

# Assessing Spatial and Temporal Variations in the Ocean Heat Content and Earth Energy Imbalance from Space Geodetic Data

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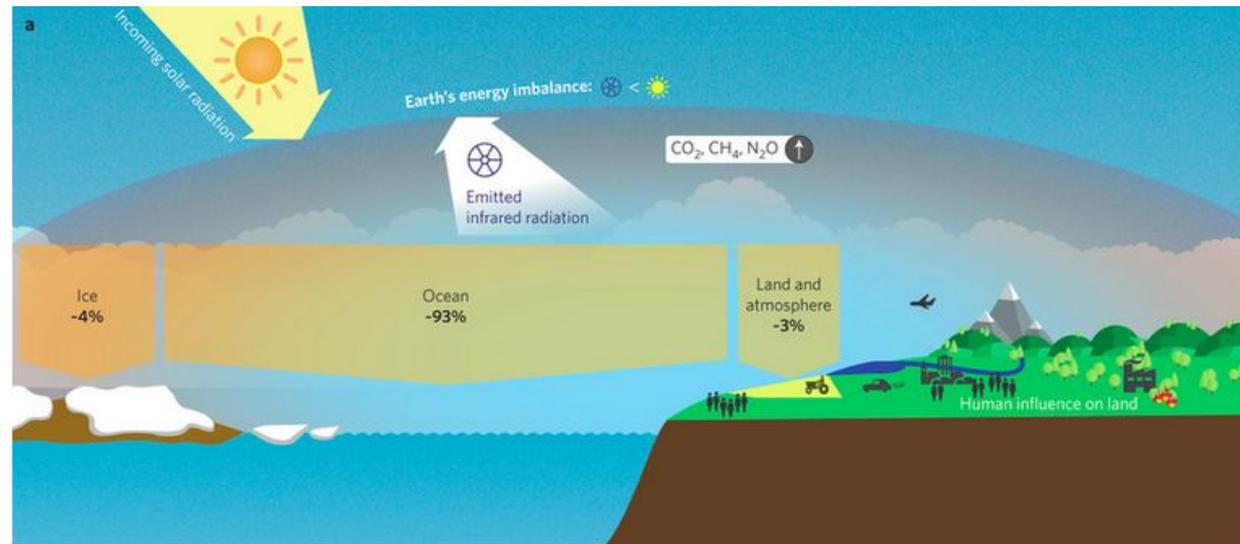
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# Earth energy imbalance

- The **Earth's energy imbalance (EEI)** is the difference between the amount of energy arriving from the sun at the top of the atmosphere and the amount of energy returned to space.
- Because of greenhouse gases emissions, there is a net positive EEI leading to the accumulation of heat in the climate system, mostly the ocean.
- Monitoring the EEI is essential to assess how our climate is changing in response to greenhouse emissions.
- Measuring the EEI is a challenge:
  - ◆  $\sim 0.5\text{-}1\text{ W/m}^2$  versus  $340\text{ W/m}^2$  of energy entering and leaving the top of the atmosphere



From von Schuckmann et al. 2016 NCLIM



- 1) EEI estimates from the space geodetic approach
- 2) Propagation of space geodetic uncertainties in the EEI estimate
- 3) EEI uncertainties and contribution of barystatic sea level uncertainties
- 4) Take home messages and recommendations



# 1) EEI estimates from the space geodetic approach

→ Measuring the EEI is a **challenge**:

Climate science question	Accuracy in EEI measure at decadal scale (90% CL)	Accuracy in EEI trend (90% CL)
Assessing EEI variations and trend	$\pm 0.3 \text{ W/m}^2$	$\pm 0.1 \text{ W/m}^2/\text{decade}$
Enable the effect of Green House Gases reduction policies	$\pm 0.1 \text{ W/m}^2$	-



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→ **Space geodetic approach** provides an indirect estimate of the **Earth Energy Imbalance (EEI)** by estimating changes in the **Ocean Heat Content (OHC)** based on the combination of space altimetry and gravimetry data, and in-situ T/S profiles (Meyssignac et al, 2019; Marti et al., 2022):

- ◆ Good spatial and temporal coverage of space geodetic data
- ◆ OHC estimates over full ocean depth
- ◆ Well-characterised uncertainties on the space geodetic data and propagation to the OHC and EEI



# 1) EEI estimates from the space geodetic approach

→ Method is based on the **sea level budget equation**:

◆  $\Delta SL_{\text{total}} = \Delta SL_{\text{mass}} + \Delta SL_{\text{thermsteric}} + \Delta SL_{\text{halosteric}}$

◆ OHC change is derived from the thermsteric sea level change :  $\Delta OHC = \frac{\Delta SL_{\text{thermsteric}}}{IEEH}$

◆ Global OHC change is the sum of local OHC change

◆ EEI is the time derivative of GOHC multiplied by the capacity of the ocean to absorb the excess of energy stored by the Earth system:  $EEI \approx \frac{1}{\alpha} \frac{dGOHC}{dt}$



