



Drifter Quality control

A focus on C-RAID ocean drifters reprocessing:
Improve the access to historical drifter data

In situ

Ifremer, Copernicus Marine & Copernicus in situ

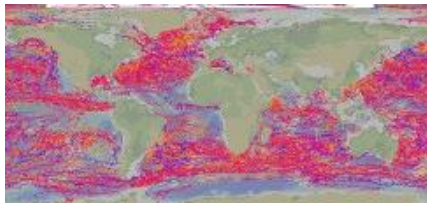




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C - RAID DRIFTING BUOYS PROJECT

- C-RAID project is a global rescue and reprocessing of drifting buoys data. The C-RAID dataset contains the metadata of 20.000 drifting buoys, deployed between 1979 and 2018.
- During “C-RAID phase 1”, the data of 10.035 drifting buoys deployed between 1997 and 2010 have been delayed mode processed (including comparison with Copernicus ERA5 reanalysis).
- The project is continuing in 2022-2033 as “C-RAID phase 2” to reprocess drifting buoys data deployed before 1997 and after 2010.





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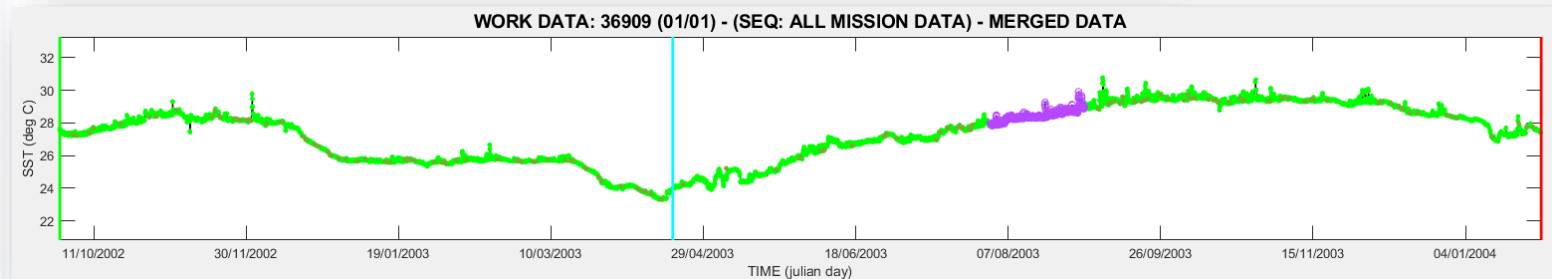
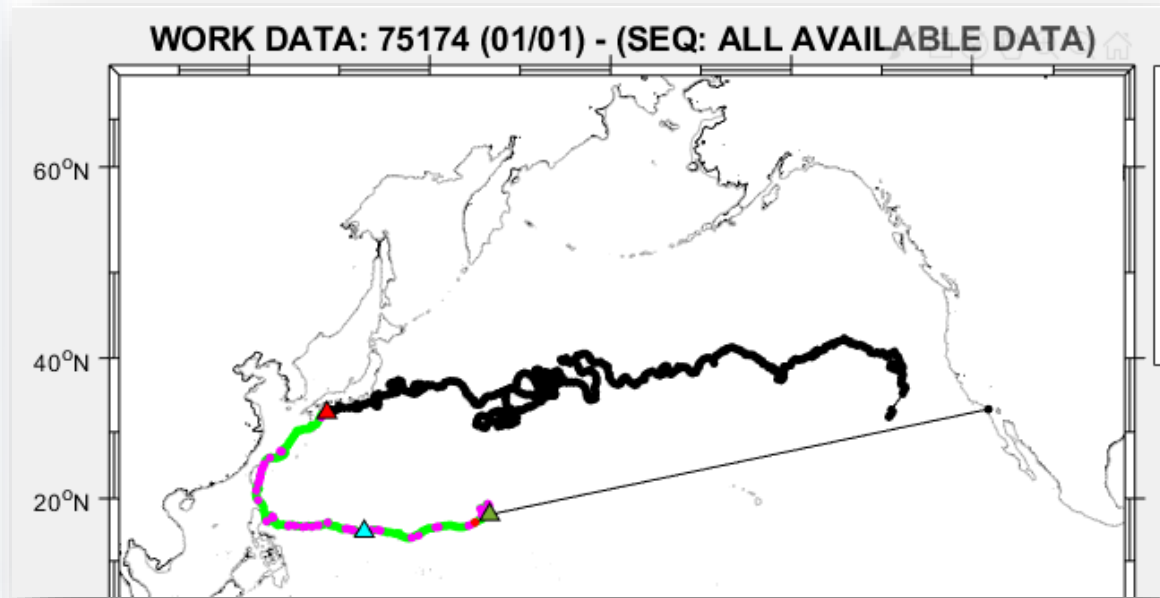
C - R A I D d e l i v e r a b l e s

