# V irtual R esearch E nvironment

Towards a comprehensive analysis platform

<u>Elena Gazzarrini</u>, Enrique Garcia, Domenic Gosein

European Union's Horizon 2020 programme Grant Agreement 824064 and 101017536



# Agenda

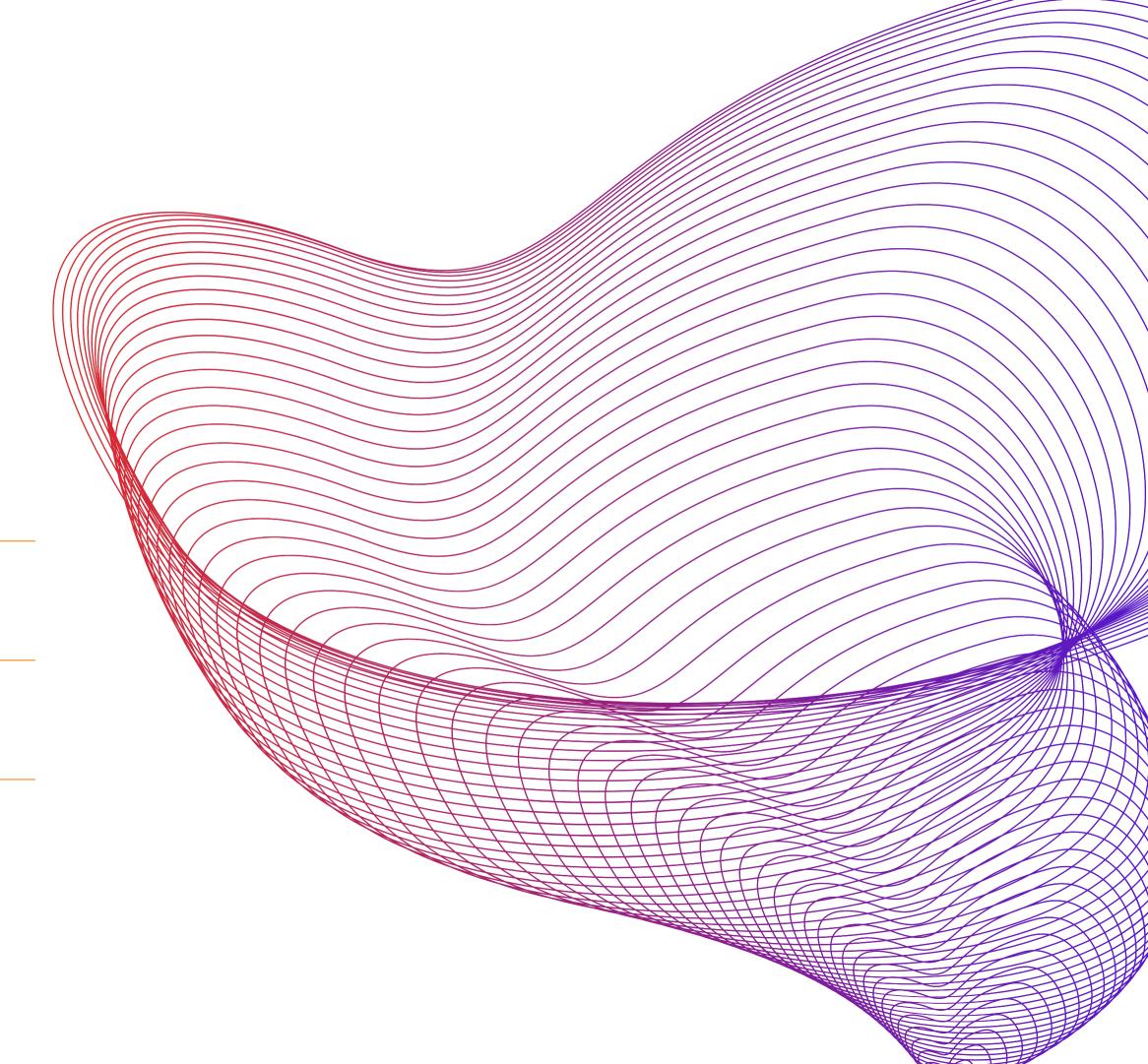
Motivation

Science use case

Components

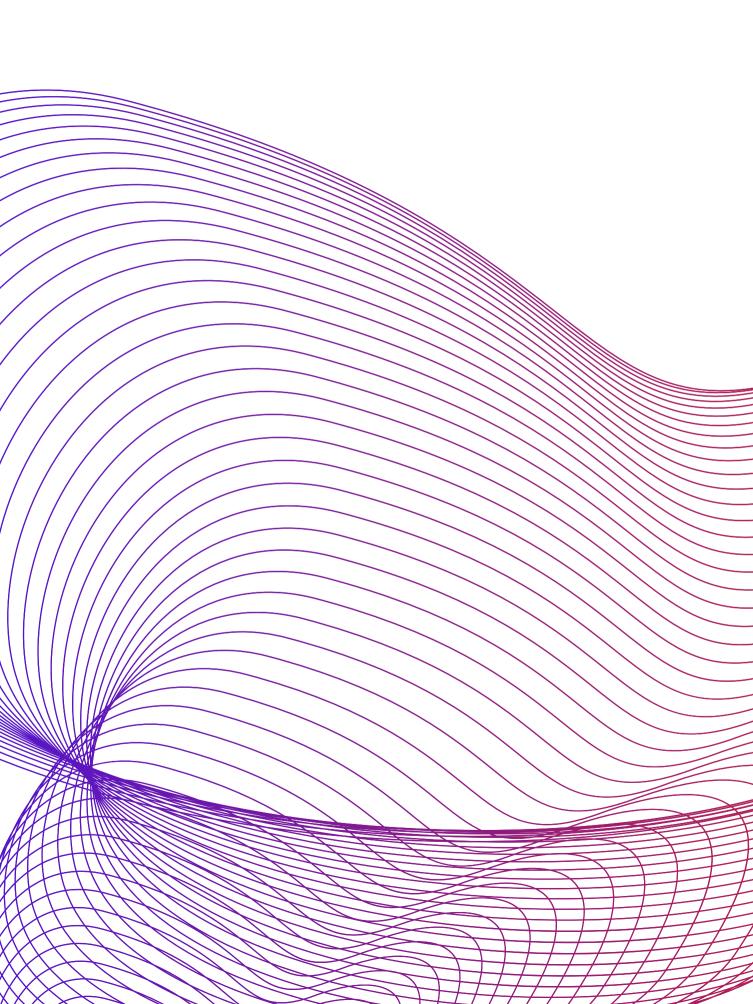
Demo





# Motivation

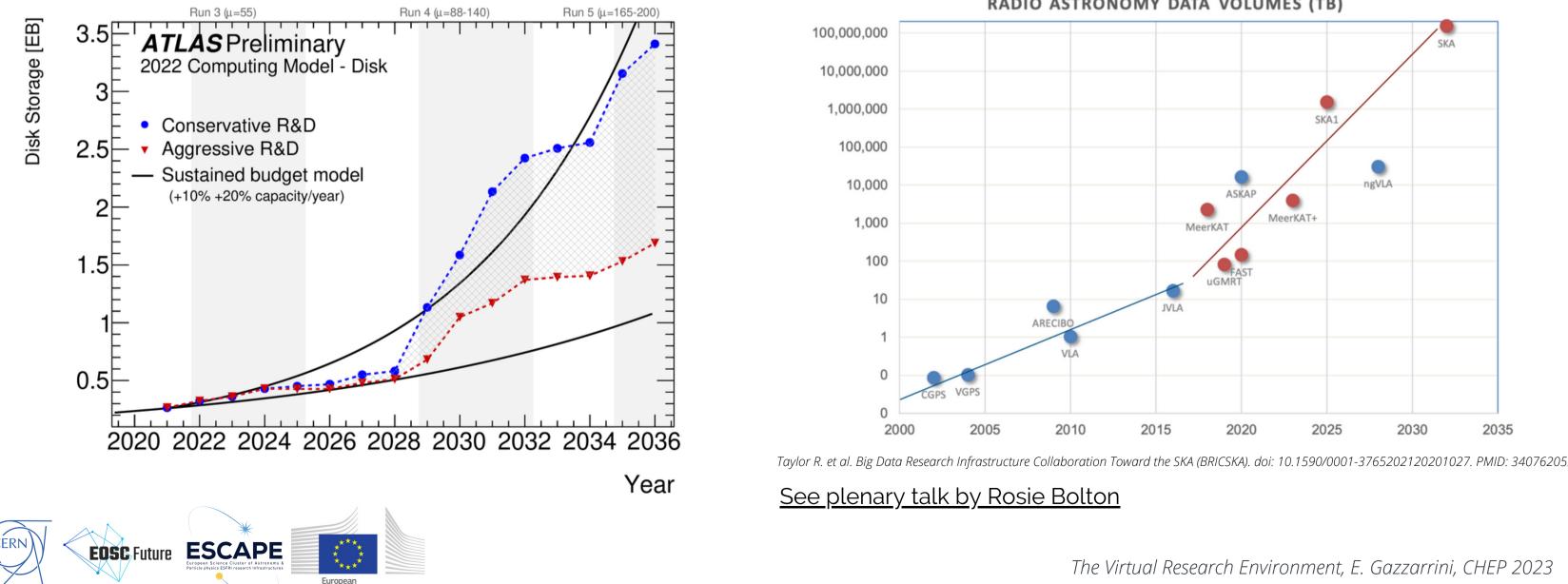




## Data volumes growing not only at LHC

The LHC at CERN was the first large scientific experiment to generate and manage multi PBs of data per year.

Technologies to manage and process data initially developed at CERN are being adopted by other collaborations, as new generation of detectors, antennas and telescopes are producing and processing large data volumes as well.



