

# CAREHeat deteCtion and threAts of maRinE Heat waves

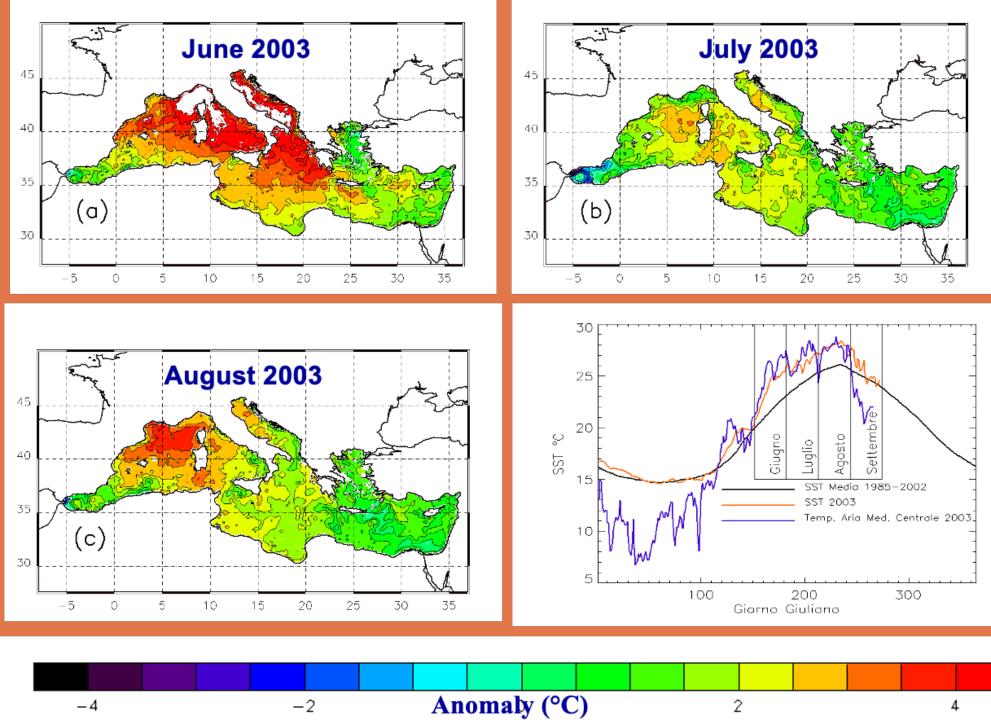
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### Marine Heath Waves (MHW) Definition: Abnormal warm seawater temperature events

### The warm summer of 2003 observed in NRT: SST anomaly 2003 with respect to 1985 – 2002 average

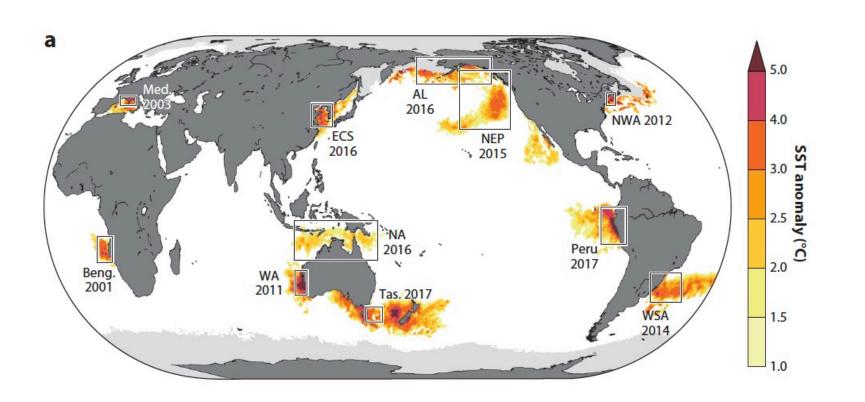


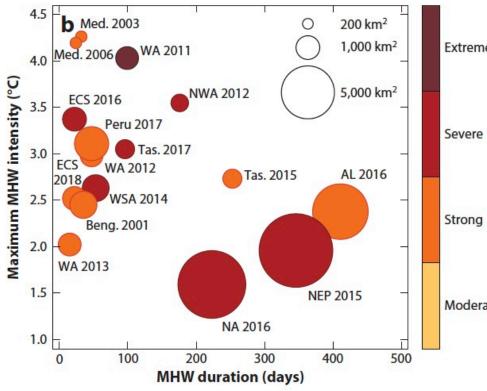
First evidence of MHW in Summer 2003 in NRT durng Summer 2003

SST 4-5 °C > climatology 2003 MHW lasting 2-3 months

From Marullo & Guarracino 2003

### Marine Heath Waves (MHW) frequently observed in any region of the ocean





Extreme

Severe

Moderate

From Oliver et al. Annu. Rev. Mar. Sci. 2021.

