

A photograph showing two researchers on the deck of a ship. They are wearing safety gear, including hard hats and life jackets. One researcher is wearing a white hard hat and a dark jacket, while the other is wearing a blue hard hat and a red life jacket. They are both pointing upwards with their right hands. In the foreground, a large orange buoy with a blue stripe is suspended by a metal frame. The background shows the blue ocean under a clear sky.

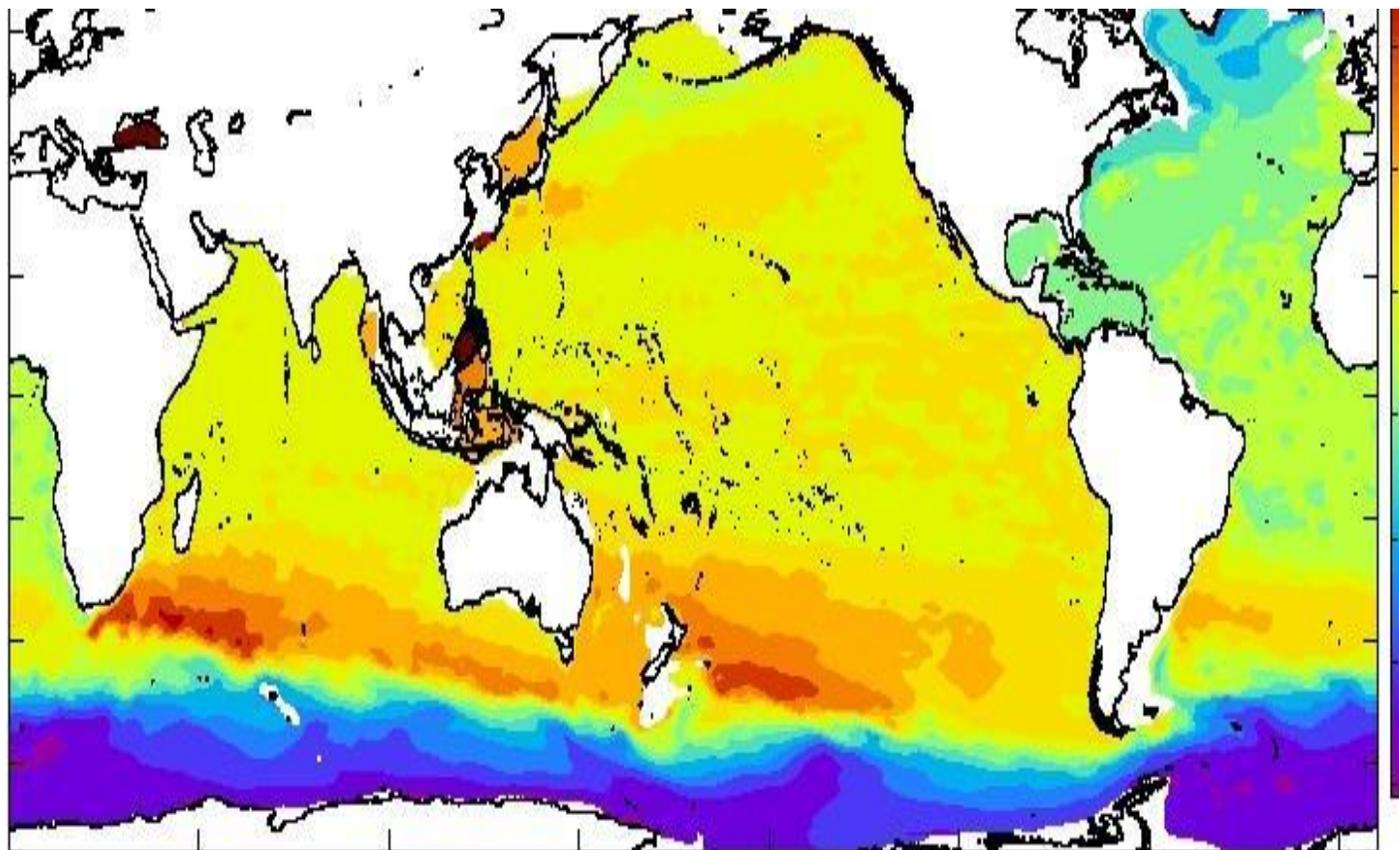
## The CSIRO Ocean Data Archive (CODA) and CSIRO Atlas of Regional Seas v2 (CARSV2)

Chris Chapman, Thomas Moore  
Rebecca Cowley, Ash Parker (CSIRO)

*With contributions from Didier Monselesan, Bernadette Sloyan, Chris Roach and many, many others!*

# The Original CARS - Product and Philosophy

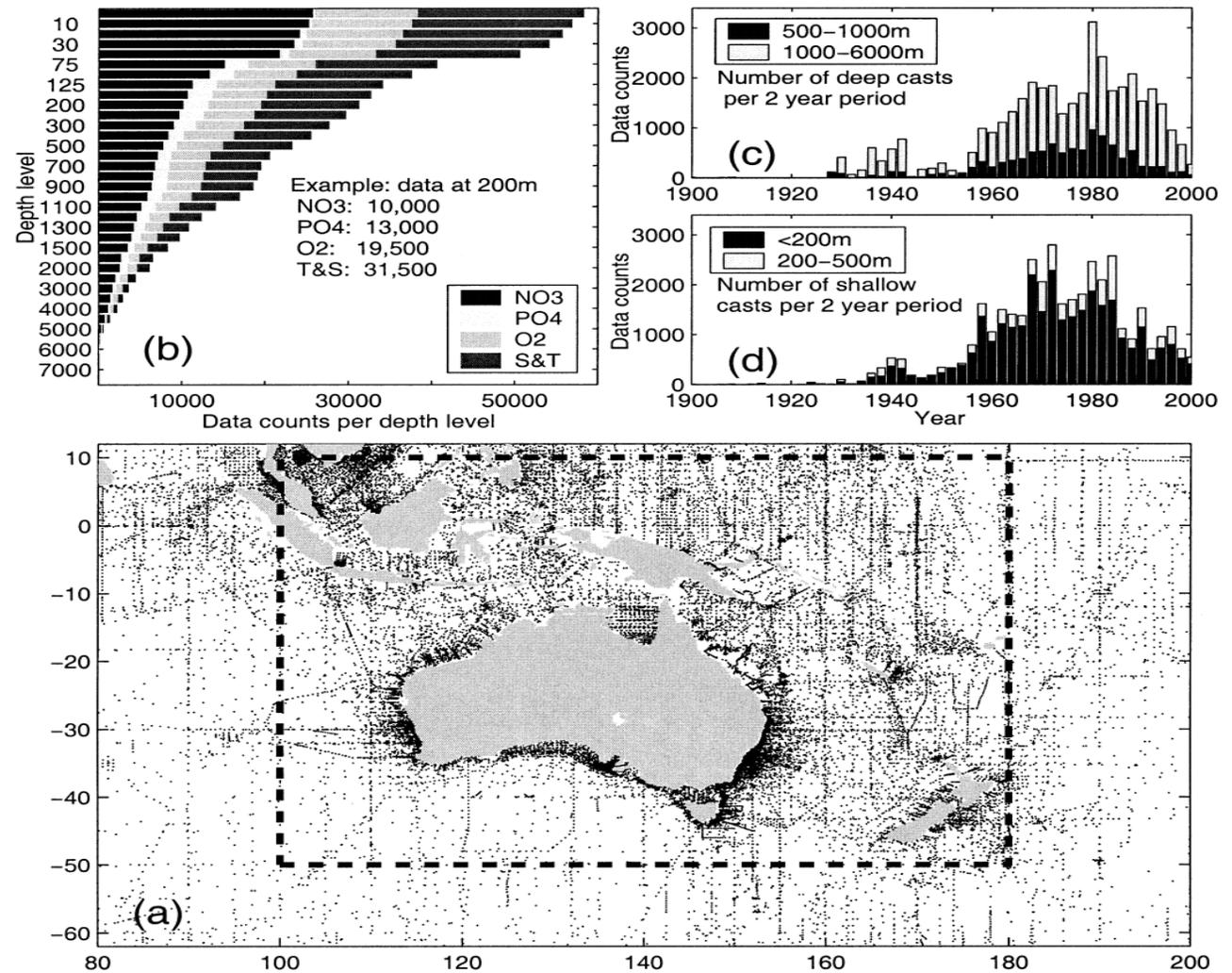
- An "atlas" of seasonal ocean properties;
- Gridded ( $1/2^\circ \times 1/2^\circ$  and  $1/8^\circ \times 1/8^\circ$ ) horizontal grid spacing;
  - Local least-squares fit;
  - Constraints on bathymetry and land barriers;
  - Attempts to improve *resolution* in areas of high data density;
- Derived from an "in-house" cultivated database of oceanographic observations (Bluelink Ocean Archive – BOA);
- **Extremely successful** – *Ridgeway et al. (2002)* cited 635 times (Google Scholar)



Source: CARS 2009, dynamic height

# The Original CARS – where are they now?

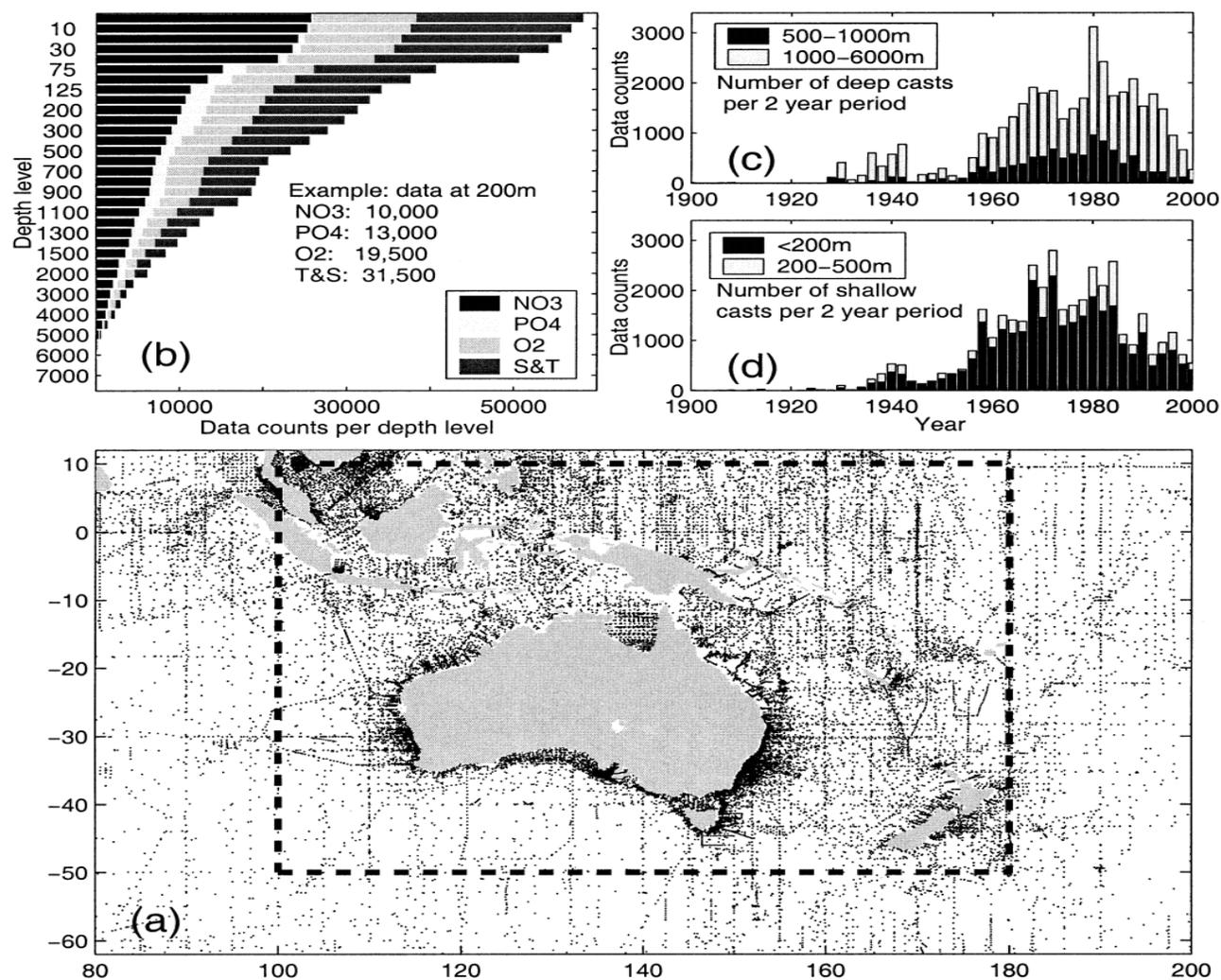
- Last comprehensive update - 2009;
- Loss of key personnel;
- Code base no longer maintainable;
- Lots of new obs and platforms since (ARGO, gliders, animal borne sensors, mooring programs, etc...)



Source: Ridgeway et al (2002) - data distribution of the original CARS product

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- Last comprehensive update - 2009;
- Loss of key personnel;
- Code base no longer maintainable;
- Lots of new obs and platforms since (ARGO, gliders, animal borne sensors, mooring programs, etc...)
- However – strong demand within the community for updated an **Australian Ocean Atlas** with accompanying **High Quality In-Situ Database**



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What are we doing about  
it?

