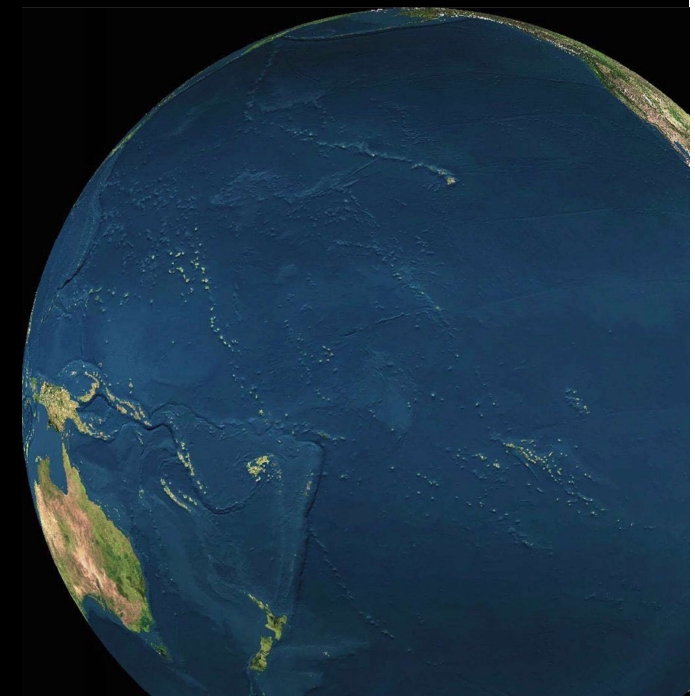


# Marine heatwaves and compound events: Attribution and future changes

**Thomas Frölicher**

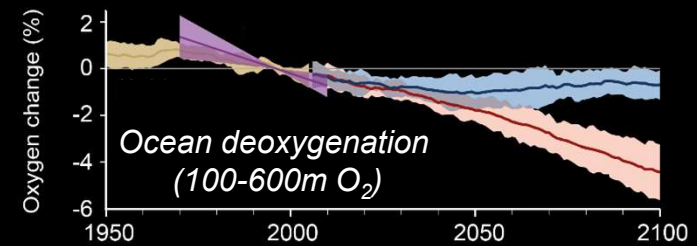
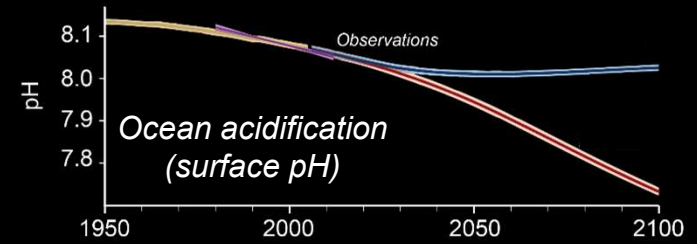
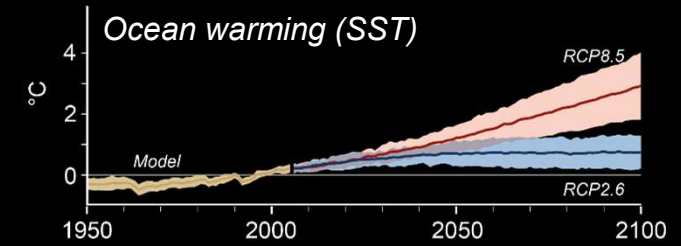
Climate and Environmental Physics  
Oeschger Centre for Climate Change Research  
University of Bern



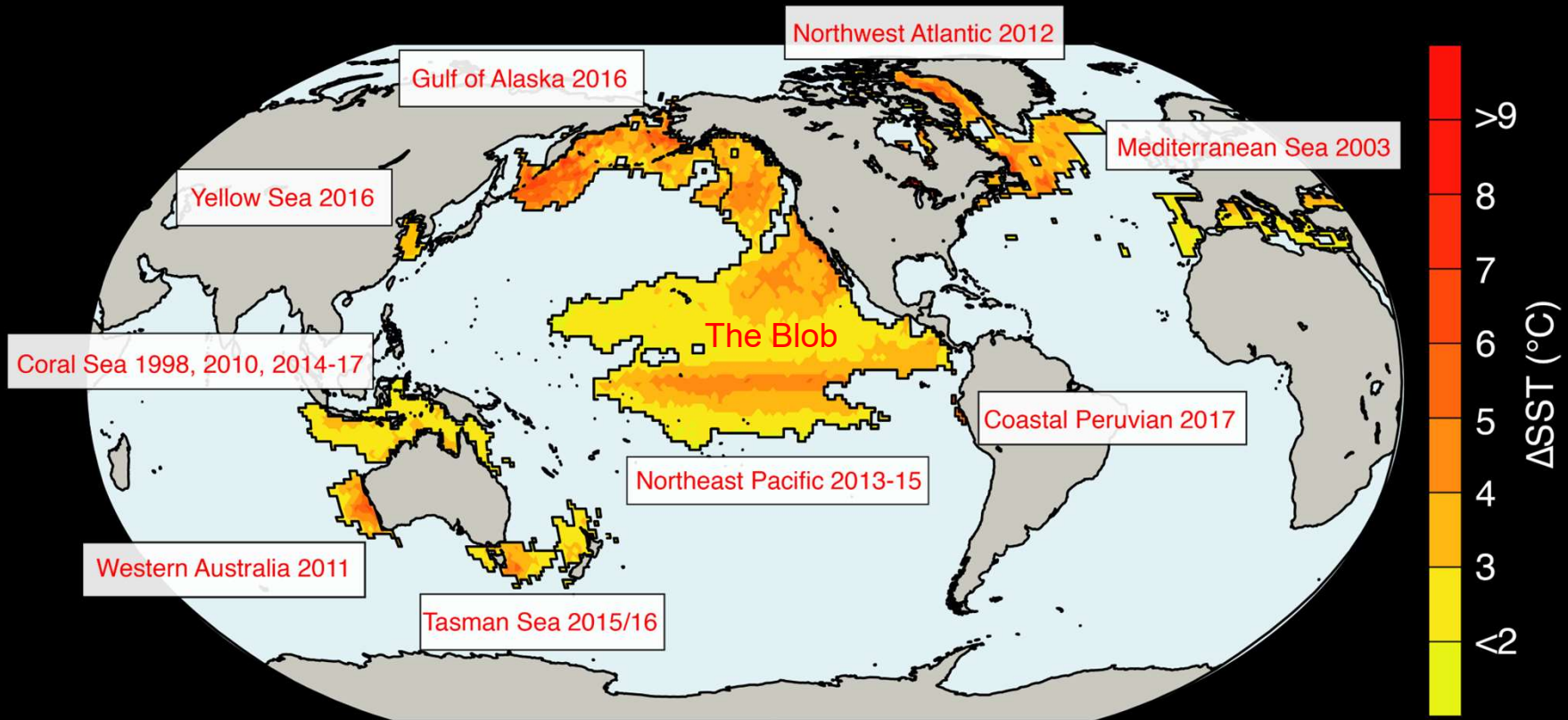
Taking up heat

Taking up carbon

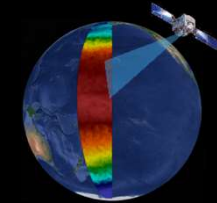
Providing food and other services



## Prominent marine heatwaves over the last two decades

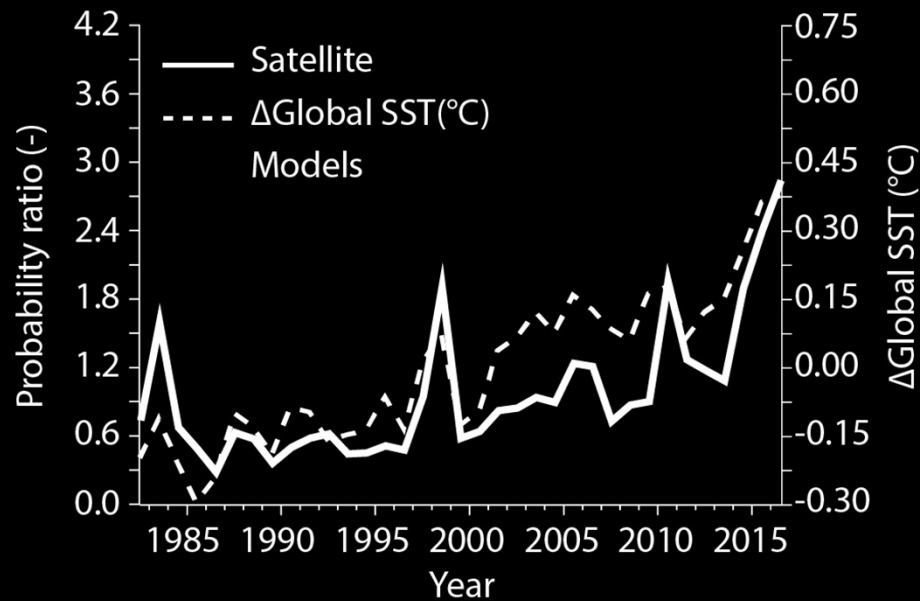


# Marine heatwaves days have doubled over the satellite period



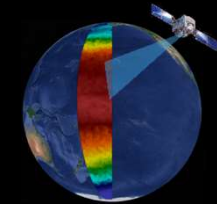
Definition MHW: 99 Percentile of 1982-2016 baseline period

$$\text{Probability ratio} = \frac{p(t)}{p(1982-2016)}$$



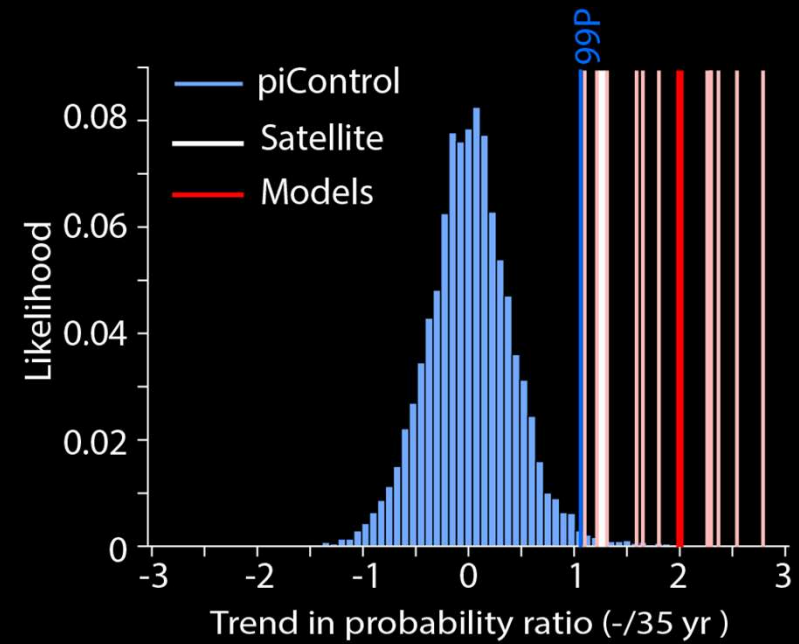
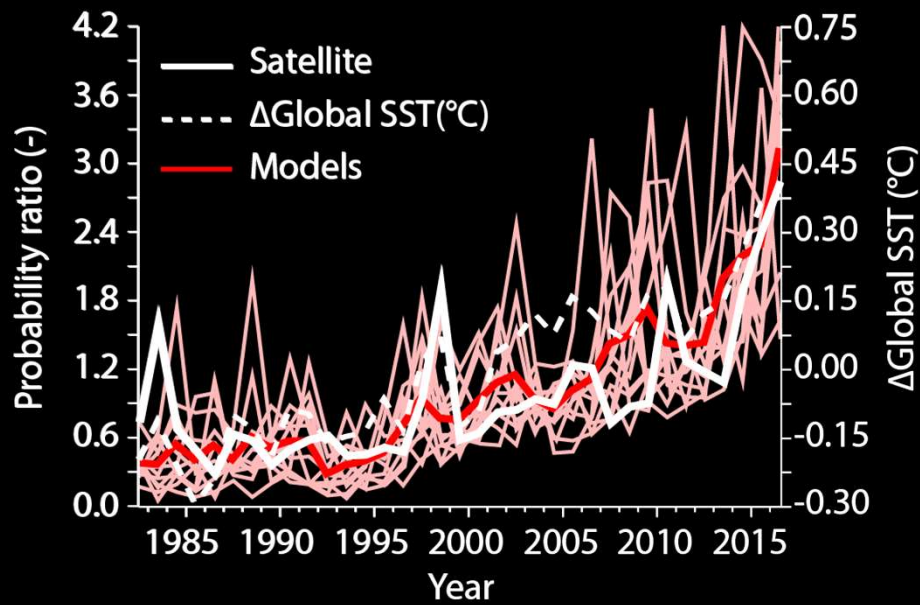
- Global SST has increased by  $\sim 0.4^{\circ}\text{C}$
- The frequency of marine heatwaves has doubled between 1982 to 2016
- The duration, extent and intensity of marine heatwaves has also increased

