



The global land water storage data set GLWS 2.0

assimilating GRACE and GRACE-FO into a global hydrological model

**Helena Gerdener¹, Kerstin Schulze¹, Jürgen Kusche¹,
Petra Döll^{2,3}, Anna Klos^{4,1}**

¹Institute of Geodesy and Geoinformation, University of Bonn, Germany

²Institute of Physical Geography, Goethe University Frankfurt, Germany

³Senckenberg Leibniz Biodiversity and Climate Research Centre Frankfurt (SBIK-F), Germany

⁴Faculty of Civil Engineering and Geodesy, Military University of Technology, Warsaw, Poland

28.04.2023, Vienna, EGU 2023



MOTIVATION

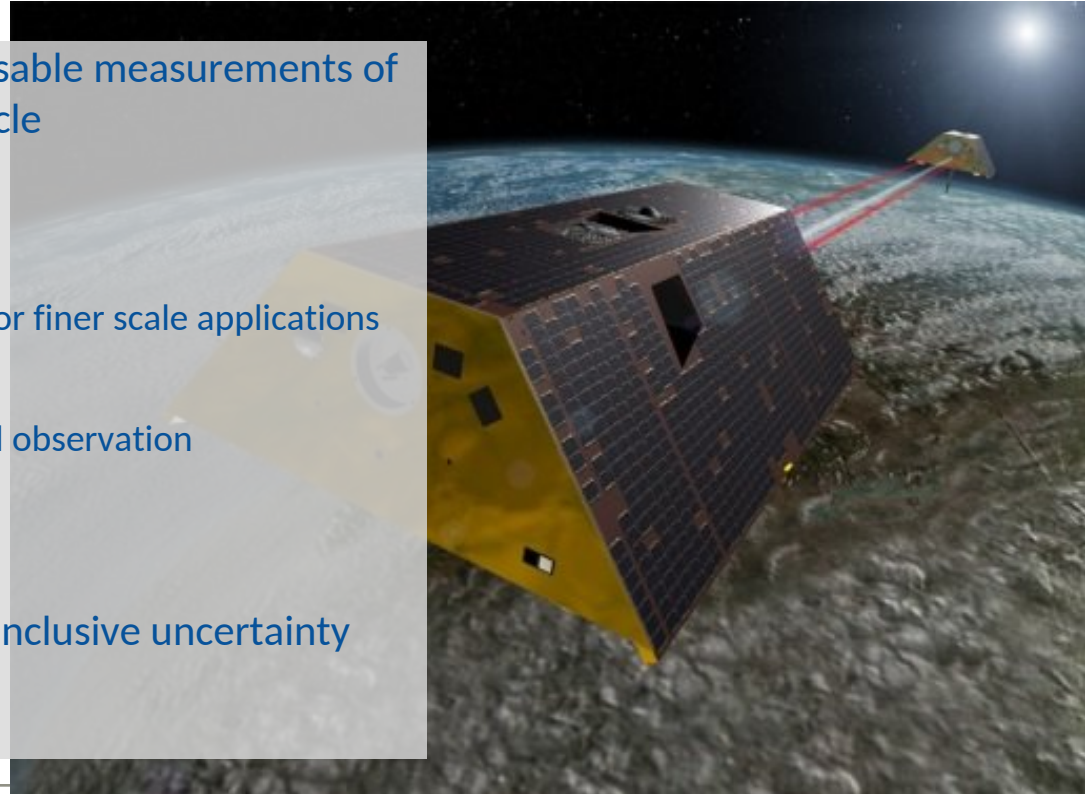
GRACE and GRACE-FO provide indispensable measurements of the global water cycle

But :

- Resolution of a few 100km is too coarse for finer scale applications
- Temporal gaps
- Separation of storages requires additional observation

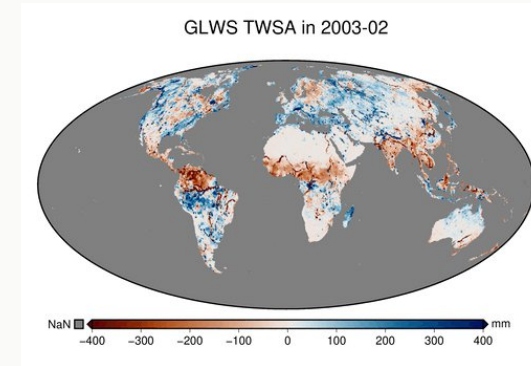
Goal:

