



2-4 November 2022 | ESA-ESRIN | Frascati (Rm), Italy

#### **Outline**

- What is Pangeo?
- How does Pangeo foster Open Innovation?
- Successes, Challenges and Lessons learned
- Recommendations to Space Agencies

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#### What is Pangeo?



A global community initiative for Big Geoscience Data that promotes open, reproducible, and scalable science

- Open Community
- Open Platform

#### Code of conduct

https://github.com/pangeo-data/governance/blob/master/conduct/code of conduct.md



https://github.com/pangeo-data/governance/blob/master/governance.md



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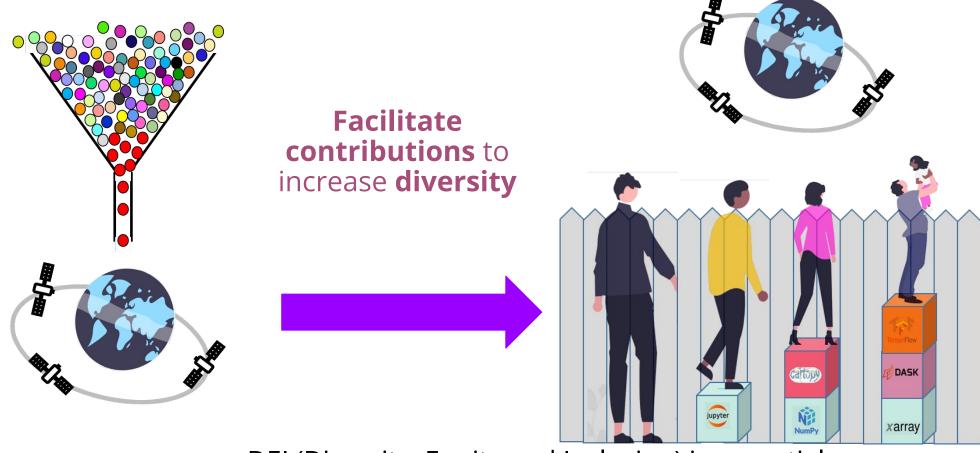
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# Open Community

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#### Pangeo vision: lower barriers to entry to stimulate innovation

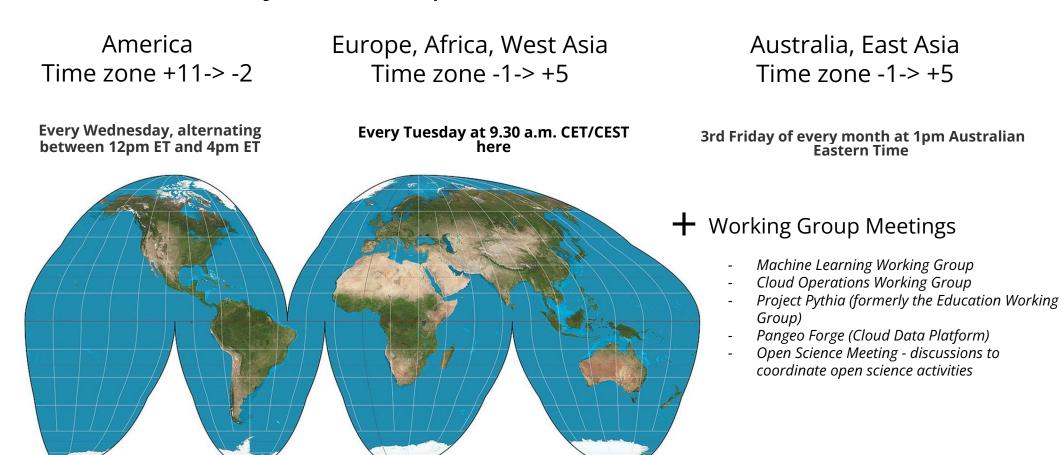


DEI (Diversity, Equity and Inclusion) is essential





#### A community of developers, scientists and users



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#### Pangeo Showcase Webinar Series

To learn from each other. It it part of "America" community calls. 15 minute talks
are recorded, given a DOI and made available on the <a href="Pangeo YouTube Channel">Pangeo YouTube Channel</a>;