# Trend is outside the range expected from internal variability



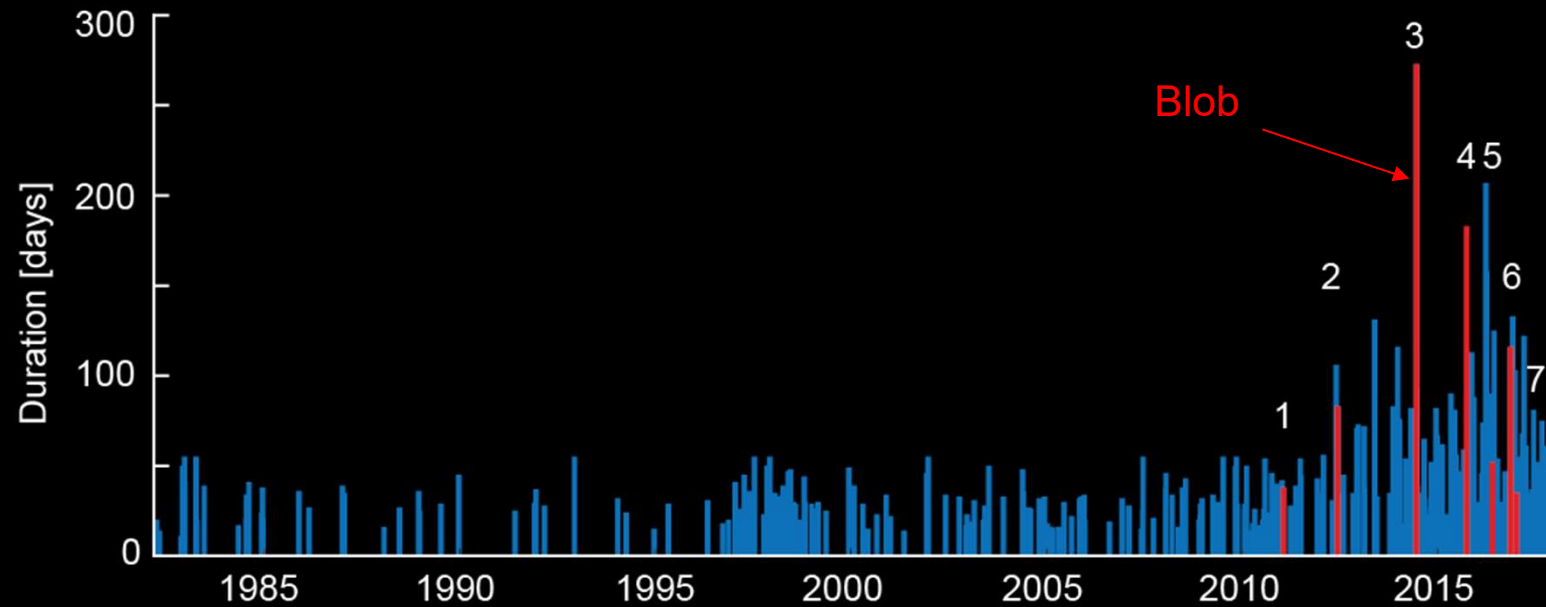
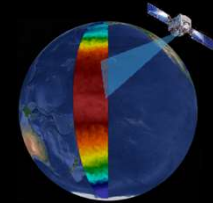
Definition MHW: 99 Percentile of 1982-2016 baseline period

$$\text{Probability ratio} = \frac{p(t)}{p(1982-2016)}$$



# Marine heatwaves over the satellite period

Comparison of 300 largest marine heatwaves



- 1981-1990: 27 large MHWs; 32 days and 4.8°C
- 2008-2017: 172 large MHWs; 48 days and 5.5°C

## Outline

### 1. Past trends in marine heatwave frequency

*Q: have marine heatwaves changes over the historical period?*

### 2. Attribution of marine heatwaves

*Q: has anthropogenic warming changed the odds of marine heatwaves?*

### 3. Future changes in marine heatwaves

*Q: what can we expect in the future?*

### 4. Future changes in ocean biogeochemical extremes and compound events

*Q: have we overlooked a potential serious problem?*

# Extreme event attribution is a rapidly growing field

- 10 years ago: 'no individual extreme event can be attributed to climate change'
- Today: 'we can calculate the influence of climate change on some types of specific extreme events'
- Near-real time attribution of events by World Weather Attribution



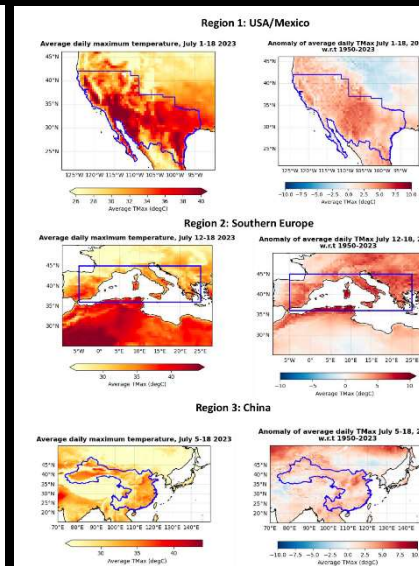
world weather attribution

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Extreme heat in North America, Europe and China in July 2023 made much more likely by climate change

Following a record hot June, large areas of the US and Mexico, Southern Europe and China experienced extreme heat in July 2023, breaking many local high temperature records.



<https://www.worldweatherattribution.org>

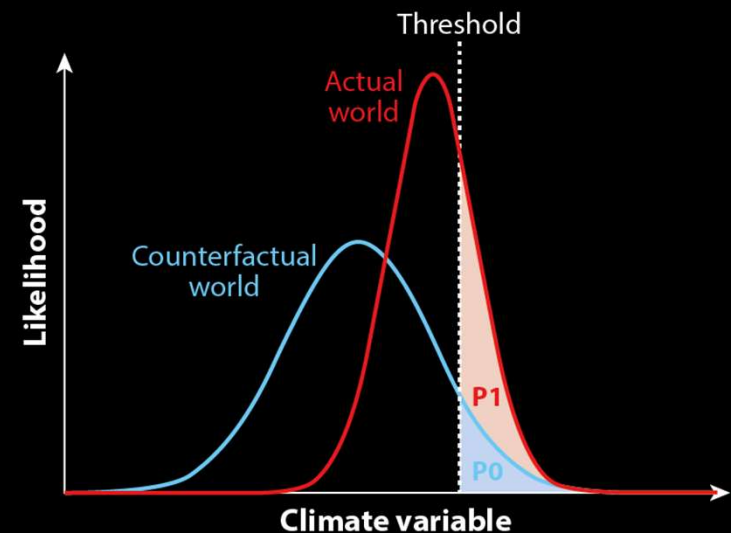


## Different methods exist

There are many methodologies for extreme event attribution analysis. First method was pioneered in 2003/2004 by Allen (2003) and Stott et al. (2004)

### 1. Probability-based approach

- Probability of the event in the present-day climate,  $p_1$
- Probability of the event in past climate/counterfactual climate without anthropogenic influences,  $p_0$
- Probability ratio:  $PR = p_1/p_0$
- Fraction of Attributable Risk:  $FAR = 1 - p_0/p_1$



### 2. Storyline approach (e.g., Shepherd 2016)

## Probability-based approach: Eight step procedure (Philip et al. 2020, Oldenborgh et al. 2021)

Step 1: Analysis trigger: which events do we attribute?

Step 2: Event definition: how do we define the event quantitatively?

Step 3: Observed probability and trend

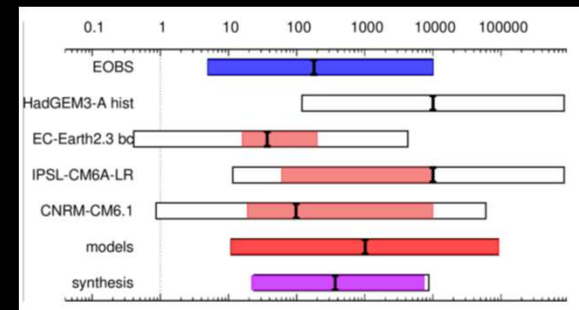
Step 4: Model evaluation

Step 5: Multi-method multi-model attribution (step originally proposed by Allen 2003)

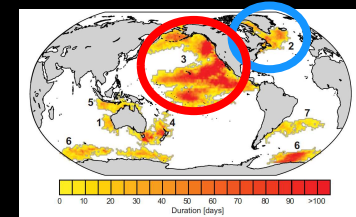
Step 6: Hazard synthesis: synthesis of different results into a single attribution statement

Step 7: Vulnerability and exposure analysis: Risk depends on hazard, exposure and vulnerability

Step 8: Communication: likelihood increased, decreased, not changed, unable to determine



# Most impactful heatwaves became more than 20-fold more likely due to human-induced global warming



Heatwave number	Time and location	Intensity (°C)	FAR intensity	Duration (days)	FAR duration
1	Western Australian 2011	2.26	–	101	0.79 [–0.55, 0.97]
2	Northwest Atlantic 2012	2.15	0.97 [0.92, 0.99]	57	0.96 [0.94, 0.97]
3	Northeast Pacific 2013 to 2015	1.56	1.0 [0.97, 1.0]	357	1.0 [0.99, 1.0]
4	Tasman Sea 2015 and 2016	1.49	0.98 [0.92, 0.99]	175	1.0 [0.49, 1.0]
5	Indo-Australian Basin 2016	1.67	1.0 [0.77, 1.0]	90	–
6	Southern Ocean 2016*	1.0	0.03 [–2.71, 0.74]	183	–0.6 [–2.6, 0.26]
7	Southwest Atlantic 2017	1.96	1.0 [0.74, 1.0]	82	1.0 [0.91, 1.0]

