

# Robustness and uncertainties in global multivariate wind-wave climate projections

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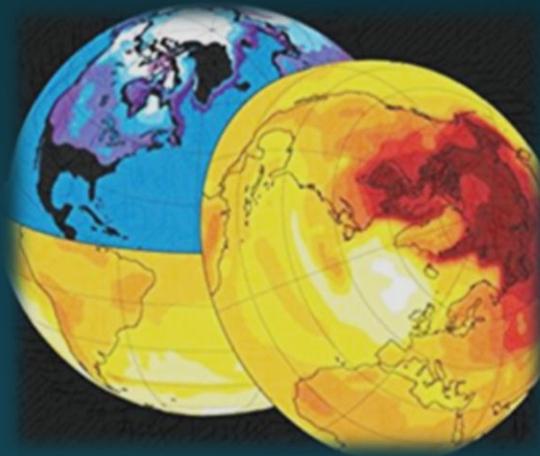
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# Topics

1. Global wave projections
2. COWCLIP published data
3. Ongoing COWCLIP research

# 1. Global wave projections



# Why are wind-waves important?

Coastal climate Impact and adaptation assessments and planning require consideration of a range of different sea-level drivers: mean changes, surges and **waves**.

Wave-driven flooding



Marshall Islands

Shoreline position change



Senegal, Africa

# Wind-waves in a warmer world?

Wind-waves will respond to variability and climate-driven changes in atmospheric circulation



Changing storm tracks/strength will drive changes in global wave fields (height, frequency and direction)

with potential

- geophysical (e.g. flooding, erosion)
- socio-economic (e.g. infrastructure damage)
- environmental (e.g. marsh erosion, saltwater intrusion)

consequences...

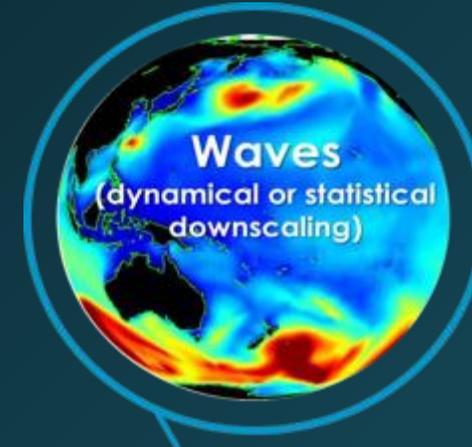
Gold Coast, Australia



# How waves are derived from GCM atmospheric fields?



Wind-wave modeling methodology



Inter-scenario uncertainty (RCP25...RCP85)  
Inter-model uncertainty (model forcing)  
Intra-model uncertainty (realization)

Dynamical

Model (WAM, WW3)  
Source Term (ST2-ST6)  
Calibration (e.g., wave growth)  
Resolution (spectral, numerical)  
Input (sea ice, bathymetry)

Statistical

Model (regressions, weather types)  
Atmospheric fields (e.g., ERAI)  
Calibration (e.g., satellite)  
Bias correction

Increasing uncertainty



# However, our current understanding is limited...

To date, Independent global wave projection analysis have,

1) narrow sampling of uncertainty space  
*(Morim et al. 2018, Global and Planetary Change)*

2) little sample space overlap leading to large unquantifiable uncertainty  
*(Hemer et al. 2012, BAMS, Hemer et al. 2013, Nature Climate Change)*

3) lack of scientific consensus with other published global wave projections  
across many ocean regions  
*(Morim et al. 2018, Global and Planetary Change)*

4) provided a limited understanding of robustness  
*(Hemer et al. 2012, BAMS, Morim et al. 2018, Global and Planetary Change)*

# So, how robust are global wave projections? and which uncertainty sources dominate?

To answer, we use a large community ensemble established under a pre-designed framework...

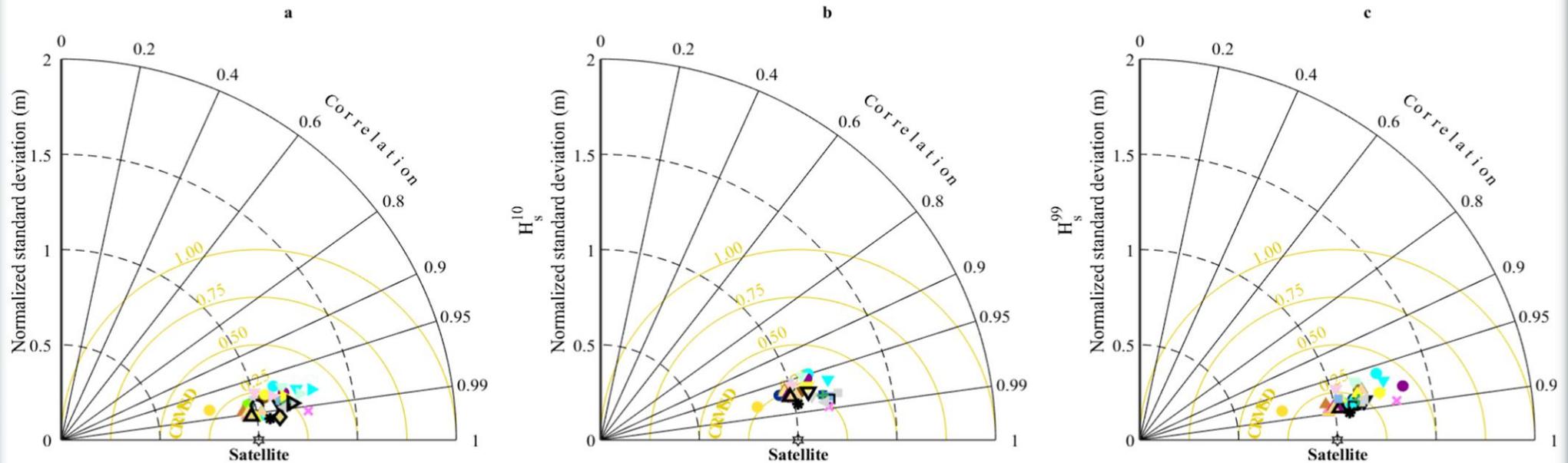
The ensemble members are obtained from ten CMIP5-based standalone data sets developed by different climate modelling centers