- C-RAID deliverables
 - 1) An improved drifting buoys data archive
 - 2) FAIR interfaces to drifting buoys data :
 - Web data discovery for human users
 - API for data discovery/subsetting/download services (machine-to-machine data access)
 - “Improved drifting buoy data record”
 - Missing datasets and parts of datasets recovered -> data rescue activity
 - Homogeneous and rich metadata and data NetCDF format
 - Homogeneous QC and assessment on marine and atmospheric data
 - Matchup with Copernicus ERA5 reanalysis (temperatures, atmospheric pressure, wind)



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Two examples of improved data record





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C - R A I D data distribution

- C-RAID data, metadata and documentation are published on <https://doi.org/10.17882/77184>
 - Complies with FAIR data rules
 - Findable DOI published on DataCite, google indexed (Schema.org)
Link with bibliography and authors bibliography (ORCID)
 - Accessible One click download, anonymous access
Links to big data services
 - Interoperable CF and SeaDataNet standards, QC documented, rich metadata
 - Re-usable CC-BY license
- C-RAID metadata are transmitted to OceanOPS team (IODE-WMO)

The screenshot shows a web page for 'Data Buoy' with the title 'C-RAID improve the access to historical drifter data: Copernicus Reprocessing of Argos and Iridium Drifters (C-RAID)'. The page includes a metadata section with fields for Date, Author(s), Affiliation(s), DOI, Publisher, and Abstract. There is a 'Click to download the data' button with a 'DATA' icon. Two world maps are displayed on the right. A 'Data' table lists two datasets: 'C-RAID phase 2 dataset' (15 GB, NC, NetCDF, Quality controlled data, Open access, 86062) and 'C-RAID phase1 1997-2010 period' (13 GB, NC, NetCDF, Quality controlled data, Access on demand, 78610). A 'How to cite' section is at the bottom, providing the citation: 'Zunino Rodriguez Patricia, Rannou Jean Philippe, Poli Paul, Blanc Frédérique, Carval Thierry, Billon Christophe (2021). C-RAID Improve the access to historical drifter data: Copernicus Reprocessing of Argos and Iridium Drifters (C-RAID). SEANOE. https://doi.org/10.17882/77184'. The page footer contains 'CONTACT' and 'LEGAL NOTICE'.

C-RAID buoys DOI <https://doi.org/10.17882/77184>

One click download of data ([https](https://doi.org/10.17882/77184))

Authors ORCID

Data licence

Documentation (NetCDF format, QC manual)

Dashboard and its API

ERDDAP server

Data charts explorer

How to cite statement

And more...