CARS2022 – design and  
philosophy

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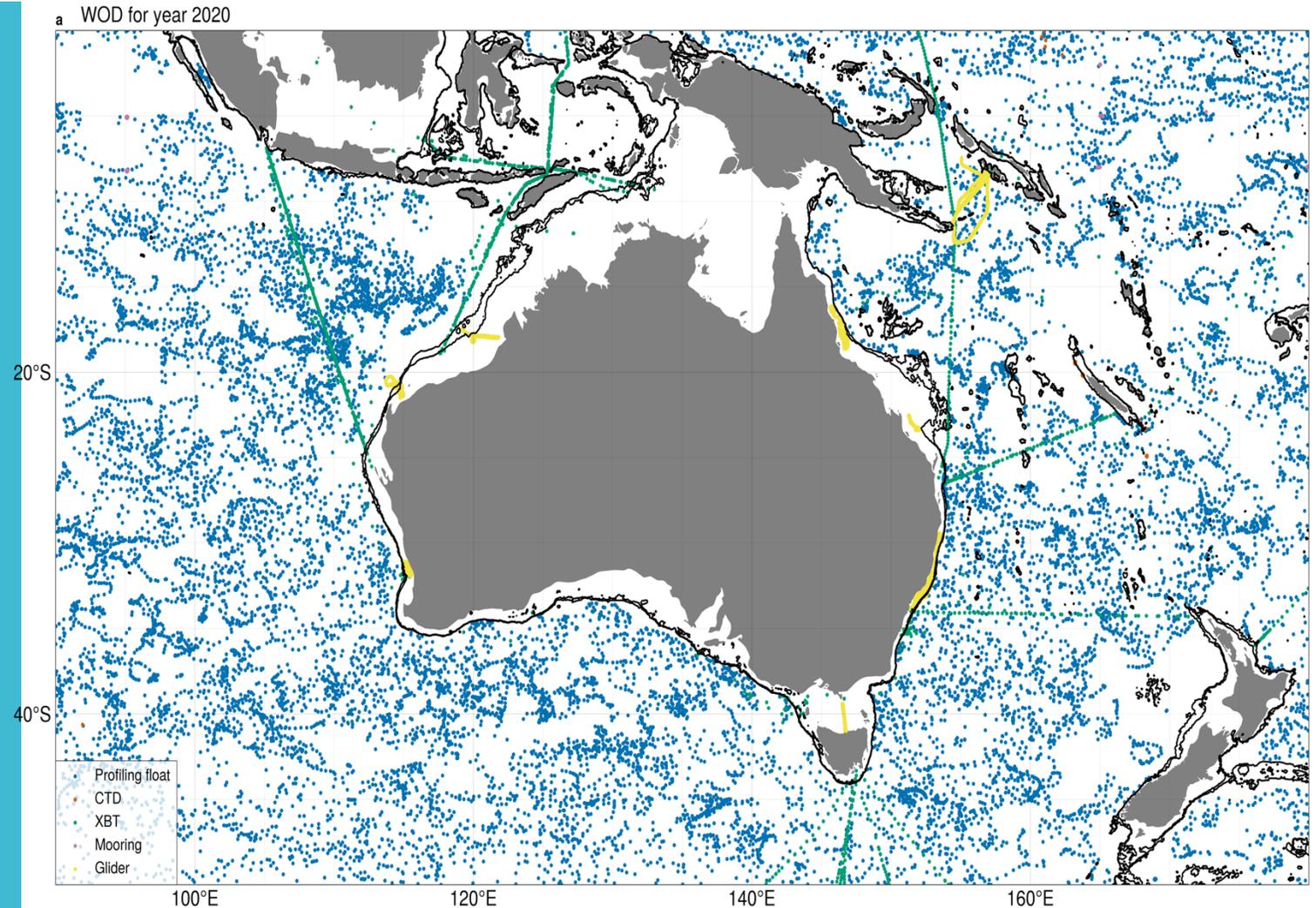
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  - The CSIRO Atlas of Regional Seas 2025 – a gridded climatology of ocean conditions around Australia

# CSIRO Ocean Data Archive

- Limited observations over shelf and shallow seas;

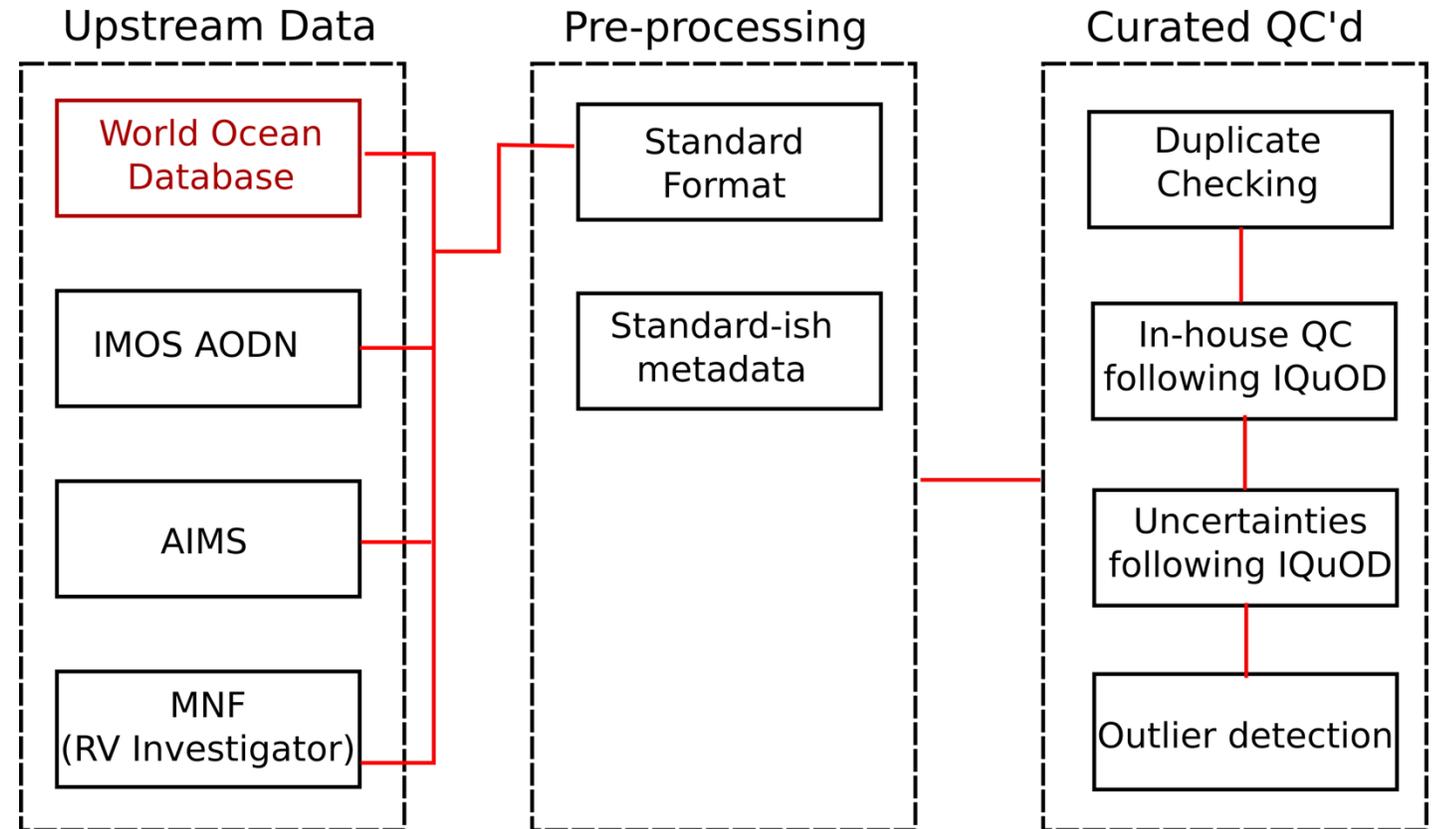


Source: Data from CODA (WOD<sub>2018</sub> + AIMS + MNF + RAN/AODN)

# The CSIRO Ocean Data Archive (CODA)

- Multi-platform database of ocean observations with an Australian focus
- Complement the global database (WOD) with "boutique" data;
- Data has a simple to read common file format(s):
  - Follows cf-conventions;
  - Standardised meta-data;
  - Netcdf and tabular (parquet) form (in progress);
- Automated, standardised, best-practice QC and uncertainties
- Potential use cases:
  - Research
  - Data-Assimilation

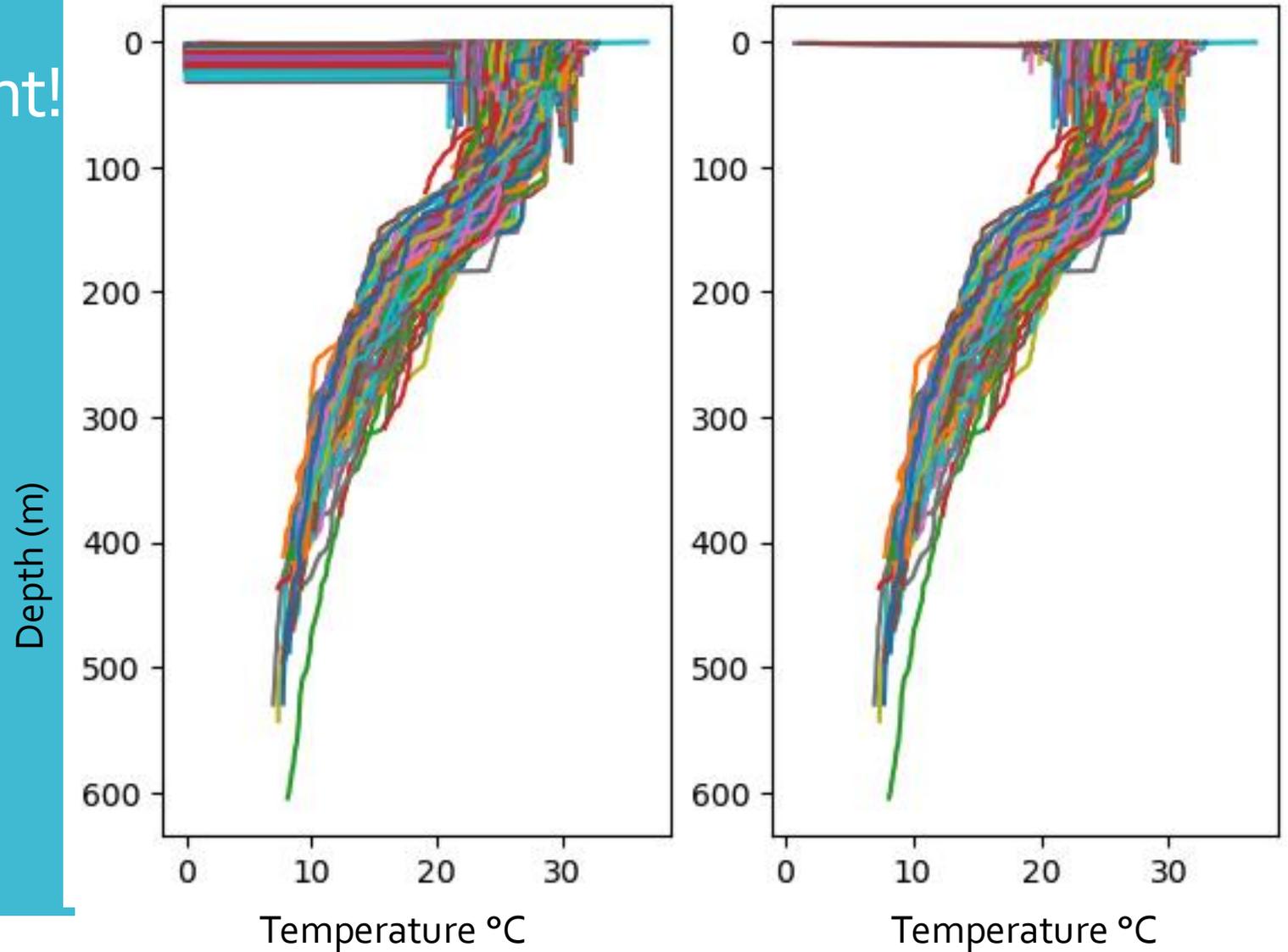
## CODA Structure



# Data Quality is Paramount!

Simple example of CTD data with no QC flags included

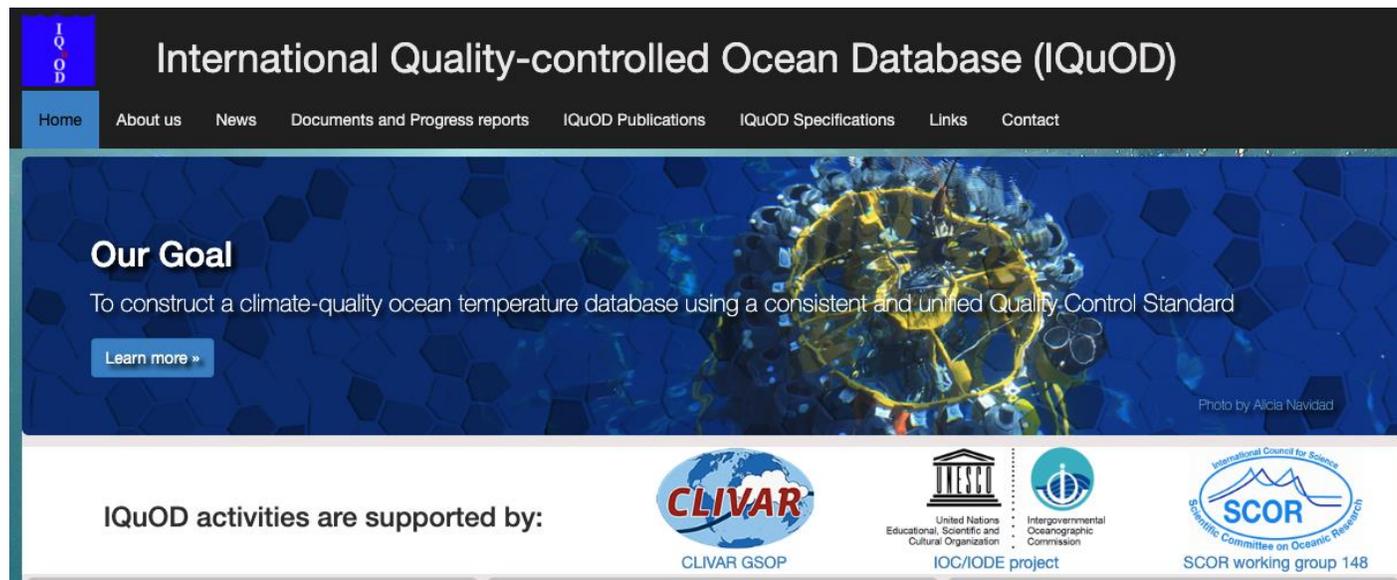
- Remove the Temperature data with values of zero gives us the plot on the right



# Data Quality

- Some of the data sourced is QC'd – some isn't;
- Even QC data may have very different standards/methods!
- Automated QC tools developed by IQuOD allow for **scalable and unified approach**
- Requires us to adapt the tools for file formats or transform the data recovered into a standard format for QC and data ingestion

[www.iquod.org](http://www.iquod.org)



International Quality-controlled Ocean Database (IQuOD)

Home About us News Documents and Progress reports IQuOD Publications IQuOD Specifications Links Contact

**Our Goal**  
To construct a climate-quality ocean temperature database using a consistent and unified Quality Control Standard

Learn more »

Photo by Alicia Navidad

IQuOD activities are supported by:

CLIVAR GSOP United Nations Educational, Scientific and Cultural Organization IOC/IODE project Intergovernmental Oceanographic Commission SCOR working group 148

**IQuOD aims to maximize the quality, consistency and completeness** of the long-term global subsurface ocean temperature database. IQuOD is a product served alongside the World Ocean Database (WOD).