Prominent MHWs have been reported to have a devastating impact on marine ecosystems

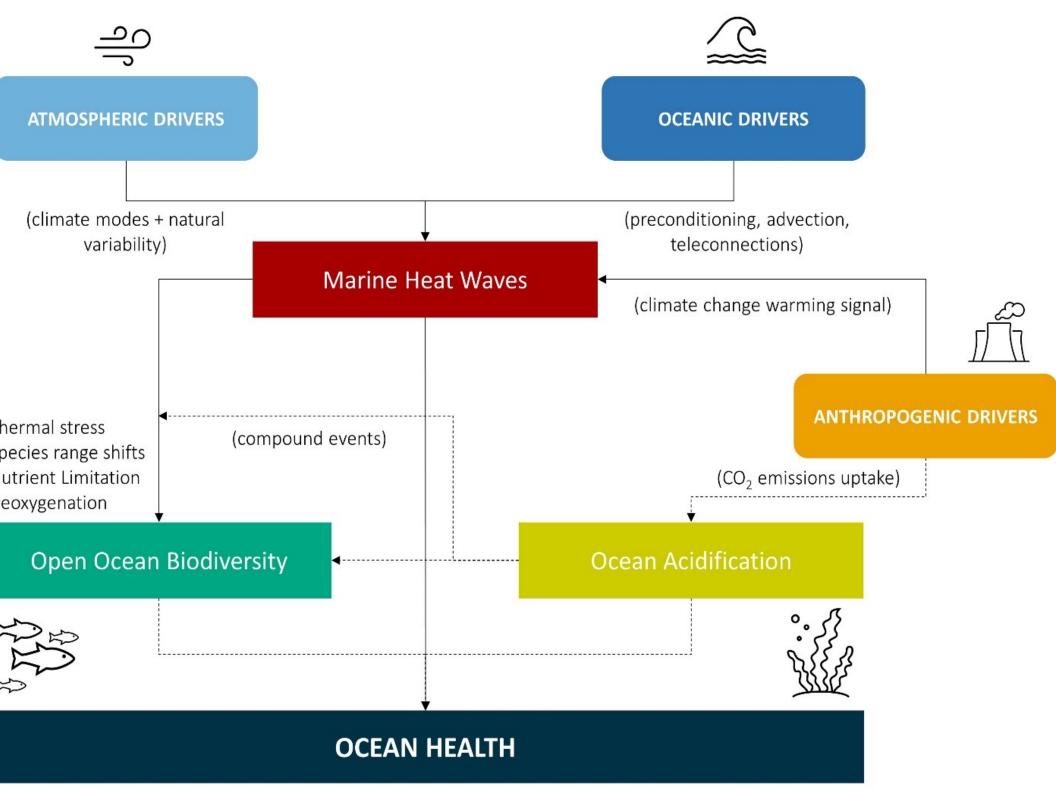
### Marine Heath Waves (MHW) – abnormal warm seawater temperature events – THREATH living organisms and marine ecosystems and planetary health

### More Frequent lately .... but Many Unknowns

Are MHW well identified? How frequent are MHW? What are the Drivers and the Triggers of these extreme events? What are the Effects on Ecosystems and their Services? Do they Co-Occur with other Hazardous events?

### CAREHeat **AIM**

- IMPROVE current MHW Detection and **Characterization** methodology
- ADVANCE the understanding of the physical processes involved in MHW Development
- ASSESS MHW impact on marine **Ecosystems and Biogeochemistry**
- ASSESS the impact of MHW on **Ecosystem Services**