**RADIO ASTRONOMY DATA VOLUMES (TB)** 

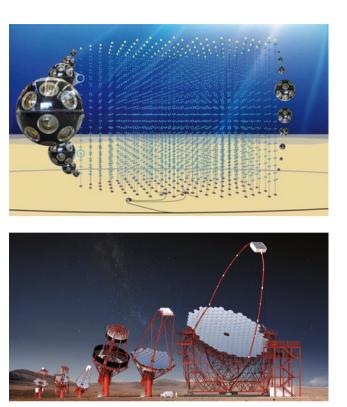
# The challenge

A common infrastructure across Research Infrastructures would foster:

- economy of scale
- collaboration across domains
- scientific reuse
- sustainability

















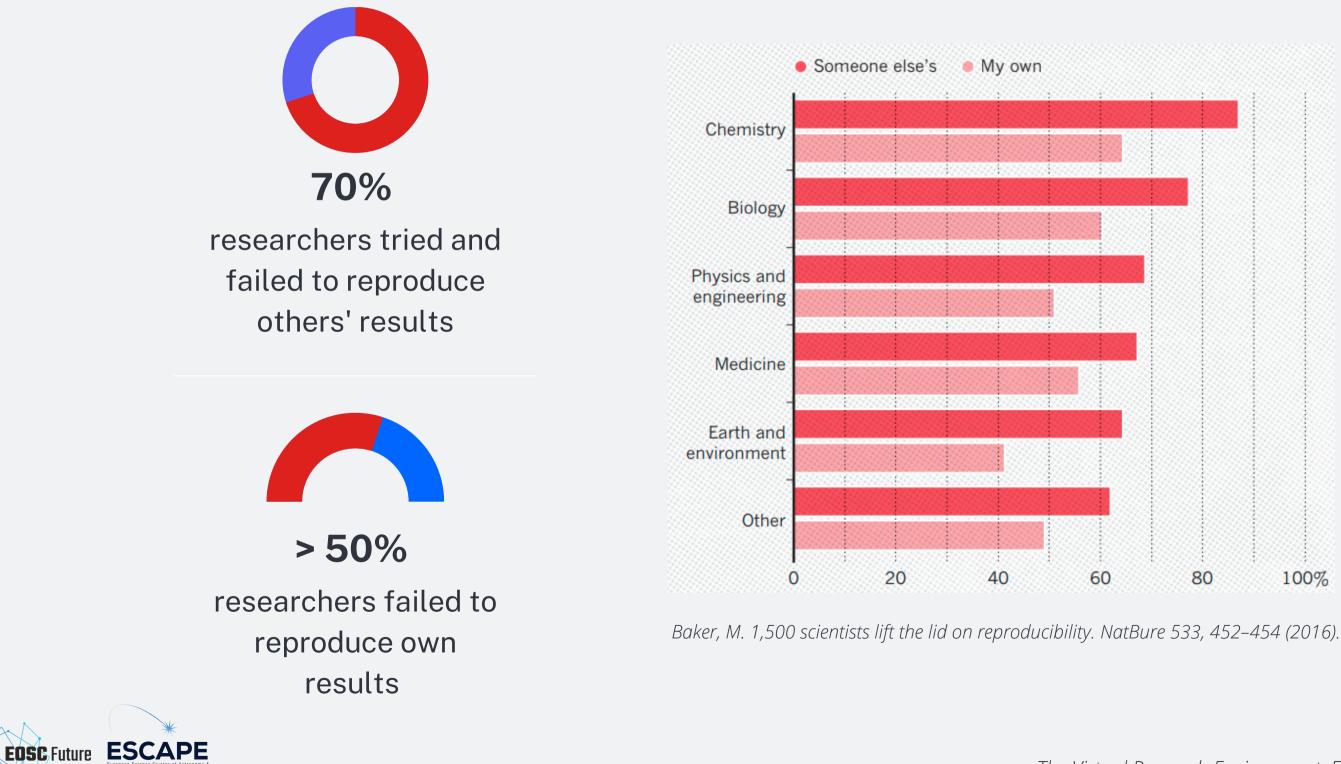








## Have you failed to reproduce a result?



# EU collaborations

EU-funded projects promote cross-fertilisation across Research Infrastructures and scientific domains to find common, consistent and useful solutions to challenges of

- Federated Data Management and Transfer Services
- Distributed Data Processing
- Software Sustainability
- Analysis Preservation and Reusability

... all in one common Analysis Platform!





### See yesterday's talk by G. Lamanna

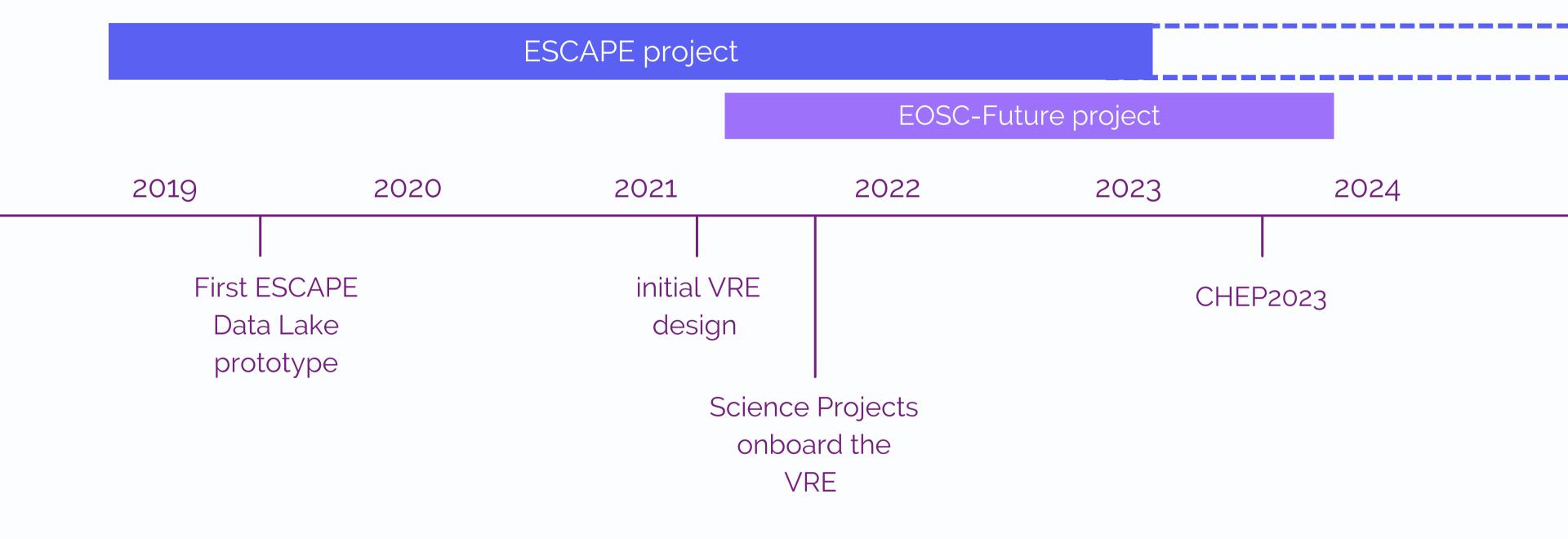
# The Virtual Research Environment

The VRE is an **open source** analysis platform where researchers have access to all the digital content needed to develop, share and reproduce an end-to-end scientific result in compliance with FAIR (findable, accessible, interoperable, reproducible) principles.