# 1) EEI estimates from the space geodetic approach

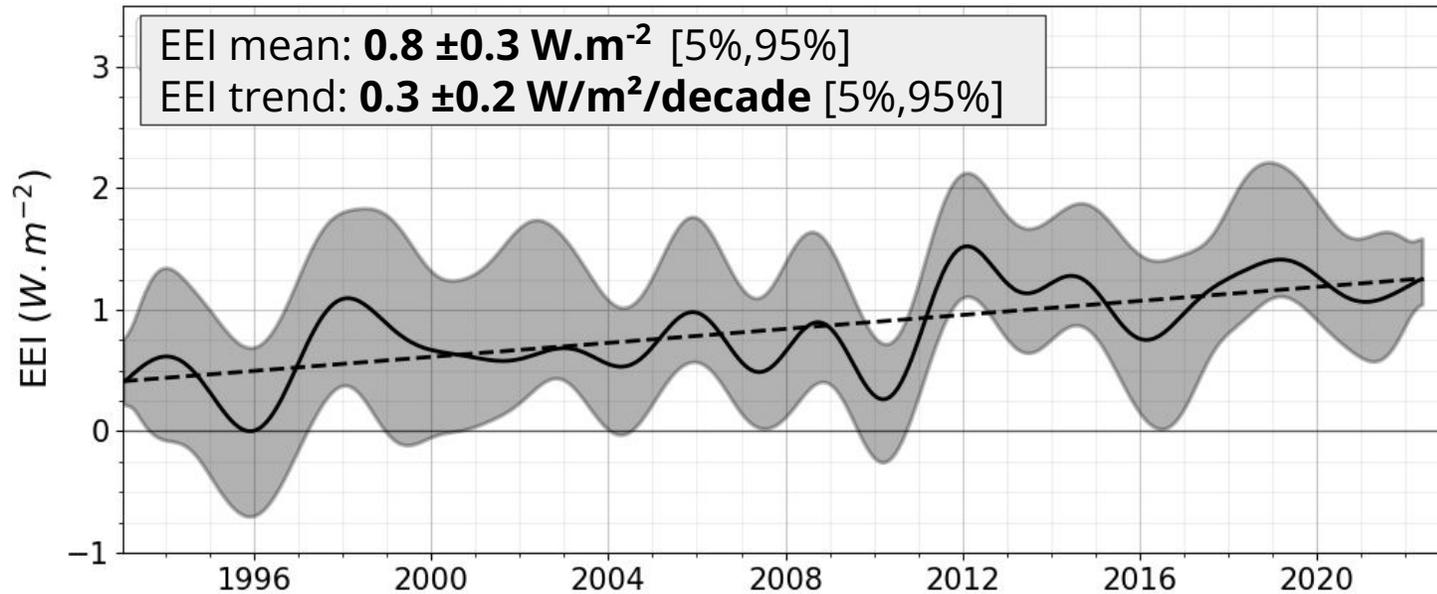
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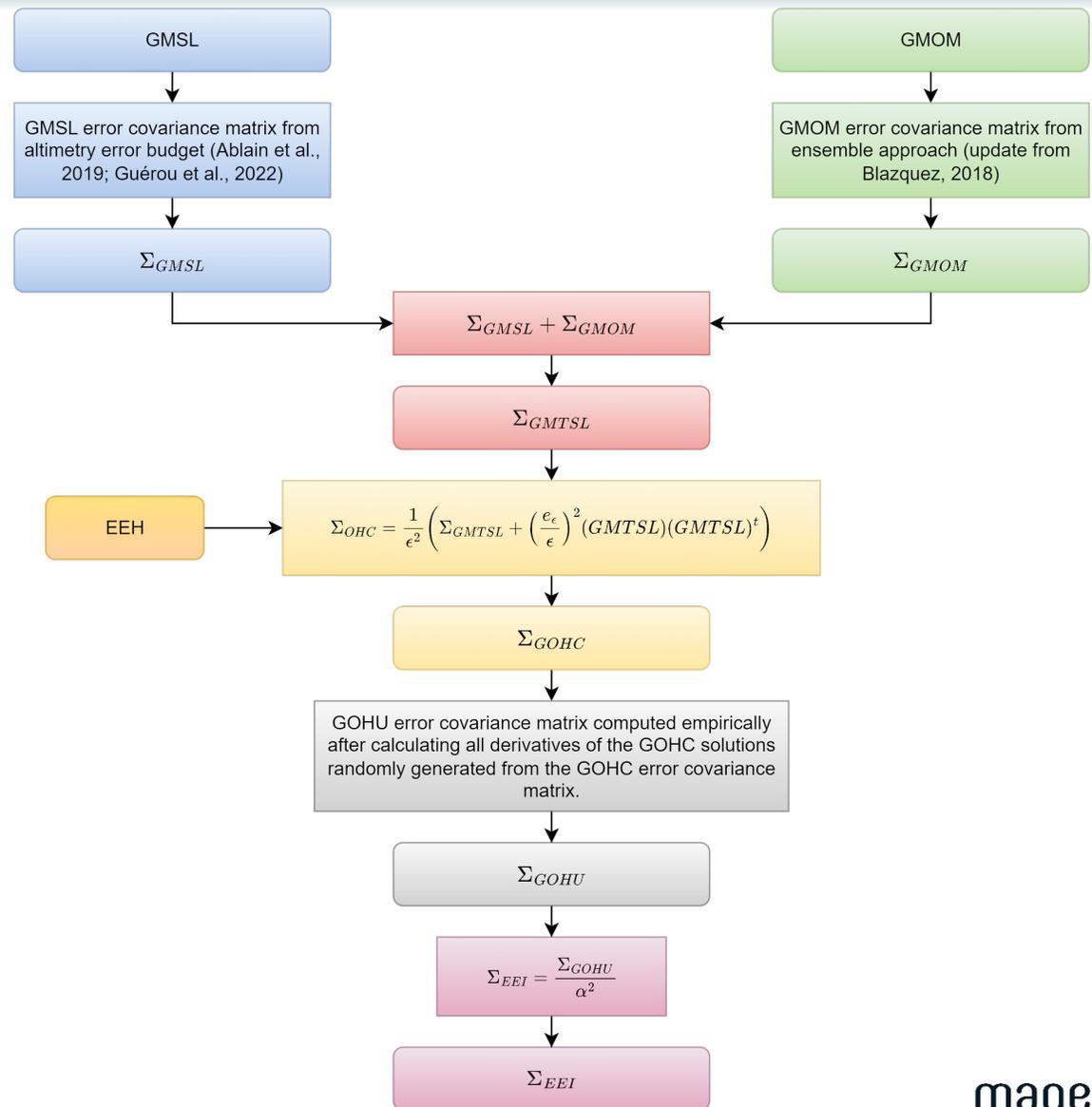


From Marti et al., 2024



# 2) Propagation of uncertainties in the EEI estimates

→ Uncertainties are propagated from input data (space geodetic data, IEEH ) until the GOHC change and EEI estimate by calculating and propagating error covariance matrices ( $\Sigma$ )