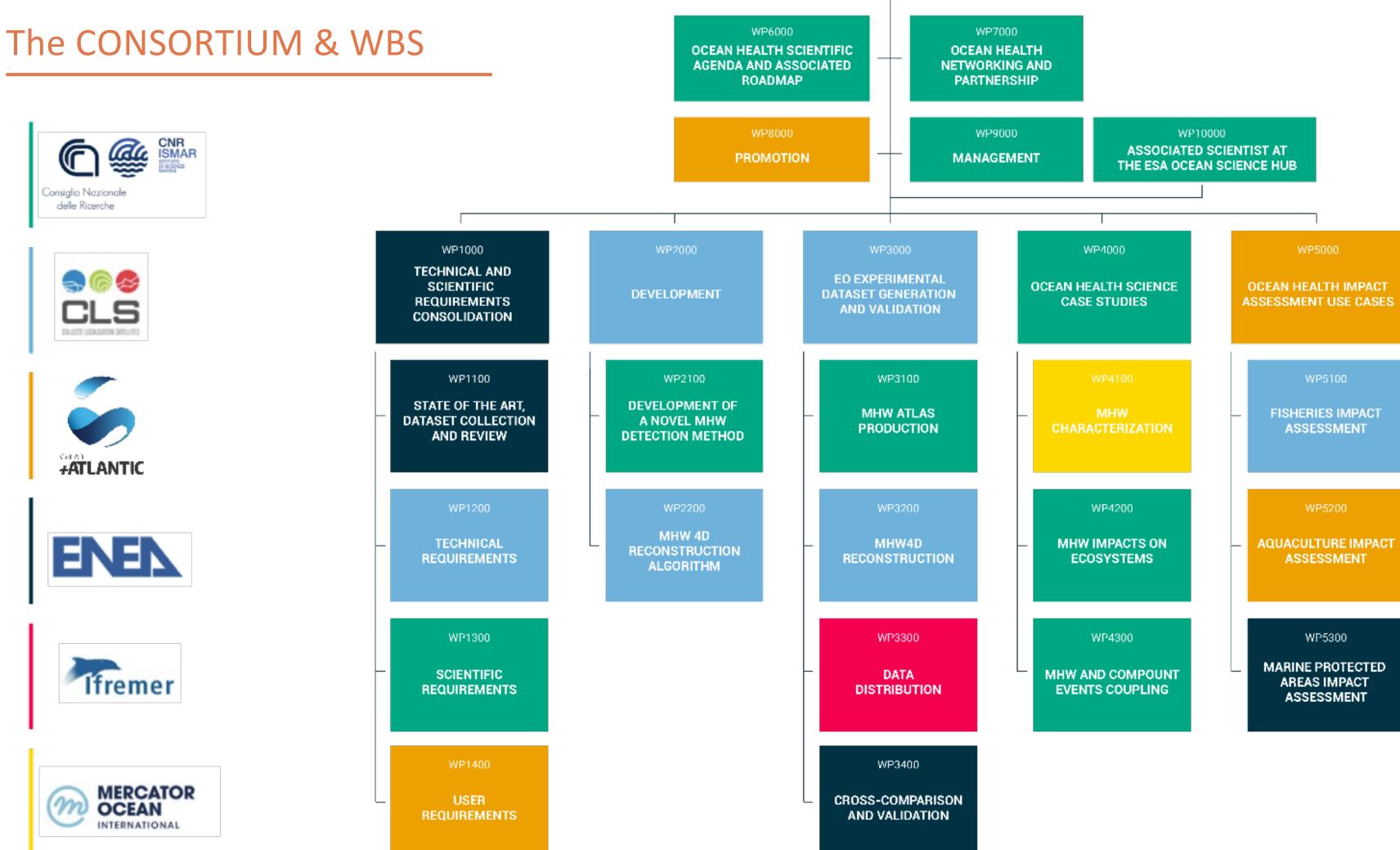


Thermal stress Species range shifts Nutrient Limitation Deoxygenation



**CAREHeat Project starting soon** 





#### CAREHeat



### Improving the MHW detection method

### MHW detection

MHW Widely detection used method is Hobday et al. (2016). This method is based on local temperature anomalies exceeding a given climatology percentile threshold.

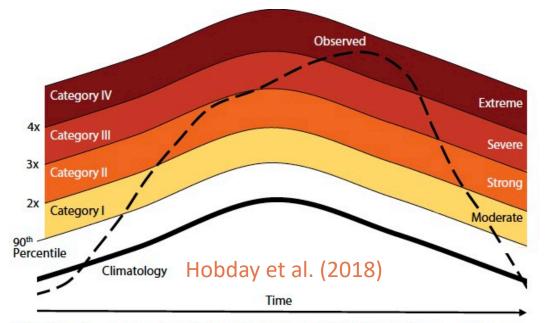
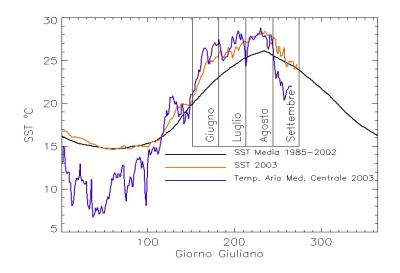


FIGURE 2. Categorization schematic for marine heatwaves (MHWs) showing the observed temperature time series (dashed line), the long-term regional climatology (bold line), and the 90<sup>th</sup> percentile climatology (thin line). Multiples of the 90th percentile difference (2x twice, 3x three times, etc.) from the mean climatology value define each of the categories I-IV, with corresponding descriptors from moderate to extreme. This example peaked as a Category IV (extreme) MHW.

