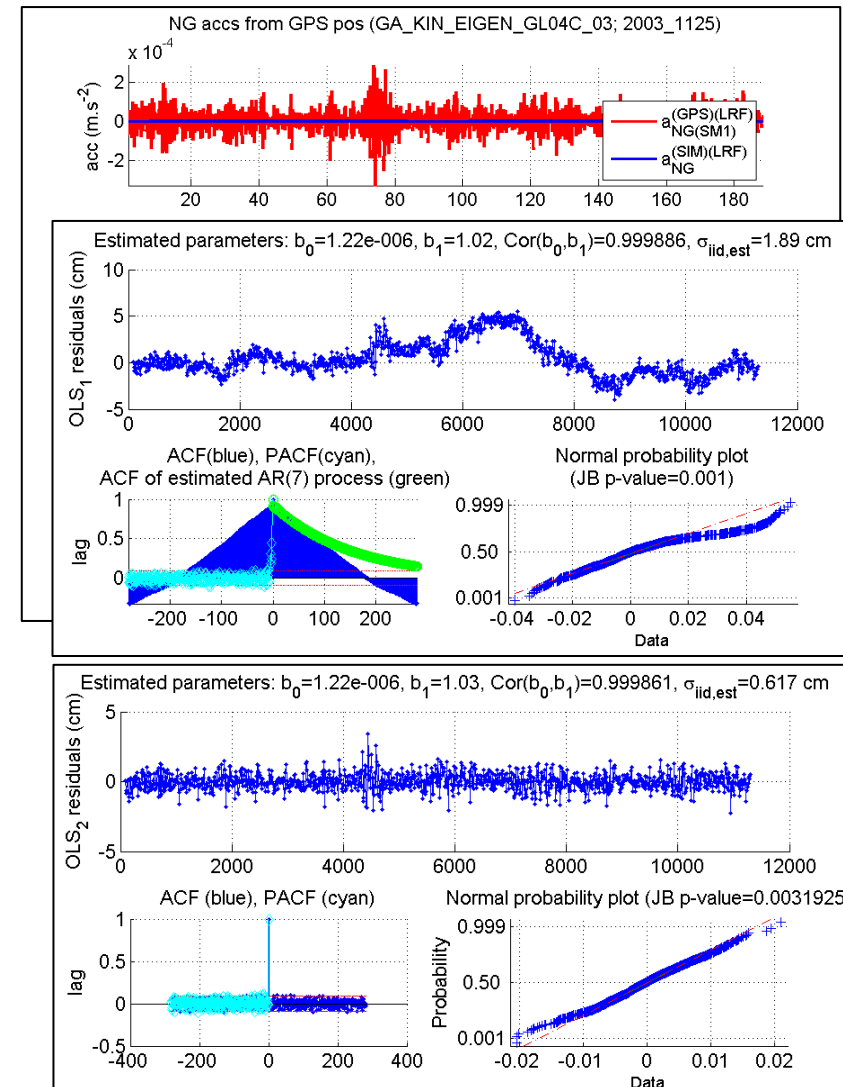
Estimation of geopotential coefficients GC

- After decorrelation, GC are **more accurate** by factor 2–3!
- More realistic uncertainty estimate of GC