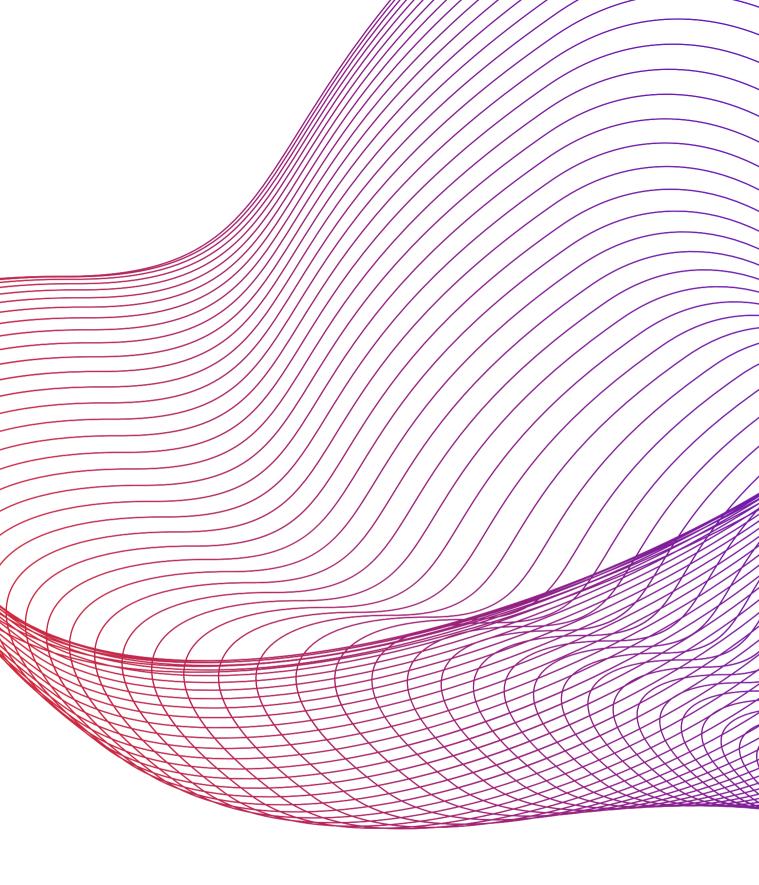
# Timeline



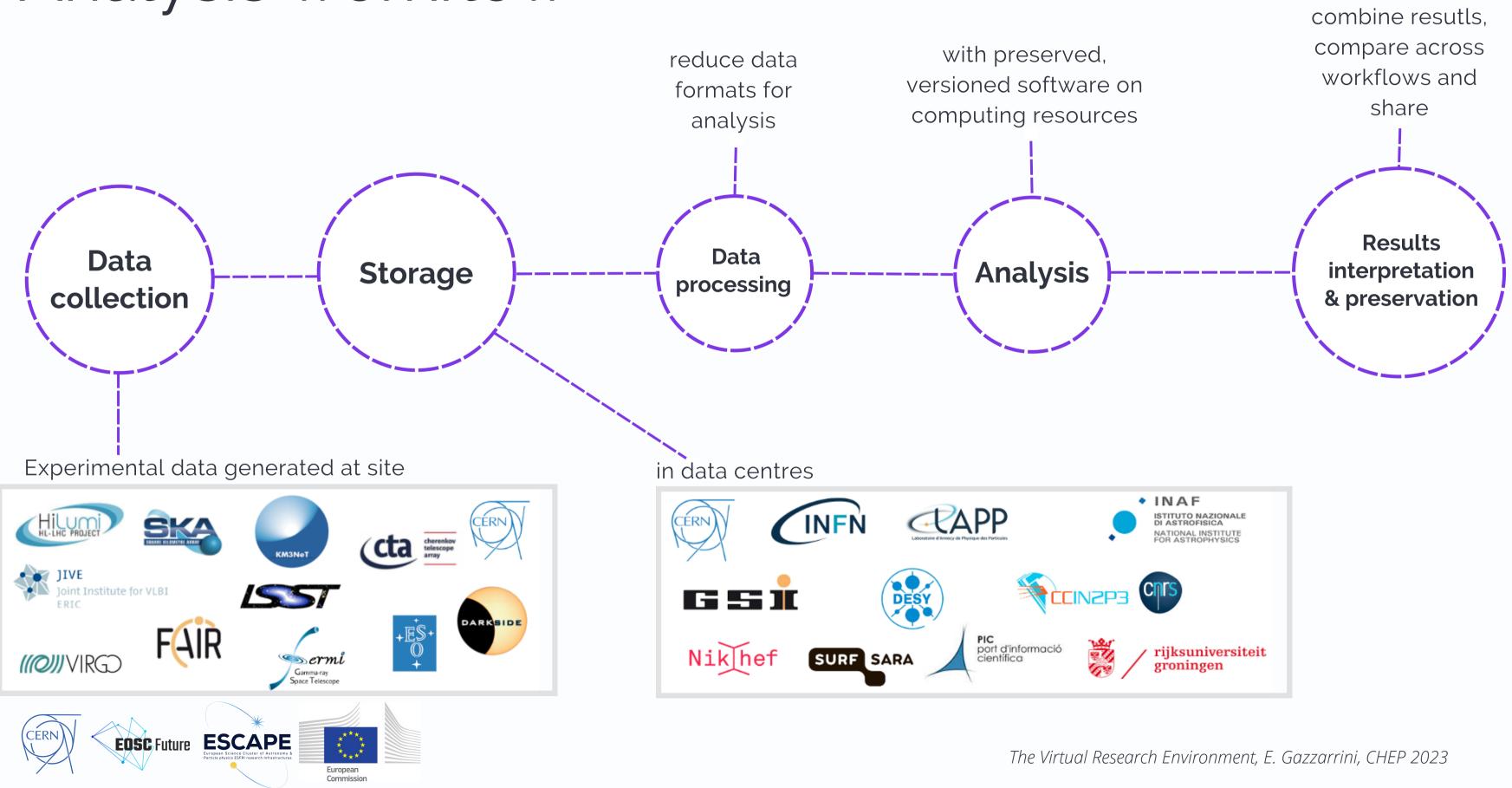


# Science Use Case





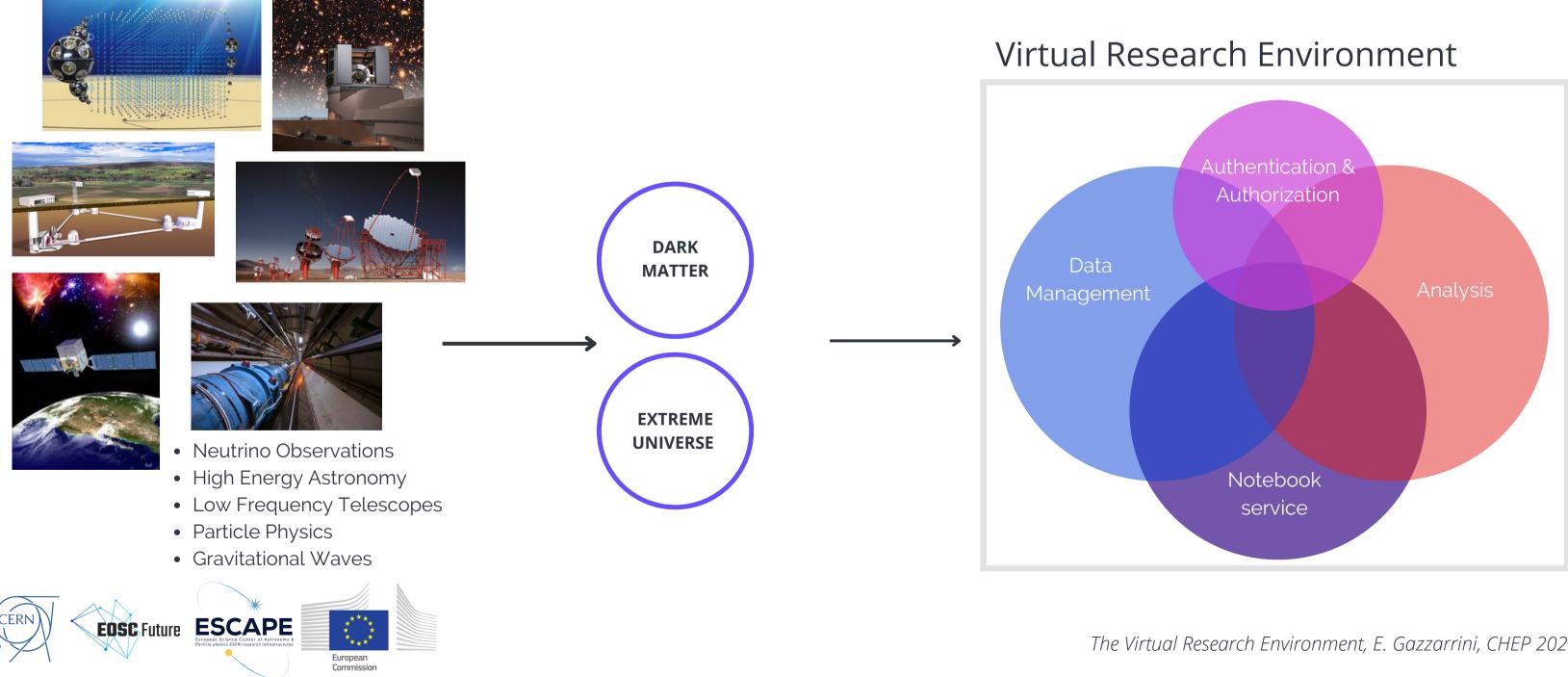
## Analysis workflow



### Context: EOSC-Future

**EOSC-Future** Science Projects demonstrate

- multi-domain science integration across the **ESCAPE** project
- unification of services under one Proof of Concept (PoC) analysis platform, the VRE
- interdisciplinary open science example from bottom-up effort as a science driver for other communities

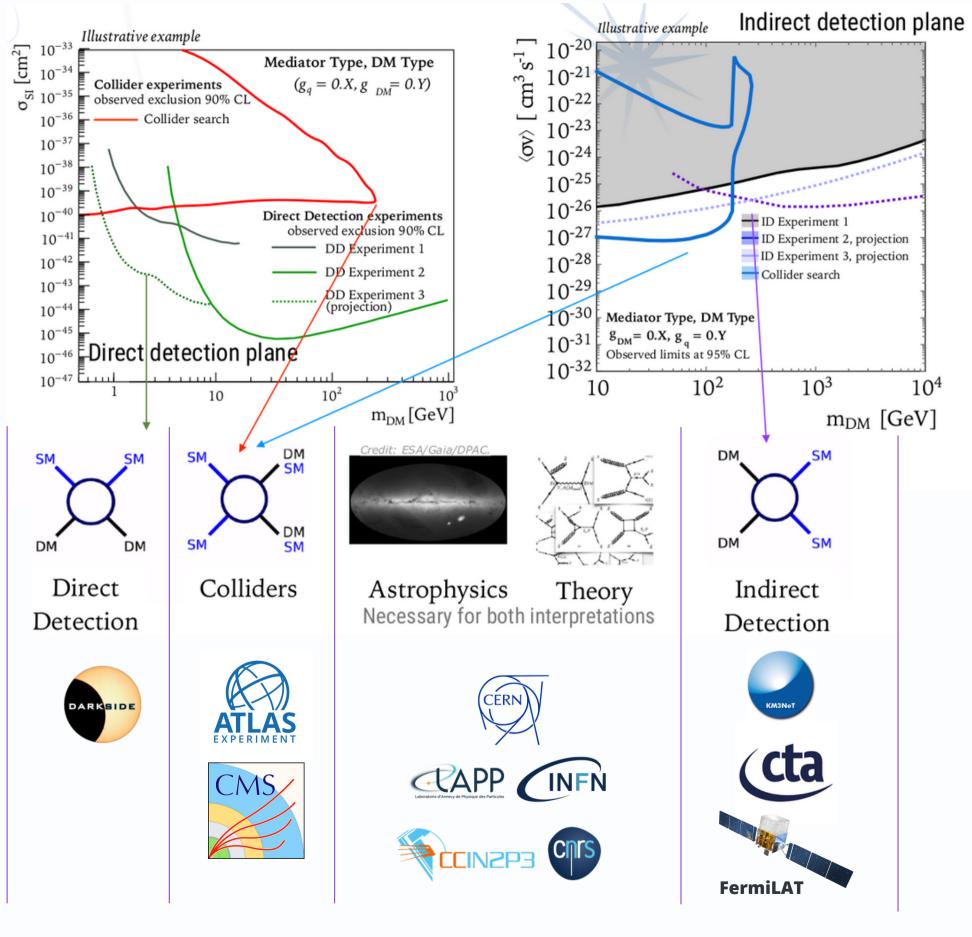


## Dark Matter searches

Both HEP and astrophysics and researching limits of Dark matter, and preserving analysis workflows would enable to output **combined plots** 