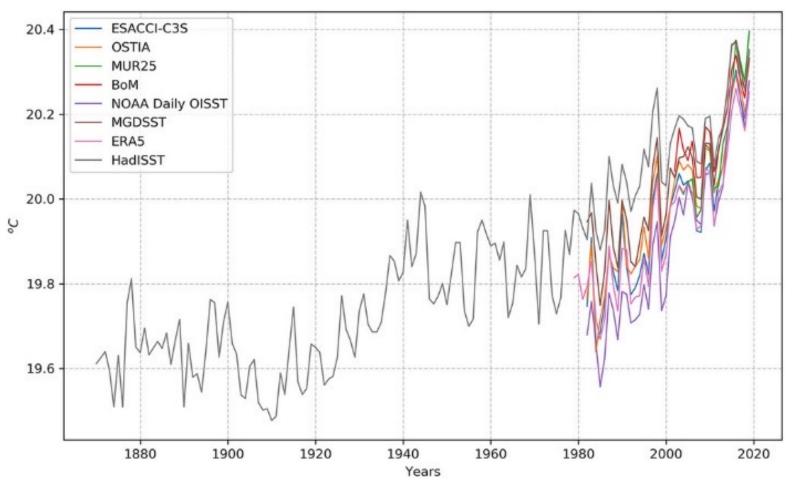


Marullo & Guarracino (2003)

### Aims

What is the effect of SST trend on MHW detection?

#### What is the contribution of natural mode of variability?



Yang et al 2021: Global monthly mean SST time series for all the ensemble members for the whole covered period originally obtained in each SST product.

### Method Improvements

#### • SST TRENDS and impact of CLIMATE MODES on the statistical thresholds at regional and global scale

- Sensitivity of MHW detection with respect to the baseline climatology definition (e.g., moving versus fixed climatology)
- Effects of DIURNAL WARMING
- Disentangling the main drivers of MHW development

Extensive use of all available satellite datasets (

### Validation

Novel MHW products will be compared with well-known MHW events



### 4D MHW reconstruction

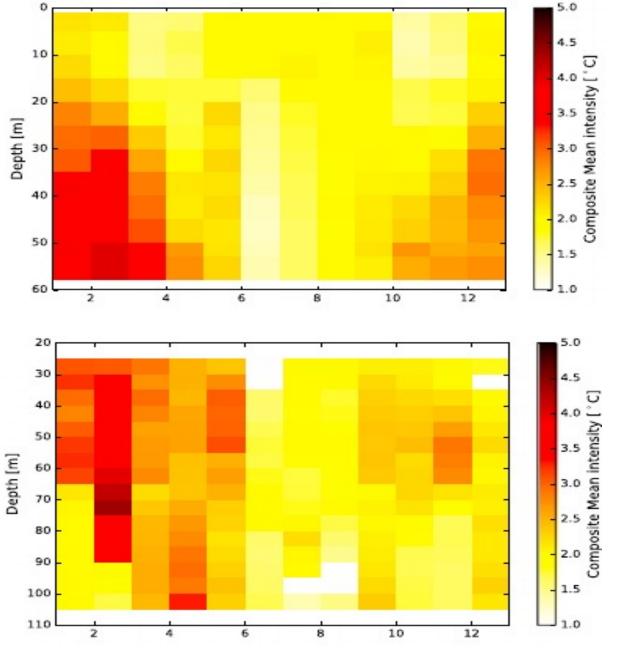
Reconstructing the information related to MHW events in the subsurface of the ocean is crucial for our understanding of MHW and their impact on ecosystems.

- Over the last 30 years, extremely hot sea surface temperatures (SSTs) have become more common in one third of the world's coastal areas ([Lima and Wethey, 2012]
- Different studies demonstrated an intensification of MHW at depth as well as a deeper penetration of the signal (e.g. Schaeffer and Roughan, 2017).
- The characteristics of subsurface events can differ from the ones at the surface: Darmaraki & al (2019) shown that in the MED Sea, subsurface events are seasonally shifted and appear, on average, longer and more intense but less frequent and less extended in space than surface MHW
- The propagation of surface events to depth can strongly impact benthic organisms and ecosystems => In response to the unusual thermal stress, marine communities have to either acclimatize or track more suitable habitat farther poleward or deeper. This includes shallow communities and benthic species, coral communities and seaweed below the surface mixed layer. Habitat-forming species are dying and are not able to recover after the MHW has subsided (Wernberg et al.,2016)

Unfortunately, little is known about temperature extremes at depth due to the lack of longterm in situ measurements.

