

WP5 NRT & Regional Service – Results and Achievements by GFZ and TUG

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EGSIEM Final Review Meeting

Bern, 08.02.2018

Outline

- NRT Service - Implementation Phase
 - Improved Daily GRACE Time Series
 - Pre-operational Simulations

- NRT Service - Operational Phase
 - Results of the Operational Test Run
 - Reanalysis

- Summary And Outlook



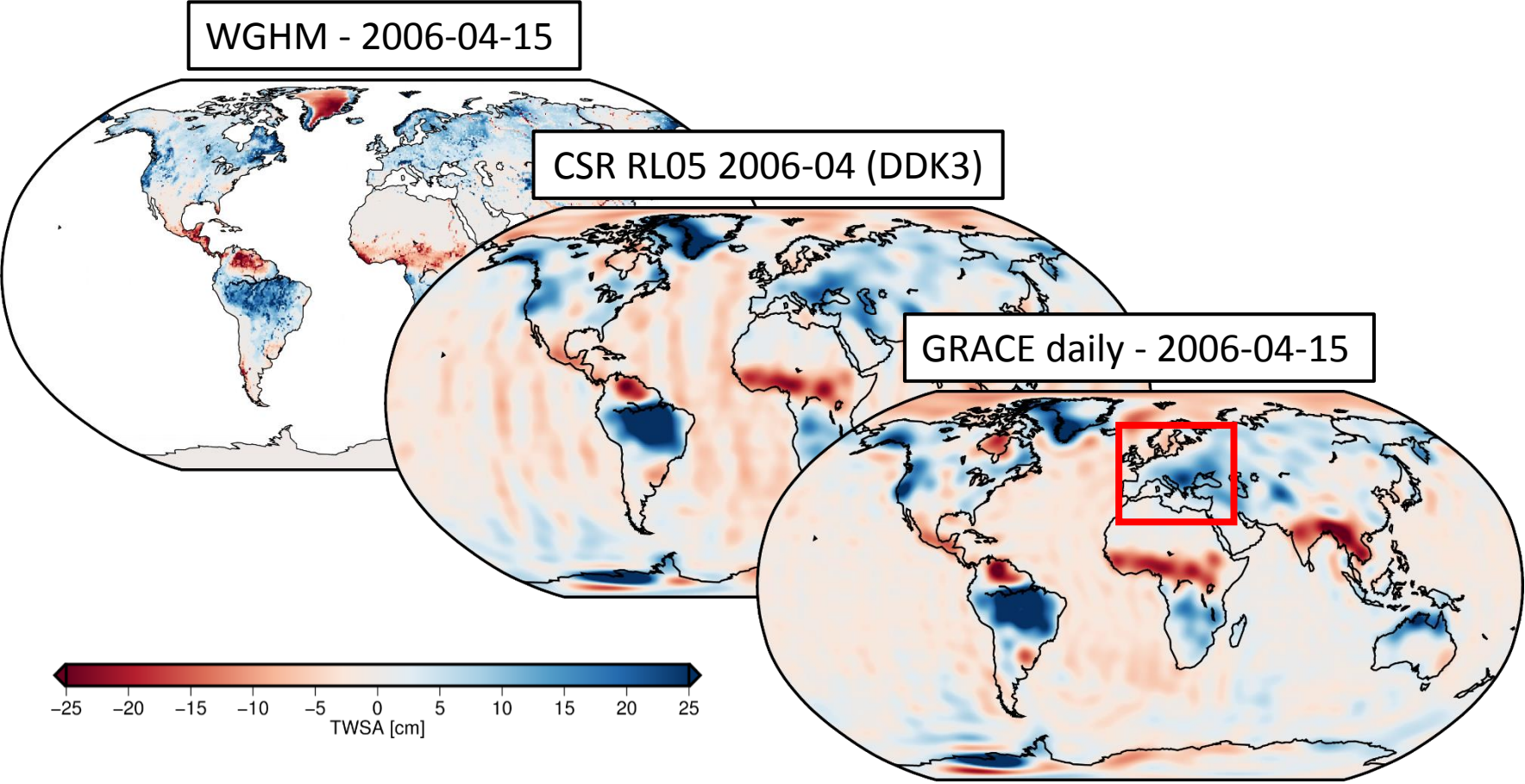
NRT Service – Results of the Implementation Phase



Implementation Phase - Introduction and Objectives

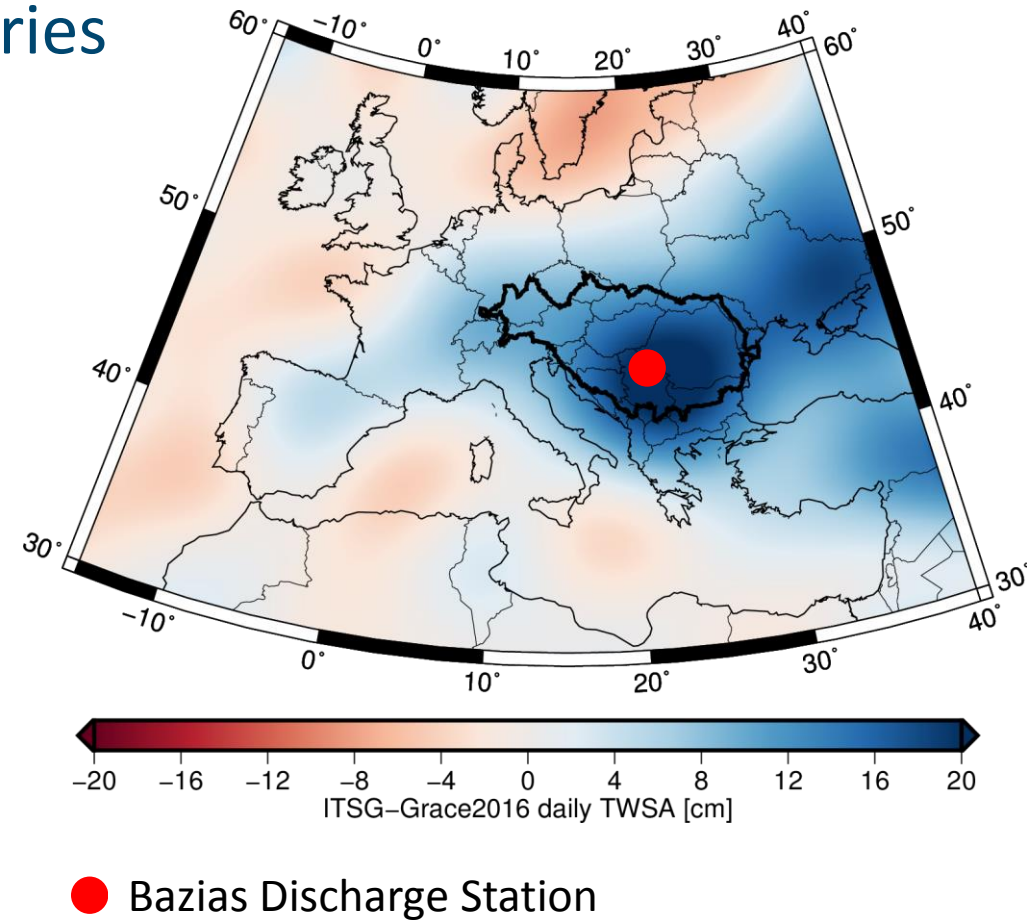
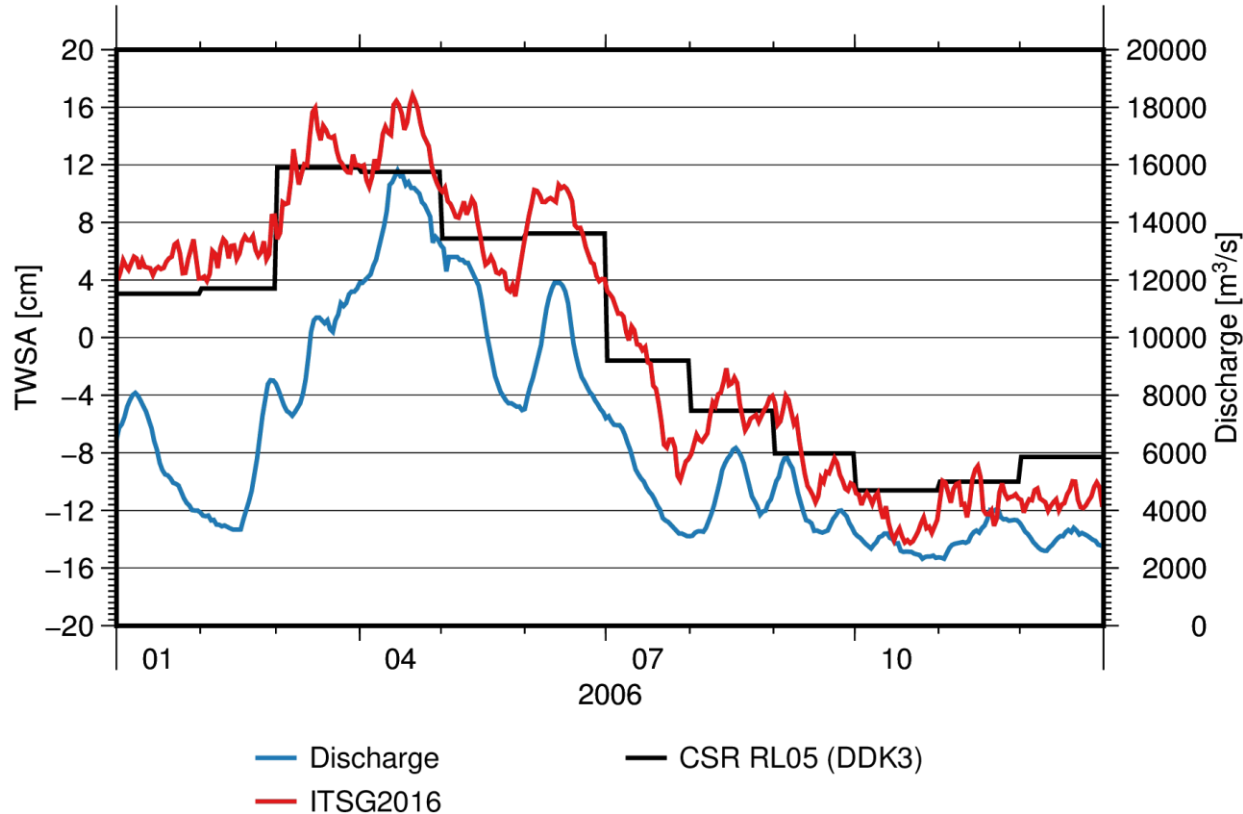
- Main objective of the NRT Service implementation phase were:
 - the development and improvement of methods to infer high frequency mass variations from GRACE
 - implementation of automation frameworks which allow the production of robust mass variation data in near real-time
- Additionally, a simulation study was conducted to quantify the impact of the degrading satellite health during the operational service test run

Implementation Phase – Post-processing time series



Implementation Phase – Post-processing time series

- Comparison of GRACE monthly and daily solutions with in-situ data
 - Discharge measurements at Bazias station during the 2006 Danube Flood

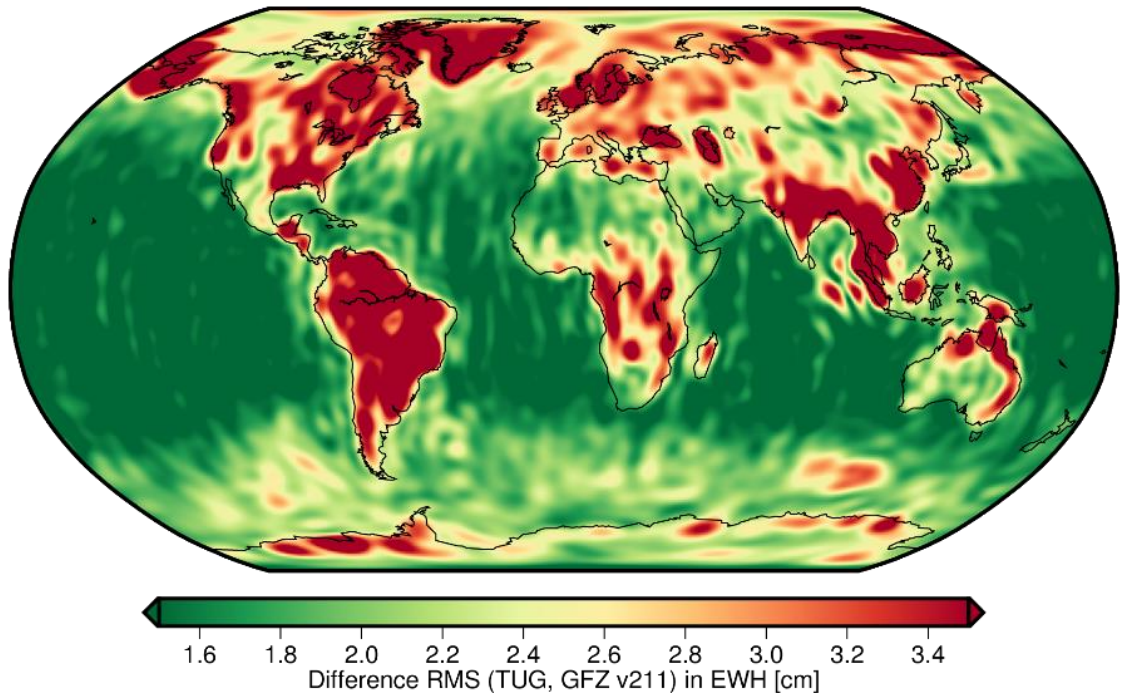
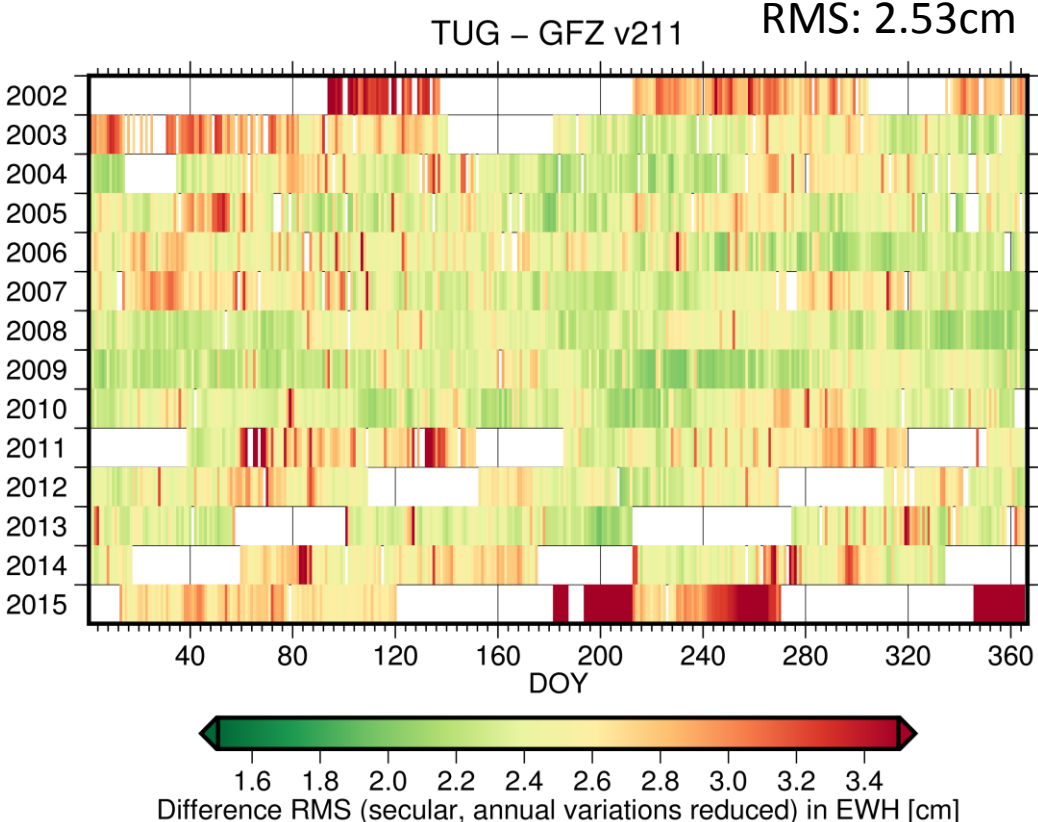


Implementation Phase – Post-processing time series

- Both GFZ and TUG produced post-processing time series to evaluate their approaches in preparation of the service run
 - GFZ focused on alternative representations of the gravity field in conjunction with a time varying Kalman filter approach
 - TUG focused on the derivation of the spatiotemporal constraints required for the Kalman filter approach
- While both centers rely on the same input data, the approaches are very different and hence should produce sufficiently independent solutions
- Both time series are available from the institutes web sites, as well a public portals such as ICGEM and have been used by the (hydrological) scientific community
- To ensure robust daily gravity time series, we checked that there is:
 - Consistency between both analysis centers (AC)
 - Good agreement with external data – GNSS displacements, ocean bottom pressure

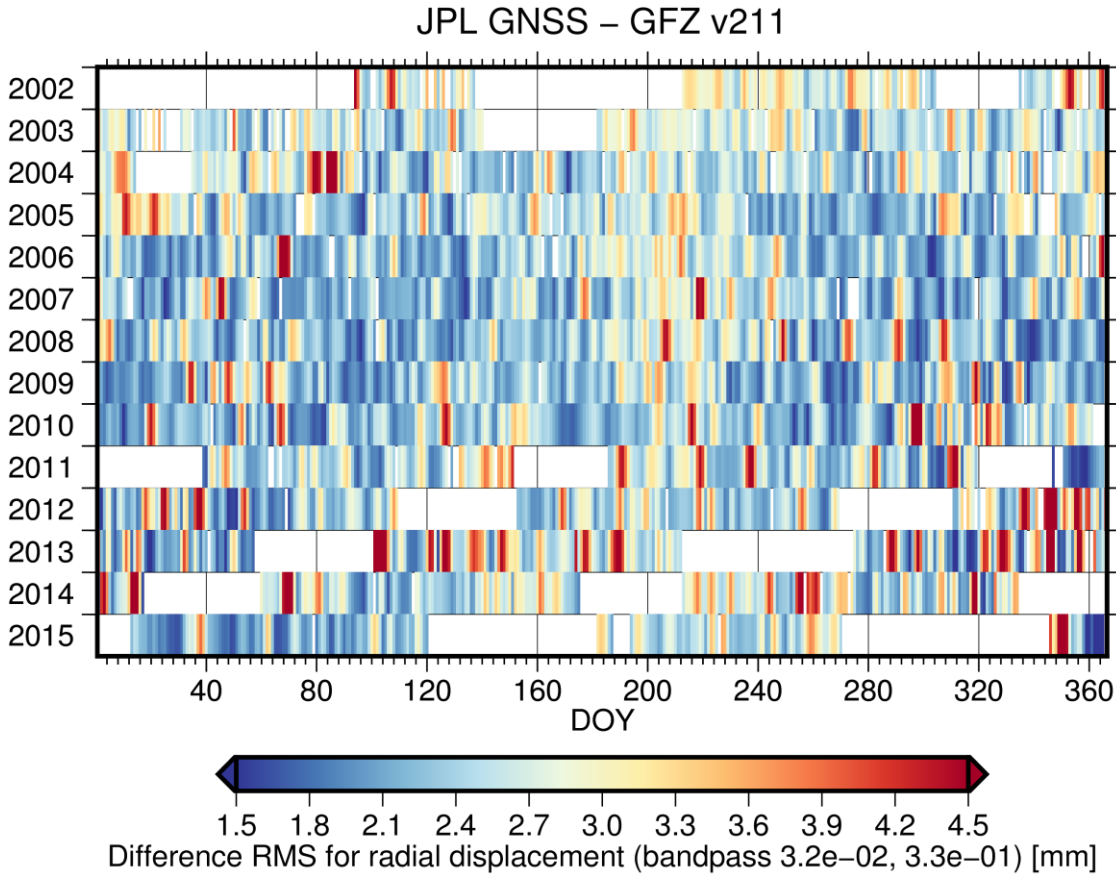
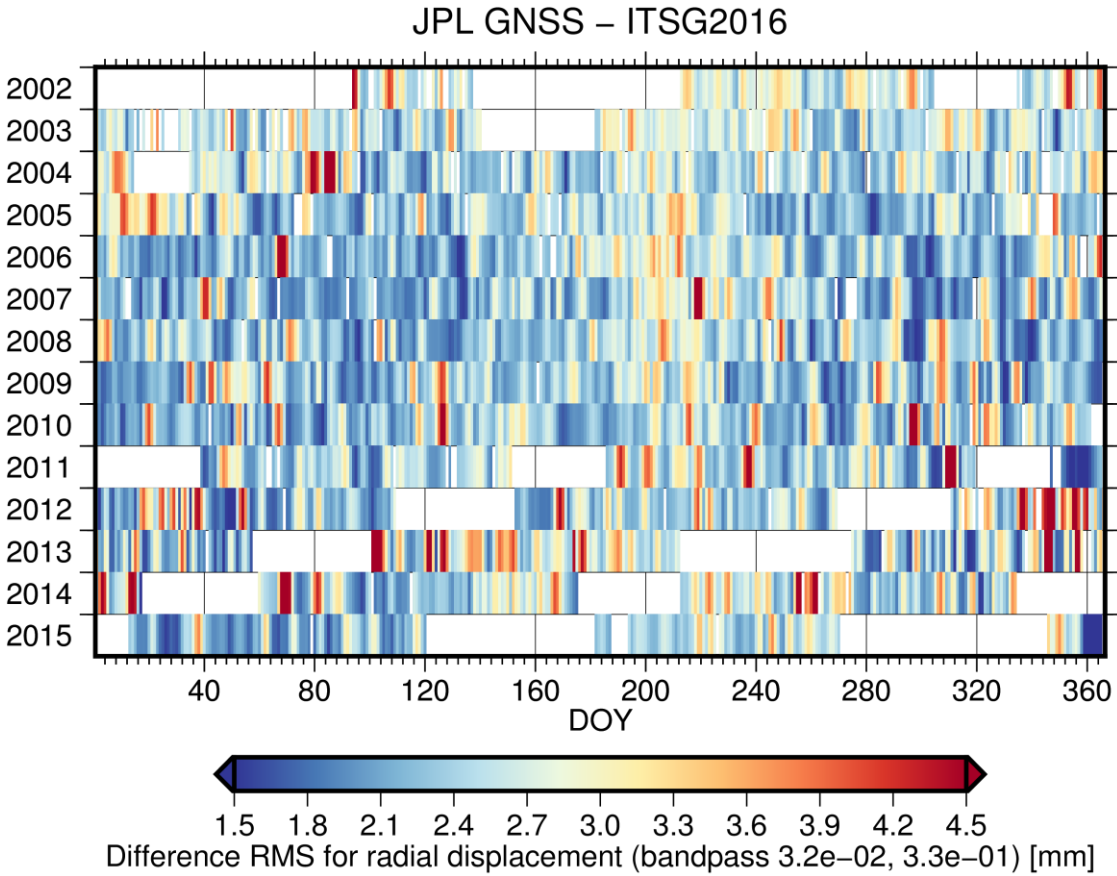
Implementation Phase – Post-processing time series