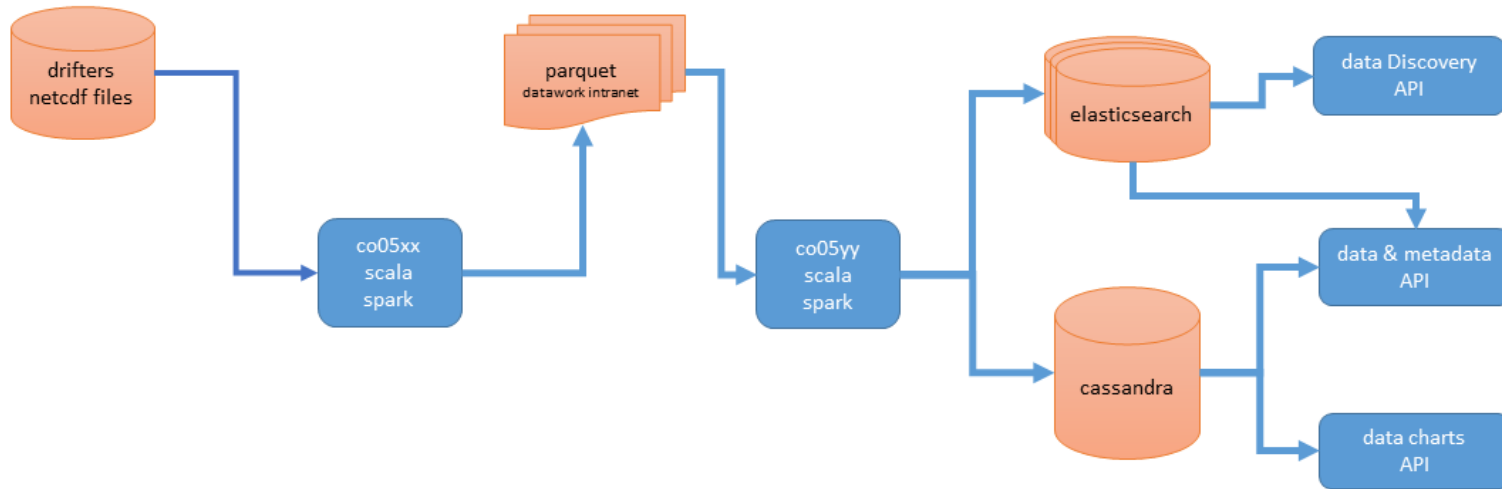


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C - RAID Drifters bigdata infrastructure

- Data discovery and subsetting API on Ifremer big data infrastructure
NetCDF - Parquet - Cassandra NoSql – Elasticsearch - API

Drifting buoys bigdata architecture





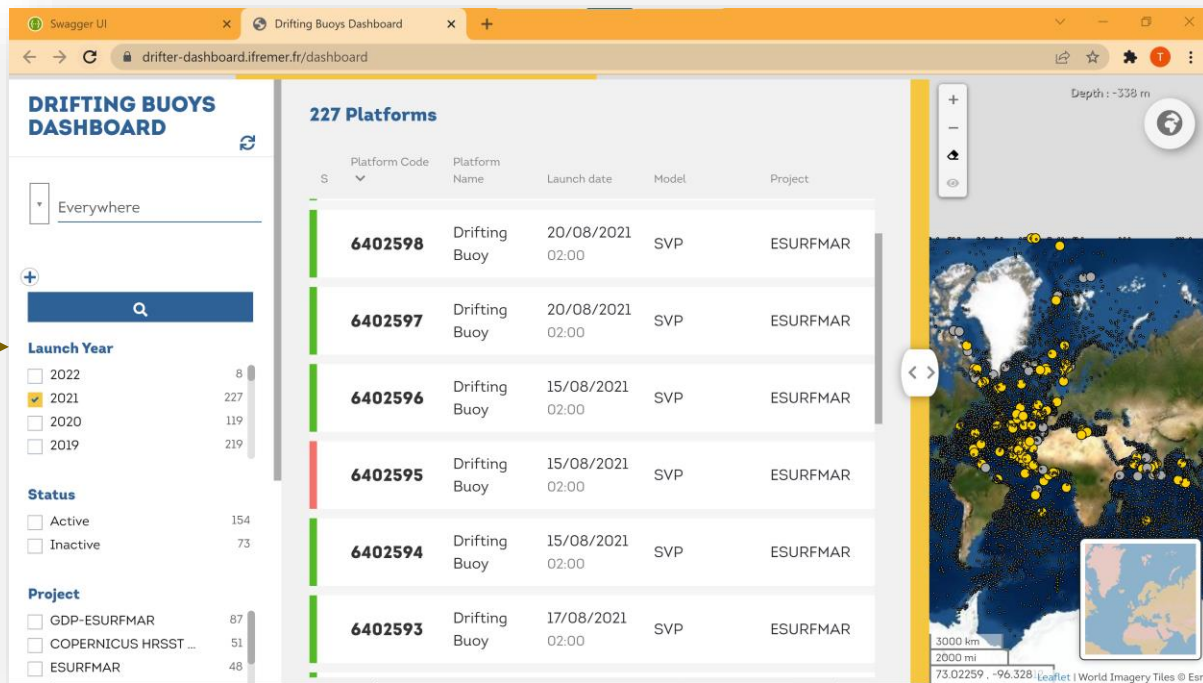
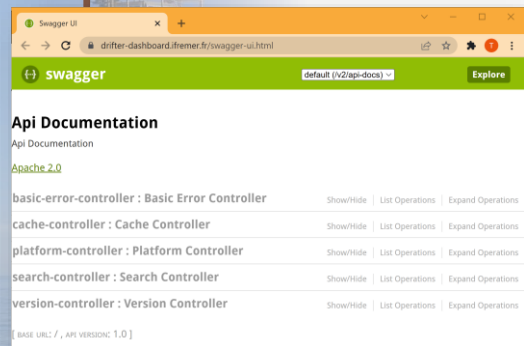
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C-RAID Drifters big data infrastructure