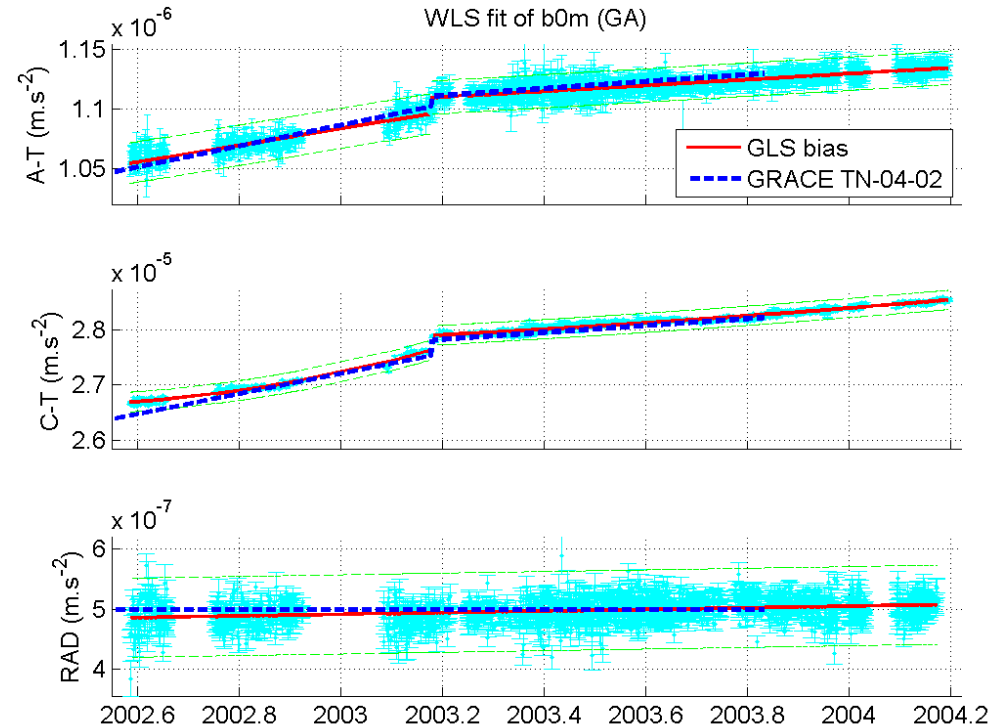
Real data: calibration of GRACE accelerometers

- Period of two satellite revolutions
- Amplification of noise due to second derivative
- Residuals after first linear transformations
- Errors in GPS positions of few cm
- Obvious autocorrelation (sample ACF)
- PACF falls down quickly
→ we estimated AR process of order 7
- Residuals after second linear transformation derived from fitted AR(7) process
- Both ACF and PACF now indicate that residuals become uncorrelated



Calibration of 1.5 years of GRACE accelerometers data

- Due to a large bias B , the calibration parameters B and S are highly correlated
- We set S fixed after GRACE TN-04-02
→ bias offsets have similar time evolution