Uncertainty propagation

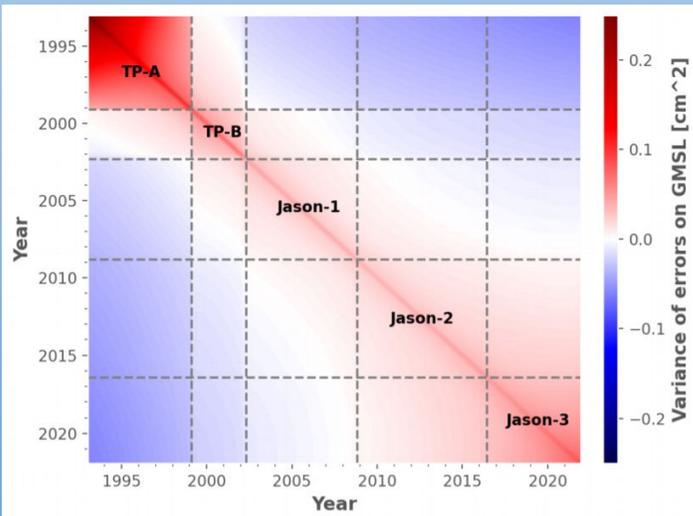


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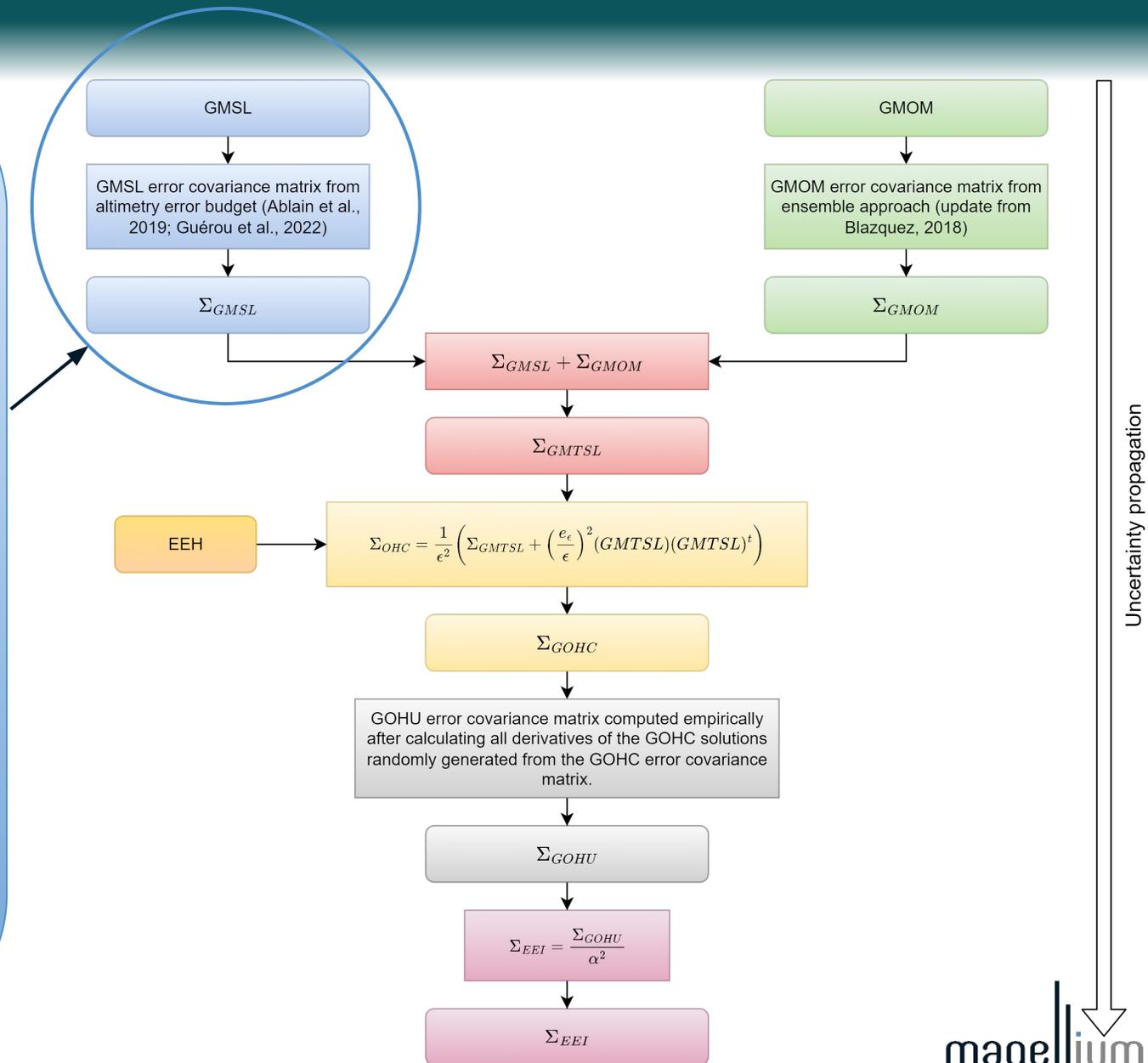
Source of uncertainties	Type of uncertainties	uncertainties (1-sigma)
Short time-correlated errors due to POD, altimeter parameter, geophysical corrections	short time-correlated effects ( $\lambda < 2$ months)	$u_b = 1.7$ mm for T/P $u_b = 1.2$ mm for T/P $u_b = 1.1$ mm for JA2 $u_b = 1.0$ mm for JA3
	short time-correlated effects (2 months $< \lambda < 1$ months)	$u_b = 1.4$ mm for T/P $u_b = 1.2$ mm for JA1 $u_b = 1.1$ mm for JA2 $u_b = 1.1$ mm for JA3
Wet tropospheric correction stability	large time-correlated effects ( $\lambda=5$ years)	$u_b = 1.1$ mm (1.7 mm for JA3)
Precise orbit determination stability	ITRF	linear time-correlated effect $u_b = 0.1$ mm/yr
	gravity fields	with large time-correlated effects ( $\lambda=10$ years) $u_b = 0.5$ mm $\geq 2002$ (JAs) $u_b = 1.1$ mm $< 2002$ (T/P)
Mean sea level offset estimate	Jump	$u_b = 2.0$ mm for TPA-TPB $u_b < 0.3$ mm for TPA-JA1, JA1-JA2, JA2-JA3
GIA correction	linear time-correlated effect	$u_b = 0.05$ mm/yr
Altimeter parameters stability	linear time-correlated effect	$u_b = 0.7$ mm/yr over TP-A $u_b = 0.1$ mm/yr over TP-B

Ablain et al. (2019), Guérou et al. (2022)

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$\Sigma_{GMSL} =$



Uncertainty propagation

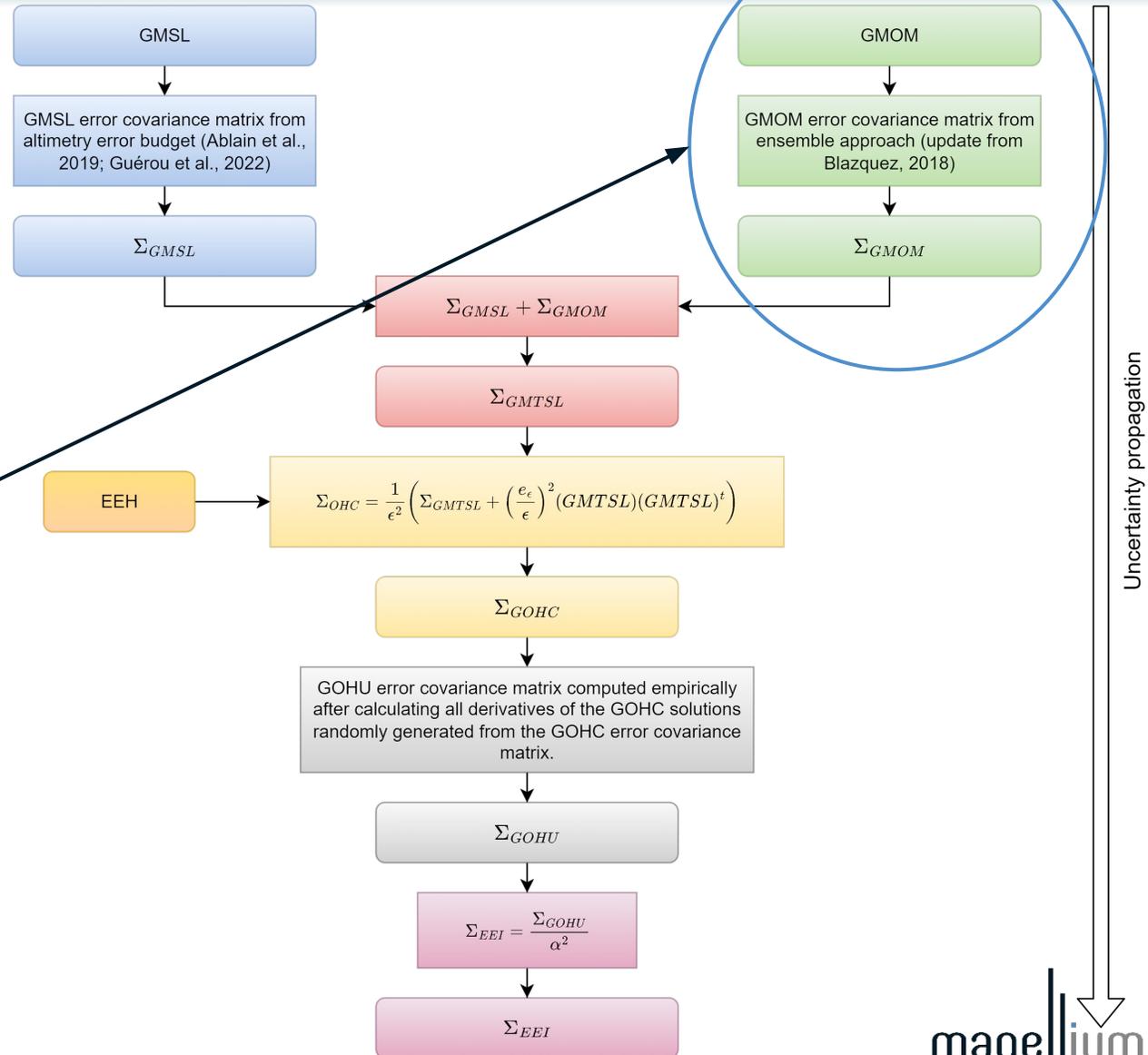


# 2) Propagation of uncertainties in the EEI estimates

→ For the barystatic sea level changes, the covariance matrix is calculated from an ensemble of solutions, including 5 processing centers and various post-processing corrections, based on Blazquez et al. (2018)