- Intercomparison of historical time series



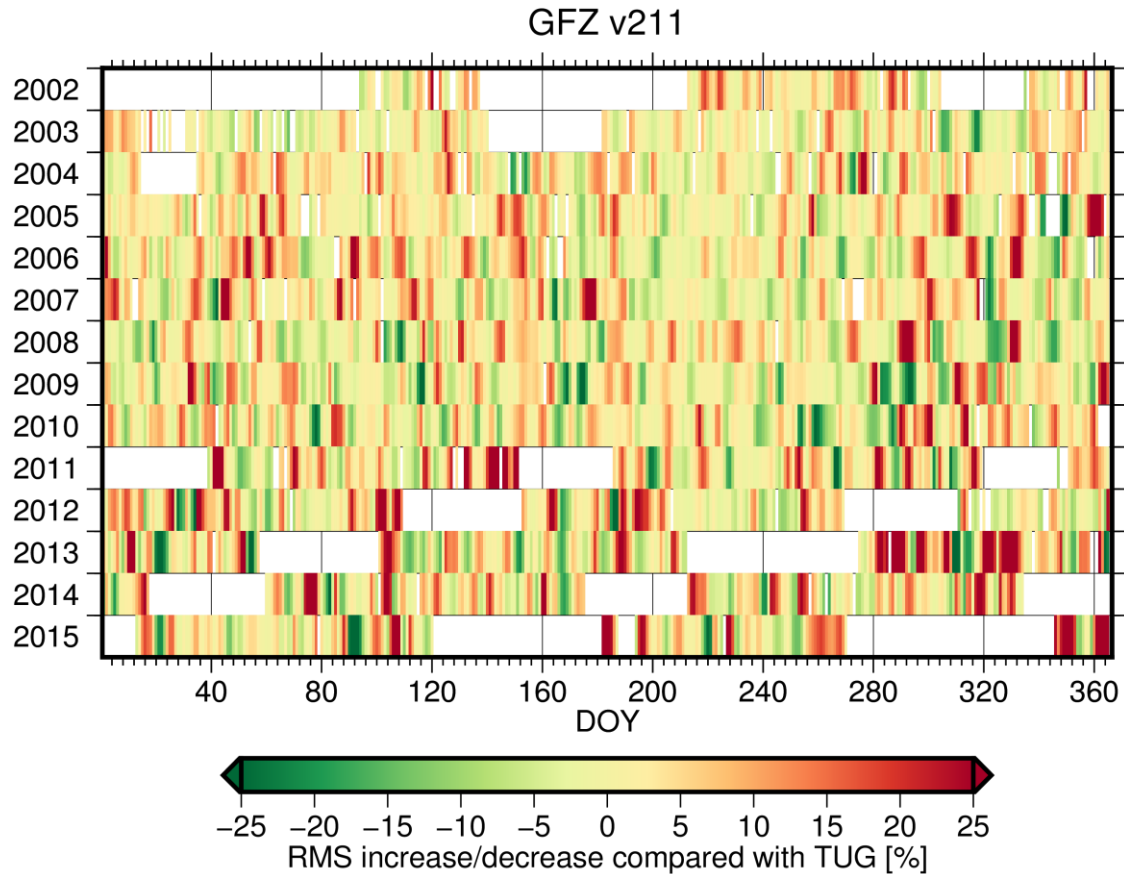
Implementation Phase – Post-processing time series

- Comparison with GNSS displacements:



Implementation Phase – Post-processing time series

- Comparison with GNSS displacements:

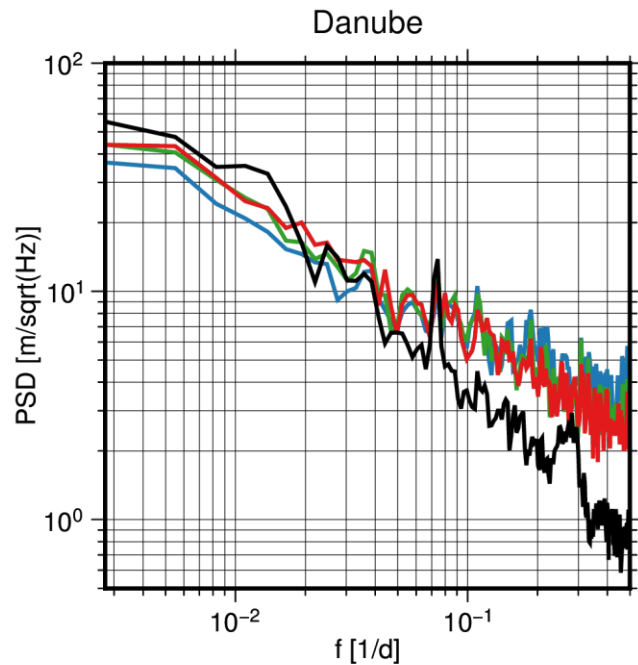


Average increase: 7.5%

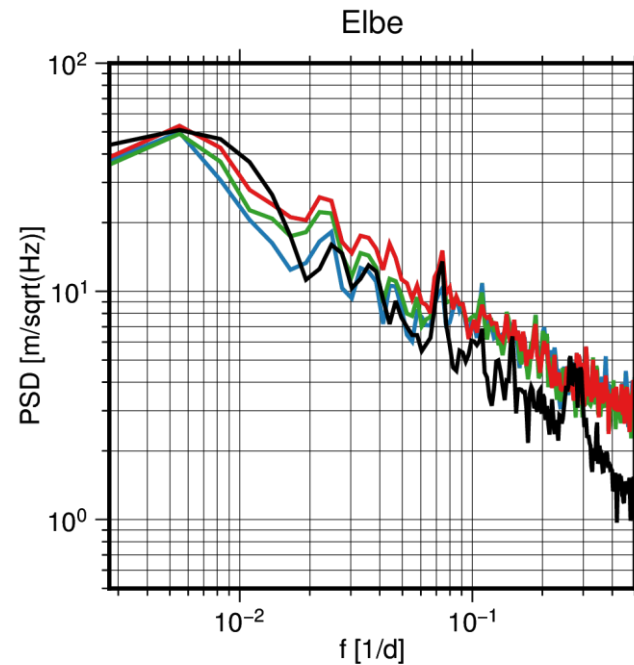
Radial Displacement RMS [mm]	Full time span	2004-2010
V211	2.67	2.57
ITSG2016	2.59	2.51

Implementation Phase – Post-processing time series

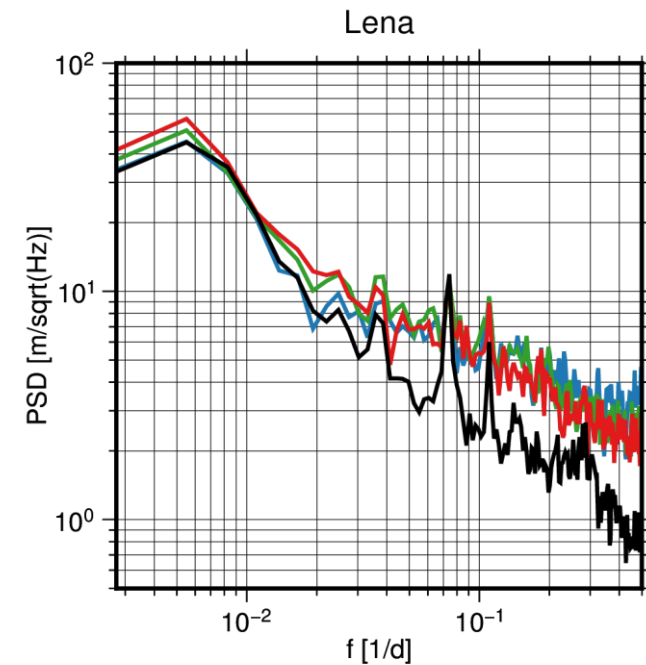
- Power spectral density for selected basins
 - Annual/secular variations removed
 - GFZ generally has more high frequency content → more signal, more noise



— v201 — v211
— v221 — ITSG



— v201 — v211
— v221 — ITSG



— v201 — v211
— v221 — ITSG

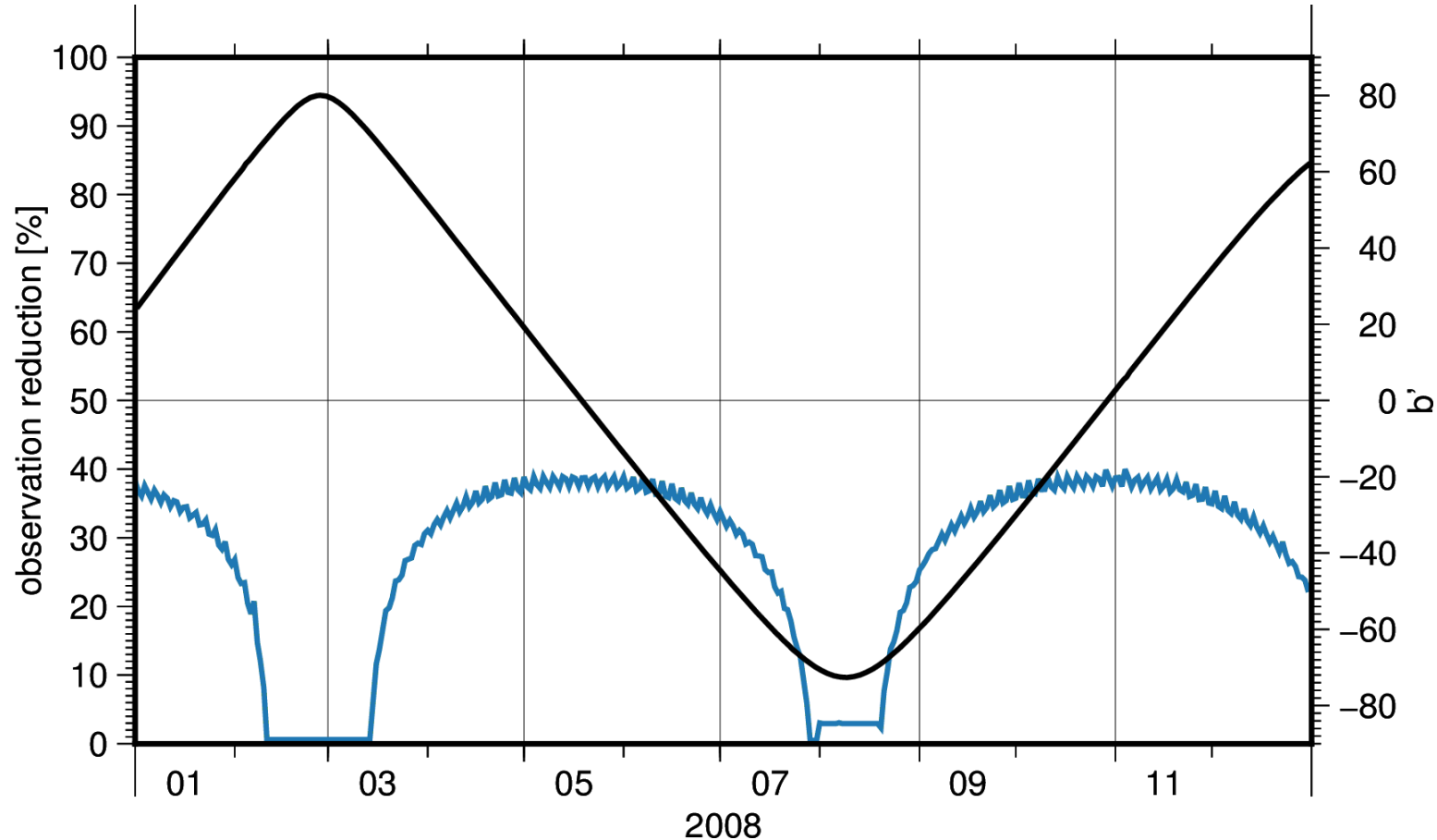
NRT Service – Pre-operational simulations

Implementation Phase – Pre-operational simulation

- The degrading satellite health – mainly the power supply aboard the spacecraft – required constraints for data collection
- During the operational service run it was expected that
 - Science data collection was only possible in full sunlight
 - No accelerometer data on GRACE-B would be available
- For the GRACE input data this meant that
 - Overall data volume would be reduced to about 60% in combination with systematic data gaps
 - Non-conservative forces on GRACE-B would have to be modelled by an “accelerometer transplant”
- To quantify the impact of these effects, a simulation study based on historic data was conducted
 - The standard L1B data was modified by applying the constraints above

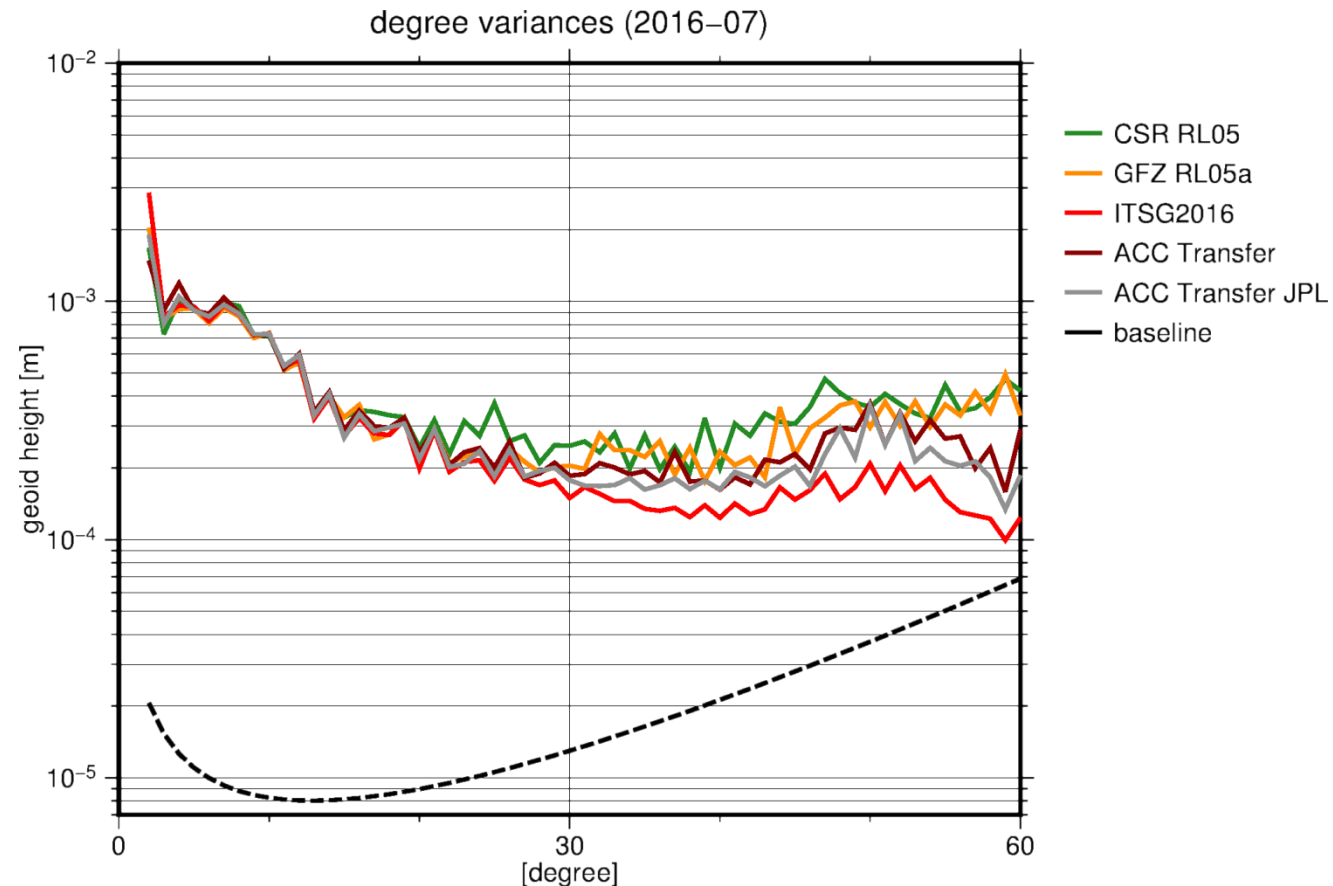
Implementation Phase – Pre-operational simulation

- The number of collected observations depends on the angle between the orbital plane and the sun
 - Low angles: the satellite dives into Earth's shadow
 - High angles: the full orbit is exposed to sunlight



Implementation Phase – Pre-operational simulation

- The “accelerometer transplant” shifts the measured non-conservative forces from GRACE-A to GRACE-B
 - Necessary steps: time shift, rotation, thruster event removal/restoration
 - Less accurate than actual measurements, but still better than models



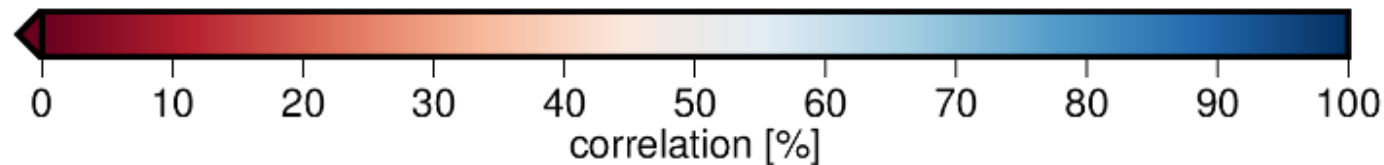
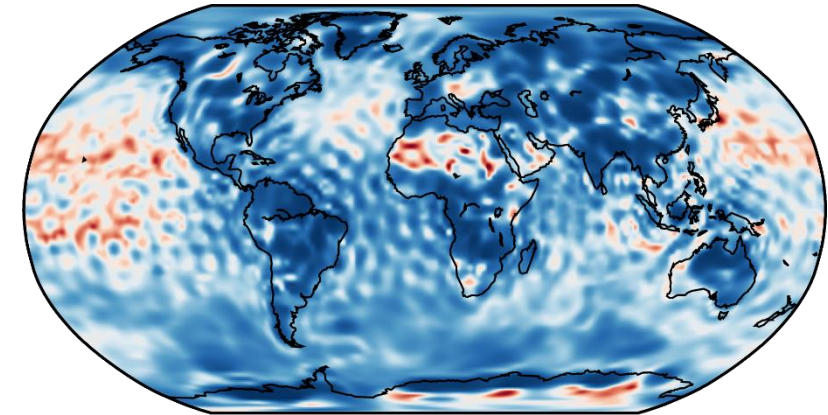
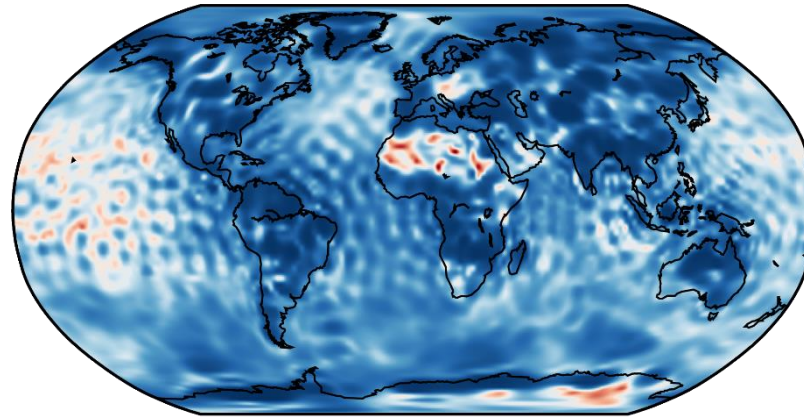
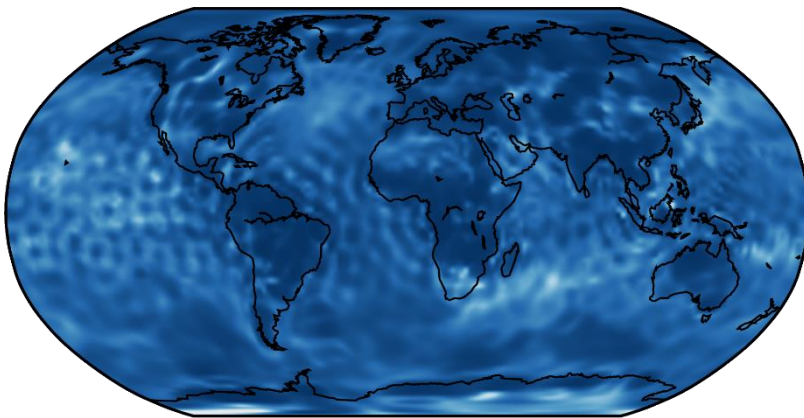
Implementation Phase – Pre-operational simulation

- Comparison of time series (annual cycle removed) for each of the constraints and the combined effect
 - The less GRACE information is available, the more the solution deviates from the reference
- However: in regions with large signals, a high correlation coefficient is retained

sun only

ACC transp.