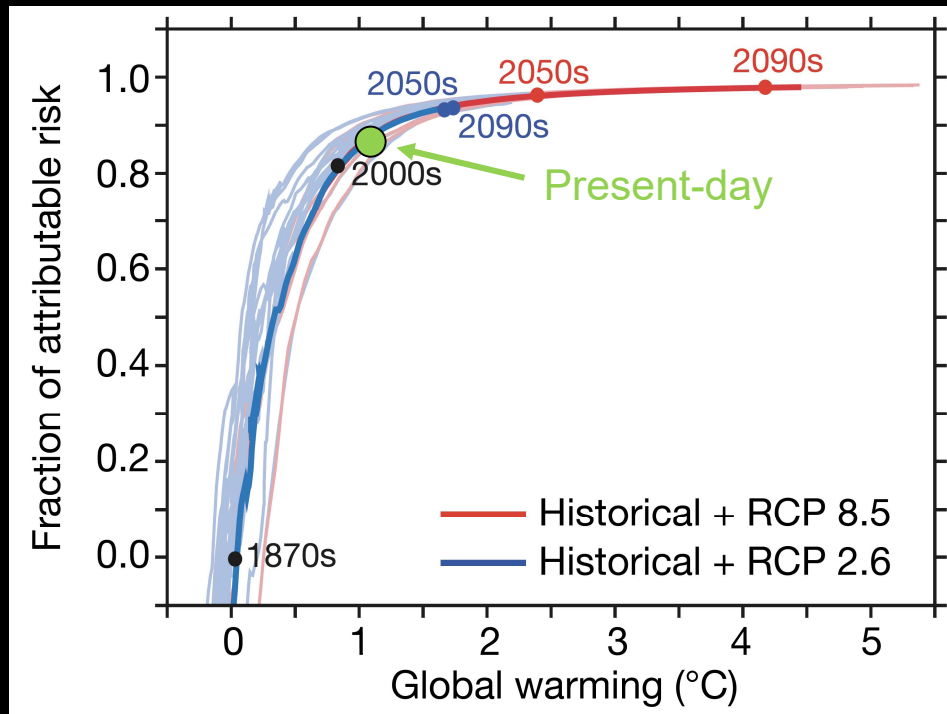
## Northwest Atlantic 2012 marine heatwave

- 2.15°C → 33x more likely by 1982-2017 than preindustrial
- 57 days → 25x more likely by 1982-2017 than preindustrial

## Northeast Pacific 2013-2015 marine heatwave ('Blob')

- 1.56°C → only possible due to climate change
- 357 days → only possible due to climate change

## Most of today's marine heatwaves are attributable to global warming

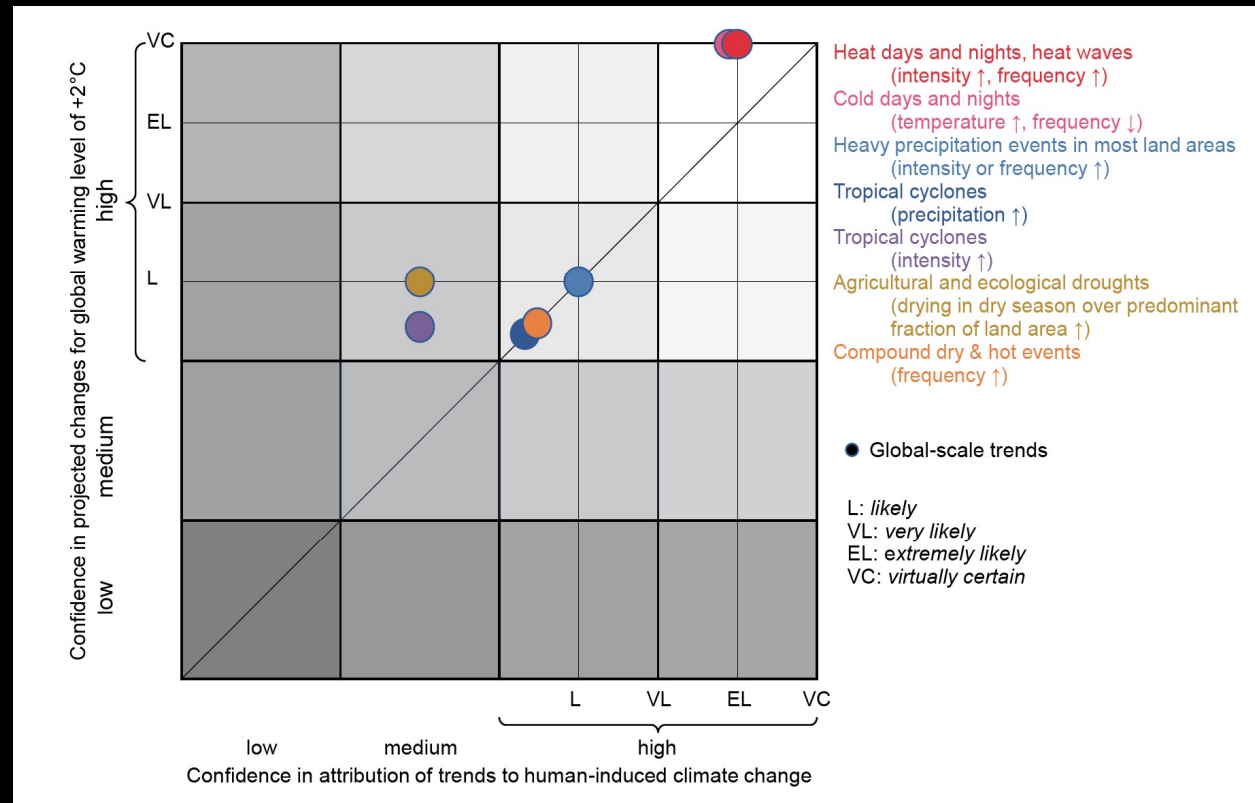


It is very likely that between 84-90% of marine heatwaves that occurred between 2006 and 2015 are attributable to the anthropogenic temperature increase

# Not all types of extreme weather events are attributable with confidence

high confidence: e.g., heat and cold events

low confidence: e.g., tornadoes, wildfires, hail



## Outline

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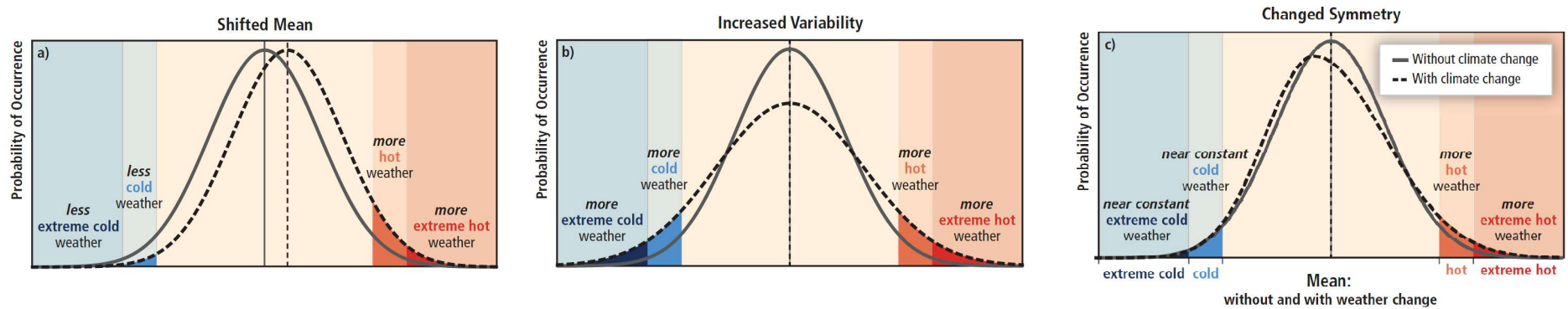
### 3. Future changes in marine heatwaves

*Q: what can we expect in the future?*

### 4. Future changes in ocean biogeochemical extremes and compound events

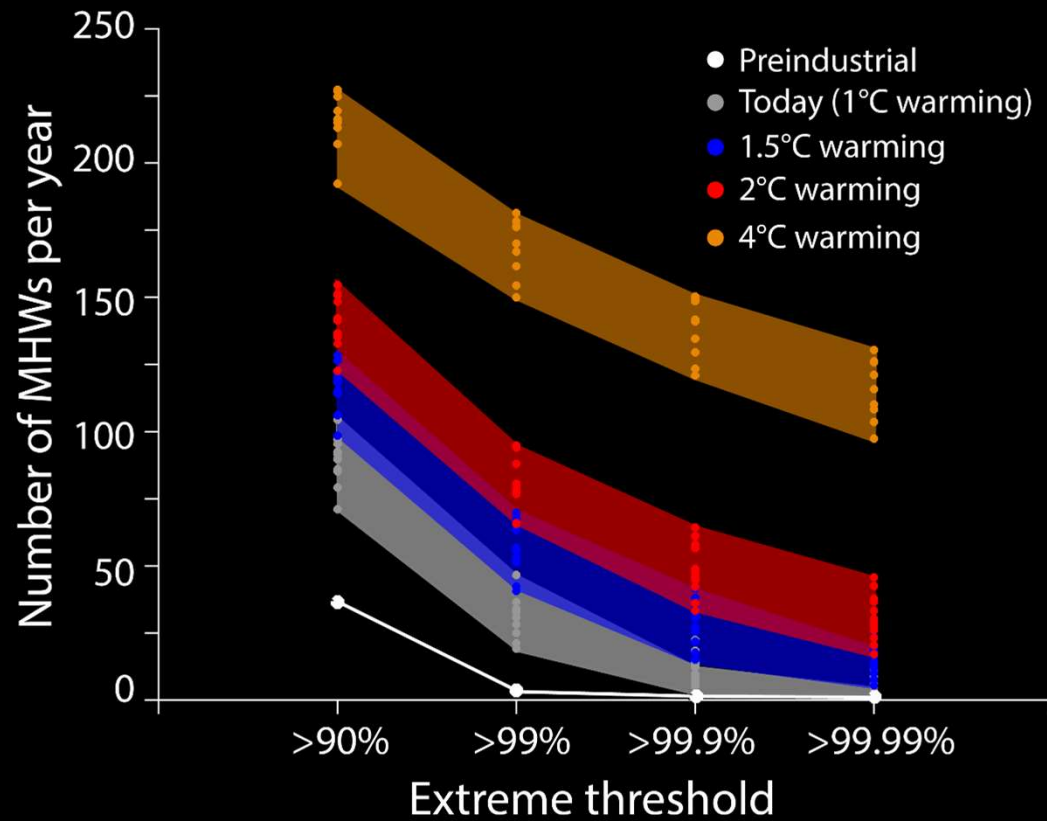
*Q: have we overlooked a potential serious problem?*