IQuOD includes:

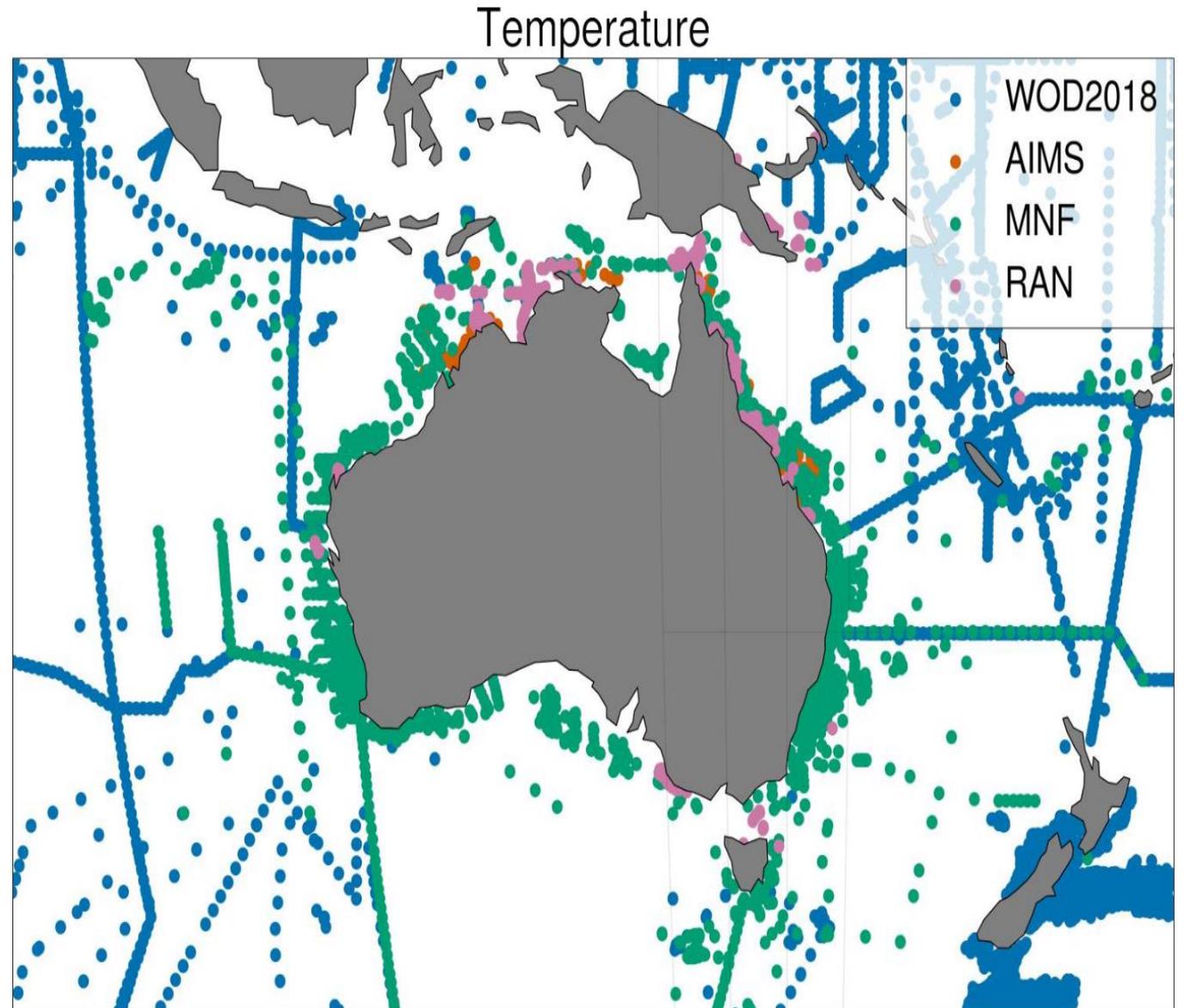
- Intelligent metadata for XBTs.
- Uncertainties assigned to each individual temperature observation.
- Some uncertainties assigned to depth and salinity.

IQuOD will soon include:

- Automated QC flags from the IQuOD community benchmarking tests.
- Duplicate checking tools.
- Machine learning tools implemented alongside expert/visual QC.