- Provide a consistent global data set inclusive uncertainty quantification



GLWS2.0: GLOBAL LAND WATER STORAGE

A monthly global 0.5° data set from 2003 to 2019 for:

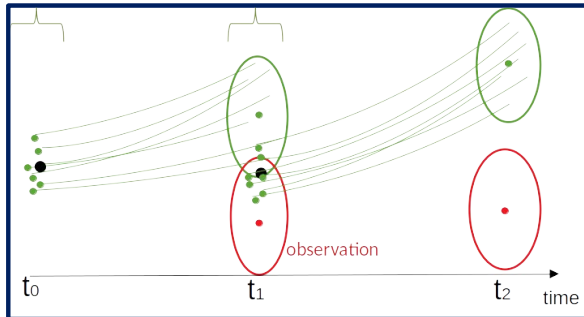


- Assimilation of global GRACE and GRACE/-FO TWSA into WaterGAP 2.2e
- Gerdener et al., submitted to Journal of Geodesy, pre-print published on Arxiv (<https://arxiv.org/abs/2211.17138>)
- GLWS2.0 data set published with PANGAEA



DATA ASSIMILATION FRAMEWORK

- Based on Eicker et al. (2014) via Ensemble Kalman Filter (EnKF Evensen, 1996)
- Parallel Data Assimilation Framework (PDAF, Nerger and Hiller, 2013)
- Assimilate 4° GRACE TWSA global grids into the WaterGAP 2.2e version based on uncertainty information
 - ~ 95 % of land surface except Greenland and Antarctica
- More details on PANGAEA, Gerdener et al. (2023)



PREDICTION:

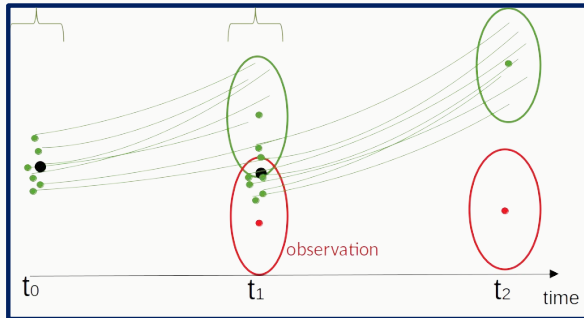
$$X_k^- = [X_k^{(1)-}, \dots, X_k^{(N)-}]$$

UPDATE:

$$X_k^+ = X_k^- + K_k (Y_k - AX_k^-)$$

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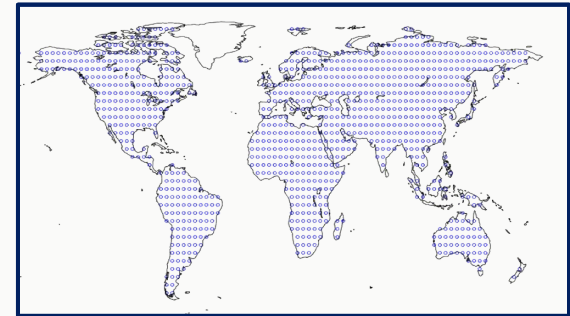


