

Validation of simulated and GRACE based ocean bottom pressure time series against in situ observations

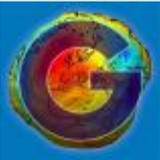
Lea Poropat, Inga Bergmann-Wolf,
Henryk Dobslaw, Frank Flechtner

German Research Centre for Geosciences (GFZ)
Department 1: Geodesy
Section 1.3: Earth System Modelling
poropat@gfz-potsdam.de



Motivation

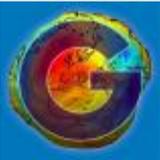
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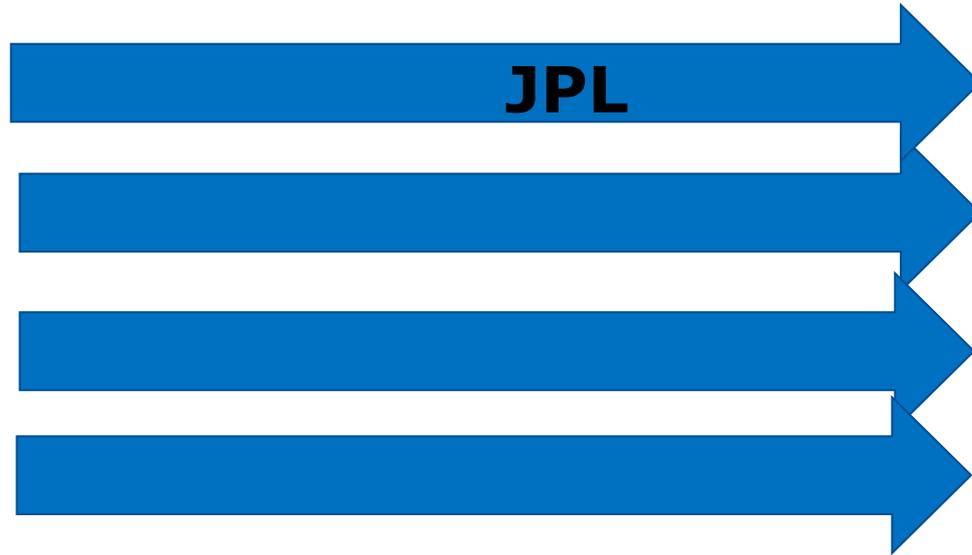
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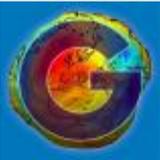
**Level-2
Products**



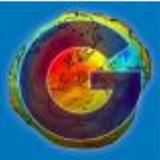
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Products**



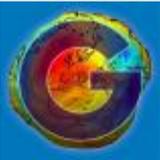
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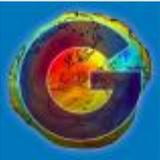
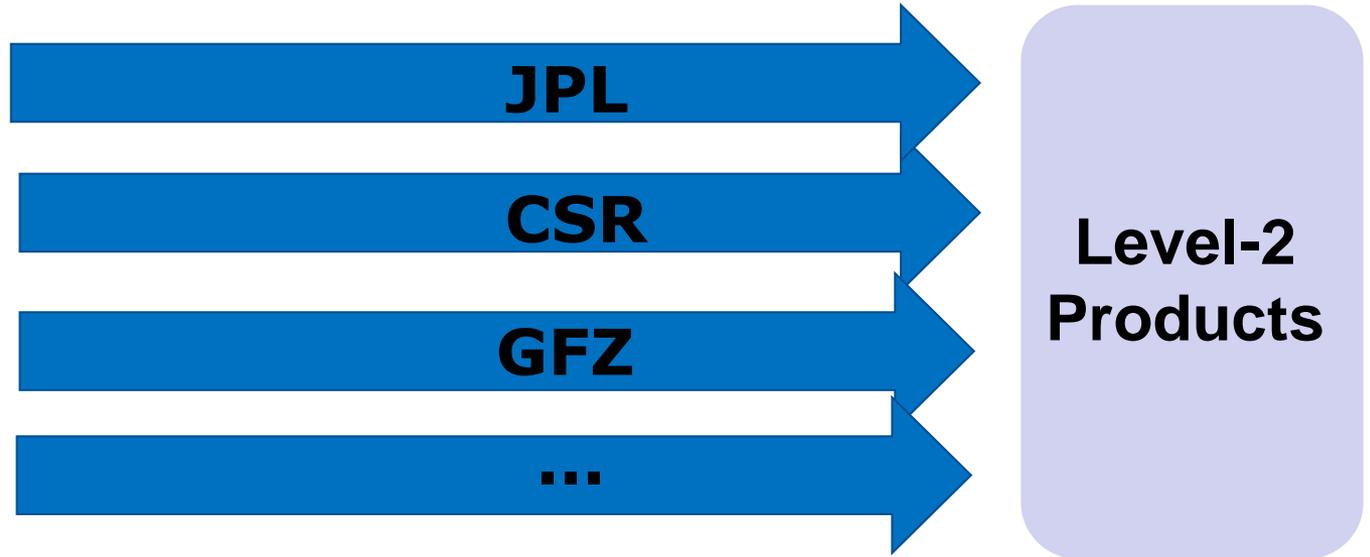
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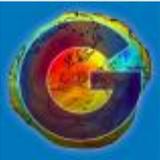
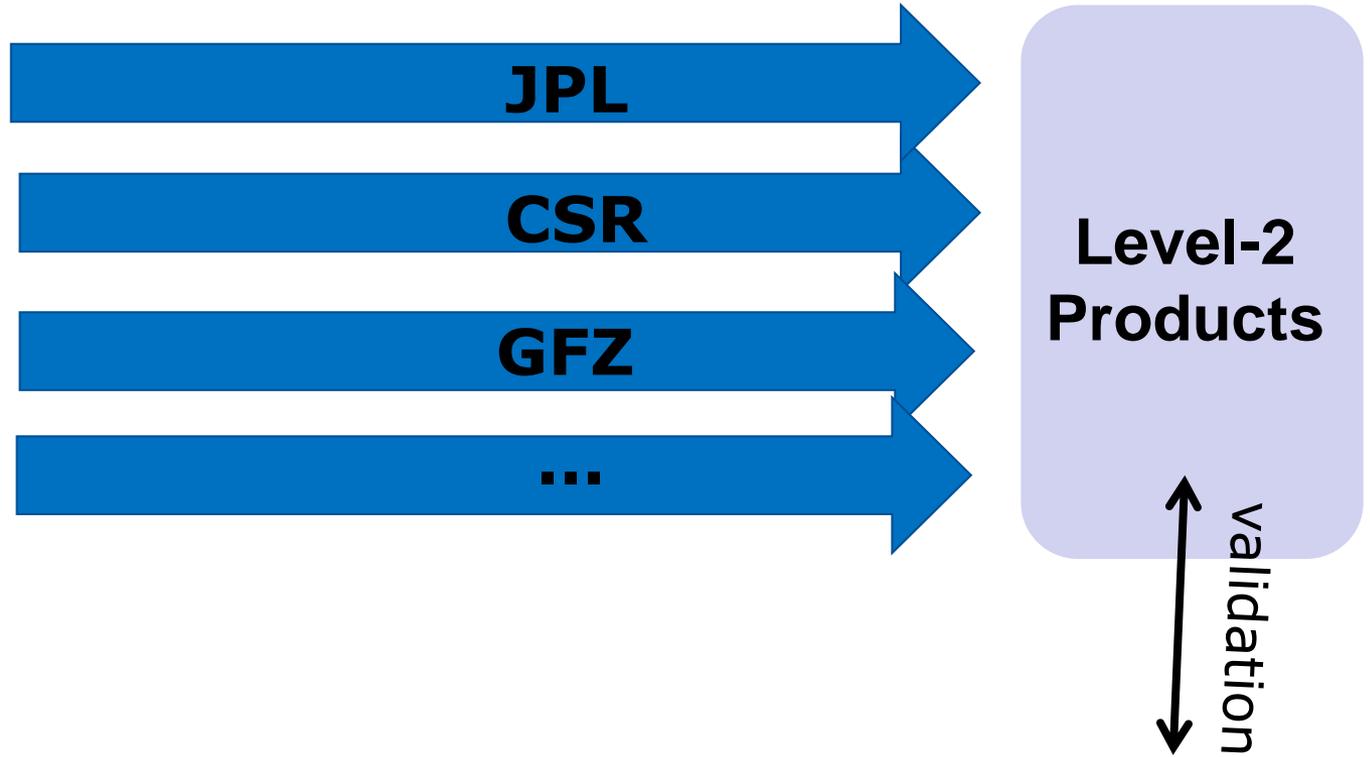
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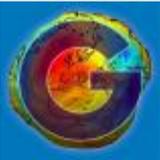
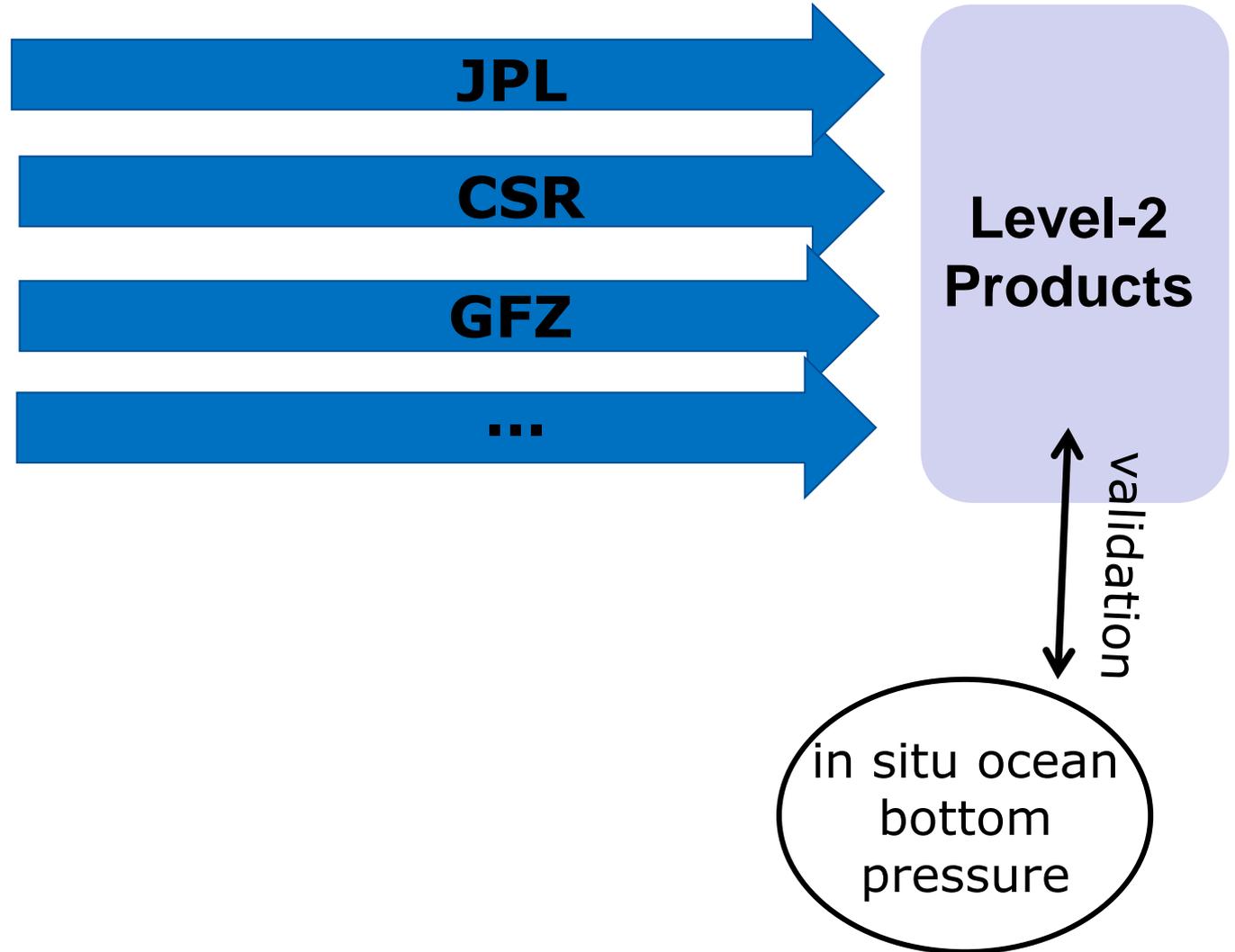
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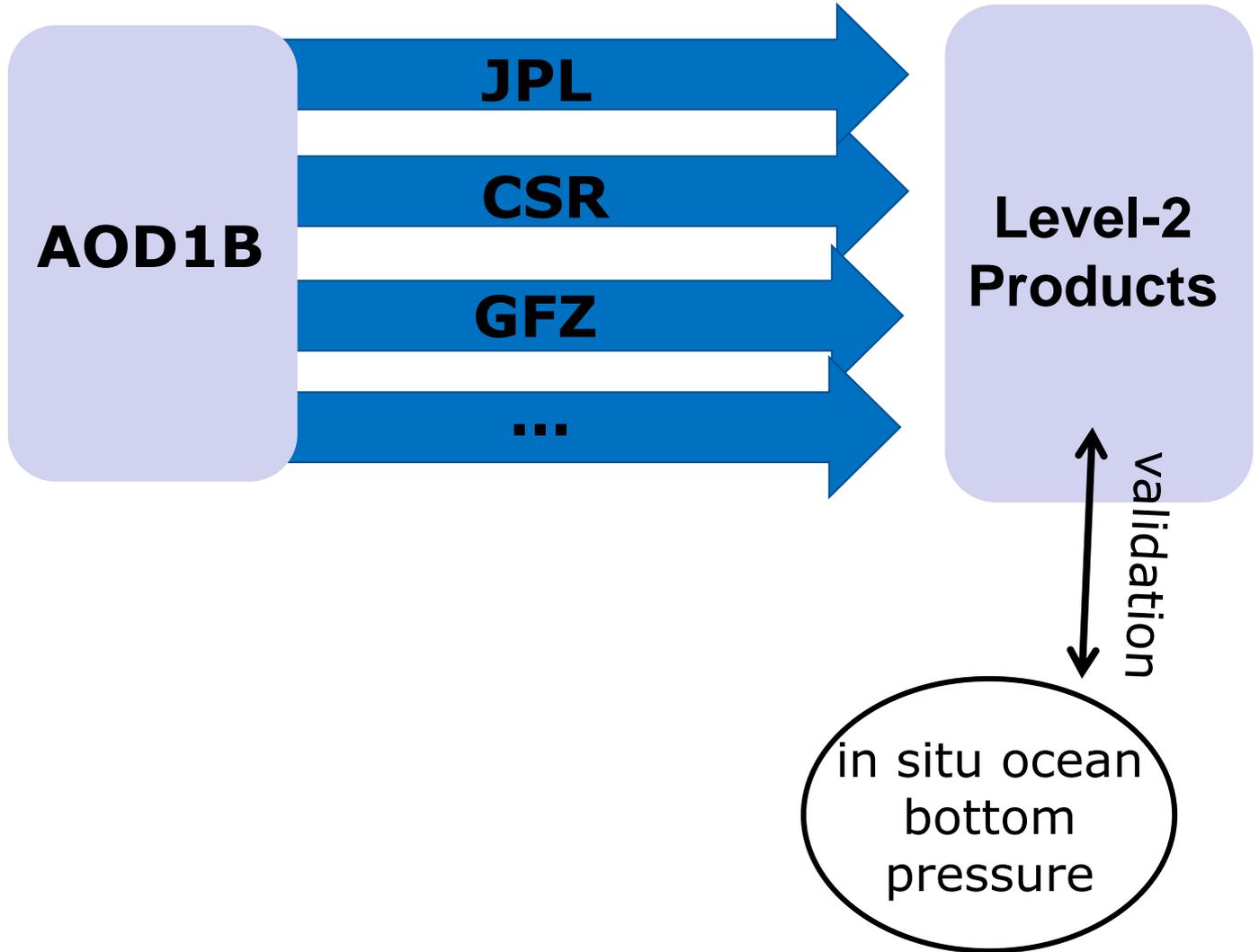
Motivation