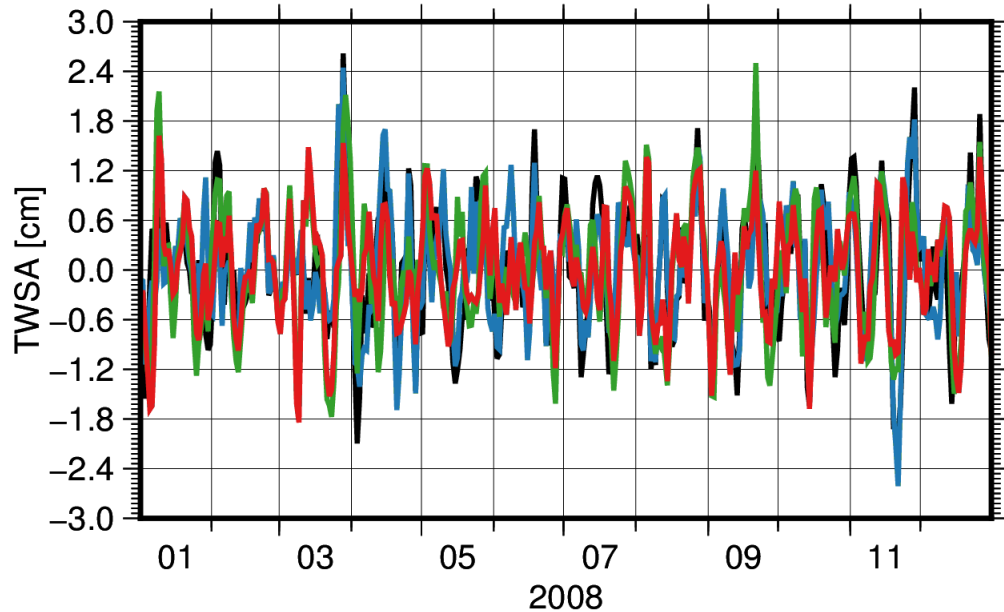
Combined effect



Implementation Phase – Pre-operational simulation

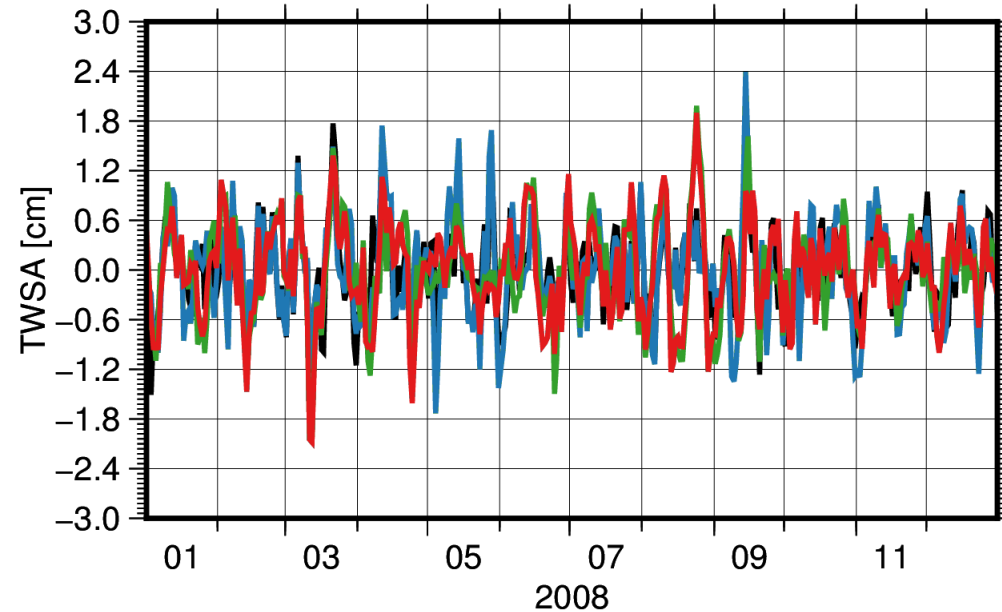
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Danube basin (31d highpass)



— ITSG2016 — sunlight only
— ACC Trans. — sun only + ACC Trans.

Mississippi basin (31d highpass)



— ITSG2016 — sunlight only
— ACC Trans. — sun only + ACC Trans.

Implementation Phase – Summary

- Both analysis centers improved their processing strategies for high frequency mass variations
- Result of these developments were post-processing time series which have been released to the public:
 - TUG: Daily time series as part of ITSG-Grace2016
 - GFZ: Standalone time series “GFZ v211”
- To quantify the impact of the degrading satellite health simulation studies, which investigated the (then) expected data characteristics, were conducted
 - These studies showed that, while a drop in quality compared to the “good” years was to be expected, hydrological signal should still be captured
 - Unfortunately, during the operational service run a change in satellite attitude made things trickier than expected

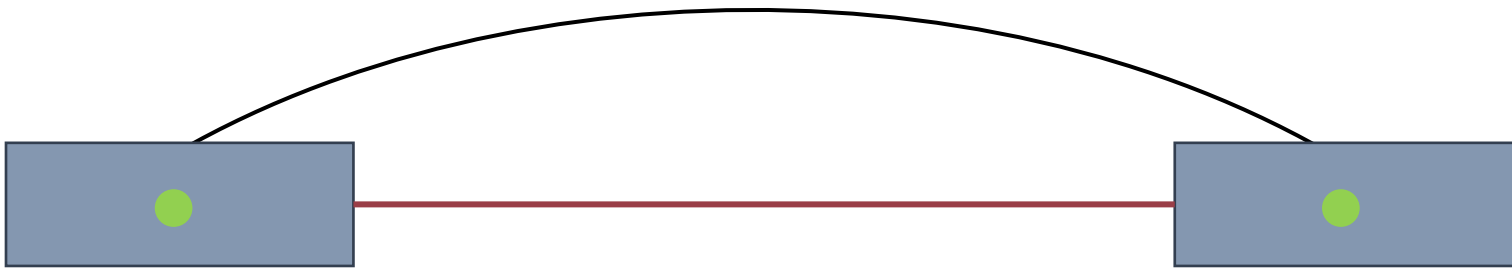
NRT Service – Results of the Operational Phase

Operational Phase – Results of the NRT Test Run

- The operational service test run was planned to run for six months starting on April 1
 - Aim was to produce daily water store grids with a maximum latency of five days as input for the Hydrological Service
- A battery cell failure on GRACE-B cut the test run short
 - Last measured epoch was June 29 – three months of daily solutions produced
- During the service run latency and availability of the input data was consistent
 - Single day data gaps in GRACE observations during attitude change manoeuvres
- GRACE data quality was also - mostly - consistent
 - Pitch bias removal deteriorated the solutions to some extent
 - Manoeuvre was unannounced, therefore on-the-fly adaptations to the processing chain became necessary

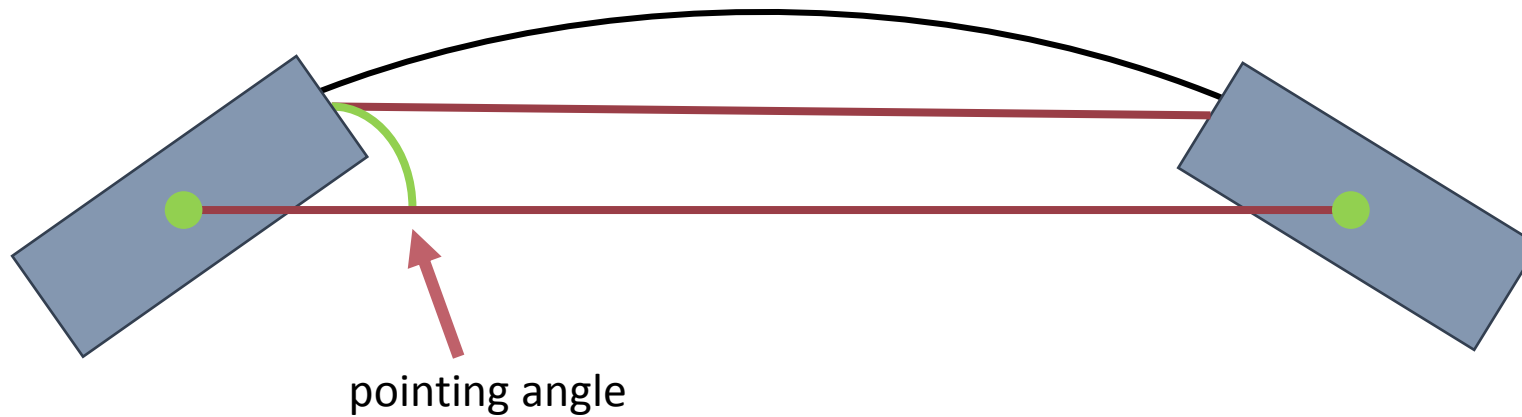
Operational Phase – Results of the NRT Test Run

- The removal of the pitch bias caused an increase in pointing angle of about 0.7 degrees
 - Attitude errors propagate into the ranging measurements more prominently



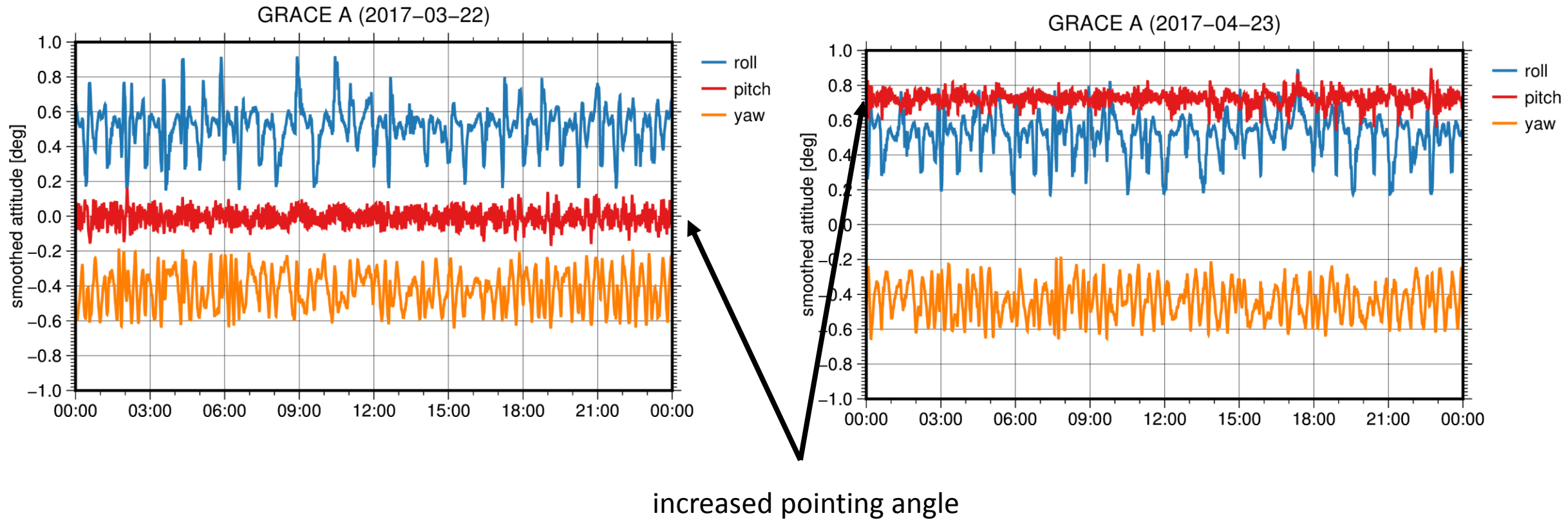
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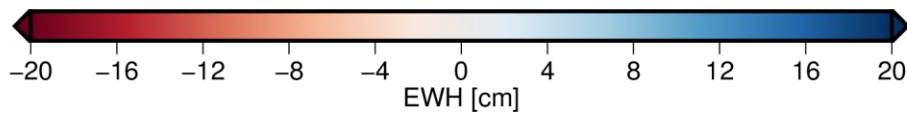
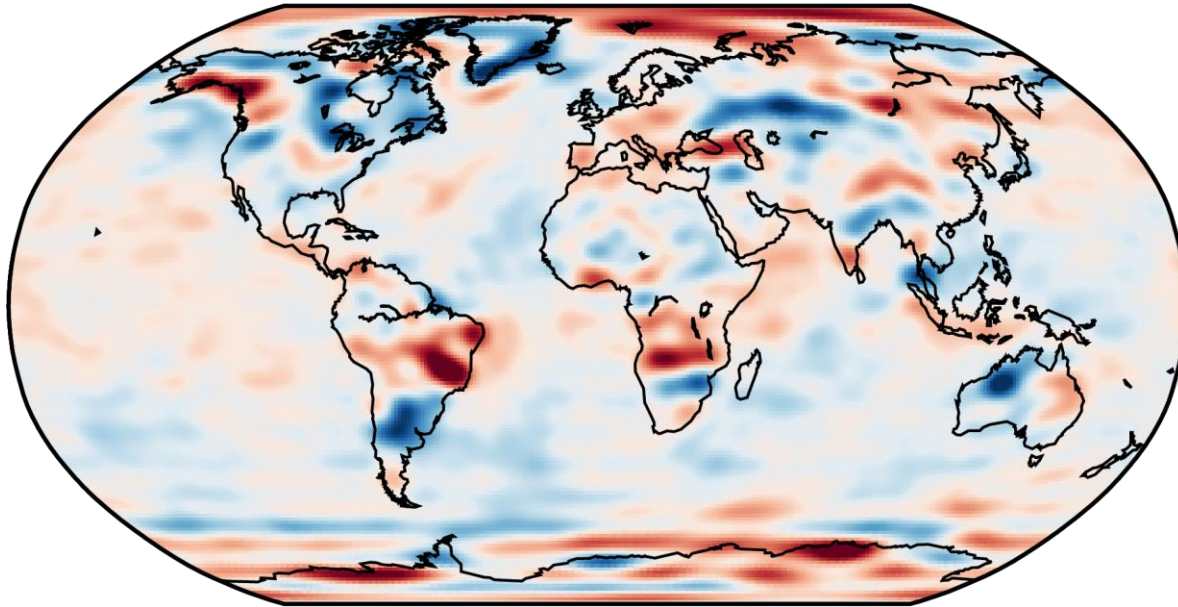


Operational Phase – Results of the NRT Test Run

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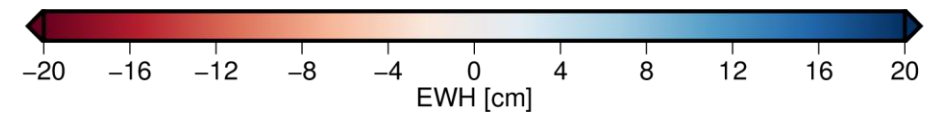
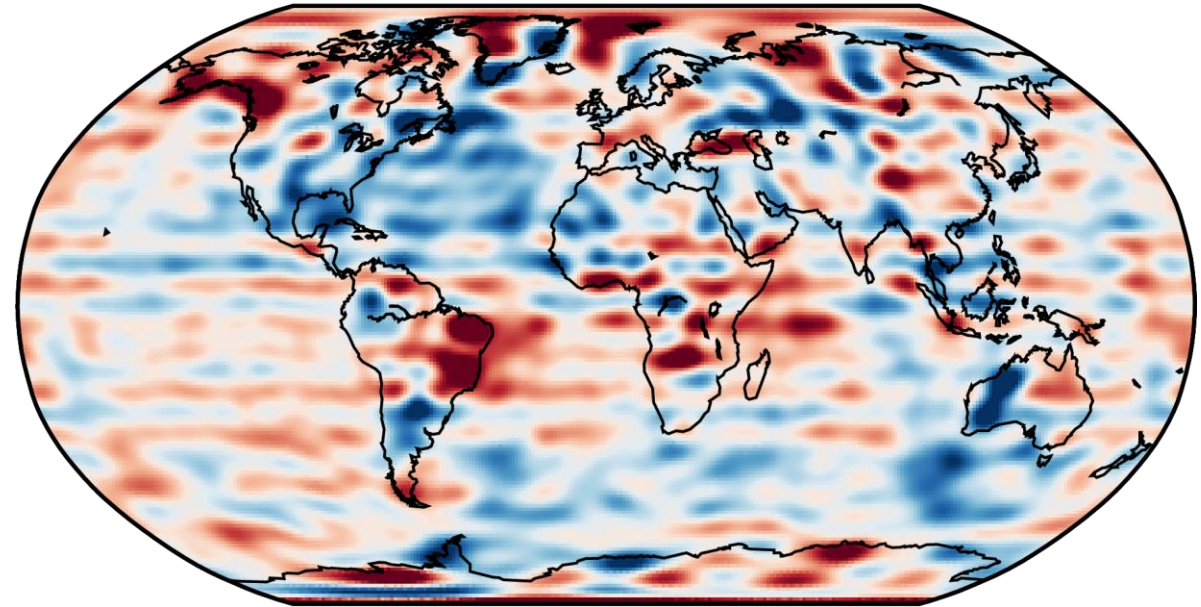
nominal attitude