# The effect of changes in temperature distribution on extremes



# Simulated changes in number of marine heatwave days per year

Definition MHW: 99 Percentile of piControl



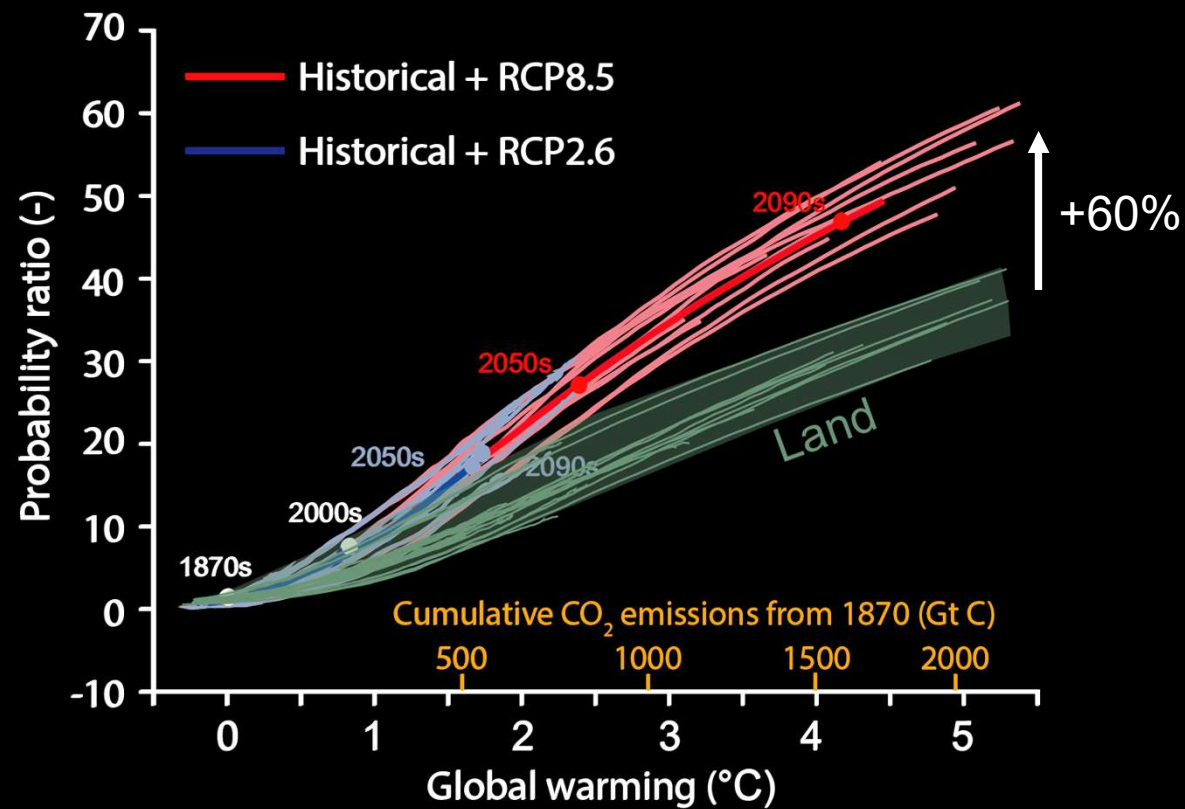
	>99%	>99.99%
Preindustrial	1 in 100 day	1 in 27 year
1°C warming	1 in 11 day	1 in 71 day
3.5°C warming	1 in 2 day	1 in 4 day



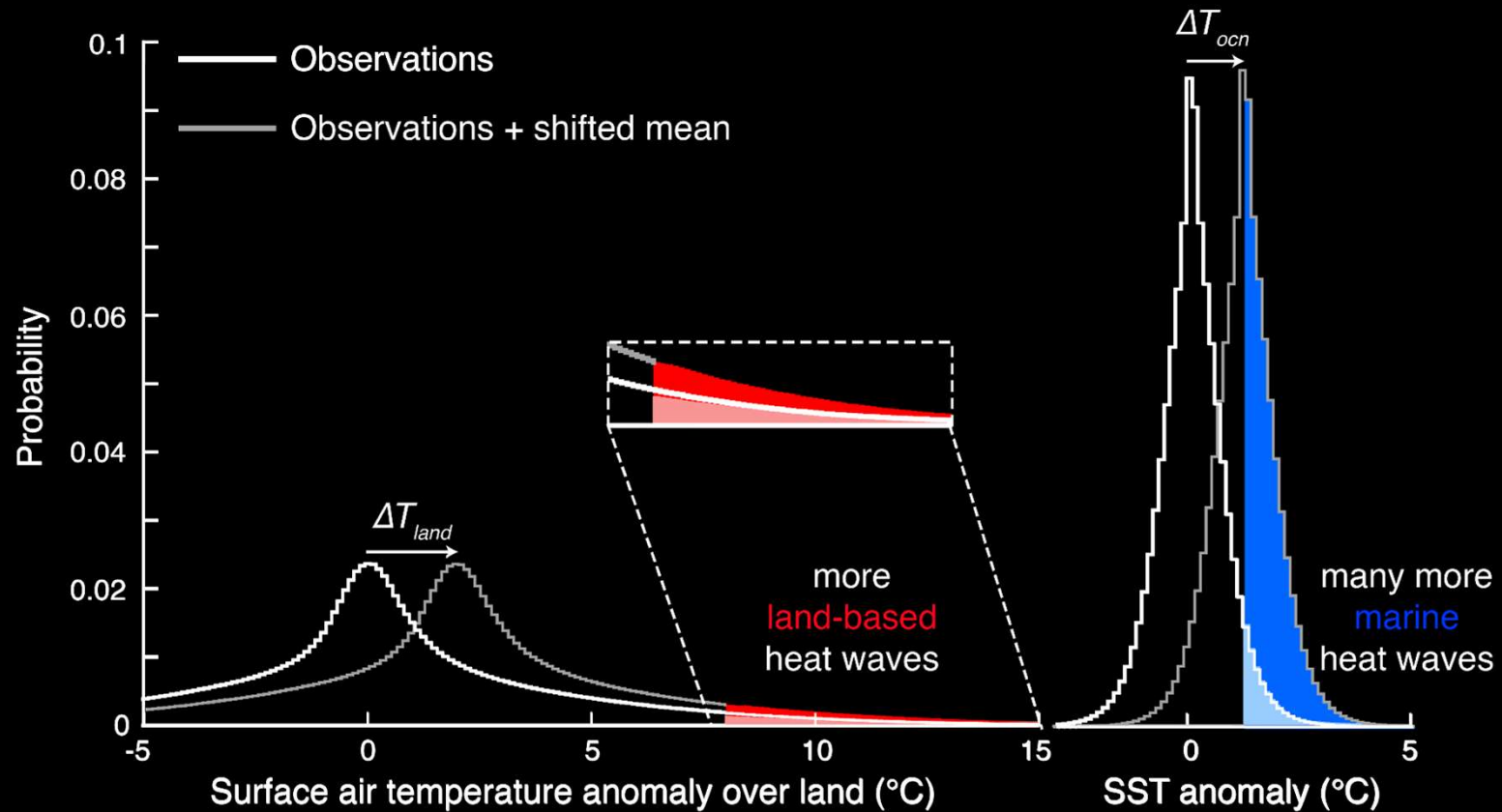
# Strong increase in marine heatwave frequency with further global warming

Definition MHW: 99 Percentile of  $\pi_{Control}$

$$\text{Probability ratio} = \frac{P_1}{P_0}$$

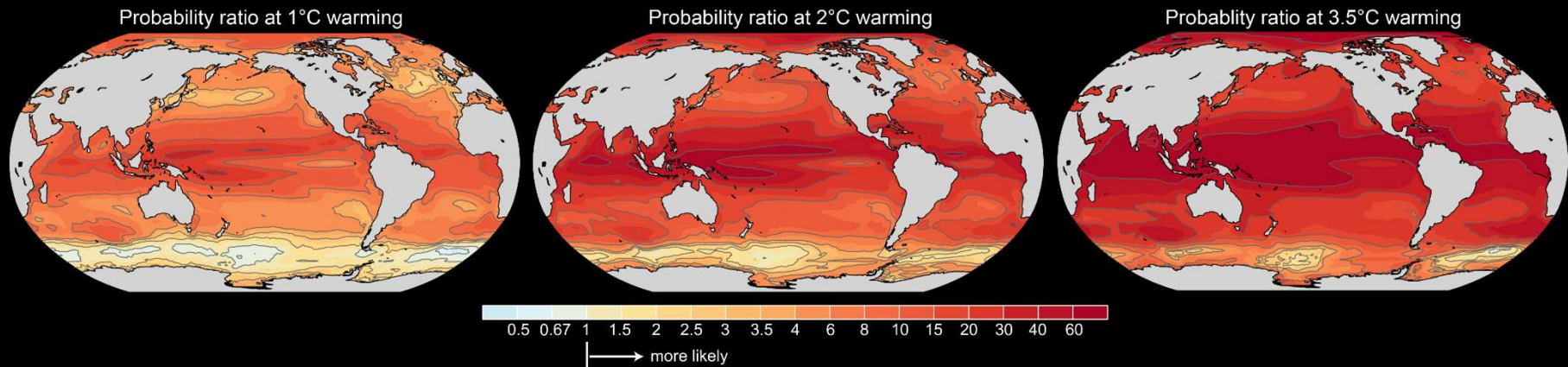


## Marine heatwaves versus terrestrial heatwaves



# Largest increase in probability of MHWs in tropical and Arctic Ocean

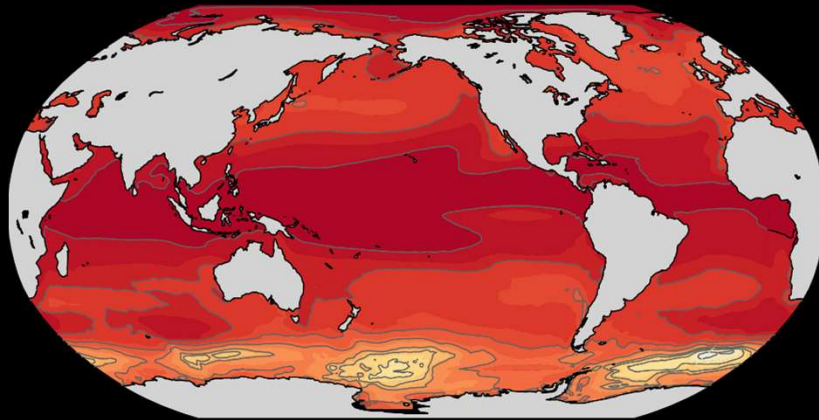
Definition MHW: 99 Percentile of  $p_{iControl}$



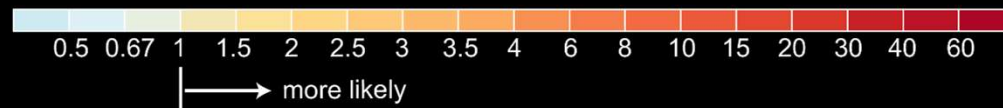
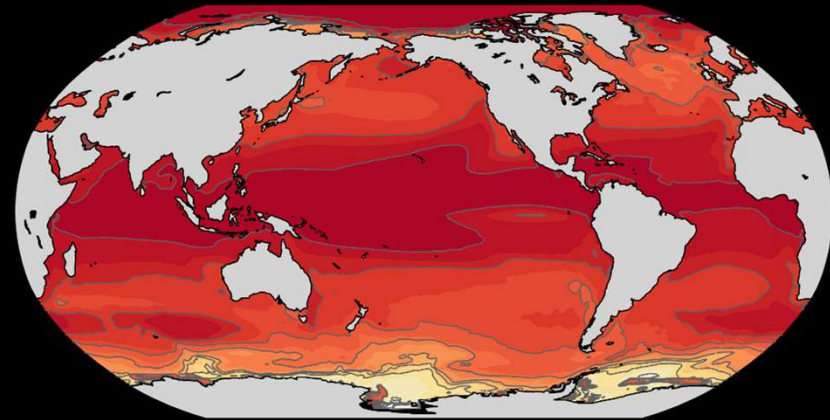
- Largest increase in MHW frequency in Arctic and tropical ocean. Small changes in Southern Ocean.

