

# Projected 21<sup>st</sup> Century changes in extreme wind-wave events

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# The missing piece

Extreme wind-waves

## Past uncertainties:

Wave model

Atmospheric model

Observations

Statistical

## Future uncertainties:

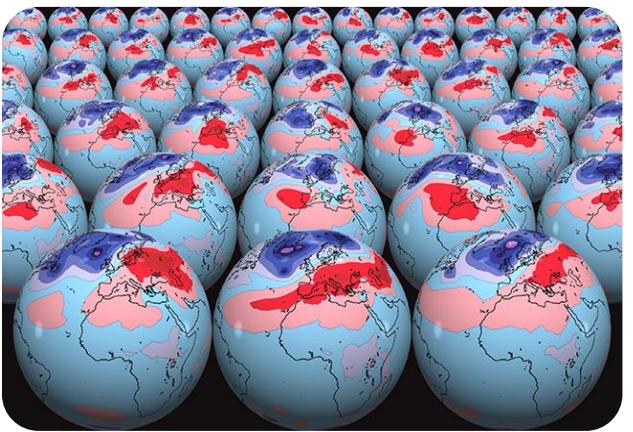
Emissions scenarios

GCMs

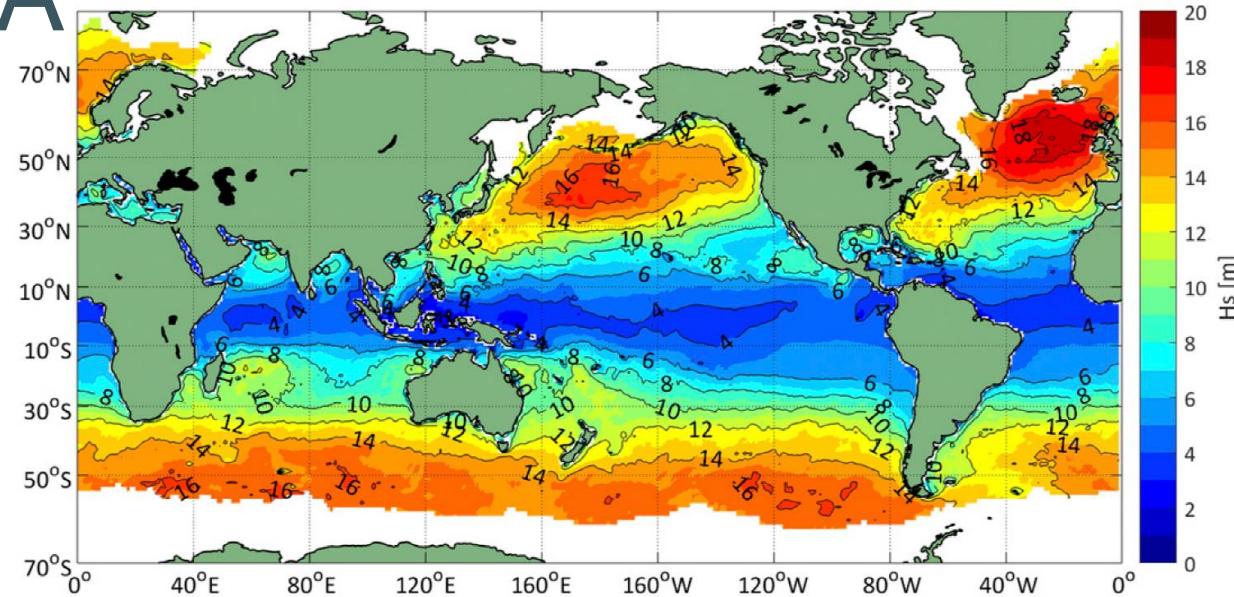


# Ensemble approach to EVA

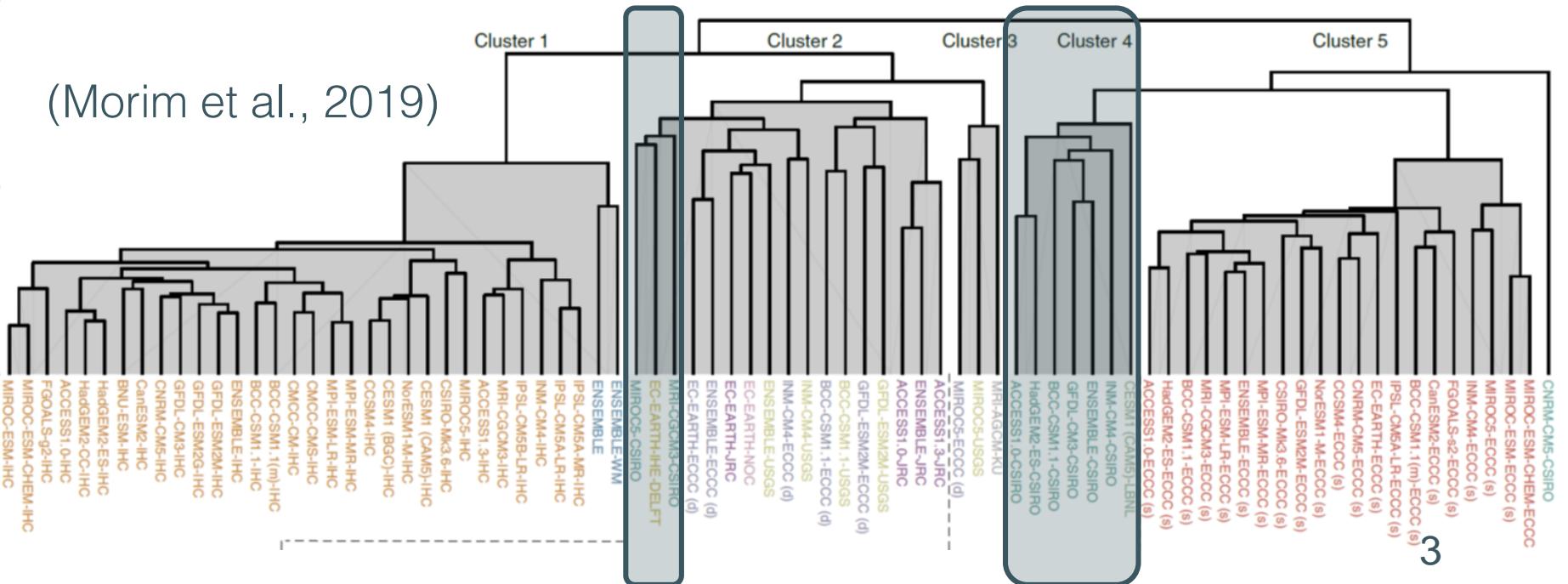
(Breivik et al., 2013, 2014; Meucci et al., 2018)



(Lorenz, 1965; Molteni et al., 1996)



(Morim et al., 2019)



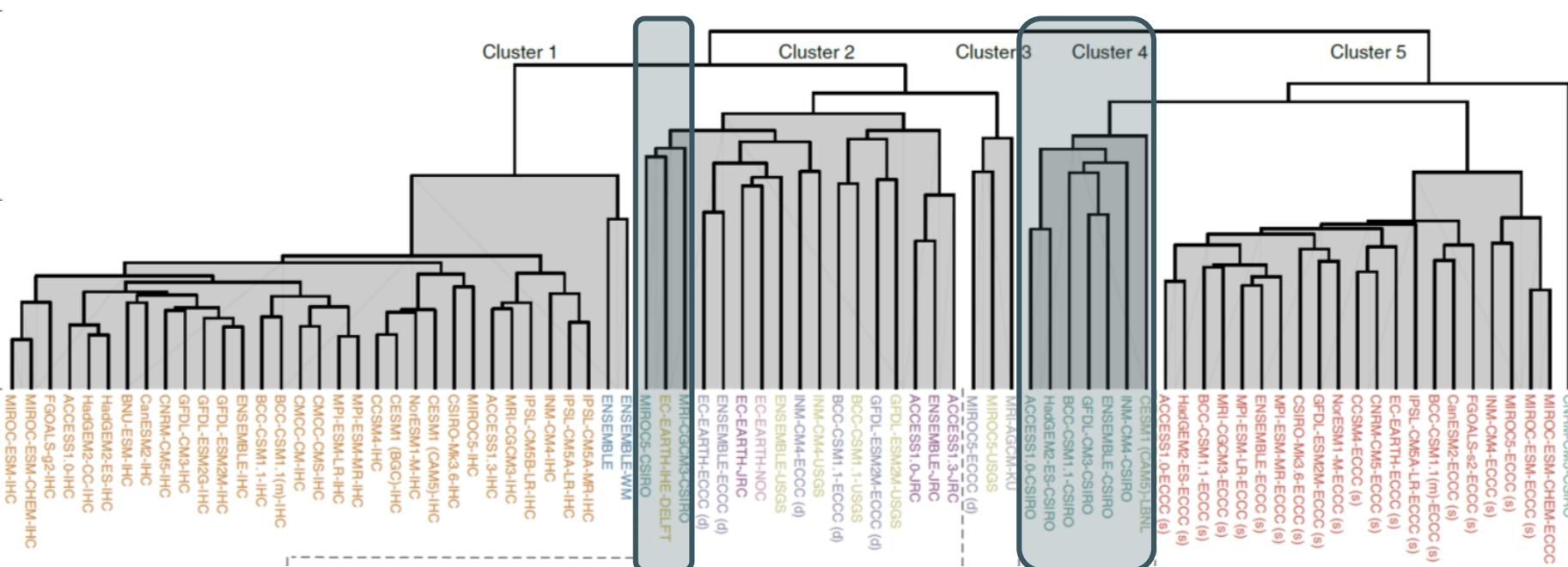
WWIII (v3.14) 6-hourly datasets forced using CMIP5 GCM surface winds