- The drifting buoys API and its dashboard are online

<https://drifter-dashboard.ifremer.fr>

<https://drifter-dashboard.ifremer.fr/swagger-ui.html>

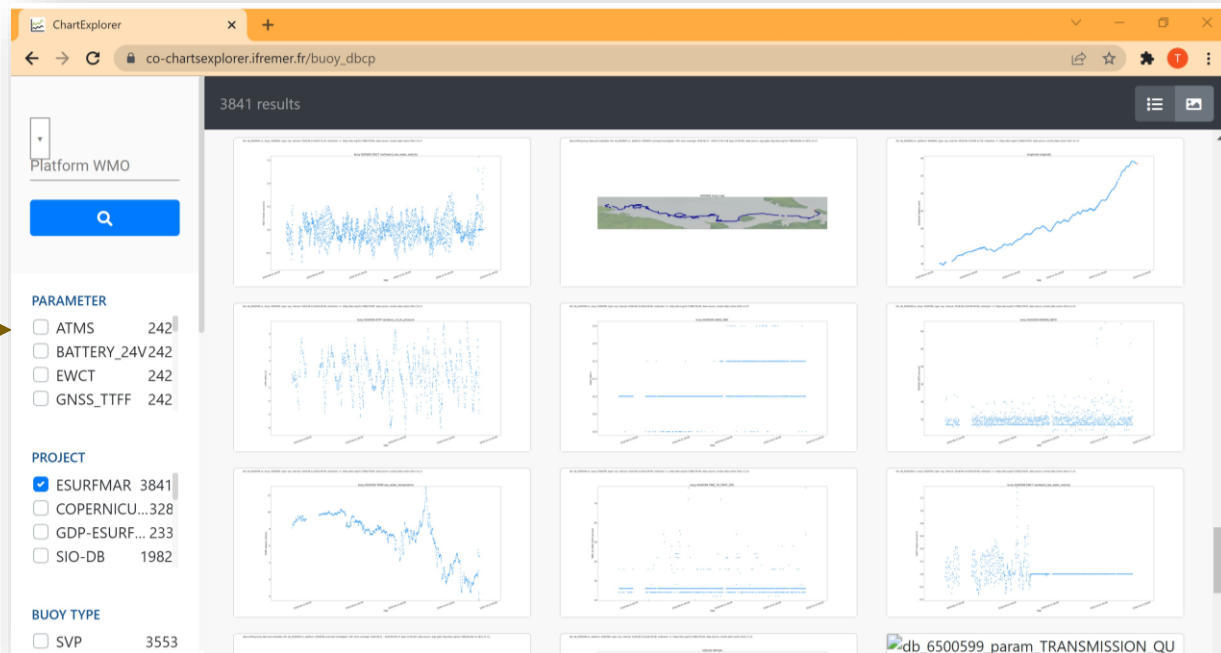
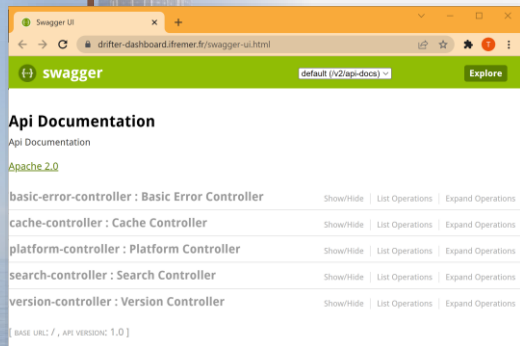