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Motivation



AOD1B

JPL

CSR

GFZ

...

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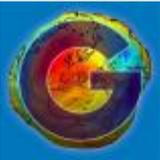
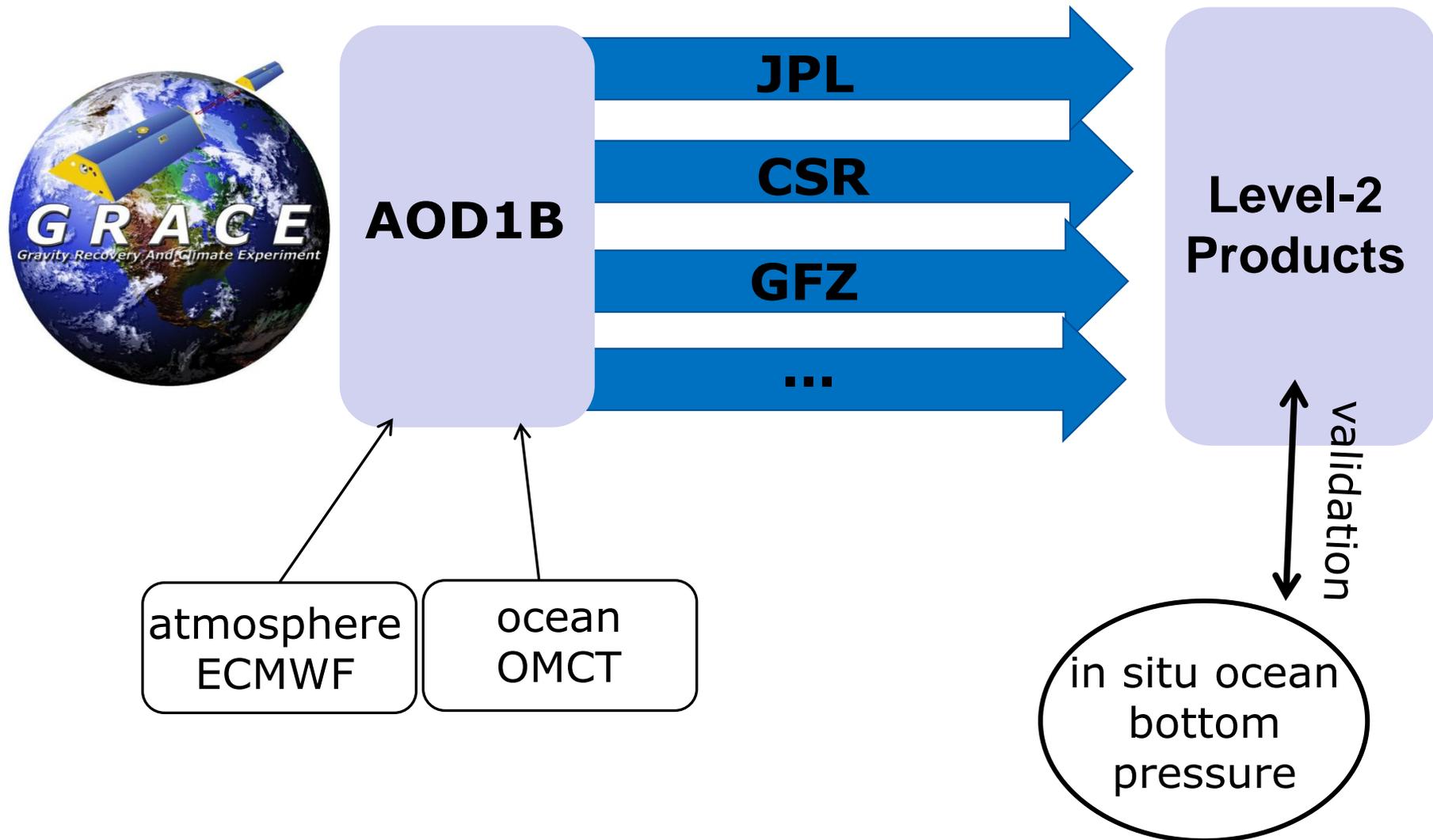
atmosphere
ECMWF

in situ ocean
bottom
pressure

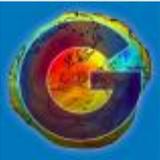
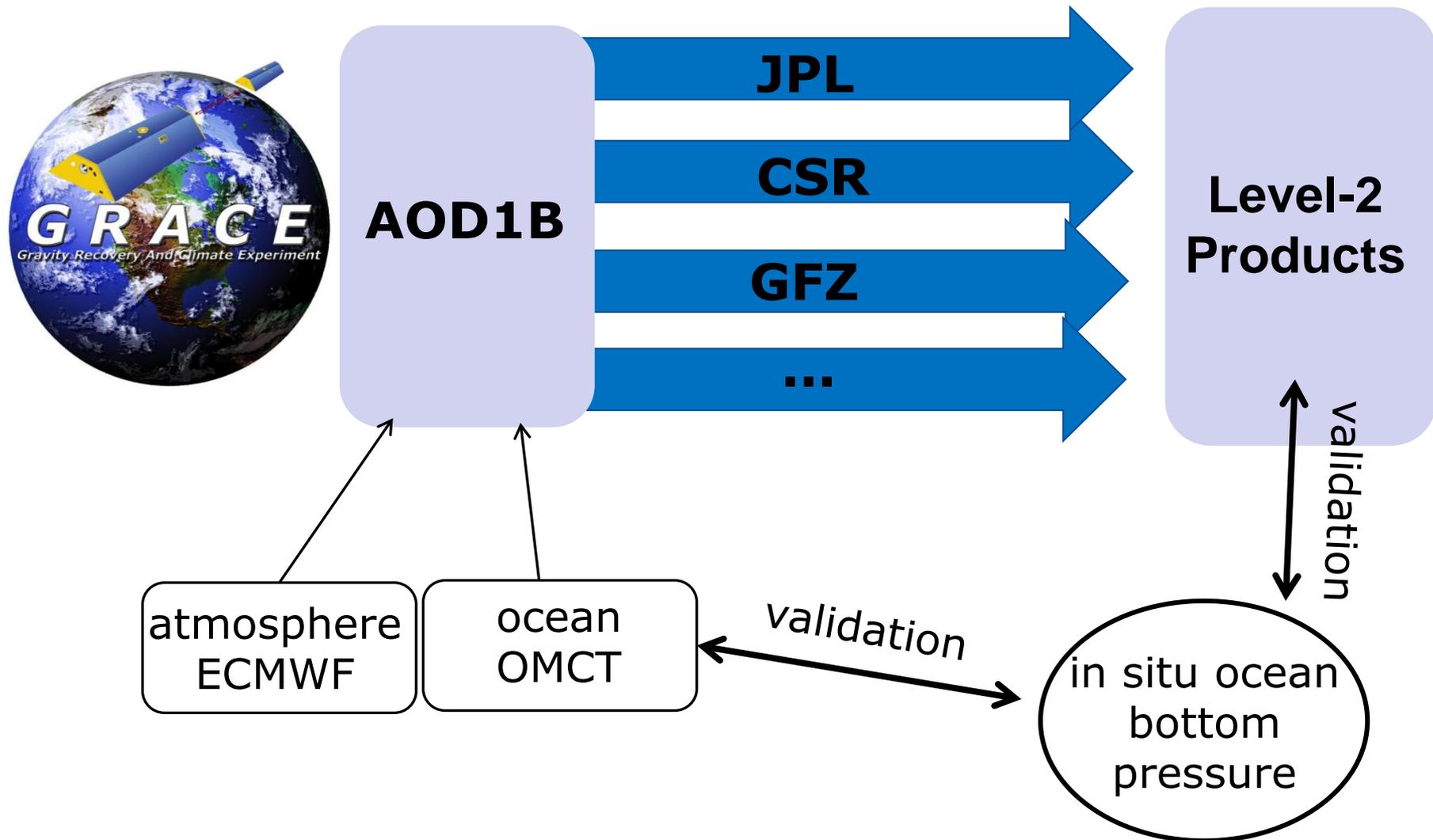
validation