Error sources	mm/yr
Processing centers	0.02
geocenter motion	0.43
C20	0.01
filtering	0.01
GIA	0.15
<b>Total</b>	<b>0.45</b>

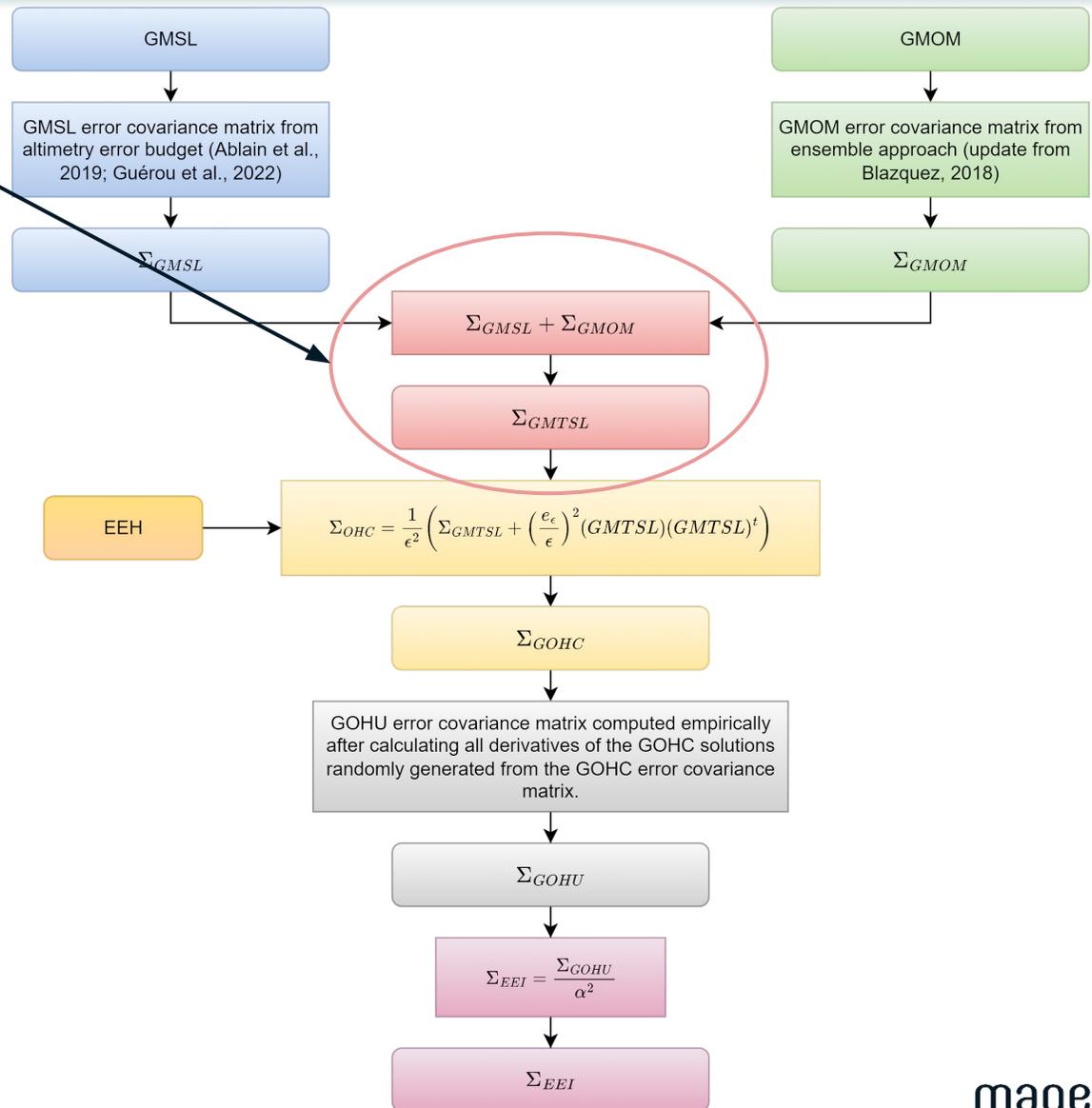
*Barystatic uncertainty budget (Blazquez et al., 2018)*





# 2) Propagation of uncertainties in the EEI estimates

→ Covariance matrix of global mean thermostic is the sum of GMSL and GMOM covariance matrices : errors are assumed independent.