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C-RAID Drifters big data infrastructure

- The drifting buoys data charts explorer
https://co-chartsexplorer.ifremer.fr/buoy_dbcp

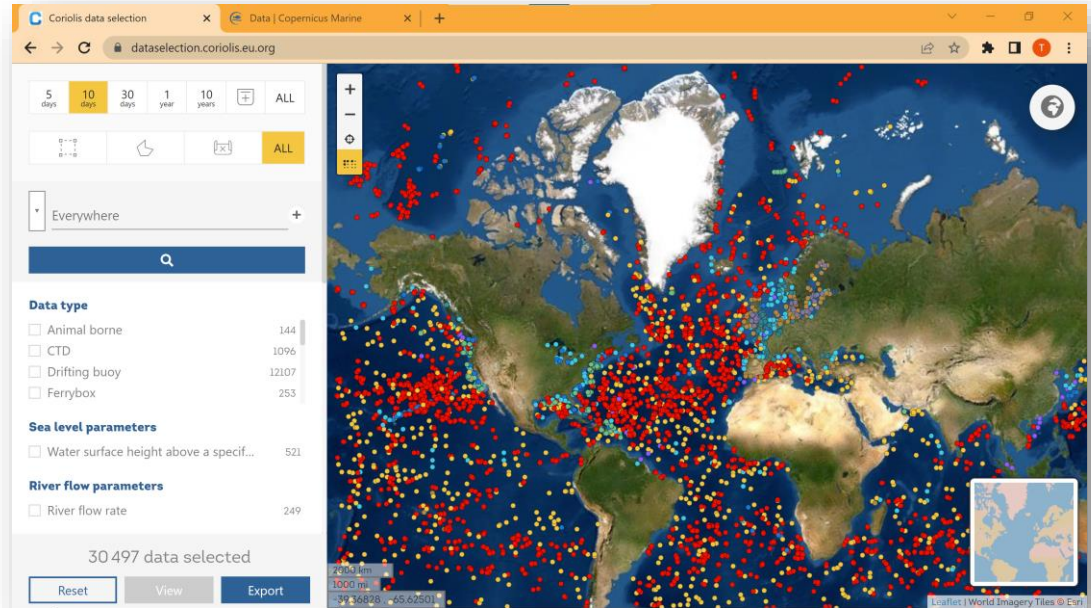




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C - R A I D a c t i v i t y

- The C-RAID dataset delivery is ingested in:
 - OceanOPS metadata dashboard <https://www.ocean-ops.org/board>
 - Copernicus Marine in situ TAC <https://doi.org/10.48670/moi-00036>
 - CIS2: Copernicus In Situ Information System <https://cis2.eea.europa.eu>