(Hemer et al., 2016 )

# Dataset

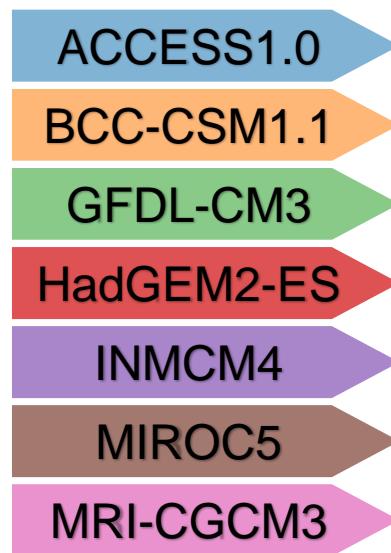
WWIII (v3.14) 6-hourly datasets forced using CMIP5 GCM surface winds

(Hemer et al., 2016 )



CMIP	phase	ATM		WAVE		Period	
		lon x lat [°]	lon x lat [°]	Δt			
ACCESS1.0	5	1.88 x 1.25	1.0 x 1.0	6h	1979-2005	2081-2100	
BCC-CSM1.1	5	2.8 x 2.8	1.0 x 1.0	6h	1979-2005	2081-2100	RCP4.5
GFDL-CM3	5	2.5 x 2.0	1.0 x 1.0	6h	1979-2005	2081-2100	
HadGEM2-ES	5	1.88 x 1.25	1.0 x 1.0	6h	1979-2005	2081-2100	RCP8.5
INMCM4	5	2.0 x 1.25	1.0 x 1.0	6h	1979-2005	2081-2100	
MIROC5	5	1.4 x 1.4	1.0 x 1.0	6h	1979-2005	2081-2100	
MRI-CGCM3	5	1.1 x 1.1	1.0 x 1.0	6h	1979-2005	2081-2100	

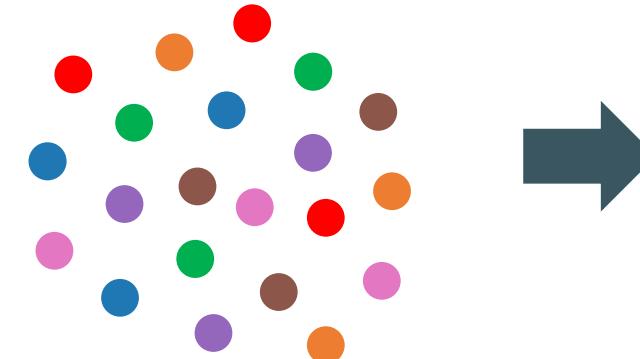
# Selection of extremes



(Lopatoukhin et al., 2000)  
peaks over 90<sup>th</sup> percentile threshold for each  
model -- 48h storm independence

$$Z_m = \frac{H_{s,m} - \mu_m^{\text{hist}}}{\sigma_m^{\text{hist}}}$$

(Aarnes et al., 2017)



1000 highest  
peaks

## Representative time interval

(Breivik et al., 2013, 2014)

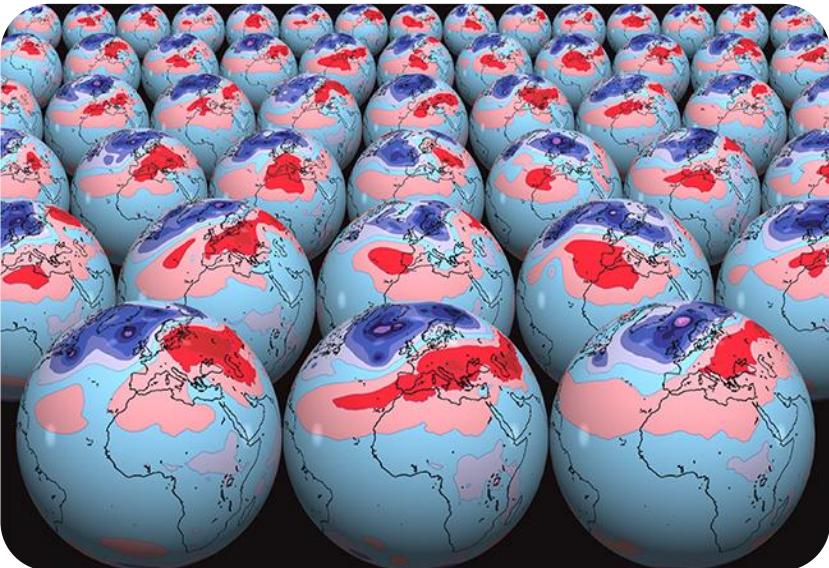
Historical dataset 1979-2005:

$$T_{\text{eq}} = 27 \text{ years} \cdot 365 \cdot 4 \text{ hindcasts a day} \cdot 6 \text{ h} \cdot 7 \text{ GCMs} = 189 \text{ years}$$