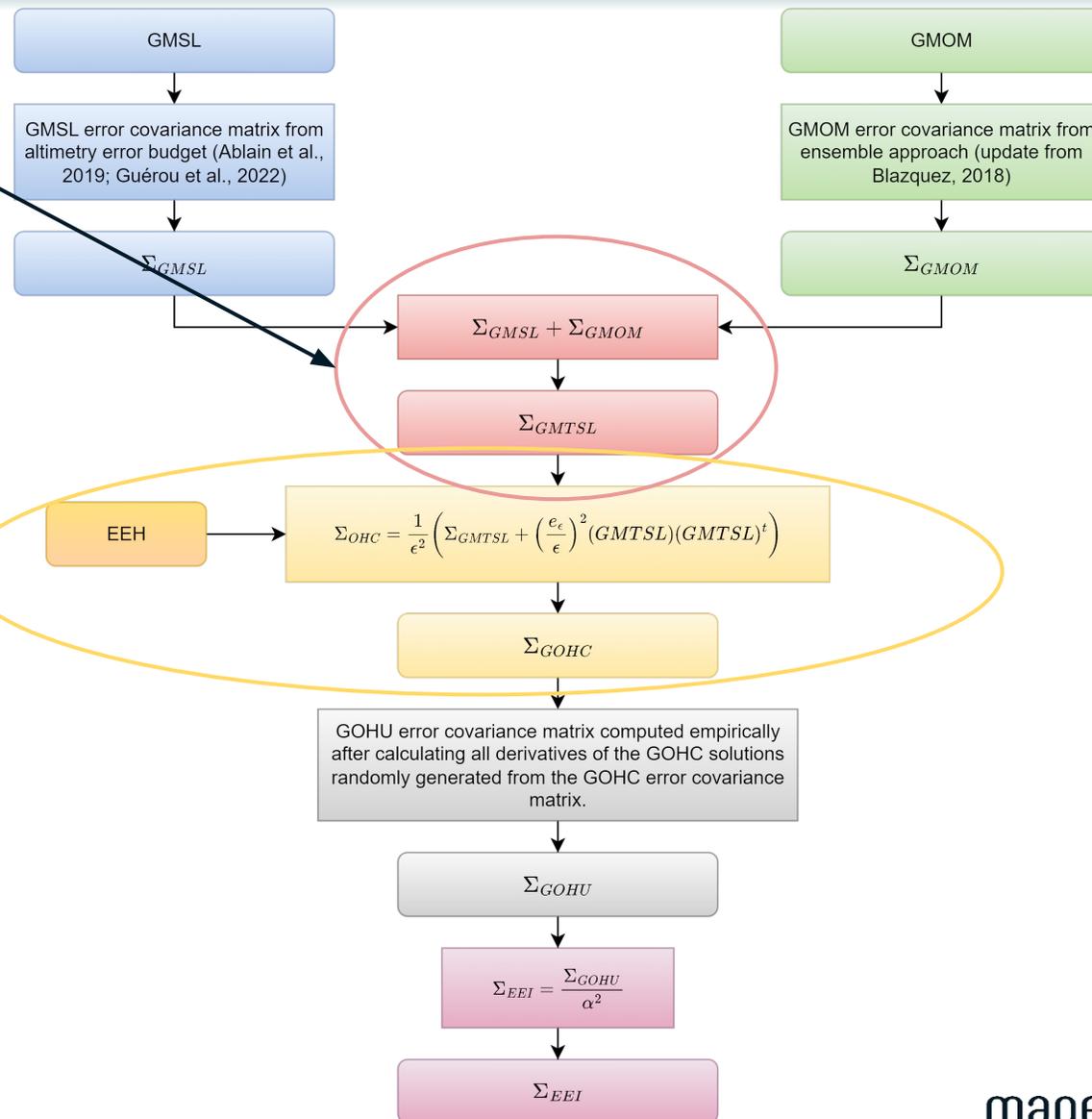
Uncertainty propagation



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→ Covariance matrix of global OHC takes into account additional uncertainty of the IEEH coefficient



Uncertainty propagation

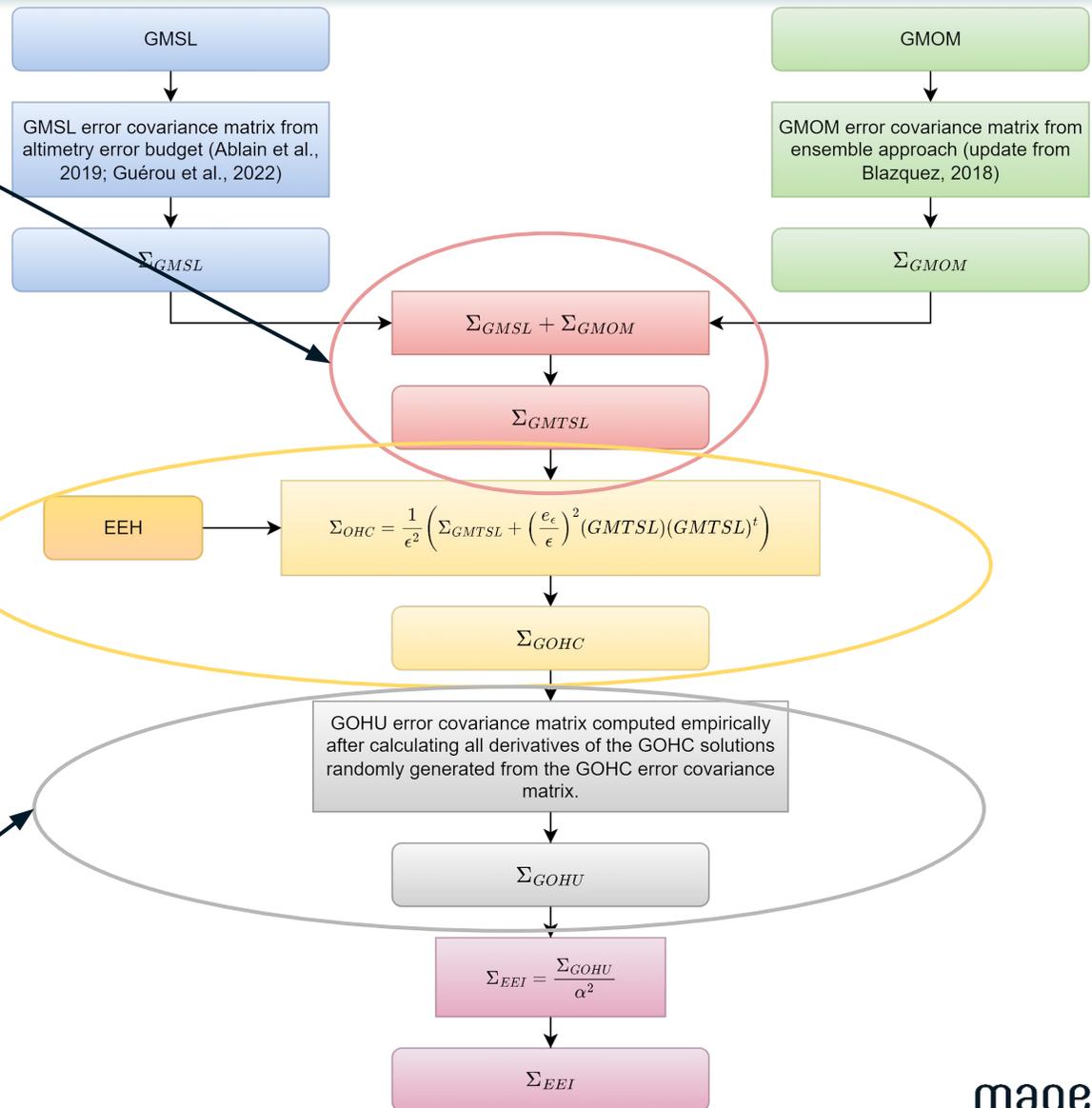


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→ Covariance matrix of global OHC takes into account additional uncertainty of the IEEH coefficient

→ As the global ocean heat uptake (OHU) is the time derivative of the GOHC after applying a low-pass filter (2-3 years), the covariance matrix is calculated empirically