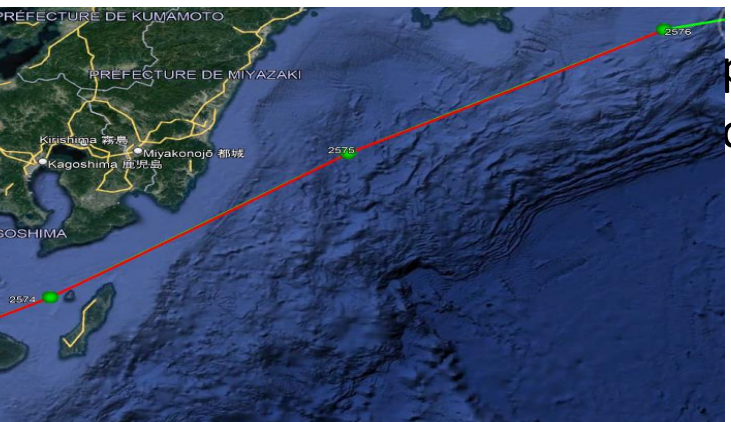
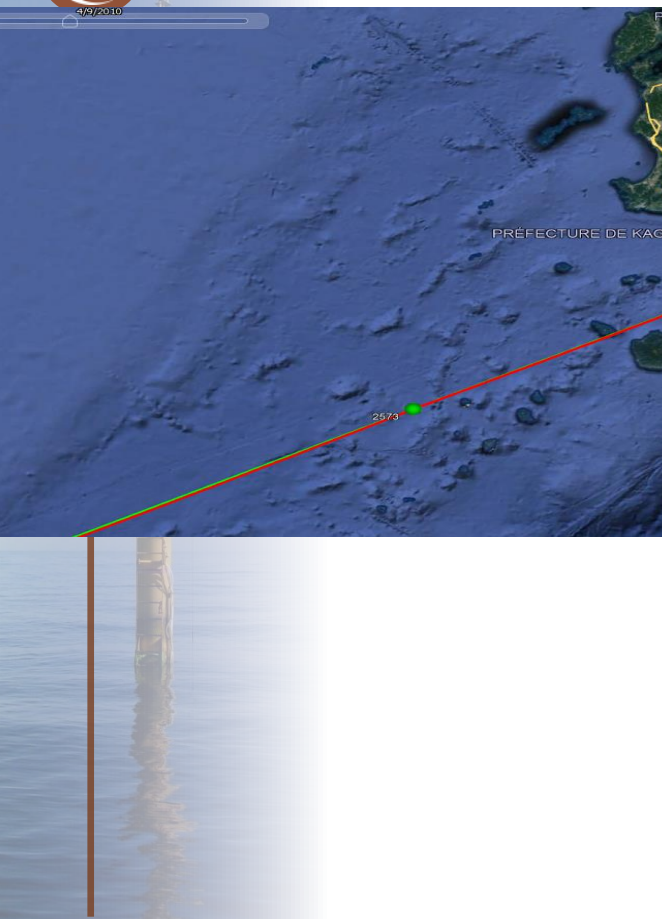
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Success story: Kalman improved trajectories

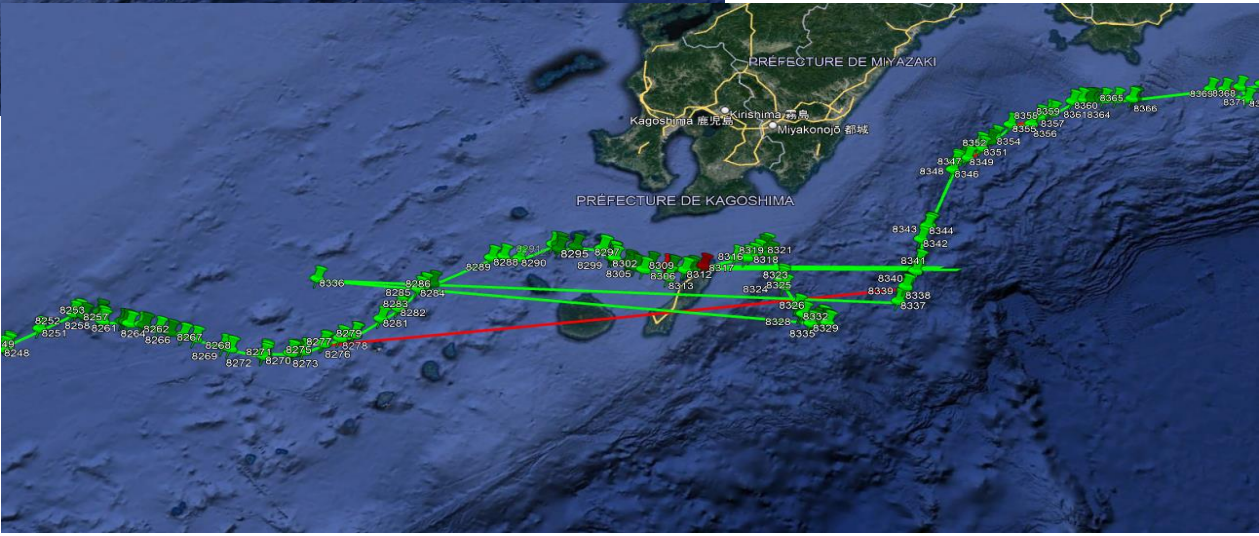
- CLS reprocessed the trajectories of their recent database
- We received in 2020 the Kalman reprocessed trajectories of 3000 drifters
- On a majority of drifters, it provides a huge increase in the quality of trajectories, on particular on poor satellite coverage positions