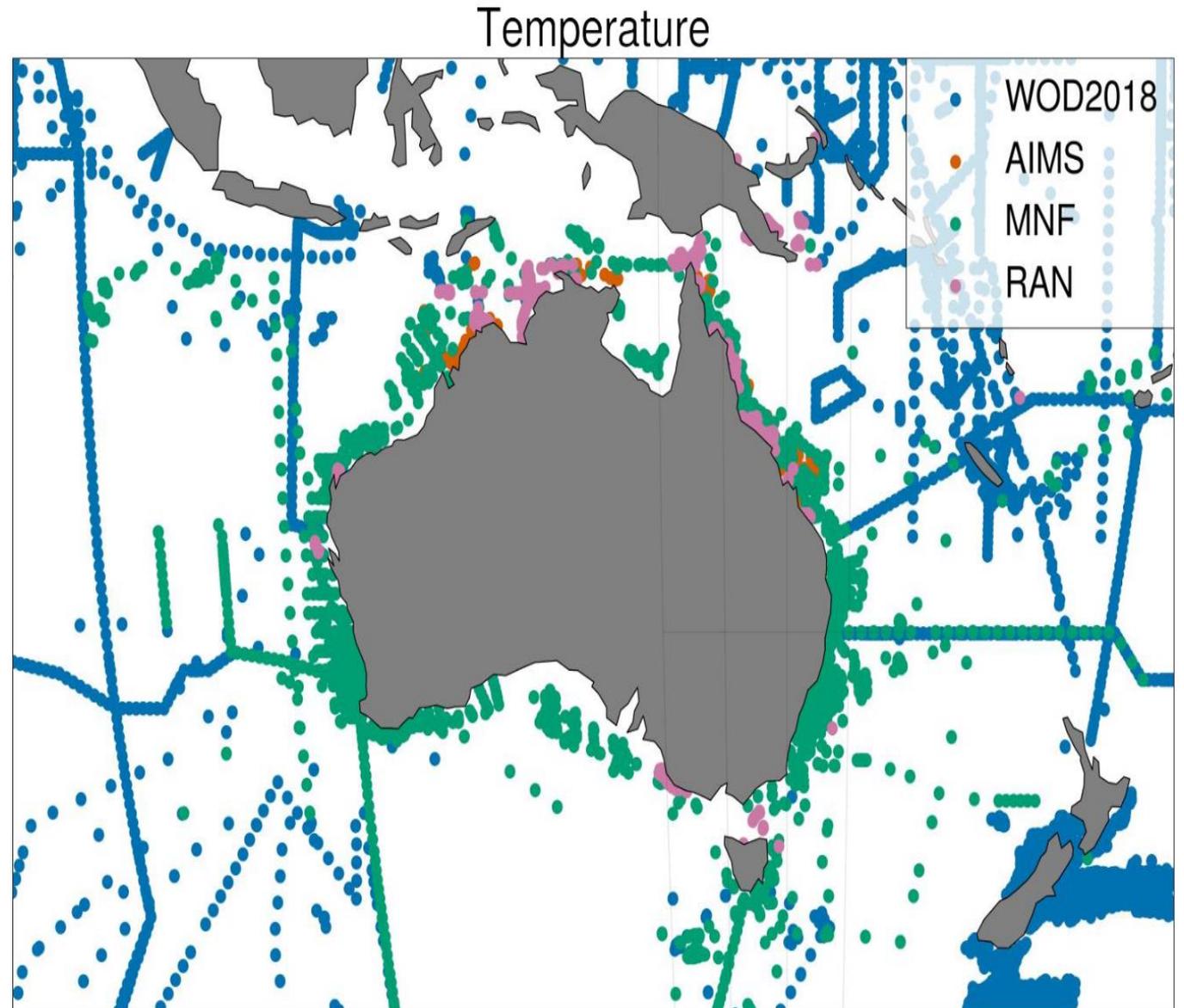
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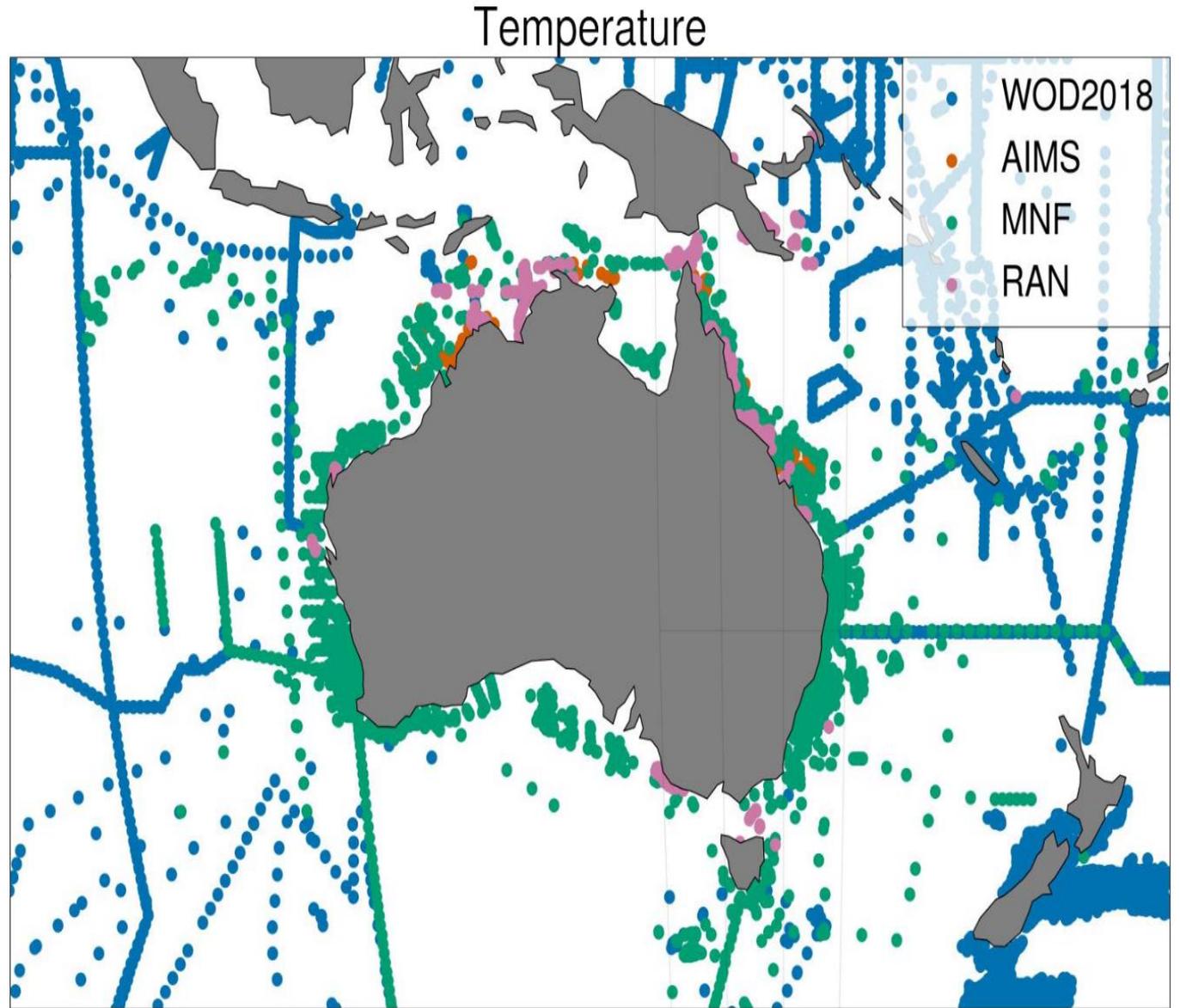
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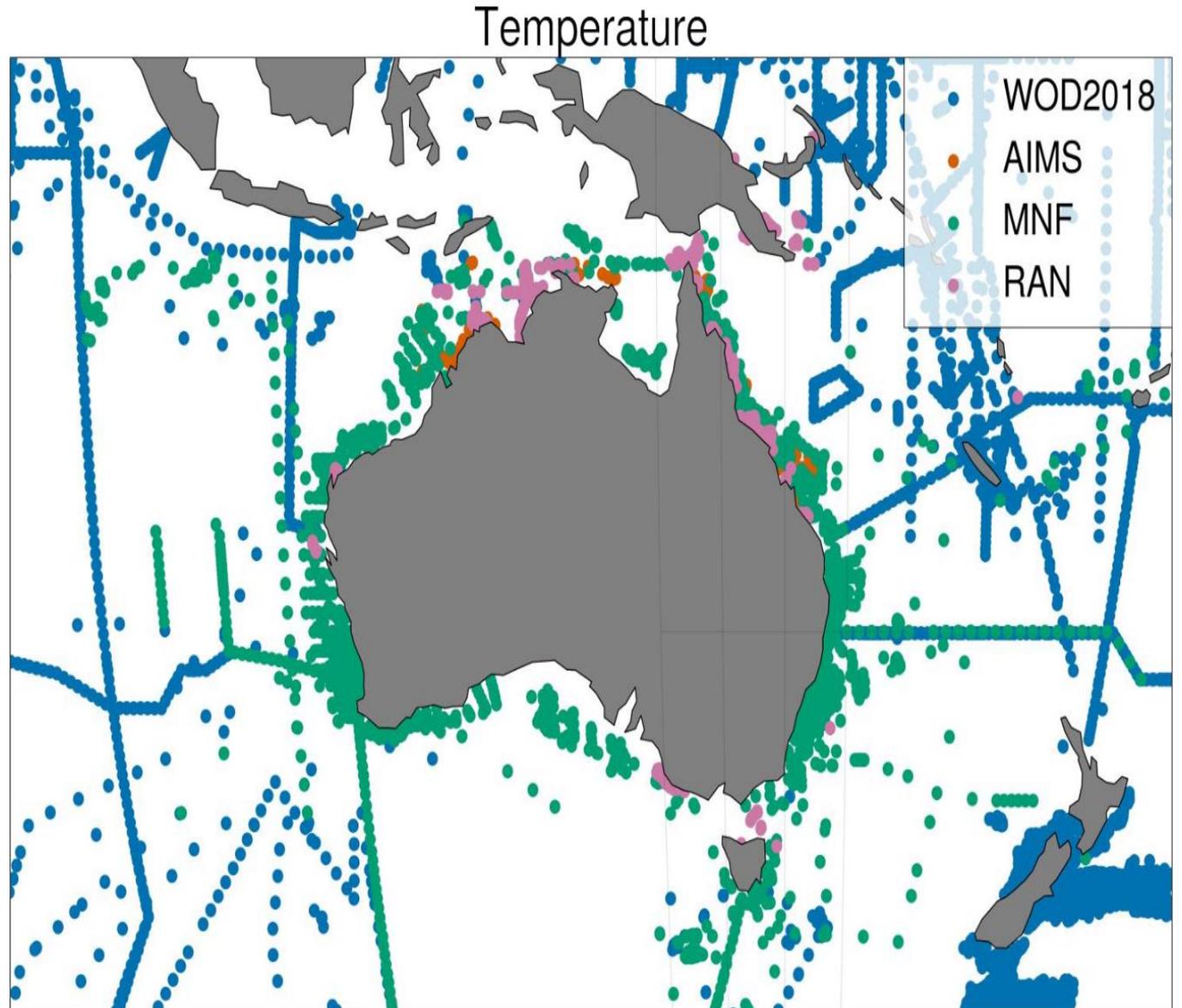
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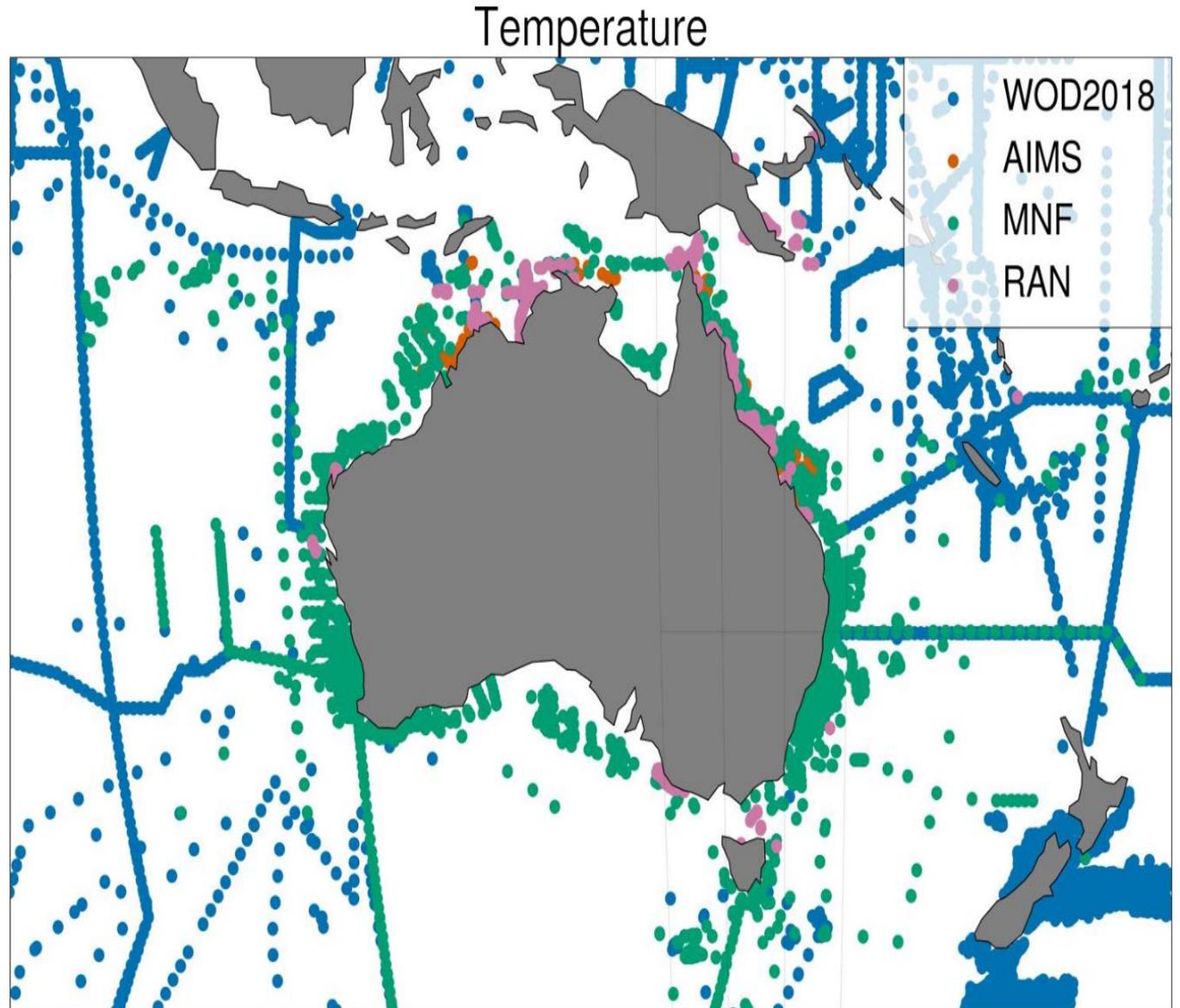
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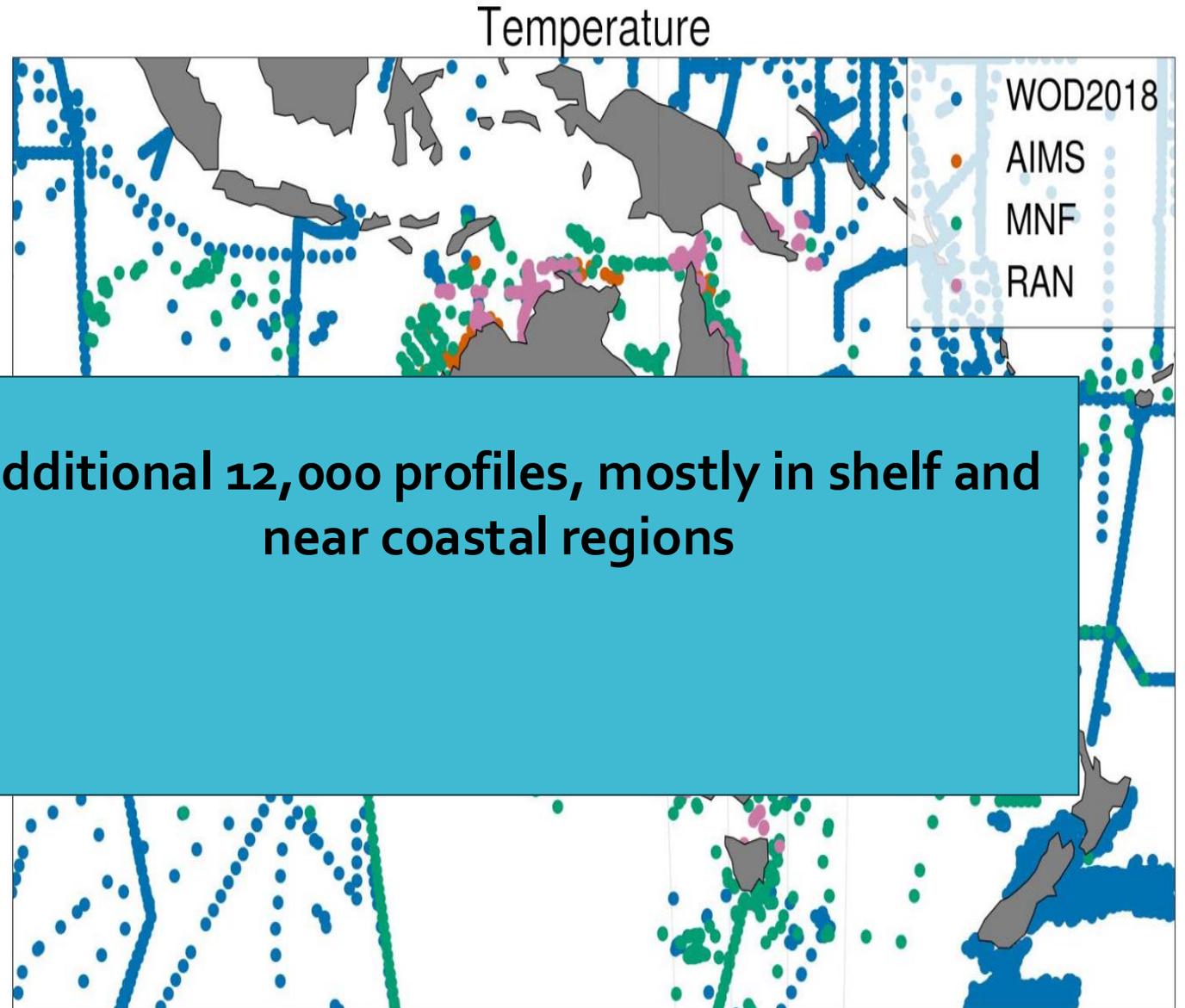
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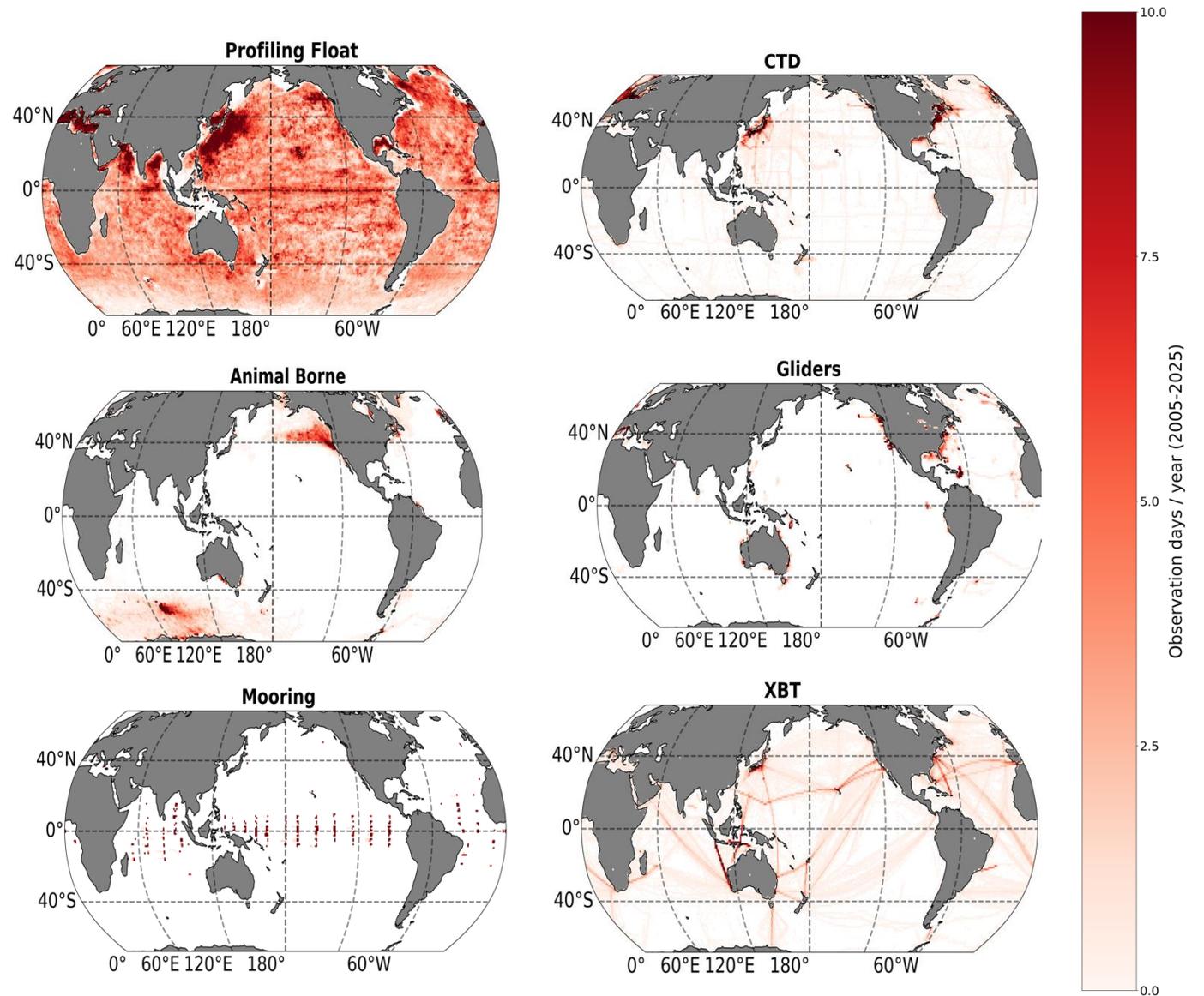
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**Additional 12,000 profiles, mostly in shelf and near coastal regions**