**Community ensemble of 148 members of global multivariate wave climate projections**

**(10 Methods, 37 GCM forcing, 2 RCP scenarios)**

# Comparison of simulated wave height against satellite data (26 years)



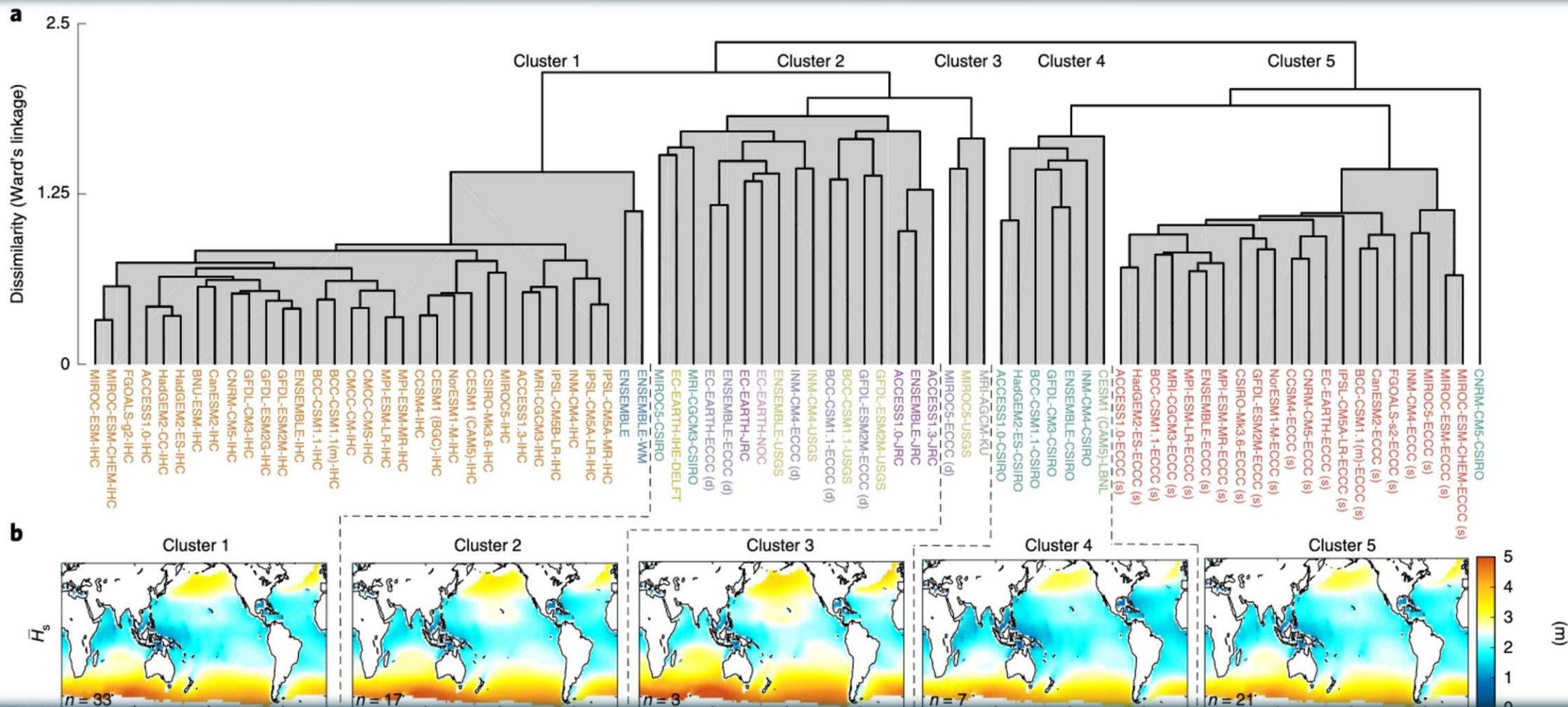
- |                 |                  |                    |
|-----------------|------------------|--------------------|
| • ACCESS1.0     | • GFDL-ESM2G     | ○ CSIRO            |
| • ACCESS1.3     | • GFDL-ESM2M     | ★ IHE-DELFT        |
| • BCC-CSM1.1    | • HadGEM2-CC     | ▽ ECCC(d)          |
| • BCC-CSM1.1(m) | • HadGEM2-ES     | △ ECCC(s)          |
| • BNU-ESM       | • INM-CM4        | ◇ IHC              |
| • CanESM2       | • IPSL-CM5A-LR   | □ JRC              |
| • CCSM4         | • IPSL-CM5A-MR   | × KU               |
| • CESM1 (BGC)   | • IPSL-CM5B-LR   | + LBNL             |
| • CESM1 (CAM5)  | • MIROC-ESM      | ◁ NOC              |
| • CMCC-CM       | • MIROC-ESM-CHEM | ▷ USGS             |
| • CMCC-CMS      | • MIROC5         | ☆ Satellite        |
| • CNRM-CM5      | • MPI-ESM-LR     | ★ Multi-model mean |
| • CSIRO-Mk3.6   | • MPI-ESM-MR     |                    |
| • EC-EARTH      | • MRI-AGCM       |                    |
| • FGOALS-g2     | • MRI-CGCM3      |                    |
| • FGOALS-s2     | • NorESM1-M      |                    |
| • GFDL-CM3      |                  |                    |

