

# Easy Access to Complex Analysis Tools for Climate Researchers and Climate Data End Users

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November 21, 2022

## Abstract

Researchers and end users using climate data face a challenge when they analyze the data they need. Data volumes are increasing very rapidly, and the ability to download all needed data is often no longer possible. Also, it can be complex to install, configure and use some advanced analysis tools on such large datasets. This is especially true when they are stored in a federated architecture like the ESGF. An example of a complex analysis tool used in climate research and adaptation studies is a tool to follow storm tracks. In the context of climate change, it is important to know if storm tracks will change in the future, in both their frequency and intensity. Storms can cause significant societal impacts, hence it is important to assess future patterns. Having access to this type of complex analysis tool is very useful, and integrating them with front-ends like the IS-ENES climate4impact (C4I) would enable the use of those tools by a larger number of researchers and end users. Integrating this type of complex tool is not an easy task. It requires significant development effort, especially if one of the objectives is also to adhere to FAIR principles. The DARE Platform enables research developers to faster develop the implementations of scientific workflows more rapidly. This work presents how such a complex analysis tool has been implemented to be easily integrated with the C4I platform. The DARE Platform also provides easy access to e-infrastructure services like EUDAT B2DROP, to store intermediate or final results and powerful provenance-powered tools to help researchers manage their work and data. This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreements N°824084 and N°777413.

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**I Accessing climate data: climate4impact**

**II Take Home Messages (2)**

1. Climate Datasets grow to represent our climate more accurately
2. They require new ways of working using new data-analysis methods supported by new infrastructure
  - climate scientists conduct their work through web gateways
  - which exploit the power of data and computational platforms
  - minimizing data movement
  - avoiding the need for local resources
  - reducing the data size of the new data
3. DARE is a pioneering demonstration of these new methods of working on new platforms
  - climate clusters, EOSC, EUDAT, EOSC CWT, ...
  - avoiding complexity barriers
  - governance and re-use as standard
4. Scientific Researchers and their developers will gain agility and productivity