See yesterday's talk by J. Little



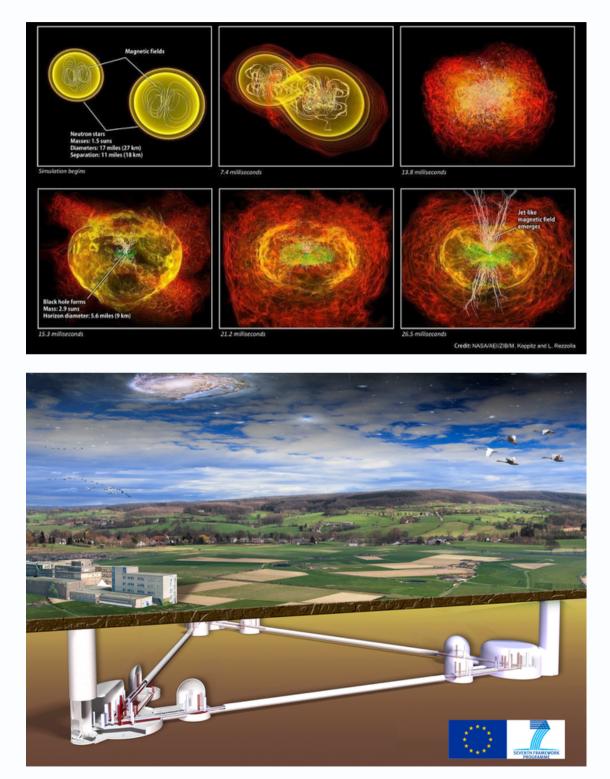


## Extreme Universe searches

Multi-messenger astronomy: EM radiation, GW, neutrinos, cosmic rays are created by different astrophysical processes, and thus reveal different information about their sources)

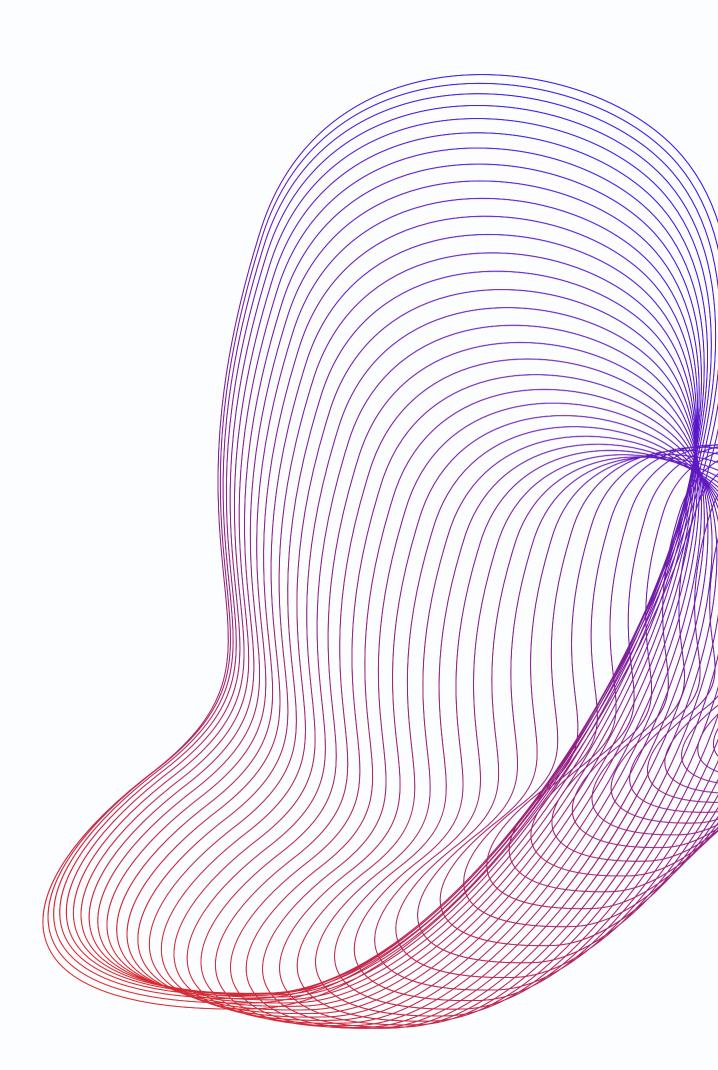
| INPUT DATA | Binary Neutron<br>Star Merger   | Active<br>Galactic<br>Nuclei        | Core-Collapse<br>Supernovae            |
|------------|---|-------------------------------------|--|
| STUDY      | <ul> <li>GW</li> <li>Fast Radio<br/>Bursts</li> <li>Broadband<br/>follow ups</li> </ul> | multi<br>wavelength<br>observations | <ul><li>Neutrinos</li><li>GW</li></ul> |
| EXPERIMENT |   |                                     | ((O)))VIRGO                            |
|            | <b>LOFAR</b>  | FermiLAT                            | KM3NeT                                 |