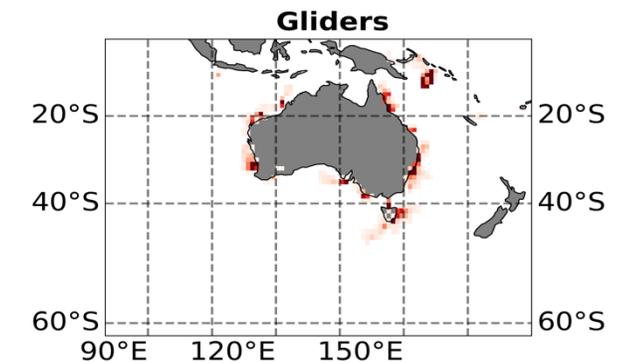
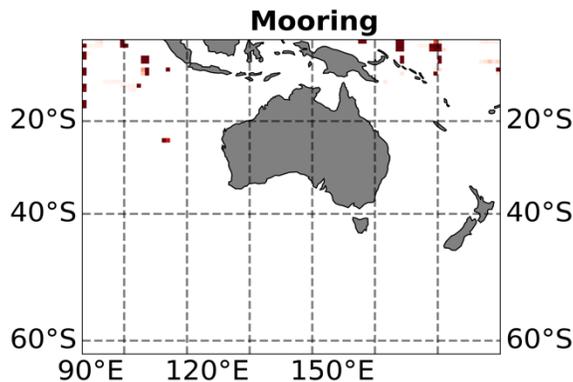
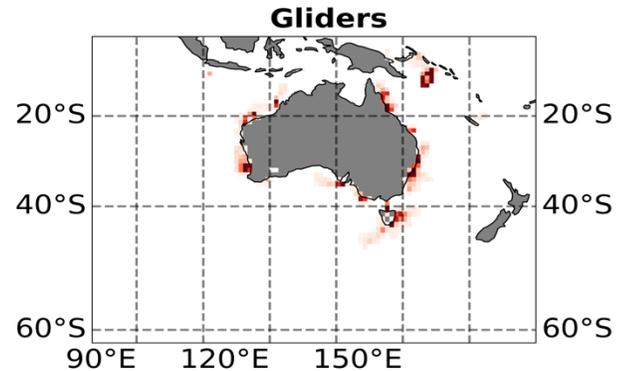
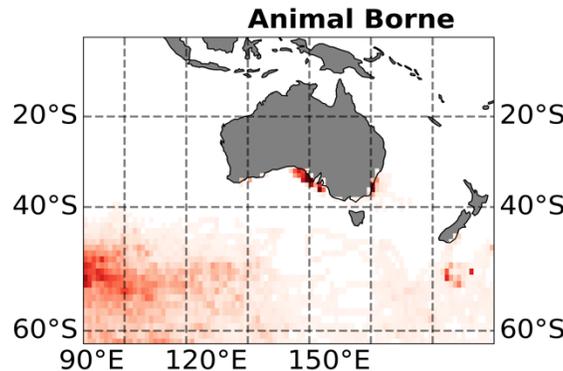
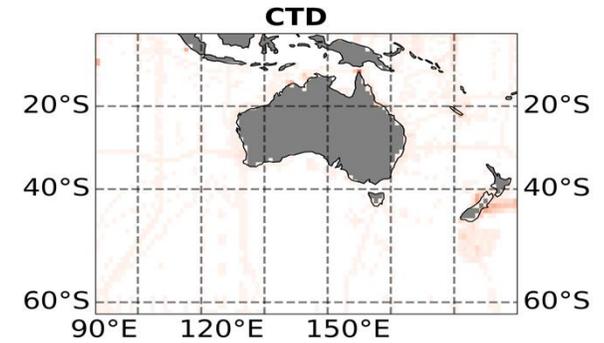
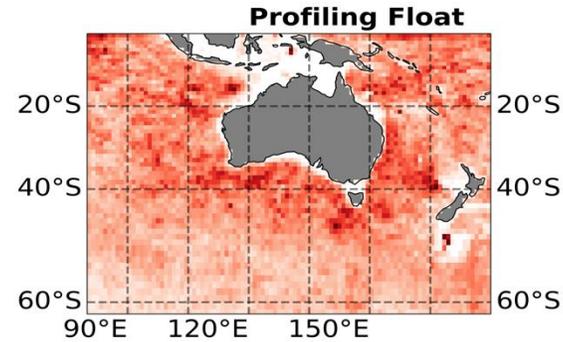
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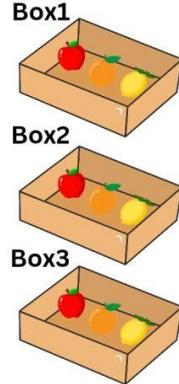
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## CSV VS Parquet

If you want apples only

CSV

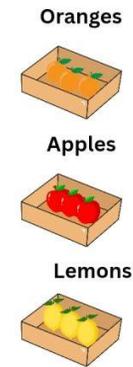
check every box  
(each box is a row)



CSV is Row-based  
takes more space

Parquet

open apples box only



Parquet is column-based  
compressed and efficient

By: Wael Dagash

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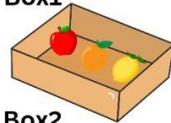
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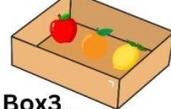
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CSV

check every box  
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Box1



Box2



Box3



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Parquet

open apples box only

Oranges



Apples



Lemons



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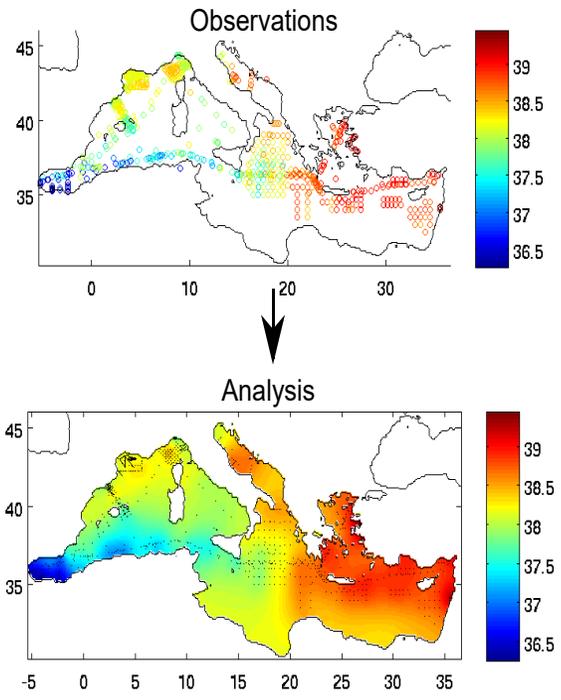
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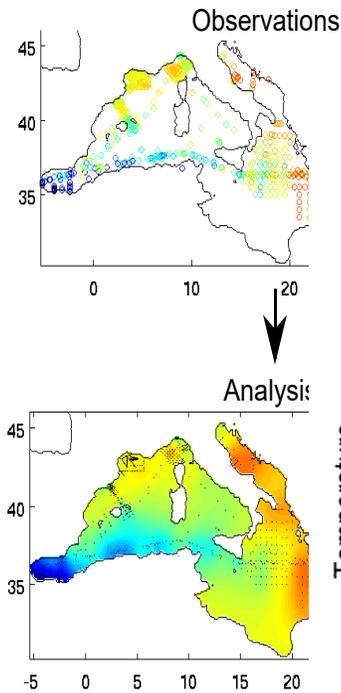
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Source: DIVAnd website: <https://gher-uliege.github.io/DIVAnd.jl/>

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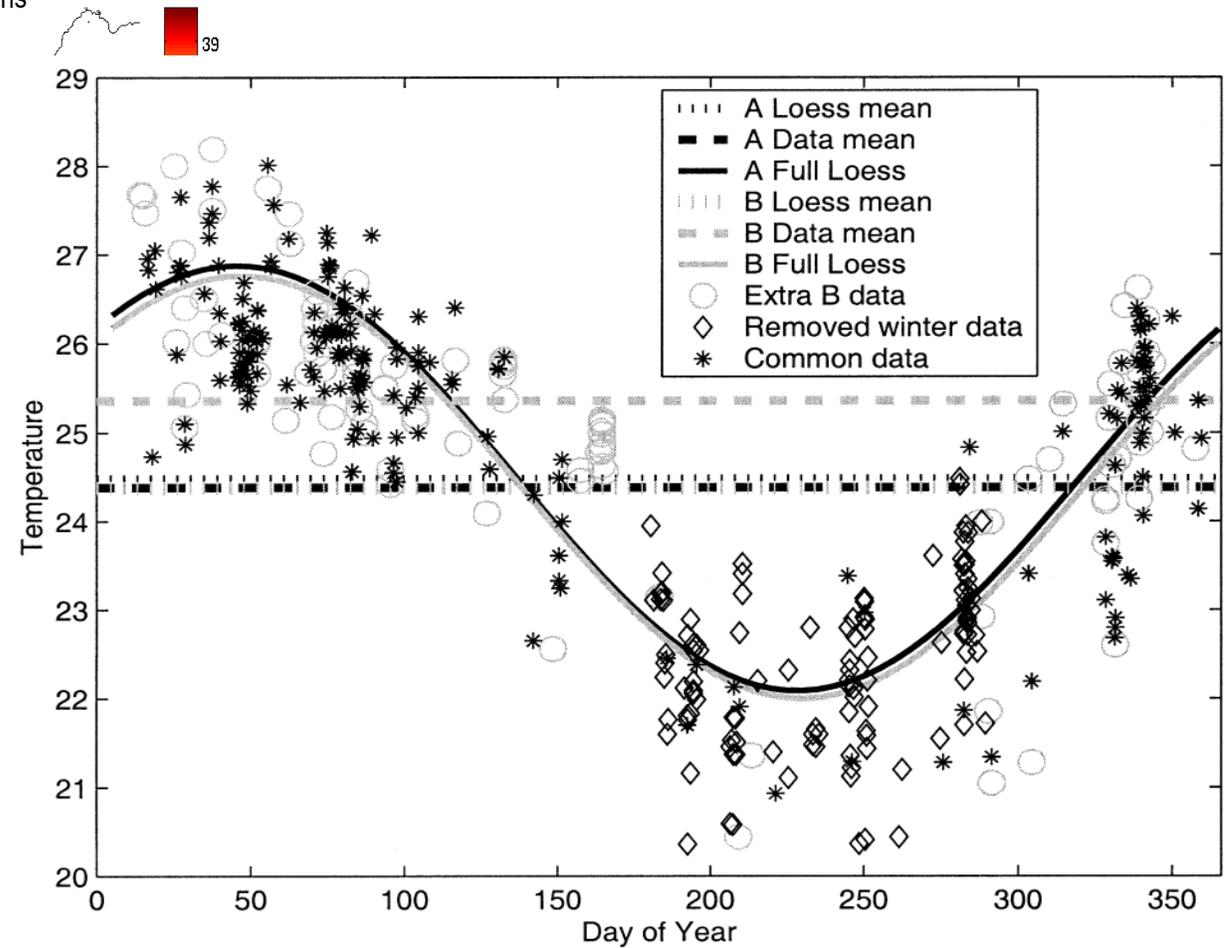
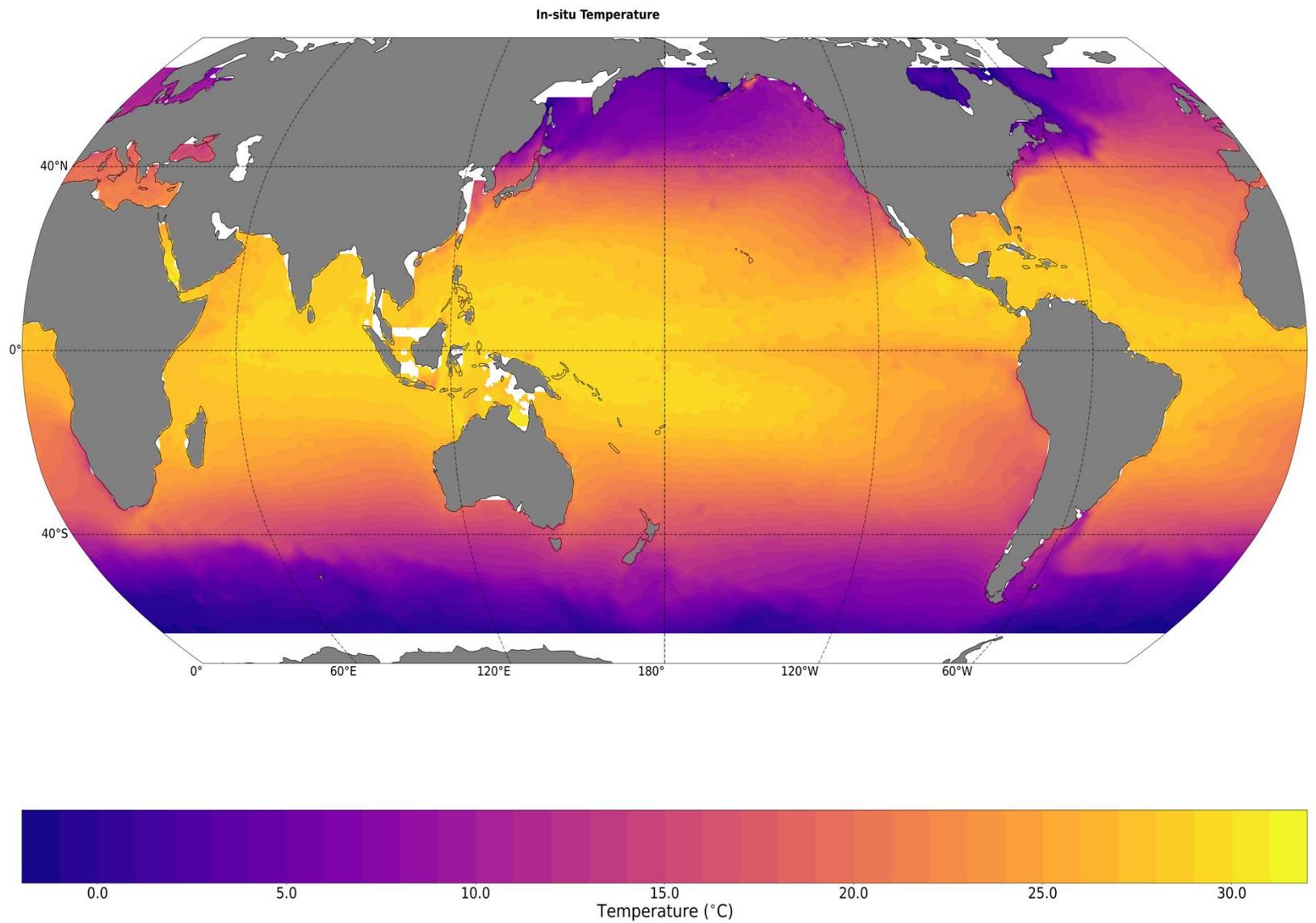


FIG. 9. Surface temperature plotted against day of year for the region (28.2°–21.85°S, 153.5°–160.5°E). The figure legend shows the origin of each symbol and curve plotted in the figure.