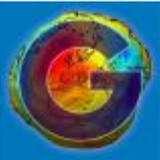
Motivation



Motivation



Preprocessing of in situ data

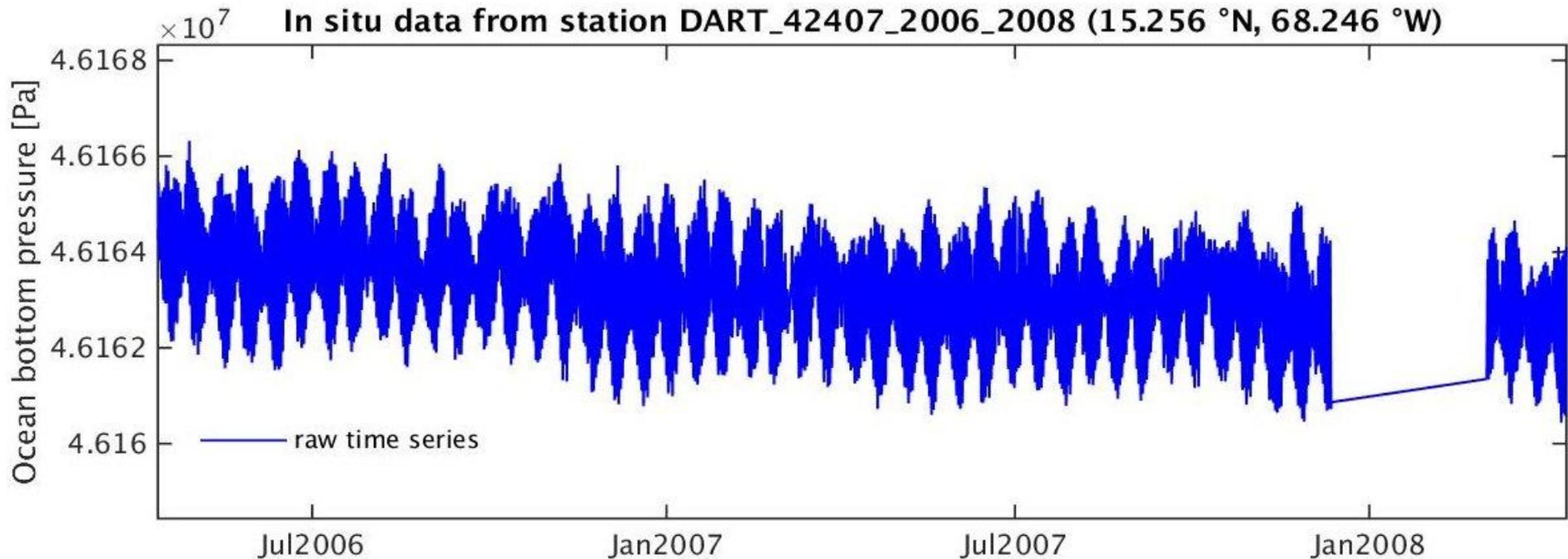


Preprocessing of in situ data

- removing outliers, drifts, jumps and trends
- changing time step to 1 hour

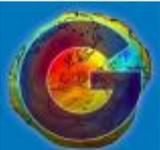
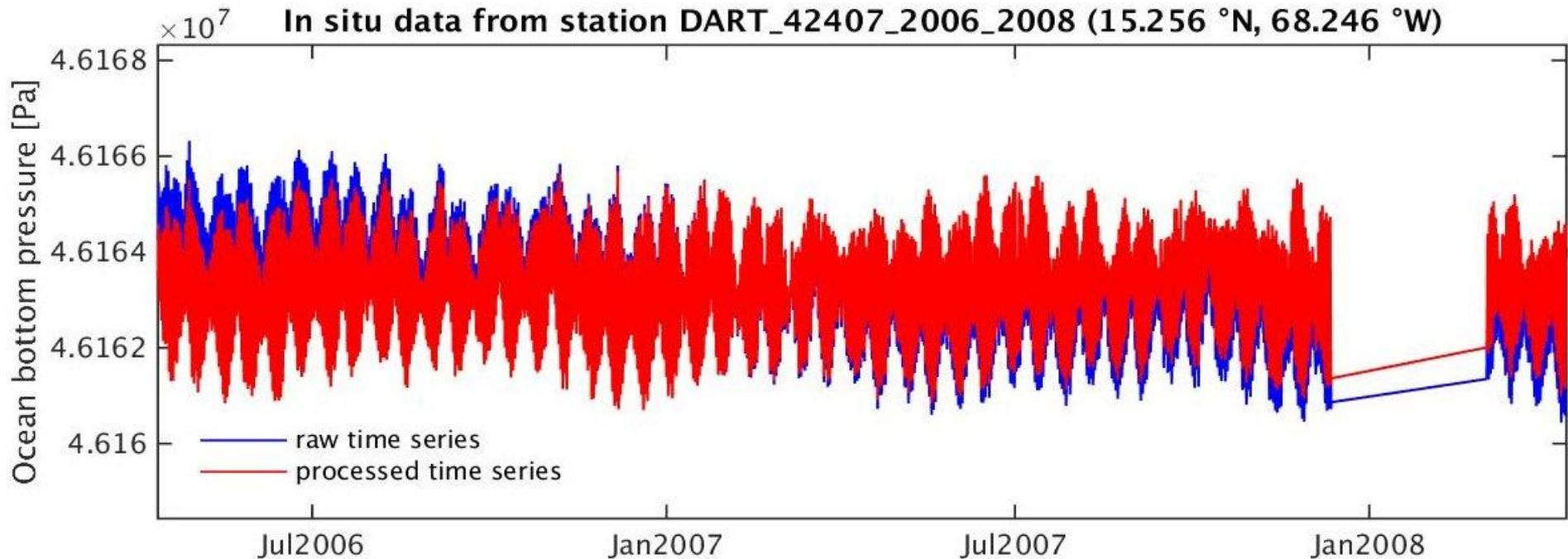
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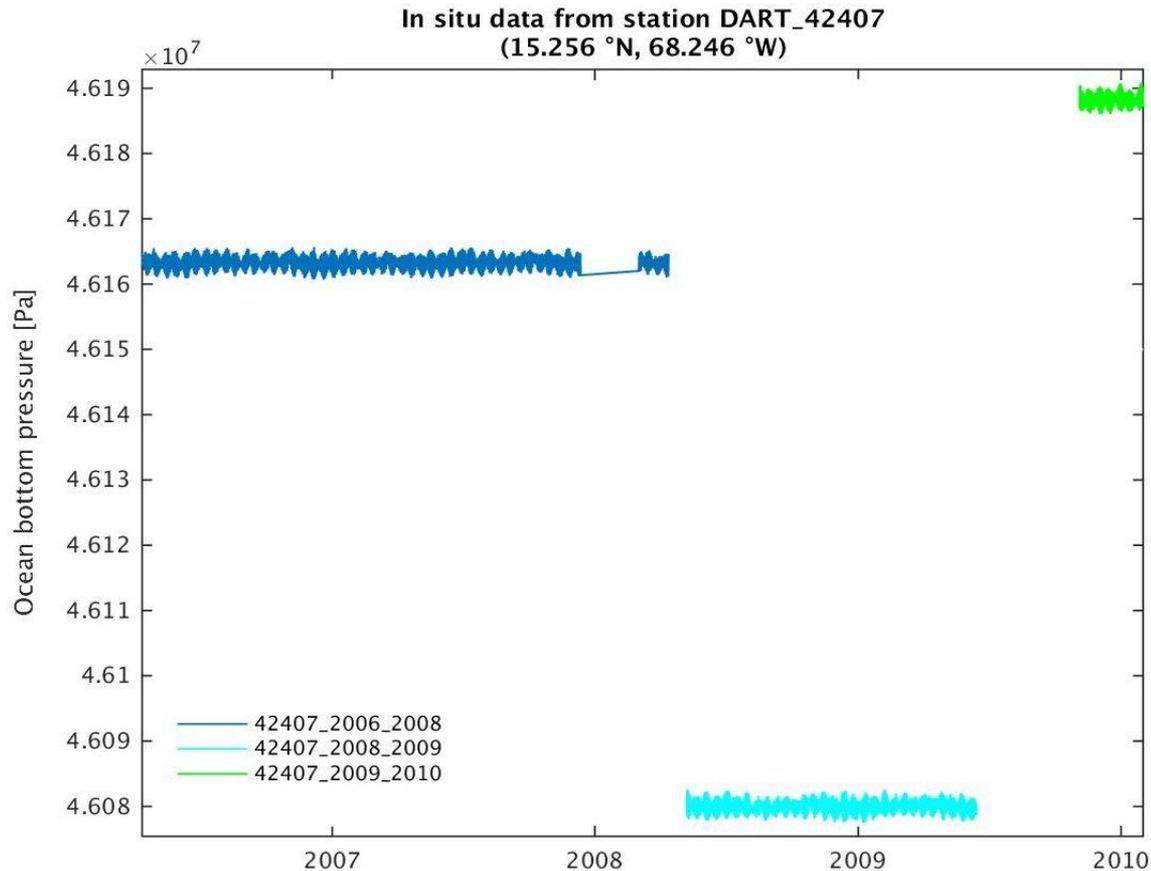
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Preprocessing of in situ data

- removing outliers, drifts, jumps and trends
- changing time step to 1 hour
- stacking time series from the same station

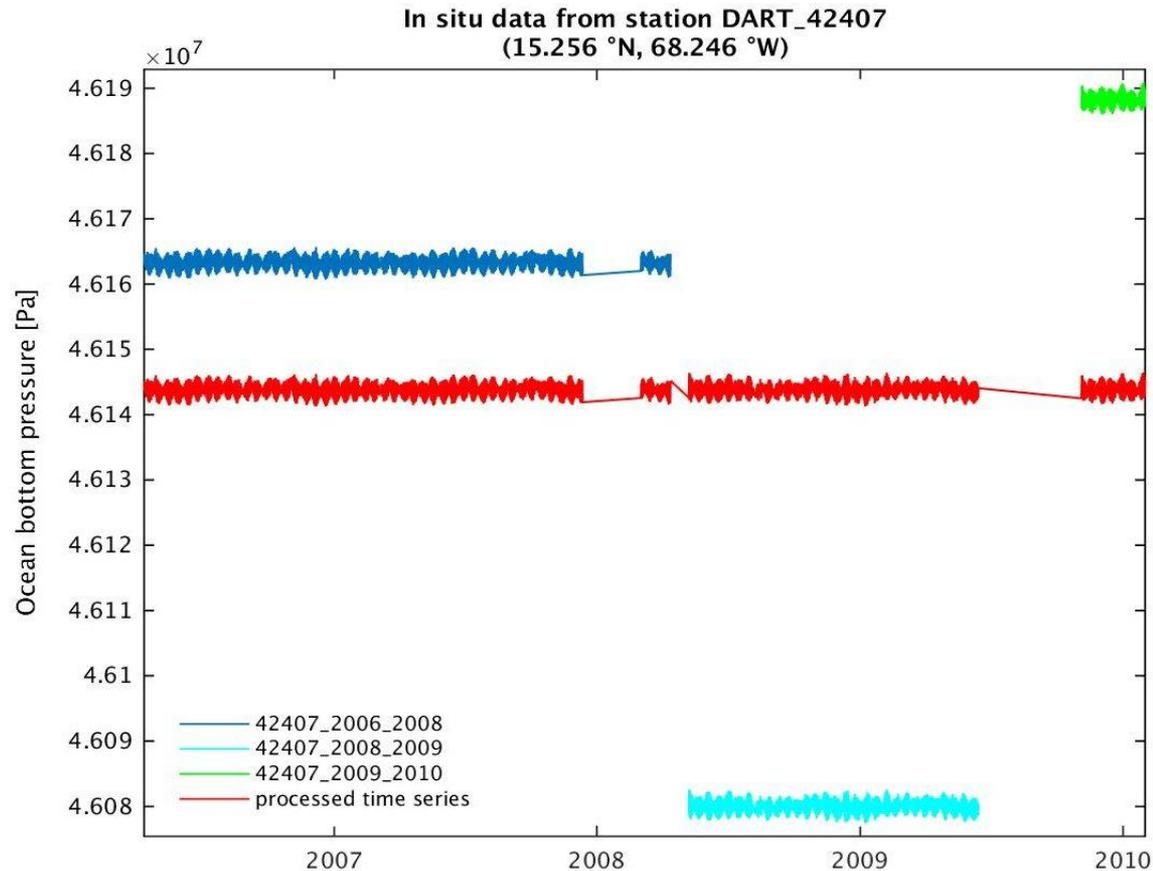
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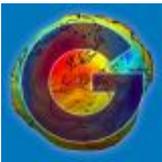
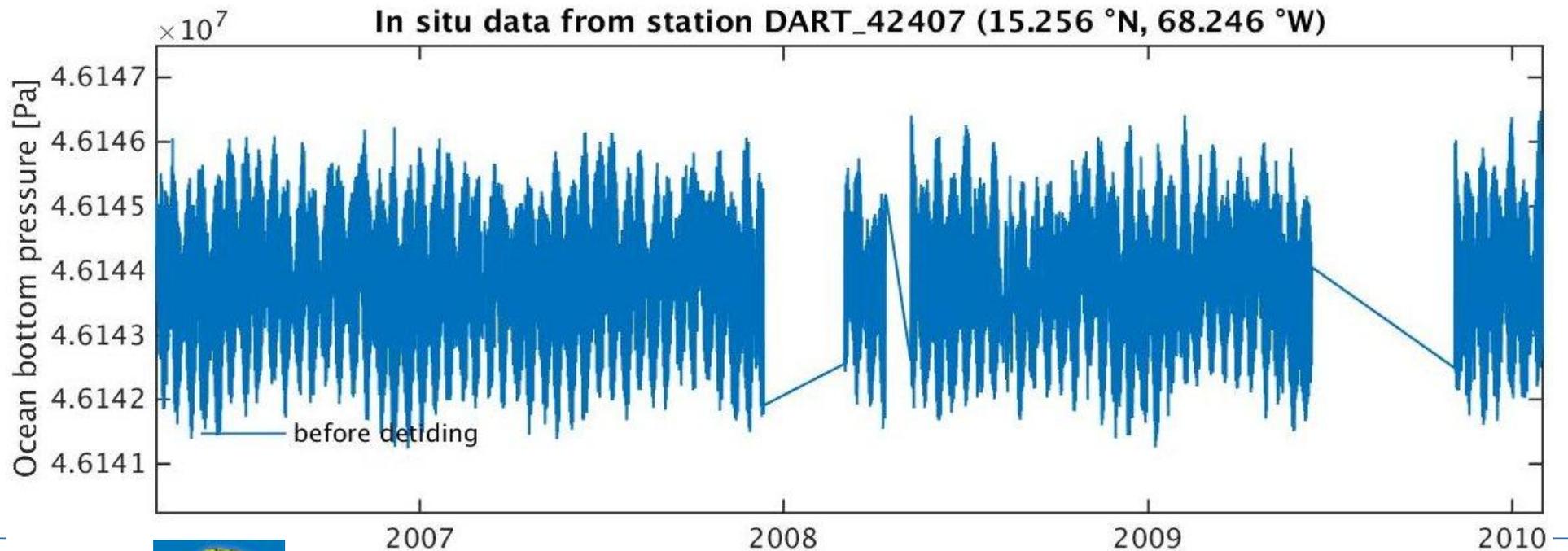
- removing outliers, drifts, jumps and trends
 - changing time step to 1 hour
 - stacking time series from the same station
 - removing tidal signal 
- T_TIDE MATLAB package for classical harmonic analysis [Pawlowicz et al., 2002]