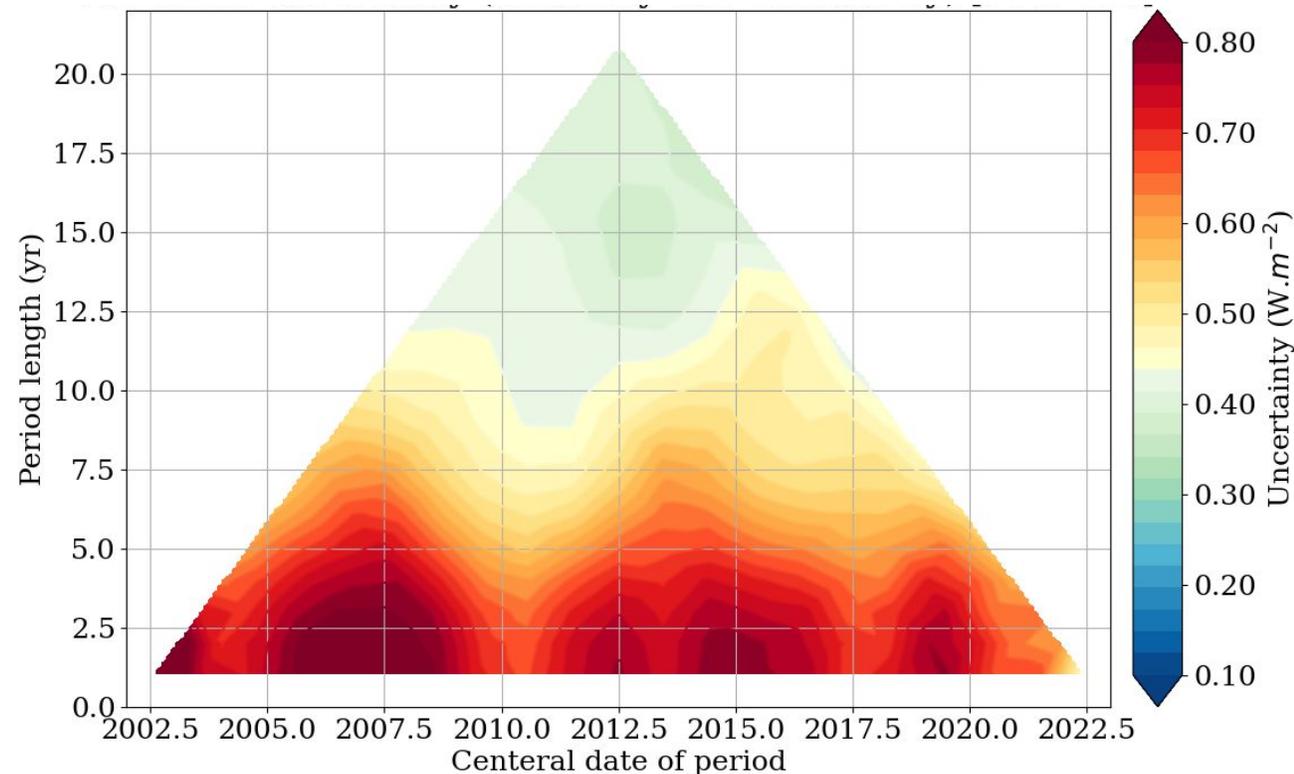


Uncertainty propagation



### 3) Uncertainties in the EEI and gravimetry contribution

→ Trend/acceleration uncertainties derived from an OLS method where  $\Sigma$  is taken into account (Ablain et al, 2009, 2019):  $\hat{\beta} = N(\beta, (X^t X)^{-1}(X^t \Sigma X)(X^t X)^{-1})$



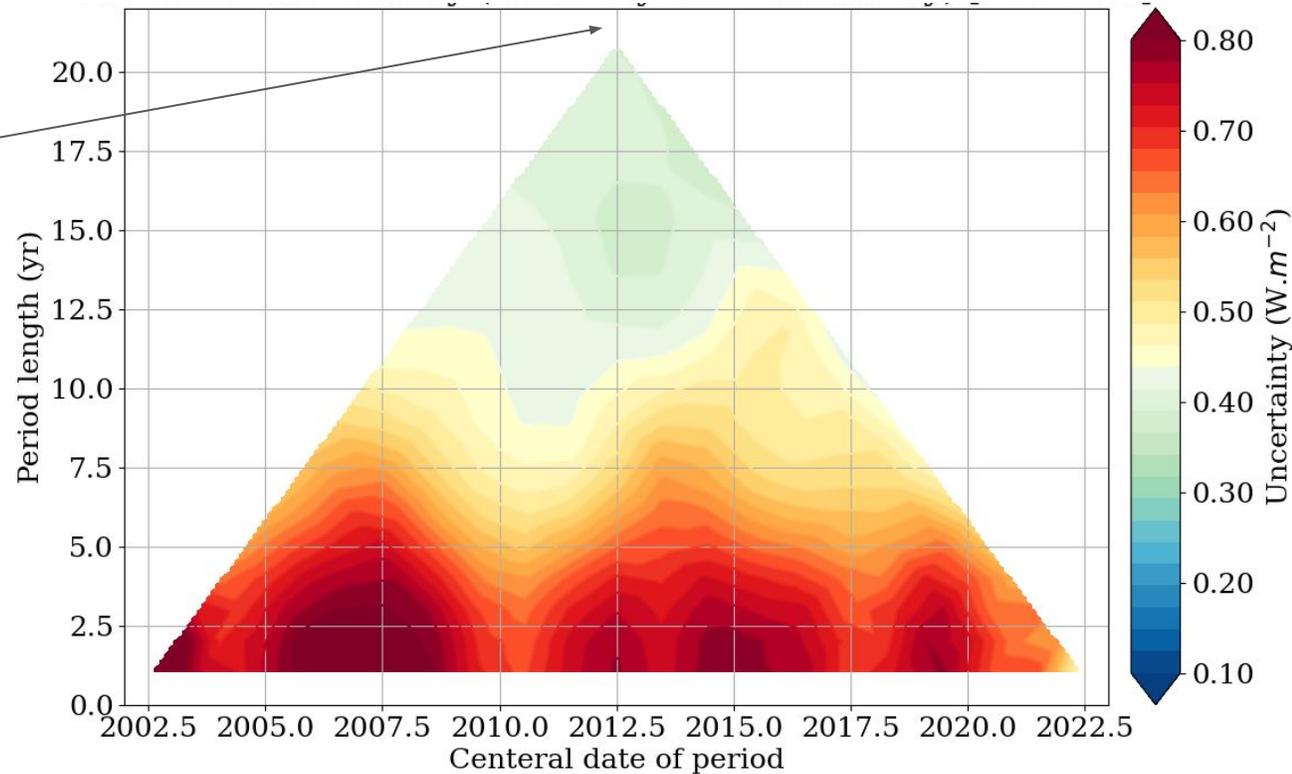
EEI mean uncertainties ([5-95%] CL )



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$\pm 0.4 \text{ W.m}^{-2}$   
over 20 years