CAREHeat: better characterize the subsurface MHW events through the reconstruction of a dedicated 4D MHW dataset

### MHW intensity as a function of depth– 2 sites along the Australian coast



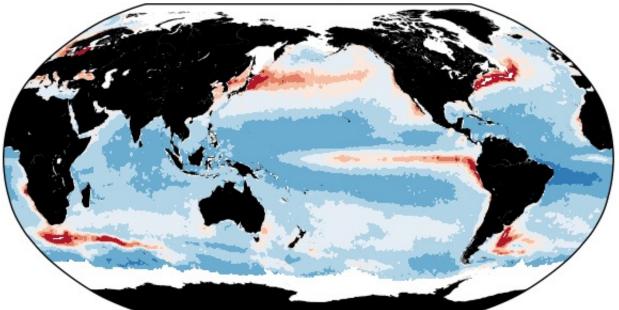
Schaeffer and Roughan, 2017

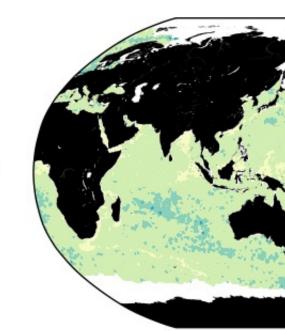


### **MHW Surface Global Atlas**

### Spatial distribution of average properties of MHW $C_{3}S_{511}$

Intensity





Frequency

- 5.0

- 4.0

- 3.5

- 3.0

ں 2.5 -

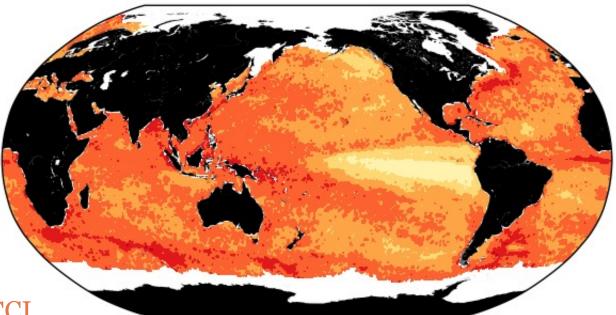
- 2.0

- 1.5

- 1.0

- 0.5

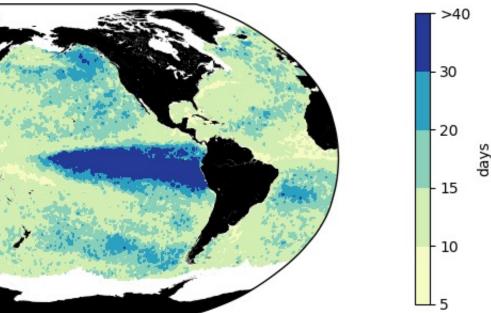
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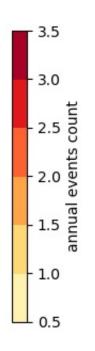


Pisano et al. (2020) C3S\_511 SPQB –based on the ESA CCI SST Level-4 dataset v2.0 Detection with current methodology applied to ESA CCI SST Level-4 dataset (v2.0)

### Improved methodology will be use to produce a new MHW Atlas covering the satellite era (> 10 years)







The Atlas will be accompanied by a list of ancillary information: METEOROLOGICAL OCEANIC GEOPHYSICAL BIOLOGICAL