2017-03-22



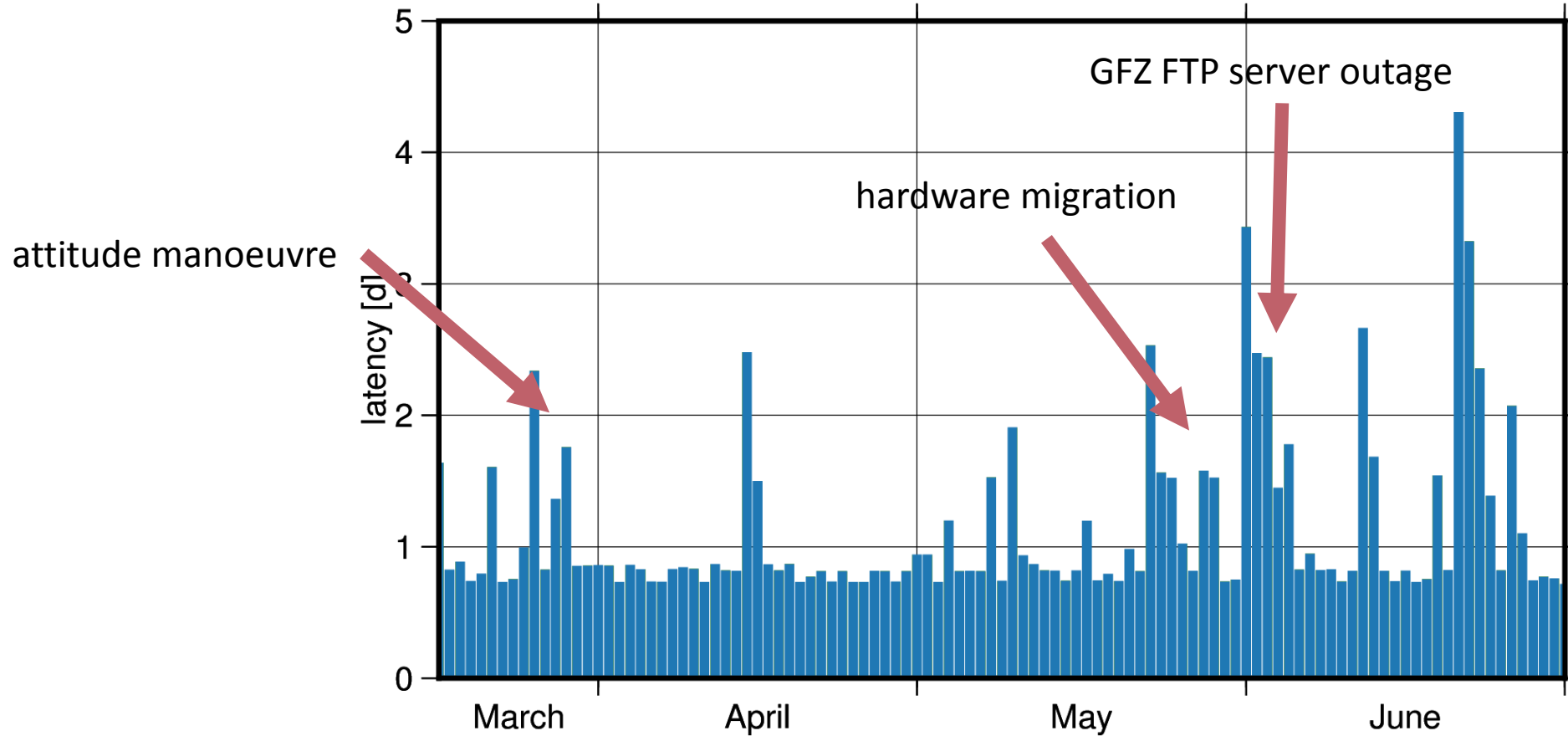
pitch bias removed

2017-04-23



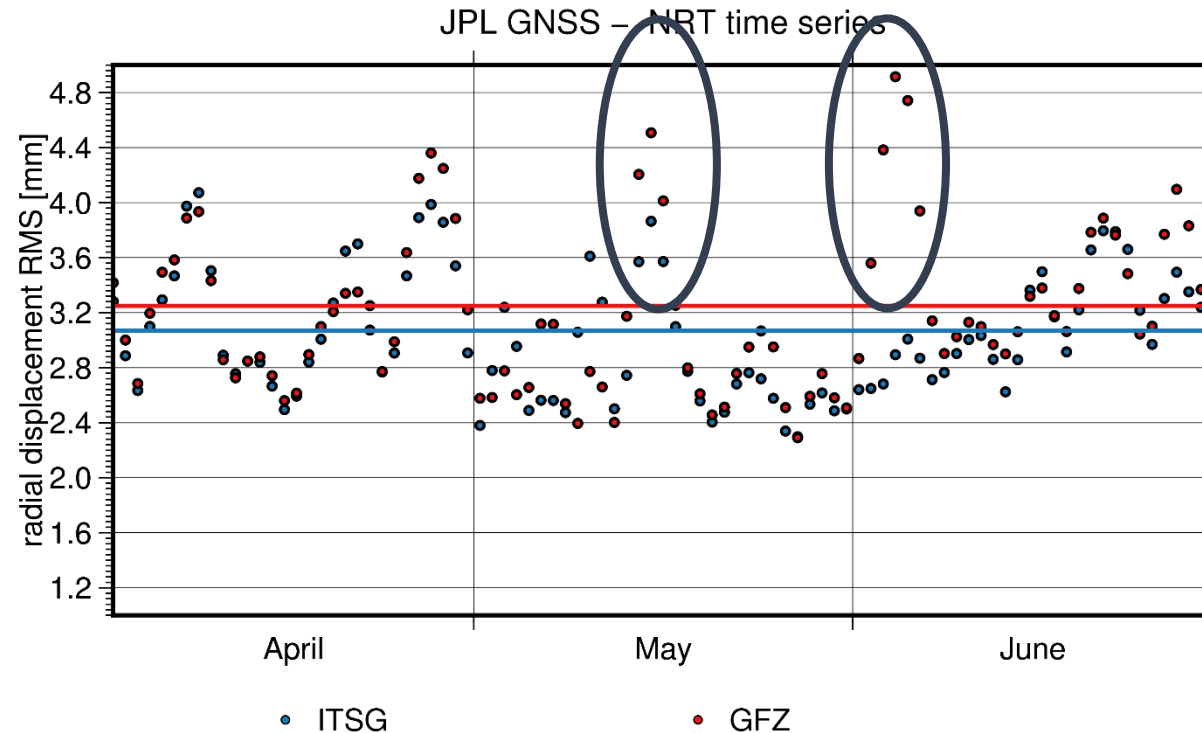
Operational Phase – Results of the NRT Test Run

- Latency of the computed water storage anomalies was below one day for most epochs
 - Single spikes in latency mostly caused by infrastructure issues



Operational Phase – Results of the NRT Test Run

- Quality of the produced gravity field solutions was - mostly – consistent
 - TUGs approach handled the new data situation better than GFZ
- Overall better agreement with external data from TUG
 - GFZ time series contains outliers in the later stages of the test run

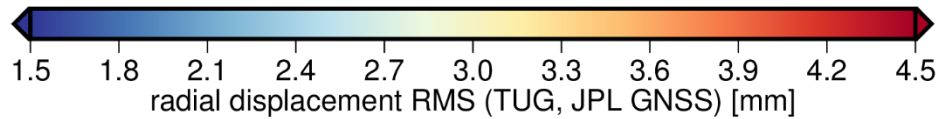
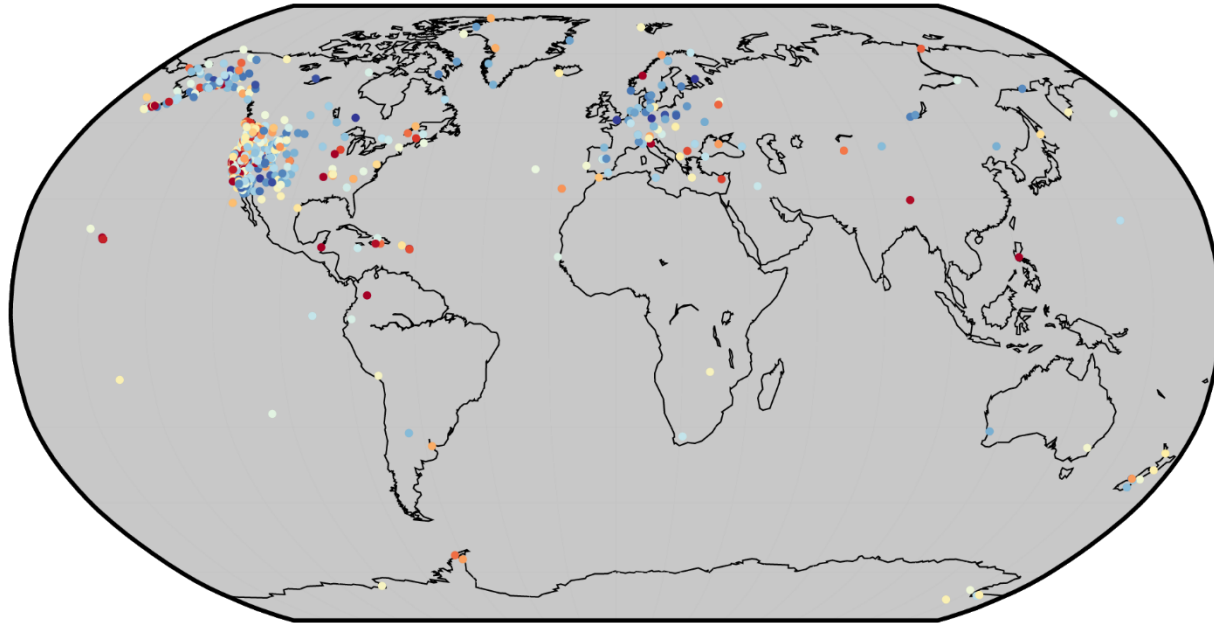


← GFZ: 3.3 mm
TUG: 2.9 mm

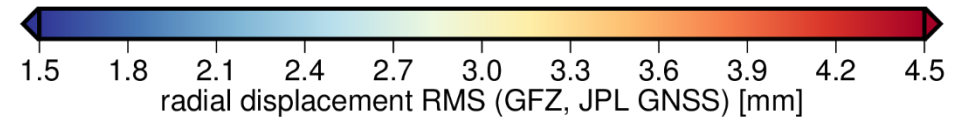
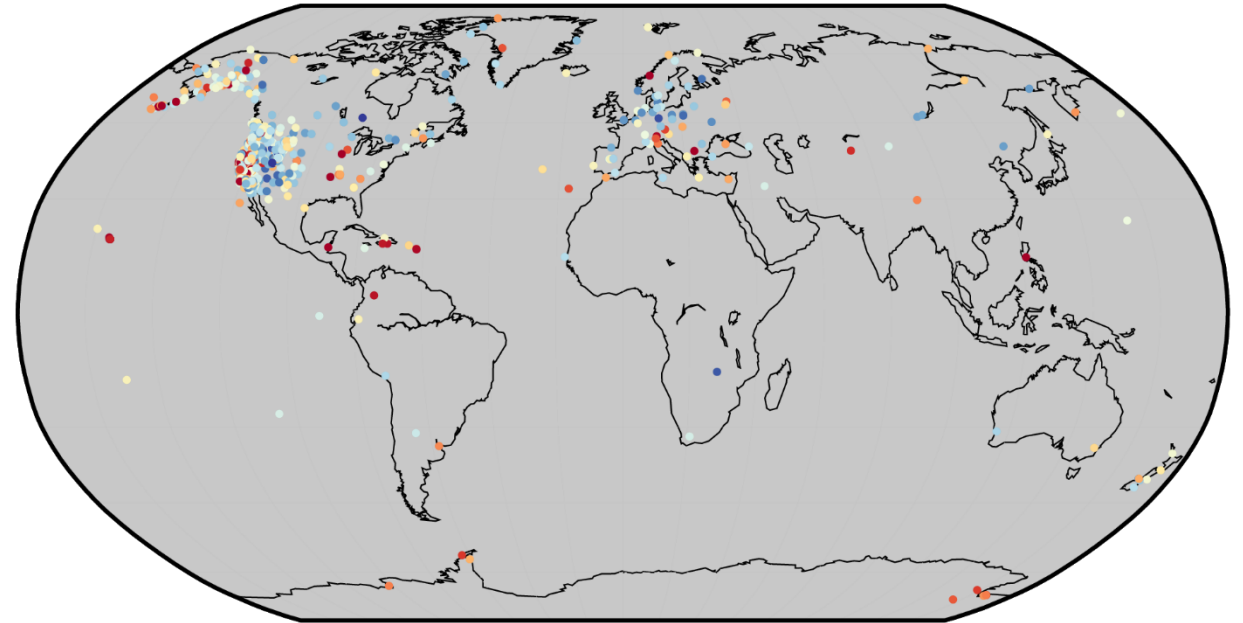
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TUG: 2.9 mm

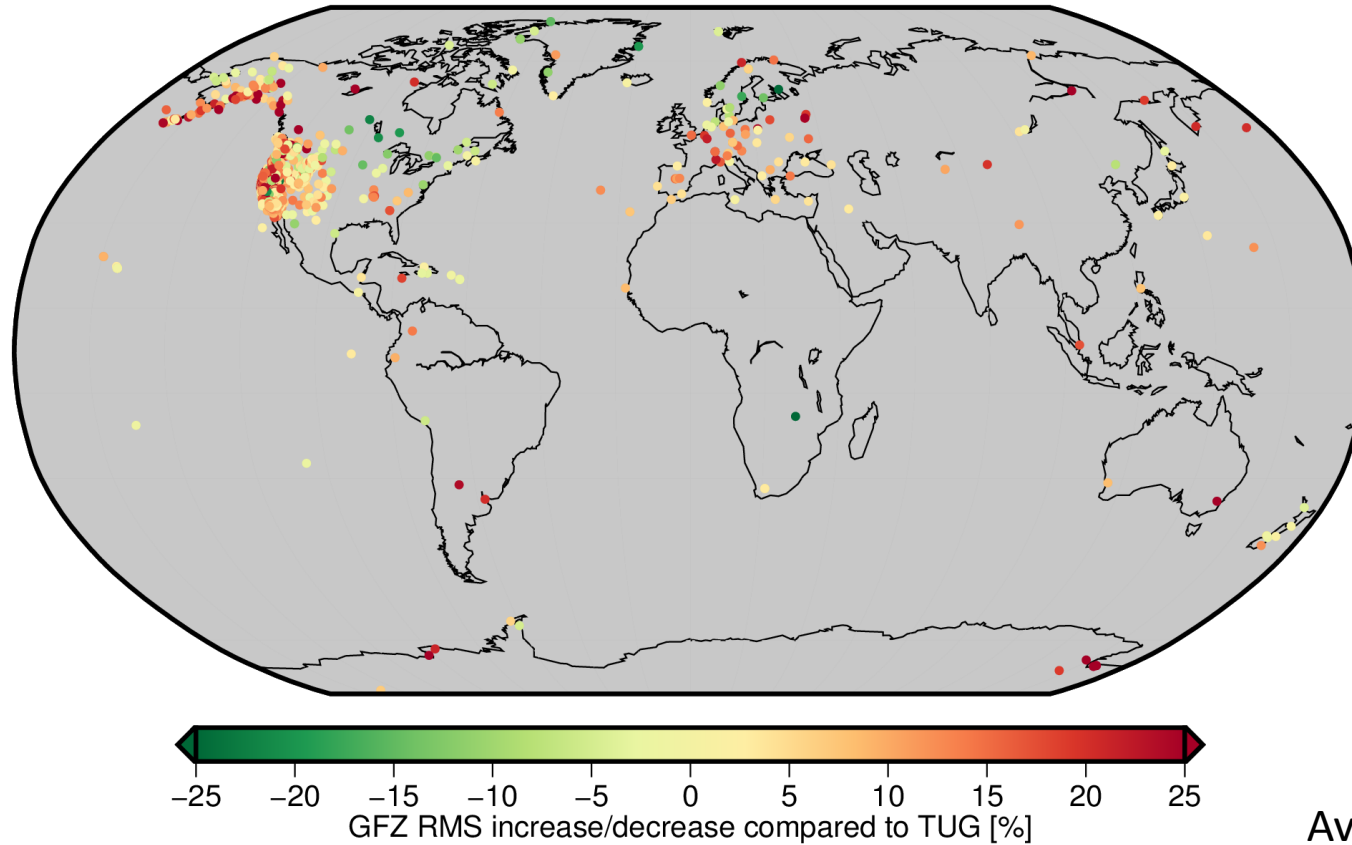


GFZ: 3.3 mm



Operational Phase – Results of the NRT Test Run

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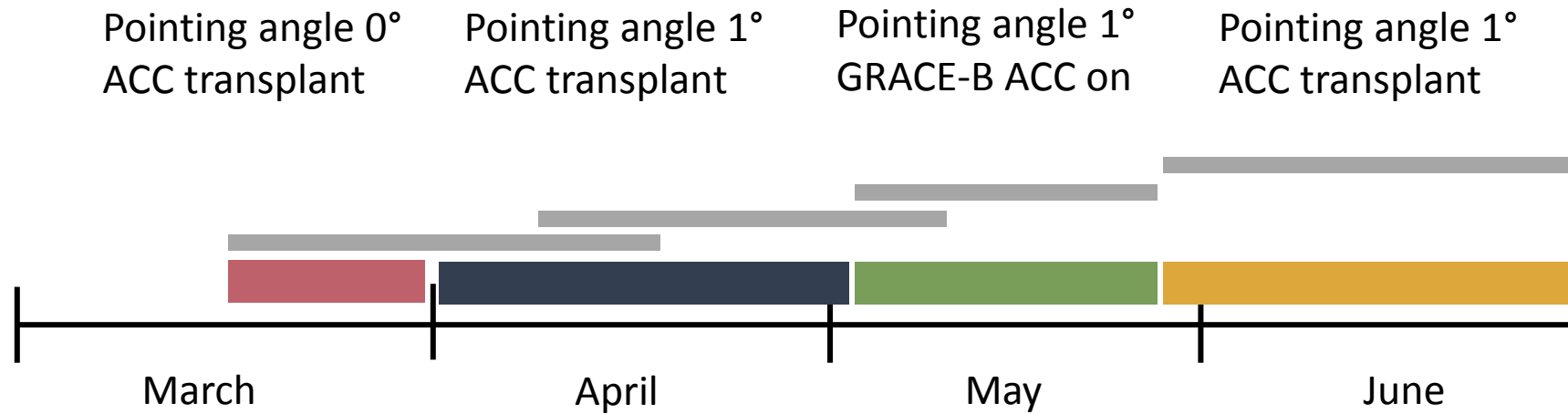
Average increase: 11.7%

Operational Phase - Reanalysis

- ITSG-Grace2016 processing applied to quick-look input data
- Main differences:
 - improved and extended outlier detection
 - Non-causal: we know when data characteristics change and can tailor covariance function estimation accordingly
 - Use of GRACE-B accelerometer data from 2017-05-02 to 2017-05-22 (operational NRT solutions only depended on transplant data)
- Comparison of three time series:
 - “Operational”: the automatically processed L1B quick-look data during the service run
 - “Reanalysis”: ITSG-Grace2016 processing applied to quick-look data
 - CSR-RL05: the standard monthly gravity field solutions based on final L1B data
 - CSR-21d moving: 21 day sliding window solutions provided by Himanshu Save

Operational Phase - Reanalysis

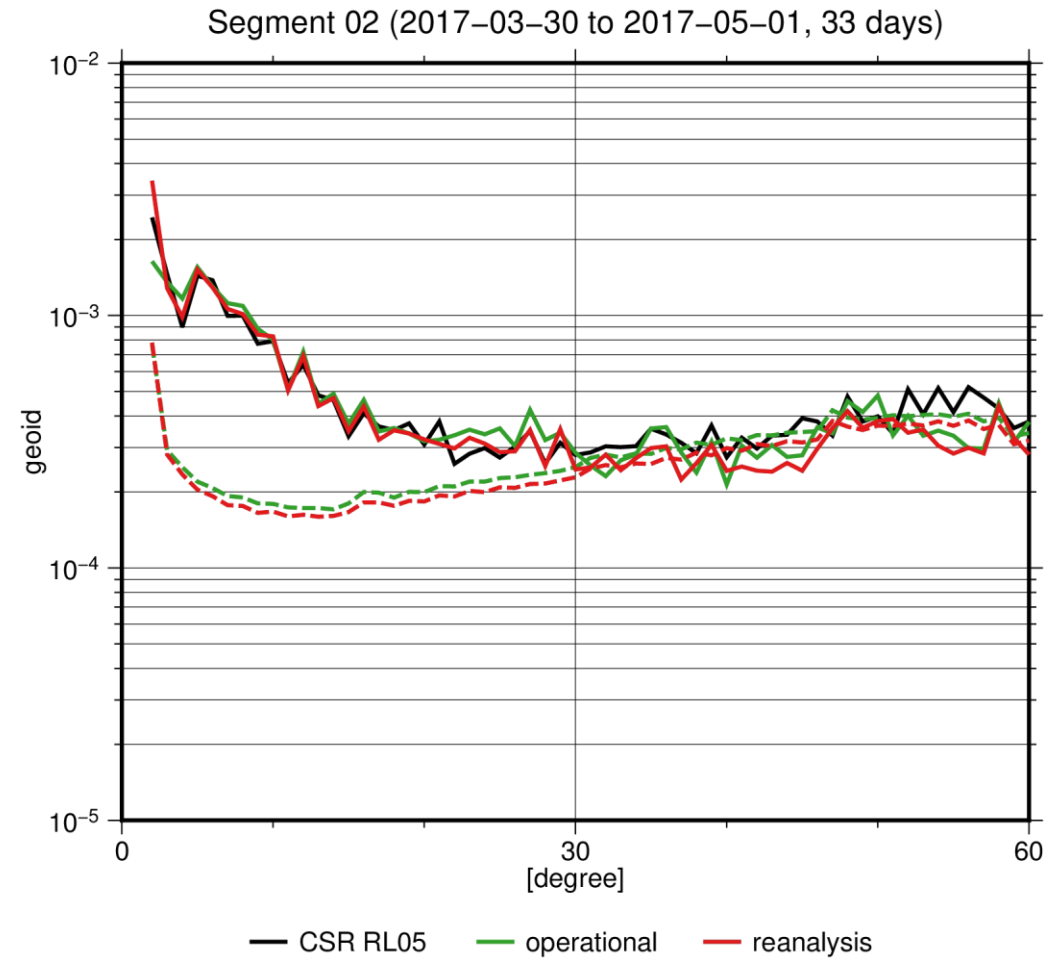
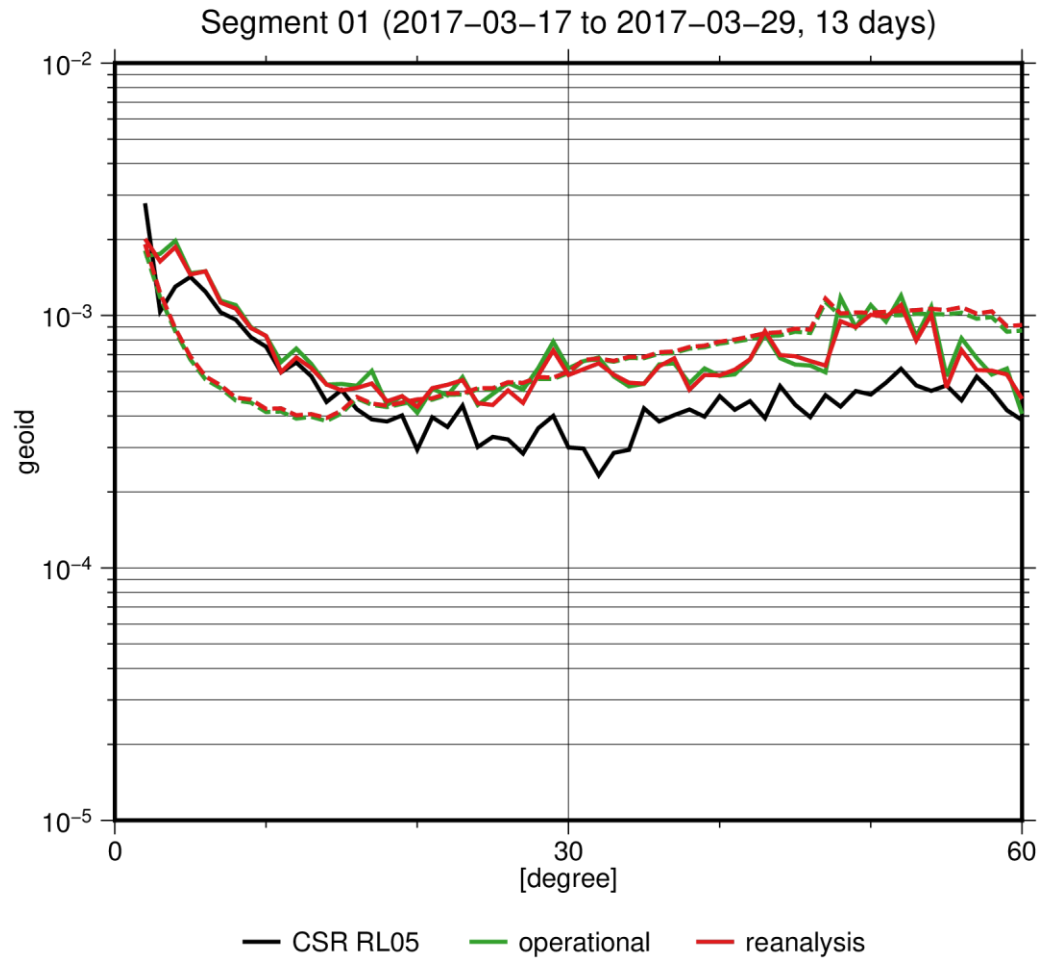
- The NRT service run (2017-03-17 to 2017-06-30) was divided into four segments based on data characteristics



