# **Recovery of residual GRACE-observations by radial base functions** MARKUS ANTONI, Wolfgang Keller, Matthias Weigelt

### Abstract

Gravity fields are mainly represented in spherical harmonics, which causes problems in the regional improvement. Therefore the signal and the model are separated into a global and a local part, by subtracting a synthetic observation of a reference field from the measurement. The residual signal is analyzed by radial base functions, each of them described by a scale factor, a shape parameter and a position. To avoid an over-parametrization a non-linear algorithm is used to optimize these parameters for a minimal number of base function.

### **1. Optimized radial base functions**

THE potential of a radial base function in the (earthfixed) orbit  $\vec{x}_e$  can be described by a sum of Legendre polynomials [1]:

$$\Psi_b(\vec{x}_e, \psi_b) = \eta_b \frac{GM}{R} \sum_{n=0}^{\tilde{N}} \left(\frac{R}{r}\right)^{n+1} \sigma_b(n) P_n(\cos \varpi_b) \quad (1)$$

The argument  $\psi_b$  contains the parameter  $\eta_b$  (scale factor),  $\sigma_b(n)$  (shape-parameter), and the position of the center  $(\lambda_b, \vartheta_b)$ . Latter one is hidden in the spherical distance  $\varpi_b$ between center and calculating point. For the shape parameter an exponential model  $\sigma_b(n) = \sigma_b^n$  is chosen, so that the behavior is described by a single value per base function.

Two kinds of observations are modeled in the study:

• the energy integral, where the residual potential  $\delta T$  in the orbit is calculated by the superposition:

$$\delta T(\vec{x}_e, \psi_1, \psi_2, ..., \psi_B) = \sum_{b=1}^B \Psi_b(\vec{x}_e, \psi_b)$$
 (2)

• the line-of-sight gradient (LOS), i.e. second derivate in flight direction of GRACE, which is generated by applying the differential operator

$$\frac{1}{a^2}\frac{\partial^2}{\partial u^2} + \frac{1}{a}\frac{\partial}{\partial r}$$
(3)

to the field  $\delta T$ , using the argument of latitude u and the semi-major axis a of the Kepler-ellipse [2, 3].

Both kind of observations can be described pointwise as function of the unknown parameters  $\psi_b$  and in closed formulas, if the orbit integration is done in a previous step.

#### 2. Methodology

IN order to optimize the parameters of the base functions, the following steps are necessary (cf. figure 1):

- . calculating a residual signal by subtracting a synthetic observation of the reference field
- 2. finding initial positions and shape parameters
- 3. linear adjustment to estimate proper scale factors
- 4. nonlinear Levenberg-Marquardt algorithm to optimize all parameters
- 5. comparing/subtracting the residual signal and the approximation
- 6. repetition of the steps 2-6 until the approximation is "'good enough"'
- 7. removing non accepted base functions and linear adjustment of the scale factor of the remaining ones



# **Figure 1:** Workflow of the nonlinear optimization

For pointwise observations the position of additional radial base functions should be evident in the orbit as well. In several simulations it turned out that the best localization is close to the maxima and minima of the residual signal. Therefore the data are interpolated and smoothed in the orbit to find the initial positions of a small number of base functions.

### 3. Simulated observations

THE approach is tested by a GRACE-like scenario, using the EGM96 up to degree N = 150 as reference field. Before the orbit integration some additional radial base functions added to the field in terms of sphericalharmonic coefficients, to generate a disturbed signal.

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Geodetic Institute, University of Stuttgart markus.antoni@gis.uni-stuttgart.de



**Figure 2:** Residual signal caused by 4 base functions

Figure 2(a) illustrates the residual potential on the ground caused by four additional base functions, while the effects in the orbit are shown in the figures 2(b) and 2(c).