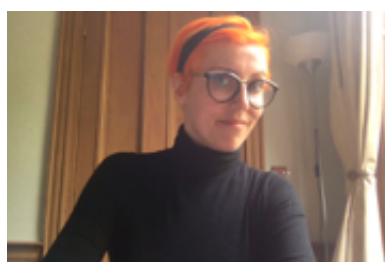
**III Cyclone Tracking Analysis Tool**

**IV Integrating Components**

CHAT INFO | AUTHOR INFORMATION | DISCLOSURES | ABSTRACT | REFERENCES | CONTACT AUTHOR | PRINT | GET POSTER

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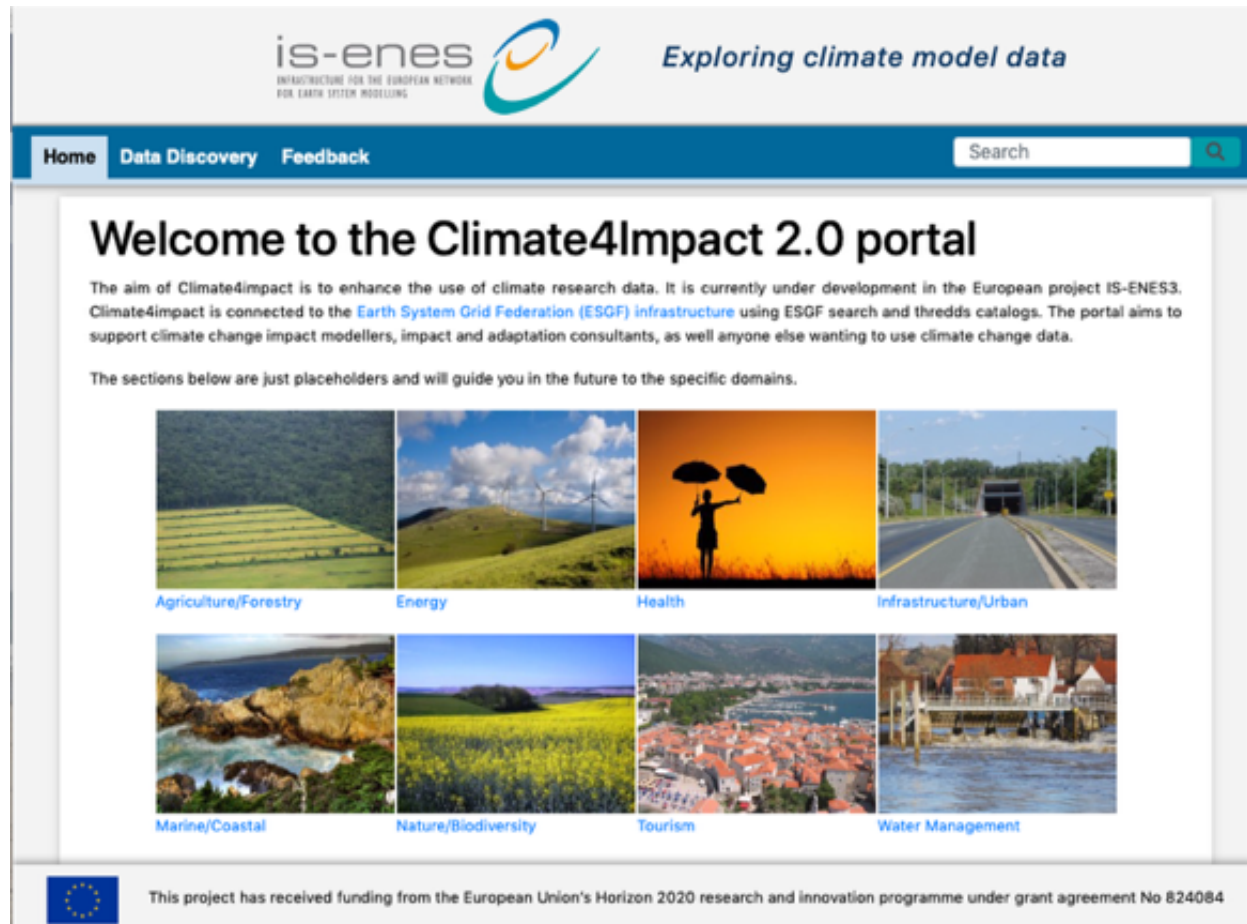
PRESENTED AT:

**AGU** FALL  
MEETING

Online Everywhere | 1–17 December 2020



# I ACCESSING CLIMATE DATA: CLIMATE4IMPACT



- <https://climate4impact.eu> (<https://climate4impact.eu>)
- Developed and managed by IS-ENES (IS-ENES3 EU Project (<https://is.enes.org>))
- Platform for researchers to explore climate data and perform analysis
- Connects to climate e-infrastructure services (ESGF (<https://esgf-data.dkrz.de>))
- Tailored for end-users
- Supports on-demand data processing and statistical downscaling



{RESTful API}

- Version 2.0 of the portal
  - Alpha stage currently
  - Jupyter Notebooks (JupyterLab) approach for data processing and analytics
  - Remote subsetting (spatial and temporal)
  - Revamped user workflow and data discovery interface
  - Going away from a file-based interaction
  - Full provenance and reproducibility, getting closer to FAIRness compliance




Below the user workflow in the Data Discovery of C4I.

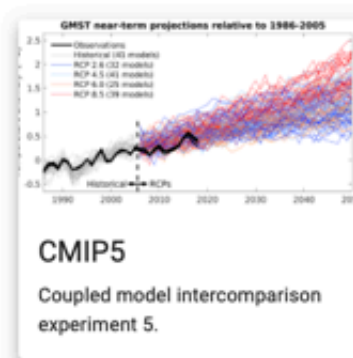



# Select project

You can search the Earth System Grid Federation for various kinds of climate data. Please select the variables and region you are looking for.



**CMIP6**  
Coupled model intercomparison experiment 6.

**CORDEX**  
Global

PARAMETER

FREQUENCY

EXPERIMENT

MODEL

project:CMIP6

## Temperature

- ☐ ta - Air temperature (113564)
- ☐ tas - Temperature (94339)
- ☐ tasmin - Min. Temperature (63244)
- ☐ tasmax - Max. Temperature (62467)

## Precipitation

- ☐ pr - Precipitation (89537)
- ☐ prsn - Snow (57456)
- ☐ pro - Convective precipitation (38969)