- CSR released four solutions which cover this time span
 - 2017-03-17 to 2017-04-15
 - 2017-04-10 to 2017-05-08
 - 2017-05-02 to 2017-05-22
 - 2017-05-23 to 2017-06-29

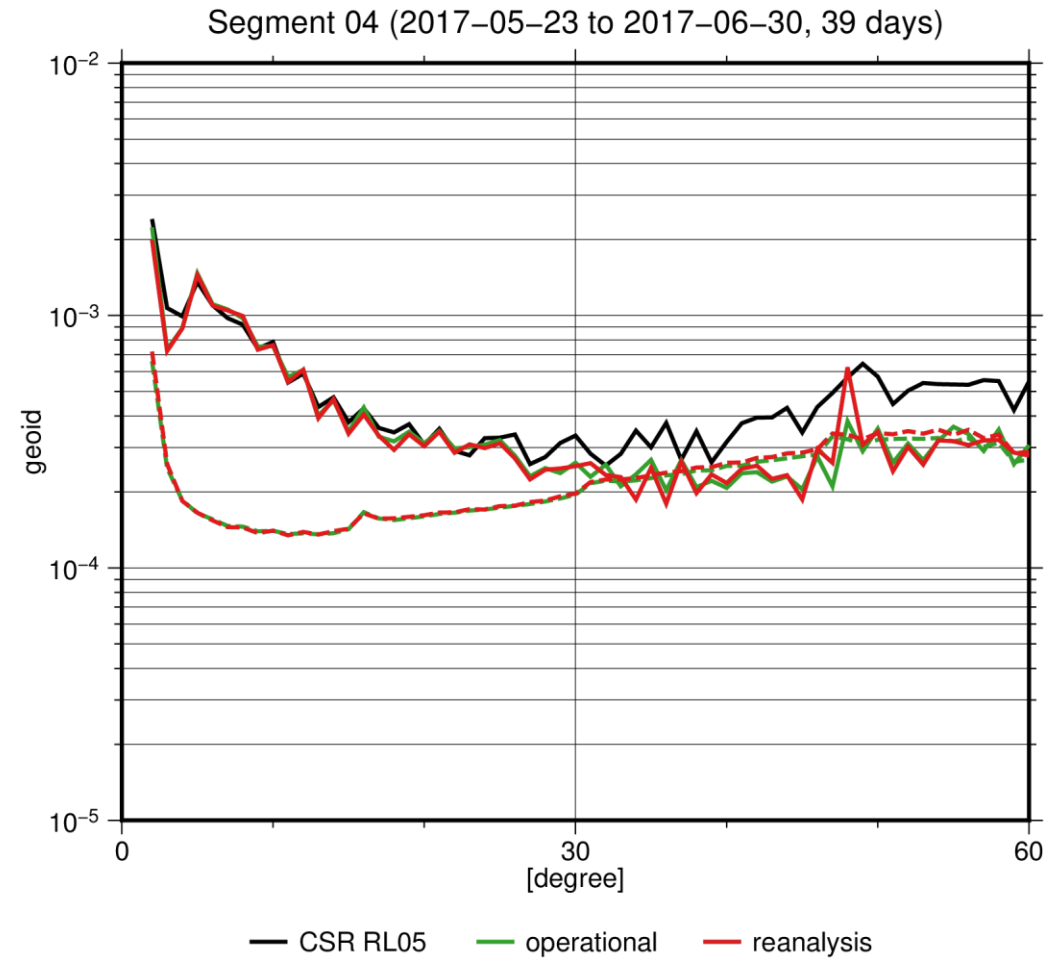
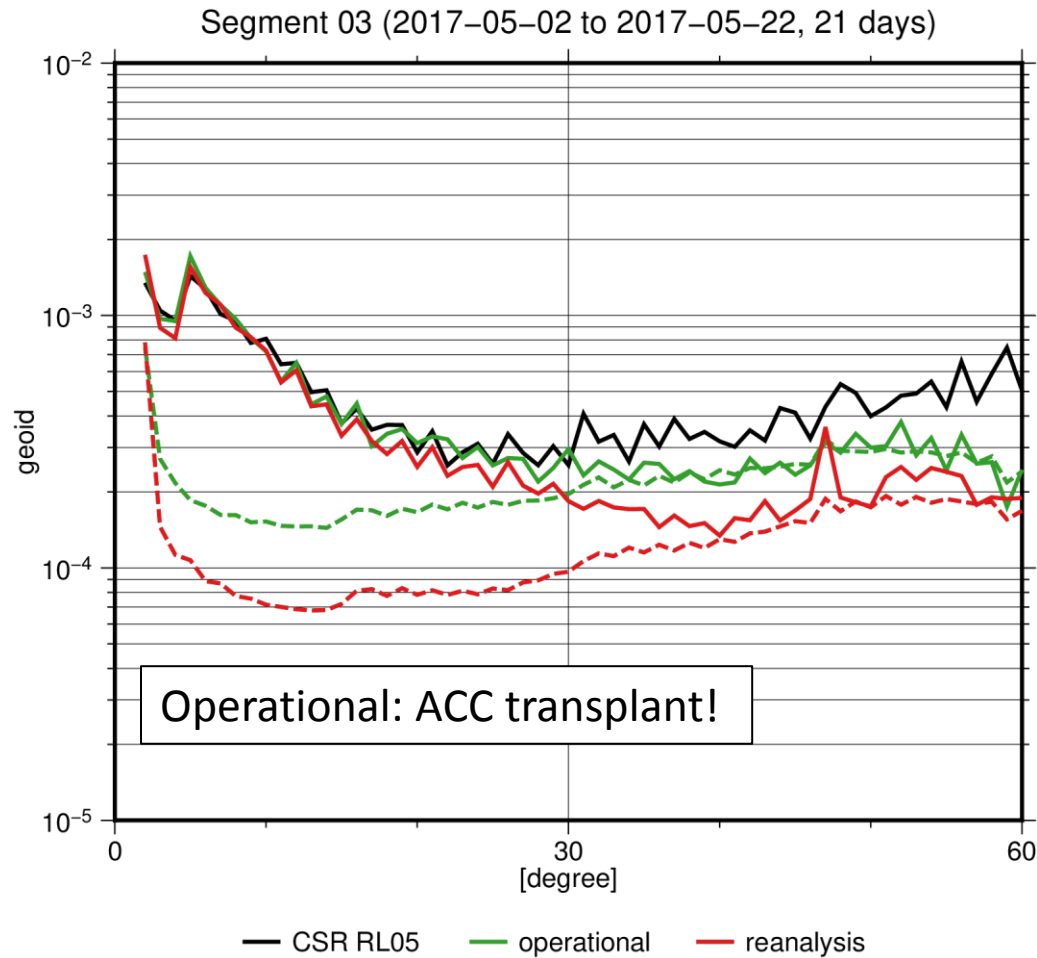
Operational Phase - Reanalysis

- Comparison of (quasi-) monthly solutions, CSR solutions were chosen based on number of overlapping days



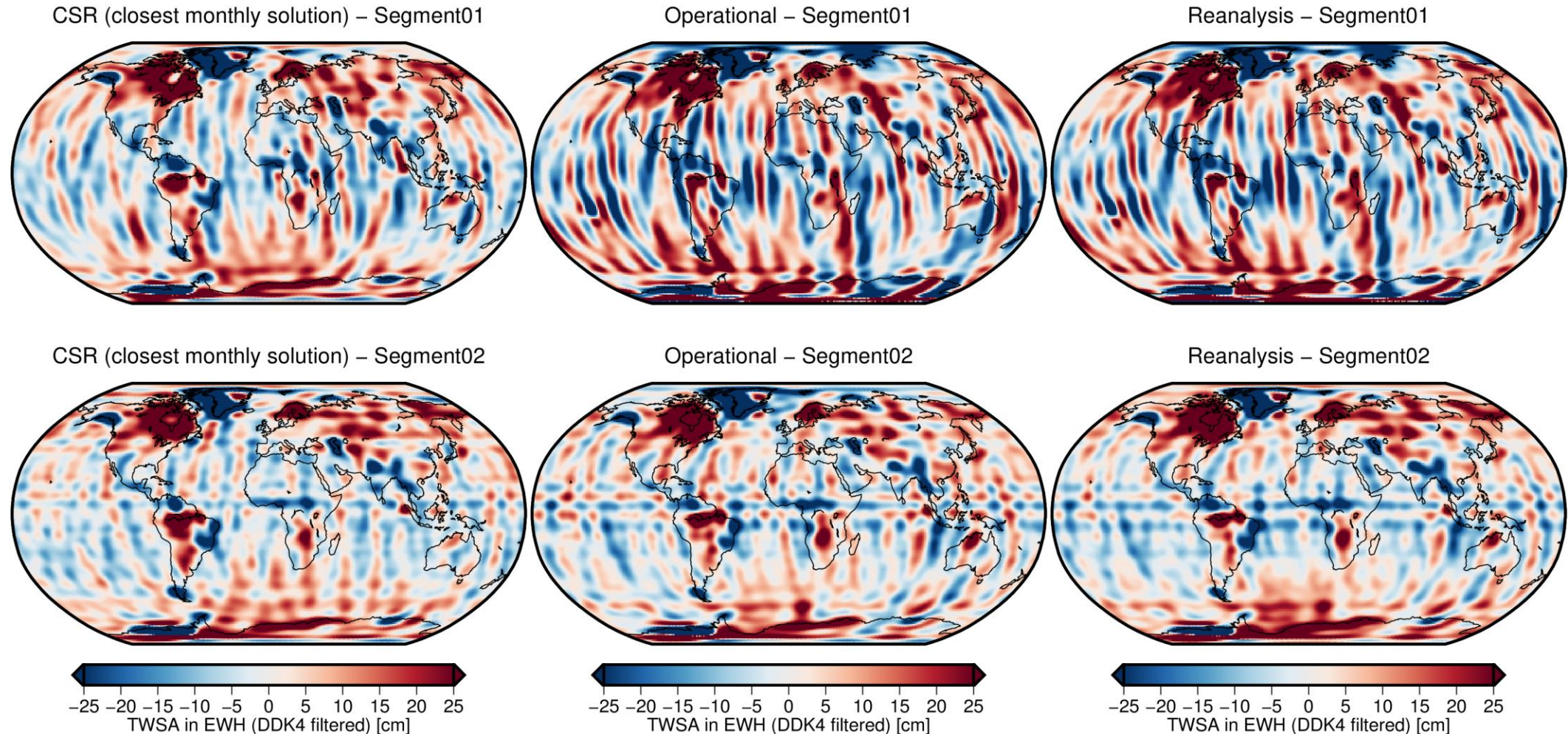
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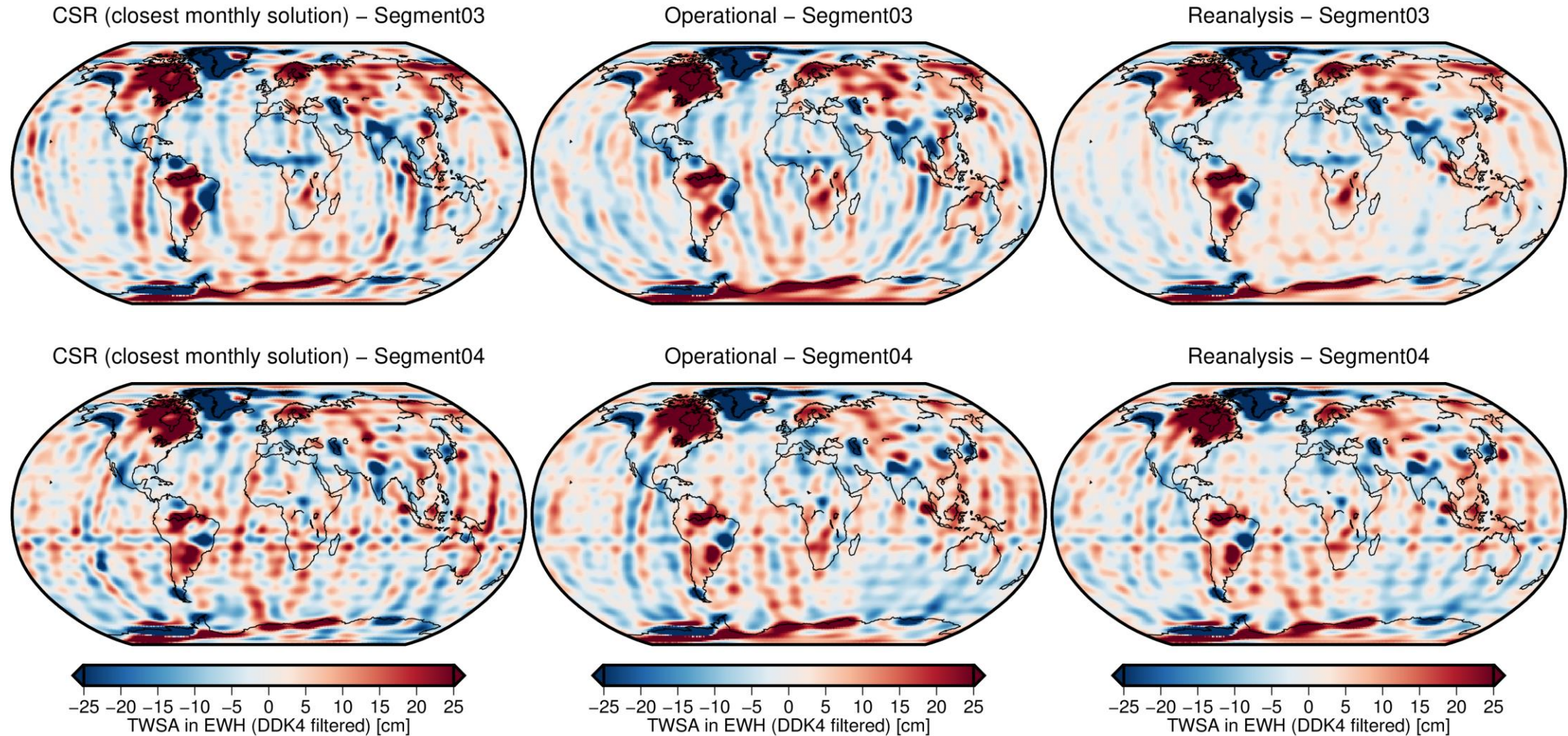
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Operational Phase - Reanalysis

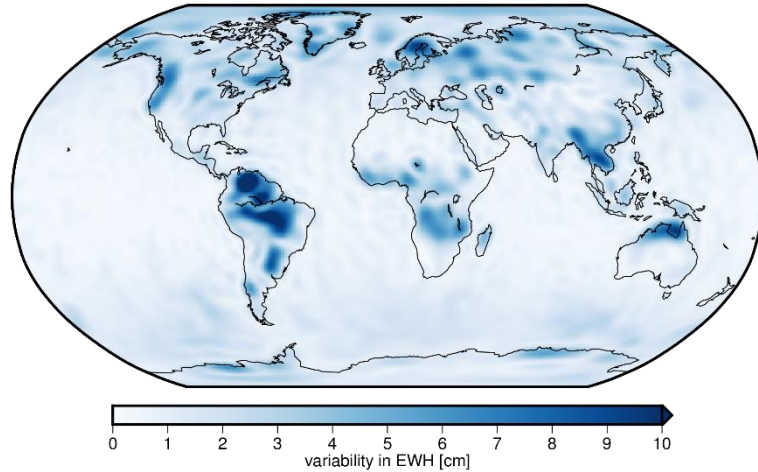
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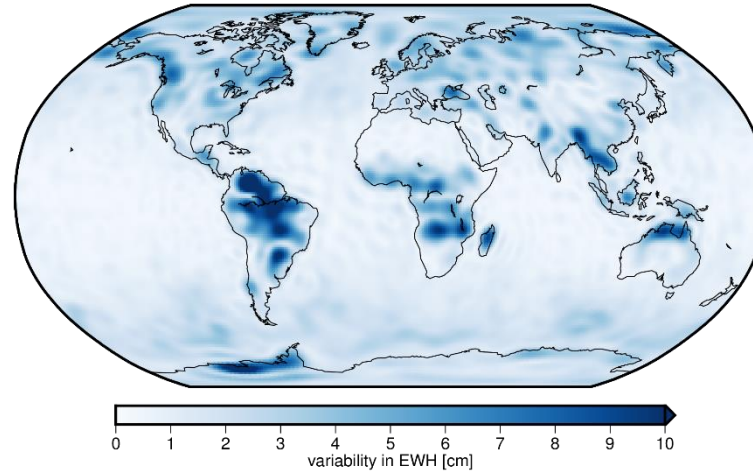
Operational Phase - Reanalysis

- Kalman filtered solutions from 2017-03-17 to 2017-06-30
 - Reanalysis: both forward and backward filtering is possible

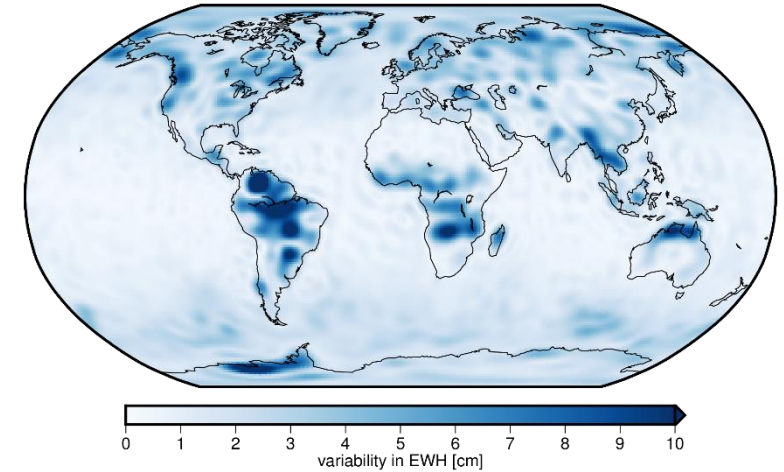
operational



reanalysis (forward)