# 4. Results and outlook

 $\blacktriangle$  FTER the optimization the parameters  $\psi_b$  can be used **H** to calculate an approximation of the observation in the orbit and the potential on the ground. By comparing the signal and the approximation in orbit, the best solution is achieved by the energy integral (cf. table 1). One reason is the clearly separated signal of the disturbing radial base functions in the orbit, so that the initial values are very good. The solution of the LOS-gradient suffers from the insensitiveness across the flight direction and an unsolved ambiguity. Nevertheless the correlation coefficient in the orbit is already 0.97 and can be improved by using a second iteration.

	Potential	LOS-gradient	LOS-gradient
	$\left[\frac{\mathrm{m}^2}{\mathrm{s}^2}\right]$	(1.step)[E]	(2.steps)[E]
max(signal)	$4.89 \times 10^{-1}$	$5.11 \times 10^{-3}$	$5.11 \times 10^{-3}$
min(signal)	$-5.84 \times 10^{-1}$	$-3.66 \times 10^{-3}$	$-3.66 \times 10^{-3}$
mean(signal)	$-3.46 \times 10^{-2}$	$8.89 \times 10^{-5}$	$8.89 \times 10^{-5}$
std(signal)	$2.03 \times 10^{-1}$	$1.28 \times 10^{-3}$	$1.28 \times 10^{-3}$
max(diff.)	$5.87 \times 10^{-7}$	$9.07 \times 10^{-4}$	$1.81 \times 10^{-4}$
min(diff.)	$-7.10 \times 10^{-7}$	$-1.21 \times 10^{-3}$	$-1.88 \times 10^{-4}$
mean(diff.)	$4.85 \times 10^{-10}$	$-1.51 \times 10^{-5}$	$-3.22 \times 10^{-7}$
std(diff.)	$1.86 \times 10^{-7}$	$2.87\times10^{-4}$	$3.30 \times 10^{-5}$
correlation	1.0000	0.9746	0.9997

Table 1: Analysis of the signal and the difference (diff.) to the approximation in the orbit

The difference between the estimated and the simulated potential on the ground is shown in figure 3 and analyzed in table 2 in more details.







(a) energy integral

(b) LOS-gradient 1. step

(c) LOS-gradient 2. step

Figure 3: Difference between the simulated and the estimated potential on the ground

	Potential	LOS-gradient (1.step)	LOS-gradient (2.steps)
max(diff.)	$2.49 \times 10^{-6}$	$2.52 \times 10^0$	$1.23 \times 10^{0}$
min(diff.)	$-1.68 \times 10^{-6}$	$-1.23 \times 10^0$	$-7.84 \times 10^{-1}$
mean(diff.)	$-7.06 \times 10^{-9}$	$4.02 \times 10^{-2}$	$3.62 \times 10^{-3}$
std(diff.)	$3.52 \times 10^{-7}$	$3.70 \times 10^{-1}$	$1.26 \times 10^{-1}$
correlation	1.0000	0.9272	0.9912

**Table 2:** Difference between the estimated and the simulated potential on the ground, compared to the real field (min = -5.7, max = 3.6, std =  $9.4 \times 10^{-1}$  and mean  $= -4.9 \times 10^{-2}$ )

The calculating time is less then 3 minutes for all optimizations and can be neglected compared to effort of the orbit integration. Another remarkable point is the small number of base functions for the approximation and the distances  $\rho$  between the positions of the simulated and the estimated base functions (cf. table 3).

Potential	LOS-gradient (1.step)	LOS-gradient (2.steps)
30 <b>s</b>	38 <b>S</b>	153 <b>s</b>
8	9	9 + 16
4	5	20
0.00 - 0.14	0.30 - 8.83	0.08 - 0.47
	Potential 30 s 8 4 0.00 - 0.14	Potential LOS-gradient (1.step)   30 s 38 s   8 9   4 5   0.00 - 0.14 0.30 - 8.83

**Table 3:** Performance for the example of 3750 data points and a maximal degree of  $\tilde{N} = 100$ 

#### **References**

- [1] A. Eicker: Gravity Field Refinement by Radial Basis Functions from In-situ Satellite Data, PhD thesis, Rheinische Friedrich-Wilhelms-Universitt Bonn, 2008
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