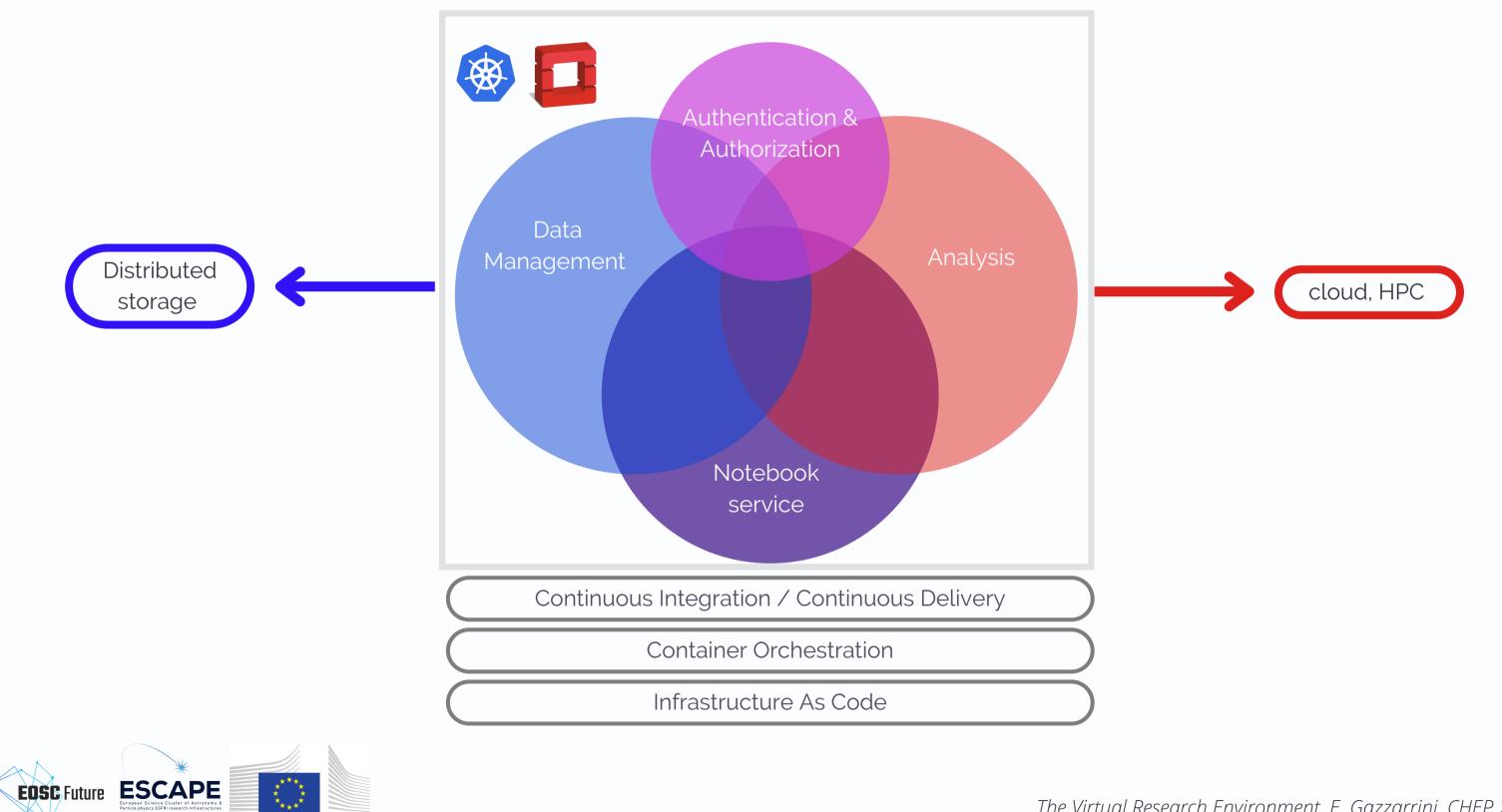


# VRE Components





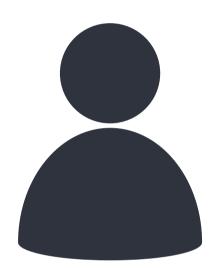
## The building blocks



European Commission

CERN

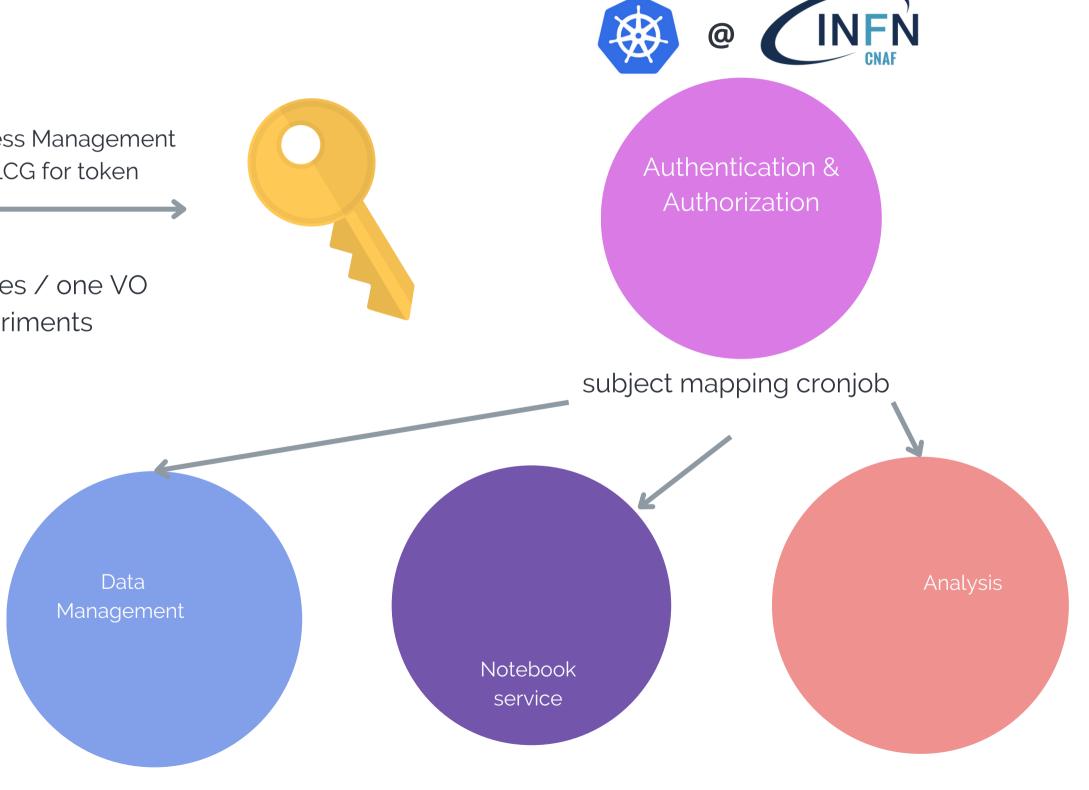
## Authentication & Authorisation



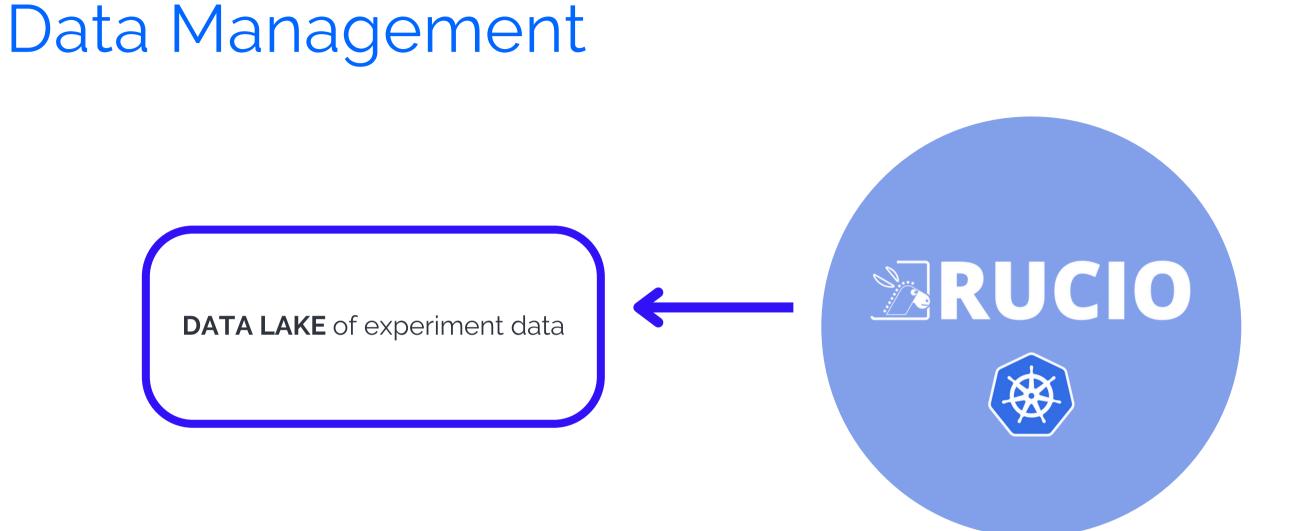
INDIGO Identity and Access Management (IAM) - adopted by WLCG for token

- OIDC tokens
- X.509 certificates / one VO for all the experiments









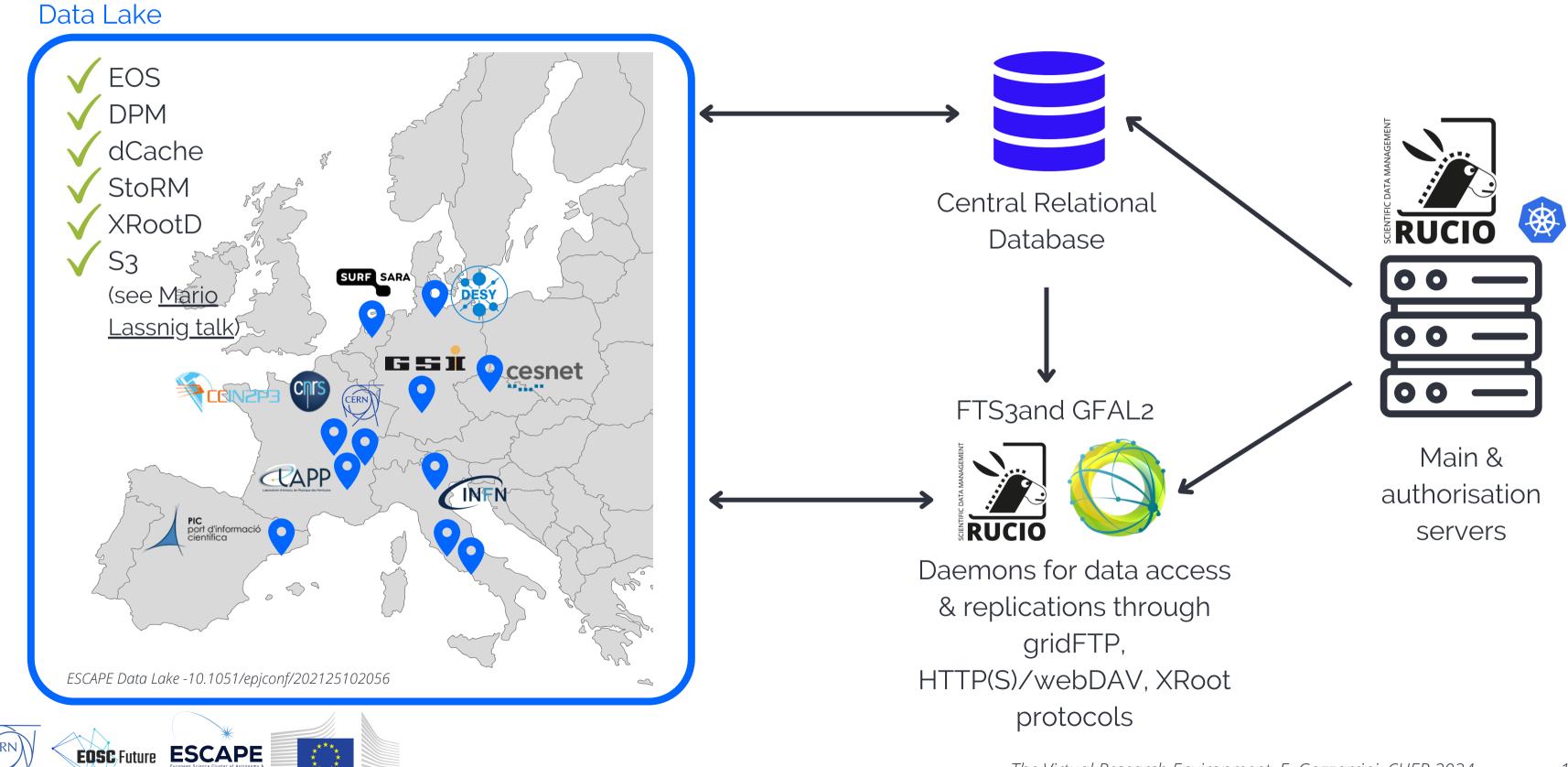
**<u>Rucio</u>** is an **open-source data management and orchestration** project initially developed by the ATLAS experiment to manage large volumes of data. It is now used by various CERN and non-CERN communities.

The Data Lake is a policy-driven, reliable, distributed data infrastructure able to deliver data on-demand at low latency to all types of processing facilities. It ensures data security, quality and access. The storage elements are managed by partner institutions.



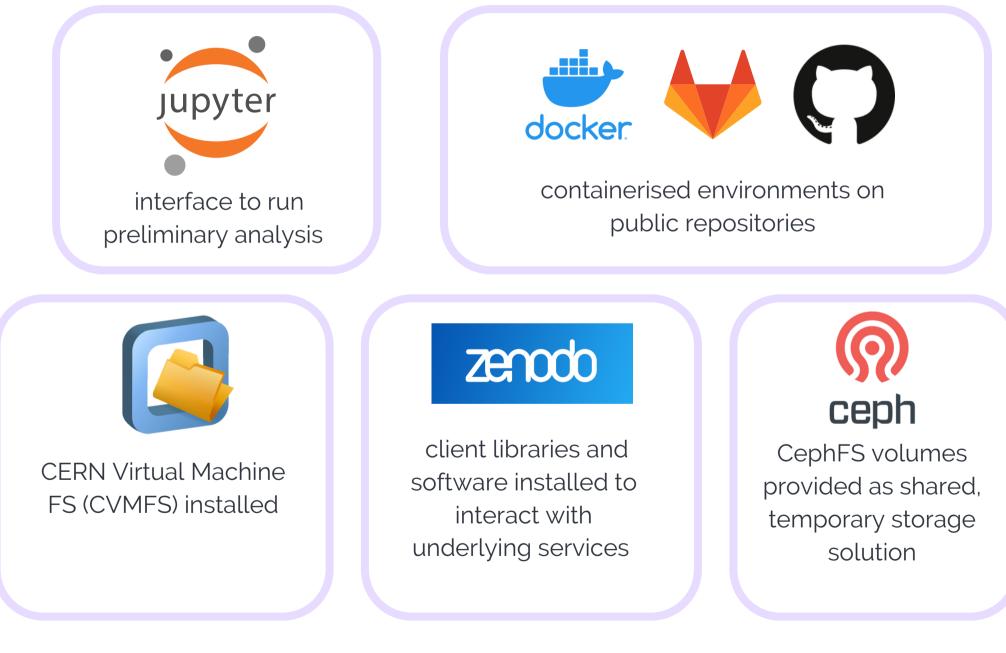
### Rucio instance

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### Notebook Service

To facilitate interactive analysis.