- We also performed seasonal and regional comparisons

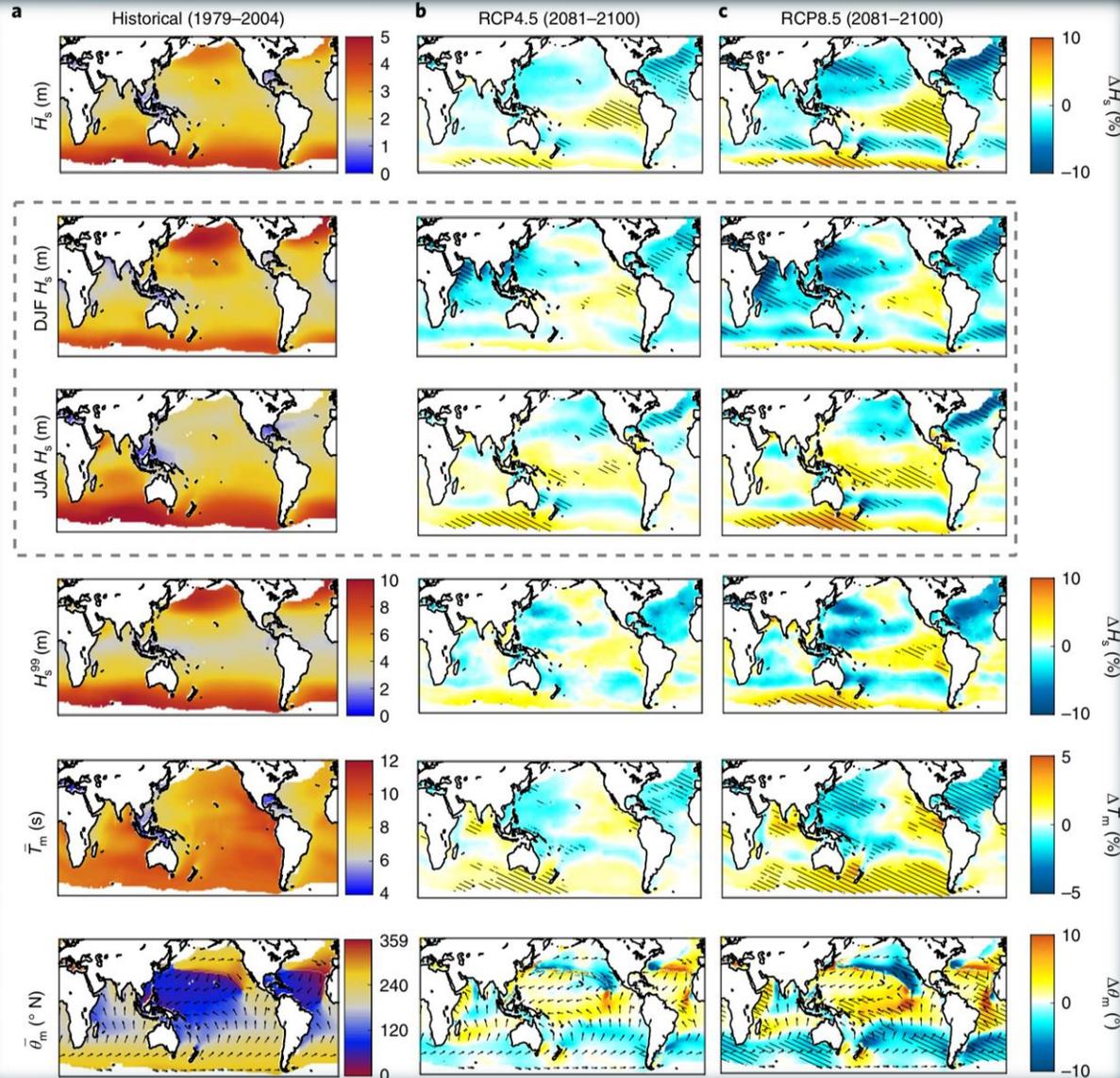
- We also performed comparison against wave reanalysis (wave period and direction)

Satellite source: Ribal and Young 2019, Scientific Data

# Overall, members cluster by wave modelling method (historical) 1981-2005



# How much change by end of 21st century?



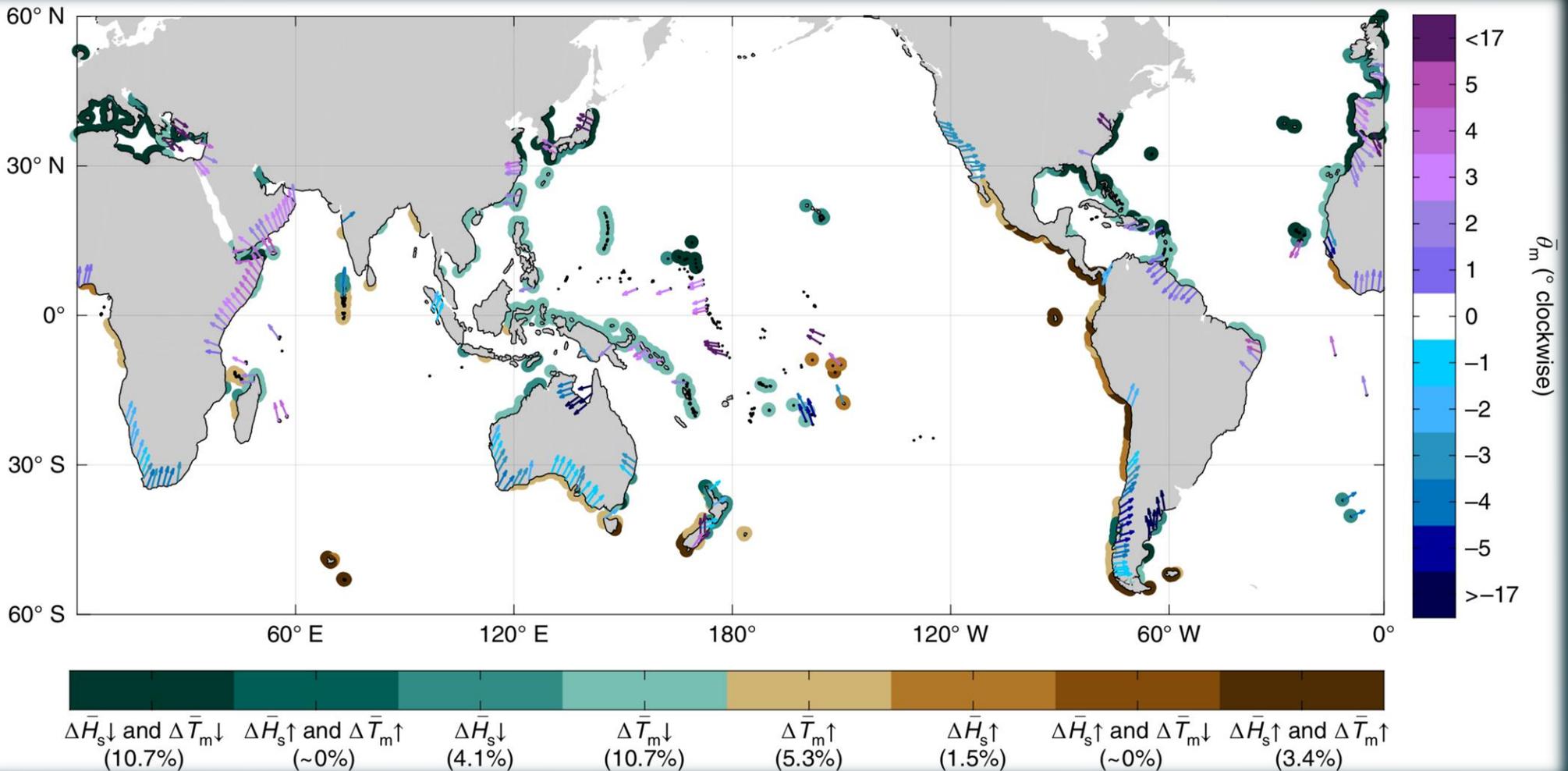
Weighted (by forcing)  
multi-member mean  
change