#### FALL 2022 SHOWCASE

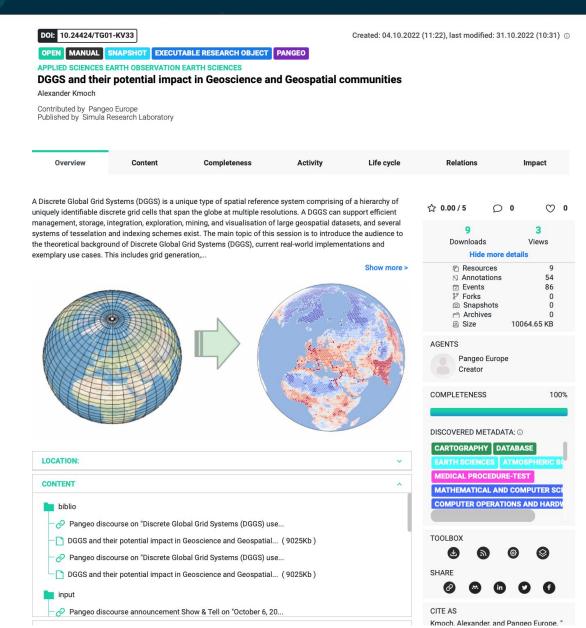
Date	Speaker	Title
2022-09-21 12PM EDT	Peter Marsh, University of Cape Town	Accessing NetCDF and GRIB file collections as cloud-native virtual datasets using Kerchunk DOI 10.5281/zenodo.7140825
2022-10-05 12PM EDT	Leah Wasser, pyOpenSci	<u>PyOpenSci</u> DOI 10.5281/zenodo.7158586
2022-10-12 4PM EDT	Rich Signell, USGS	My ERA5 Journey: From API-to-ARCO DOI 10.5281/zenodo.7226344
2022-10-19 12PM EDT	Matthias Mohr, openEO	openEO: What it is and how it relates to Pangeo  DOI 10.5281/zenodo.7229398
2022-10-26 4PM EDT	Hauke Schulz, CICOES/University of Washington	Xbitinfo: Compress datasets based on their information content

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#### **Show & Tell**

- At the request of anyone who is interested to go in depth and show what they are working on. It is expected to be hands-on and is also recorded.
- FAIR Digital Object: a Research Object
   (<a href="https://reliance.rohub.org/">https://reliance.rohub.org/</a>) is created and
   aggregate all the material used/showed
   (slides, recorded video, jupyter notebooks
   or other codes, input data, etc.) and given
   a DOI.
- Text mining service to extract metadata and facilitate interdisciplinary re-usage



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#### A Culture of Collaboration













































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**Centre for Environmental** Data Analysis

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CIENCE AND TECHNOLOGY FACILITIES COUNCIL























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Massachusetts Institute of Technology®



Helmholtz Centre for Ocean Research Kiel











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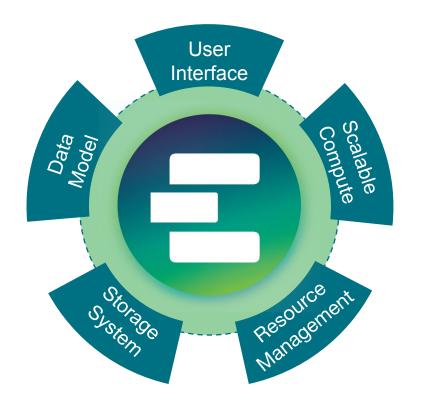
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# Open Platform