## Humidity

- ☐ hus - Spec. Humidity (83110)
- ☐ huss - Specific humidity (59596)
- ☐ hur - Rel. Humidity (53786)
- ☐ hurs - Rel. Humidity (42367)
- ☐ rhsm - Min. Rel. Humidity (-)
- ☐ rhs - Rel. Humidity (-)

## Wind

- ☐ sfcWind - Wind (87913)
- ☐ vas - Northward wind (64138)
- ☐ uas - Eastward wind (63493)
- ☐ sfcWindmax - Max Wind (30130)

## Radiation

- ☐ rsds - SW Radiation Dn (79622)
- ☐ clt - Cloud (72523)
- ☐ rlds - LW Radiation Dn (66589)
- ☐ rlus - LW Radiation Up (52481)
- ☐ rsus - SW Radiation Up (51771)
- ☐ rdsdiff - Diff. Radiation (11529)

## Pressure

- ☐ psl - Sea level pressure (94241)
- ☐ ps - Pressure (68567)
- ☐ pfull - Pressure (6602)

## Evaporation

- ☐ evspsbl - Act. Evap. (47944)
- ☐ evspsblpot - Pot. Evap. (-)
- ☐ evspsblsol - Sol Evap. (20595)
- ☐ evspsblveg - Canopy Evap. (20309)

Simple view

OPEN ACTIVE NOTEBOOK

OPENDAP

STANDARD

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PARAMETER

FREQUENCY

EXPERIMENT

MODEL

project:CMIP6

variable:tas

3hr	6hr	daily	mon	yearly
<input type="checkbox"/> 3hr - Instantaneous states every 3 hours (218)	<input type="checkbox"/> 6hr - Instantaneous states every 6 hours (5188)	<input type="checkbox"/> day - Daily averages (32070)	<input type="checkbox"/> mon - Monthly averages (52006)	<input type="checkbox"/> year - Annual averages (5-3)

✓  
PARAMETER

✓  
FREQUENCY

✓  
EXPERIMENT

✓  
MODEL

project:CMIP6

variable:tas

frequency:day

### Historical

- ☐ historical - Historical (1718)
- ☐ esm-hist - CMIP6 historical (CO2 emission-driven) (98)

### Hindcast

- ☐ dcppA-hindcast - Hindcast (10765)

### SSP

- ☐ ssp585 - update of RCP8.5 based on SSP5 (859)
- ☐ ssp245 - update of RCP4.5 based on SSP2 (800)
- ☐ ssp370 - gap-filling scenario reaching 7.0 based on SSP3 (688)
- ☐ ssp245-nat - natural-only SSP2-4.5 run (76)
- ☐ ssp245-GHG - well-mixed GHG-only SSP2-4.5 run (68)
- ☐ ssp245-stratO3 - stratospheric ozone-only (66)

Simple view

OPEN ACTIVE NOTEBOOK

OPENDAP

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✓  
PARAMETER

✓  
FREQUENCY

✓  
EXPERIMENT

✓  
MODEL

project:CMIP6

variable:tas

frequency:day

experiment\_id:ssp585

### Model

- ☐ CanESM5 - CanESM5 (241)
- ☐ MIROC6 - MIROC6 (113)
- ☐ EC-Earth3 - EC Earth 3.3 (90)
- ☐ MPI-ESM1-2-LR - MPI-ESM1.2-LR (40)
- ☐ ACCESS-ESM1-5 - Australian Community Climate and Earth System Simulator Earth System Model Version 1.5 (32)
- ☐ CNRM-CM6-1 - CNRM-CM6-1 (31)
- ☐ EC-Earth3-Veg - EC-Earth3-Veg (28)
- ☐ CNRM-ESM2-1 - CNRM-ESM2-1 (24)
- ☐ CESM2-WACCM - CESM2-WACCM (23)
- ☐ IPSL-CM6A-LR - IPSL-CM6A-LR (22)
- ☐ UKESM1-0-LL - UKESM1.0-N96ORCA1 (20)