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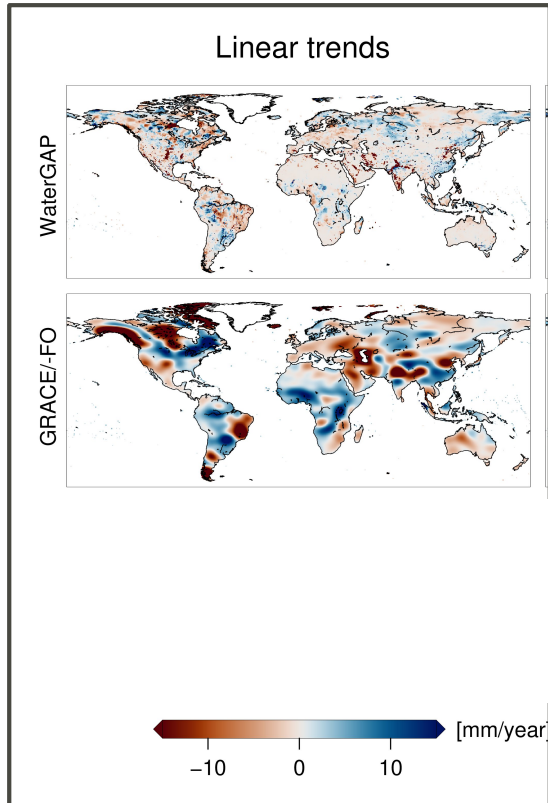
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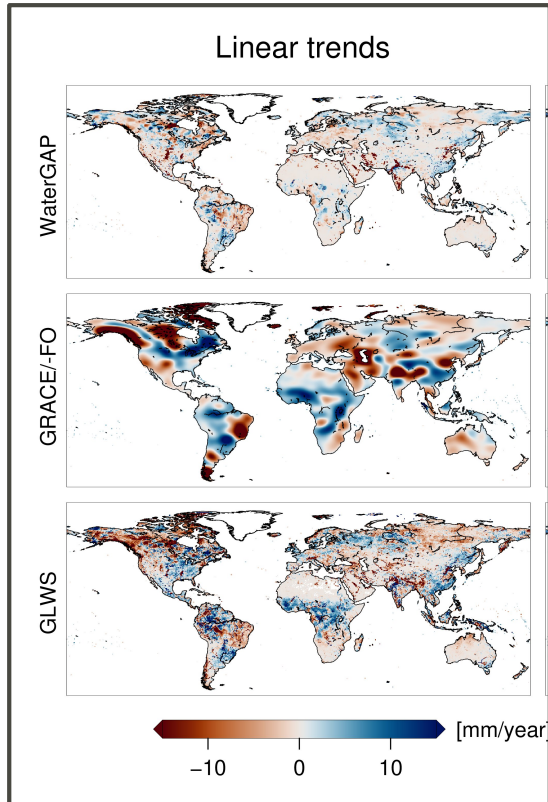


GLWS2.0: GLOBAL LAND WATER STORAGE



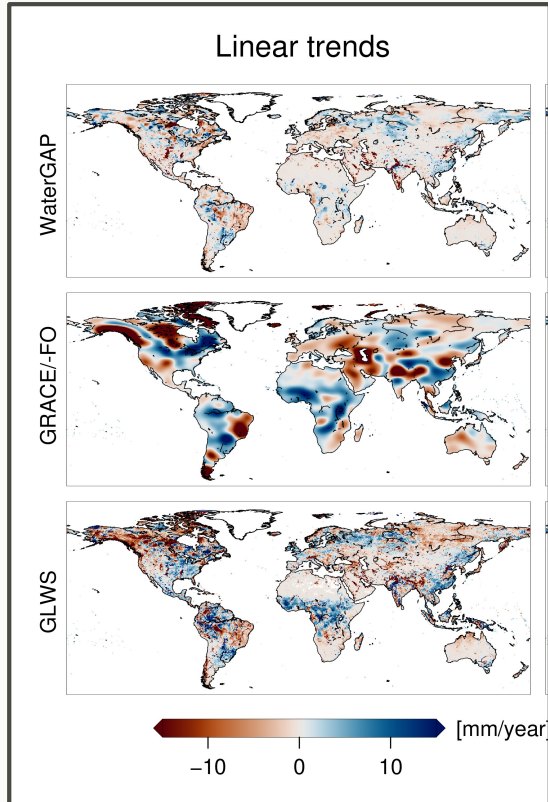
- Monthly fields have no temporal gaps
- Higher spatial resolution as compared to GRACE/-FO; ~ 50km (no simple statistical downscaling)
- Underestimation of simulated linear trends (Scanlon et al. (2018) in WaterGAP is improved in GLWS
- For GLWS the ensemble mean is shown