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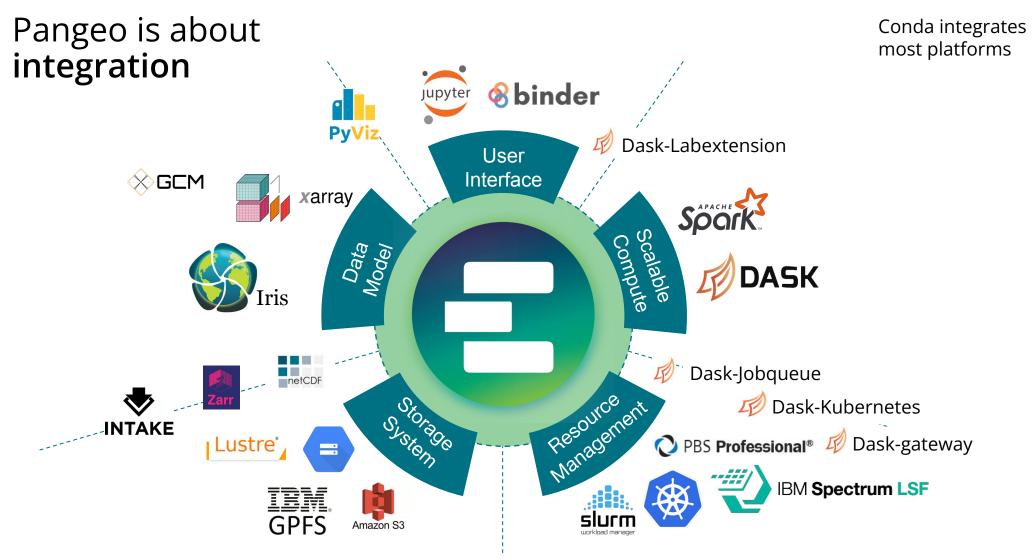
#### Pangeo **platform** is scalable



from laptop to cloud or HPC



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Pangeo makes it possible to explore geoscience data using HPC or cloud in an interactive manner



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#### Pangeo deployments

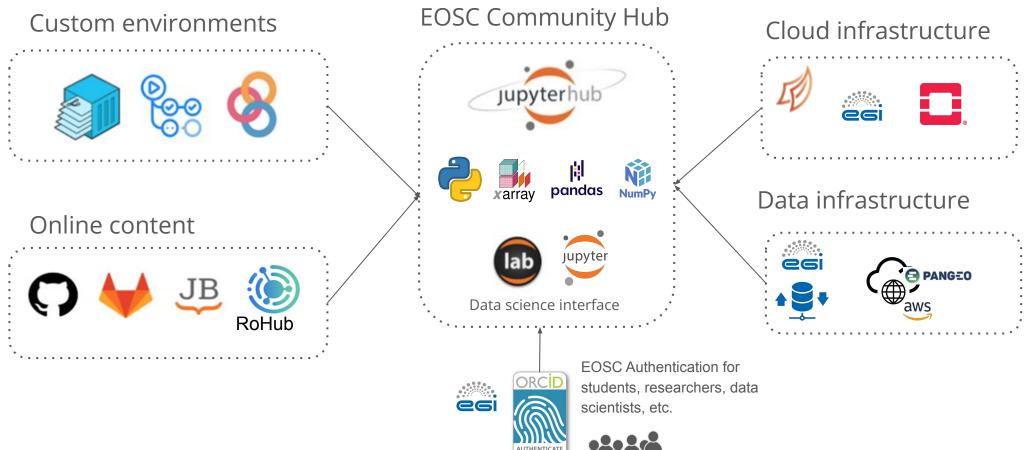
- HPC
  - CNES, IFREMER, PRACE, Fugaku, ...
- Cloud
  - Public Clouds (EGI-ACE, EOSC)
  - Commercial clouds (AWS, Microsoft, Google)
- Laptop
  - Anywhere for anyone!

Docker images (pangeo-notebook, ml-notebook, etc.) developed and maintained by the Community to ease usage and deployments.