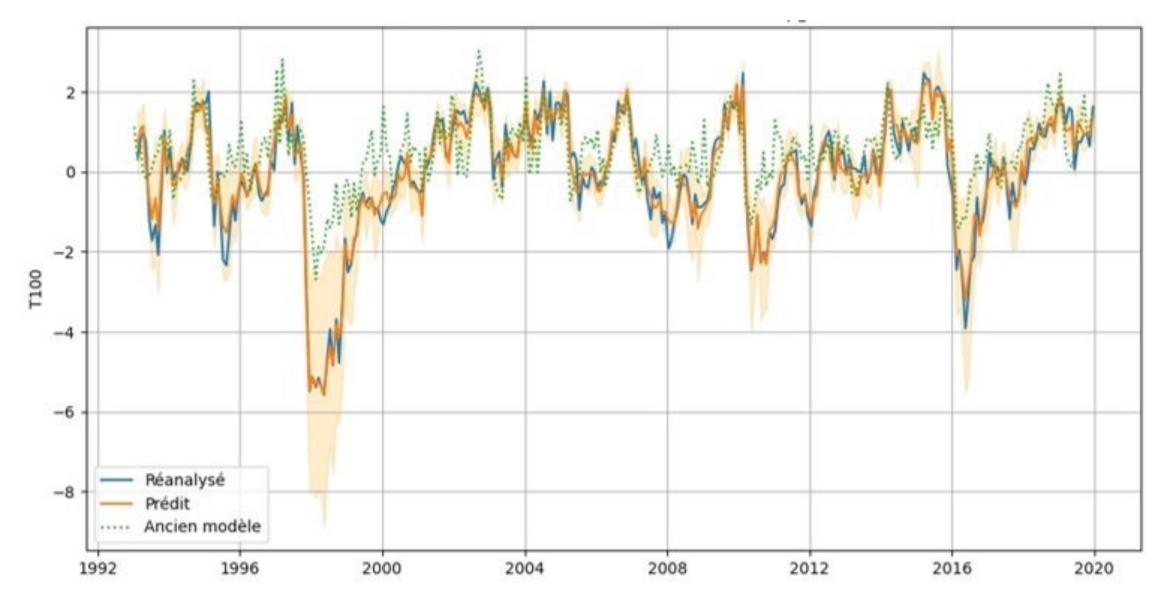


# 4D time series reconstruction

Optimize the AI approach to reconstruct Marine Heatwaves (MHW) in the subsurface for past events over a recent 10-year period

### Output 4D

A 4D MHW dataset for several areas of interest



Random Forest model at  $0^{\circ}N - 180^{\circ}E$ 

Schaeffer and Roughan, 2017

### Optimization

Choose the right oceanic and atmospheric predictors to reconstruct the 4D field & prepare these data (detrending, denoising (e.g.: EOFs, interpolation, ...). This task relies on the preliminary study about the MHW drivers.

Target some MHW events (based on MHW Atlas computed) on test sites to guide this optimization Select the best performant supervised ML-based approach (Random Forest (RF) or Neural Network(NN), other...) to reach the target. Iterative tests.

### Validation

In situ data are the truth. Independent reference observations

The estimation of MHW requires time series, so moorings will be preferred

Intercomparison with other subsurface temperature products (dynamic models, CMEMS), statistical models based on combined earth observations such as ARMOR3D (Guinehut et al., 2012), other reconstructed products with ML approach if available on the test sites (Buongiorno Nardelli, 2020)



### **Drivers and precursors of MHW**

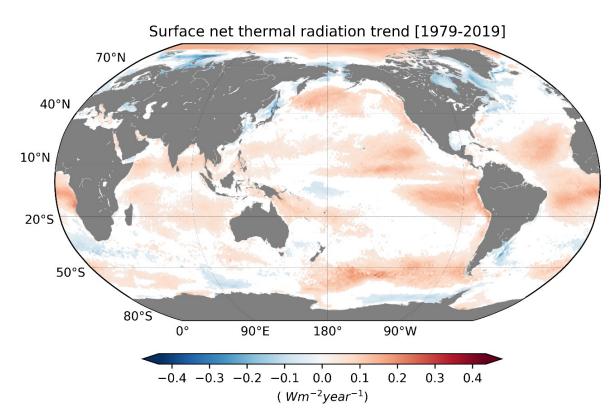
CHARACTERIZE MHW variability, drivers and precursors that are responsible for MHW occurrence and evolution

#### Strategy

- Evaluate global 10 year time and space variability of MHW
- Investigate via statistical tools the relationships between MHW events and key oceanic and atmospheric variables

#### Validation

Exploit ocean model analysis and reanalysis to investigate (e.g., using tools for advanced time series analysis) the effects of forcing and eligible precursors occurring during observed MHW events



### MHW impact on biodiversity and biogeochemistry

Assess the IMPACT of MHW on marine **biodiversity** and **biogeochemistry** along the water column



- Use MHW4D products
  - Assess EFFECTS of MHW during and after the event Exploit synergies between Ocean Colour satellite observations, floats and biogeochemical models Capitalize on open carbon products (e.g., C<sub>phyto</sub> and POC) within the ESA Ocean Science Cluster