GLWS2.0: GLOBAL LAND WATER STORAGE



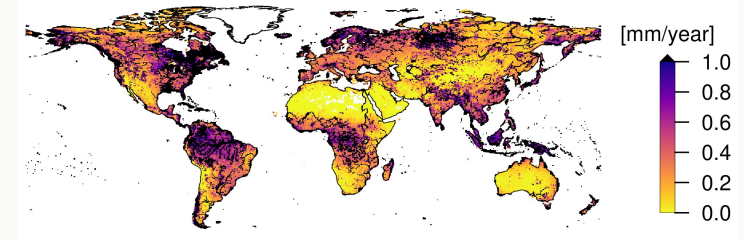
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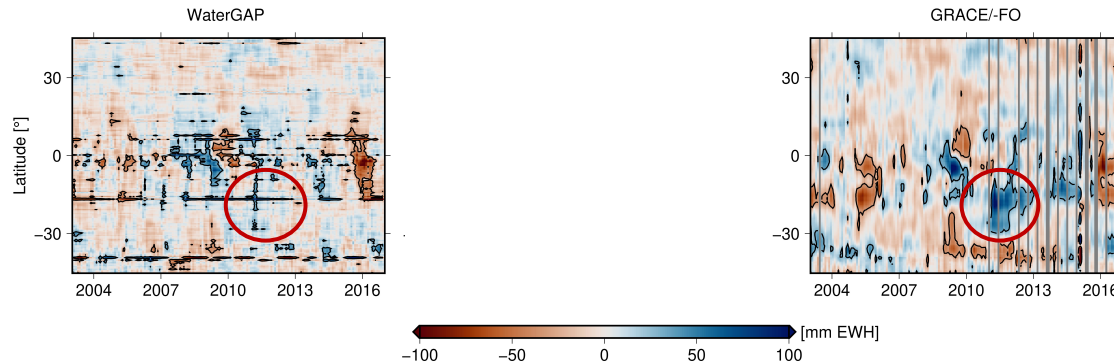
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TWSA linear trend uncertainty from ensemble



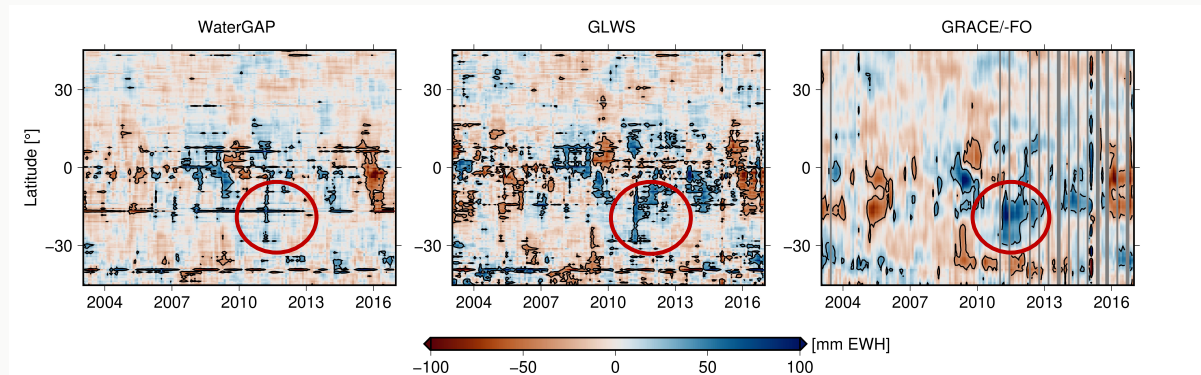
TRENDS AND NON-SEASONALITY

- Nonseasonal TWSA from GLWS: latitude-averaged vs. Time (compare Tapley et al., 2019)
- Contains all major extreme events that are given in GRACE/-FO as well
- GLWS shows La Nina event in 2010-2012 with more spatial-temporal extent



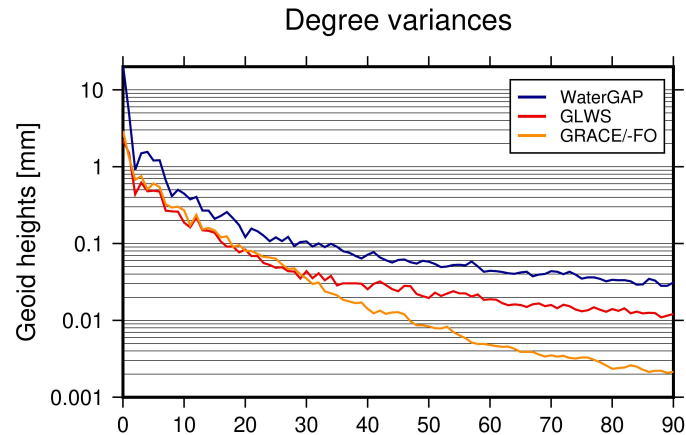
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ANALYSIS IN SPECTRAL DOMAIN