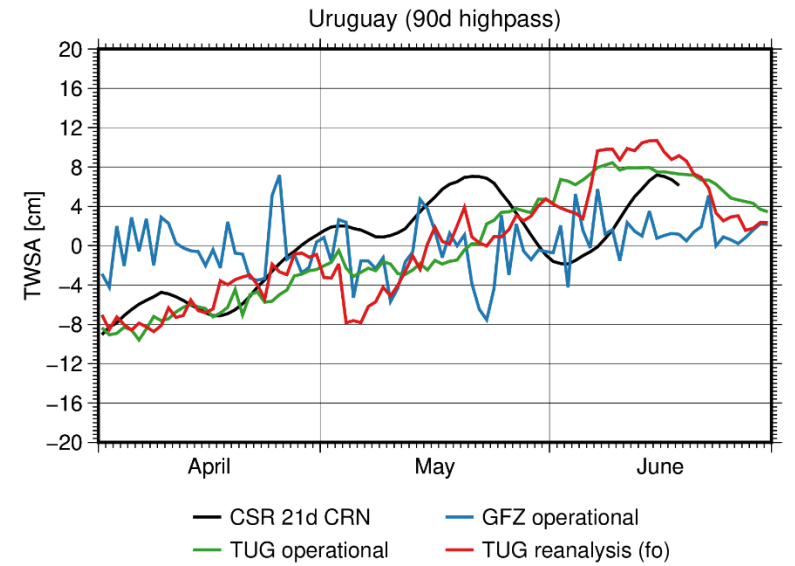
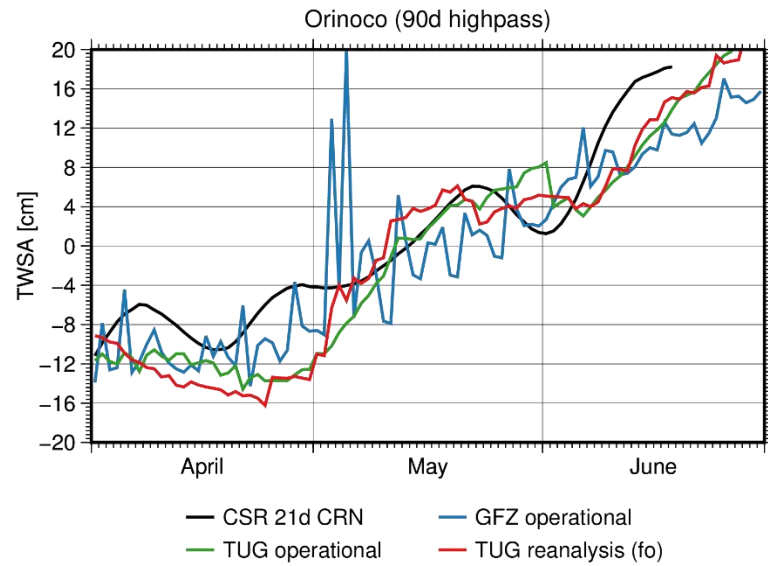
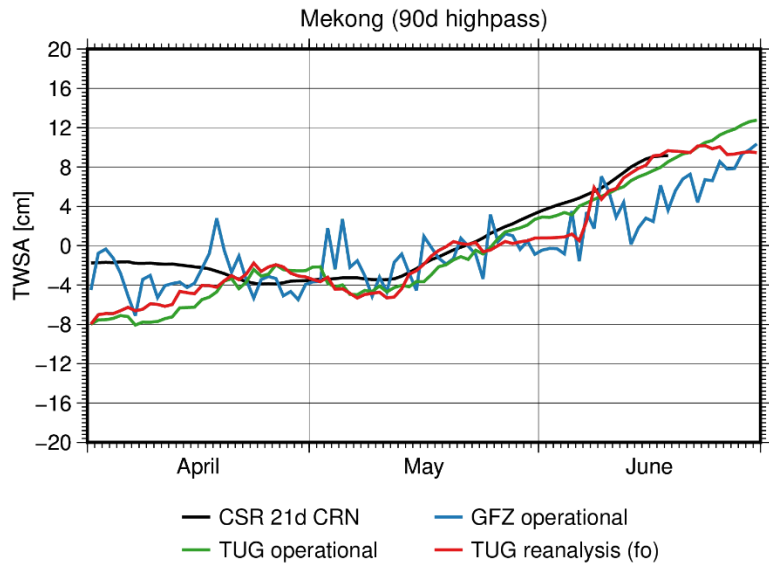
reanalysis (f/b)



- Operational solutions have less variability (2.1cm EHW) than reanalysis (2.5cm EHW)
 - GRACE has less weight due to suboptimal noise estimation → less contribution to Kalman state

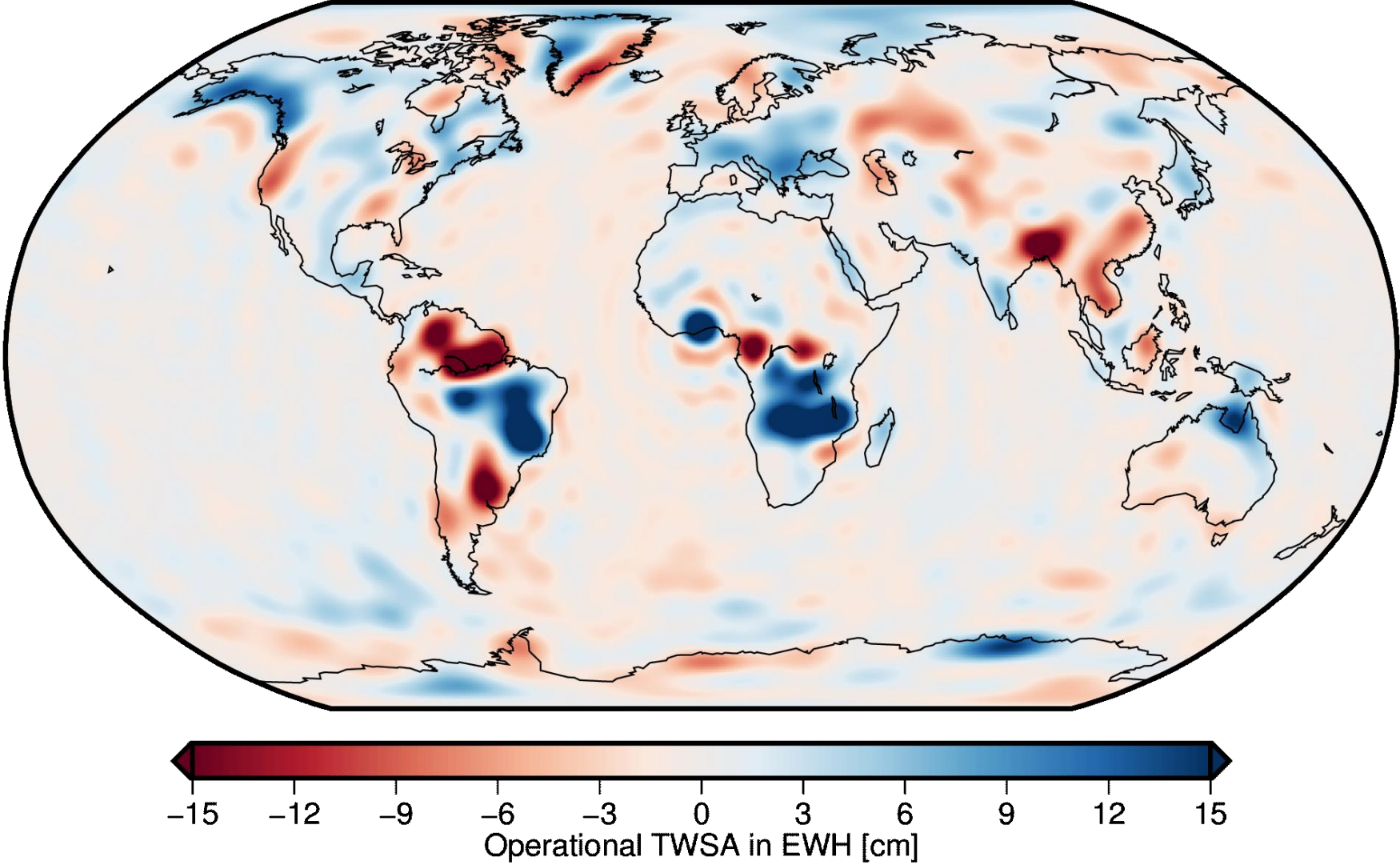
Operational Phase - Reanalysis

- Kalman filtered solutions from 2017-03-17 to 2017-06-30



Operational Phase – NRT Solutions

2017-03-17



Operational Phase - Summary

- Pre-operational simulation showed that post-processing data quality is transferrable to near real-time applications
 - However, challenging data characteristics during the service run resulted in lower than expected quality
 - Reanalysis and intercomparison confirmed that the developed approach still produced competitive gravity products
- The implemented automation framework was capable of managing the daily processing steps without external action
 - Latency during the operational test run was well below the projected five days
 - Software framework is generic enough to be used for future satellite missions

EGSIEM

European Gravity Service for Improved Emergency Management

Summary And Outlook



Summary And Outlook

- We were able to show that mass variations can be inferred from satellite data in near real-time
 - Satellite health during the operational test run resulted in challenging data characteristics
 - Quality levels estimated during pre-operational simulations could not be fully reached
 - Reanalysis and external validation showed that the gravity products were nonetheless competitive
- Housekeeping:
 - Finalizing the WP5 chapter for the final project report
 - Publications: Gruber et al. 2018 (submitted), Kvas et al. 2018 (close to be submitted)

Hydrological Extreme Events as Seen by GRACE

November 01, 2005



Total Water Storage Anomaly [cm]
(seasonal and secular variations removed)

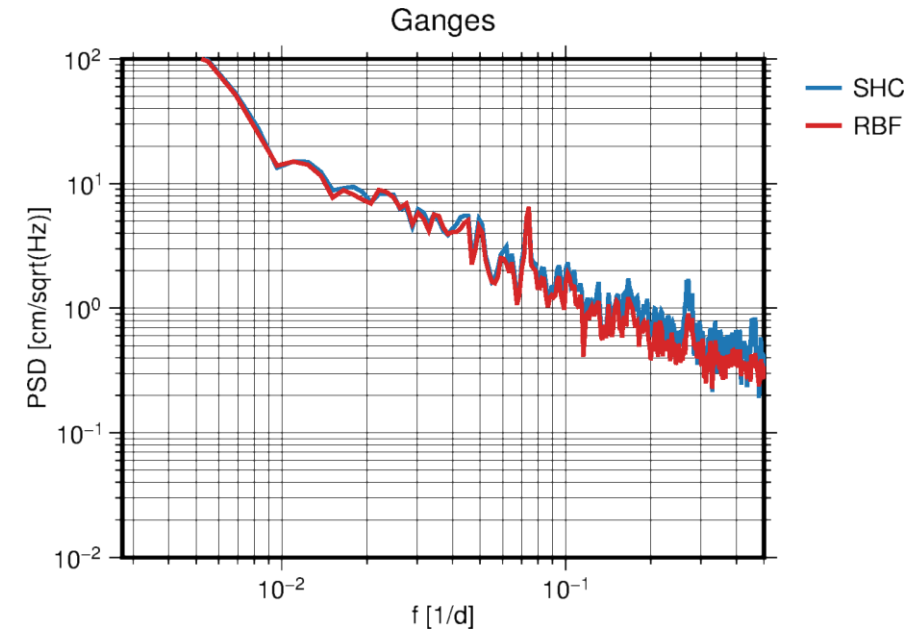
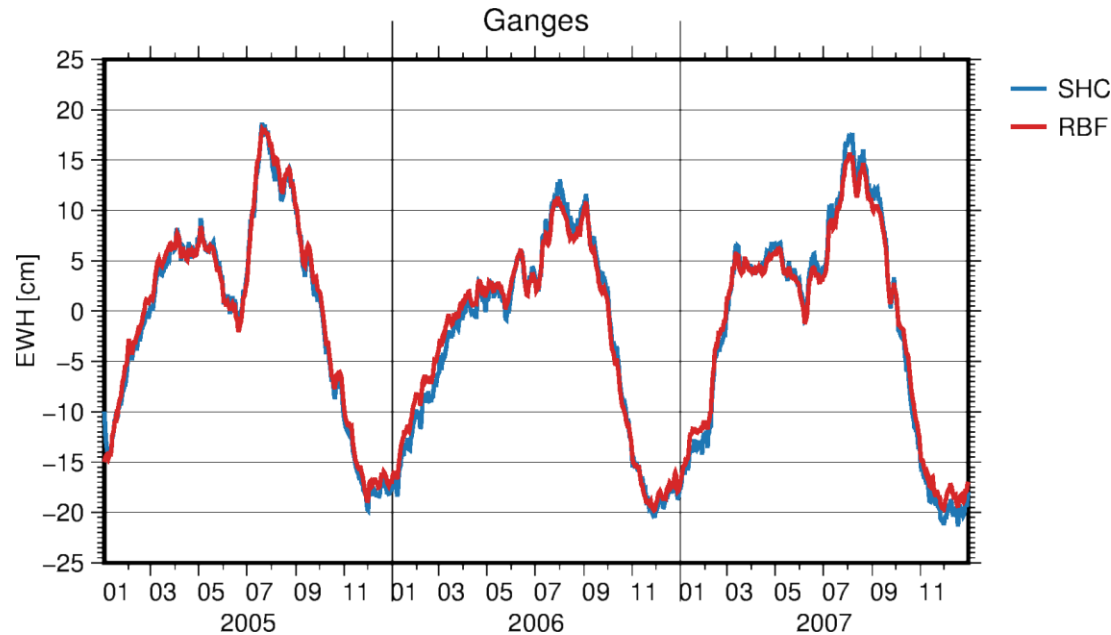
Backup – Regional Solutions

Regional Solutions – Results at TUG

- Regional solutions implemented as radially symmetric spherical splines (RBFs) according to (Eicker, 2008)
- Three experiments were conducted
 - Daily RBF solutions from a Kalman filter framework (E1)
 - Five day moving average solutions with tailored basis functions (E2)
 - Five day moving average solutions with tailored regularization (E3)
- Spatial representation makes life easier in a few circumstances
 - Regularization matrices are usually very sparse or diagonal
 - Easy separation of spatial domains

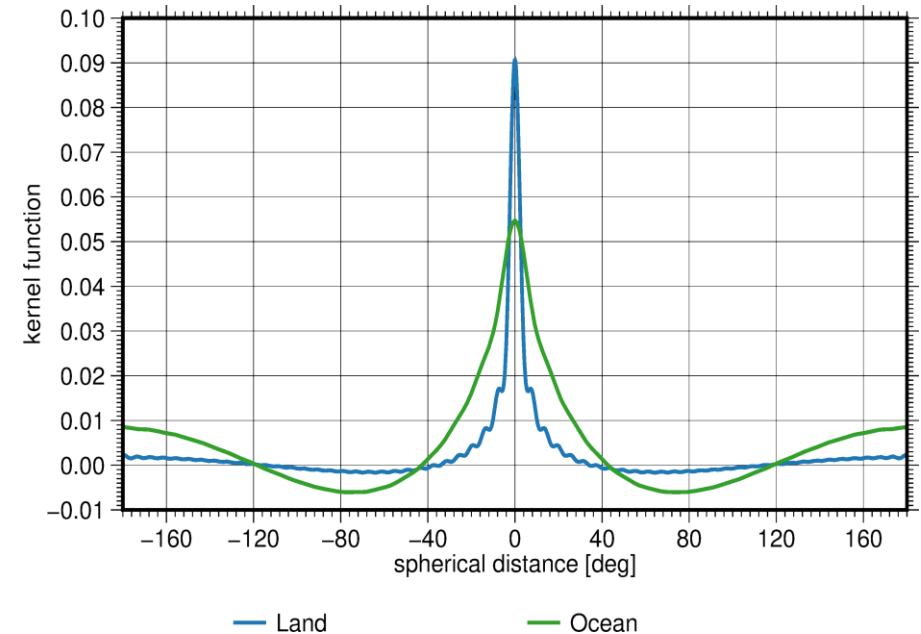
Regional Solutions – E1: Kalman filter with different representation

- Daily normal equations with gravity field represented by RBFs
 - Kernel shape: isotropic part of empirical autocovariance matrix, globally uniform
 - RBFs are distributed on a Reuter grid with a nodal point count of 1442 (approximately d/o 40)
 - Kalman filter process model derived from high resolution grids by least squares adjustment
- Comparison with standard spherical harmonic solution (SHC)



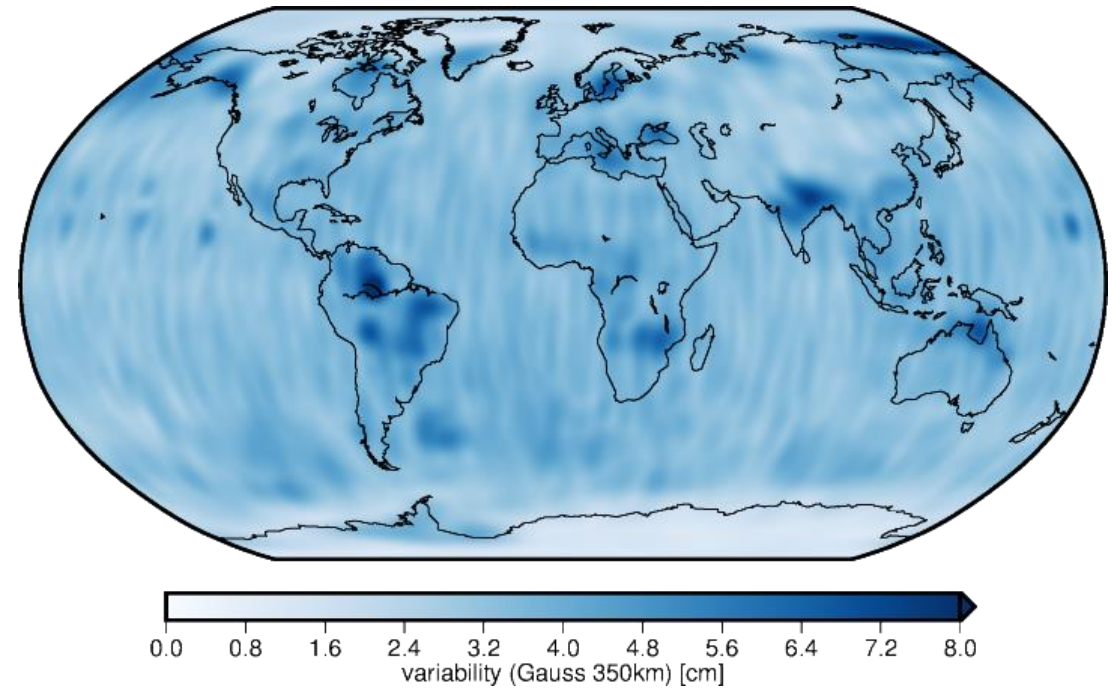
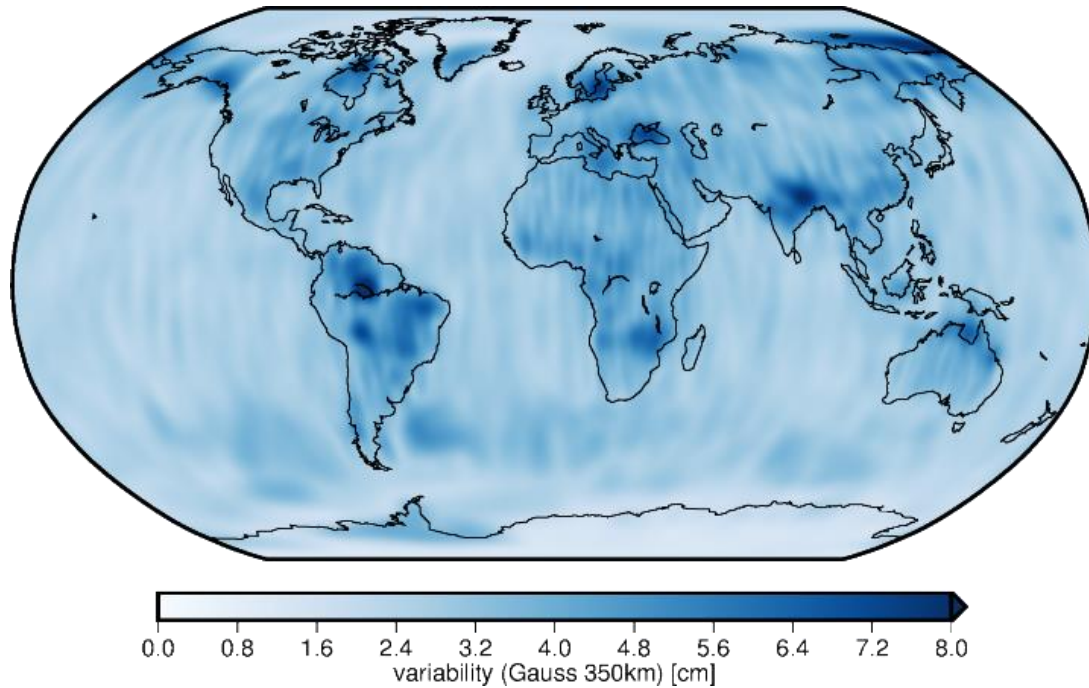
Regional Solutions – E2: tailored kernel shapes