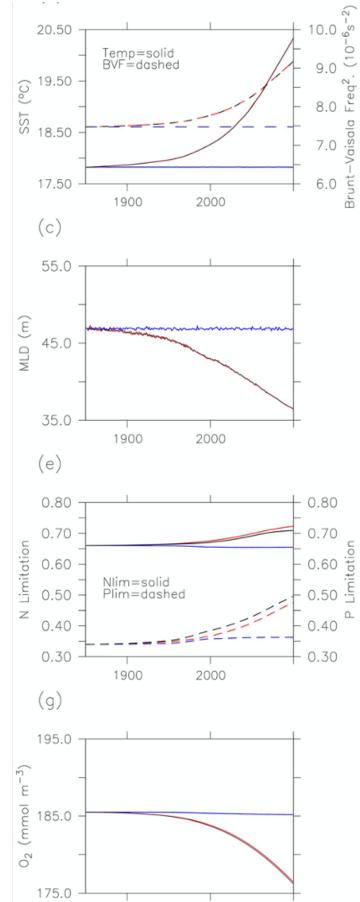
#### **Key questions to address**

- 1. How MHW impact on Chl concentration?
- 2. Do biomass or physiology affect Chl changes?
- 3.Impact on phytoplankton community structure?
- 4. Impact on ocean biogeochemistry nutrients and oxygen?
- 5. Impact on higher trophic levels?
- 6. Impact and sensitivity on pH and air-sea CO<sub>2</sub> fluxes during MHW events?

### MHW and compound events

**BGC-Argo** 

IDENTIFY compound events and ASSESS impacts and links with oceanic biological productivity



1900

2000

### Strategy

- Use MHW4D products -Identify the COoccurrence of MHW with extreme anomalies in **CMEMS-biogeochemical** model output

#### **Key questions to** address

1. Identification and Frequency of compound events 2. Identify cumulative impact on ocean productivity 3. Identify positive feedbacks driving compound events

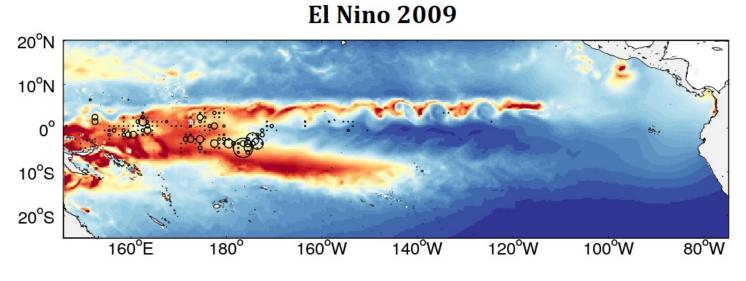


### **Fisheries**

Two species of tropical Tunas

Evaluate short-term impacts of MHW on larvae, juveniles, immature and mature tunas

Evaluate long-term impacts of MHW on tuna recruitment



Density distribution of biomass for tunas as predicted by the model SEAPODYM

### **Marine Protected Areas**

MPA Isole Pelagie (Lampedusa)



Corals

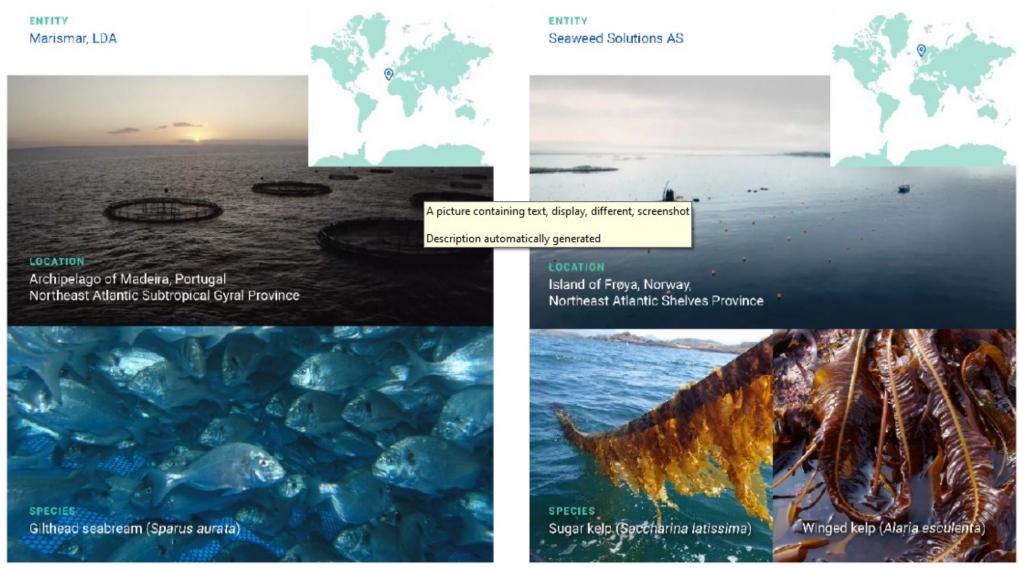


Sea urchins



ENTITY





Assess how two economically important marine species (Sea Breams and Sugar Kelp), from different trophic levels respond to acute thermal stress during events of MHW, in Portugal and Norway. Analysis of impacts on life cycle and mortality, distribution and productivity