- Power spectrum of GLWS, WaterGAP and GRACE/-FO
- Note: projecting grids to spherical harmonic coefficients (land mass only, Greenland and Antarctica excluded)
- Smooth transition in spectral domain, example August 2010:

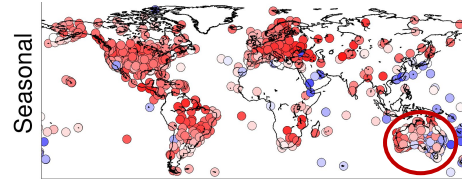


VALIDATION WITH GNSS

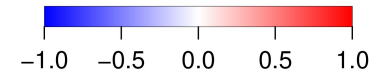
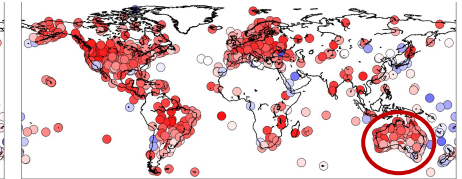
Correlations of GLWS with 1030 GNSS stations

- Vertical displacements
- Signal separated into sub-signals
- Improvement correlation in all band, e.g.:
 - Australia, seasonal signal

GNSS vs GRACE-/FO (d/o 96)



GNSS vs GLWS (d/o 96)



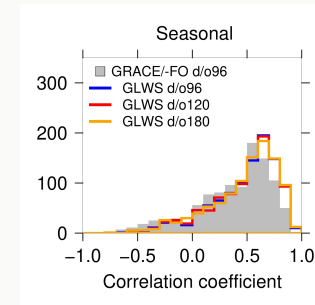
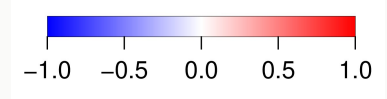
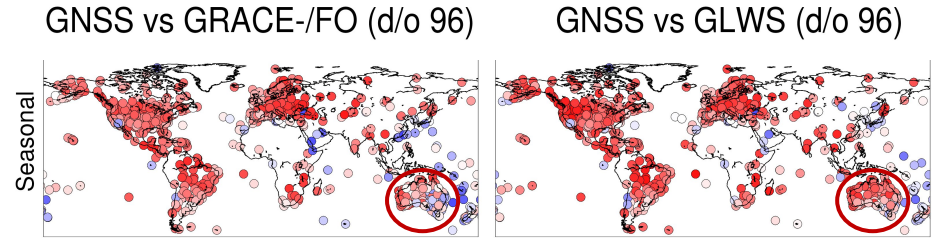
IGS, repro-3 solution, NTAL and NTOL removed with predictions of Vertical displacement by GFZ, detrended

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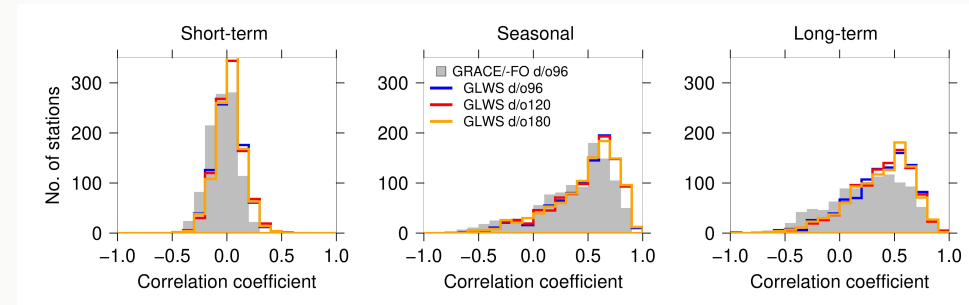
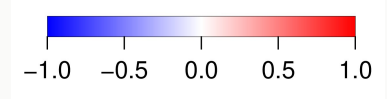
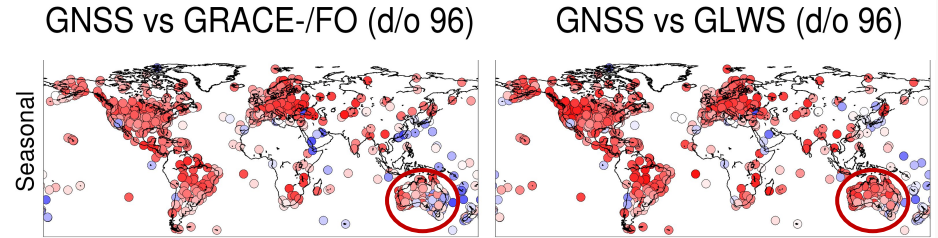