Source: Ridgeway et al. (2002)

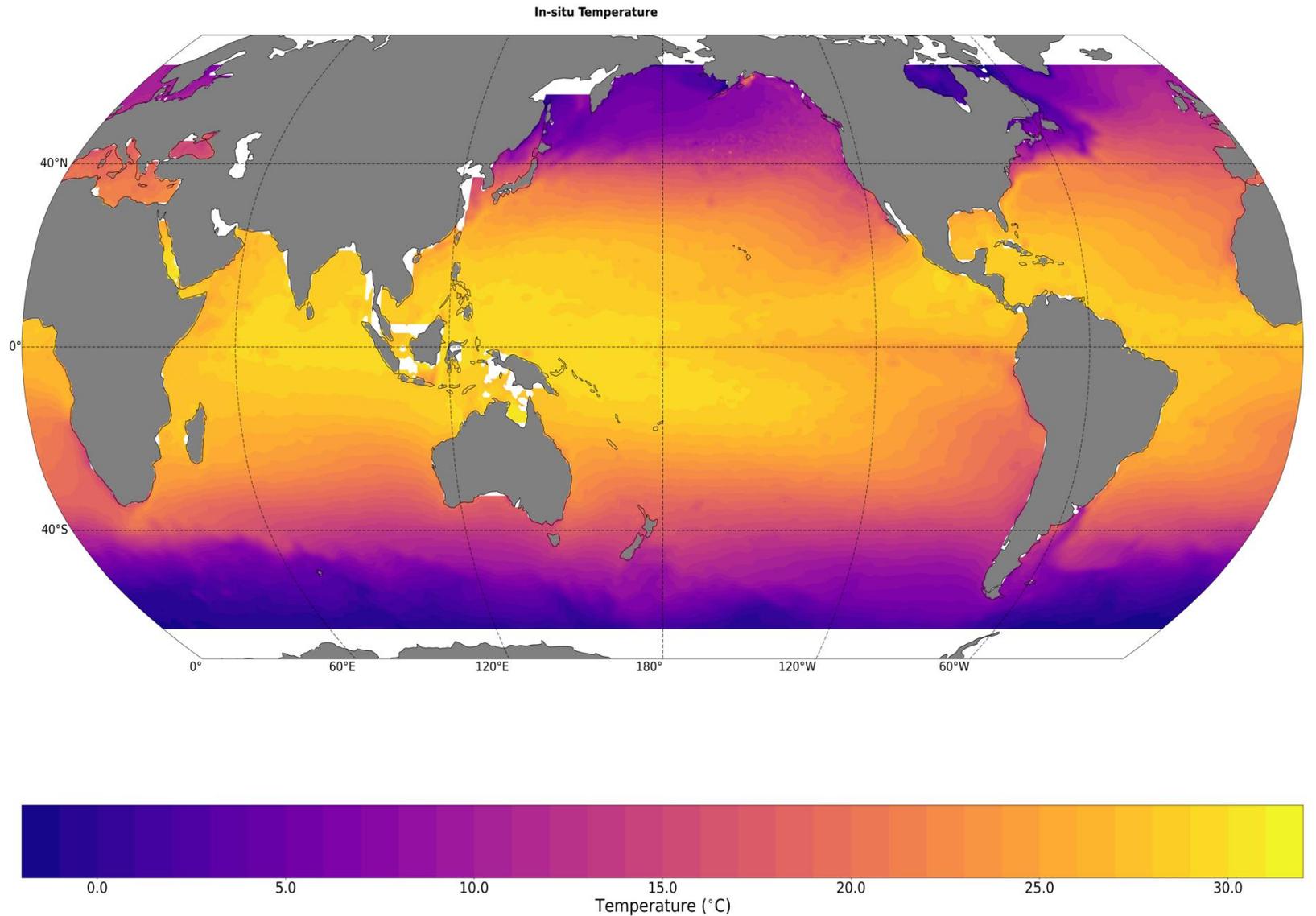
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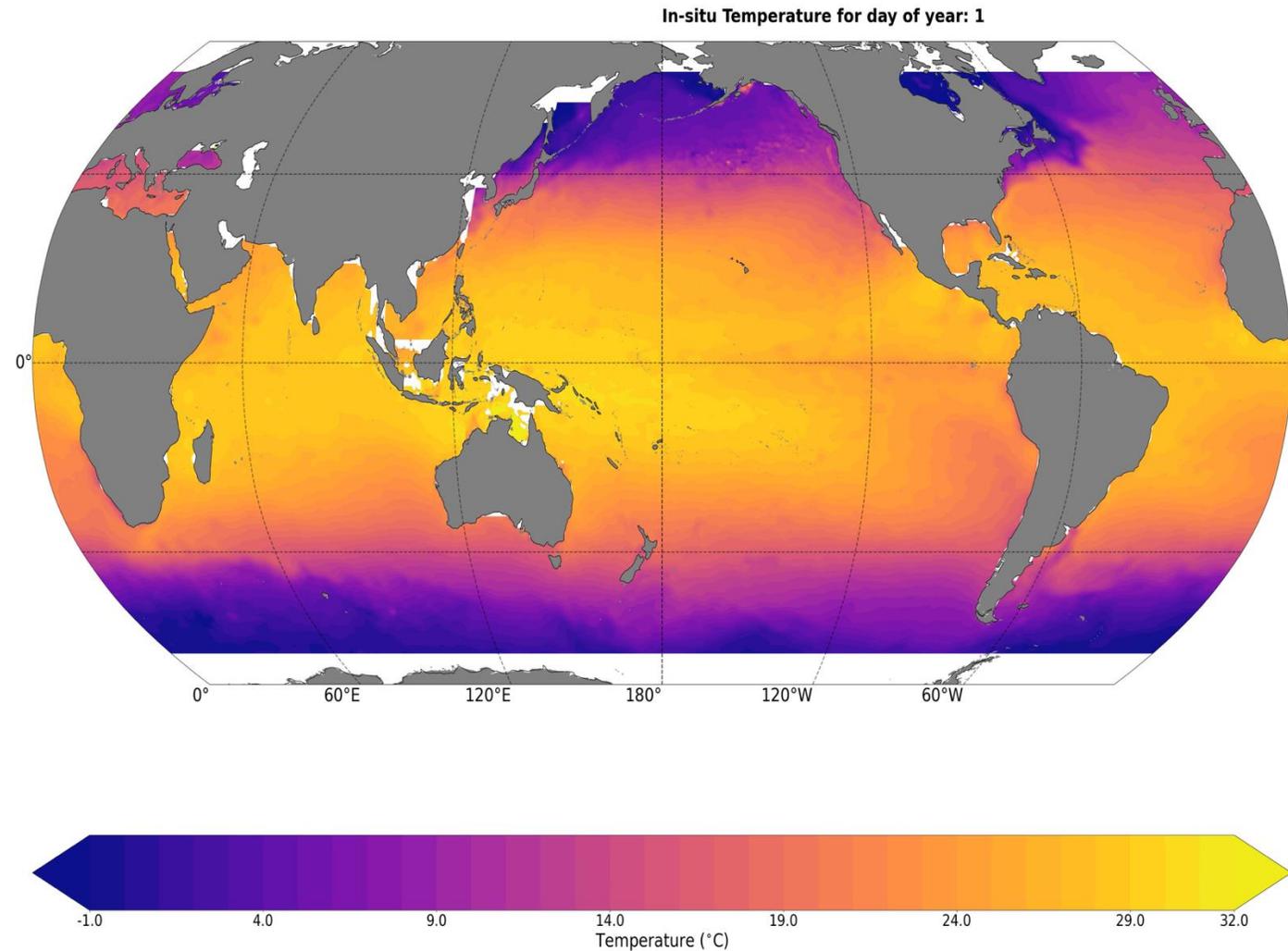
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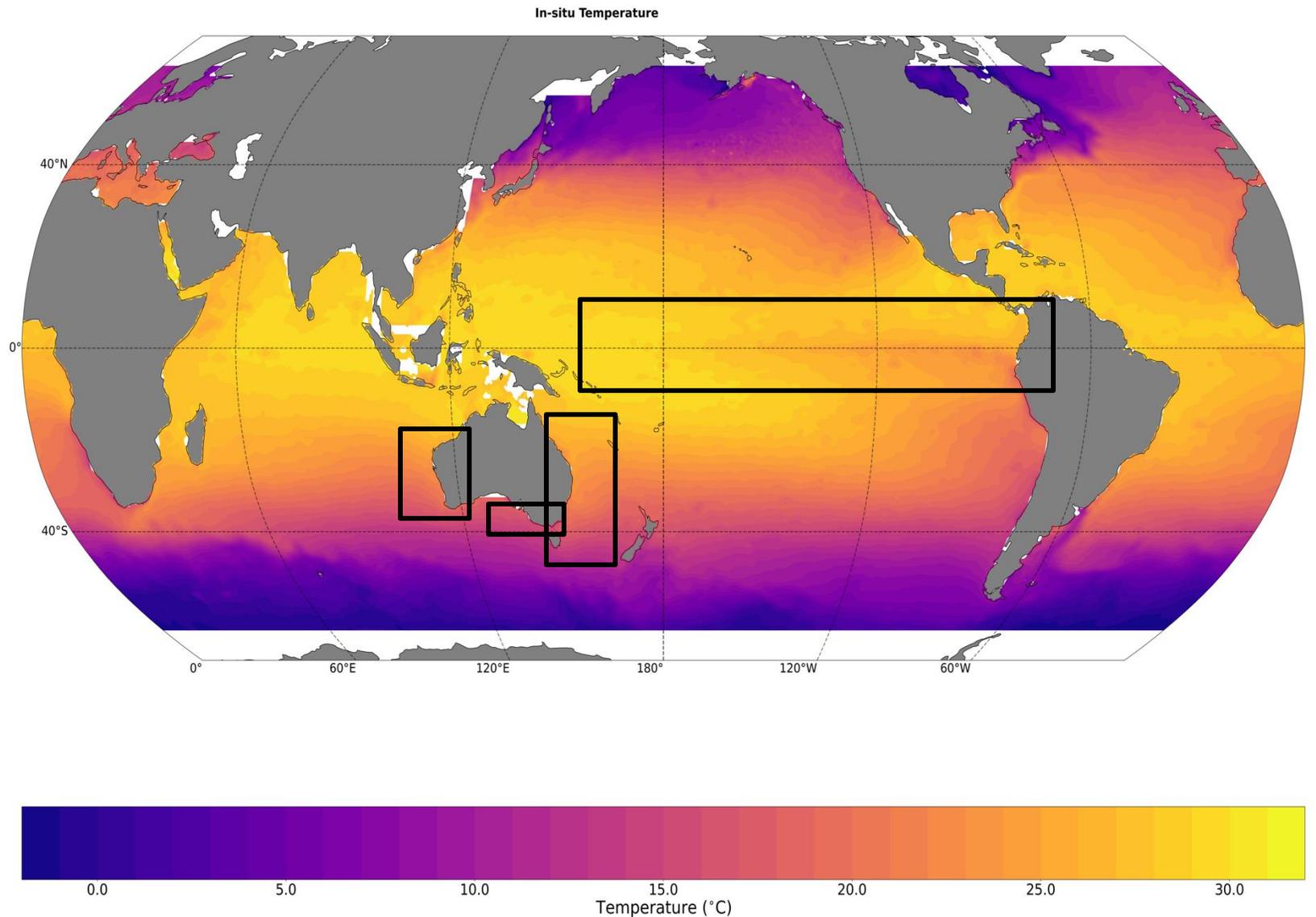
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  - ✓ Updated bathymetry, post map residual screening;