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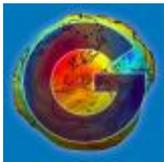
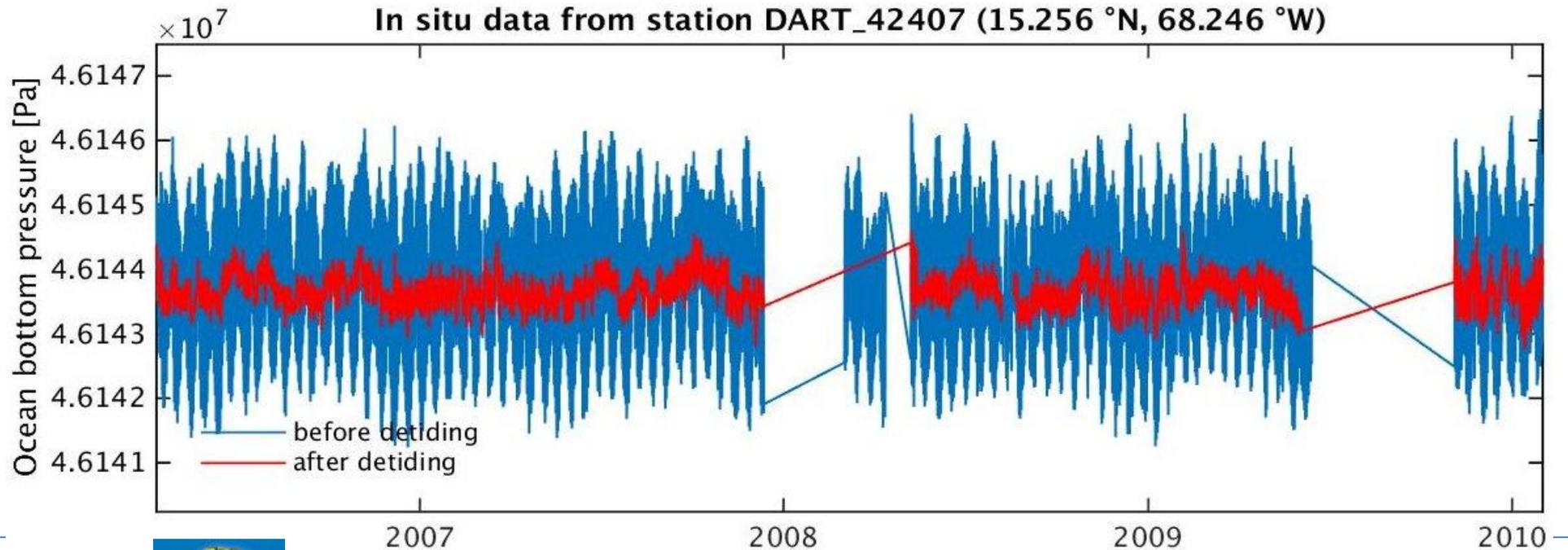


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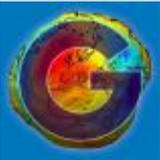
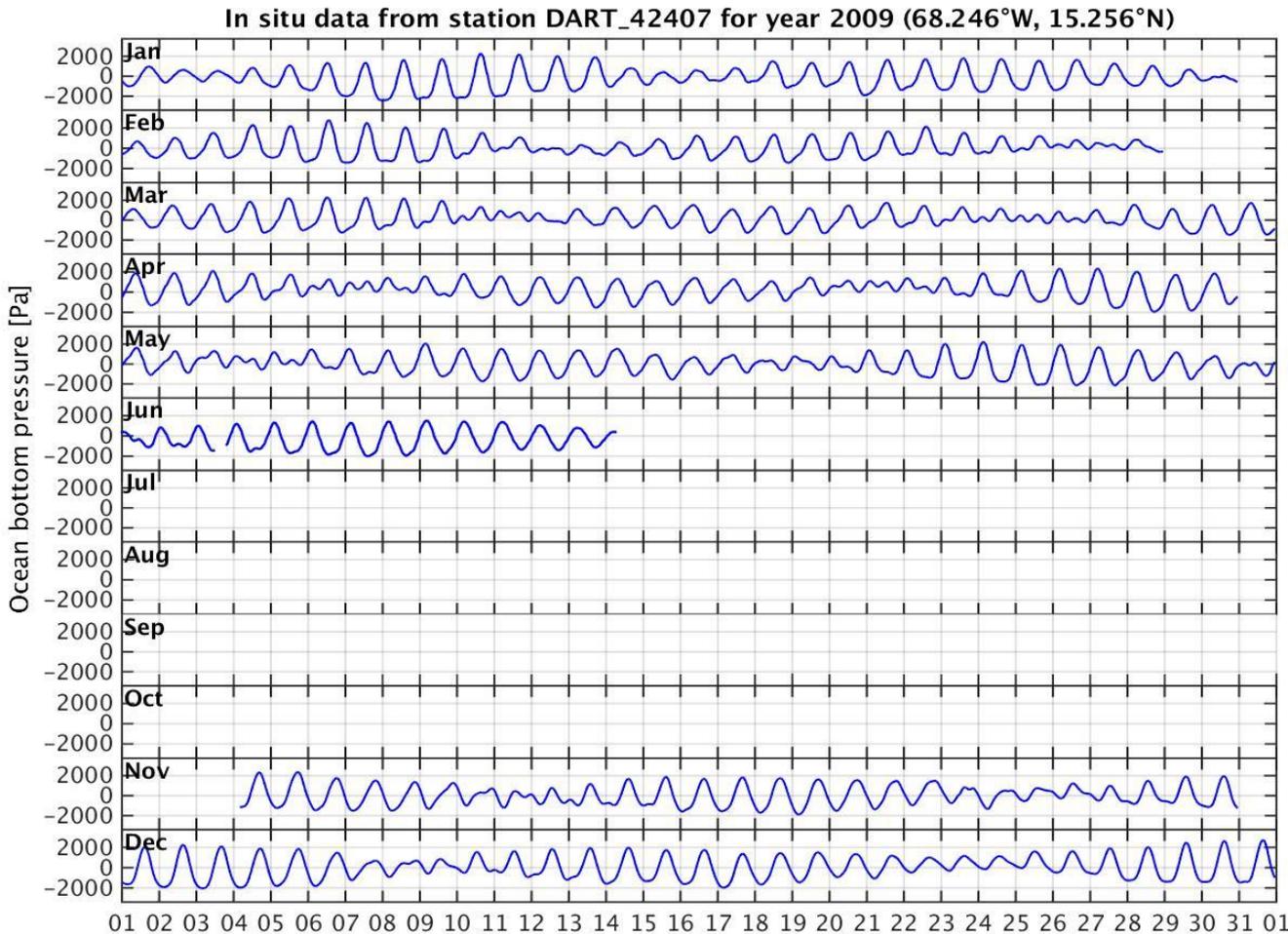
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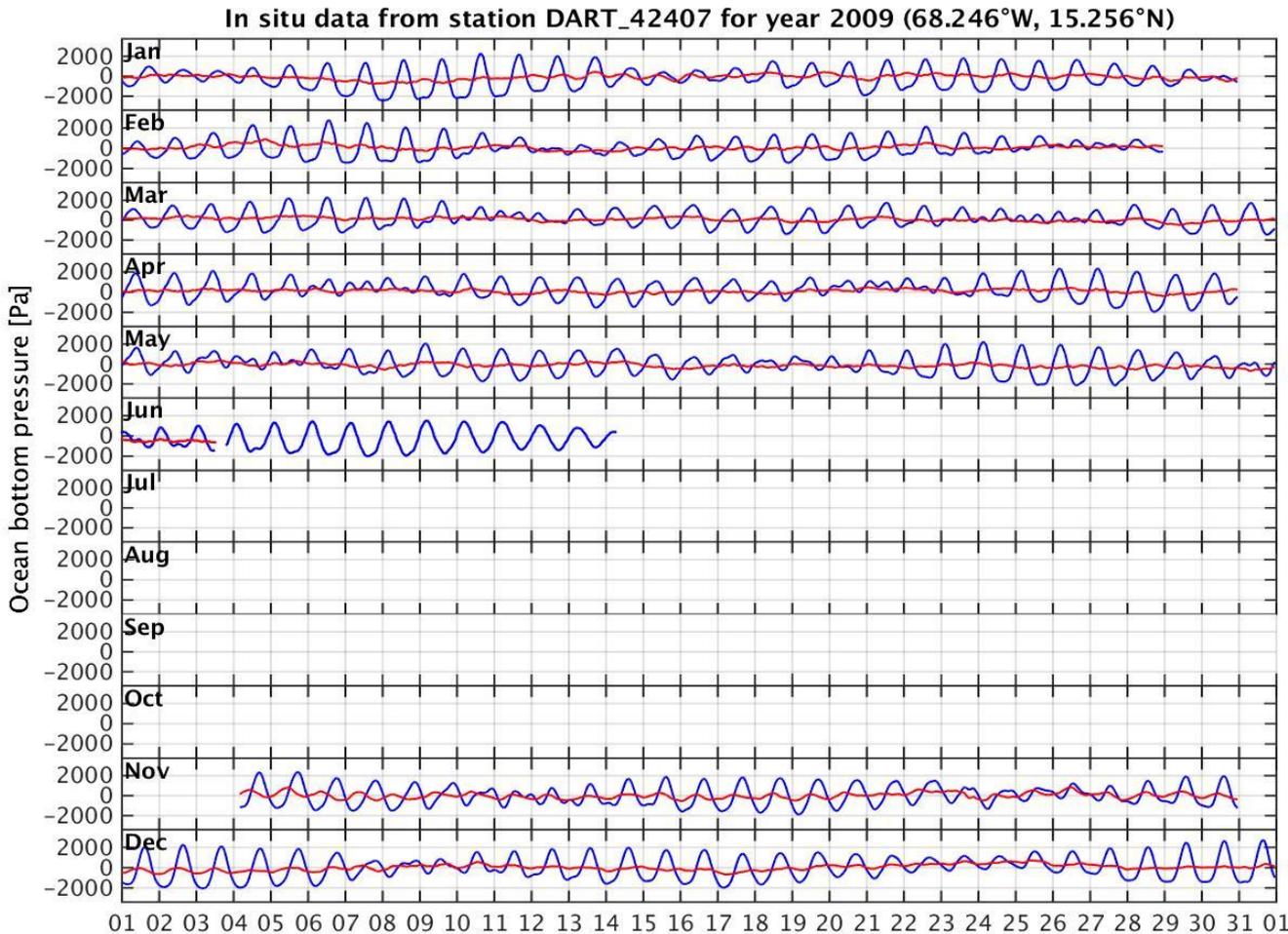
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4 frequency
bands:

- 1-3 days
- 3-10 days
- 10-30 days
- 1-30 days

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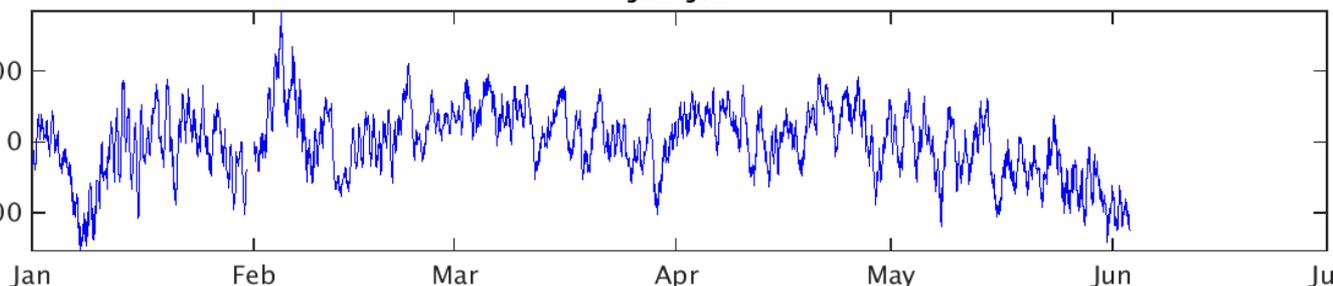
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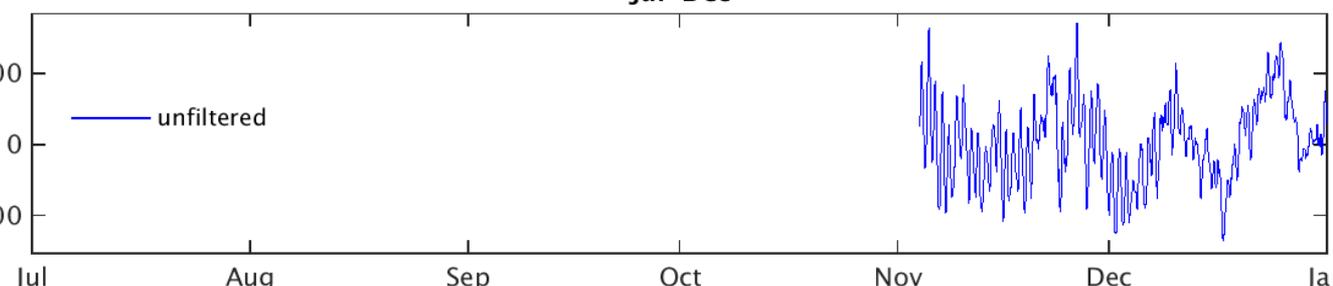
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In situ data from station DART_42407 (15.256 °N, 68.246 °W) for year 2009