- Tailored RBF kernel shapes
 - Expected signal is quite different between ocean and land, which can be modelled through the basis functions
 - Ocean: lower overall amplitudes and smoother signal, Land: Higher spatial variability
- Shape of kernel functions are derived by fitting Kaula type functions to AOD1B GAD for ocean and WGHM for land
 - Cut off for ocean: degree 30
 - Cut off for land: degree 60
- Different grid densities for land and ocean result in a parameter count of approximately 1800



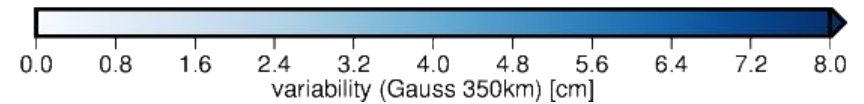
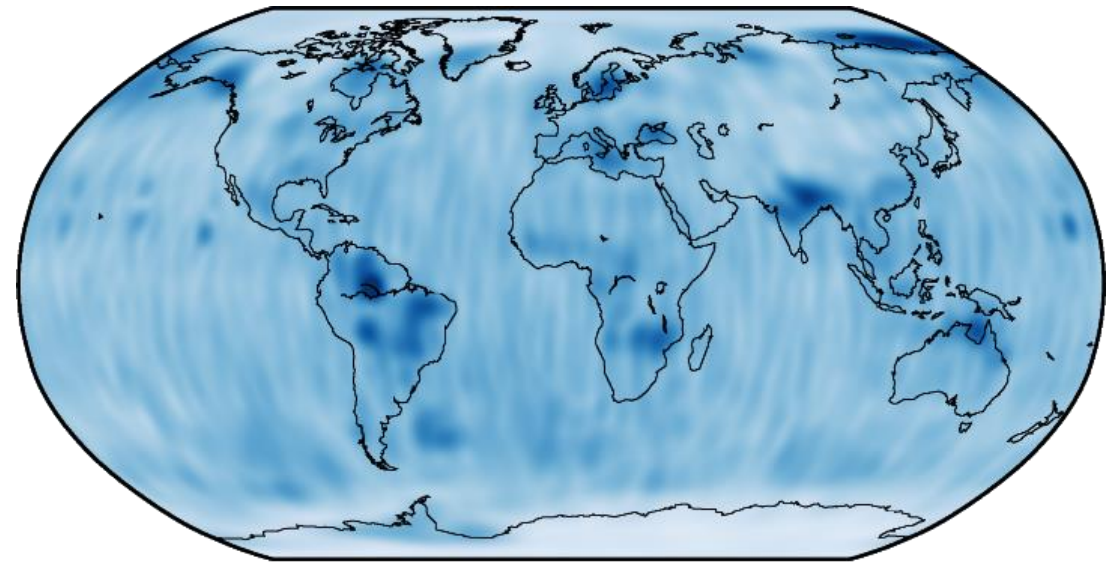
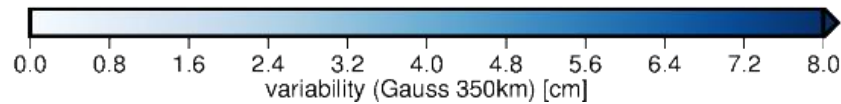
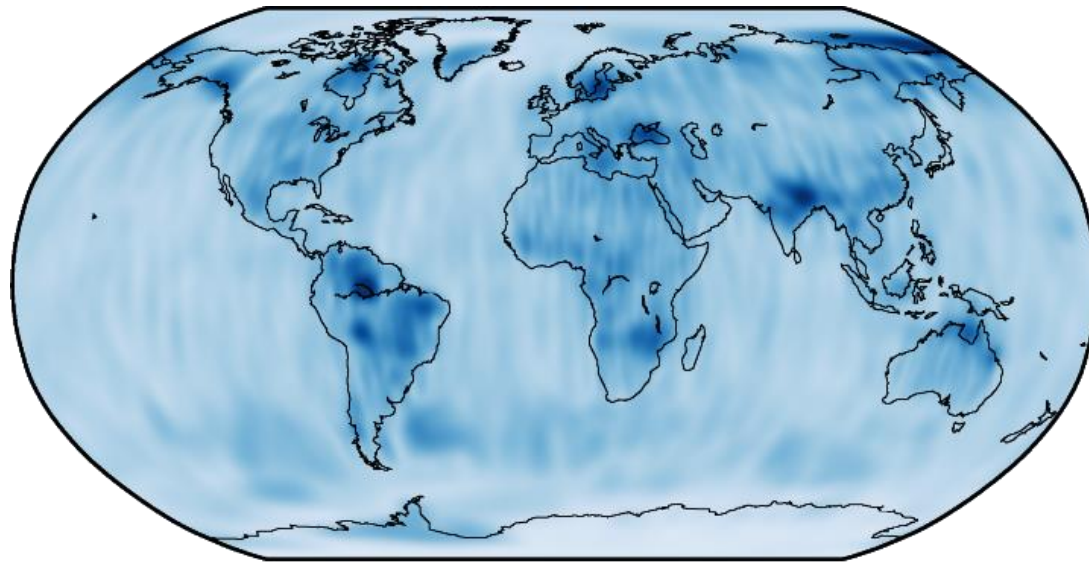
Regional Solutions – E2: tailored kernel shapes

- Comparison of solution with spherical harmonic representation up to degree and order 40
 - Both are five day moving average solutions
 - Gauss filter of 350km is applied to the result



Regional Solutions – E2: tailored kernel shapes

- Higher noise over the ocean in SHC solution → kernel shape acts a low pass filter
- Contrary behavior on land → kernel shape does allow for higher variability

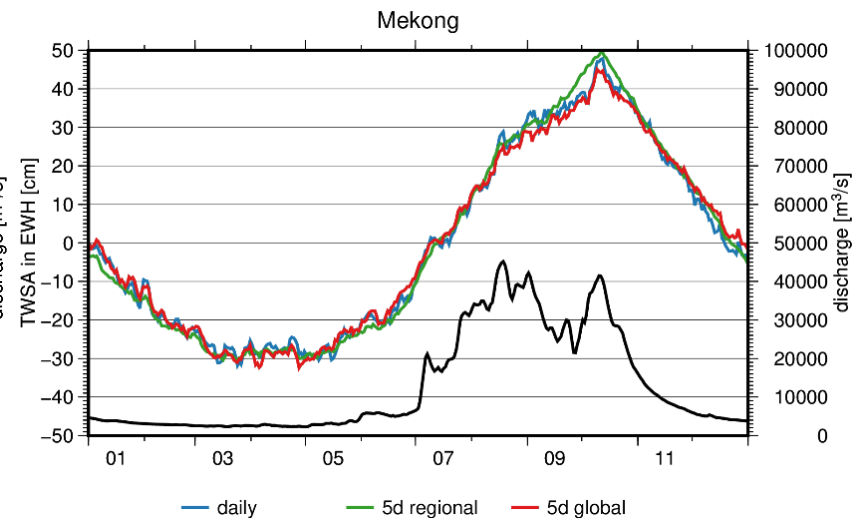
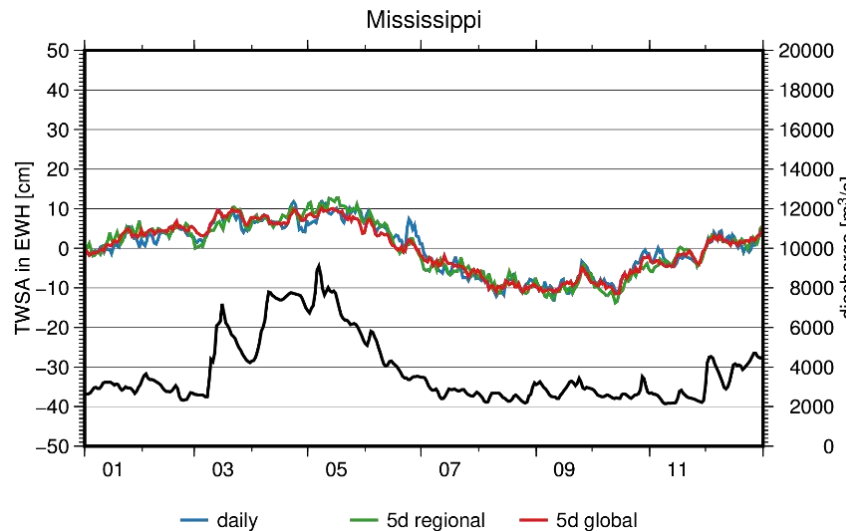
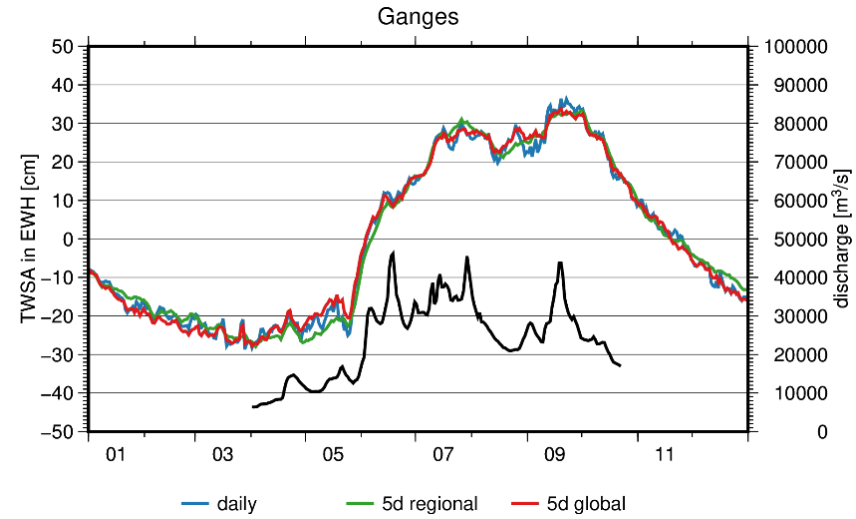
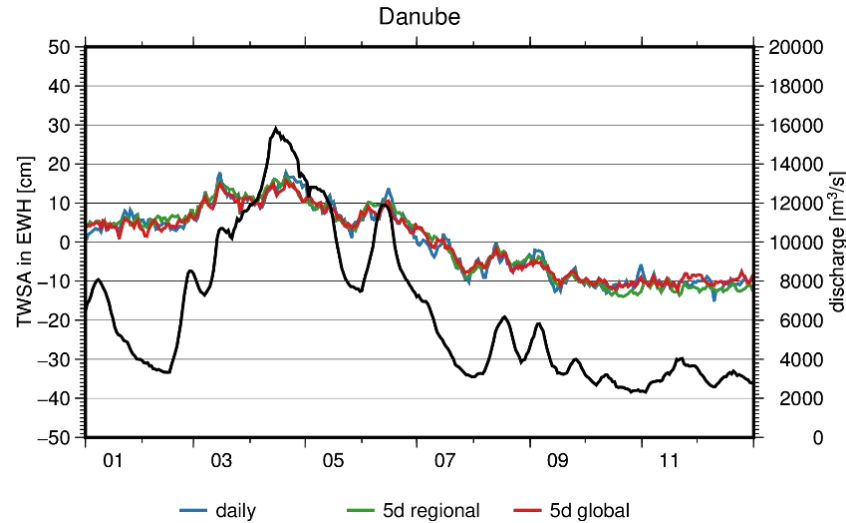


Regional Solutions – E3: regionally adapted regularization

- Picking up on the idea of E2, regionally adapted regularization was implemented
 - Independent isotropic noise model for ocean and land
 - Noise level estimated through variance component estimation
 - Only prior information is land/ocean mask!
- Companion solution: same normal equations, one global variance factor
- Evaluation of solutions based on comparison of five day moving RBF solutions with Kalman filter output
 - Primary goal is to check the feasibility of this product for operational use

Regional Solutions – E3: regionally adapted regularization

- Point wise evaluation of solutions in discharge stations

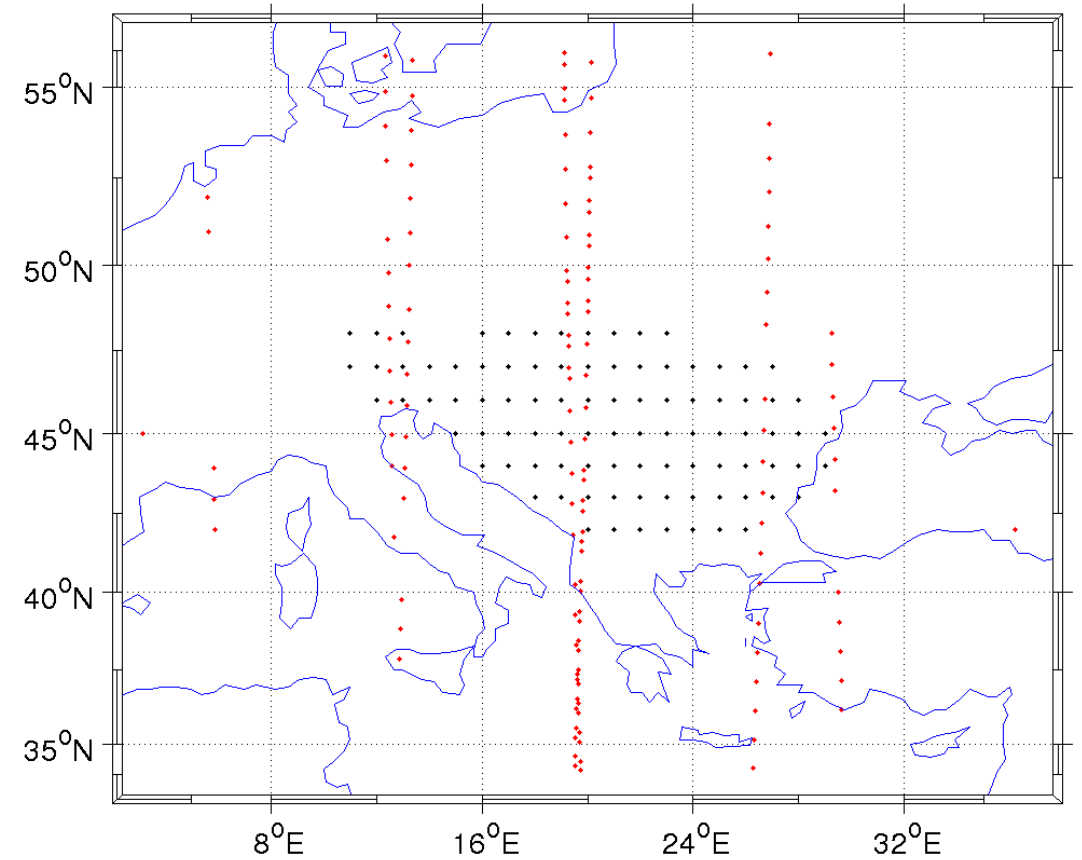


Regional Solutions – E3: regionally adapted regularization

- Conclusion (from D5.4):
 - To concede temporal resolution by stacking the normal equations of five days seems therefore counterproductive, since the Kalman filtered solution exhibits a more dynamical behavior during events with sharply increasing river discharge, without major loss of spatial resolution.
- However: moving five day solutions are however a useful tool in evaluating the temporal behavior of the Kalman solutions
 - No explicit temporal constraint needs to be applied
 - During TUGs NRT run, five day moving solutions (with isotropic noise constraint) were used as offline evaluation tool

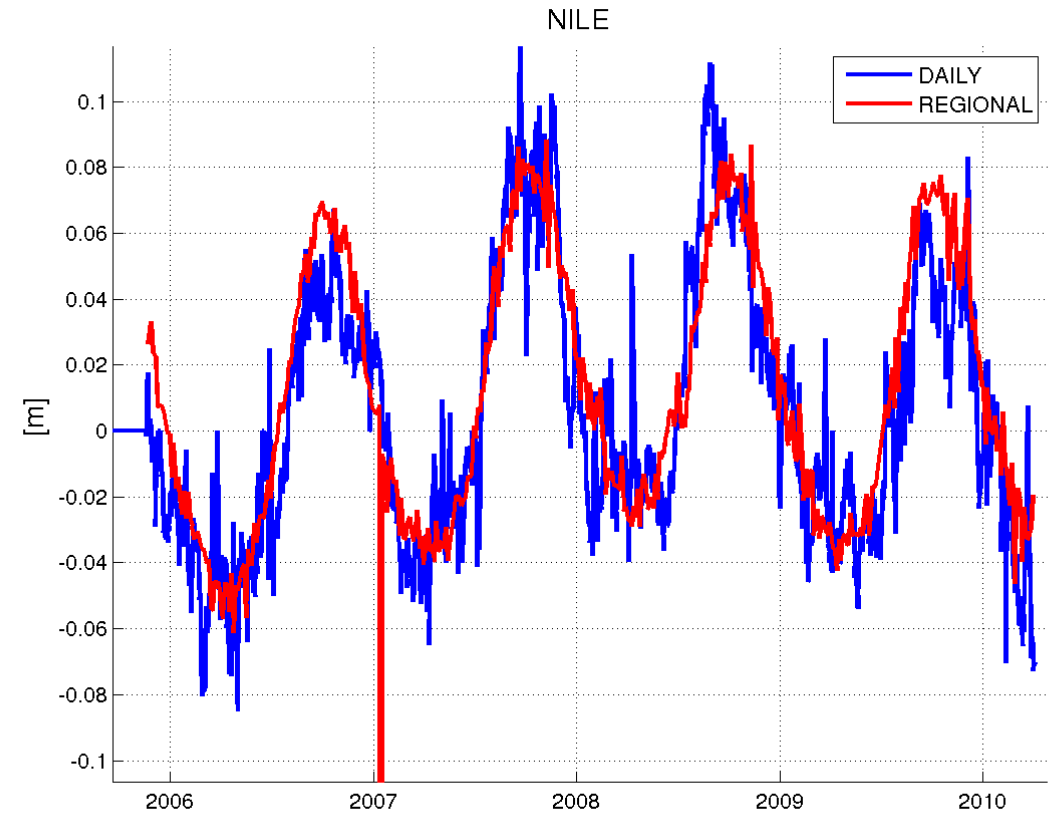
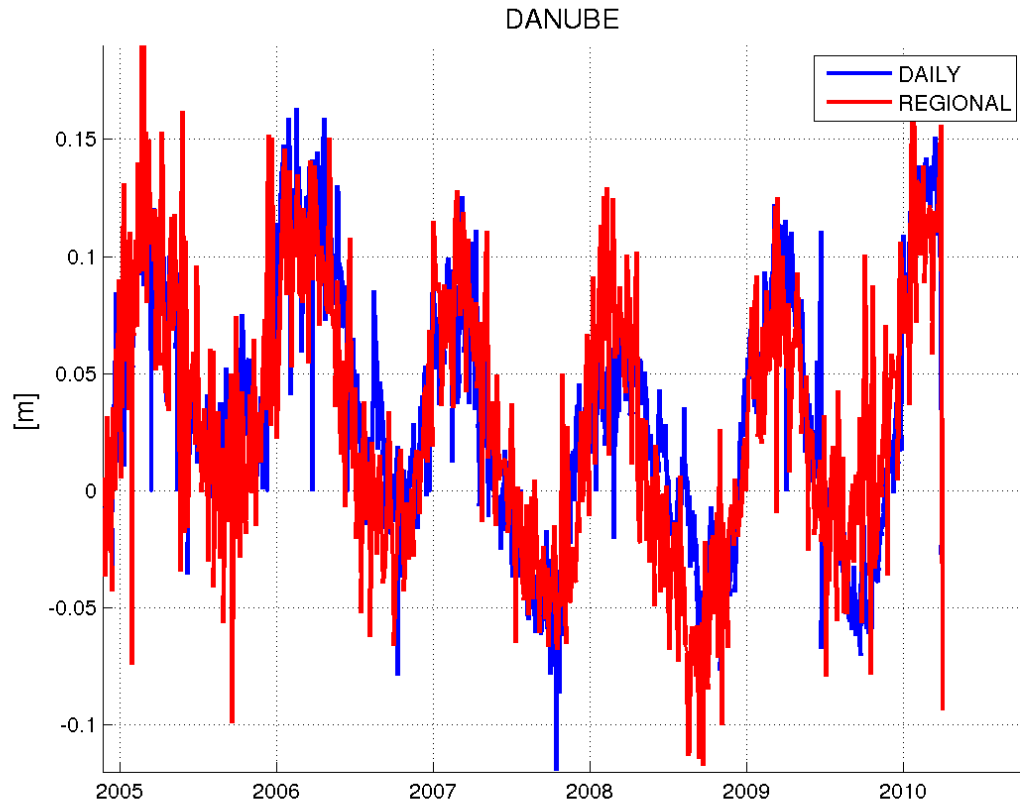
Regional Solutions – Results at GFZ