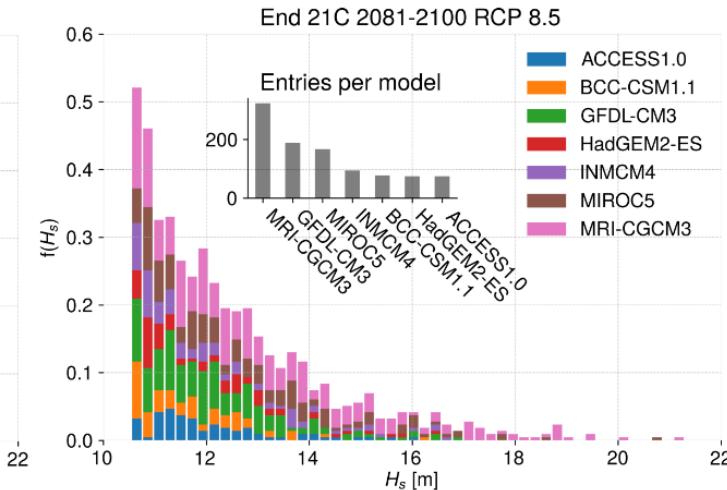
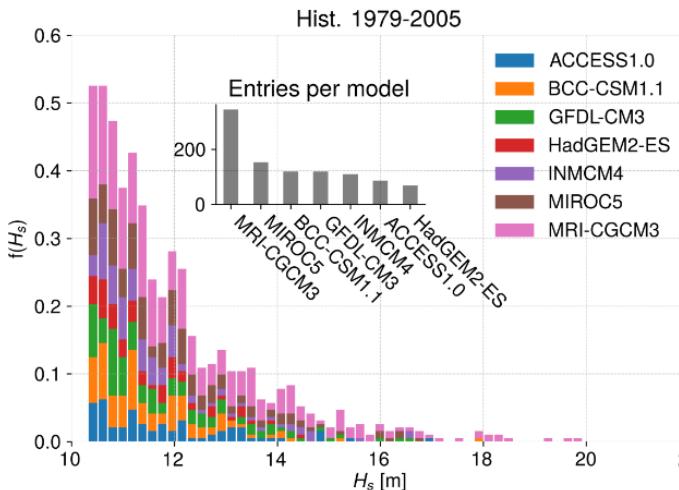
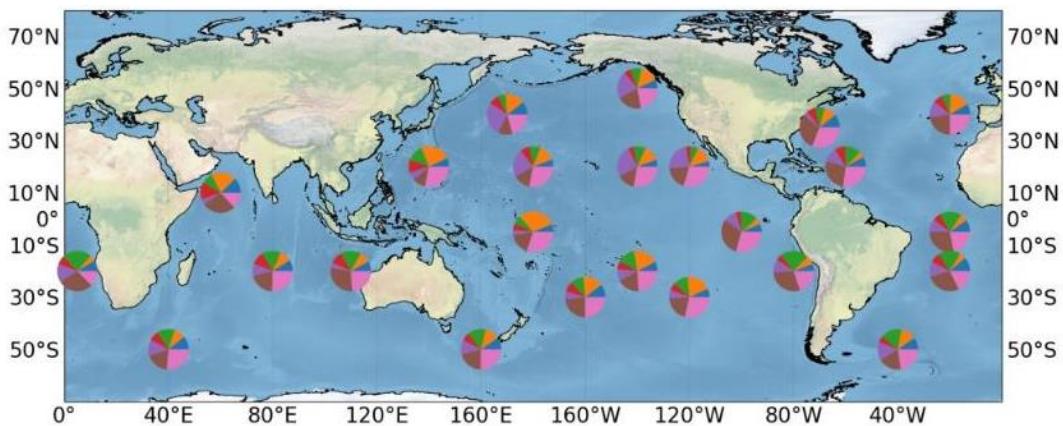
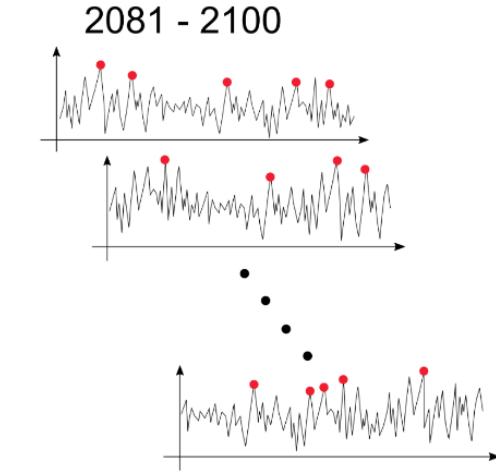
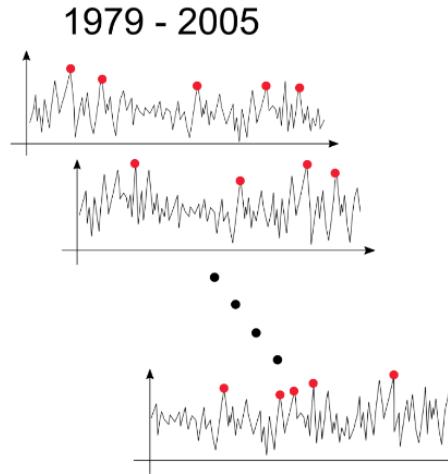
Future projection dataset 2081-2100:

$$T_{\text{eq}} = 20 \text{ years} \cdot 365 \cdot 4 \text{ hindcasts a day} \cdot 6 \text{ h} \cdot 7 \text{ GCMs} = 140 \text{ years}$$