### Server Options

| ۲ | Minimal environment<br>Based on jupyter/scipy-notebook (active reana-client)   |
|---|--|
| 0 | ROOT environment<br>ROOT v6.26.10, a C++ kernel is implemented too - DASK testing  |
| 0 | Minimal environment - python 3.9.13<br>Contains a REANA client   |
| 0 | Virtual Observatory environment<br>Contains Jupyter Notebooks examples with the basic usage of the IVOA tools                                      |
| 0 | Indirect Dark Matter Detection Environment<br>Contains a GCC compiler and the MLFermiLATDwarfs and fermitools libraries - not fermipy<br>(bugged)  |
| 0 | Common gamma analysis tools<br>Contains a GCC compiler and astropy, sherpa, agnpy, gammapy libraries   |
| 0 | Wavelet Detection Filter (WDF) project environment<br>Contains the full WDF env  |
| 0 | Compact stars Science Project environment<br>Contains the matchmaker library   |
| 0 | KM3NeT Science Project environment<br>Contains the common gamma analysis tools and the km3io, km3pipe and km3irf libraries                         |
| 0 | KM3NeT & CTA combined analyses<br>Compatible environament with gammapy and the km3io, km3pipe and km3irf libraries (env testing)                   |
| 0 | SKA SDC1<br>SKA environment profile for SDC  |
| 0 | LOFAR environment<br>Based on the prefactor container. Can be used to image LOFAR data   |
| 0 | ESAP shopping basked environment<br>Using the ESAP shopping basket library.  |
| 0 | ESAP shopping basked environment (with astropy)<br>ESAP shopping basket and astropy, e.g. to download and plot images from the virtual observatory |

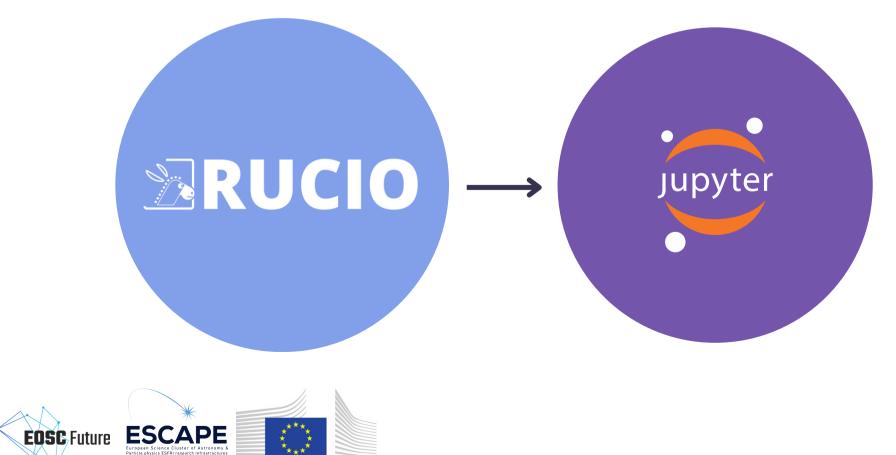
Start

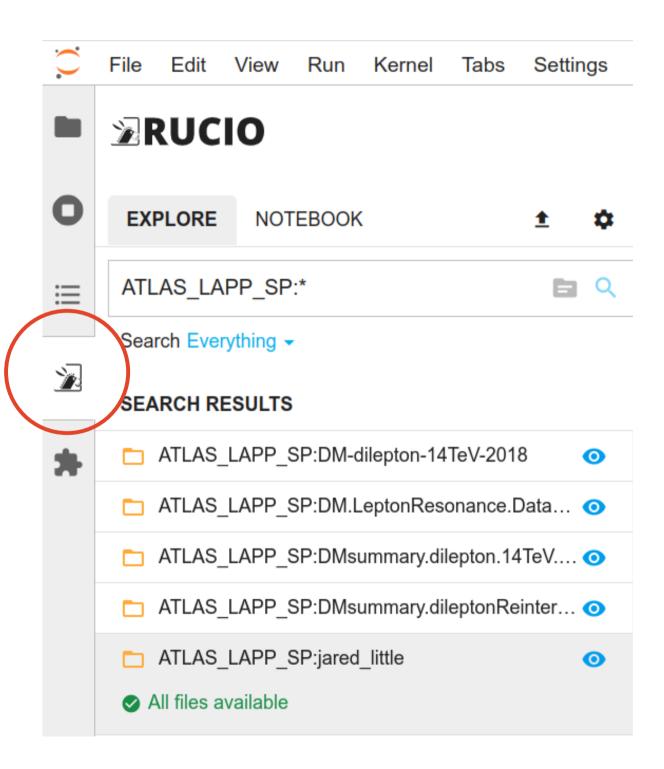
### Data into the notebook

The **Jupyterhub Rucio extension** hides the complexity of the Data Lake and allows users to

- browse experiments' data catalogue
- authenticate with OIDC tokens to the Rucio infrastructure
- replicate data into the notebook
- import the data into the notebook by assigning a parameter to it
- run preliminary analysis to prototype code

European



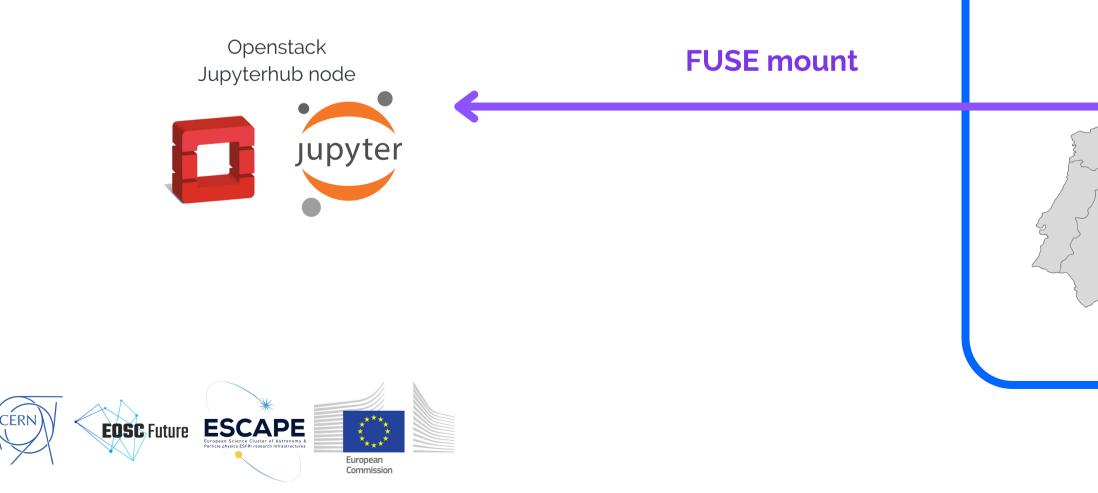


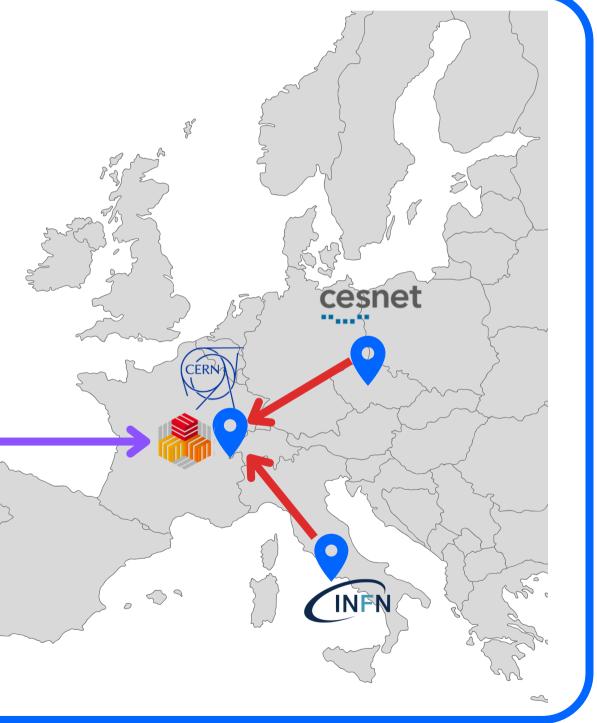
### Data into the notebook

Data gets replicated through Rucio daemons from any storage element to an EOS storage element of half a Petabyte FUSE mounted on the Jupyterhub node.

The computation is limited to the CPU capacity of the node.

How do we SCALE OUT?

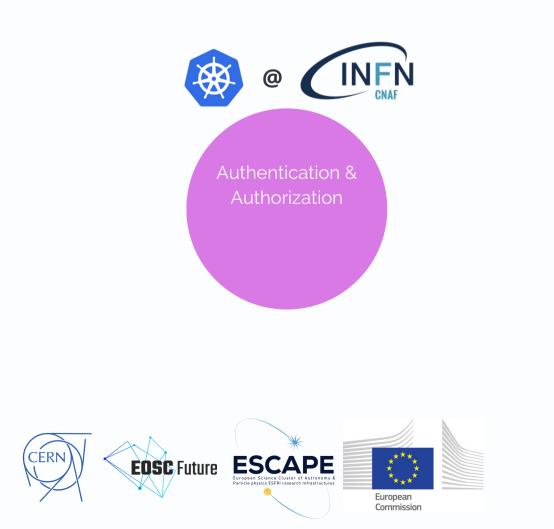




Data Lake

## Computing

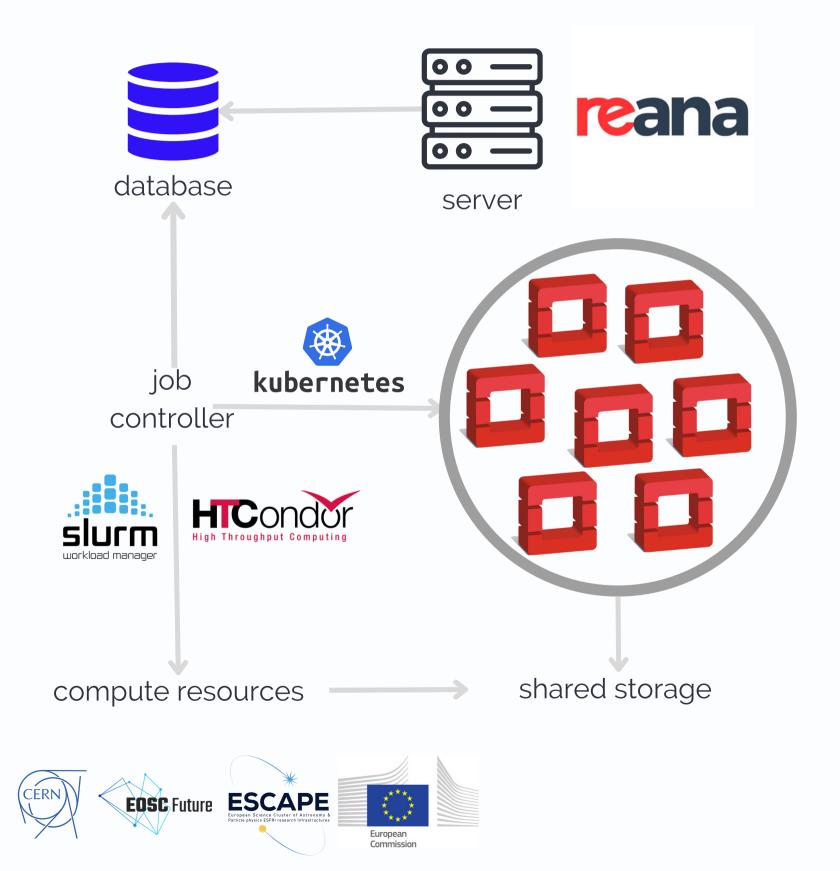
- **Distribute** the analysis
  - resource managers (Kubernetes, HTCondor (High Throughput Computing (HTC)) and Slurm (High Performance Computing (HPC))
  - work schedulers (Dask, Reana, Spark)
- **Preserve** the analysis for reuse
  - work schedulers (Reana)





machines connected over a network (cluster of cloud, local or grid resources)