Jan-Jun

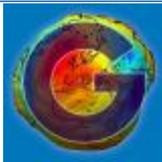


Jul-Dec



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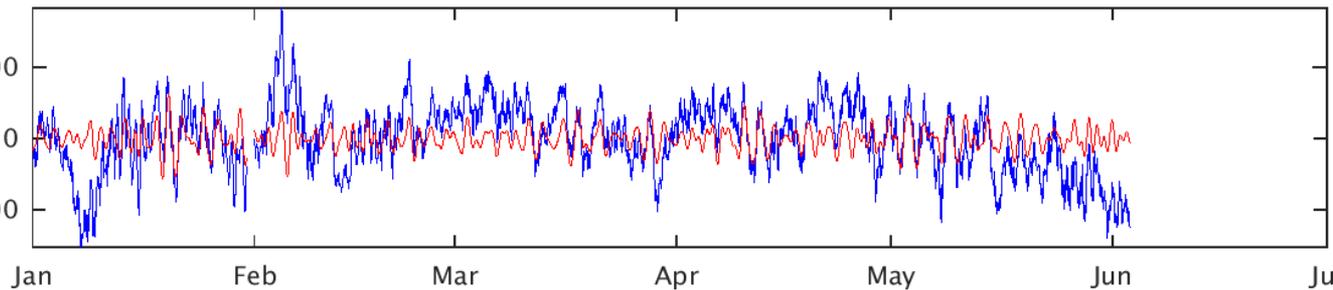
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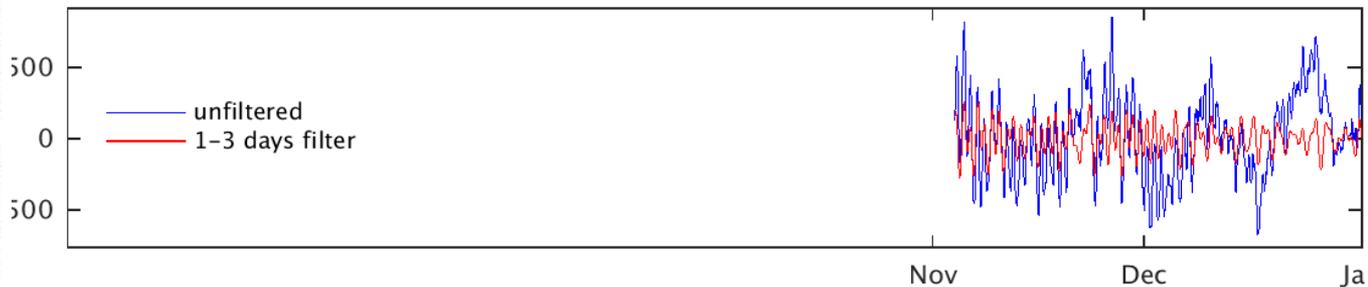
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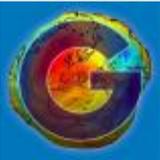


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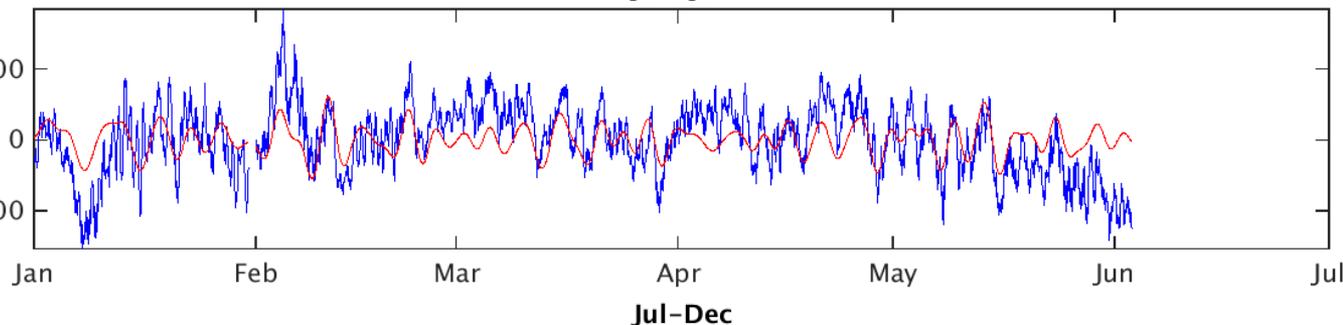
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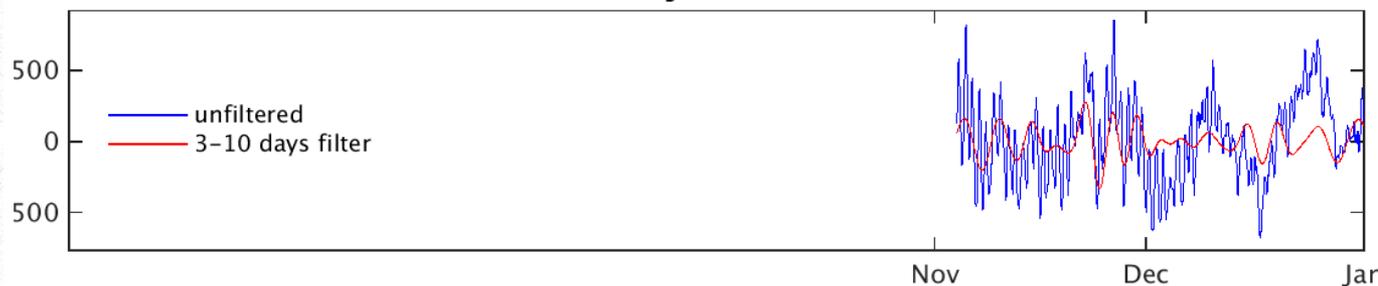
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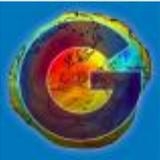


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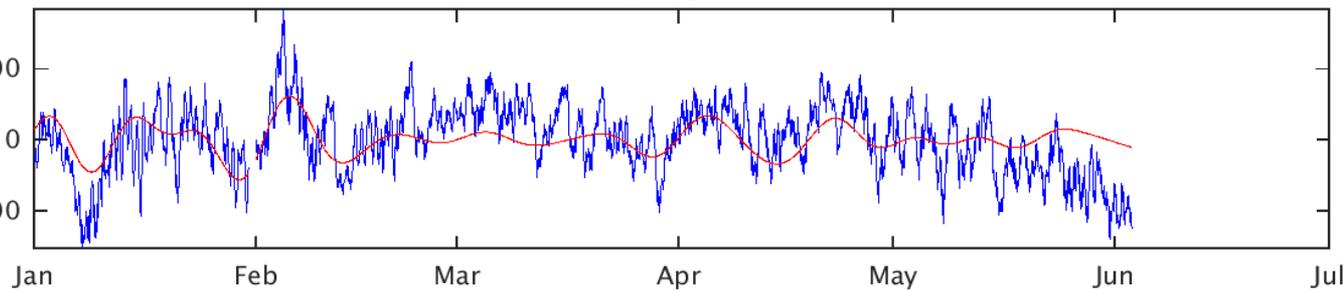
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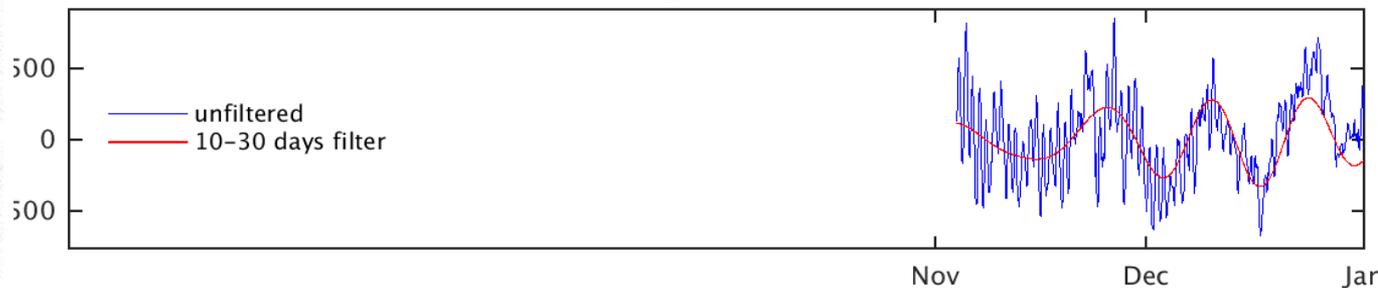
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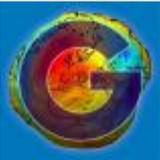


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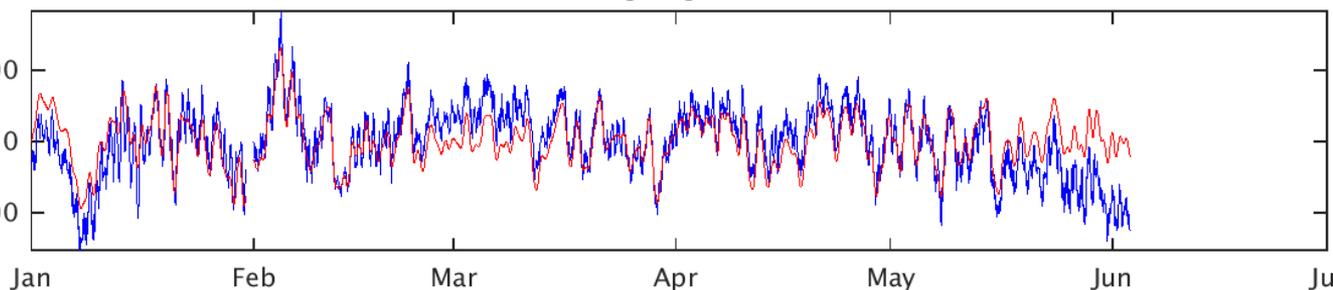
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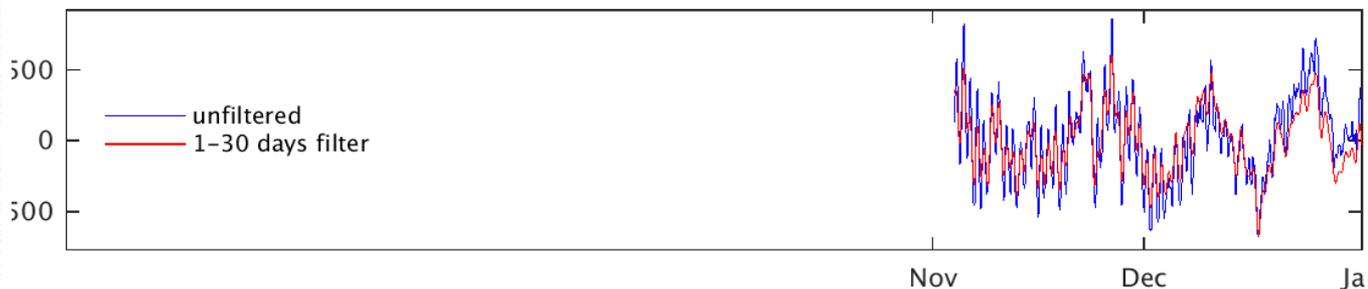
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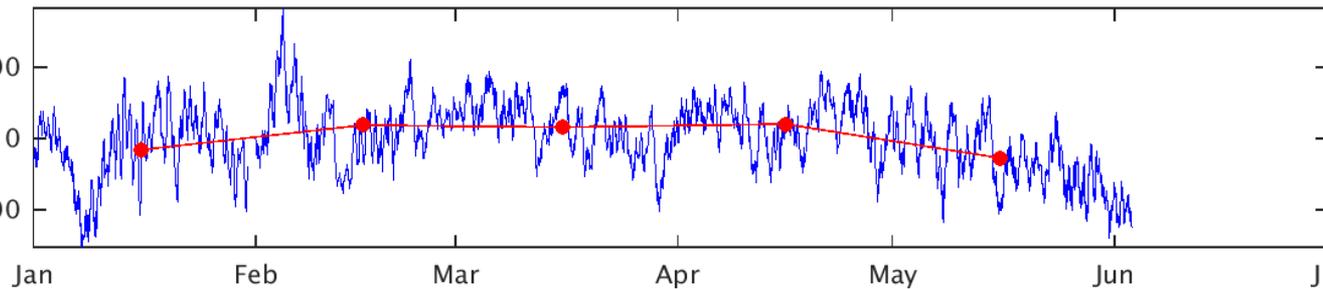


Preprocessing of in situ data

- removing outliers, drifts, jumps and trends
- changing time step to 1 hour
- stacking time series from the same station
- removing tidal signal
- filtering data
- or
- monthly mean

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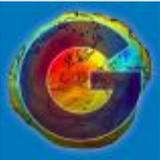