## Changes in MHW frequency can be explained by global ocean warming

PR at 3.5°C warming



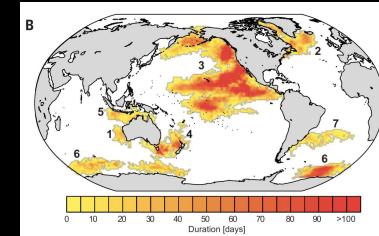
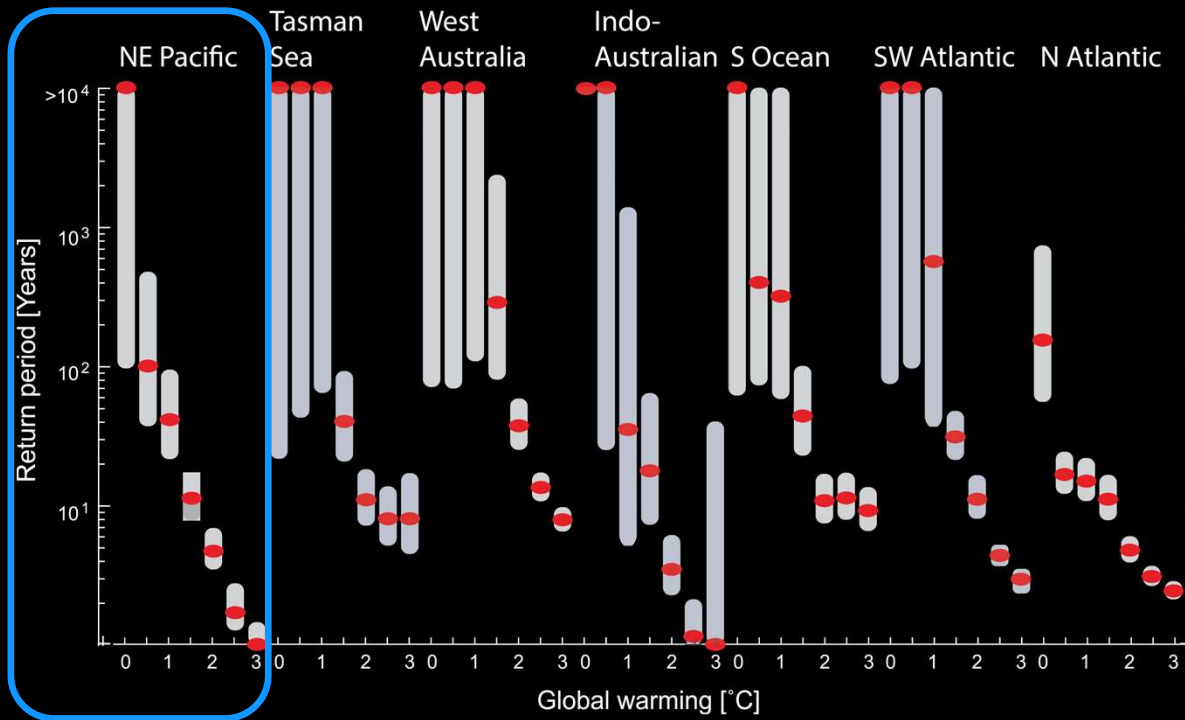
Estimated PR by shifting preindustrial control by local annual warming consistent with 3.5°C



→ See also talk by Clara Deser

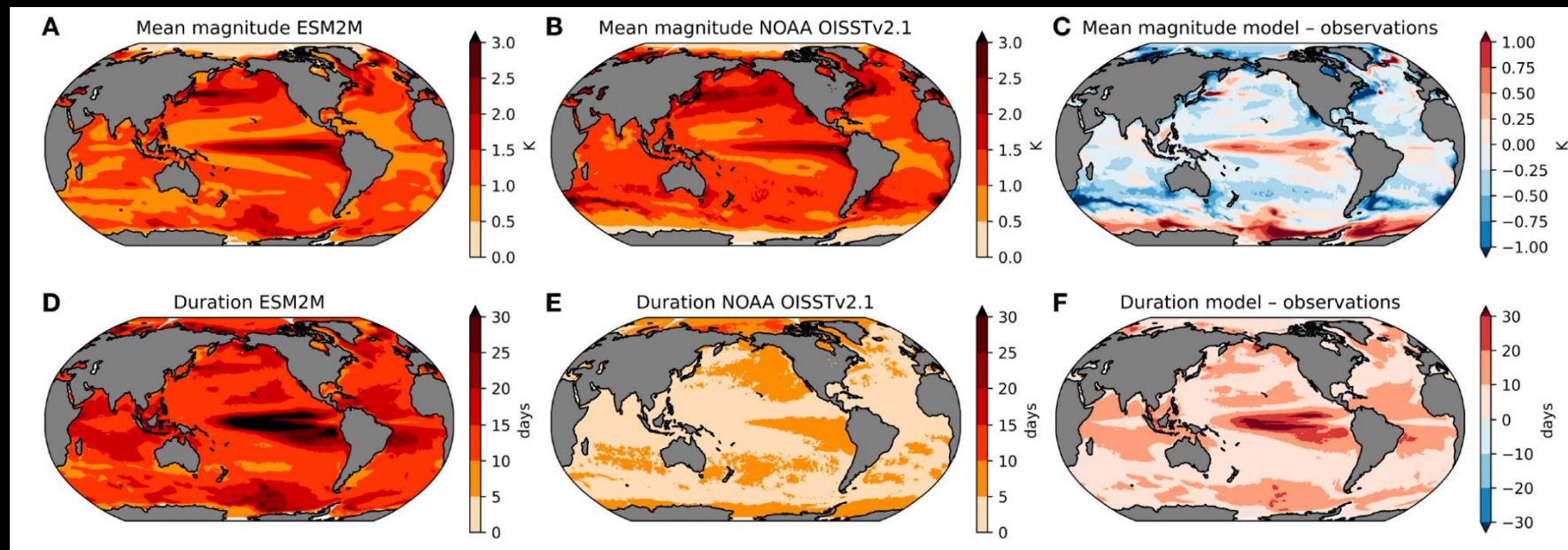
# Many rare marine heatwave events will become decadal to annual events

## The Blob



Marine heatwaves that typically occurred once in hundreds to thousands of years in preindustrial times, likely occur on an annual to decadal basis if global temperature rises by 3°C

# Are CMIP-type Earth system models fit for purpose?



## Outline

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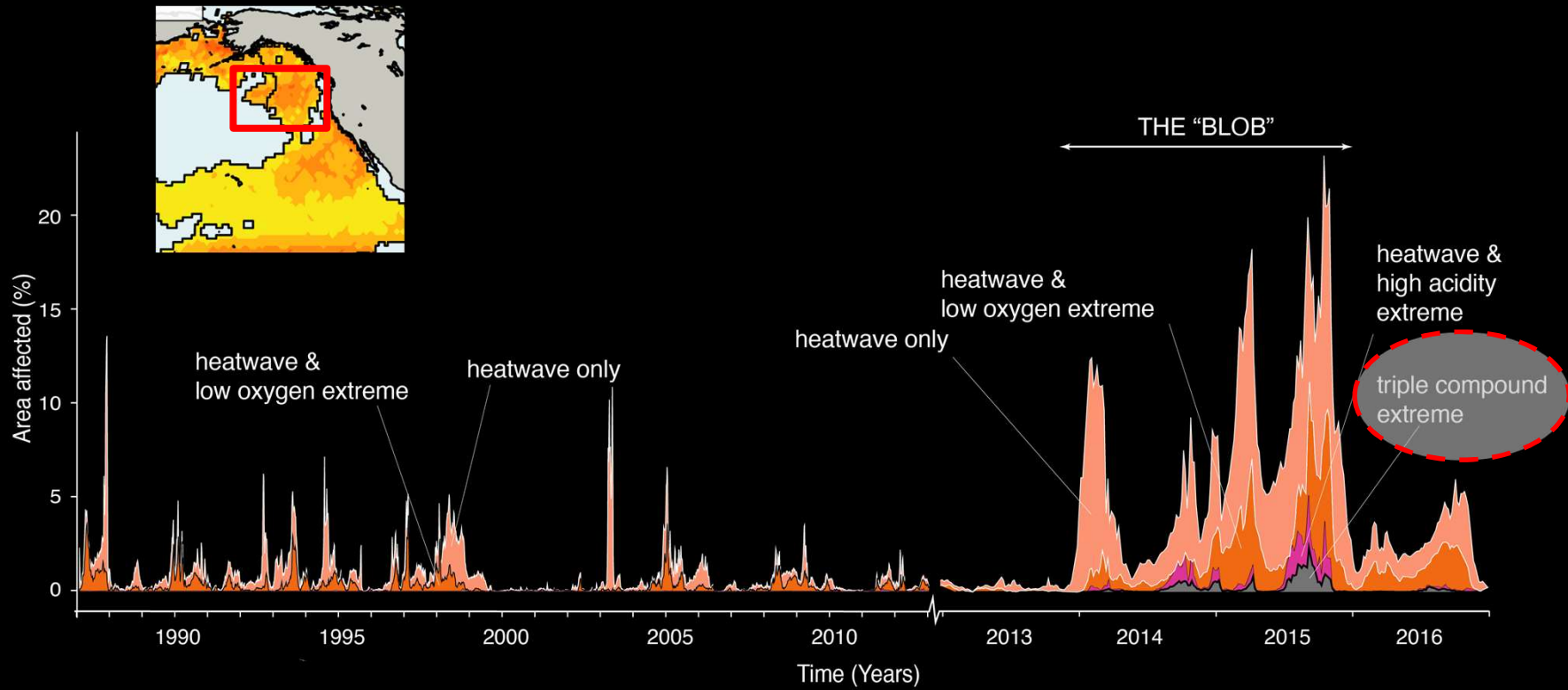
### 3. Future changes in marine heatwaves