#### Pangeo at scale with deployment on the European Open Science Cloud (EOSC)











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# Easy and efficient access to Geoscience data

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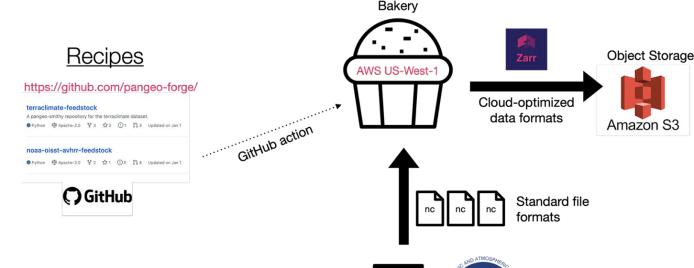


#### Pangeo-forge for efficient data management within the Pangeo Community

→ Make it easy to extract data from any traditional repository and deposit this data in cloud object storage in an analysis-ready, cloud optimized (ARCO) format;

#### Two main components:

- Open source Python package for describing and running data pipelines;
- Cloud platform for automatically executing recipes stored in Github repos.









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#### STAC and Pangeo

- Pangeo-forge supports the creation of analysis-ready cloud optimized (ARCO) data in cloud object storage from "classical" data repositories;
- STAC is used to create catalog and goes beyond the Pangeo ecosystem;
- Work is ongoing to figure out the best way to expose
   Pangeo-Forge-generated data assets via STAC catalogs.







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# Team-up with other initiatives to onboard new members and increase diversity

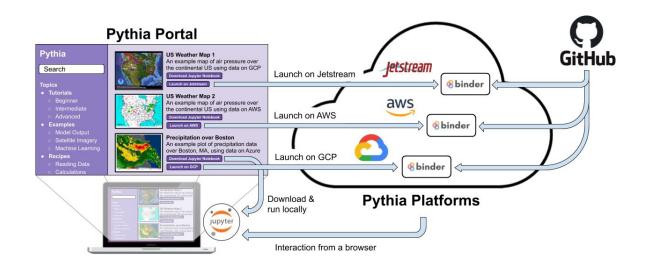
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# Team-up with Project Pythia

A Community Learning Resource for Geoscientists

https://projectpythia.org/





This work supported through the National Science Foundation Award #2026899.

# Aspiration goal: Be the goto resource for learning the *Scientific Python Ecosystem*

- ★ Geoscience focused
- ★ From beginner to the power user
- ★ Tutorials, videos, examples, on-line courses, and sample data
- ★ Community owned!



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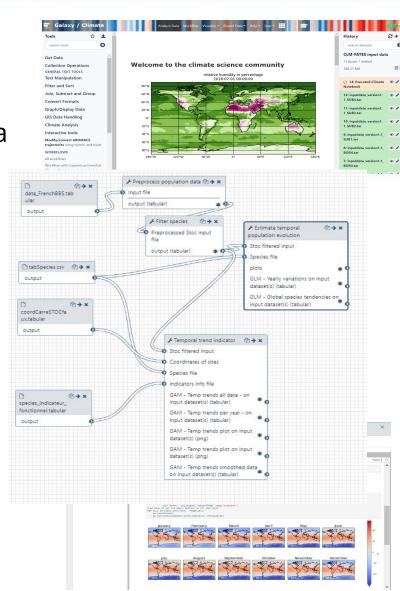


#### Team-up with Galaxy Europe

Galaxy is an open-source community and platform for FAIR data analysis. It offers:

- Graphical User Interface (GUI) for users with no programming skills
- Workflow editor to create and run fully reproducible data analysis
- Compute & Storage to everyone (free registration)
- Self Paced Learning material with the Galaxy Training Network
- Training Infrastructure as a Service (TiaaS) free and ready to use with private queues where only training's jobs run





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#### Co-design: from Jupyter Notebook to standalone Galaxy Tools

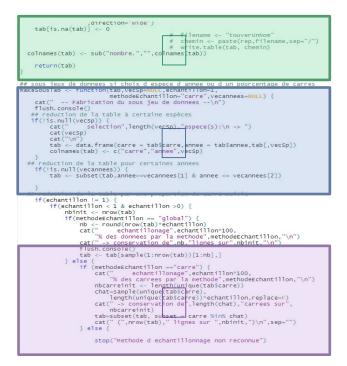


Create a
Jupyter
Python/R/Julia
Notebook

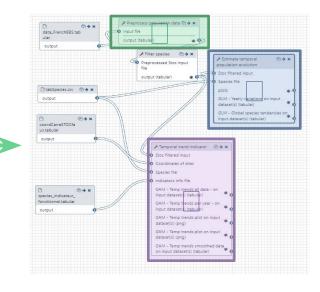
#### **Galaxy Europe**



One Jupyter Notebook is turned into one script



Several atomic scripts from which generic and fully annotated Galaxy Tools are created