Robustness measure  
following IPCC (AR5) -  
considers:

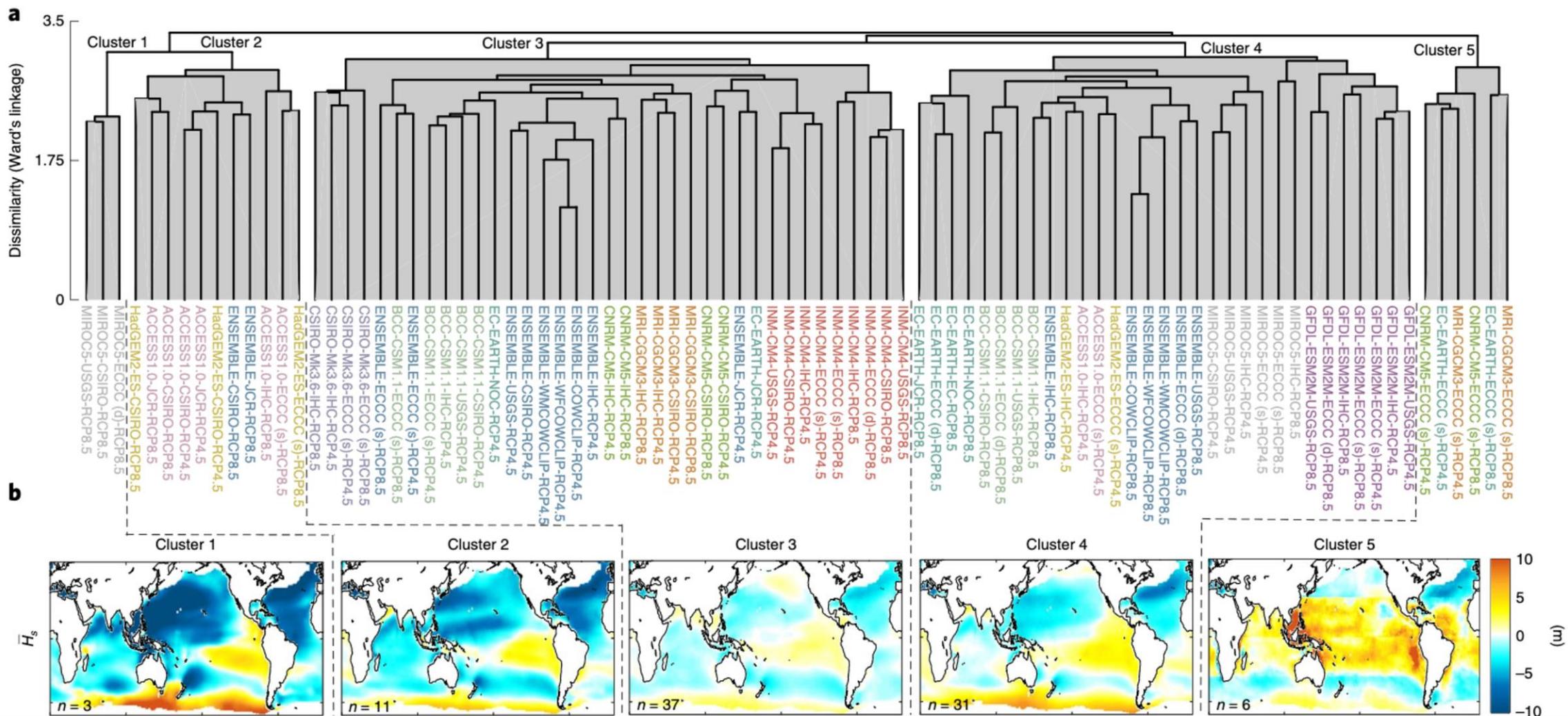
Statistical significance  
(5% level)

Agreement between  
significant members  
(90% level)

~50% of coastline exhibits robust changes in forcing wave height, wave period or direction