### Analysis preservation and distribution



**Reana** is a reproducible analysis project developed at CERN, to make the preservation of heavier analyses seamless.

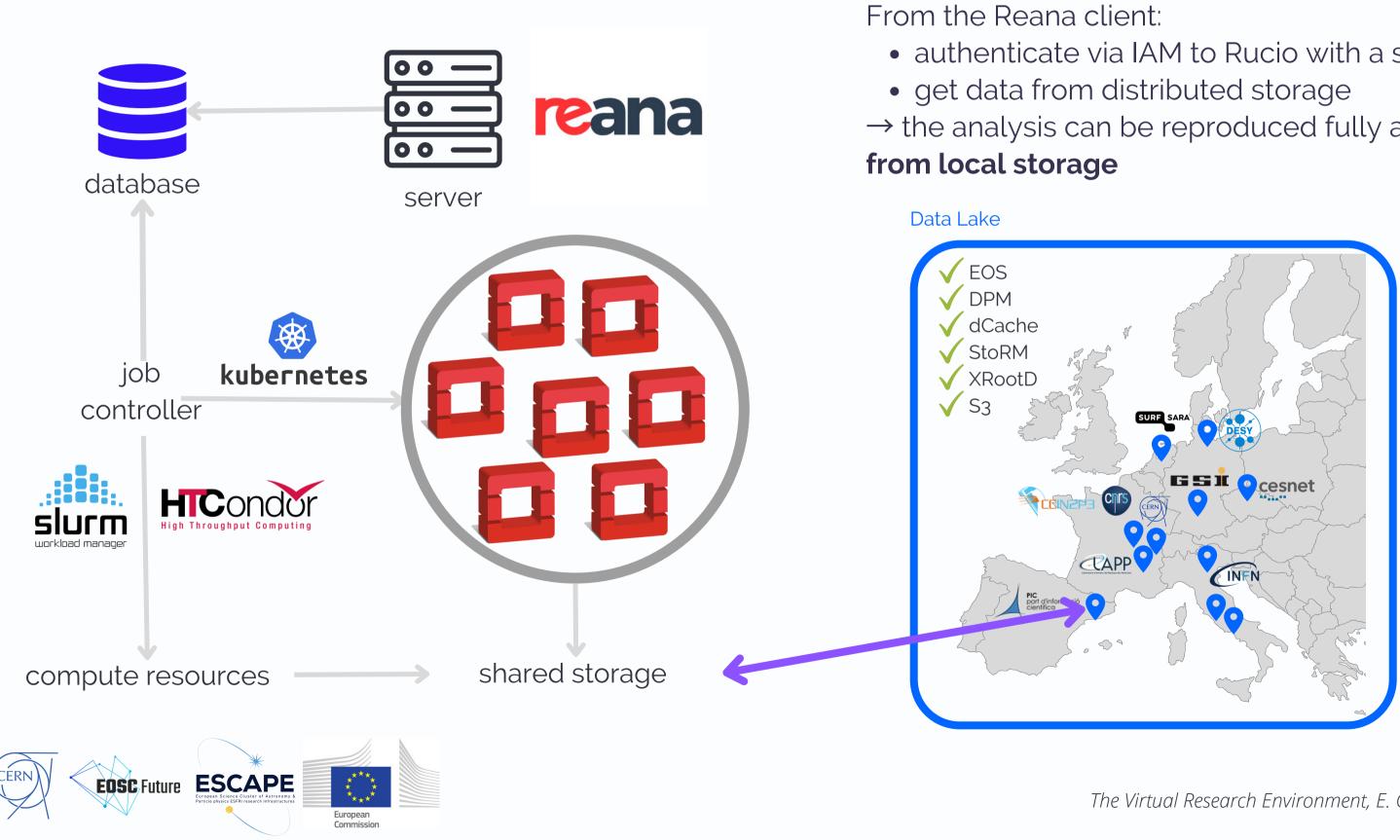
- input data
  - environment
  - code
- - CWL
  - Snakemake

• Easily installed via Helm • Intuitive declarative programming approach (reana.yaml file) with:

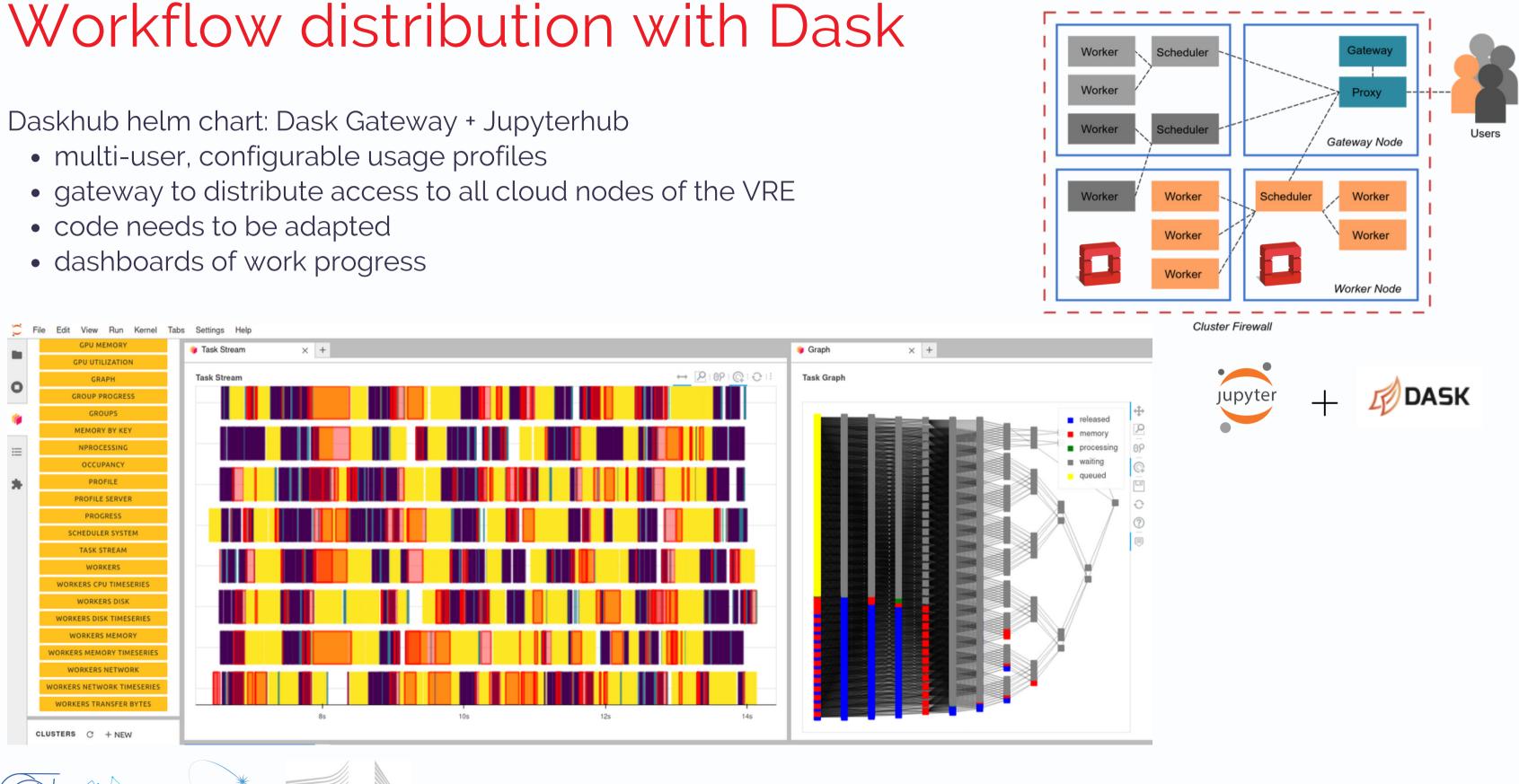
 computational steps • Isolates each step with different containers • Supports workflow engines

• <u>Yadage</u> --> workflow concatenation (output becomes input)

### Non-local analysis preservation



- authenticate via IAM to Rucio with a side-car container
- $\rightarrow$  the analysis can be reproduced fully and **independently**