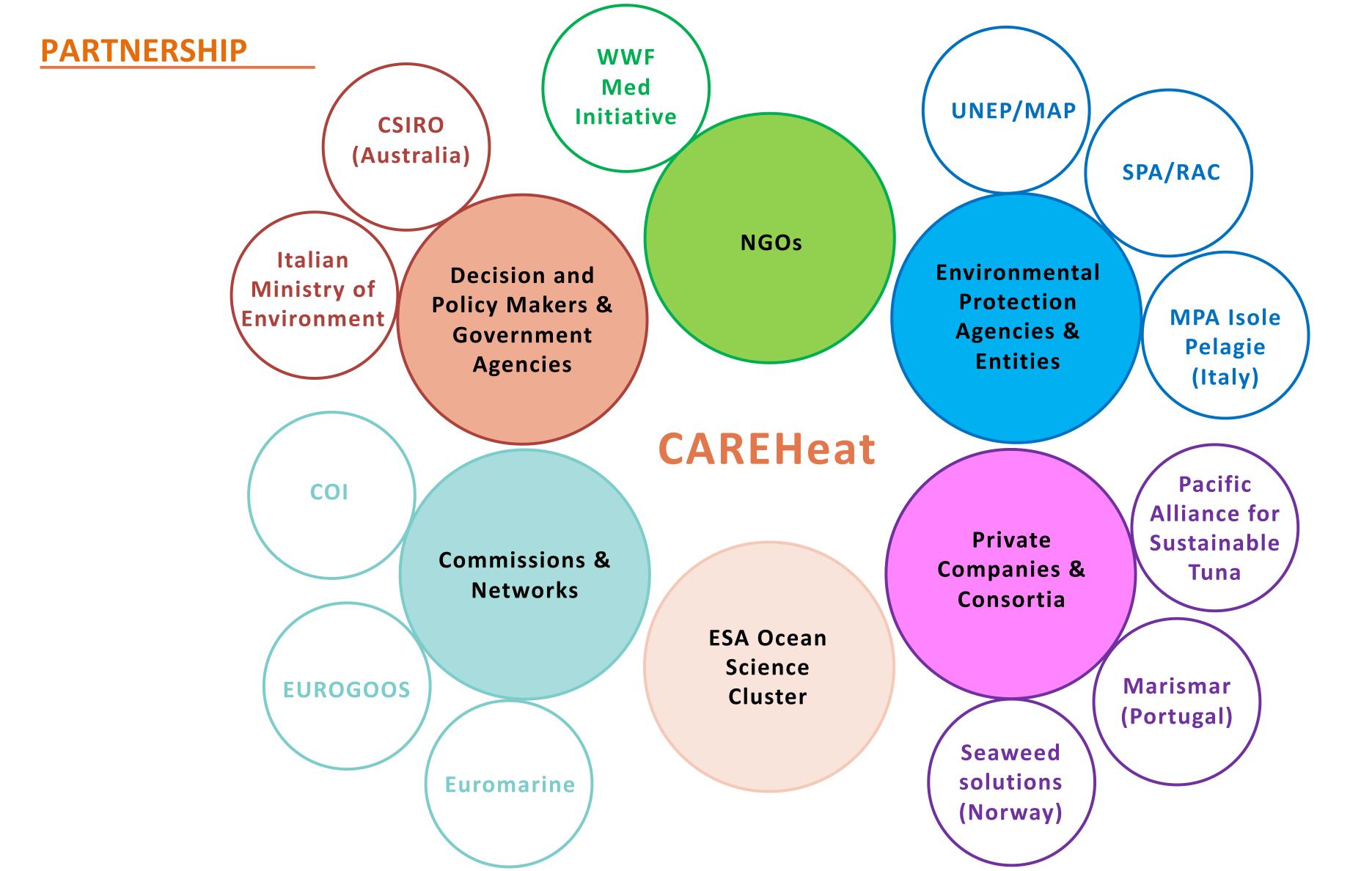
### Aquaculture

Marine birds



Assess MHW impact on fertility and reproduction, nesting, mortality, and behaviour







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## Thanks for your attention

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