Simple view

OPEN ACTIVE NOTEBOOK

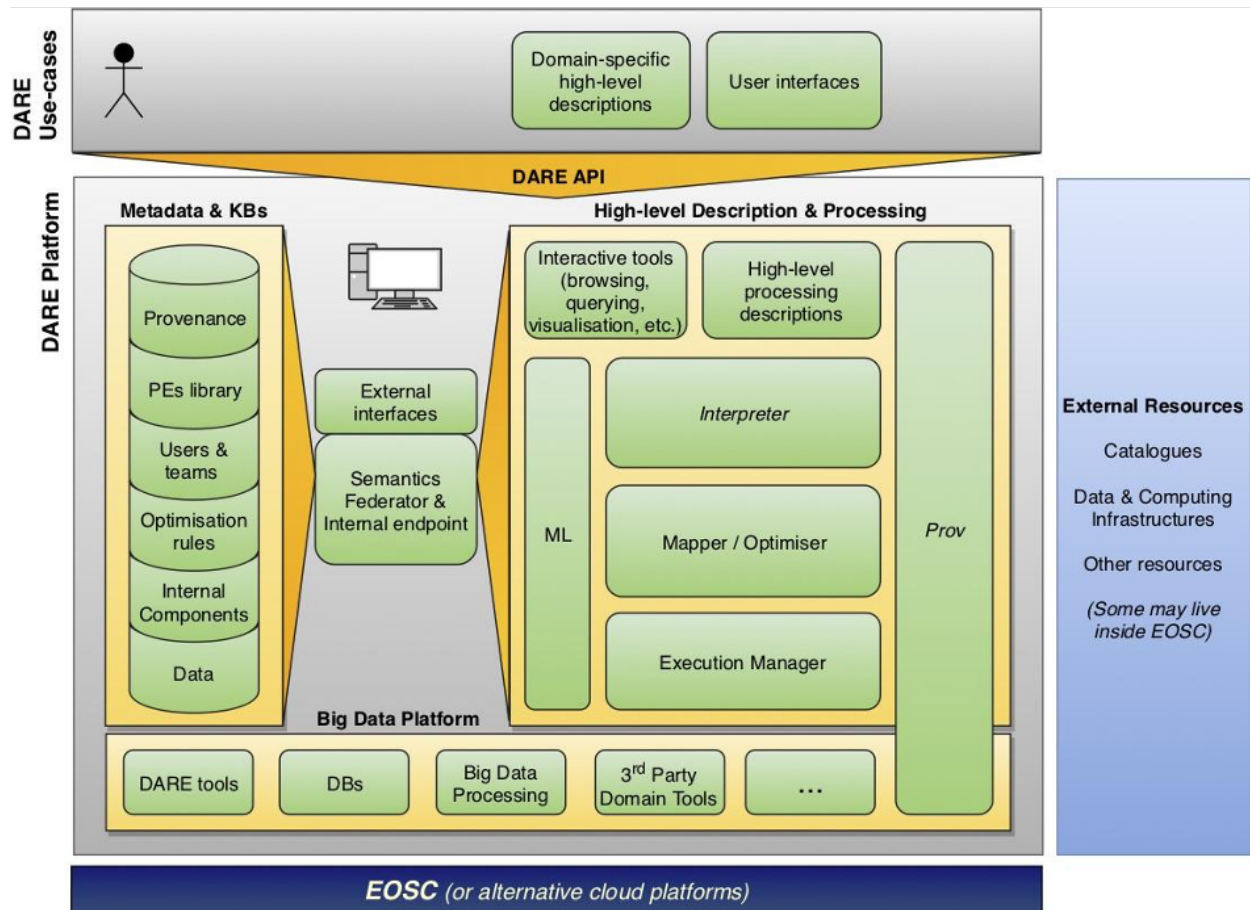
OPENDAP

STANDARD

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## II DARE PLATFORM



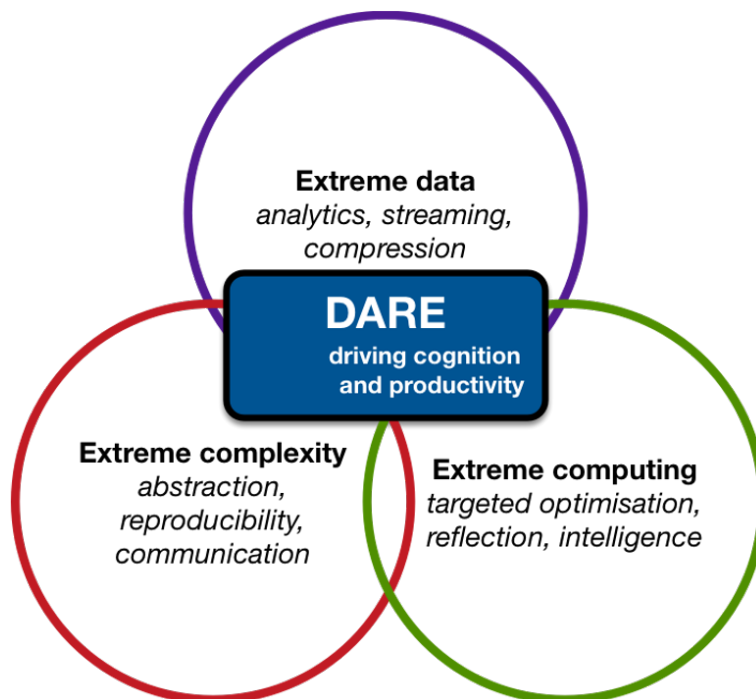
- **Composition of services** using **containers**
- Across service communication using exposed **REST APIs**
- **Scalable** and **flexible** due to **kubernetes** orchestration
- **Effortless cloud** infrastructure deployment