*Q: what can we expect in the future?*

### 4. Future changes in ocean biogeochemical extremes and compound events

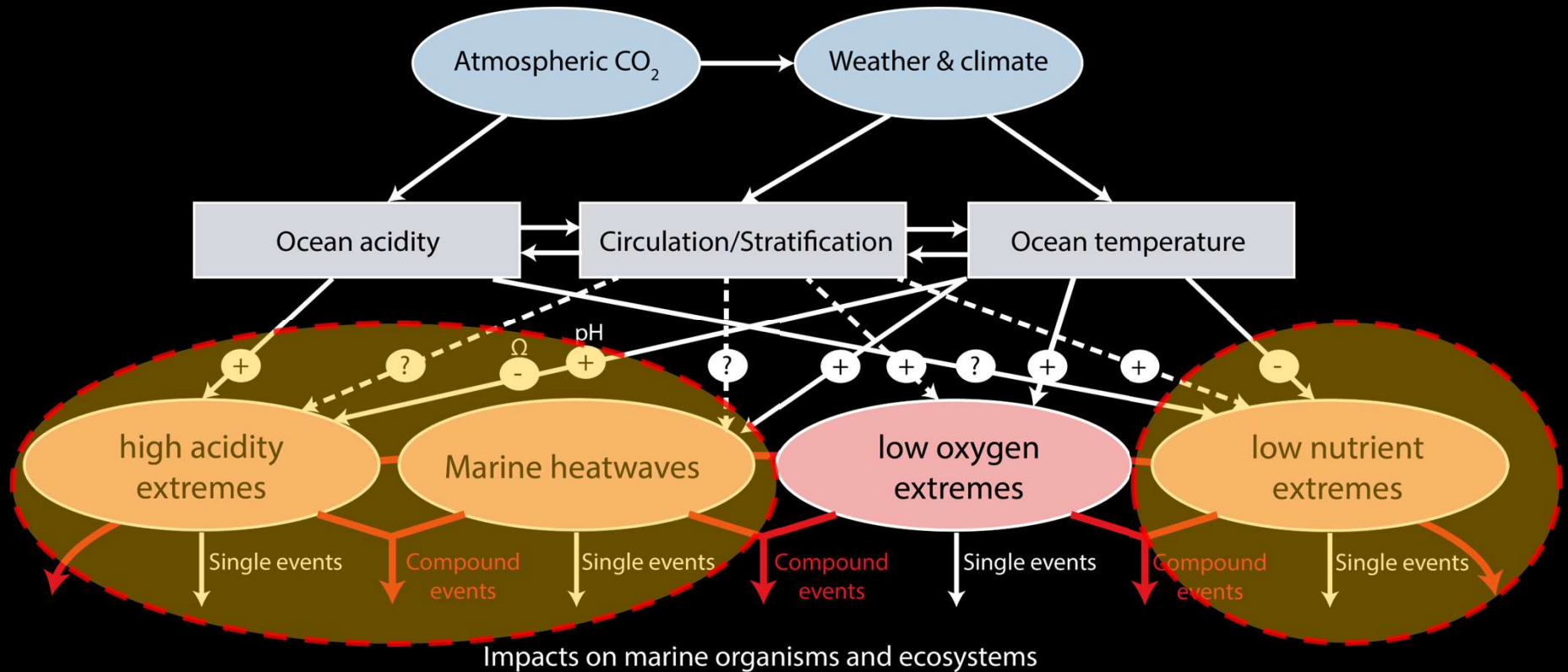
*Q: have we overlooked a potential serious problem?*

# Compound events in the ocean are a new phenomena





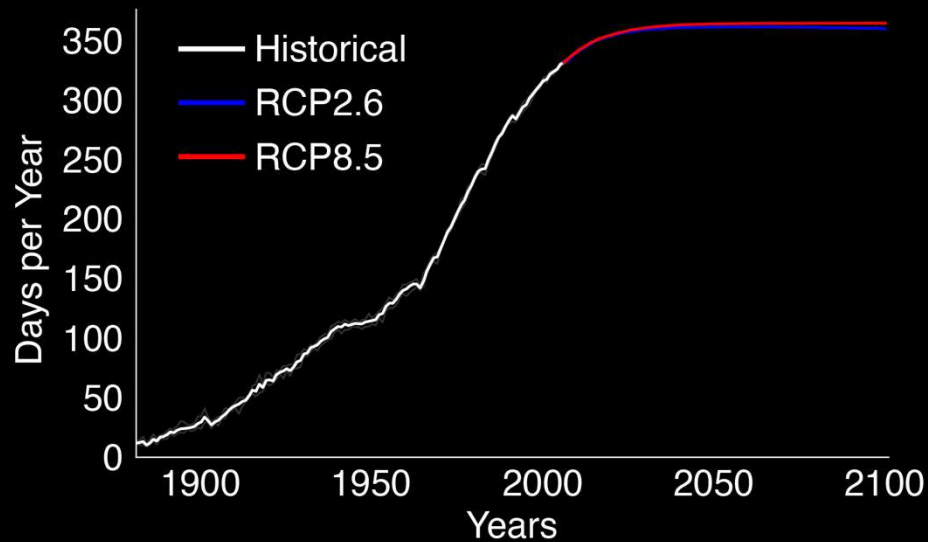
# From marine heatwaves to compound events



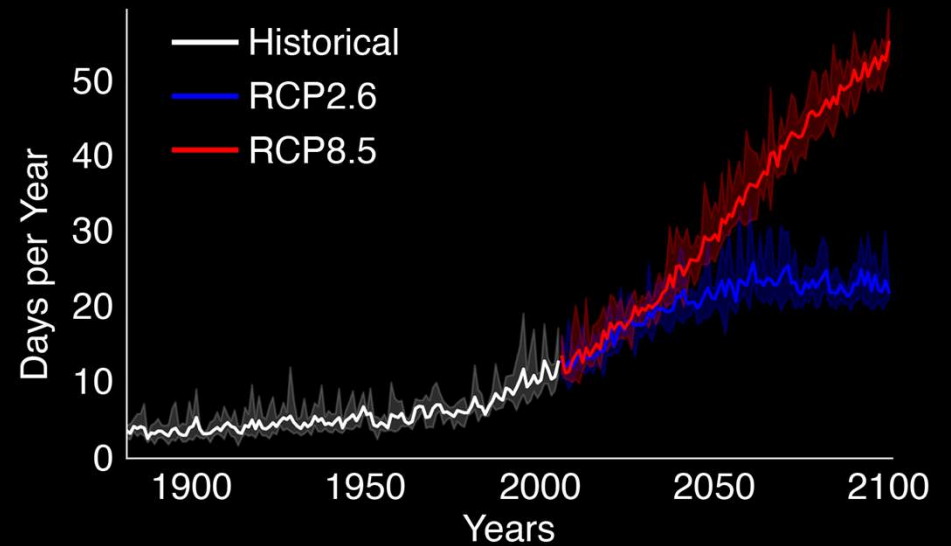
# Large increase in the number of surface ocean acidity ( $[H^+]$ ) extreme days

Results from GFDL ESM2M-LE; Definition  $[H^+]$  extreme: 99 Percentile

Total changes  
(fixed preindustrial baseline)



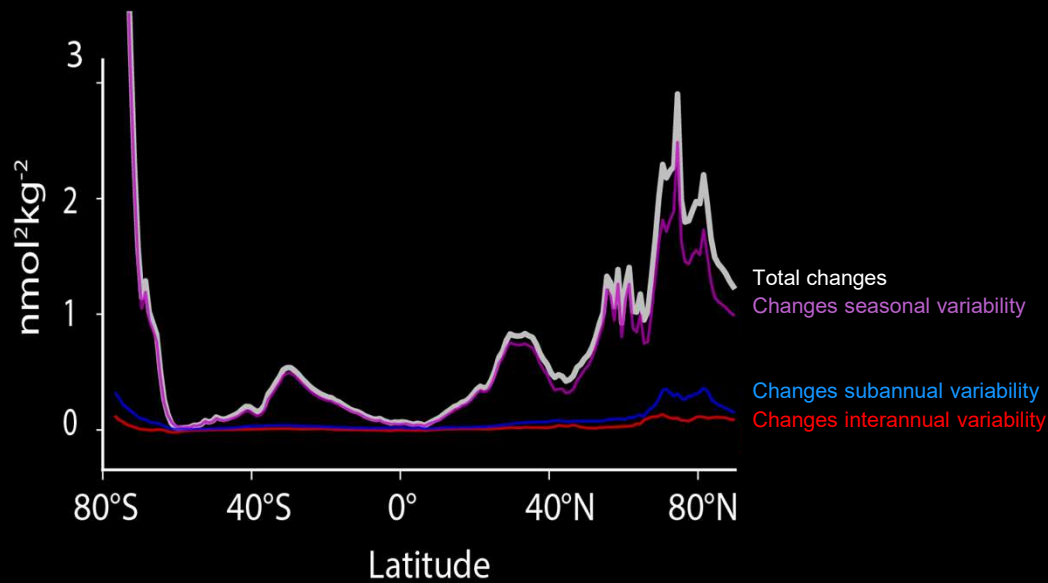
Variability-driven changes  
(shifting baseline)



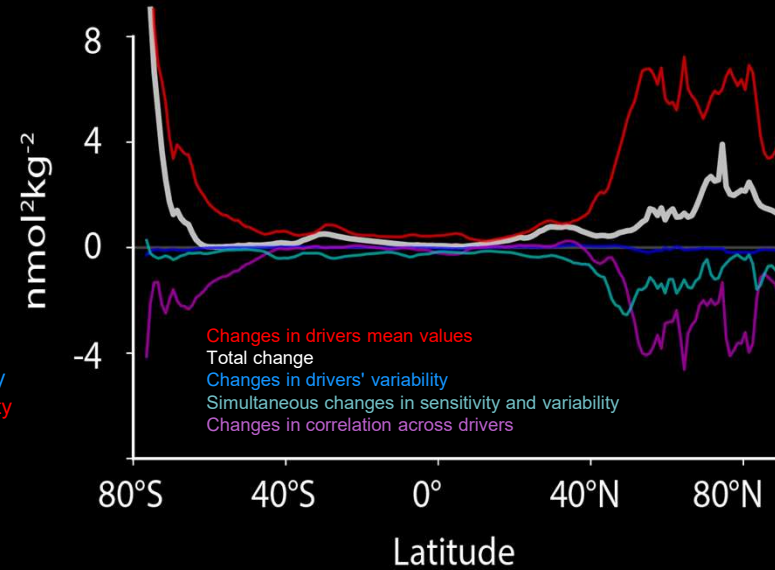
Note : The number of variability-driven extreme events days in  $\Omega_{arag}$  decreases!

# Decomposition and drivers of [H<sup>+</sup>] variability changes: 2090s – 1870s

Contribution to projected changes in [H<sup>+</sup>] variance



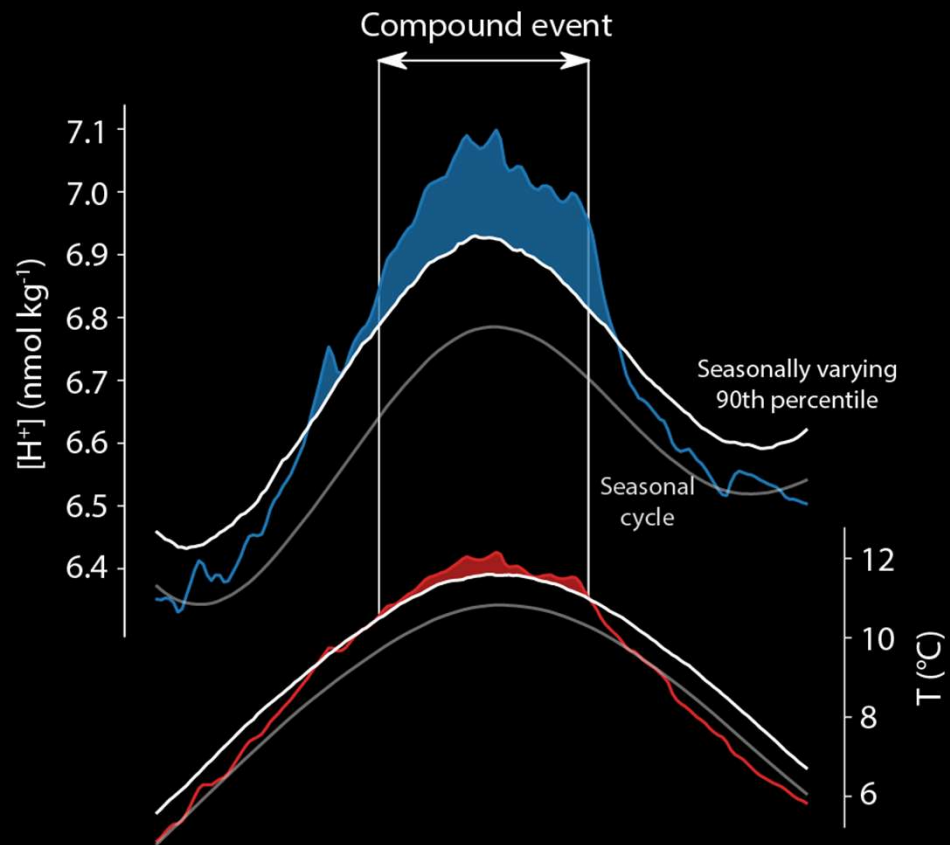
Drivers of [H<sup>+</sup>] variability change (DIC, Alkalinity, Temperature, Salinity)



