





Session: Tracking the Wild: Unlocking Insights into Animal Movement, Behaviour, and Biologging



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# Pangeo-fish: Scalable Geolocation Modelling of Fish Movements Using Biologging and Earth Science Data in the Pangeo Ecosystem

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## Why studying fish movement?

#### Motivation:

- Food security and sustainable exploitation of natural resource
- Study how fish movements and migrations shape the internal dynamics of populations
- knowledge, crucial for improving fishery management and define conservation area
- The International Council for the Exploration of the Sea (ICES):
   Lack of information regarding fish spatial structure and essential fish habitats.

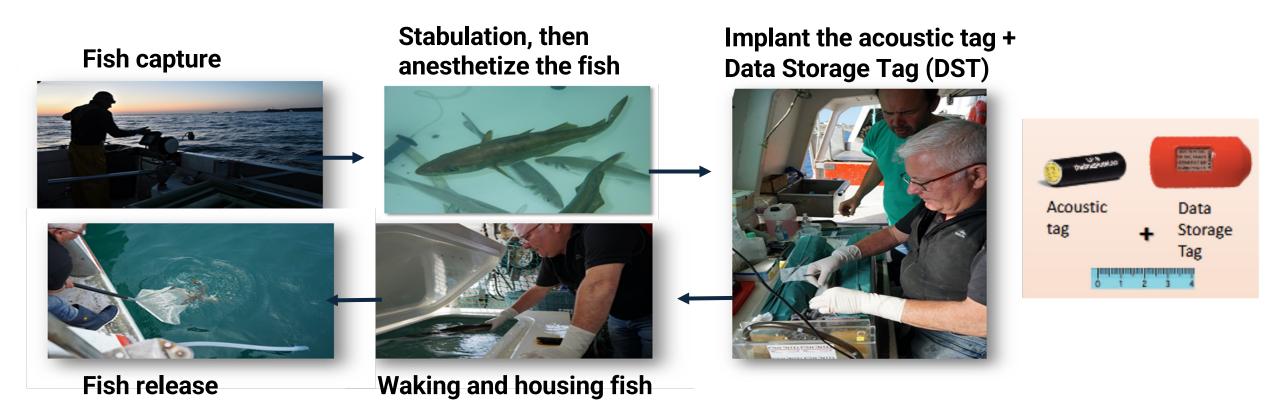








## Bio-logging: studying fish movement



Data Storage Tag: Store time series of observed temperature, depth in a tag.

Acoustic Tag: tag emits signal, detect tagged fish using acoustic telemetry network

Combine both approaches together with earth science data: Infer fish trajectory from individual environmental data histories using geolocation models





## Collecting data storage tag

The incentive program: Mobilizing citizens in the recovery of tagged fish

Project	eaturer_	Year	Nb tagged	Nb returned	%
PNMI	Iroise	2010-2012	246	40	16.2
BARGIP	BARGIP	2014-2016	1220	482	39.5
FISH INTEL	Sea bass	2022	232	59	25.4
	Pollack	2022	70	19	27.1

**Observation Frequency 90 seconds (most of it)** 









#### FISH INTEL



- Stations' locations were based on fishers' knowledge
- 198 stations have been deployed (October 2021 – October 2023)
- Thelma Biotel (TBR 800 RELEASE) in France, VEMCO in the UK and Belgium



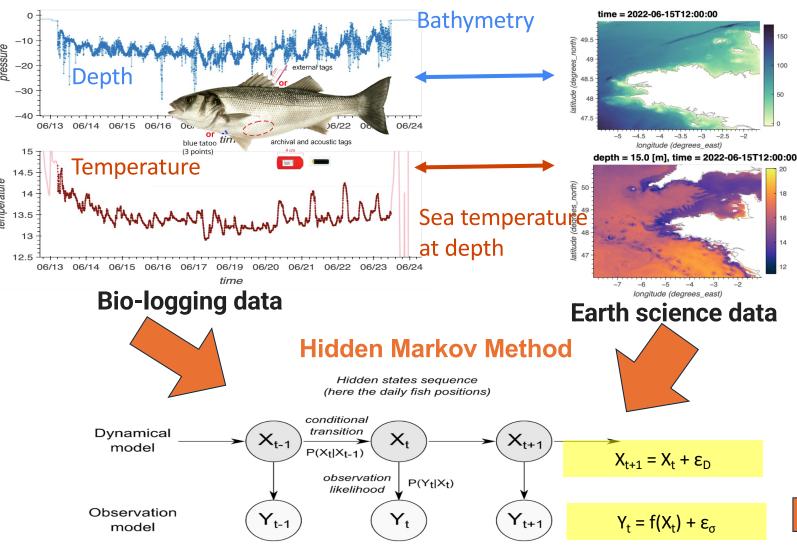
## Acoustic tag detection: Acoustic telemetry network



- The acoustic tag regularly emits a unique identifier over an extended period (1-5 years)
- The receiver can detect acoustic tags (in the tagged fish) that are in the nearby area
- Data shared in ETN (European Tracking Network)



## Reconstruct Fish Track



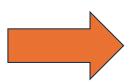
Likelihood of Observed
Temperature at depth by fish from
earth science data