- Software isolation

Important aspects to consider

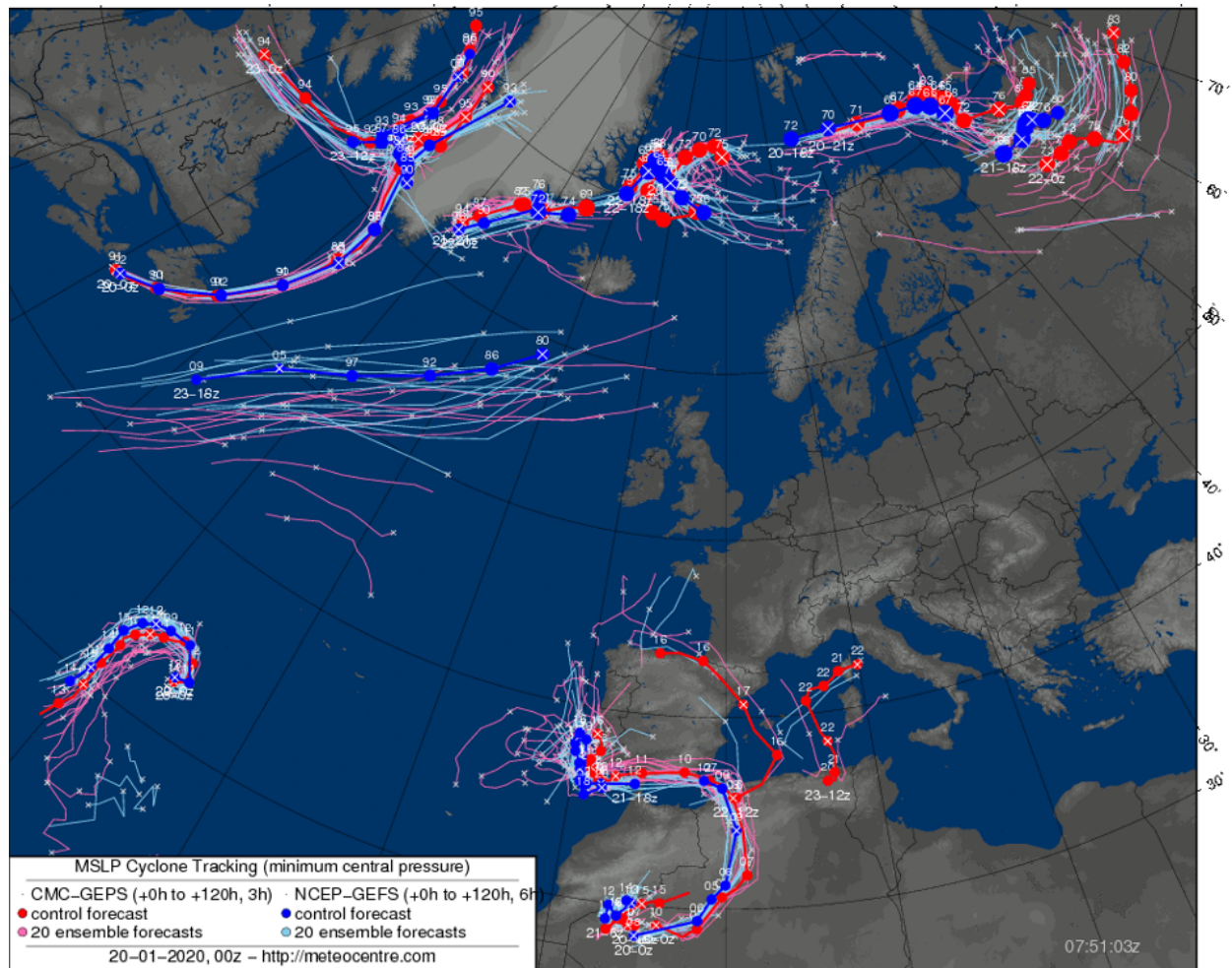
- Efficient Interfacing e-Infrastructures for Researchers is Challenging
- Technologies: fast-evolving but many are getting deprecated and obsolete
- Authentication and Security
- Scalability in Federated Environments
- DARE Platform
  - Hides complexity and heterogeneity
  - Provides automated Provenance & Lineage
  - Provides EUDAT & EOSC Compatibility