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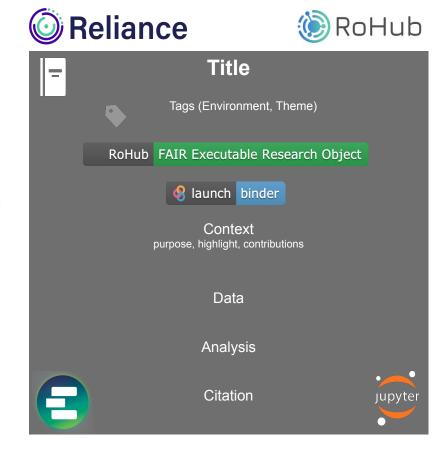
# Team-up with the Environmental Data Science Book

https://the-environmental-ds-book.netlify.app/

Reproducible, scalable, & shareable ENVIRONMENTAL DATA SCIENCE jupyter {book} **8** binder Scriberia **Publication** The Collaborative **Alan Turing** 

Reviewing

Living, open and community-driven online resource to **showcase and support the publication** of data, research and open-source tools.



Contribution

Institute

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#### Successes

- No vendor lock-in;
- Easy to start and deployment on laptops, cloud and HPC;
- "Reference" deployments on different cloud infrastructures;
- **Team up with other initiatives.** It can help to increase DEI (Diversity, Equity and Inclusion):
  - Educational material and deliver trainings (Pythia, Galaxy);
  - Training infrastructure as a Service (Pythia, Galaxy, EOSC);
  - Use Pangeo from GUI (no programming skills required) on Galaxy Europe.
- Contribute to easy creation of data in analysis-ready, cloud optimized (ARCO) format (pangeo-forge);
- Promote the work done by the Pangeo Community and other Geosciences initiatives (Pangeo Show & Tell/Showcase);
- Pangeo heavily used in industry;
- **Spin-off** (often from Pangeo community members) and many startups & companies using Pangeo software stack and contributing to Pangeo ecosystem.

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#### Challenges

- Enthusiastic individuals and volunteered driven community: Pangeo is growing in many different ways and it is often difficult to inform everyone about all the initiatives;
- Initiatives are usually driven by a few dedicated individuals with short-term funding (or no funding);
- Several spin-off but not easy to track them down and/or help them;
- Difficult to decide when a sub-project needs to be "professionalized" e.g. being able to "collect" funding, secure long-term funding (NumFOCUS but US based only);
- Difficult to onboard (train) wide range of contributors;
- Roadmap is community driven and can be a bit obscure to newcomers;

#### **Lessons learned**

- Important to create an Identity early on;
- Need to team-up with other initiatives for instance to get infrastructure, training network, interdisciplinary research, and different types of contributors (diversity of contributions), etc.;
- Important to be able to bootstrap new sub-projects (new packages);
- Need to fund a Community Manager.

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#### Recommendations to Space Agencies

Space Agencies could play a larger role, and in particular:

- Contribute actively to Open Source and Open Science projects (prevent re-inventing the wheel);
- Be more involved in Open Science initiatives, and even lead some of them (cf. #NASATOPS);
- Provide infrastructure (compute & Storage)
- Sponsor Open Source projects (similar to NumFOCUS) with EO industry compliance;
- Make calls to attract "small-players" and foster innovation;
- Fund training/hackathons events to engage with a wider range of actors, including training of community manager (CSCCE);
- Promote and fund initiative such as OSGeo;
- Support and invest in tech start-ups (incubators).

What about a "Matchmaker program" to connect with existing/upcoming entrepreneurs, deep-tech consultants, researchers, community managers, software developers, governments, citizen, funders, etc.?

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# Thank you for your attention!