WP8 Highlights



provided a **huge**
or poor satellite



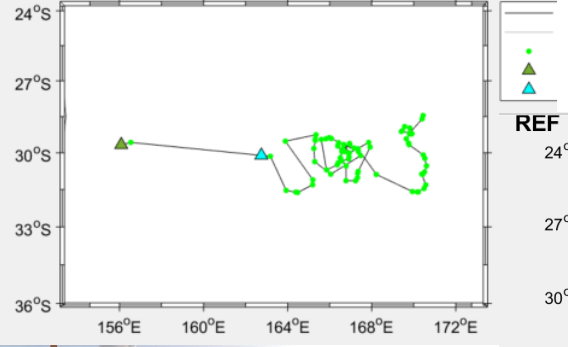


WP 8 Highlights

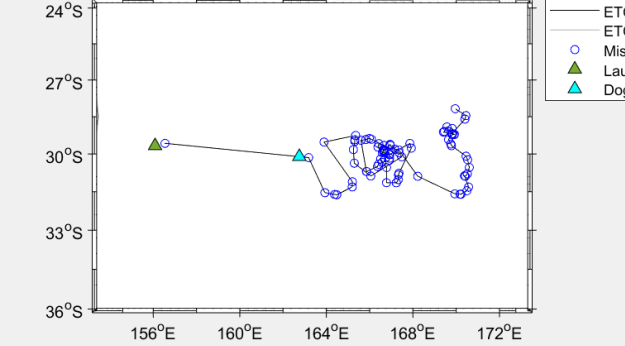
In situ

- A success story : the Kalman filter Argos positioning provided a **huge increase in the quality of trajectories**, in particular for poor satellite coverage positions

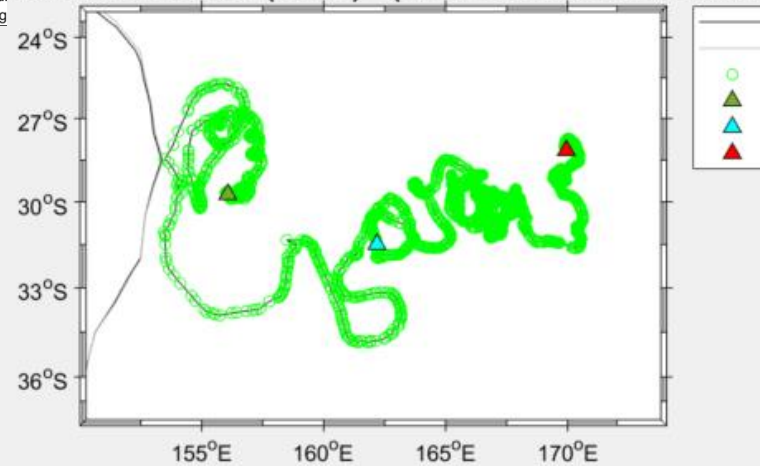
WORK DATA: 71451 (03/21) - (SEQ: ALL MISSION DAT)



REF DATA: 71451 (01/01) - (S DATA)



WORK DATA: 71451 (03/21) - (SEQ: ALL MISSION DAT)





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Drifters quality control procedure

The drifters quality control procedure are documented on:

- C-RAID drifters Quality Control Manual
<https://doi.org/10.13155/81639>
 - The QC manual is regularly improved, last release v6: December 2022)
 - Major chapters
 - RTQC : real-time quality controls : 15 automated tests
 - DMQC : delayed mode quality controls : 4 procedures performed by a scientific expert
 - Quality Control (QC) flags
 - Each date, position, parameters has a QC flag
 - 0 : no QC performed
 - 1 : good data
 - 4 : bad data

Reference document

- Argo Quality Control Manual for CTD and Trajectory Data <https://dx.doi.org/10.13155/33951>
- Guide to Drifting Data Buoys, UNESCO, 1988 <https://www.oceandocs.org/handle/1834/2734>



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Real-time QC tests

The data processing chain decodes Argos or Iridium messages and applies a list of 15 automated QC tests

- Impossible date test (TEST02)
- Impossible location test (TEST03)
- Position on land test (TEST04)
- *Impossible speed test (to be implemented)*
- Global range test (TEST06)
- Regional range test (TEST07)
- Time-continuity test (TEST08)
- Spike test (TEST09)
- Digit rollover test (TEST10)
- Stuck value test (TEST11)
- Grey list test (TEST12)
- Argos Redundancy test (TEST13)
- Inside of mission test (TEST14)
- Questionable Argos position test (TEST16)
- Spike two points test (TEST19)