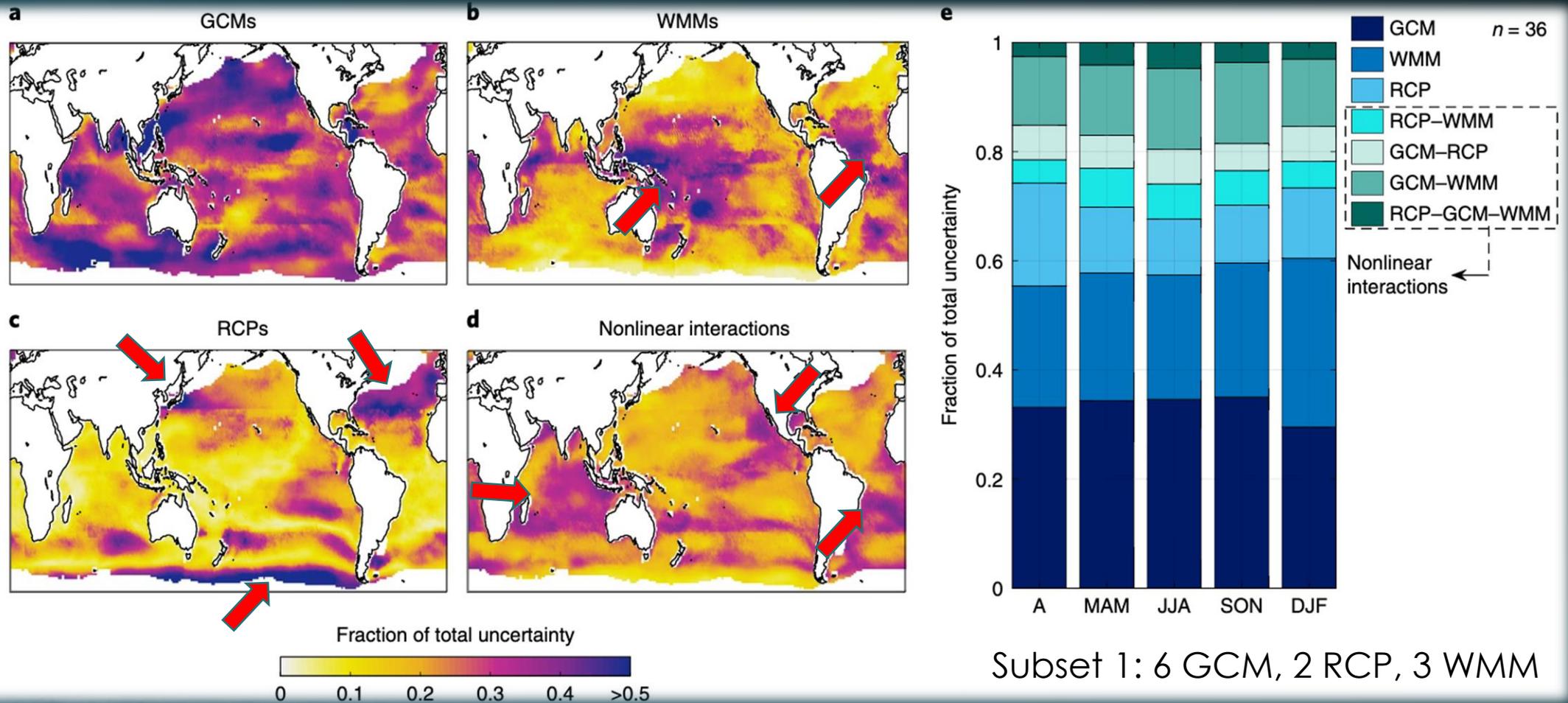
# Overall, members cluster by model forcing (climate signal) 2081-2100 relative to 1981-2004



# What contributes most to total uncertainty?

Multi-factor ANOVA-based decomposition with a subsampling scheme

**No source of uncertainty can be neglected..**





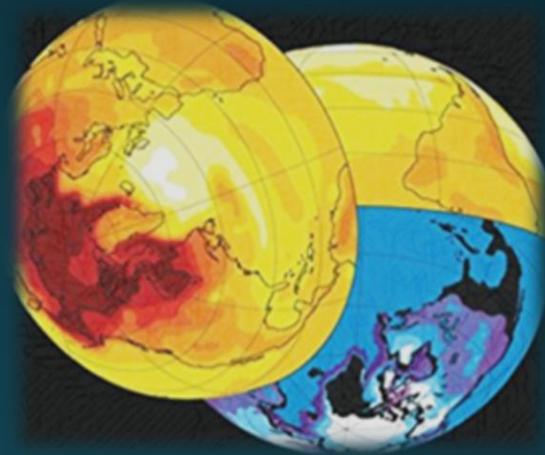
## We now know...

- 1) magnitude and robustness of wave climate signal (height, period and direction)
- 2) magnitude of uncertainty associated with global wave projections
- 3) contribution of each uncertainty to total uncertainty over globe
- 4) single-method ensembles neglect ~50% of total uncertainty