- Surface [H<sup>+</sup>] extremes will become more frequent in 87% of the ocean
- Largest increase in the Arctic Ocean and subtropical gyres
- Most of the variance increase is due to increase in [H<sup>+</sup>] seasonality

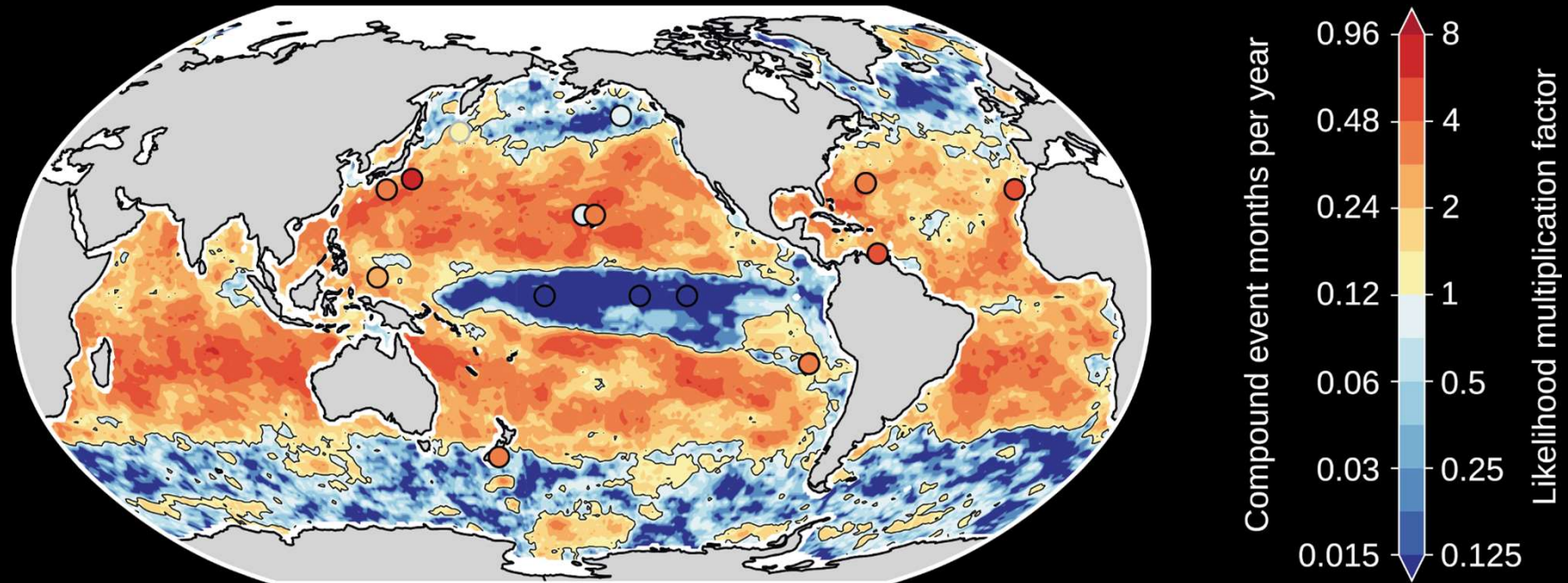
- Raise in variance is mainly driven by increase in mean surface DIC and decrease in mean alkalinity, somewhat damped by reduction in DIC variability

## Definition of multivariate compound events



- Combination of multiple drivers and/or hazards that contribute to societal or environmental risk (e.g., Zscheischler et al. 2018)
- Situations when more than one ocean ecosystem driver is outside the norm **simultaneously (in my analysis)**, in close spatial proximity or temporal succession

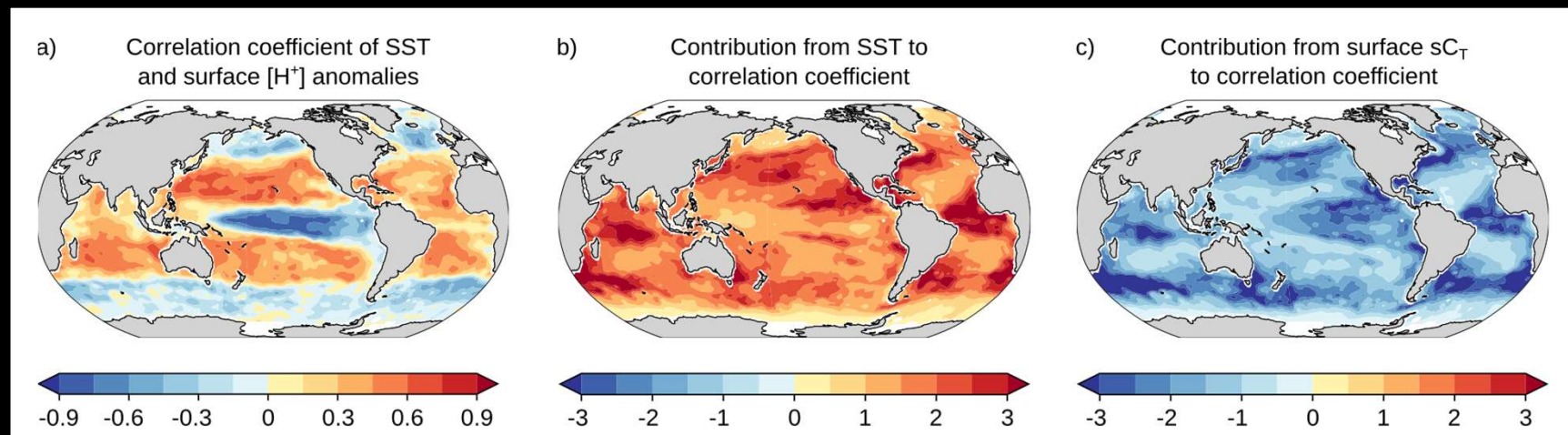
## Hotspots of compound marine heatwave - high acidity extremes



Circles: Estimates from 15 stations with time-series observations

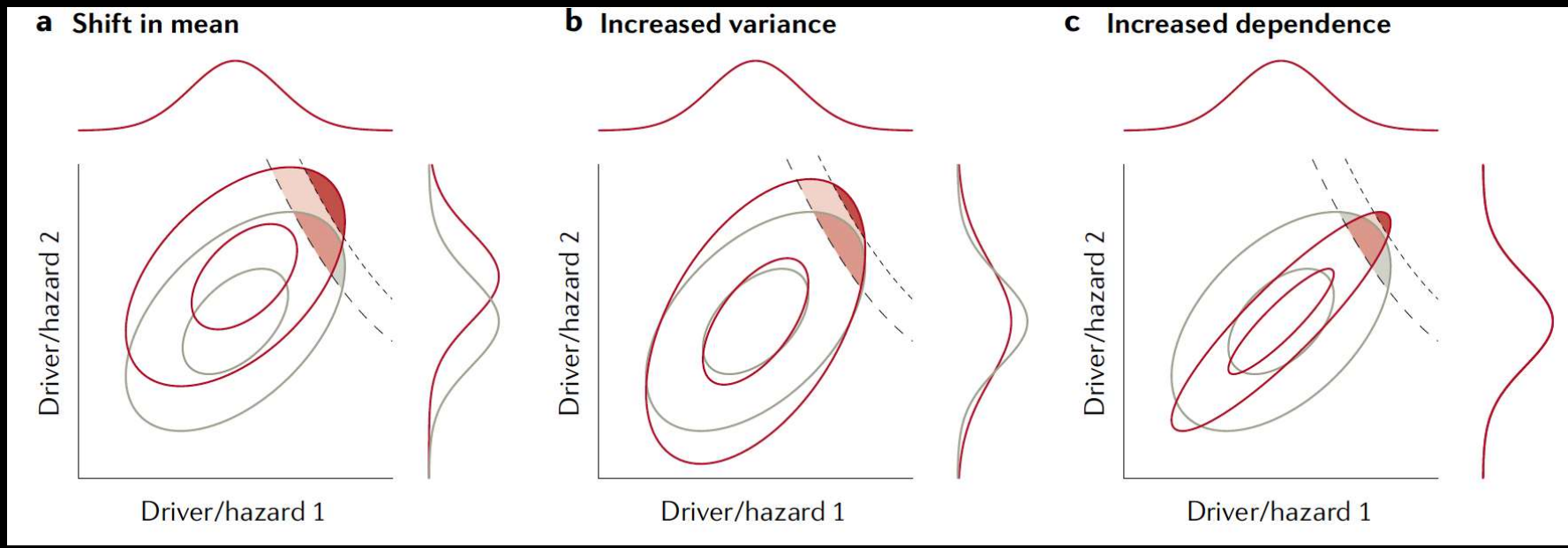
Monthly gridded  $[H^+]$  data for 1982-2019: T, S from EN4.2.1 (Good et al. 2013);  $pCO_2$  from MPI-SOM-FFN (Landschützer et al. 2020),  $A_T$  from LIARv2 regression (Carter et al. 2017)