The **DARE Platform** (<https://project-dare.gitlab.io/dare-platform/>) is now available! With documentation and support. **Get more information here!** (<https://project-dare.gitlab.io/dare-platform/>)

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  - clouds, clusters, EOSC, EUDAT, ESGF CWT , ...
  - evolving complexity hidden
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### III CYCLONE TRACKING ANALYSIS TOOL



Analysing climate scenarios requires several types of analysis tools

- Simple statistics (average, quantiles, anomalies, etc.)
- Climate indices (summer days, wet days, etc.)
- But also more complex analysis tools to analyze complex processes and features

Complex analysis tools are more difficult to be used by end users.

#### Example of a Complex Analysis Tool

Cyclone Tracking Software based on Sinclair (2004).

⇒ Tracking of Extratropical and Tropical Cyclones

Installation and proper configuration is not trivial, and it requires large input data files.

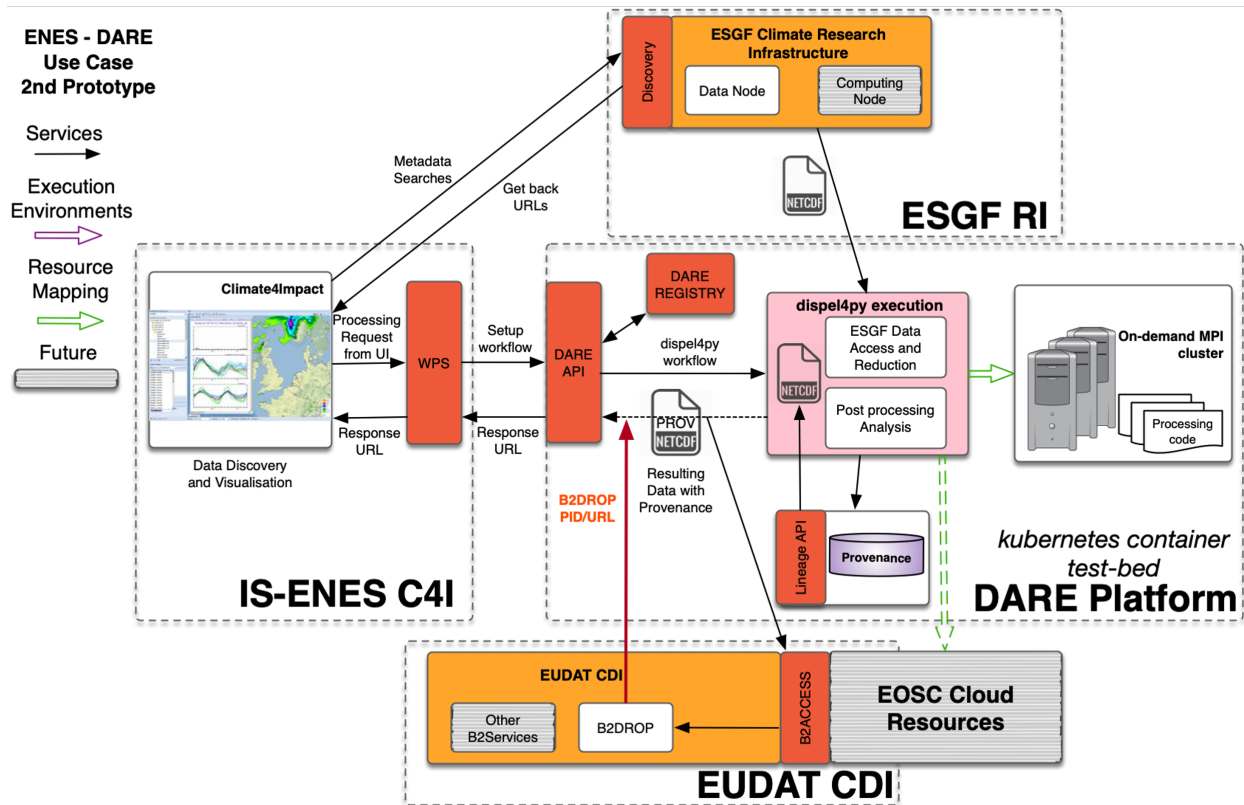
Objective is to leverage this kind of tools to make them easily accessible to end users