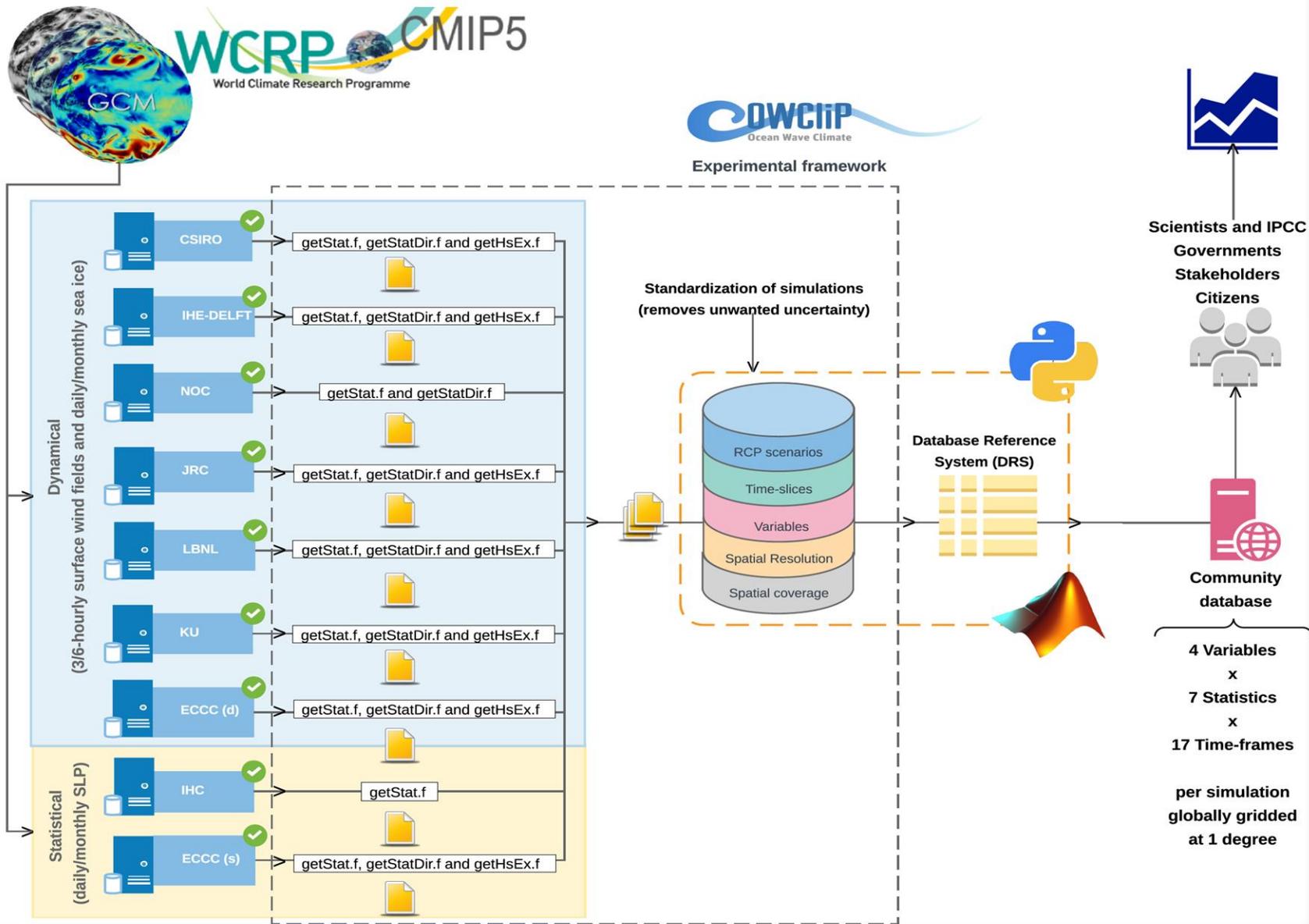
## But, we still do not know

- 1) how much uncertainty is associated to atmospheric downscaling
- 2) how morphological-driven climate changes (e.g., SLR) compare to atmospheric-driven climate changes (e.g., changes in atmospheric circulation)

## 2. COWCLIP published data



# COWCLIP Standardized data



# COWCLIP2.0 data (155 simulations available)

- 1) Globally consistent dataset at 1 degree resolution
- 2) NETCDF and Metadata compliant, and consistent with CMIP5 DRS
- 2) 3 time-frames (monthly, seasonally, annually) from original sub-daily data
- 3) 7 Statistics of wave height and period and 2 statistics of wave direction

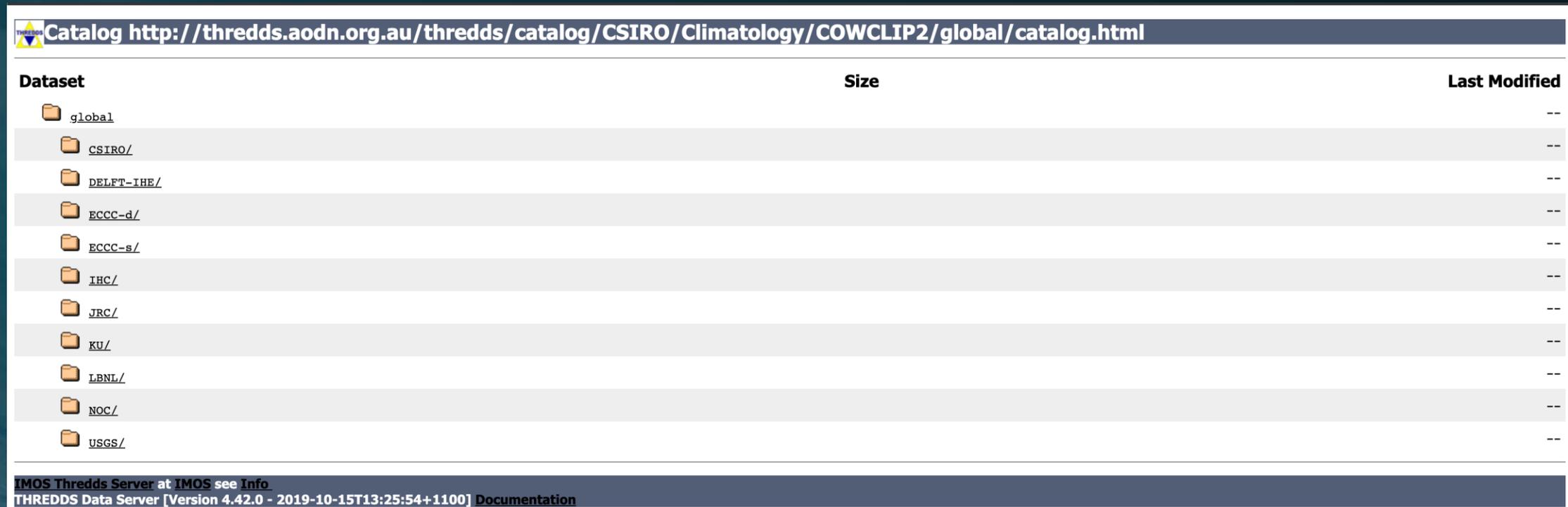
## Covering...