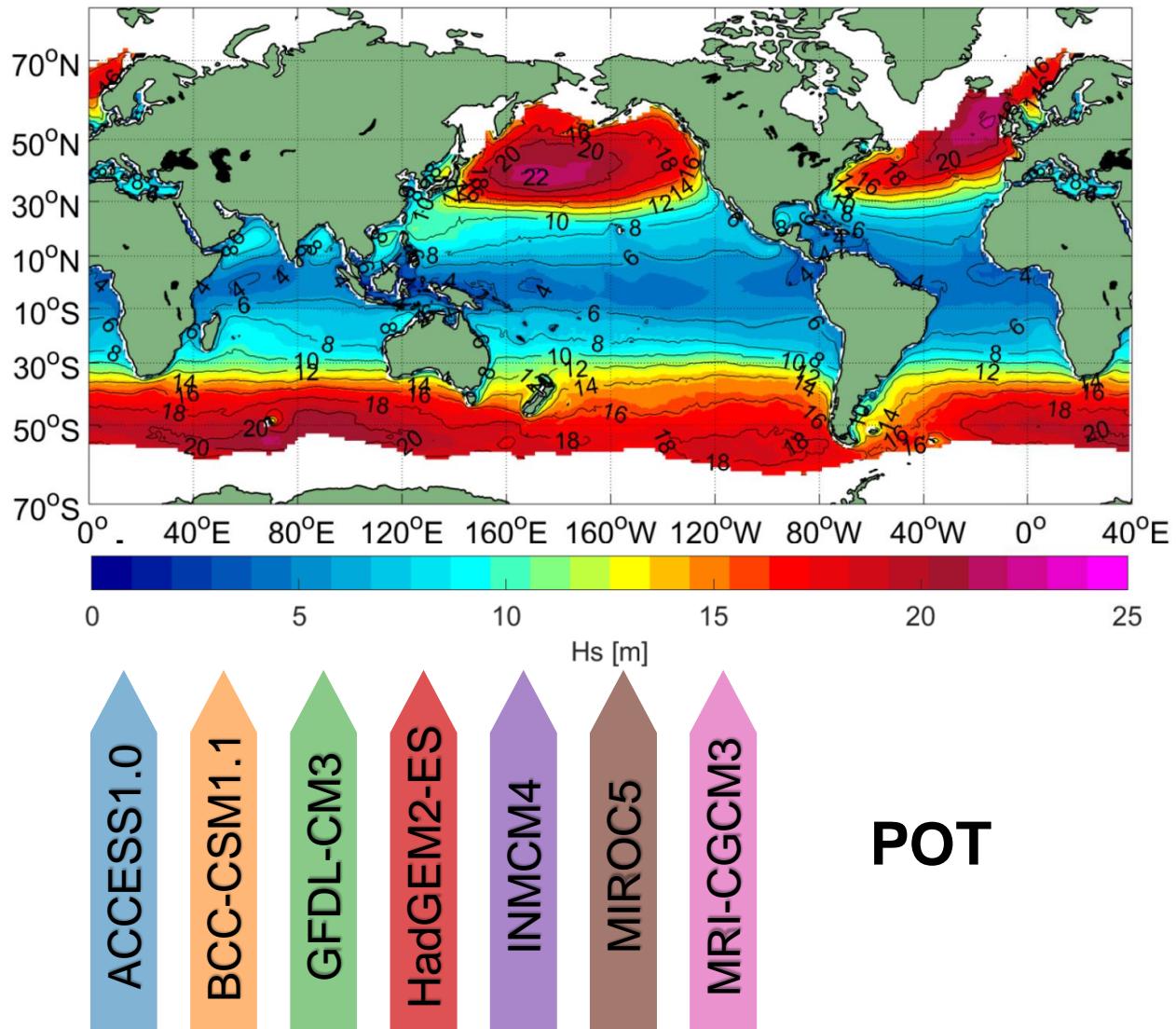
# Models contribution



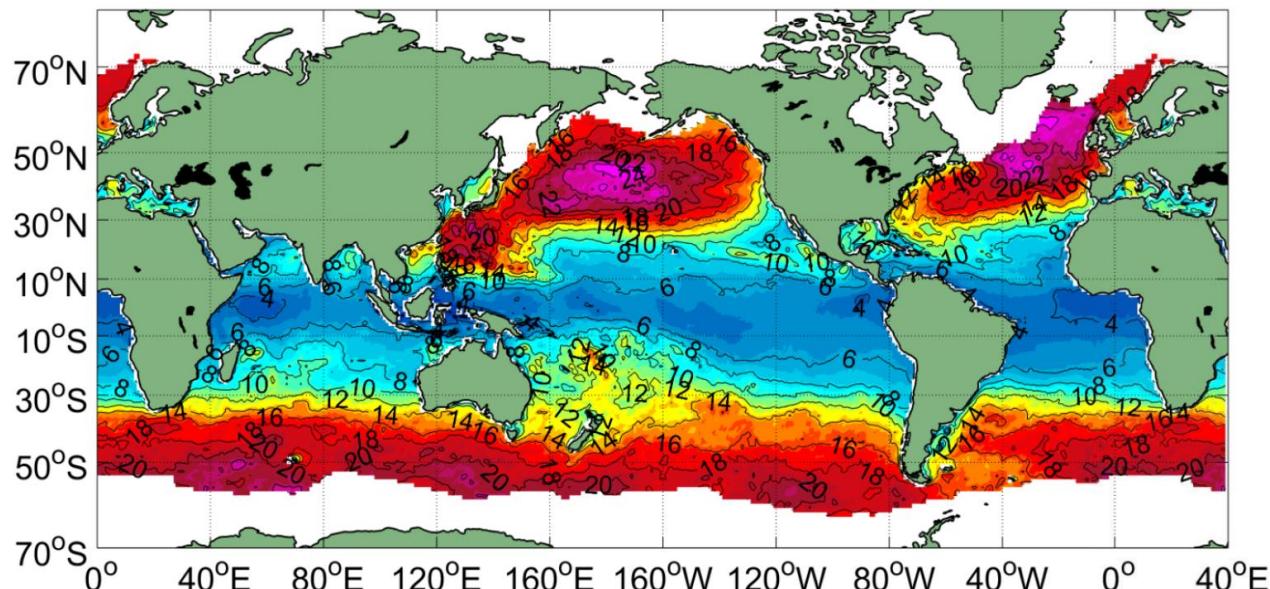
ACCESS1.0  
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MRI-CGCM3