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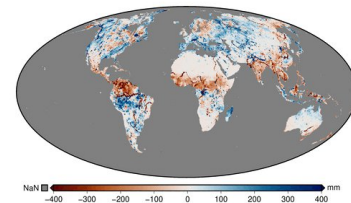
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TAKE HOME & OUTLOOK



- 1) **Global Land Water Storage (GLWS) 2.0:**
new 0.5° monthly data set via global assimilation of GRACE/-FO TWSA into WaterGAP
- 2) GLWS seems to fit better to GNSS than GRACE/-FO
evaluation ongoing for hydrology, drought applications, extension of framework
(localization techniques, daily outputs, calibration and assimilation)
- 3) Freely available on Pangaea:
Application and evaluation in your research will help to improve
(<https://doi.pangaea.de/10.1594/PANGAEA.954742>)



gerdener@geod.uni-bonn.de



PANGAEA.

LITERATURE

Eicker, A., Schumacher, M., Kusche, J., Döll, P., & Schmied, H. M. (2014). Calibration/data assimilation approach for integrating GRACE data into the WaterGAP Global Hydrology Model (WGHM) using an ensemble Kalman filter: First results. *Surveys in Geophysics*, 35(6), 1285-1309.

Evensen, G. (1994). Sequential data assimilation with a nonlinear quasi-geostrophic model using Monte Carlo methods to forecast error statistics. *Journal of Geophysical Research: Oceans*, 99(C5), 10143-10162.

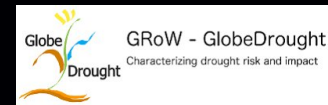
Gerdener, Helena, Schulze, Kerstin, Kusche, Jürgen (2023): GLWS 2.0: A global product that provides total water storage anomalies, groundwater, soil moisture and surface water with a spatial resolution of 0.5° from 2003 to 2019. PANGAEA. <https://doi.org/10.1594/PANGAEA.954742>,

Mayer-Gürr, T., Behzadpour, S., Ellmer, M. Kvas, A. Klinger, B., Zehentner, N. (2016): ITSG-Grace2016 - Monthly and Daily Gravity Field Solutions from GRACE. GFZ Data Services. <http://doi.org/10.5880/icgem.2016.007>

Müller Schmied, H., Cáceres, D., Eisner, S., Flörke, M., Herbert, C., Niemann, C., Peiris, T. A., Popat, E., Portmann, F. T., Reinecke, R., Schumacher, M., Shadkam, S., Telteu, C.-E., Trautmann, T., & Döll, P. (2021). The global water resources and use model WaterGAP v2.2d: model description and evaluation. *Geoscientific Model Development*, 14(2), 1037–1079. <https://doi.org/10.5194/gmd-14-1037-2021>