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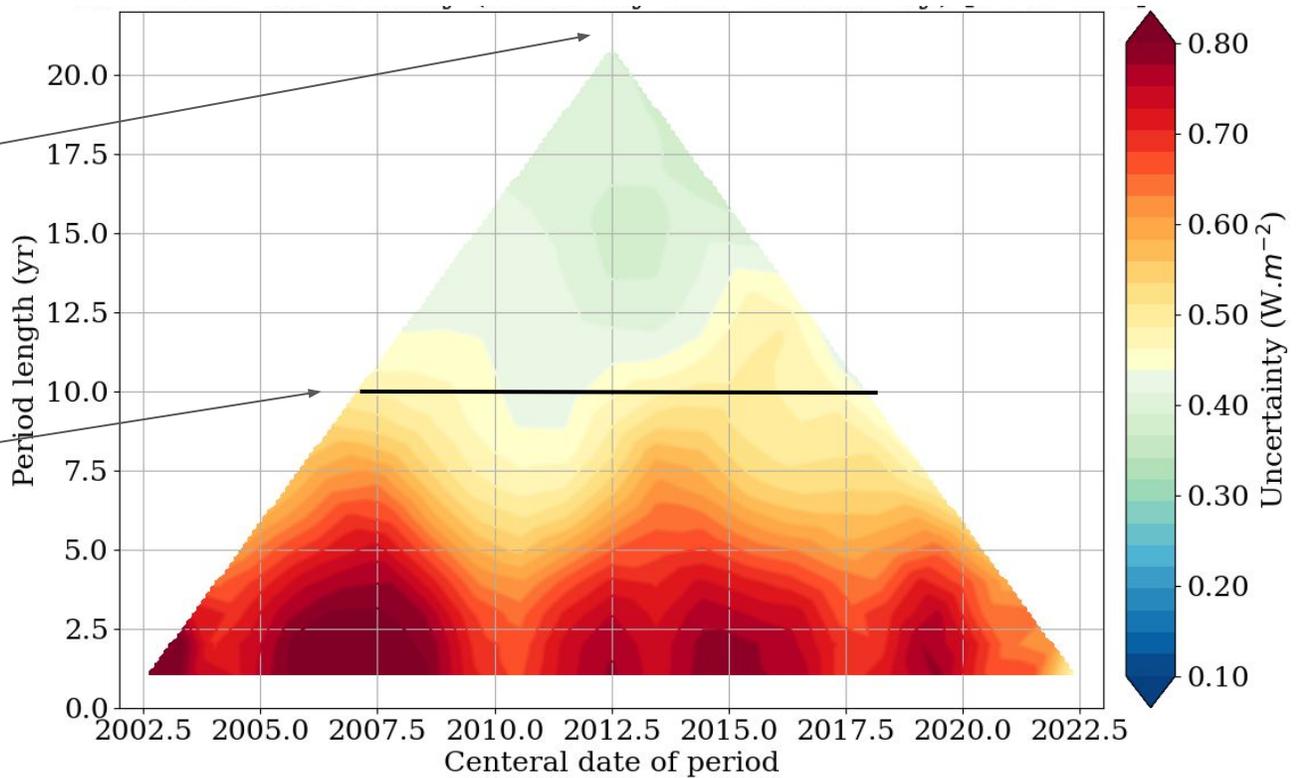


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 $\pm 0.6 \text{ W.m}^{-2}$  over 10  
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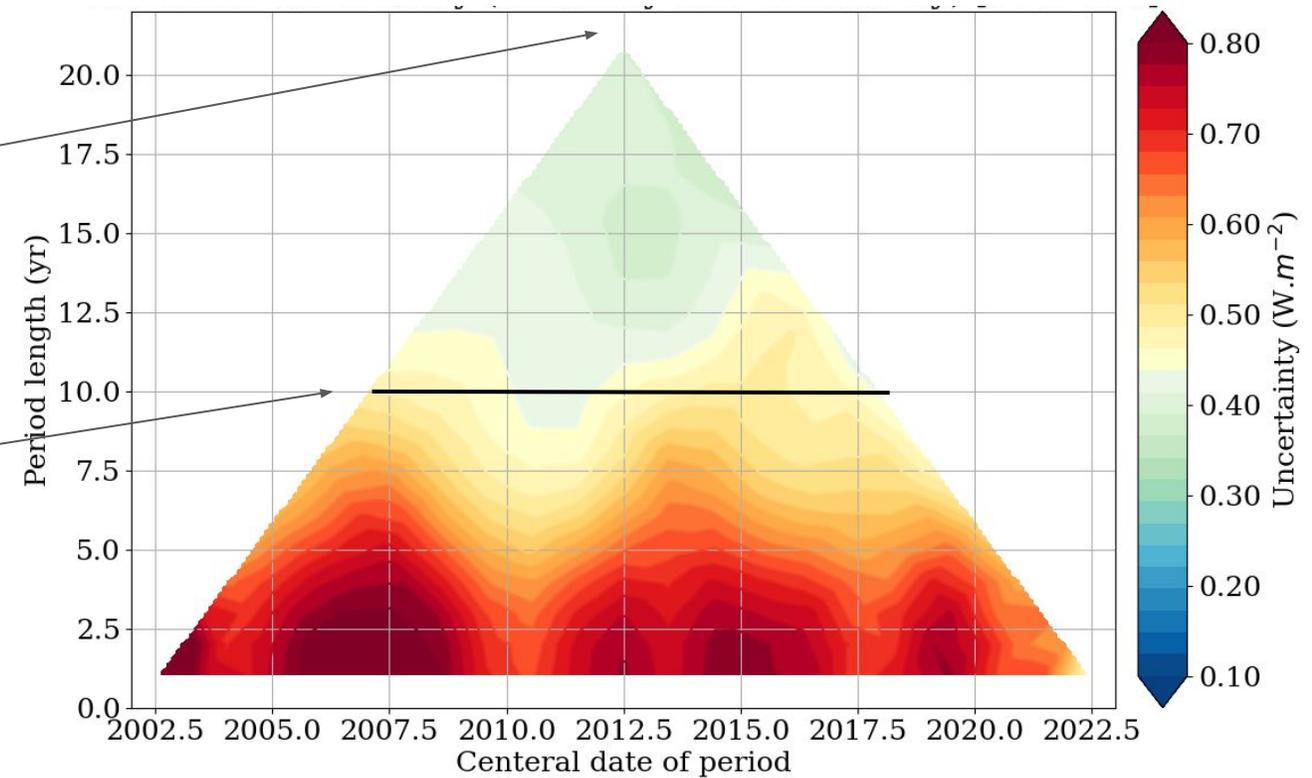


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Scientific requirements  
not yet reached:  
**0.1  $\text{W.m}^{-2}$  over 10  
years**

EEI mean uncertainties ([5-95%] CL )



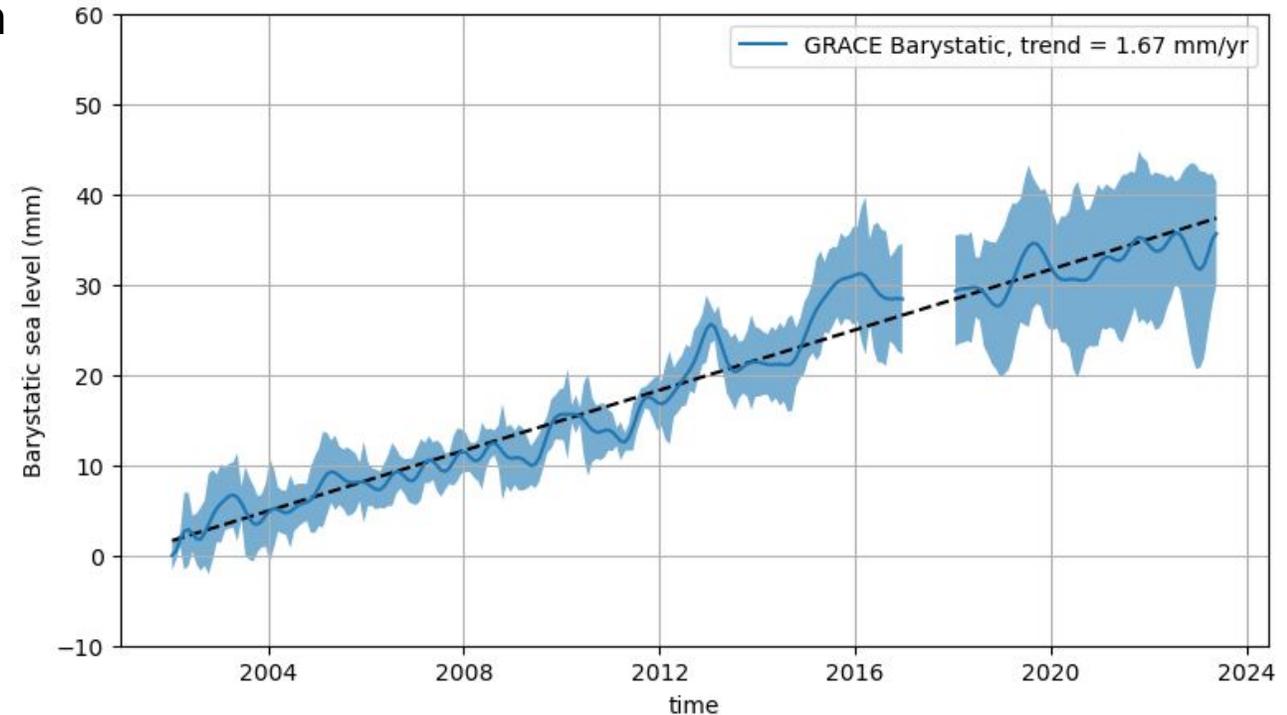
# 3) Contribution of gravimetry to EEL errors