## Drivers of compound marine heatwave-ocean acidity events



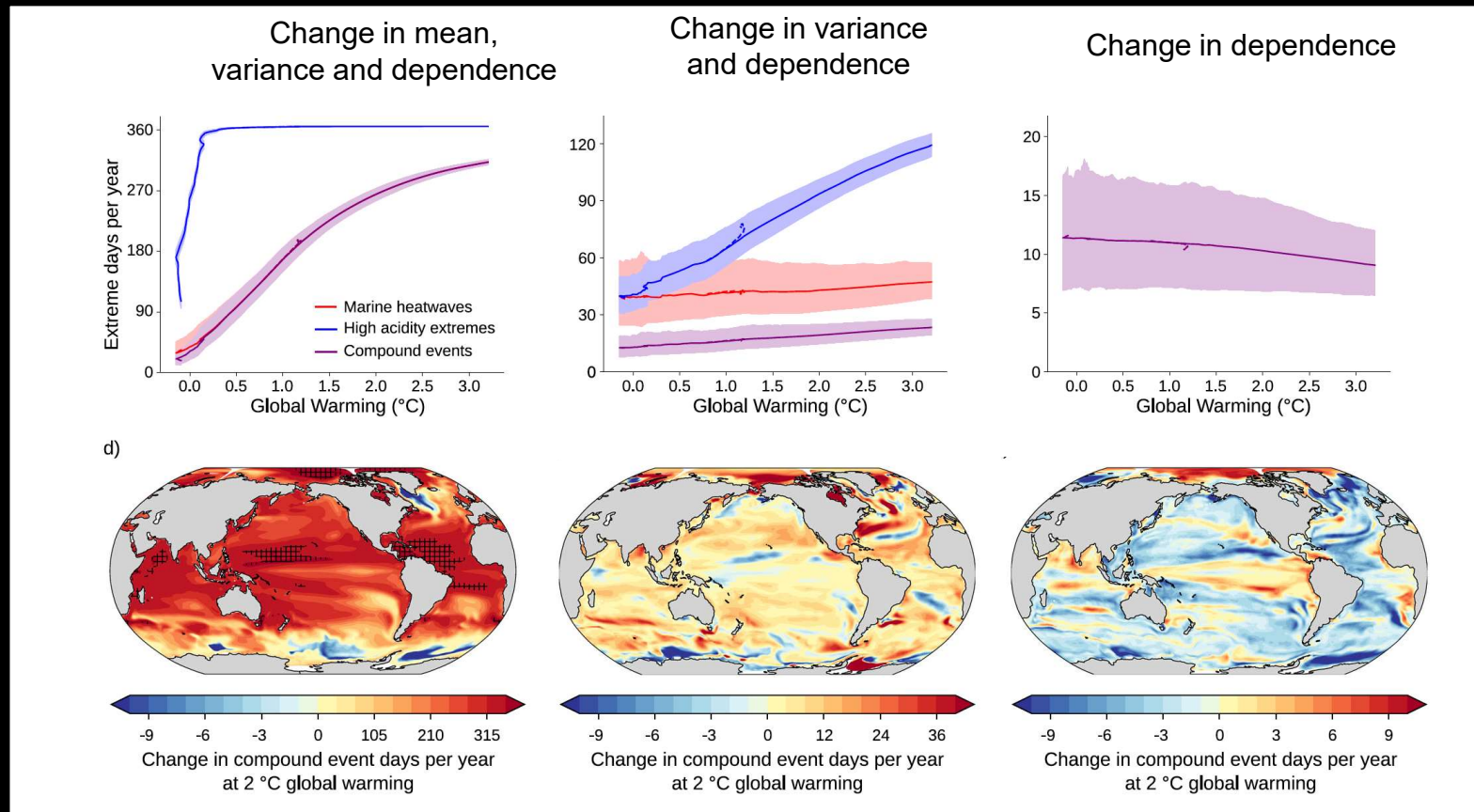
- Correlation coefficient is the net of the positive temperature contribution (increasing SST- $[H^+]$  correlation) and the negative  $sC_T$  contribution

# Climate change effects on compound events



# GFDL ESM2M-LE: MHW-OAX frequency under global warming

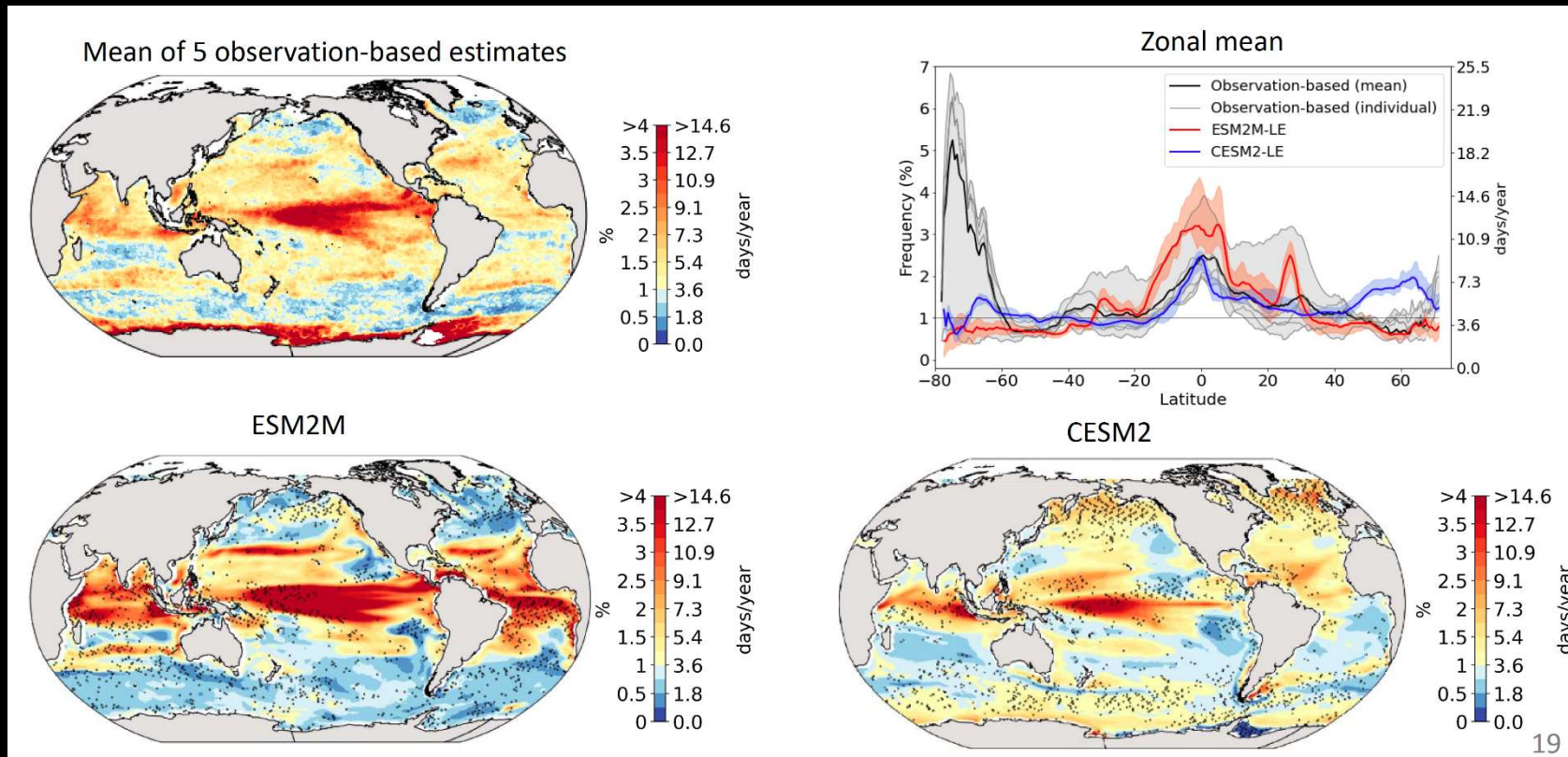
Results from daily data of a 30-member ensemble simulation with GFDL ESM2M; Definition extreme: 90 Percentile





# Hotspots of compound marine heatwave-low NPP events

1998-2018

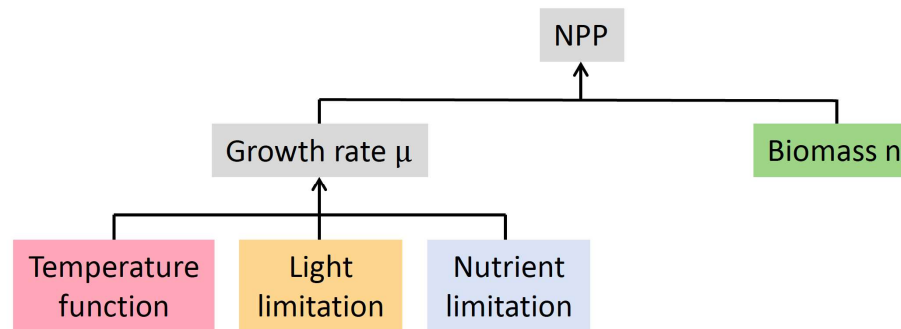


19

## Drivers of extremely low NPP during MHW-NPPX events

$$NPP = \mu n$$

$$dNPP = nd\mu + \mu dn$$

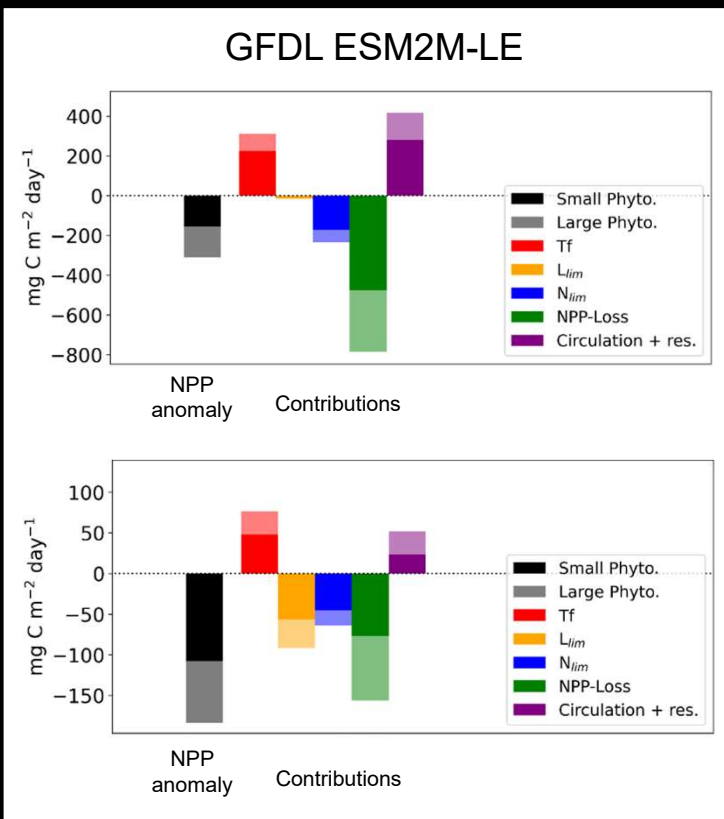


$$\mu = \mu_{max} T_f Irr_{lim} N_{lim}$$

$$d\mu = \mu_{max} dT_f Irr_{lim} N_{lim} + \mu_{max} T_f dIrr_{lim} N_{lim} + \mu_{max} T_f Irr_{lim} dN_{lim}$$

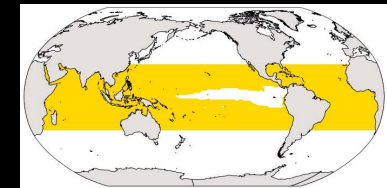
→ Is low NPP driven by a change in **Temperature?** **Light?** **Nutrients?** **Biomass?**

# Drivers of extremely low NPP during MHW-NPPX



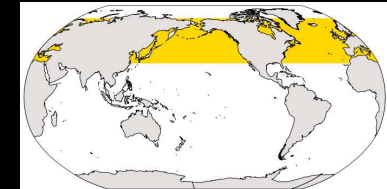
## In the low latitudes:

- Lower growth because of **nutrient limitation**
- Lower phytoplankton biomass because **phytoplankton loss (i.e. grazing) exceeds its production**



## In the northern high latitudes:

- Lower growth because of **nutrient limitation** and **light limitation**
- Lower phytoplankton biomass because **phytoplankton loss exceeds its production**



## Take-home messages

1. Marine heatwaves have doubled in frequency since 1982 and have become longer-lasting, more intense and more extensive.
2. Globally between 84-90% of marine heatwaves that have occurred between 2006 and 2015 are attributable to anthropogenic temperature increase. The Blob would have not occurred without human-caused global warming.
3. Marine heatwaves are projected to further increase in frequency, duration, spatial extent and intensity. Largest increases in frequency are projected for the Arctic and tropical oceans.
4. Biogeochemical extreme events, such as ocean acidity extremes, and compound events are also bound to strongly increase under climate change.