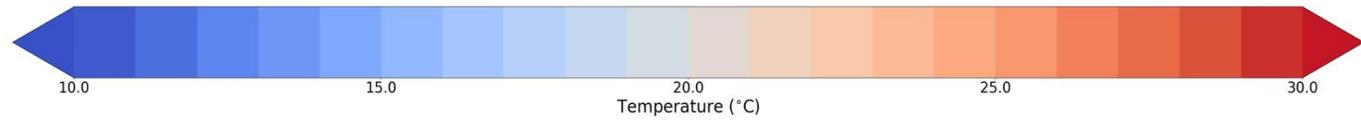
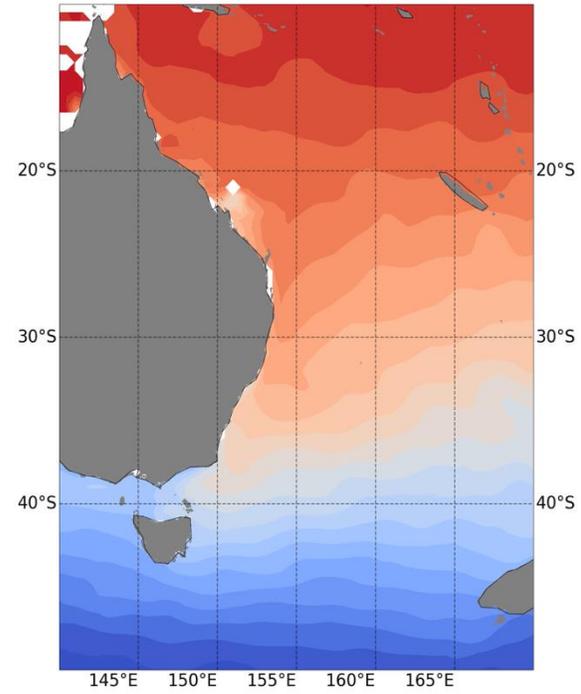
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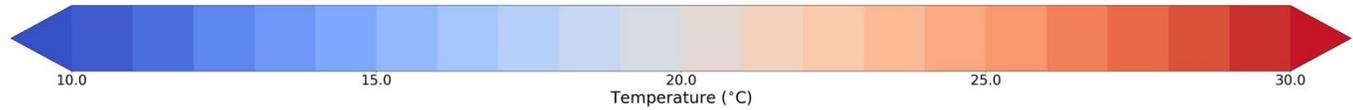
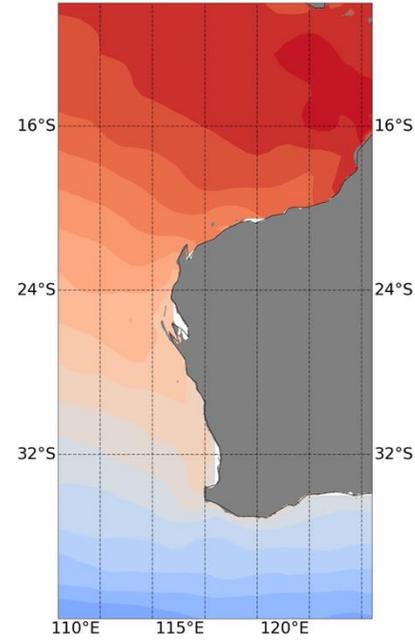
# EAC region

In-situ Temperature for day of year: 1



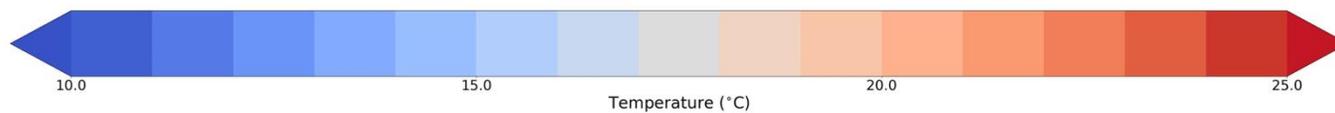
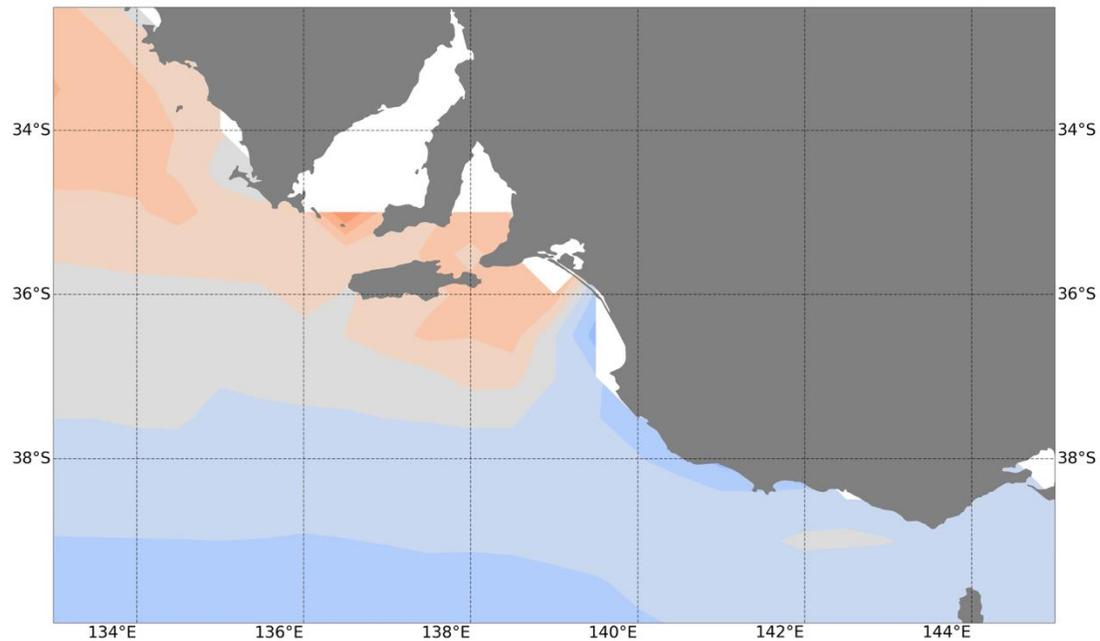
# Western Australia/Leeuwin

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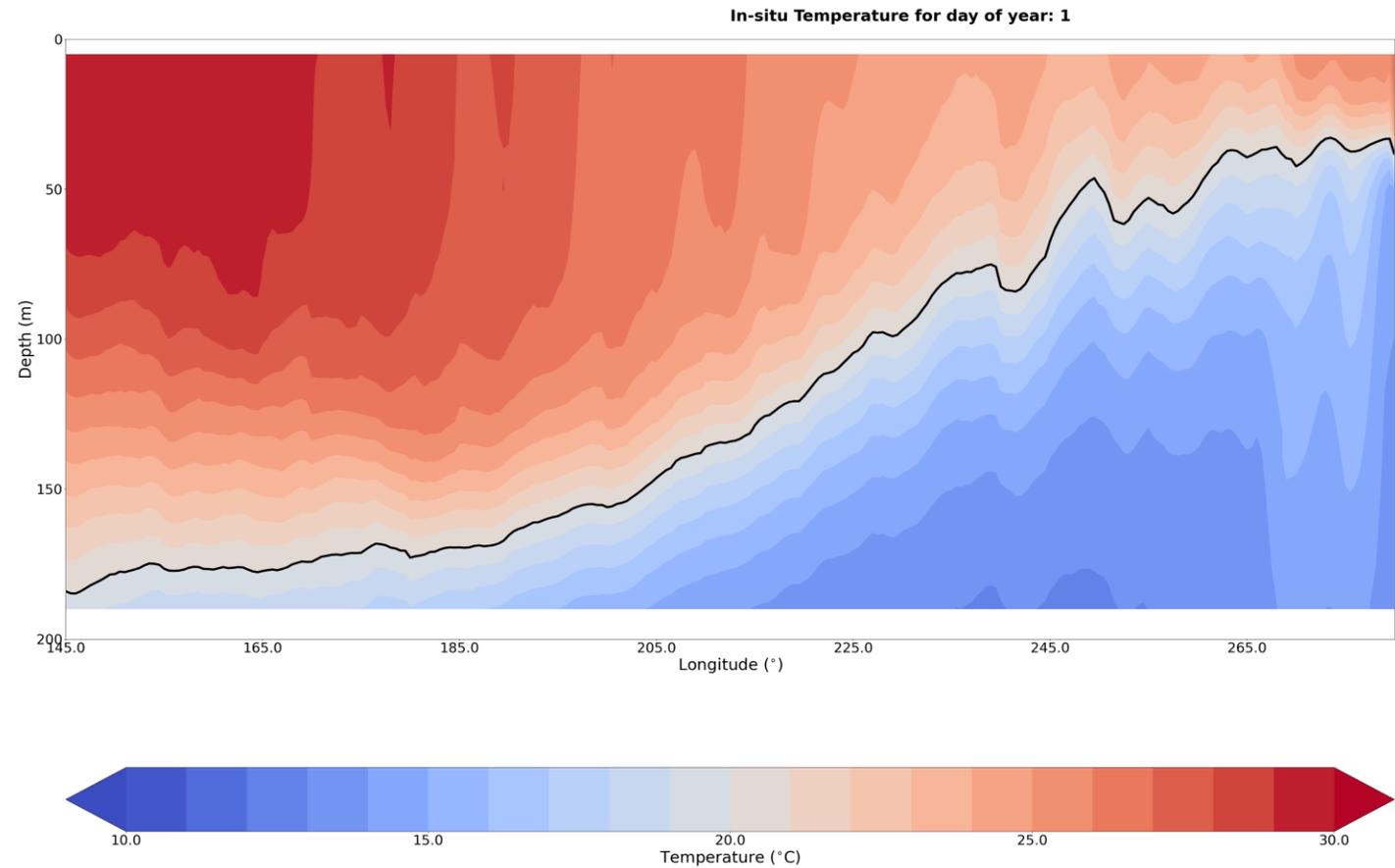


# Bonney upwelling

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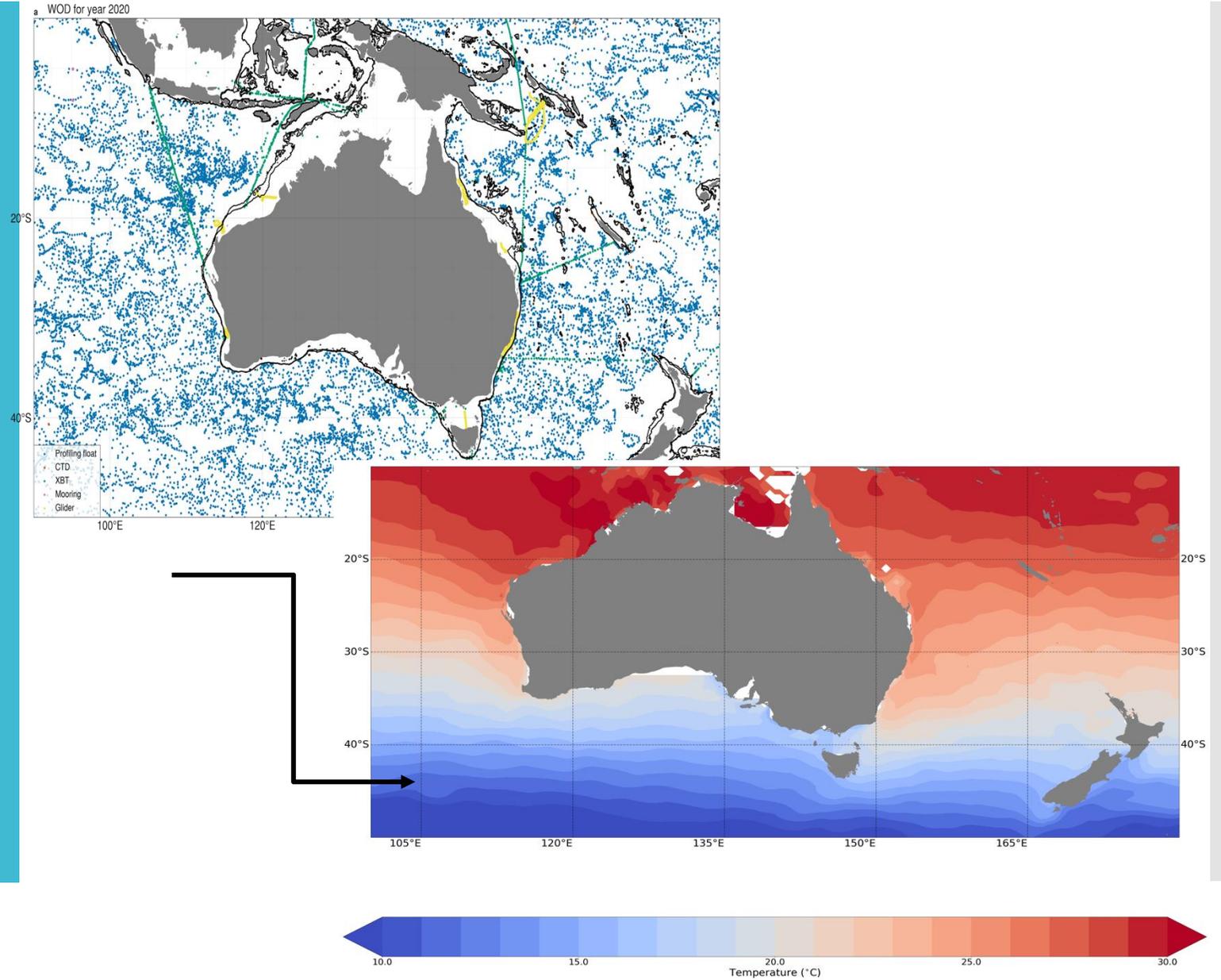