→ Barystatic sea level anomalies are estimated with an **ensemble approach**:

- ◆ 5 processing centers (CSR, JPL, GFZ, ITSG, CNES)
- ◆ 2 geocenter models (Lemoine & Reinson, 2017; Sun et al., 2016)
- ◆ 3 SLR products estimating low degree coefficients (C20, C30) of the gravitational potential
- ◆ 2 GIA models (ICE6G\_D, Caron et al., 2018)
- ◆ 2 filters (DDK3, DDK6)

→ **Over the 2002-2023 period:**

- ◆ Barystatic trend is :  $+1.7 \text{ mm/yr} \pm 0.4 \text{ mm/yr}$
- ◆ Within a **[5%,95%] confidence interval**



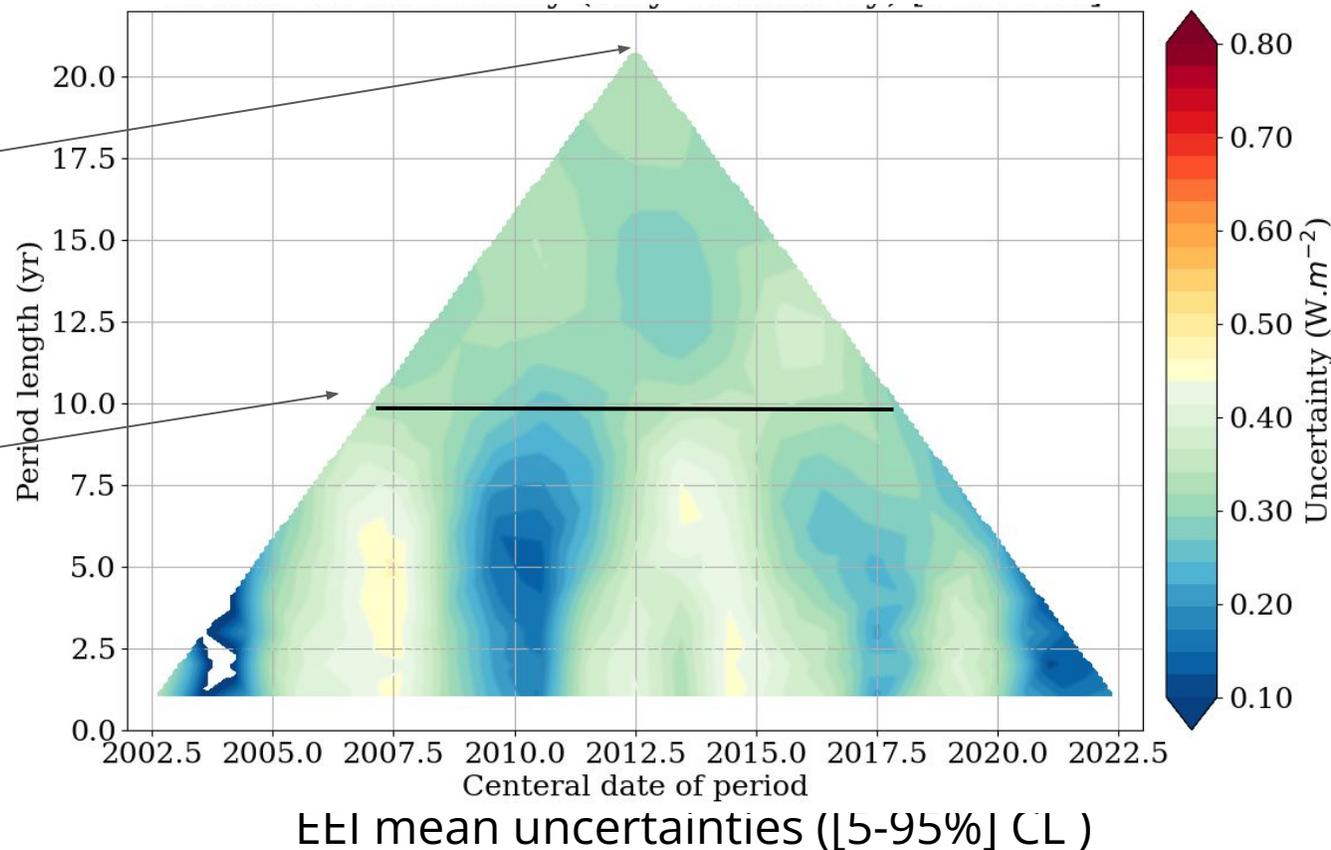


# 3) Uncertainties in the EEI and gravimetry contribution

→ Contribution of **sea level barystatic uncertainties alone** to the EEI mean :

$\pm 0.3 \text{ W.m}^{-2}$   
over 20 years

between  $\pm 0.2$  and  
 $\pm 0.4 \text{ W.m}^{-2}$  over 10  
years





## 4) Take home messages and recommendations

- **Gravimetry missions** provide a precise, accurate and stable data record over than 20 years:
  - ◆ Barystatic trend is :  $+1.7 \text{ mm/yr} \pm 0.4 \text{ mm/yr}$  [5%,95%]
- **Better accuracy needed** in barystatic estimates to answer scientific questions as the closure of the sea level budget, the monitoring of EEI:
  - ◆  $\pm 0.1 \text{ mm/yr}$  [5%,95%] for the barystatic trend over 10 years (Meysignac et al 2023)
- Using space geodetic data (altimetry and gravimetry) provide accurate EEI estimates:
  - ◆ EEI mean:  $0.8 \pm 0.3 \text{ W.m}^{-2}$  [5%,95%]
  - ◆ EEI trend:  $0.3 \pm 0.2 \text{ W/m}^2/\text{decade}$  [5%,95%]
- To date, requirements on the EEI mean ( $0.1 \text{ W.m}^{-2}$  [5%,95%] over 10 years) are not yet reached:
  - ◆ Gravimetry uncertainty contribute at 10 years for  $0.2 \text{ W/m}^2$  over the last decade
- **Further improvements needed:**
  - ◆ Improve uncertainty characterisation from geocenter, leakage correction



Thank you for  
your attention.