Jul-Dec

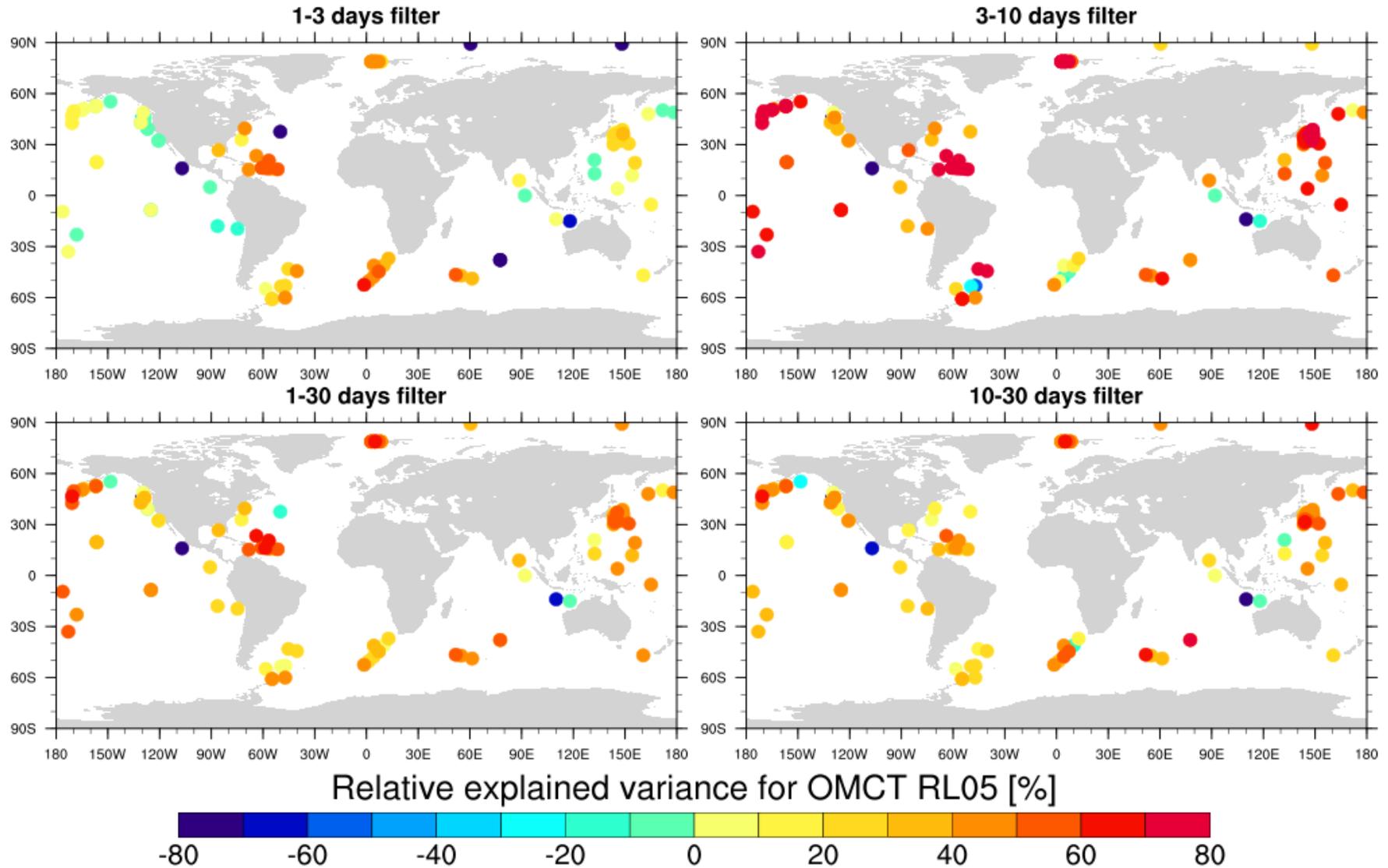


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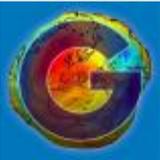
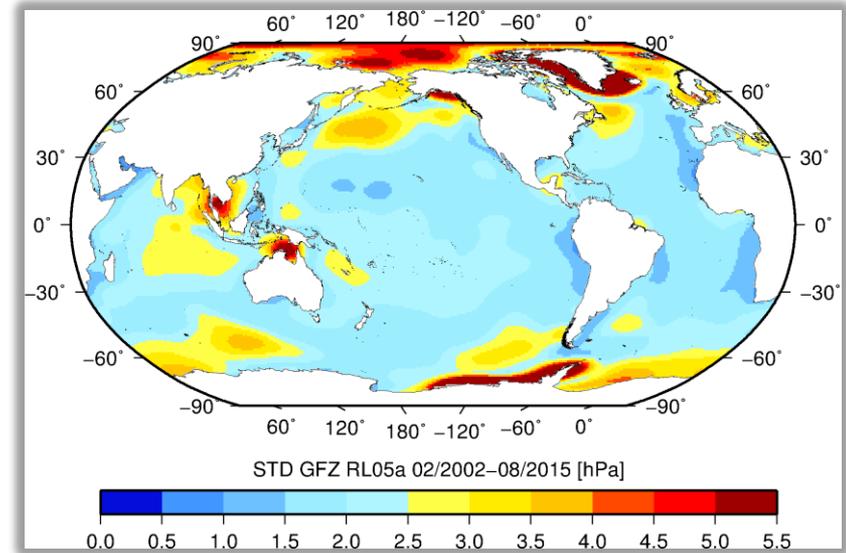


Relative explained variance for OMCT RL05



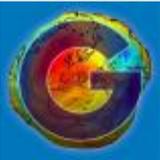
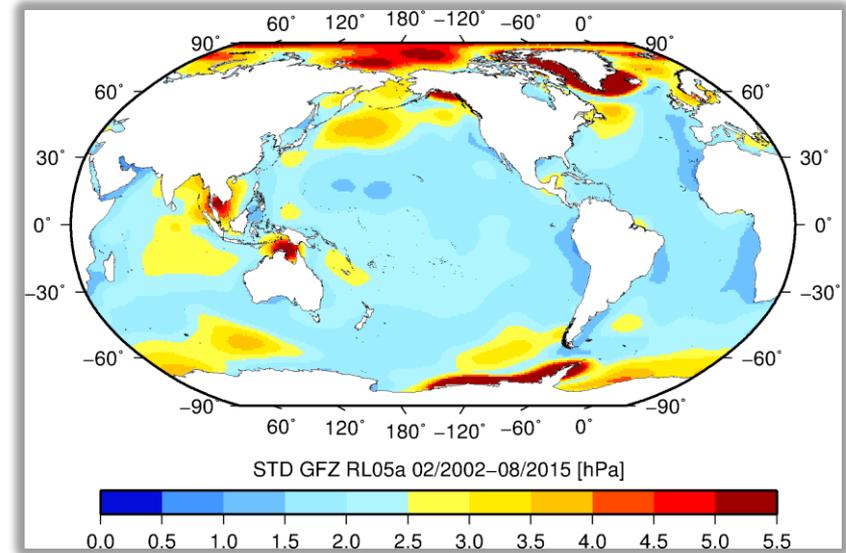
OBP fields from GRACE GFZ RL05a

- 04/2002 – 08/2015
- up to d/o=90
- atmospheric jumps corrected with GAE & GAF
- C20 replaced (Cheng et al., 2011)
- GIA correction (Paulson et al., 2007)
- Geocenter variations included acc. to Bergmann-Wolf et al. (2014)
- land leakage reduction acc. to Wahr et al. (1998)
- GAD added back
- Filtering with DDK1 (Kusche, 2007)
- grid: $1^\circ \times 1^\circ$