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Real-time QC tests

The RTQC tests are applied in this well defined order

The last test (grey list) is the last applied, it contains human decisions that revisit some of the previous tests

Order	Test number	Test name
1	1	Platform identification test
2	14	Inside of mission test
3	13	Argos redundancy test
4	2	Impossible date test
5	3	Impossible Location test
6	16	Questionable Argos position test
7	44	Position on land QC = 3 flagged by TEST16
8	6	Global range test
9	7	Regional range test
10	9	Spike test
11	19	Spike two points test
	8	Time continuity test (UNUSED)
12	10	Digit rollover test
13	11	Stuck value test
	4	on land test
14	12	Grey list test



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Delayed mode QC tests

The delayed-mode quality control is performed by an expert who revisits the real-time QCs and take decisions on a visual inspection of data and metadata.

- The very fine resolution bathymetry used (GEBCO 2020), in occasion, is not enough to provide the exact depth at the position of the drifter. The natural processes in both the ocean and the atmosphere can result in values of geophysical parameters that are real but flagged automatically by the RTQC tests.
- During the DMQC process, originally set QCs can be modified **from good data to bad data** for erroneous measurements that have been “missed” by RTQC tests but also **from bad data to good data** for erroneously flagged measurements.
- The flags given during the DMQC steps revoke the flags given by specific RTQC tests. Once the different steps of DMQC finished, the RTQC tests are ran again with the corresponding revoked RTQC test inactive, or with the new test order indicated in the DMQC test. **All the decision taken in the DMQC tests are indicated in the grey list, which is the last test to run during the RTQC procedure. Consequently, the operator decisions can be reproduced in a further run of the RTQC procedure.**
- **For QC traceability, we indicate in the C-RAID drifter grey list each modification of QC values performed during this phase.**

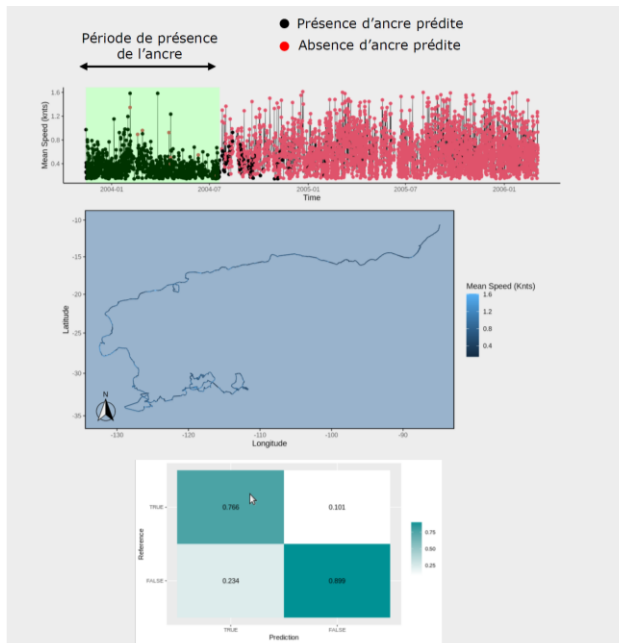


In situ

C-RAID Machine Learning activity - xgboost

Machine Learning activity on C-RAID data to detect the drifting buoys loss of floating anchor

- Question: is a buoy drifting with the nominal 15 meter deep current ?
- Solution
 - train a model with 3500 buoys (with anchor loss detected by an expert) and ERA5 (wind, temperature,...)
 - Run the model on 500 buoys



DONNÉES D'ENTRÉE

Algorithme d'apprentissage machine

Comportement de la bouée

Trajectoire, vitesse, distance parcourue, ...



Données ERA5

Vitesse et direction du vent, stress de surface, ...



Correspondance entre comportement et environnement

Entraînement sur 3500 bouées

Test sur 488 bouées

Analyse de performances

Précision moyenne observées sur l'ensemble des points des 488 bouées test = **86.34%**





In situ

Thank you for your attention, any question ?



Implemented
by