Some background on this tracking algorithm and implementation

- Written in Fortran originally by Sinclair (USA)
- Modified extensively by UQAM and Ouranos (Canada)
- Tropical cyclone tracking added by the Meteorological Service of Canada
- Adapted to the NetCDF file format at CERFACS (France)

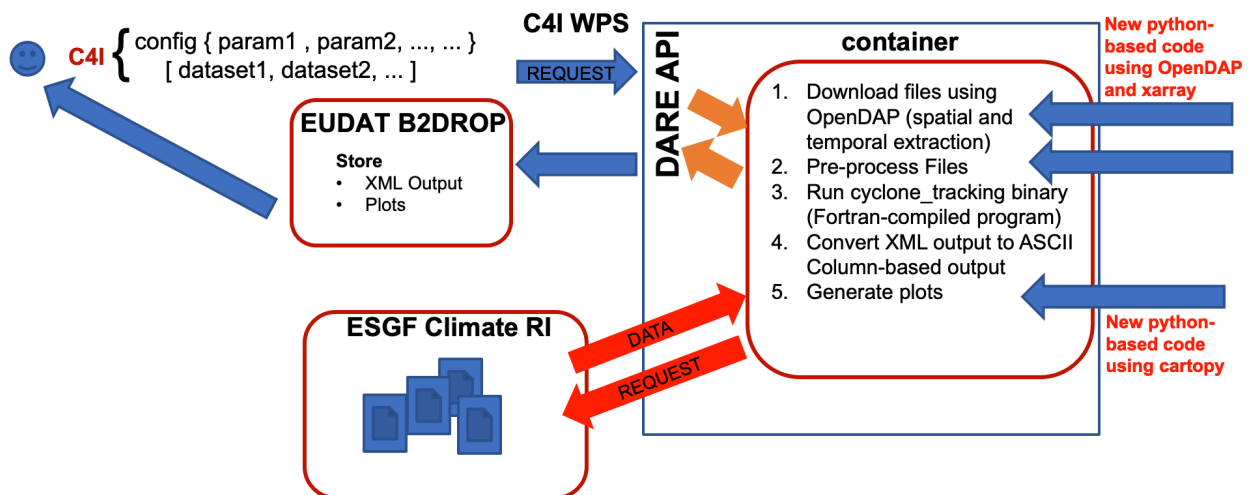


## IV INTEGRATING COMPONENTS



The figure above presents the general overview of the integration

- Integration of these infrastructures: ESGF, DARE, EUDAT and ENES.
- Workflow has been implemented in a Jupyter Notebook, so it can also be used as a standalone, or in a Jupyter Lab environment.
- Connection to EOSC Resources and Services can be made through the use of EUDAT Integrated B2 Services.
- The DARE Platform is providing:
  - CWL workflow execution on kubernetes using a docker environment
  - Automated provenance using the PROV-O standard for both dispel4py and CWL workflows