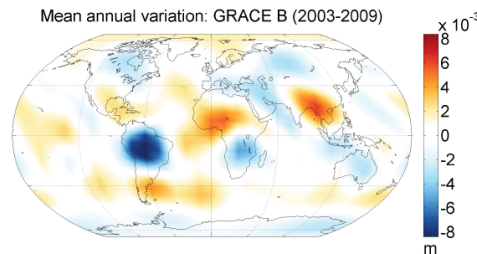
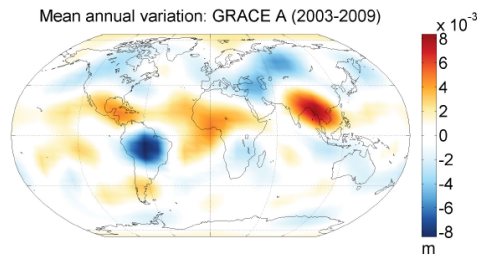
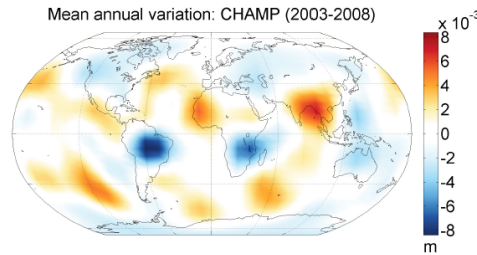
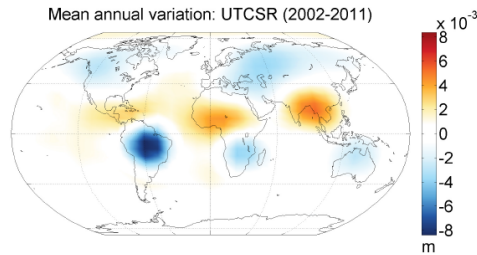
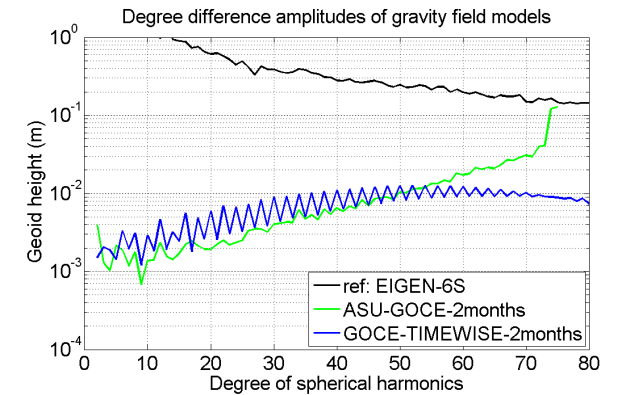
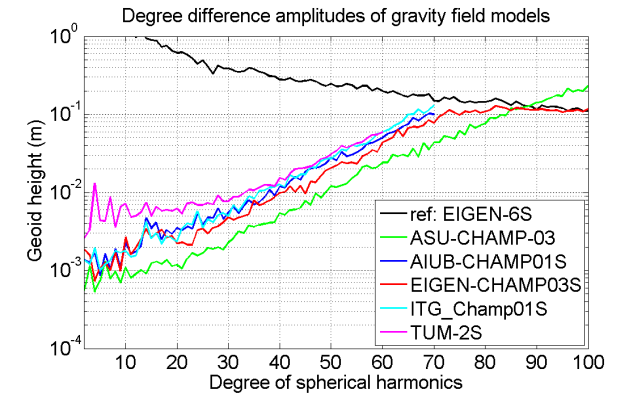
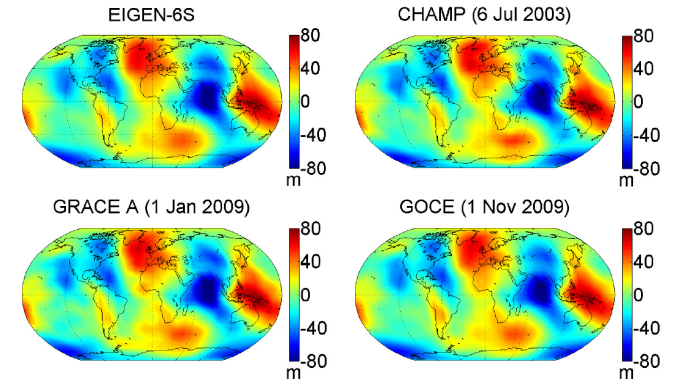
Further information

- <http://www.asu.cas.cz/~bezdek/vyzkum/>
- Bezděk A, 2010. Calibration of accelerometers aboard GRACE satellites by comparison with POD-based nongravitational accelerations. *Journal of Geodynamics* 50, 410–423.

Gravity field models from orbits of CHAMP, GRACE, GOCE

Examples of successful application of the presented calibration method to estimate geopotential coefficients.

- One-day solutions
- CHAMP yearly solution for 2003
- GOCE two-month solution
- Average hydrological signal in CHAMP and GRACE solutions over 7 years (time-variable gravity)



Contribution to SWARM validation activities

Pertinent Level-2 products

- ACCxCAL_2_: Accelerometer calibration parameters for all three SWARM satellites
- ACCx_AE_2_: Time series of calibrated accelerometer data
- Level 2 precise kinematic orbits

The presented ACC calibration method

- Independent assessment of ACC calibration parameters
- Output: calibrated ACC measurements together with realistic uncertainty estimates
- Implemented solely by our team, independent of any other orbital sw package
- Was tested using real-world ACC data of CHAMP and GRACE with positive results
- No special manoeuvres are necessary, method is applicable during science free-fall regime
- During routine phase: it may operate offline (CAT-1 algorithm)

Apart from calibrating ACC data, we will compute **SWARM-only gravity field models**

Thank you for your attention