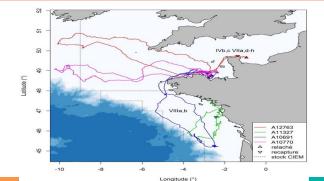
#### **Constrains:**

- acoustic detection,
- bathymetry
- release location
- recapture location

#### **Model: Hidden Markov Method**

Geolocation model developed by Woillez et al. (2016), temperature and bathymetry as reference fields, adapted from Pedersen et al. (2008)





Observations sequence (here the temperature and depth conditions)



#### Software for track reconstruction

- Quality and resolution (spatial and temporal) of earth science data (sea temperature) is crucial for track reconstruction.
- Original HMM software developed in 2016 was not scalable.
- Software workflow
  - Accessing in-situ observe environment data
  - Accessing big earth science data
  - Computation in python
  - Visualisation
- Fish track reconstruction: simillaire workflow as Big Data Geoscience!
- Let's **not reinventing the wheel**, but **using the already existing Scalable Big Data geoscience software stack**, such as PANGEO!

=> Pangeo-fish



## PANGEO?

Pangeo is an open-source platform and ecosystem, designed for scalable and reproducible data analysis in the Earth and climate sciences. It brings together tools for big data processing, cloud computing, and interactive scientific computing.

#### **Key Components:**





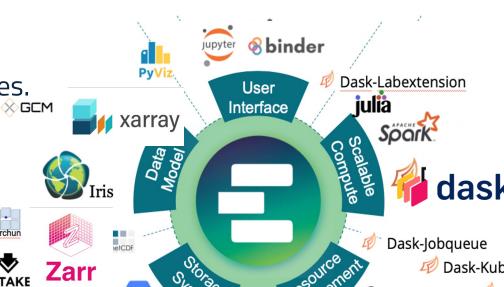
- **Jupyter**: for interactive development and visualization.
- Intake: for managing and loading data catalogs.
- **Zarr**: for cloud-optimized data storage.
- **Kerchunk**: for virtualizing access to remote NetCDF/HDF5 files.

#### What Pangeo enables:

- Scalable workflows with terabytes of data
- ARCO (Analysis Ready Cloud Optimised) Format
- Analysis directly in the laptop / cloud / HPC environments.
- Collaborative and reproducible science using open-source tools.



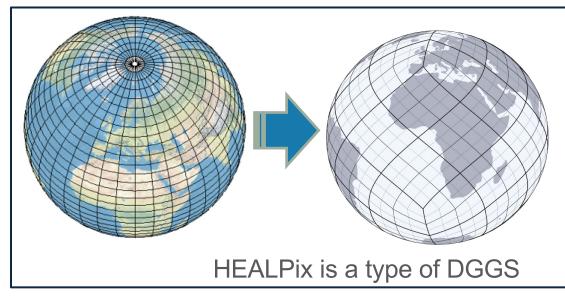






## Pangeo-fish and HEALPix





"A Discrete Global Grid System (DGGS) is a spatial reference system that uses a **hierarchical** tessellation of cells to partition and address the globe." OGC Abstract Specification, 2017

**Equal Area**, Seamless Global Coverage, and Multi-Scale. Expand possible fish tracking system to globa application!!



Data Consistency with HEALPix(DGGS)

- Overcoming challenges related to unequal cell surface areas.
- xdggs to easily access and visualise HEALPix data

Pangeo ecosystem and HEALPix for computing fish-track = Pangeo-fish



## **GRID4EARTH: HEALPix**



#### **Common DGGS for DestinE and Copernicus Sentinel Data**

Grid4Eart

**dask** 

- Part of ESA's Digital Twin Earth (DTE) Framework
- GRID4EARTH project aims to develop a unified, standardized data infrastructure





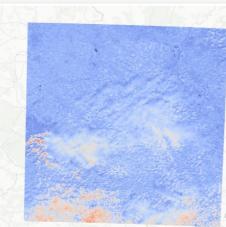
• Addresses growing complexity and volume of EO data (e.g., Copernicus and DestinE programs)



Funded by: The European Space Agency

#### **Consortium Members:**

IFREMER, CNRS, Simula, The University of Tartu, GEORODE



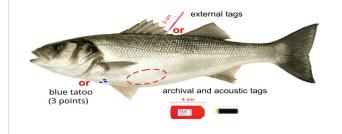


#### Conclusion



The Journal of

Open Source Software



- Pangeo-Fish is a **generic and reusable tool** for analyzing fish biologging data.
- Promotes synergy between biology and Earth science through the use of shared, open-source tools.
- Thanks to Pangeo eco system and HEALPix, the geolocation model is ready for intensive use with higher-resolution geophysical reference data, enabling more accurate reconstructions.
- Submitted to JOSS( under review)
- Install via pip install pangeo-fish
- © GitHub: github.com/pangeo-fish/pangeo-fish
- This work demonstrates how open, FAIR, and scalable eScience tools can bridge data gaps in marine ecology and support biodiversity conservation in a changing ocean.







#### Thank you for your attention!



Questions? Tina.odaka@ifremer.fr