- 1) 2 RCP scenarios (RCP4.5 and RCP8.5)
- 2) 30 GCM forcing (ACCESS1.0, ACCESS1.3, ...)
- 3) Time-slice (1981-2004 and 2081-2100)

# COWCLIP2.0: access to data remotely

OPENDAP protocol from:

<http://thredds.aodn.org.au/thredds/catalog/CSIRO/Climatology/COWCLIP2/catalog.html>



The screenshot shows a web browser displaying a Thredds catalog page. The page title is "Catalog http://thredds.aodn.org.au/thredds/catalog/CSIRO/Climatology/COWCLIP2/global/catalog.html". Below the title is a table with three columns: "Dataset", "Size", and "Last Modified". The table lists several datasets, each with a folder icon and a name. The "Last Modified" column contains "--" for all entries. At the bottom of the page, there is a footer with the text "IMOS Thredds Server at IMOS see Info" and "THREDDS Data Server [Version 4.42.0 - 2019-10-15T13:25:54+1100] Documentation".

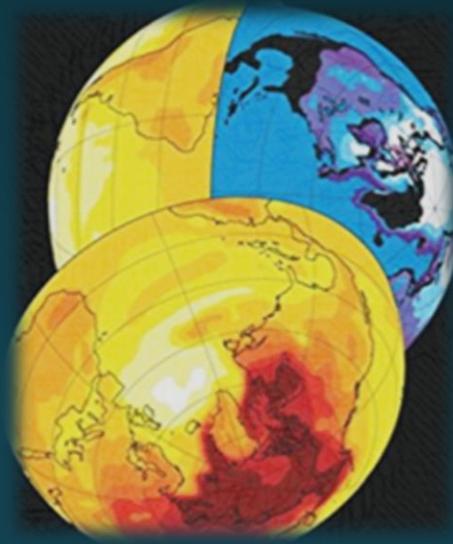
Dataset	Size	Last Modified
 global		--
 CSIRO/		--
 DELFT-IHE/		--
 ECCC-d/		--
 ECCC-s/		--
 IHC/		--
 JRC/		--
 KU/		--
 LBNL/		--
 NOC/		--
 USGS/		--

IMOS Thredds Server at IMOS see Info  
THREDDS Data Server [Version 4.42.0 - 2019-10-15T13:25:54+1100] Documentation

The data is published via the Australian Ocean Data Network (AODN)

A data descriptor has been submitted to *Scientific Data*

### 3. ongoing COWCLIP research



# What about future annual frequency of extreme wave events?

Critical to offshore infrastructure & coastal hazard assessments  
(beach recovery rate, shoreline position, wave-driven flooding)

Large waves, Nazare Portugal



- 1) Robust projections are key for coastal adaption
- 2) Accelerated sea level is continuously lowering threshold for flooding
- 2) Inter-annual extremes are historically linked to global climatological patterns
- 3) Simulations can represent high-frequency extremes better than at 'decadal-centennial' scales

# Thank you!

COWCLiP is a community effort

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## COWCLiP achievements to date

### Journal publications

- Hemer, Wang, Church and Swail, 2010. Modelling proposal: Coordinated global ocean wave projections. *BAMS*, 91 (4).
- Hemer, Wang, Weisse and Swail, 2012. Advancing wind-waves climate science. *BAMS*, 93(6).
- Cavaleri, Fox-Kemper and Hemer, 2012, Wind waves in the coupled climate system. *BAMS*, 93 (11). (Combined community paper with WISE and WGCM)
- Hemer, Fan, Mori, Semedo and Wang, 2013, Projected changes in wave climate from a multi-model ensemble. *Nature Climate Change*, 3 (5)
- Morim, Hemer, Cartwright, Strauss and Andutta, 2018. On the concordance of 21<sup>st</sup> Century wind-wave projections. *Glob. Planetary Change*, 167.
- Morim et al., 2019. Robustness and uncertainties in global multivariate wind wave climate. *Nature Climate Change*, 9 (9).

### Meetings / Technical Reports

- First COWCLiP workshop, Geneva, 2011. JCOMM Tech Report 55.
- Informal COWCLiP meeting, Hawaii, 2011. Alongside Wave Workshop.
- Second COWCLiP review meeting, Banff, Nov 2013. JCOMM Tech Report 76.
- Third COWCLiP workshop, Paris, Oct 2014. JCOMM Tech Report 82.
- Fourth COWCLiP workshop, Paris, Sep 2015. JCOMM Tech Report 88
- Fifth COWCLiP meeting, Vienna April 2016. JCOMM Tech Report 89
- Sixth COWCLiP meeting, Liverpool UK, September 16, 2017.
- Seventh COWCLiP meeting, Paris, May 2018. JCOMM Tech Report 92
- **Eighth COWCLiP meeting, Melbourne, Nov 2019.**



### Other Outputs / Impacts

- 2011: Inclusion of COWCLiP into inter-sessional work-plan of JCOMM
- 2013: Open availability of global wave climate projections via web (COWCLiP wiki)
- 2013: High uptake of COWCLiP outcomes into IPCC WG-1 AR5, Chapter 13 (Sea-Level Change)
- 2017: COWCLiP website <http://www.cowclip.org>
- 2019: Cover Story Nature Climate Change, Sep Issue.
- 2019: The Conversation article.
- 2019: High uptake of COWCLiP outcomes into IPCC SROCC and AR6 WG-1 Drafts
- 2019: Open data publication of COWCLiP global projections database

# Thank you!



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nature  
climate change

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[www.nature.com/natureclimatechange](http://www.nature.com/natureclimatechange)