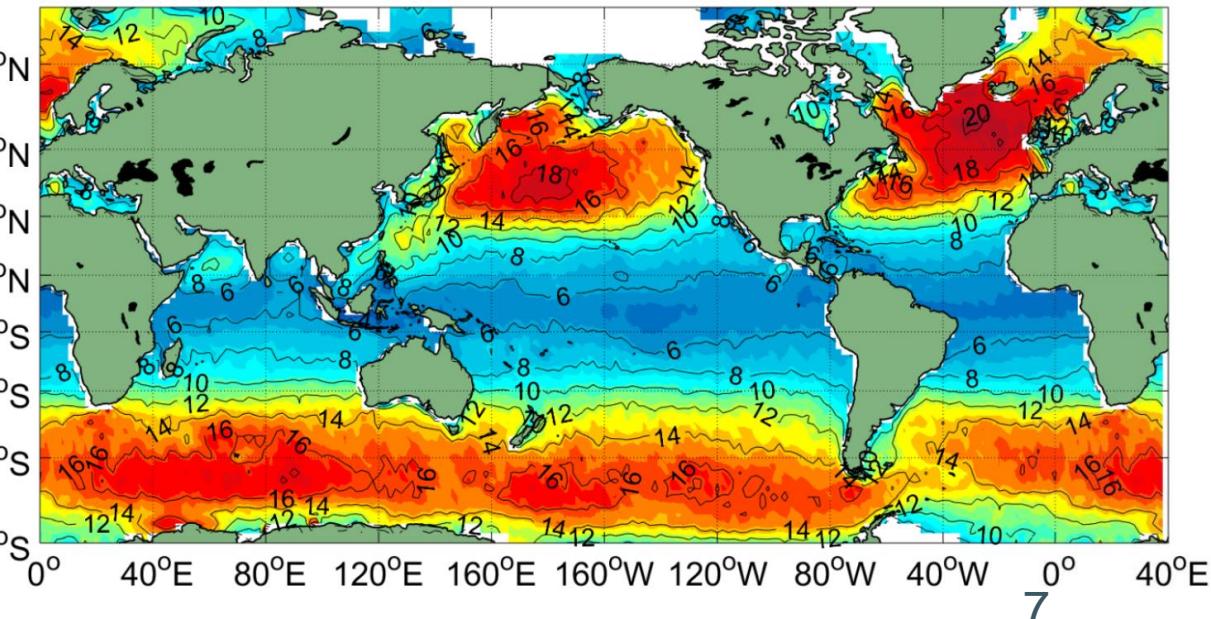
# Historical dataset extreme estimates



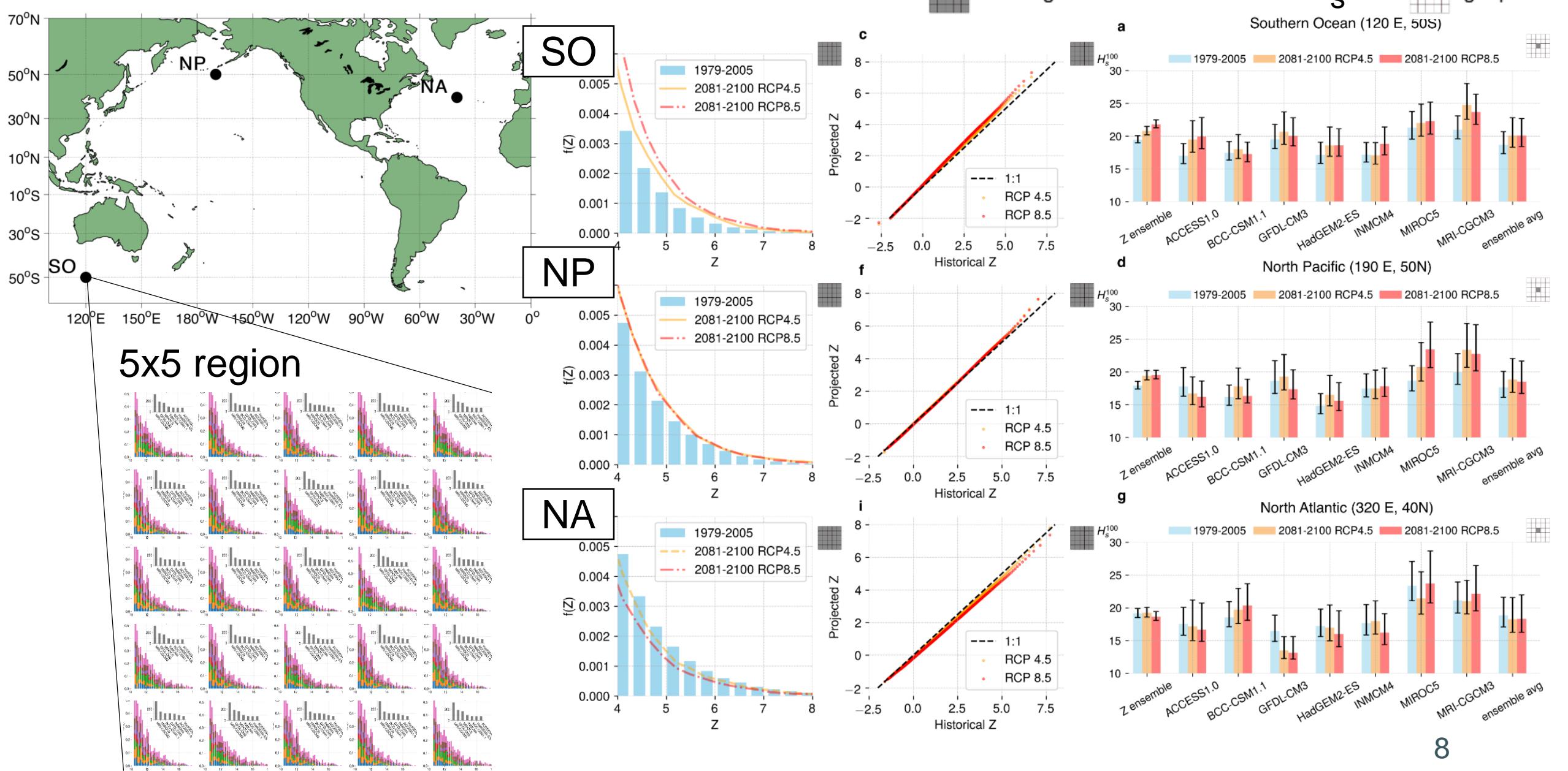
WWIII forced with CFSR winds



(Young and Ribal, 2019) Satellite Altimeter



# Extreme Value Analysis

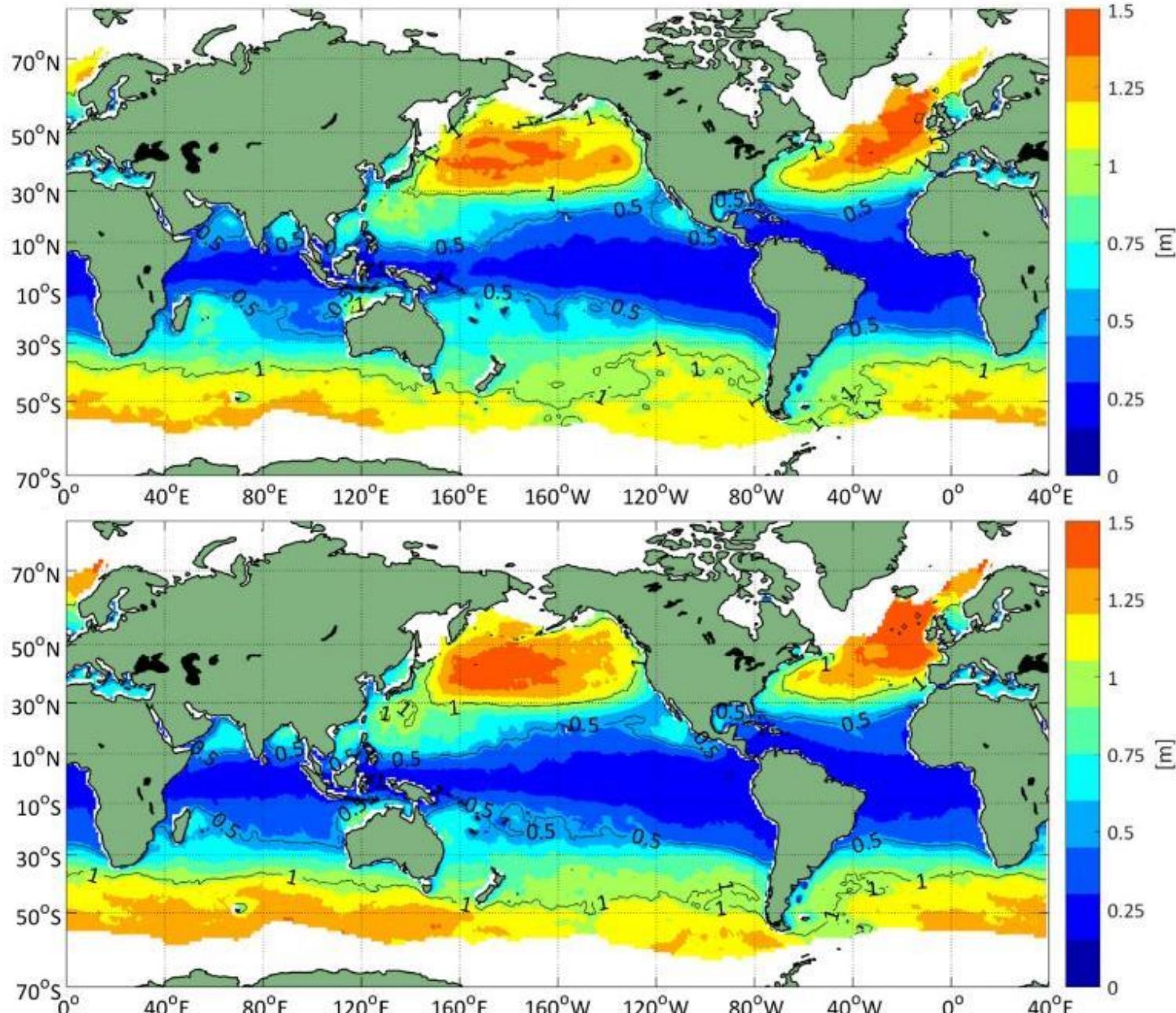


# Confidence levels

1979-2005

Bootstrap estimates  
on the 1000 peaks  
obtained from the  
ensemble pooling  
technique