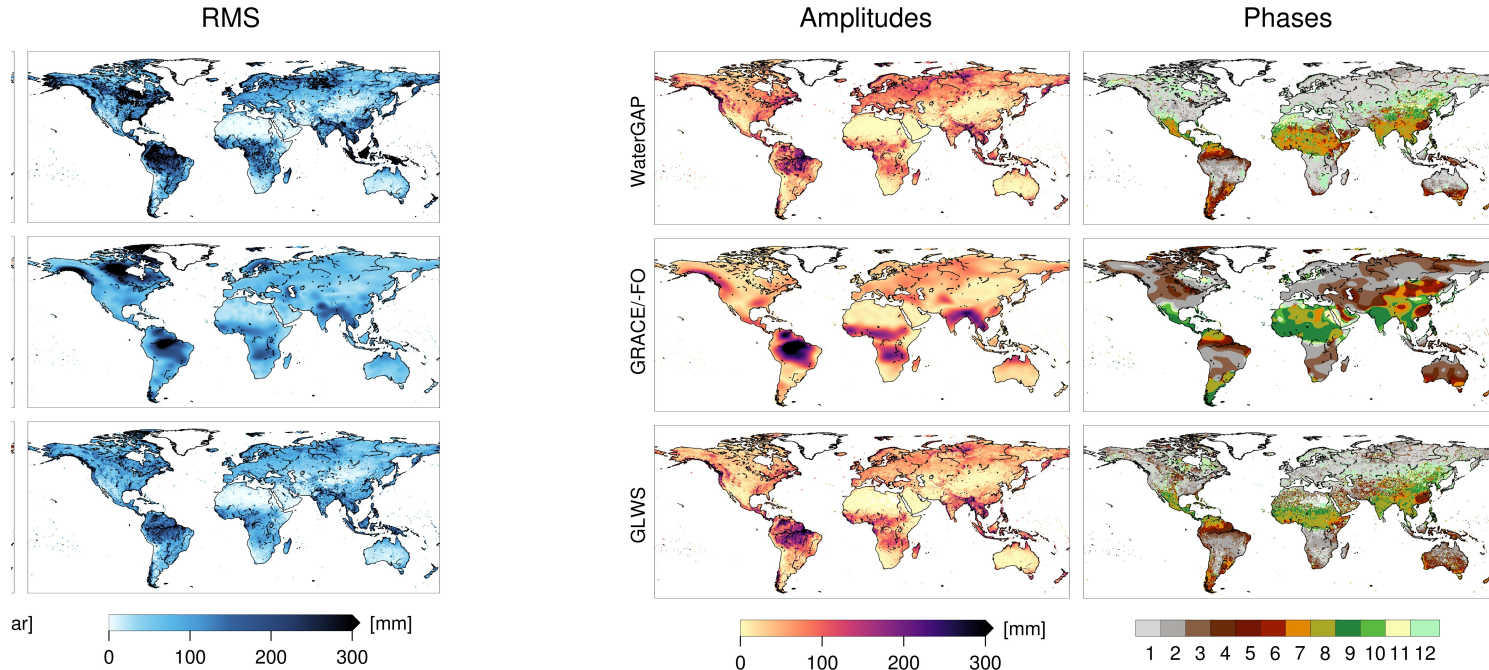
Scanlon, B. R., Zhang, Z., Save, H., Sun, A. Y., Schmied, H. M., Van Beek, L. P., ... & Bierkens, M. F. (2018). Global models underestimate large decadal declining and rising water storage trends relative to GRACE satellite data. *Proceedings of the National Academy of Sciences*, 115(6), E1080-E1089.