## Details about the workflow components

- Main component is the cyclone tracking program
  - Written originally in Fortran by Sinclair (USA)
  - Modified extensively by UQAM and Ouranos (Canada)
  - Tropical cyclone tracking added by the Meteorological Service of Canada
  - Adapted to the NetCDF file format at CERFACS (France)
- Workflow has been written using Python 3 processing elements
  - Separated in smaller standalone components
  - Encapsulated in bash shell scripts for integration into CWL
  - Integrated in a Common Workflow Language (CWL) workflow description
- Data access is using OpenDAP to access directly remote files, doing on-demand spatial and temporal subsetting that the OpenDAP protocol is providing
- A generic xarray-based python script has been written to pre-process input files and doing all needed subsetting steps using OpenDAP or local input files
- End results are stored into the user's EUDAT B2Drop Service
- The C4I Platform is providing, through its UI: user's algorithm configuration, input files' locations, and subsetting parameters

# DISCLOSURES

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# AUTHOR INFORMATION

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# ABSTRACT

Researchers and end users using climate data face a challenge when they analyze the data they need. Data volumes are increasing very rapidly, and the ability to download all needed data is often no longer possible. Also, it can be complex to install, configure and use some advanced analysis tools on such large datasets. This is especially true when they are stored in a federated architecture like the ESGF.

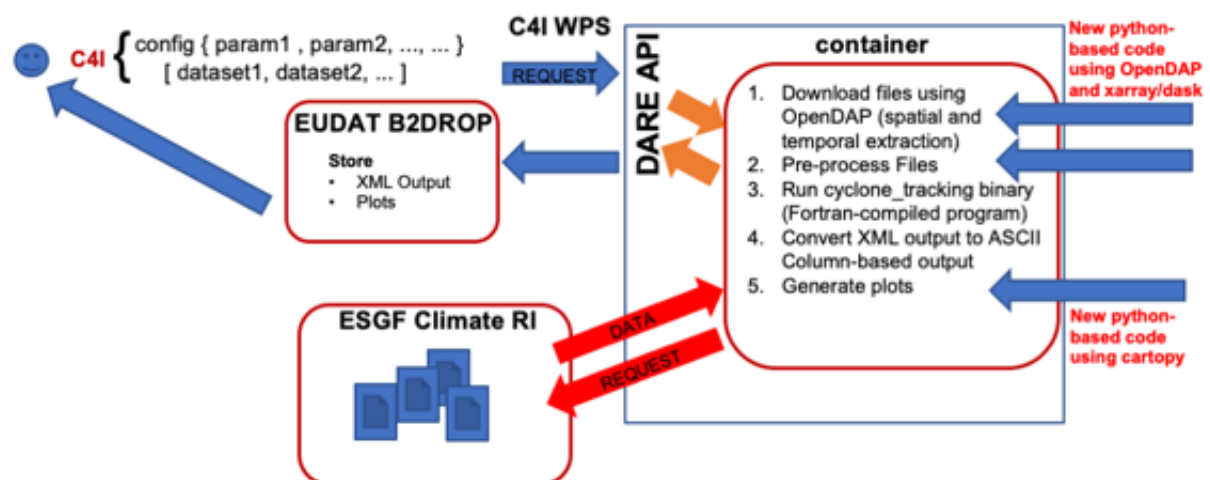
An example of a complex analysis tool used in climate research and adaptation studies is a tool to follow storm tracks. In the context of climate change, it is important to know if storm tracks will change in the future, in both their frequency and intensity. Storms can cause significant societal impacts, hence it is important to assess future patterns. Having access to this type of complex analysis tool is very useful, and integrating them with front-ends like the IS-ENES climate4impact (C4I) would enable the use of those tools by a larger number of researchers and end users.

Integrating this type of complex tool is not an easy task. It requires significant development effort, especially if one of the objectives is also to adhere to FAIR principles. The DARE Platform enables research developers to develop the implementations of scientific workflows more rapidly. This work presents how such a complex analysis tool has been implemented to be easily integrated with the C4I platform. The DARE Platform also provides easy access to e-infrastructure services like EUDAT B2DROP, to store intermediate or final results and powerful provenance-powered tools to help researchers manage their work and data.

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## Cyclone Tracking Use Case Workflow



([https://agu.confex.com/data/abstract/agu/fm20/2/2/Paper\\_669222\\_abstract\\_649537\\_0.png](https://agu.confex.com/data/abstract/agu/fm20/2/2/Paper_669222_abstract_649537_0.png))

# REFERENCES

Sinclair, M. R., 2004: Extratropical Transition of Southwest Pacific Tropical Cyclones. Part II: Midlatitude Circulation Characteristics, *Mon. Wea. Rev.*, 132, p. 2149.