2081-2100  
RCP8.5

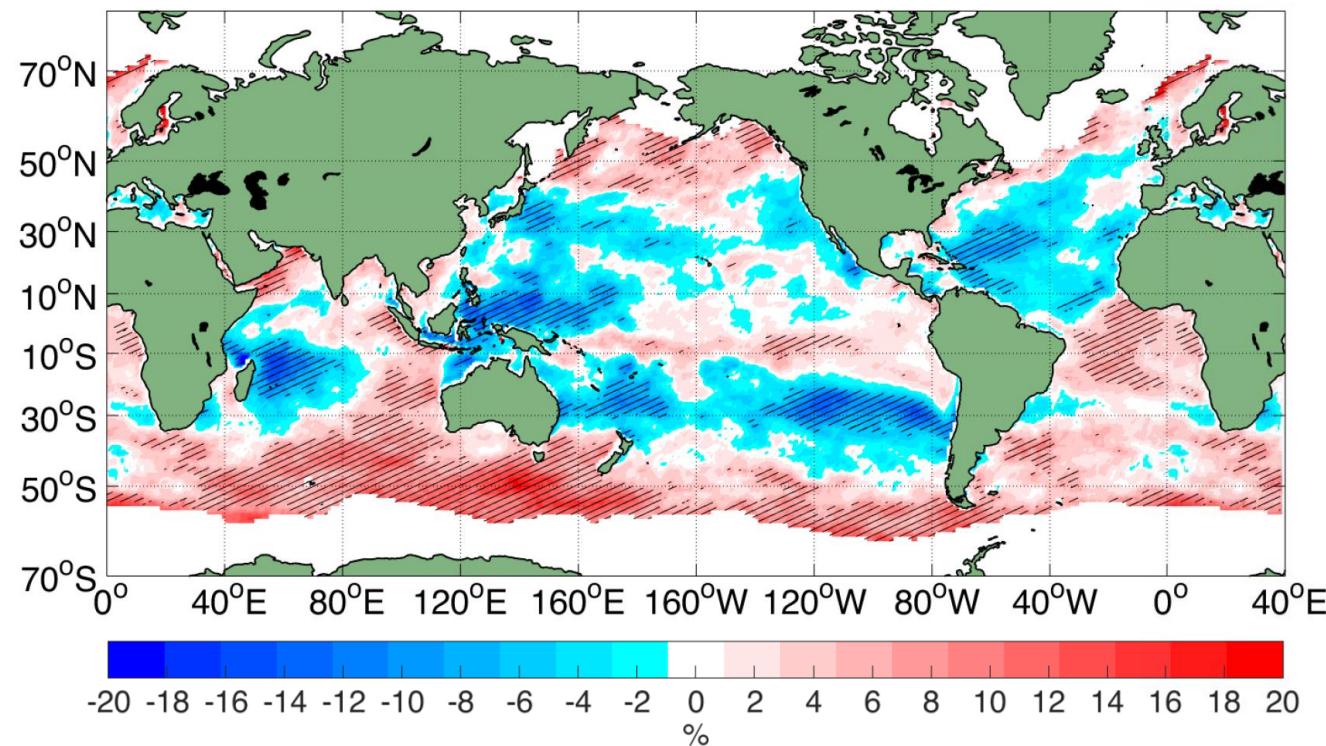


# Projected changes in extreme wind-waves ( $H_s^{100}$ )

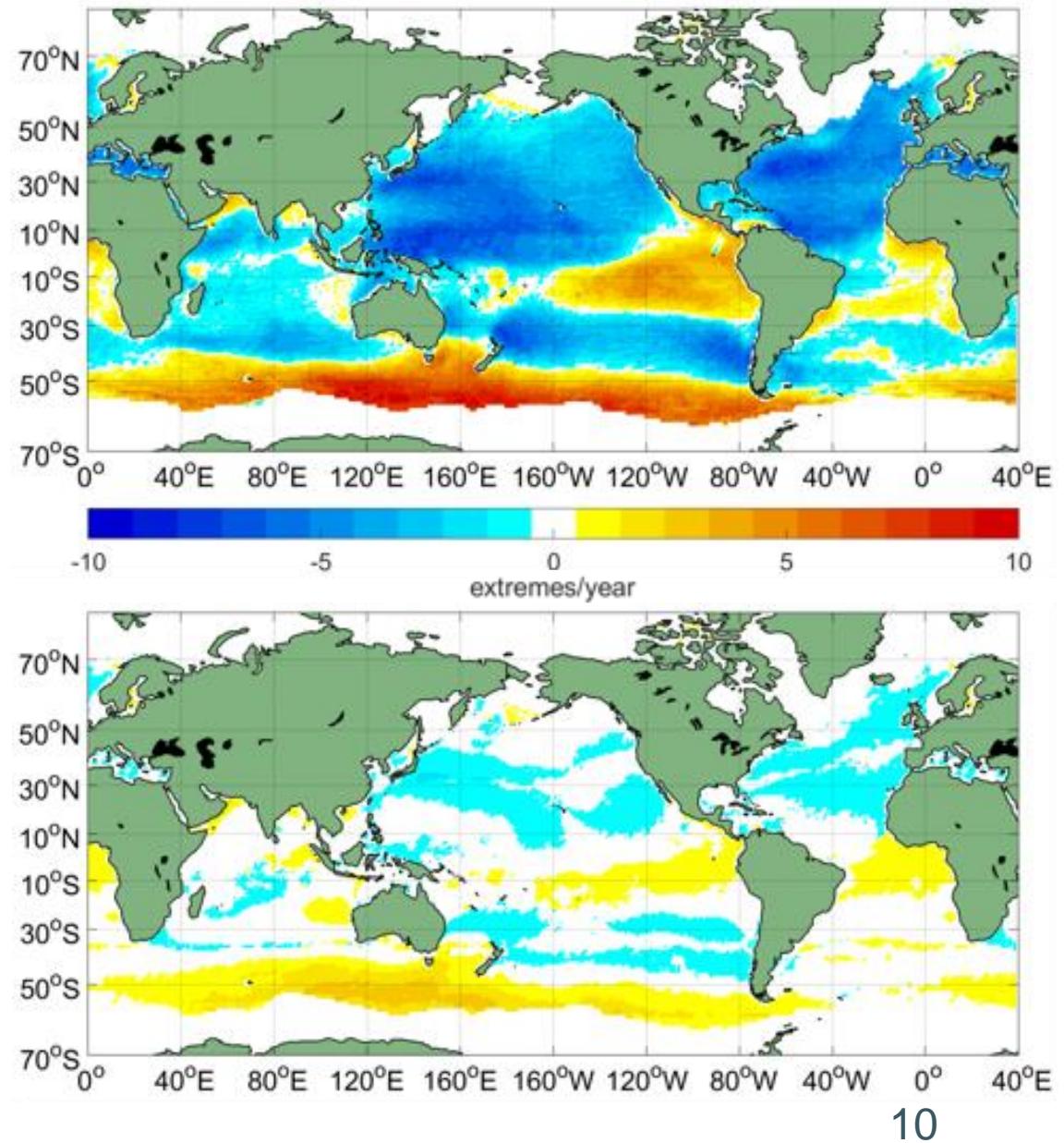
2081–2100 - 1979–2005

90<sup>th</sup> perc.

RCP8.5



99.7<sup>th</sup> perc.

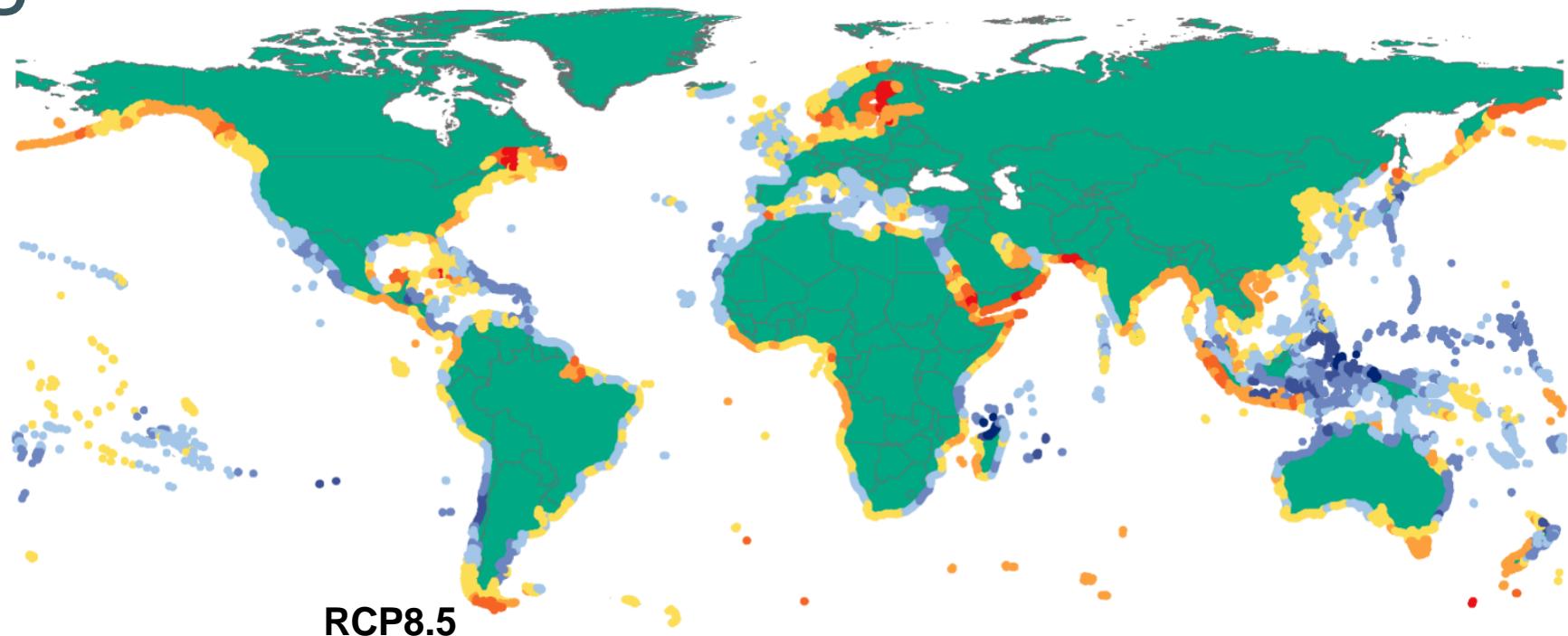


# Changes along global coastlines

Percentage of changes

in  $H_s^{100}$

- (-20) - (-15)
- (-15) - (-10)
- (-10) - (-5)
- (-5) - 0
- 0 - 5
- 5 - 10
- 10 - 15
- 15 - 20



(% change)	Coastline length (km)	Coastline length (%)	Coastline length (km)	Coastline length (%)
-20% to -15%	9,643	0.89	7,399	0.69
-15% to -10%	13,130	1.22	25,281	2.34
-10% to -5%	69,208	6.42	120,625	11.18
-5% to 0%	277,810	25.76	285,227	26.45
0% to 5%	499,537	46.32	365,741	33.91
5% to 10%	168,420	15.62	182,163	16.89
10% to 15%	33,053	3.06	68,087	6.31
15% to 20%	7,737	0.72	24,015	2.23

DIVA dataset locations

$\Delta H_s^{100}$  at the closest offshore grid point

# Limitations

- Stationarity
- Inhomogeneous datasets
- Tropical Cyclones still not correctly reproduced by GCMs
- Possible biases introduced by differently distributed datasets

# Potential

- Results are consistent with previous studies  
(Hemer et al. 2013; Wang et al. 2014; Aarnes et al. 2017; Morim et al. 2019)
- Inter models low correlation guarantees independence
- Possibility to synthesize an equivalent time series of duration longer than the simulation period
- Increased dataset reduces confidence intervals

# At what point are we?

- Higher resolutions are needed
- Ensemble approach to TC areas with increasing model resolution
- Still many uncertainties are characterizing observations of extremes
- Improved GCMs and additional models may allow use of Direct Return level Estimates
- Do GCMs ensemble models for future projections exist?