Wave climate projections



**COLD MID-LATITUDE WINTERS**  
Driven by atmospheric circulation

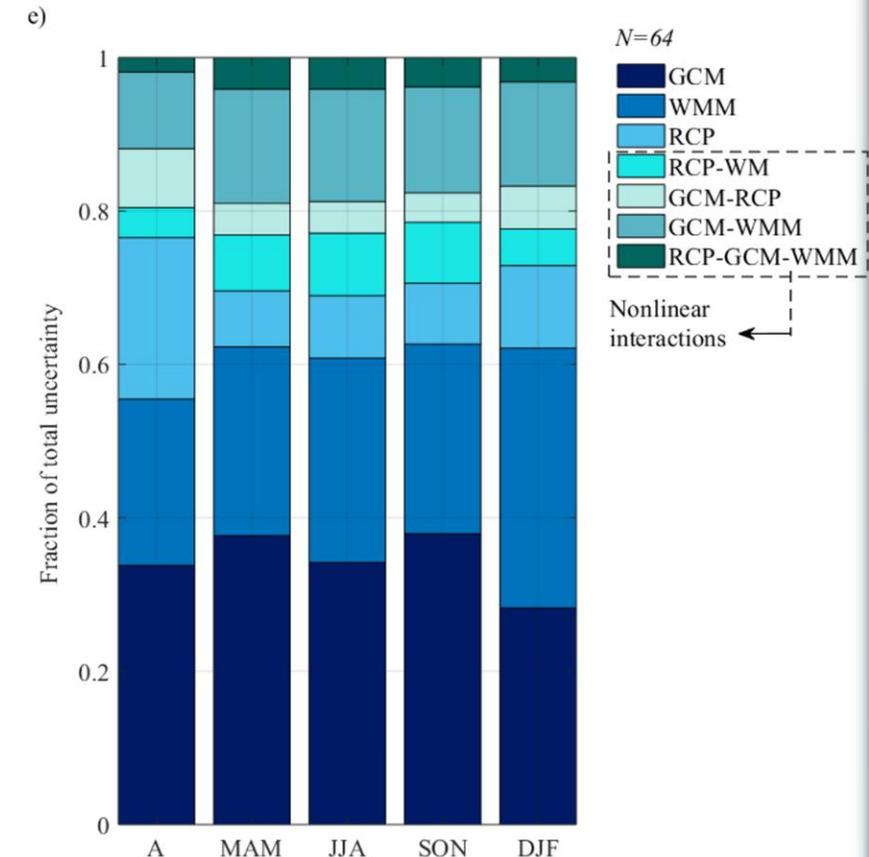
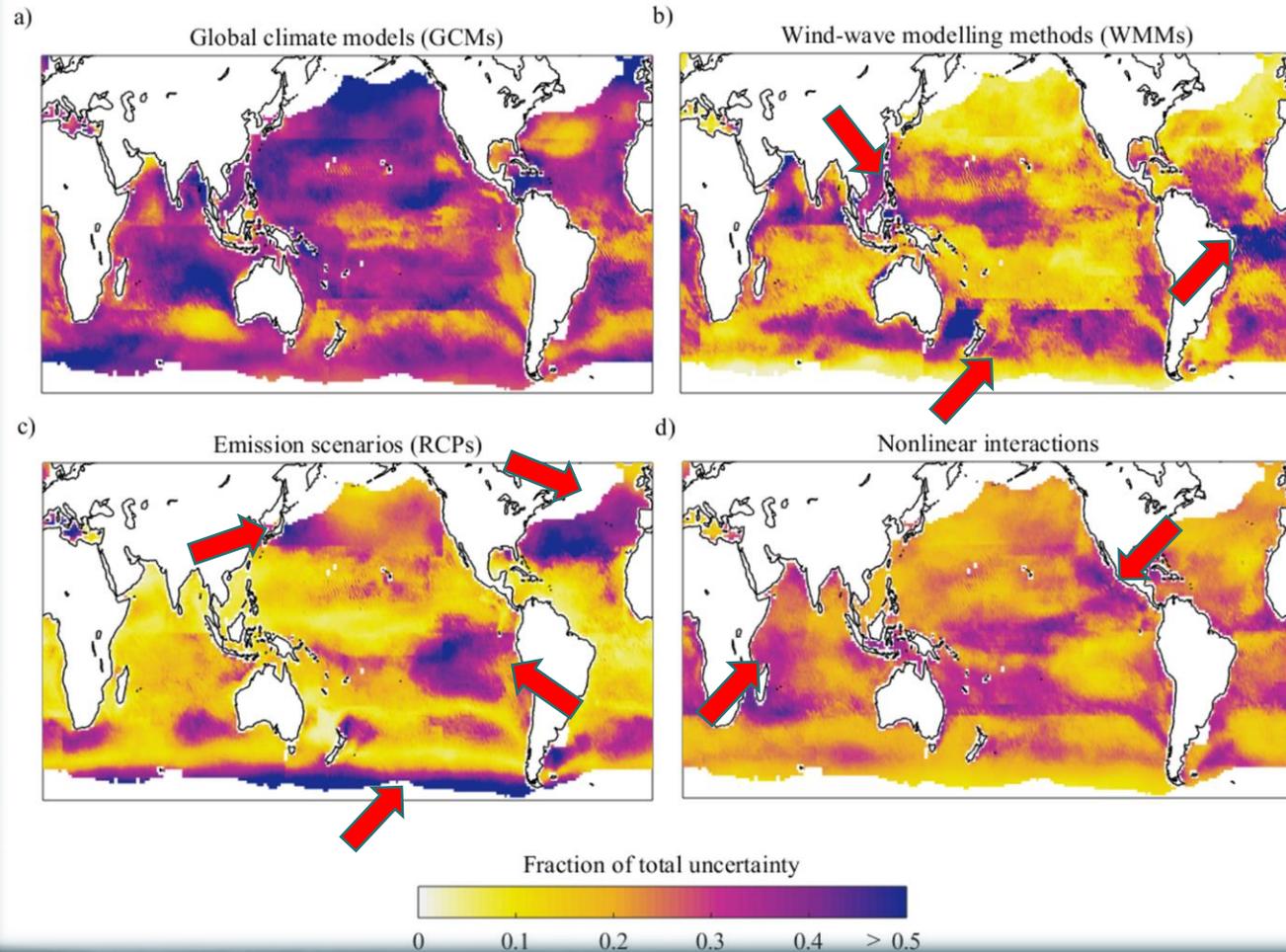
**MITIGATION OPPORTUNITY**  
Improving power transmissions

**CO<sub>2</sub> FERTILIZATION**  
The role of nutrients

# What contributes most to total uncertainty?

Multi-factor ANOVA-based decomposition with a subsampling scheme

**No source of uncertainty can be neglected...**



Subset 3: 16 GCM, 2 RCP, 2 WMM