- Idea: accumulate observations in a specified region from multiple fly-overs
 - Region of interest can be a river basin with a buffer, e.g. a spherical cap
- As the GRACE ranging observations are not fully localizing, the daily Kalman solutions are removed as additional background field to reduce far zone effects
- Within the area of interest, the gravity field is parametrized as space-localizing basis function
- Integrating only the region of interest allows for estimating the unconstrained basin average from from 4 to 5 days of data



Regional Solutions – Results at GFZ

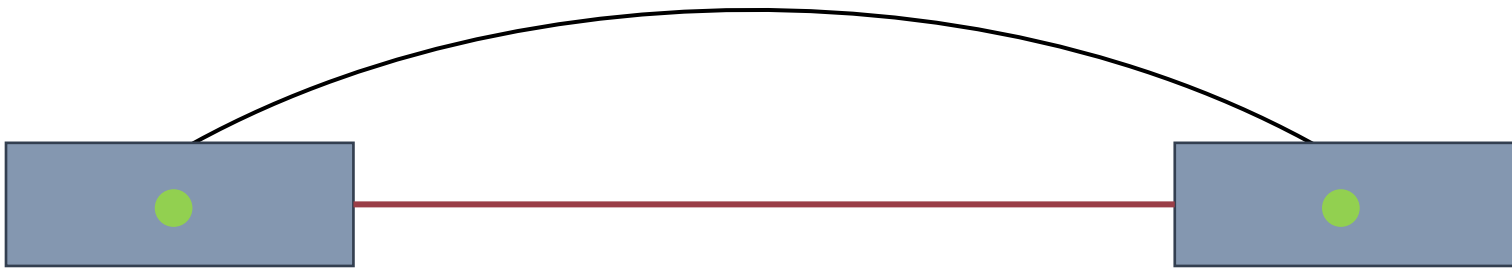
- Results: comparison of unconstrained basin average estimate (red) with the Kalman filtered solution (blue)



Backup – GRACE Satellite Health

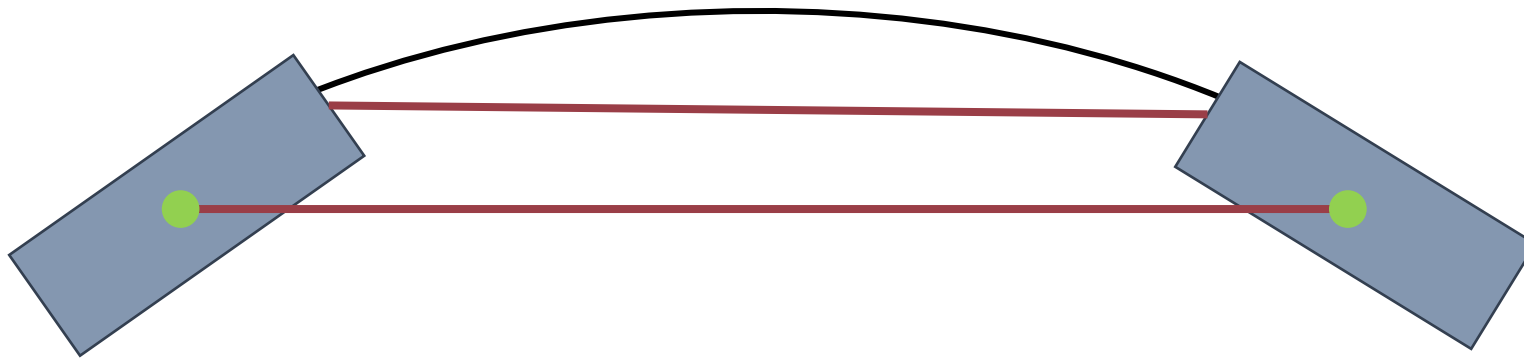
Impact of Pitch Bias Removal

- During science operations, the GRACE satellites directly face each other
 - K-band antenna center and satellite center of mass (approximately) lie on the line-of-sight



Impact of Pitch Bias Removal

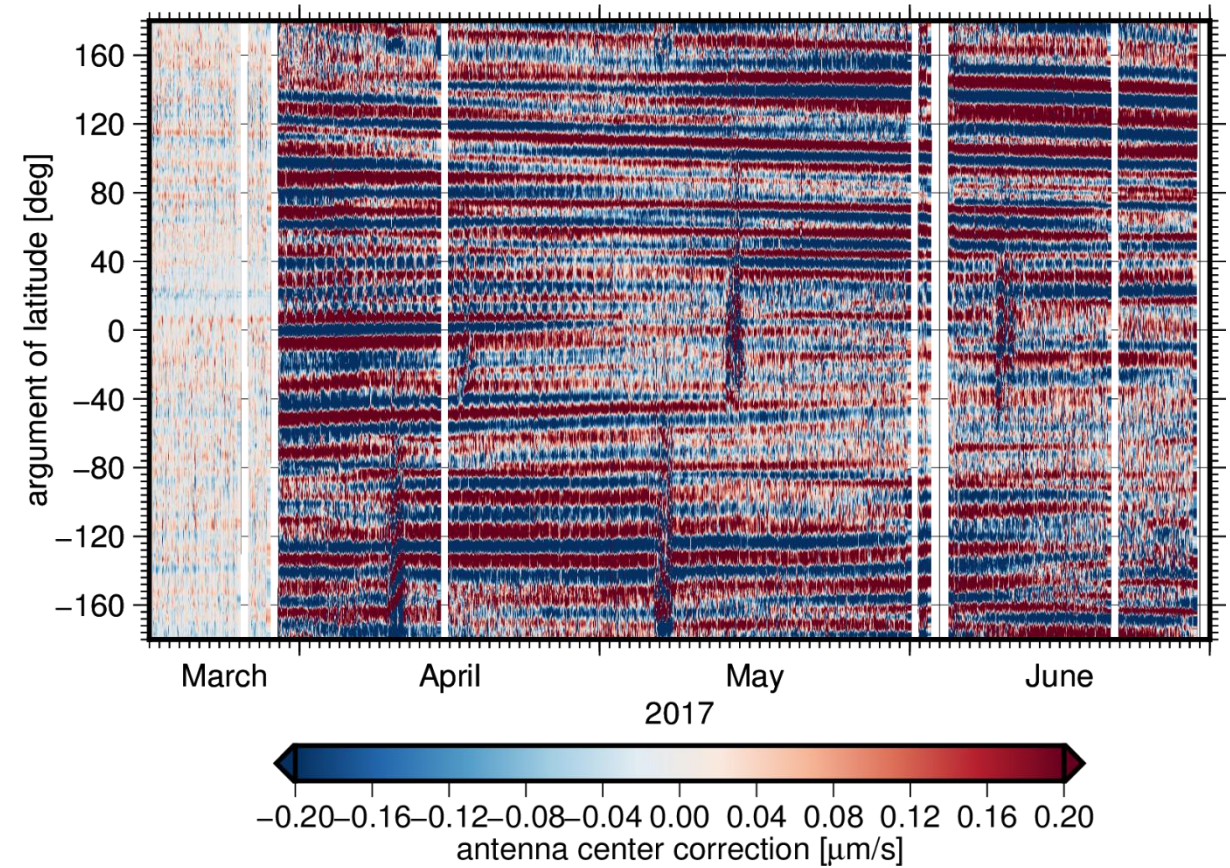
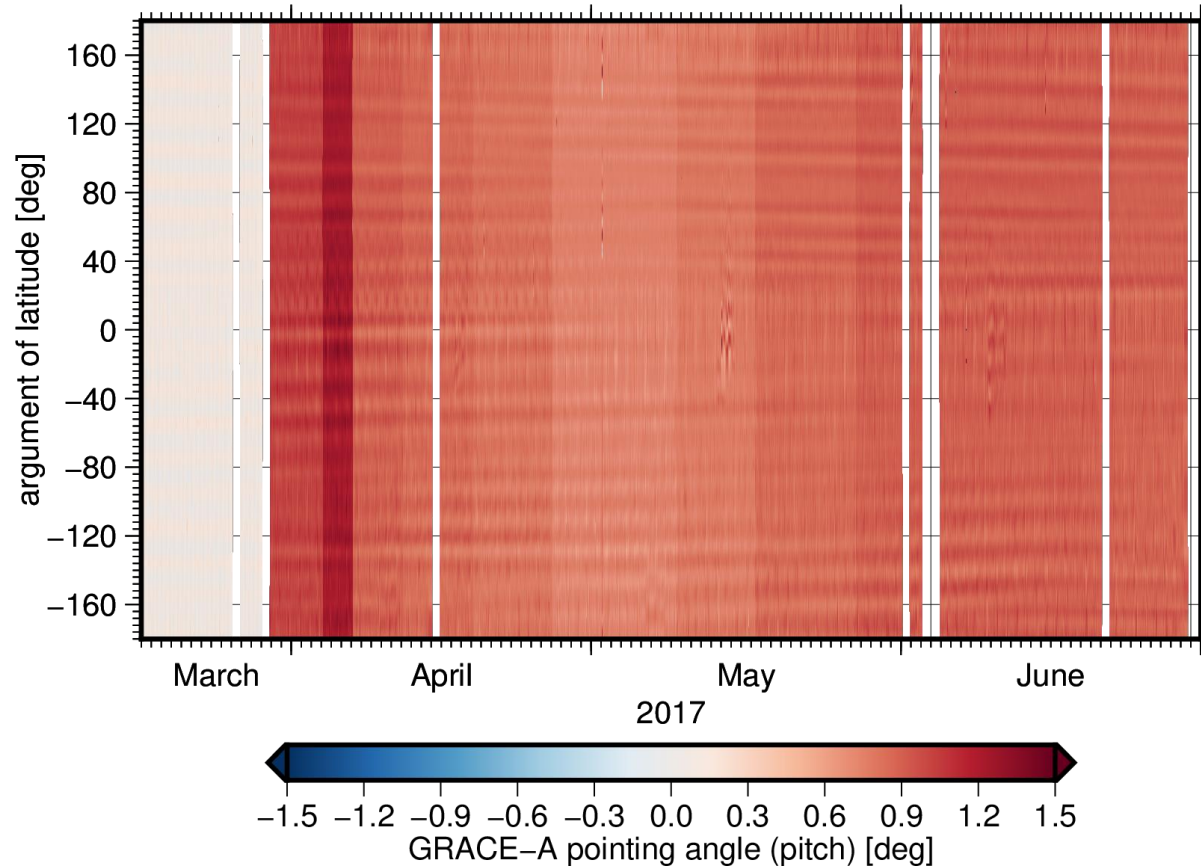
- During science operations, the GRACE satellites directly face each other
 - K-band antenna center and satellite center of mass (approximately) lie on the line-of-sight
- This pitch bias was removed on March 29 to alleviate accelerometer transplant
 - Both spacecraft hit the atmosphere at the same angle
 - Drag acts primarily along one accelerometer axis



- The drawback of this measure is an increase in magnitude of the K-band antenna center correction (ACC)
 - Attitude and ACC errors more prominently propagate into the ranging observations

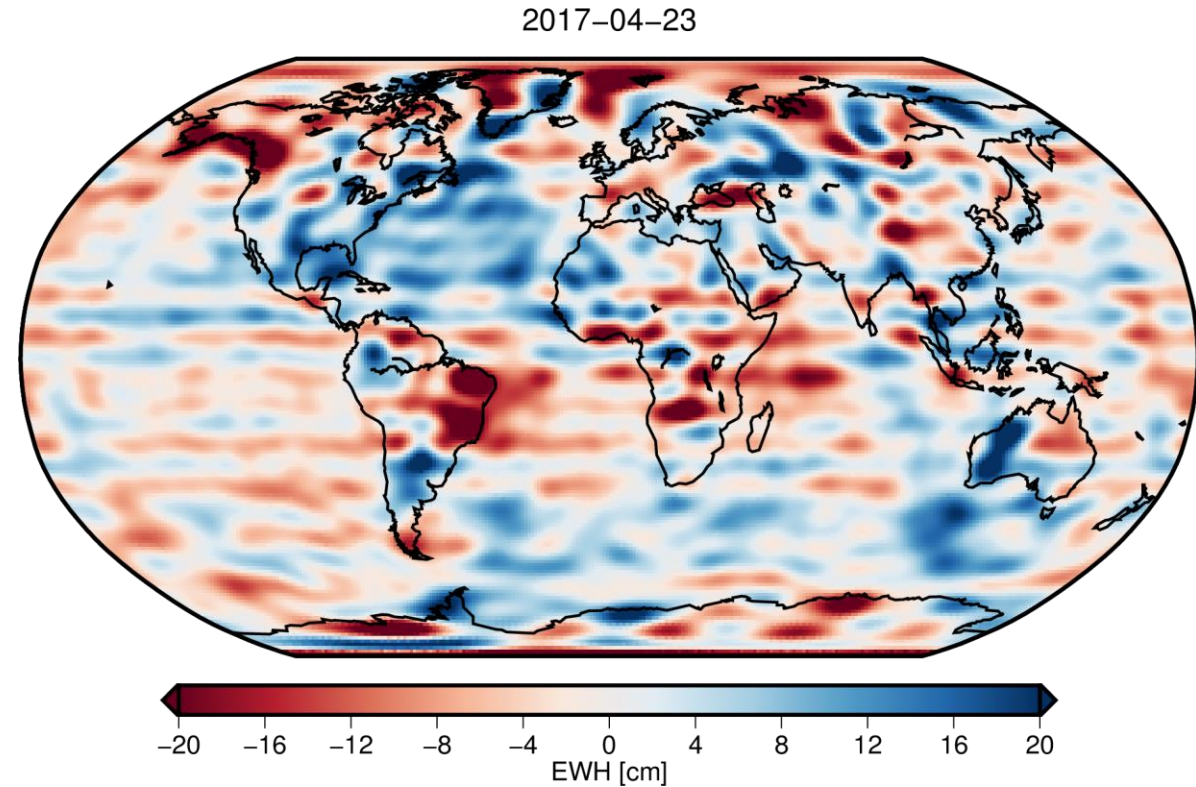
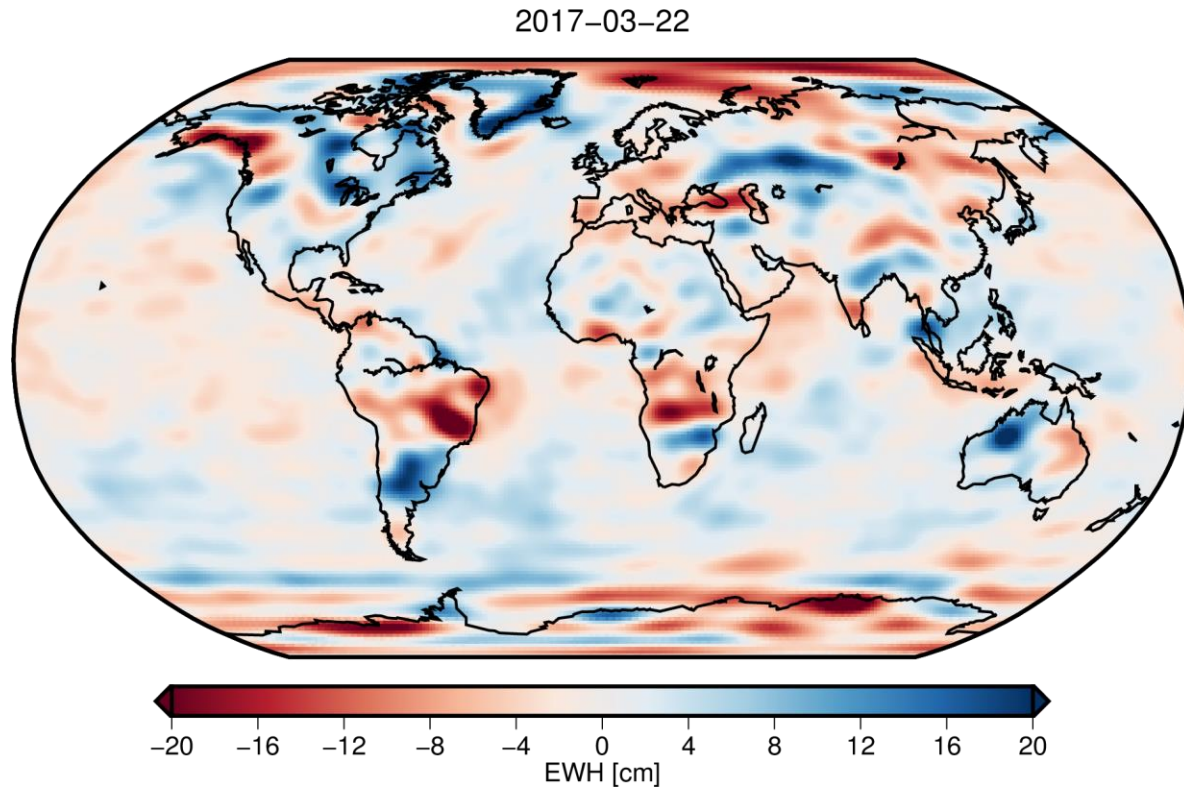
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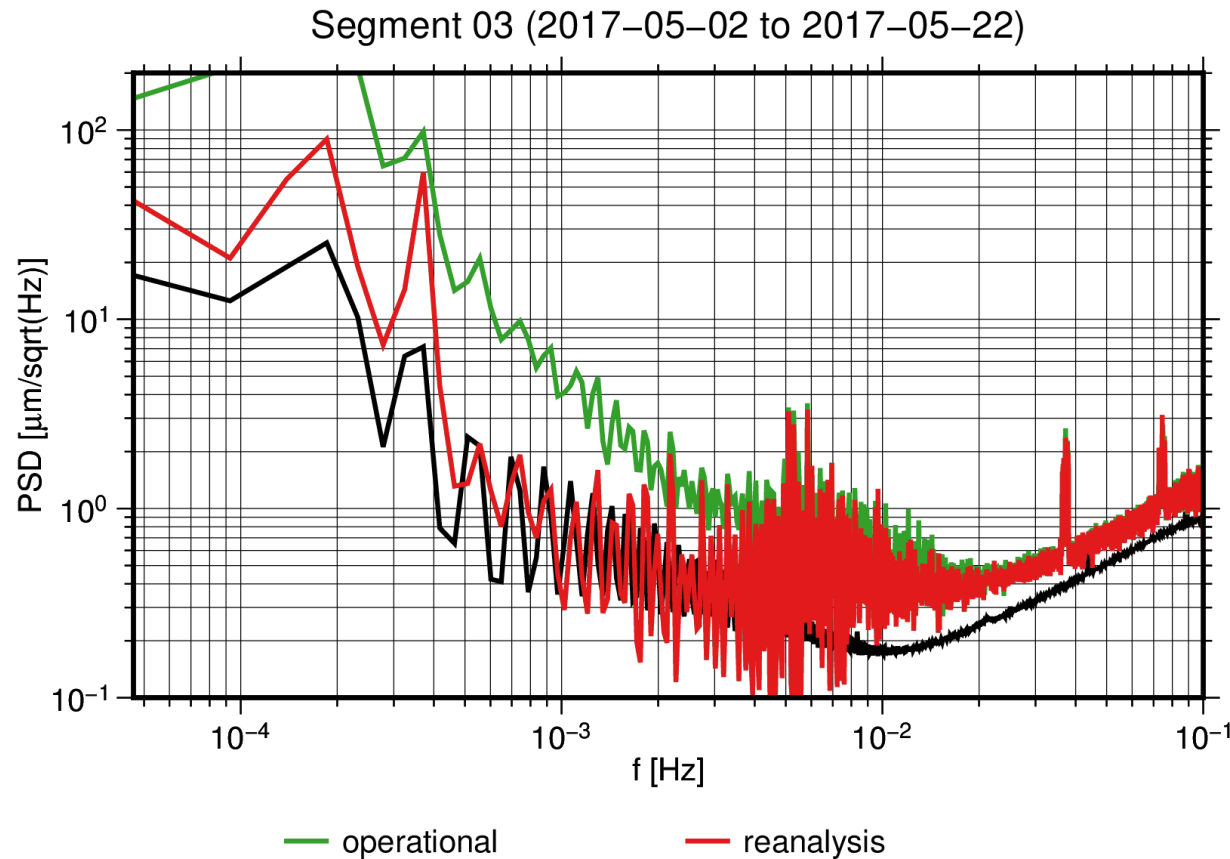
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Impact of Pitch Bias Removal

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red: GRACE-B accelerometer
green: accelerometer transplant
black: nominal science operations

Impact of Pitch Bias Removal

- The drawback of this measure is an increase in magnitude of the K-band antenna center correction (ACC)
 - Attitude and ACC errors more prominently propagate into the ranging observations

- In the frequency band 3 – 10 mHz propagated attitude errors dominate the spectrum
 - Additionally, this effect is non-stationary, which means it cannot be fully captured by TUGs and GFZs (stationary) covariance model