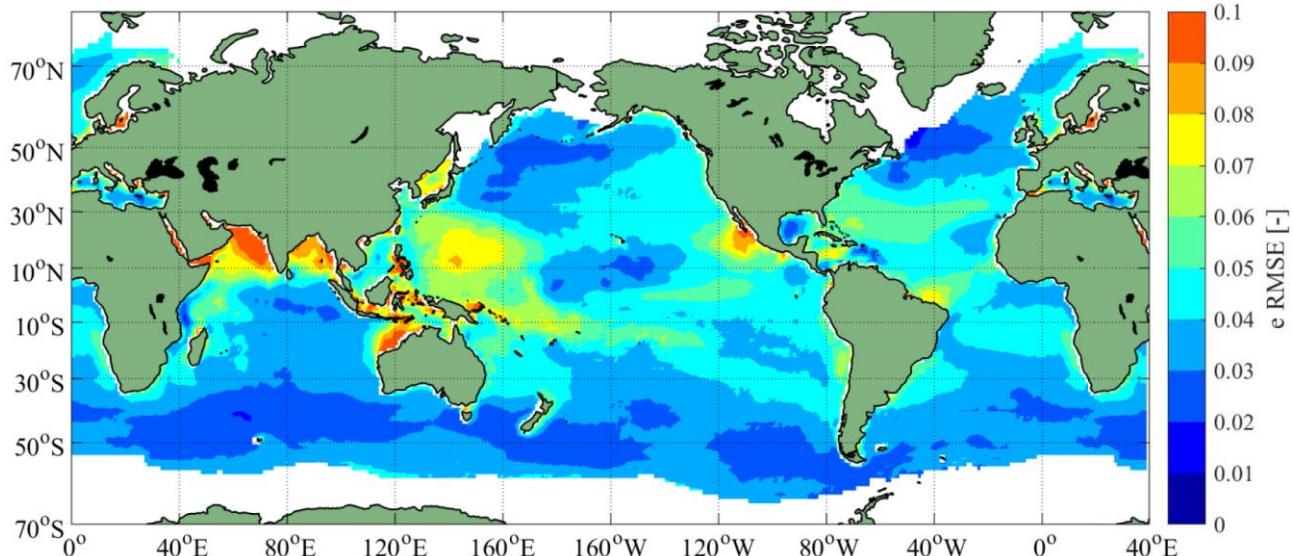
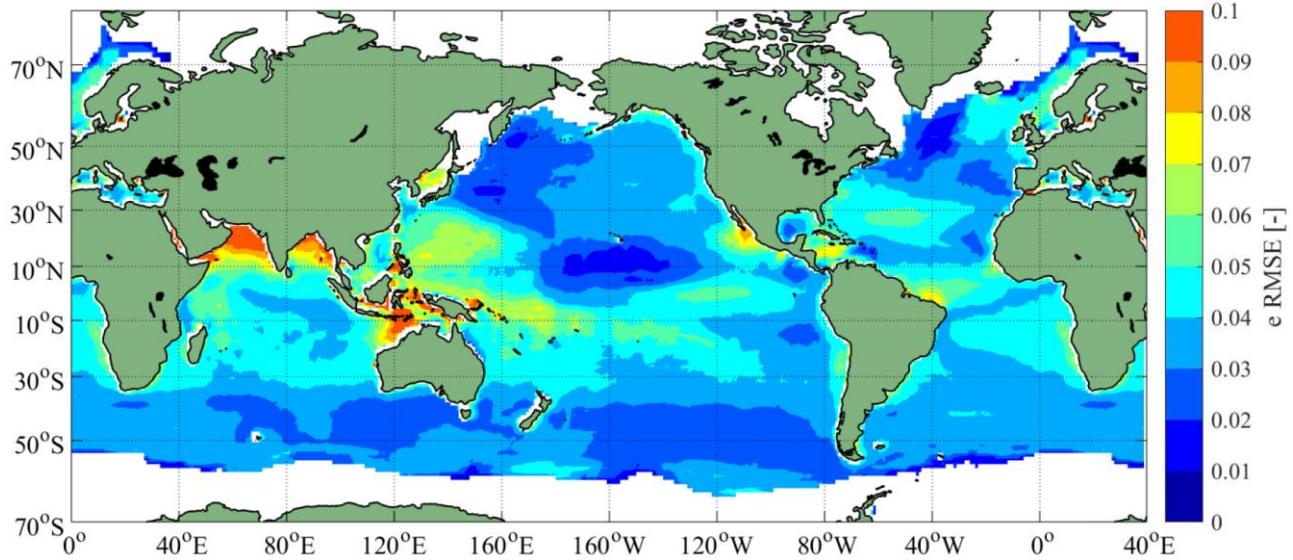
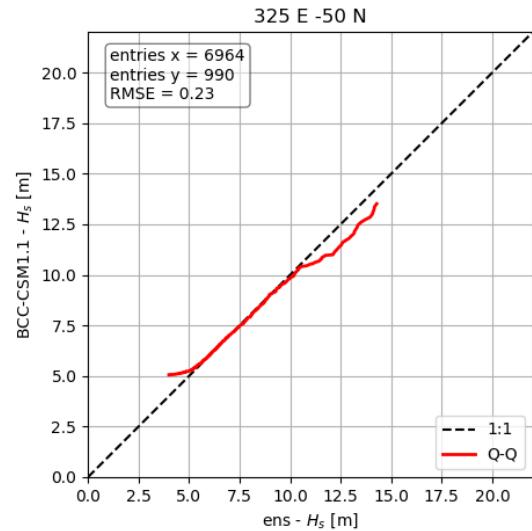
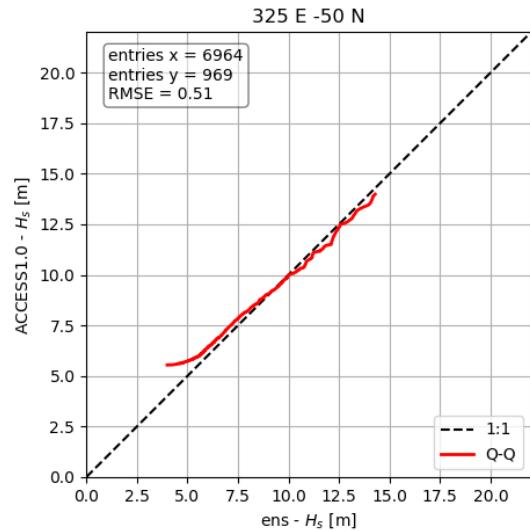


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# Supplementary material

# Similarity test between distribution of extremes

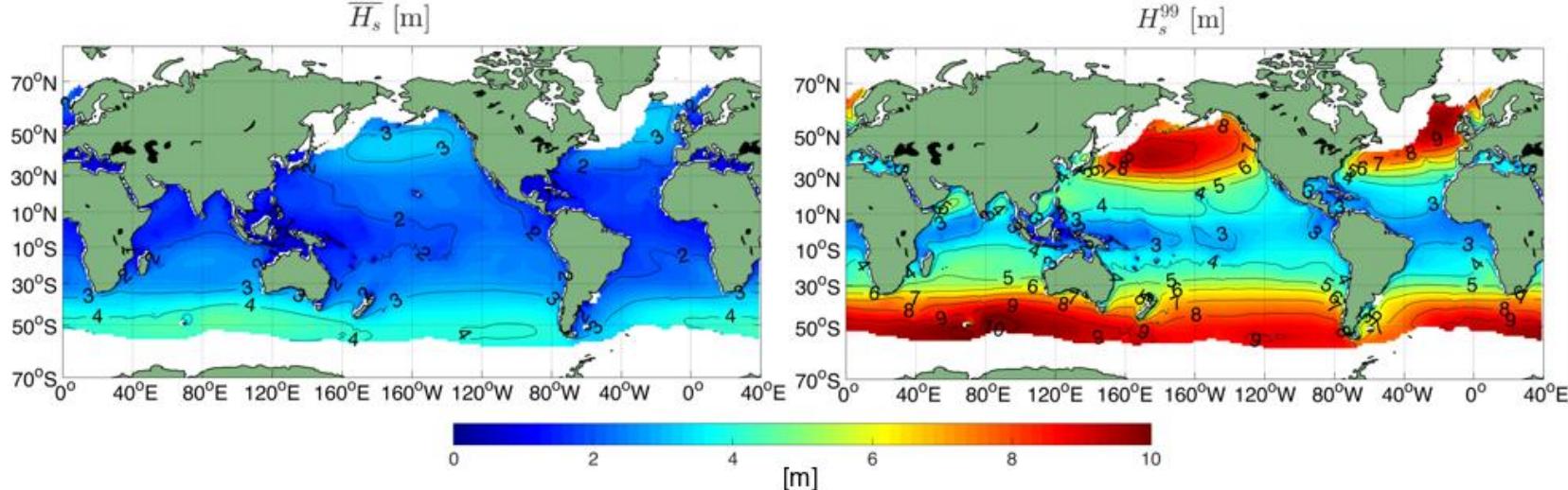


$$e_{\text{RMSE}} = 1 - \frac{\left| \frac{\sum \text{RMSE}_m}{n} - H_S^{100} \right|}{H_S^{100}}$$