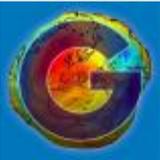
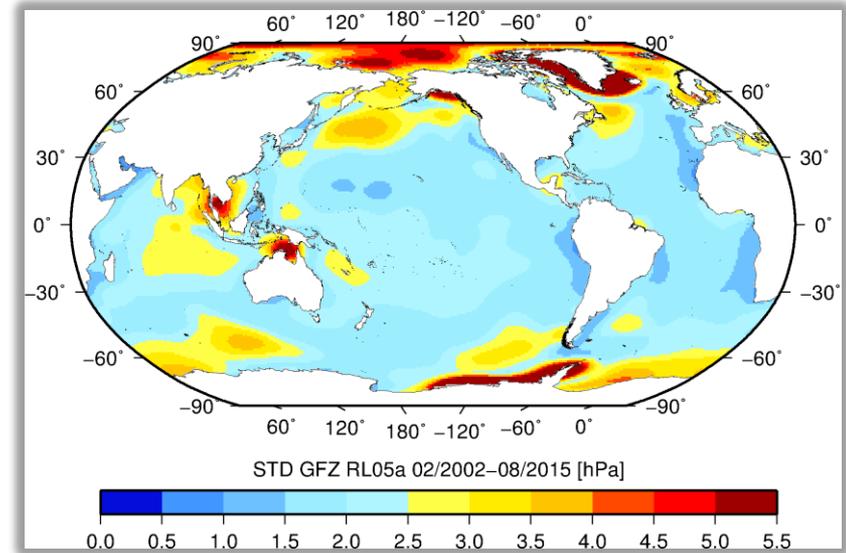
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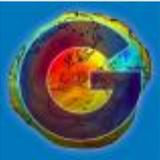
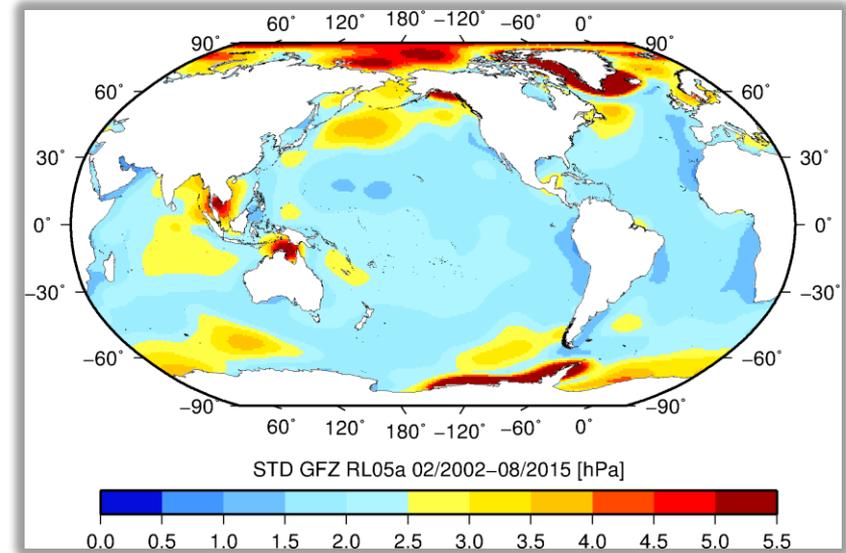
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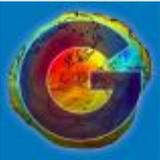
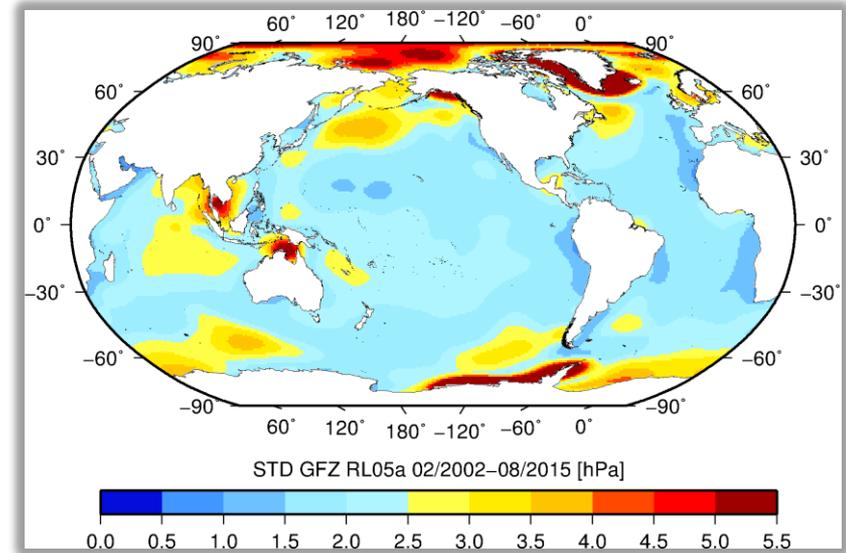
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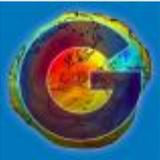
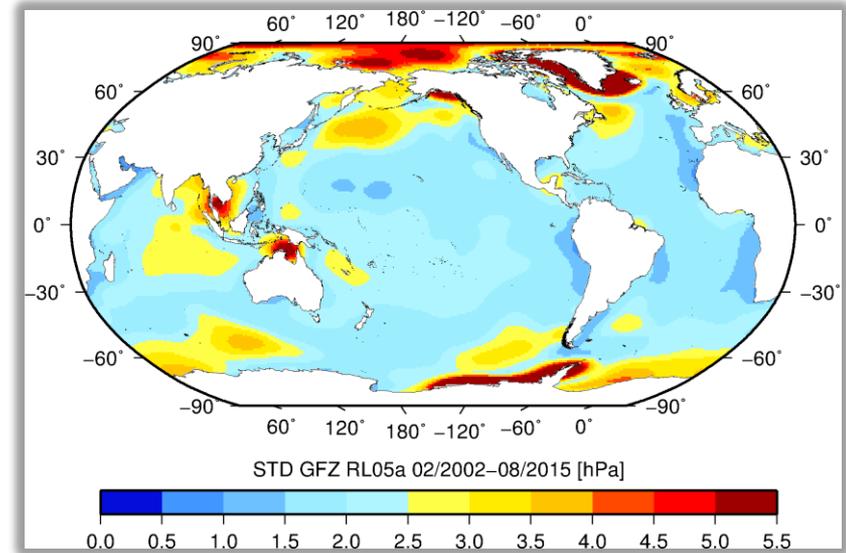
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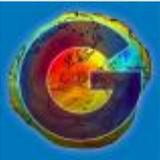
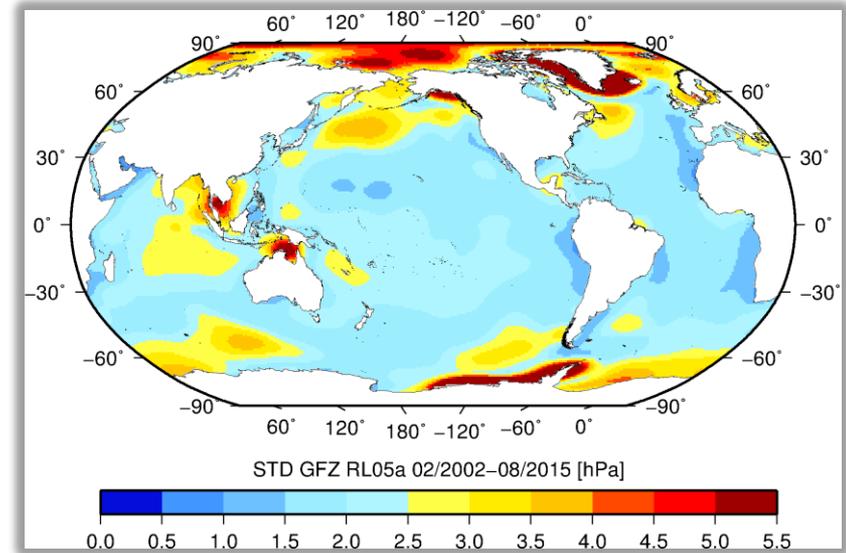
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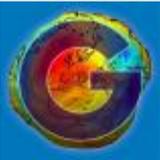
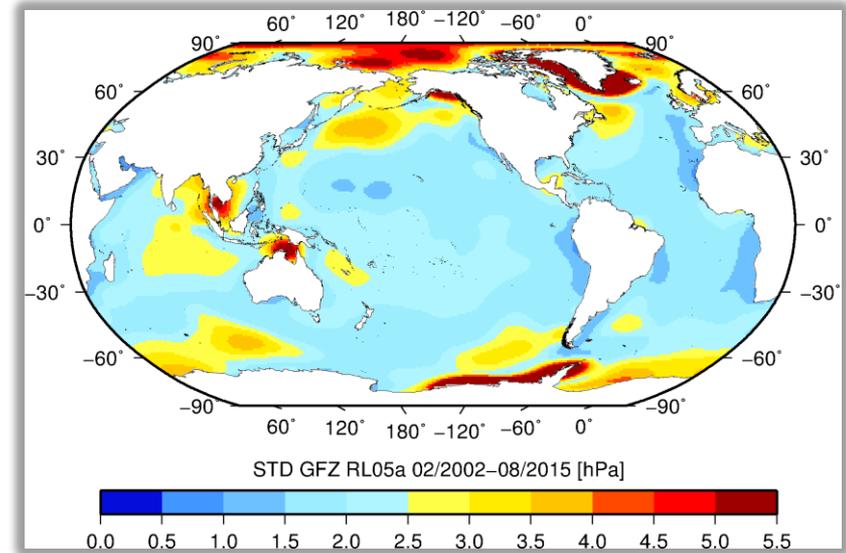
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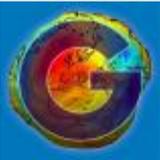
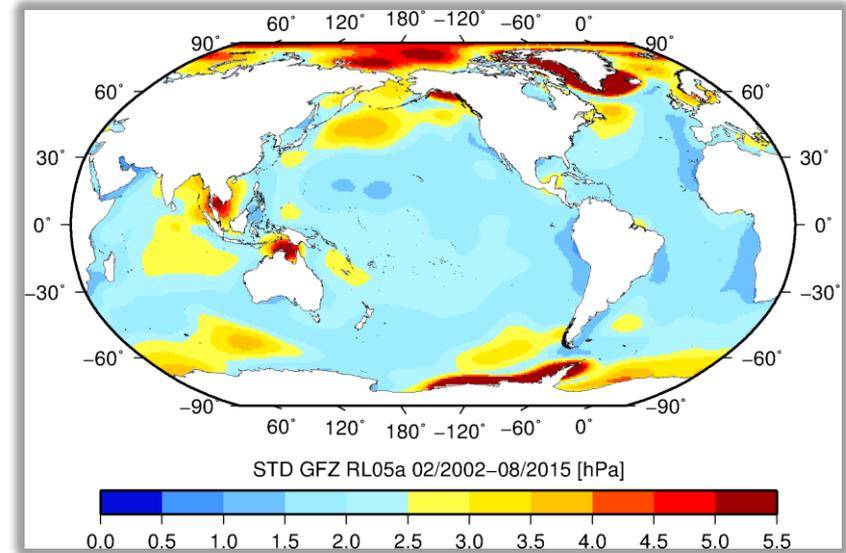
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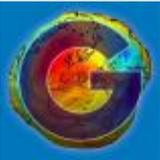
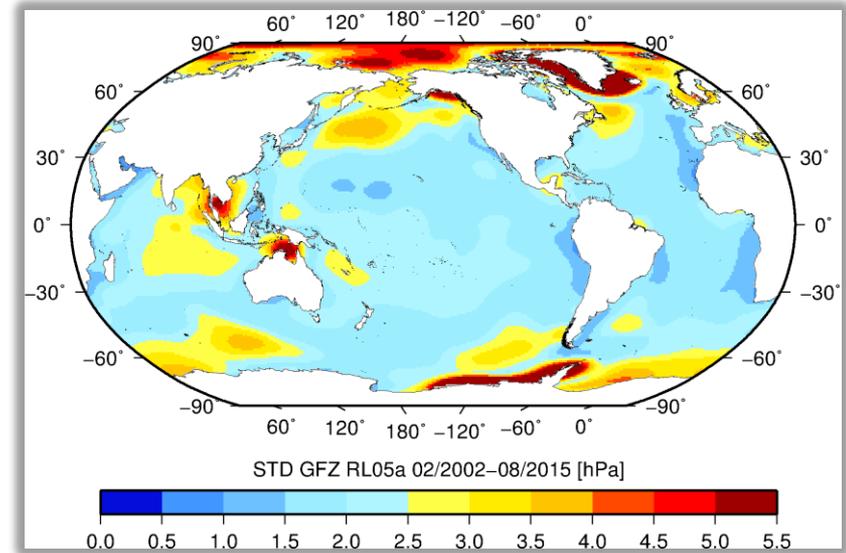
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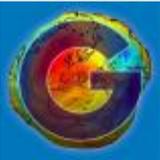
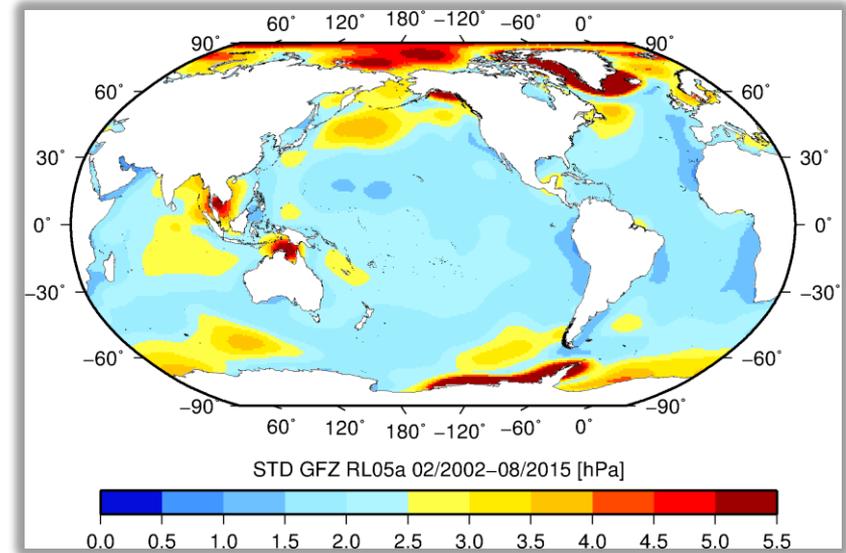
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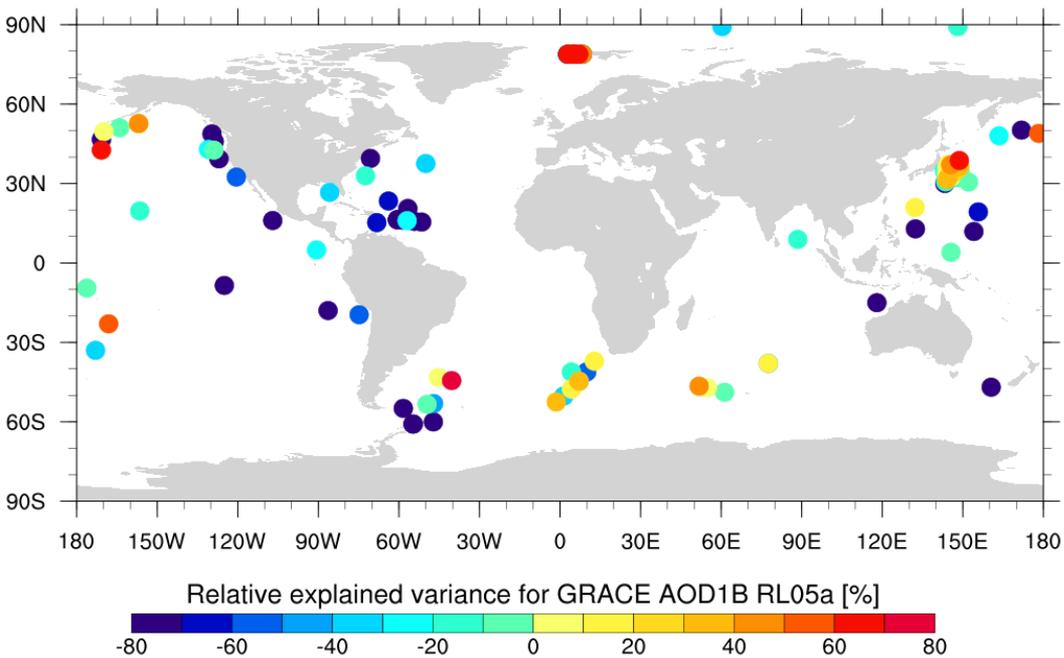