This work is part of the GlobeDrought and the GlobalCDA projects



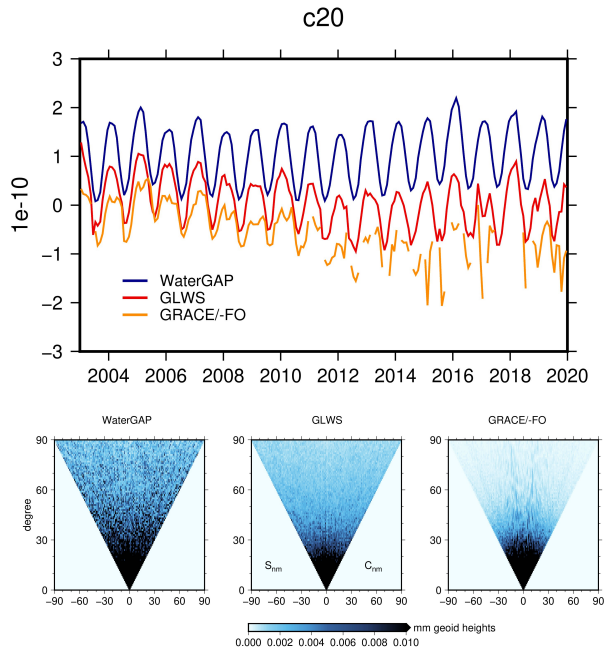
APPENDIX

- RMS, Annual amplitudes, and annual phases



APPENDIX

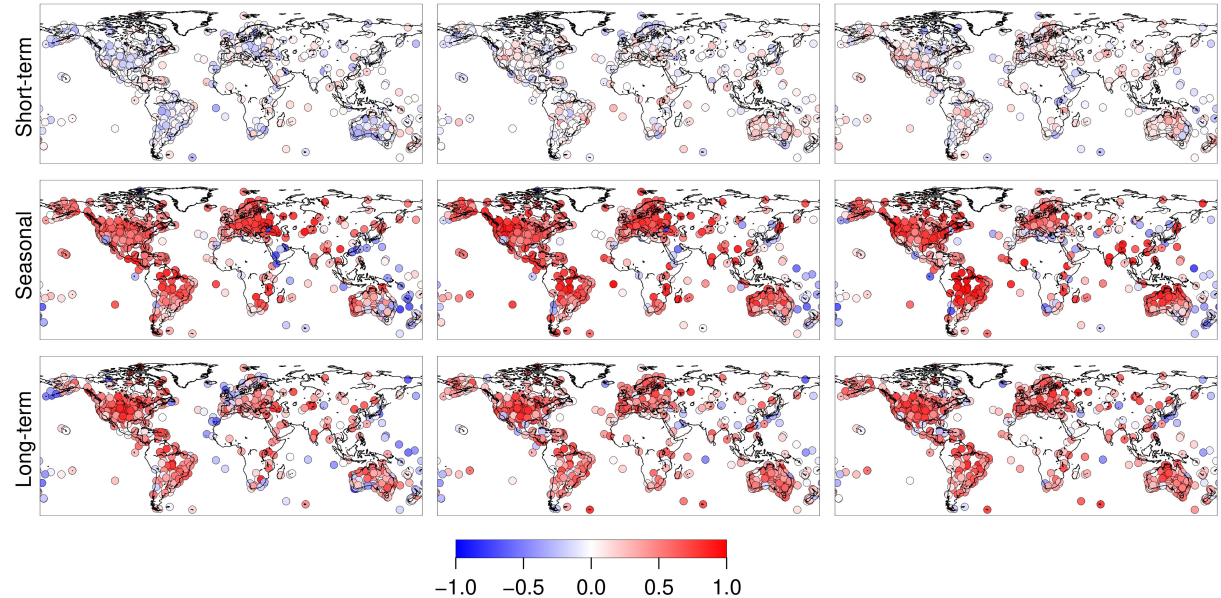
- Degree 20 and GNSS comparison to WaterGAP (d/o 96)



GNSS vs GRACE-/FO (d/o 96)

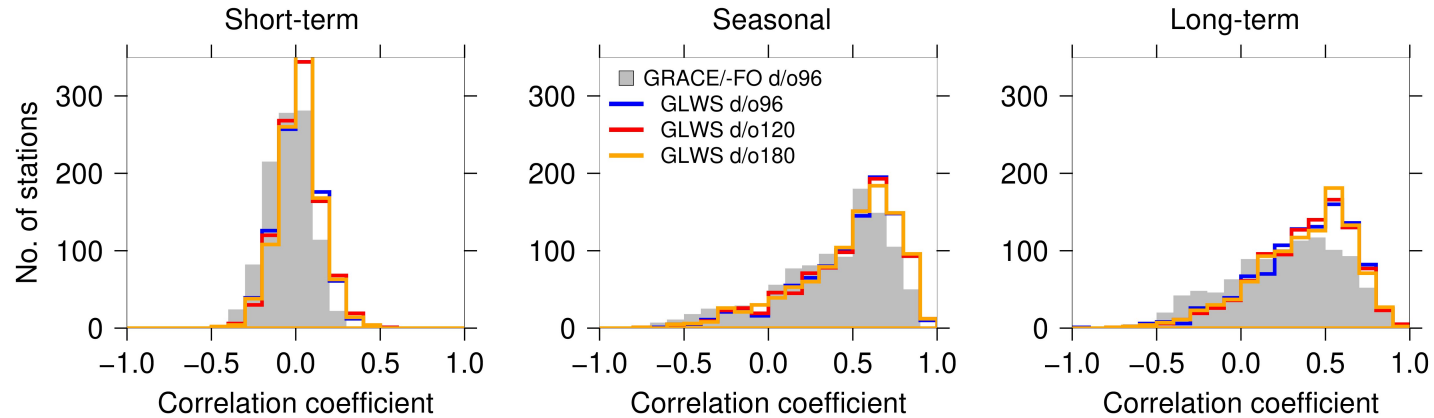
GNSS vs GLWS (d/o 96)

GNSS vs WaterGAP (d/o 96)



VALIDATION WITH GNSS

- Improvement of correlation with GLWS compared to GRACE/-FO in all temporal bands
- Minor changes between varying maximum d/o



APPENDIX

- Comparison GNSS and GLWS for degrees 120 and 180