# Equatorial thermocline



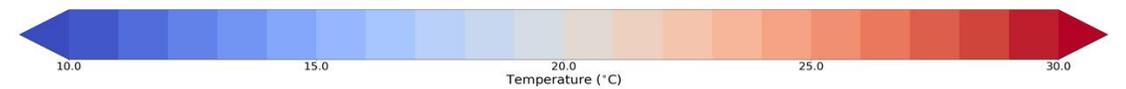
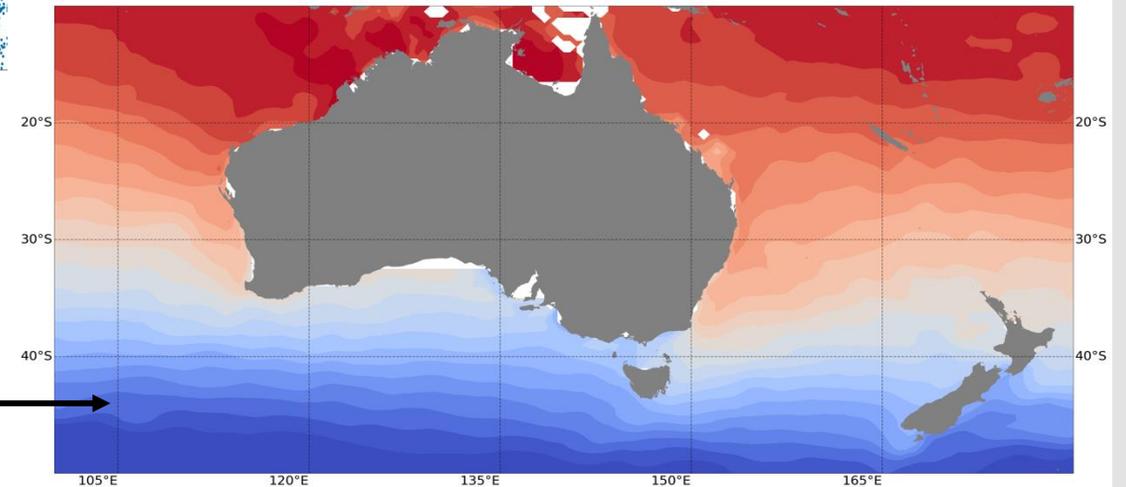
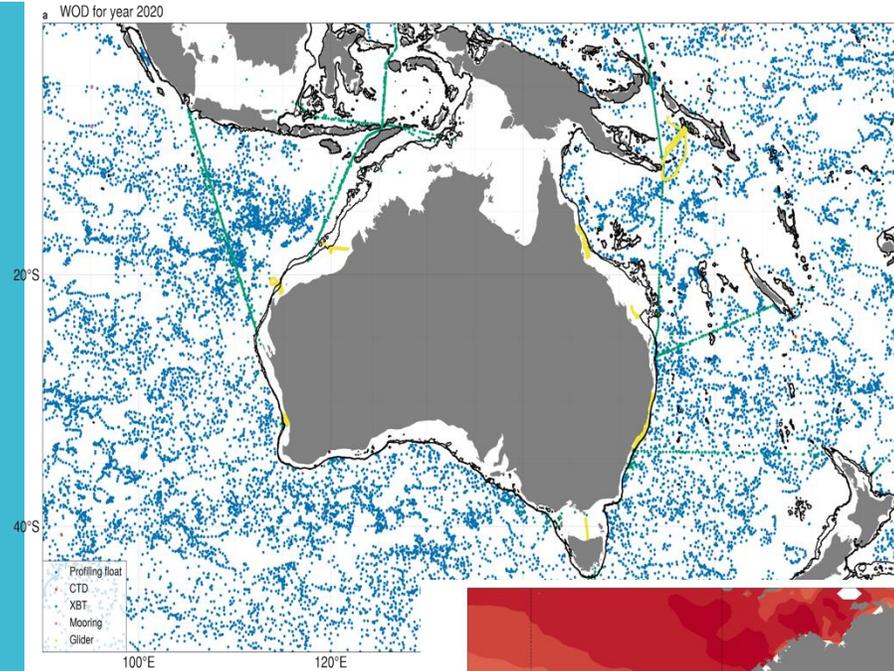
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- Incorporating "boutique" datasets into CODA one-by-one (tedious process but we are getting there)



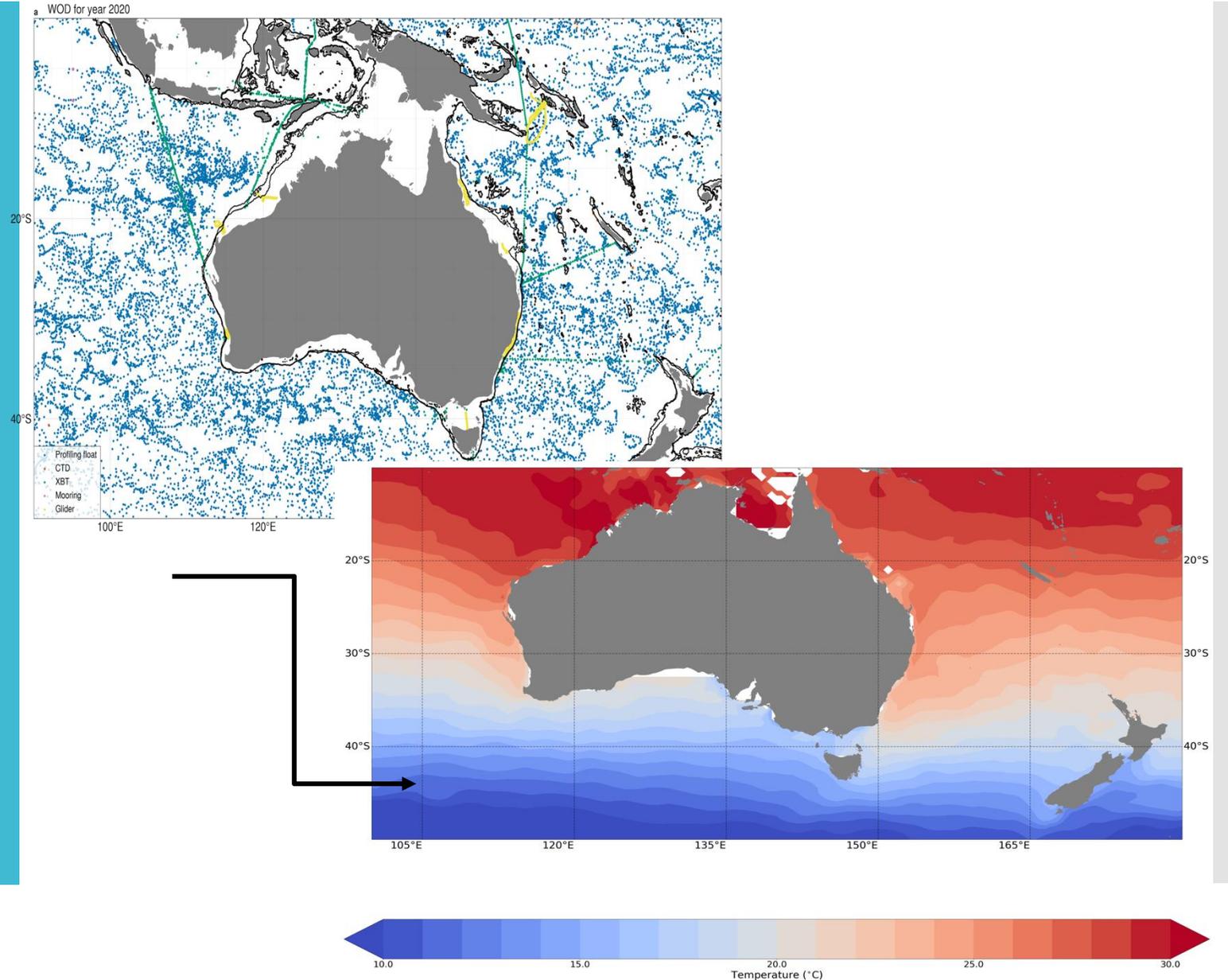
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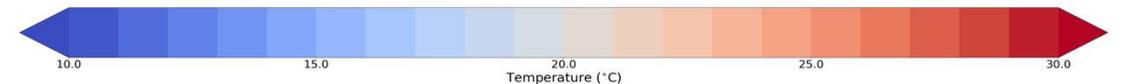
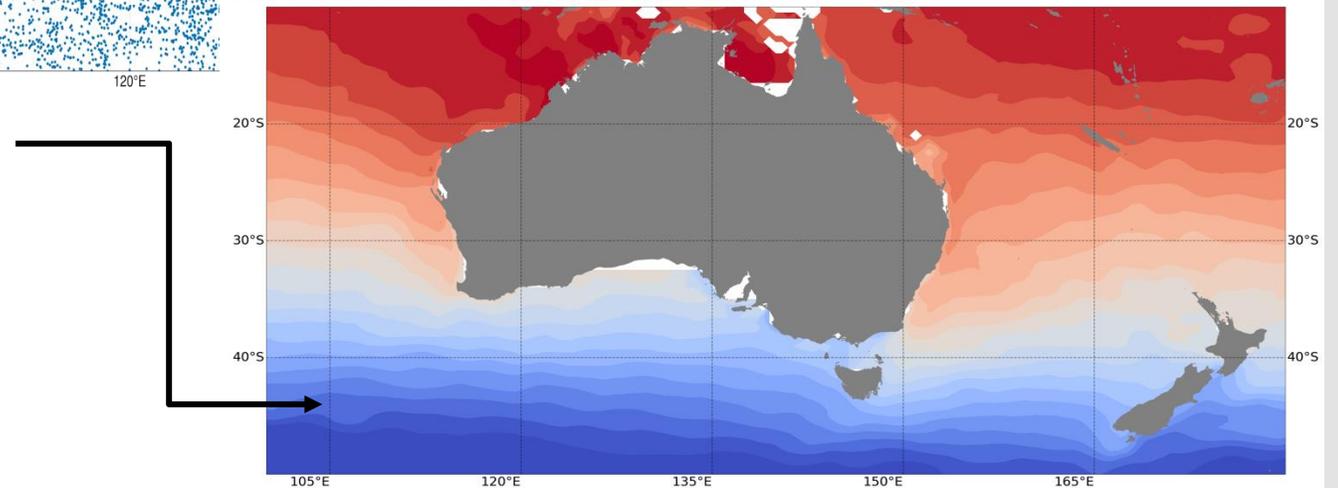
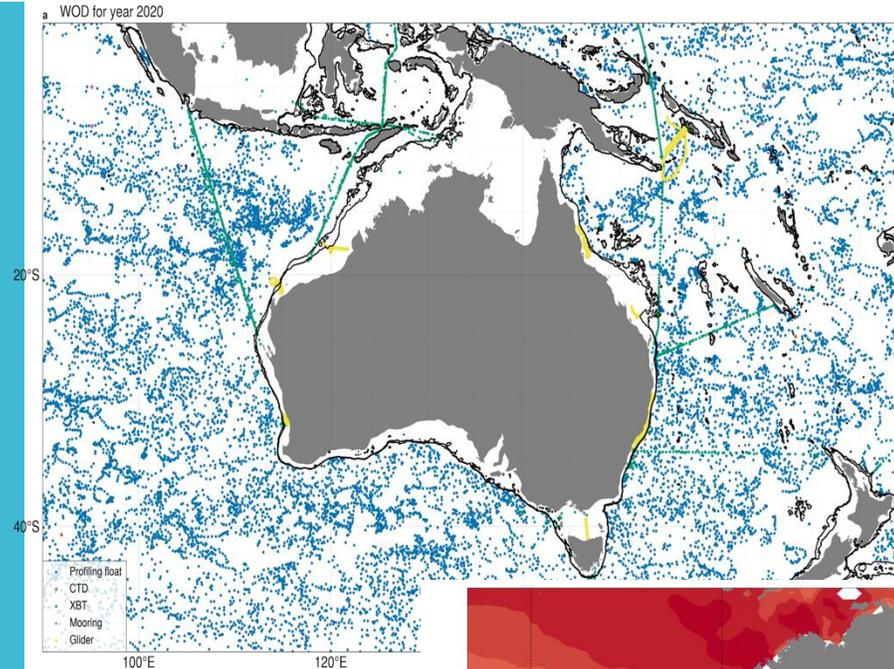
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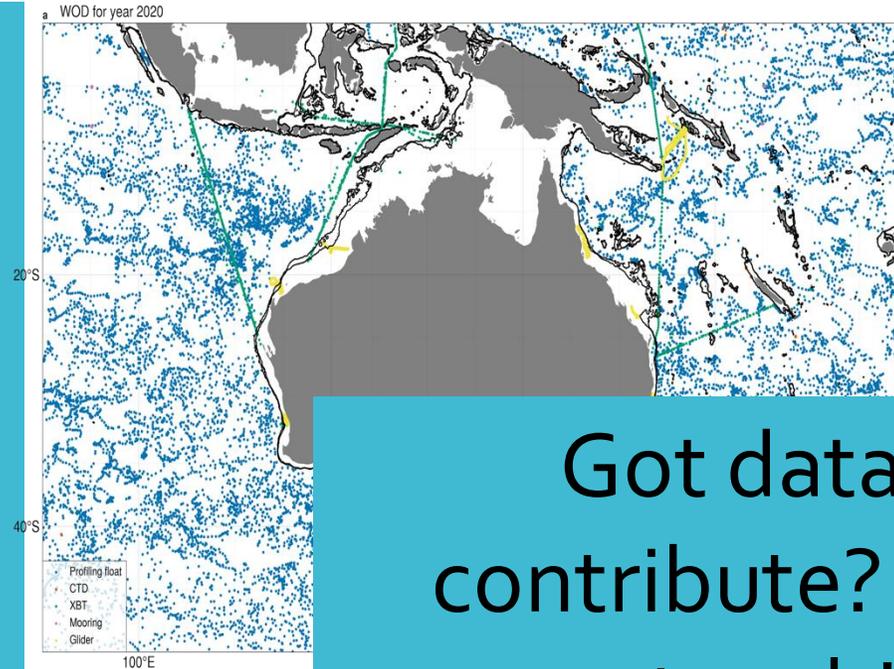
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Got data to contribute? Get in touch!