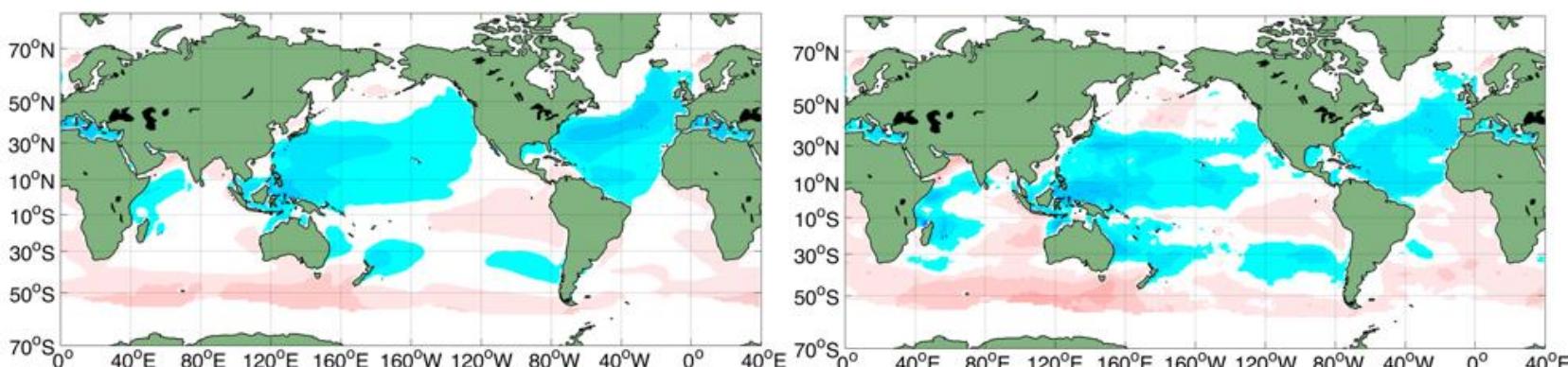
# Model ensemble performance

Comparable to total  
multi-model ensemble  
in Morim et al., (2019)

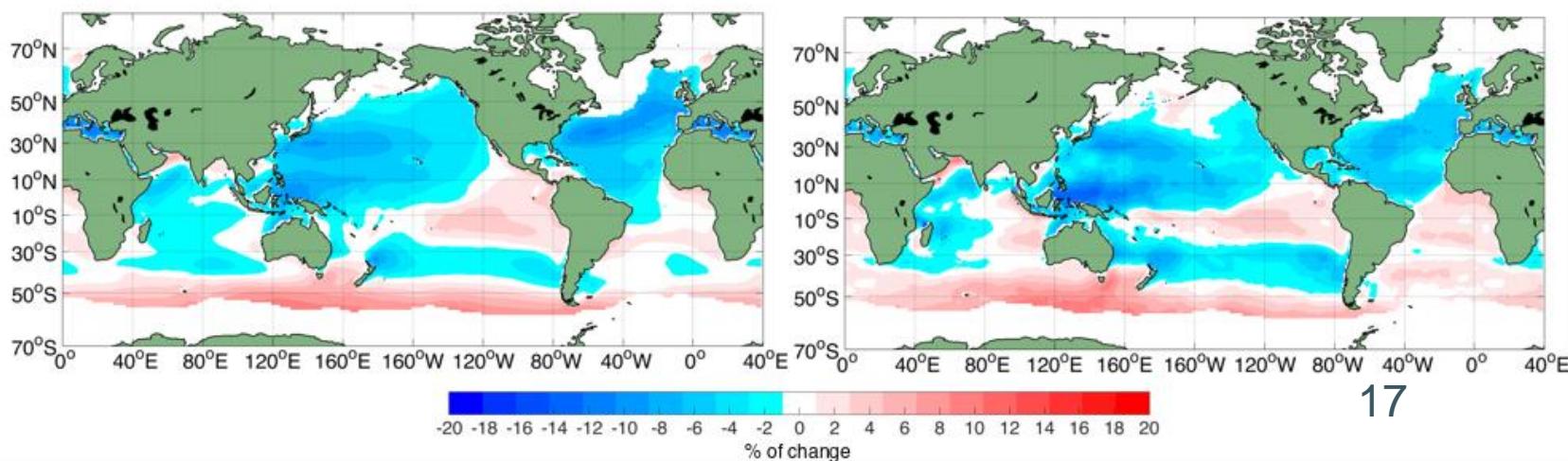
1979-2005



RCP4.5

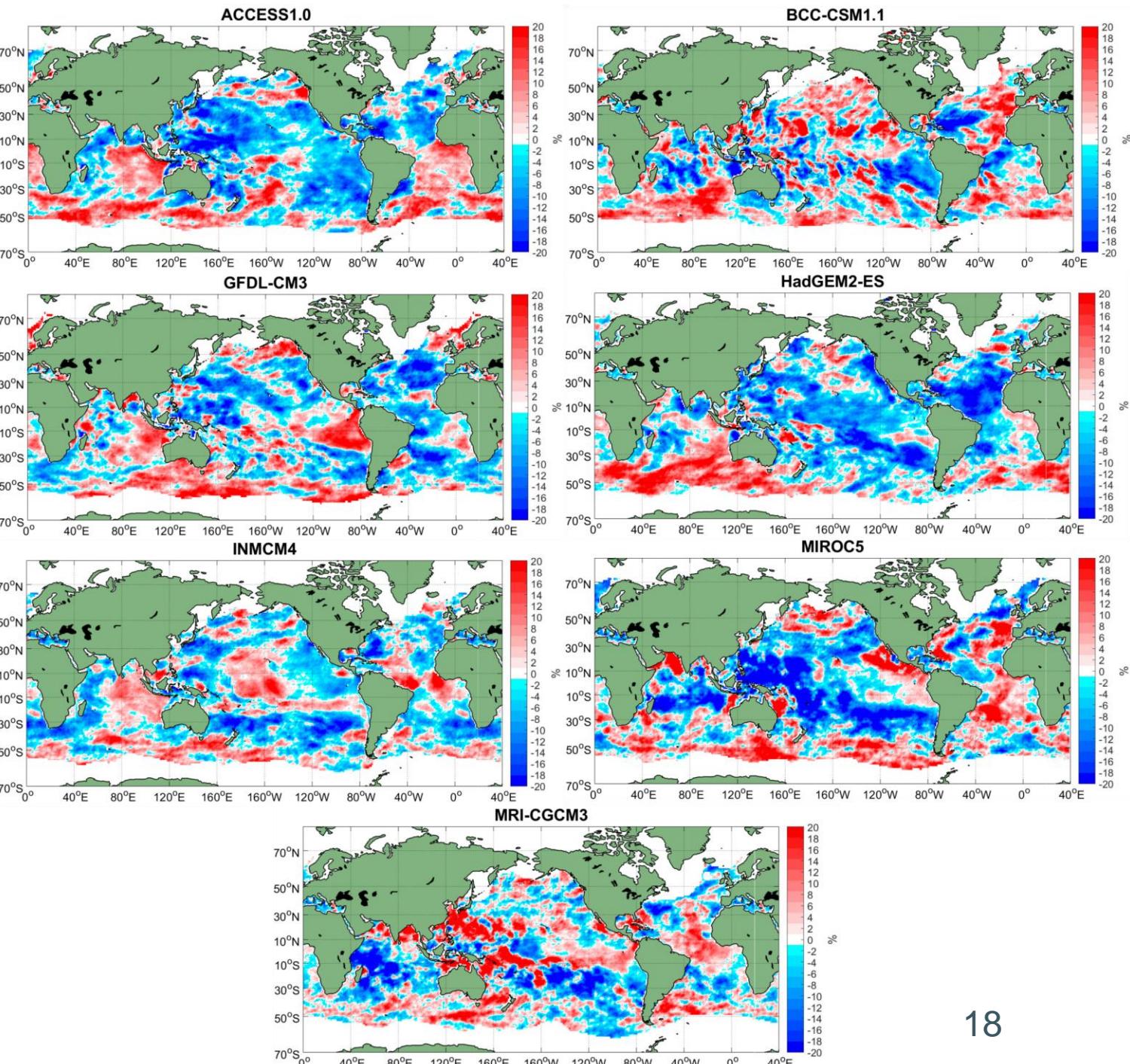


RCP8.5



# Instability of single model projected extreme changes

$\Delta = 1979-2005$  — 2081-2100  
RCP8.5



# Independent and Identically Distributed (i.i.d) data