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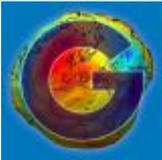
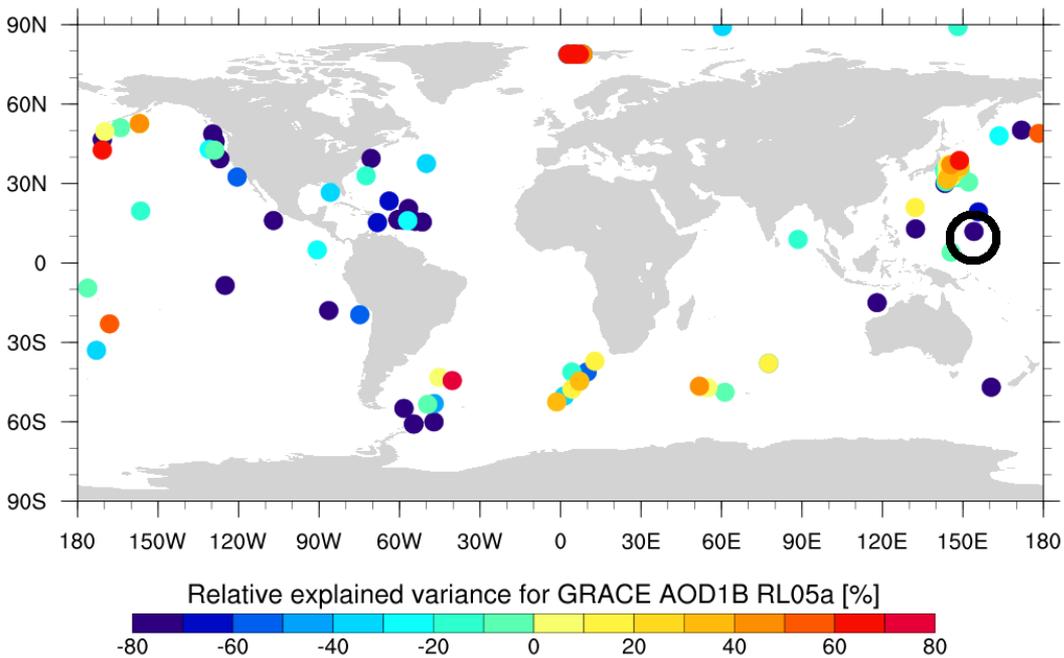
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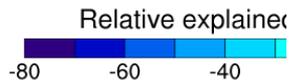
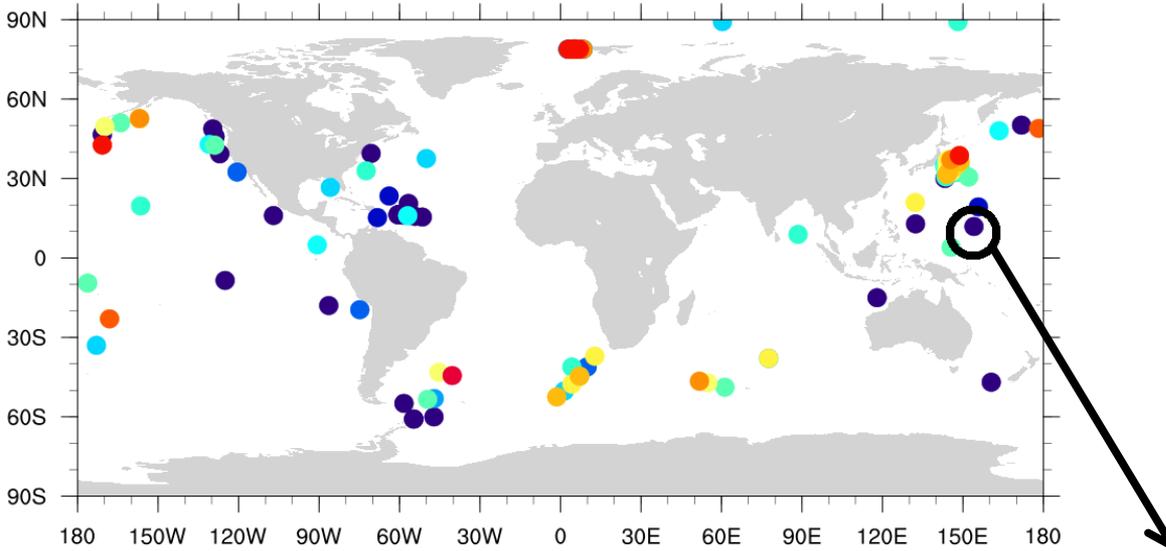
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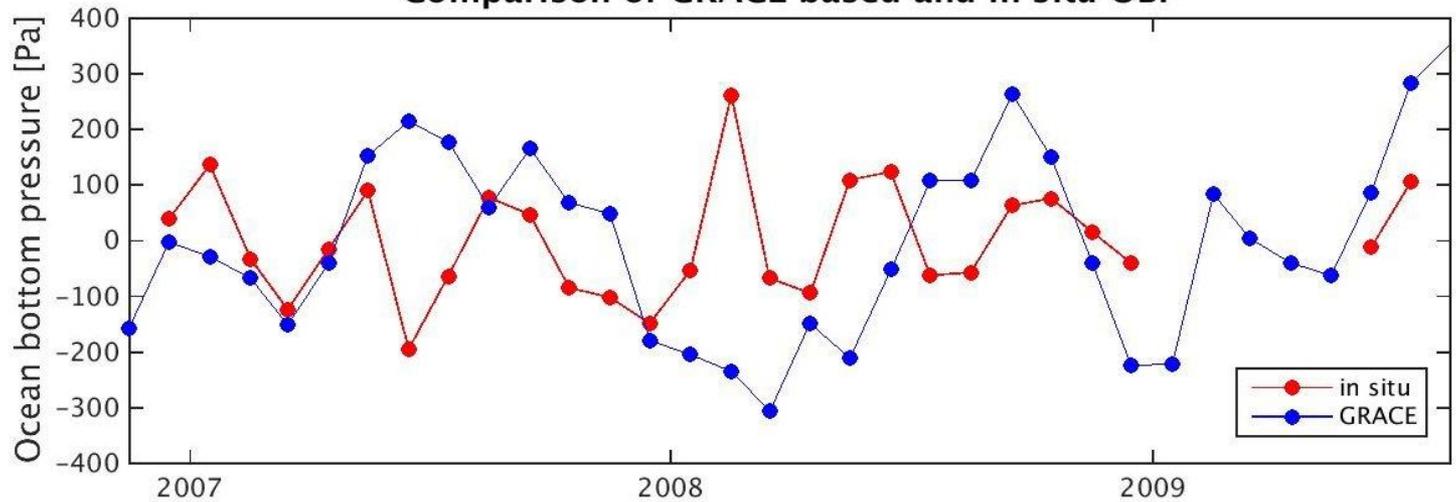
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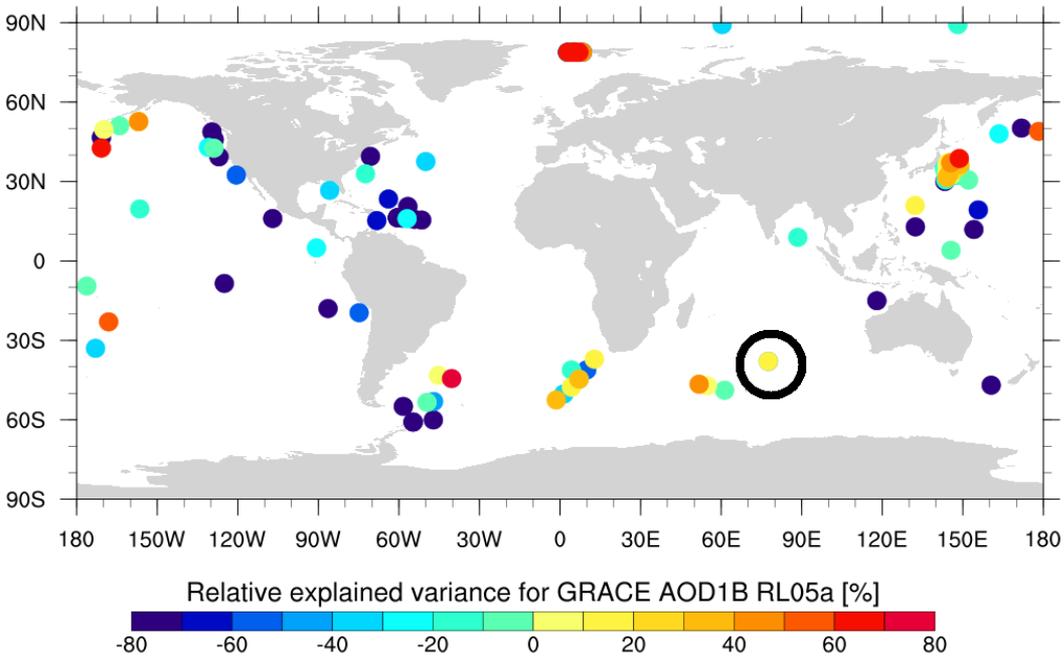
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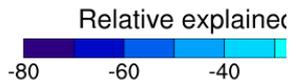
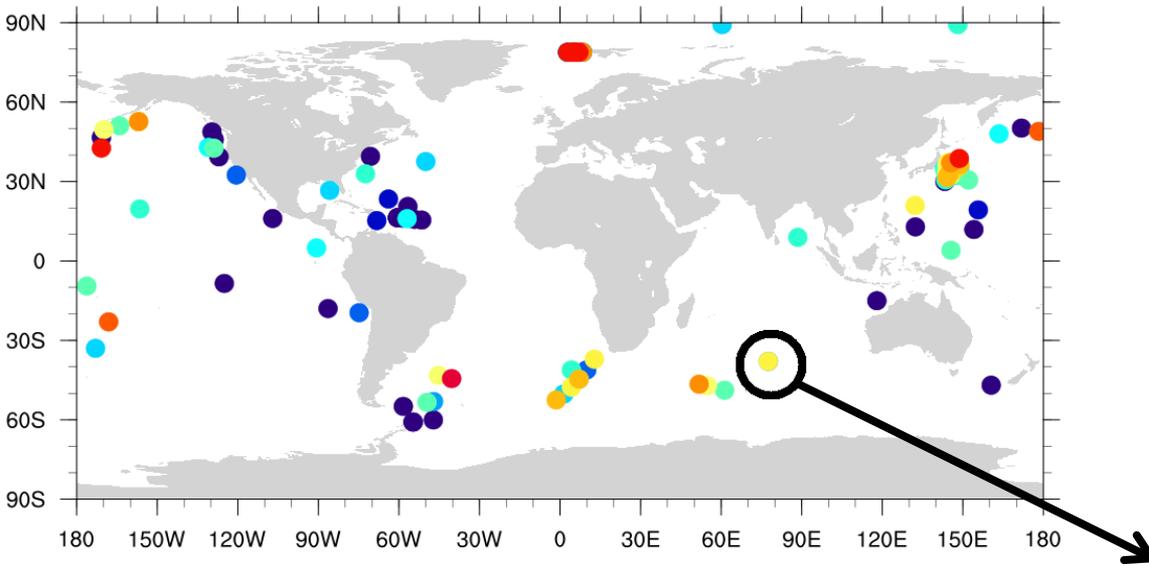
Comparison of GRACE based and in situ OBP



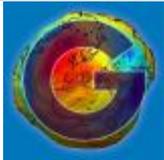
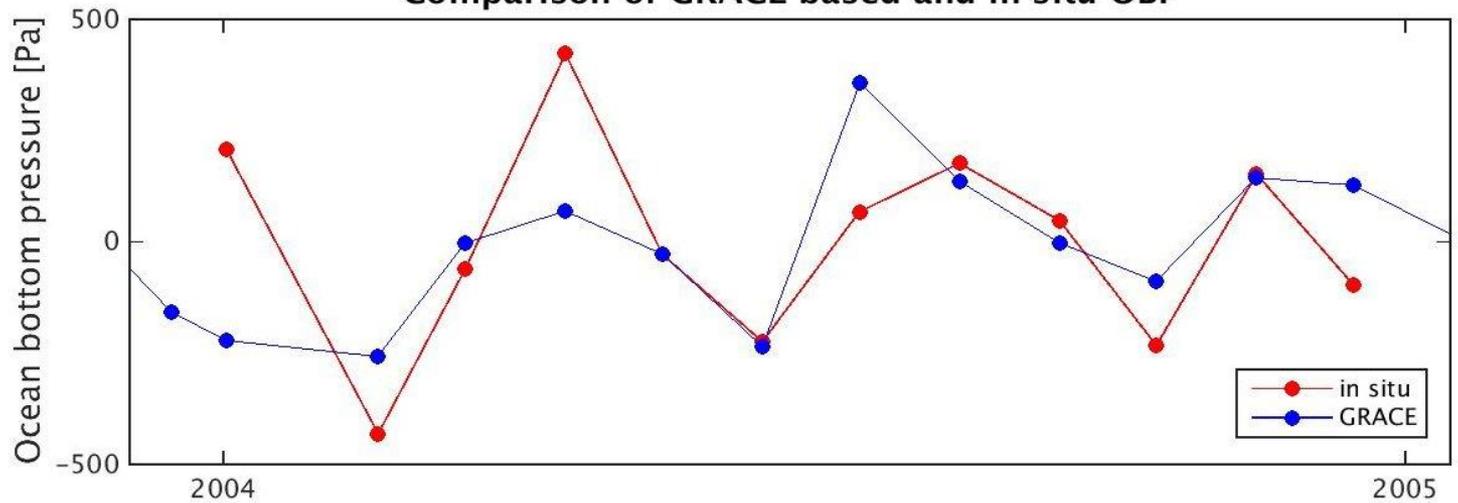
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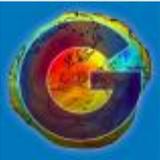
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 - ocean model validation - ~ 150 re-processed in situ ocean bottom pressure time series
 - GRACE monthly mean solutions - ~ 130 stations
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 - generally good performance of the current OMCT RL05 over all considered frequency bands
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 - too much noise in the lower latitudes
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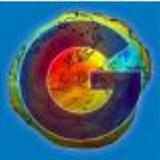
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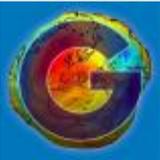
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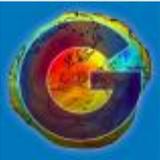
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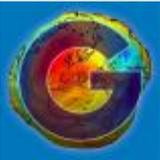
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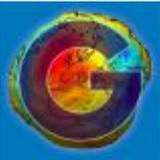
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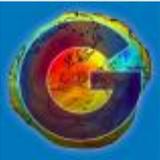
- validation work flow is non-interactive and fast:
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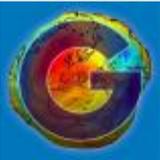


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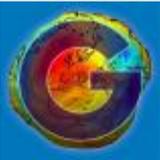
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Thank you!



References

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Relative explained variance

Explained variance – variance of in situ measurements explained by the model

$$V = \frac{\langle obs \rangle - \langle obs - mod \rangle}{\langle obs \rangle}$$

OBP fields from GRACE GFZ RL05a

Work in progress

- improve leakage correction
- remove Sumatra-Andaman earthquake signature
- reconsider GIA model
- residual tidal signal assessment: Gulf of Carpentaria
- reconsider level of smoothing (DDK2, DDK3)