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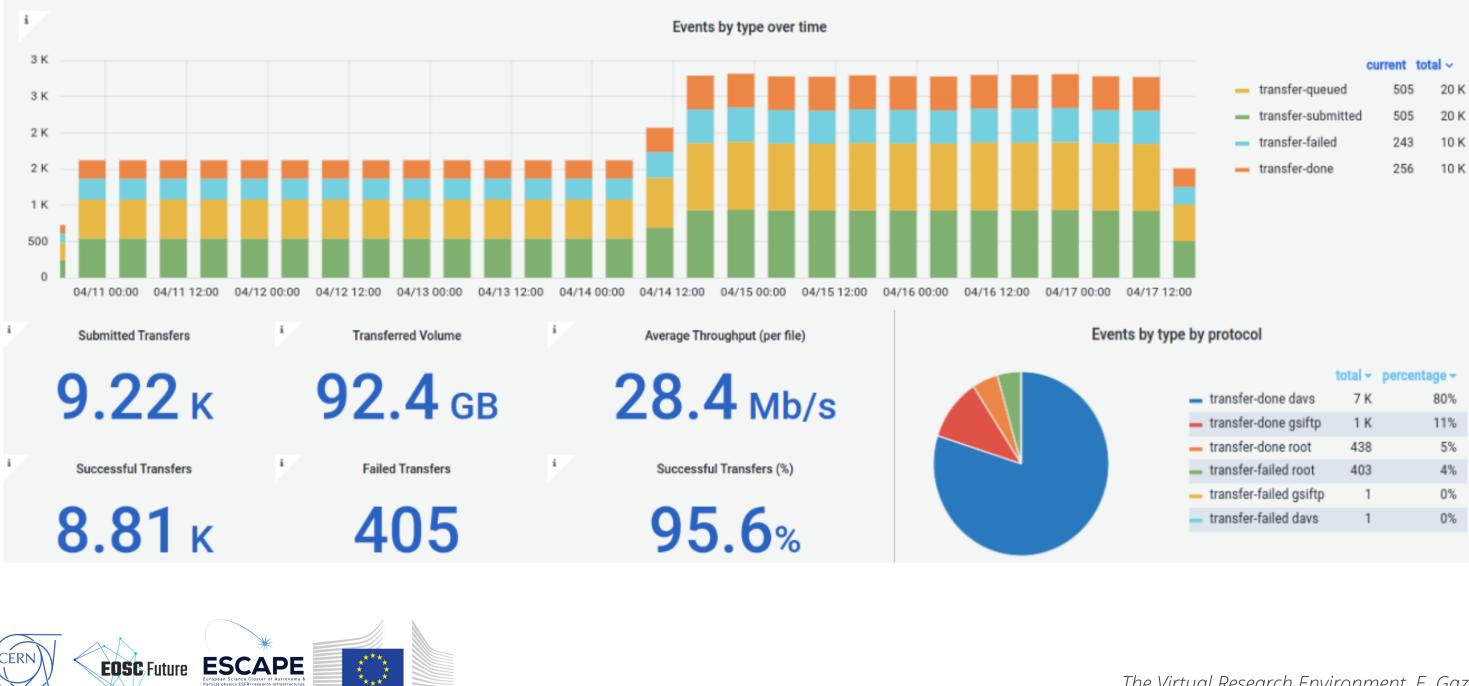
## Monitoring, testing, dashboards, on-boarding

• Continuous monitoring and testing of transfers between Rucio Storage Elements (RSEs) is in place on Grafana dashboards hosted at CERN.

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|  | total 🕶 | percentage 👻 |
|--|---------|--------------|
| <ul> <li>transfer-done davs</li> </ul>     | 7 K     | 80%          |
| <ul> <li>transfer-done gsiftp</li> </ul>   | 1 K     | 11%          |
| <ul> <li>transfer-done root</li> </ul>     | 438     | 5%           |
| <ul> <li>transfer-failed root</li> </ul>   | 403     | 4%           |
| <ul> <li>transfer-failed gsiftp</li> </ul> | 1       | 0%           |
| <ul> <li>transfer-failed davs</li> </ul>   | 1       | 0%           |
|  |         |              |

## Monitoring, testing, dashboards, on-boarding

- Continuous monitoring and testing of transfers between Rucio Storage Elements (RSEs) is in place on Grafana dashboards hosted at CERN.
- Rucio and Reana UI interfaces deployed with K8s allow to explore and debug failed transfers and workflows.

| AnalysisElenaNontuples #3<br>Finished 16 days ago  | finished in 3 min 44 sec step 4/4  | Name   |
|--|------------------------------------|--|
|  |                                    | elena_test:2023.03.16-11.19.03.txt           |
| 🗱 Engine logs >_ Job logs 🗅 Workspace 🗟 Specification  |                                    | user.ron:test_from_CERN-030523_1643.txt      |
|  |                                    | user.ron:test_from_CERN-030523_1643.txt      |
| Step     htupleAnalysisEl        finished in 47 seconds        Kubernetes        # ghcr.io/vre-hub/atlas-dilepton:latest       \$ eche   | o 'Current Directory' echo \$PWD l | user.ron:mytestfile_2                        |
| -rw-rw-r 1 root root 26222 Apr 21 10:32 prunSelector.py<br>drwxrwxr-x. 1 root root 25 Apr 21 10:34 recast  |                                    | elena_test:test-file-rucio-2023-04-24-01.txt |
| -rw-rw-r 1 root root 11825 Apr 21 10:32 runSelector.py   |                                    | elena_test:test-file-rucio-2023-04-24-02.txt |
| -rw-rw-r 1 root root 172 Apr 21 10:32 runprunSelector.py   |                                    | elena_test:test-file-rucio-2023-04-24-01.txt |
| Error in <tchain::loadtree>: Cannot find tree with name nominal in file<br/>ntuples/mcl6a/user.dummy.recastSignal.mcl6 13TeV.500353.MGPy8EG MET 50 lv lds mZp 500 ee minitrees.</tchain::loadtree> | root/user.dummy.dummy. 000001.     | elena_test:test-file-rucio-2023-04-20-04.txt |
| minitrees.root   |                                    | elena_test:test-file-rucio-2023-04-20-03.txt |
| Error in <tchain::loadtree>: Cannot find tree with name nominal in file<br/>ntuples/mcl6a/user.dummy.recastSignal.mcl6_13TeV.500353.MGPy8EG_MET_50_lv_lds_mZp_500_ee_minitrees.</tchain::loadtree> | root/user.dummy.dummy000001.       | elena_test:test-file-rucio-2023-04-19-01.txt |
| minitrees.root<br>Error in <tchain::addbranchtocache>: Could not load a tree</tchain::addbranchtocache>  |                                    | elena_test:test-file-rucio-2023-04-19-01.txt |
| Error in <tchain::loadtree>: Cannot find tree with name nominal in file<br/>ntuples/mcl6a/user.dummy.recastSignal.mcl6_13TeV.500353.MGPy8EG_MET_50_lv_lds_mZp_500_ee_minitrees.</tchain::loadtree> | root/user.dummy.dummy. 000001.     | elena_test:test-file-rucio-2023-04-19-01.txt |
| minitrees.root   |                                    | elena_test:test-file-rucio-2023-04-19-01.txt |
| user.dummy.recastSignal.mcl6_13TeV.500353.MGPy8EG_MET_50_1v_lds_mZp_500_ee_minitrees.root<br>Number of events to process: 0  |                                    | elena_test:test-file-rucio-2023-04-19-01.txt |



| Account  | RSE Expression  | Creation Date                | Remaining<br>Lifetime | State       |
|----------|-----------------|------------------------------|-----------------------|-------------|
| egazzarr | EULAKE-1        | 2023-05-<br>07T13:22:23.000Z | 7d                    | STUCK       |
| garcia   | SURF-IOP-EXP    | 2023-05-<br>04T10:35:14.000Z | -                     | STUCK       |
| garcia   | EULAKE-1        | 2023-05-<br>03T14:43:27.000Z | -                     | ок          |
| garcia   | DESY-DCACHE     | 2023-05-<br>03T14:35:27.000Z | -                     | ок          |
| egazzarr | PIC-DCACHE      | 2023-04-<br>24T14:13:33.000Z | -                     | ок          |
| egazzarr | PIC-DCACHE      | 2023-04-<br>24T14:12:45.000Z | -                     | REPLICATING |
| egazzarr | EULAKE-1        | 2023-04-<br>24T14:12:12.000Z | -                     | ок          |
| egazzarr | IN2P3-CC-DCACHE | 2023-04-<br>20T15:08:51.000Z | -                     | REPLICATING |
| egazzarr | DESY-DCACHE     | 2023-04-<br>20T15:06:00.000Z | -                     | REPLICATING |
| egazzarr | SURF-IOP-EXP    | 2023-04-<br>19T15:53:19.000Z | -                     | STUCK       |
| egazzarr | IN2P3-CC-DCACHE | 2023-04-<br>19T15:42:32.000Z | -                     | ок          |
| egazzarr | EULAKE-1        | 2023-04-<br>19T15:35:53.000Z | -                     | ок          |
| egazzarr | DESY-DCACHE     | 2023-04-<br>19T15:33:53.000Z | -                     | ок          |
| egazzarr | CESNET-S3       | 2023-04-<br>19T15:33:34.000Z | -                     | ок          |
|          |                 |                              |                       |             |

## Monitoring, testing, dashboards, on-boarding

- Continuous monitoring and testing of transfers between Rucio Storage Elements (RSEs) is in place on Grafana dashboards hosted at CFRN.
- Rucio and Reana UI interfaces deployed with K8s allow to explore and debug failed transfers and workflows.
- **Documentation** is hosted on Github pages and is made easy for both users and system administrators who would like to get inspired by the VRE model.

### The VRE

A comprehensive analysis platform to serve the particle physics and astrophysics community.

View My GitHub Profile



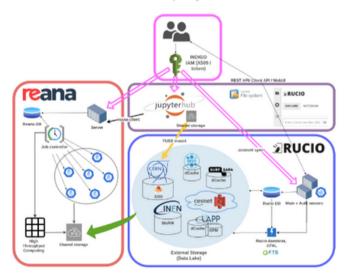
Hosted on GitHub Pages — Theme by orderedlist

### The Virtual Research Environment

The Virtual Research Environment is an analysis platform developed at CERN serving the needs of scientific communities involved in European Projects. Its scope is to facilitate the development of end-to-end physics workflows, providing researchers with access to an infrastructure and to the digital content necessary to produce and preserve a scientific result in compliance with FAIR principles. The platform's development is almed at demonstrating how sciences spanning from High Energy Physics to Astrophysics could benefit from the usage of common technologies, initially born to satisfy CERN's exabyte-scale data management needs.

The Virtual Research Environment's main components are:

- 1. A federated and reliable Authentication and Authorization layer
- 2. A federated distributed storage solution (the Data Lake), providing functionalities for data injection and replication through a Data Management framework (Rucio)
- 3. A computing cluster supplying the processing power to run full analyses with Reana, a re-analysis software
- 4. An enhanced notebook interface with containerised environments to hide the infrastructure's complexity from the user.



The deployment of the Virtual Research Environment is open-source and modular, in order to make it easily reproducible by partner institutions; it is publicly accessible and kept up to date by taking advantage of state of the art IT-infrastructure technologies.

The Science Projects which are using the VRE are described here.

If you are a scientist or a new user curious to use the above resources, please refer to the following documentation:

- 1. AAI 2. Rucio Data Lake
- 3. Reana cluster
- 4. Notebook service

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## Deployment

VRE public Github repository hosts

- cloud deployment of the infrastructure components with Helm, Flux, Terraform and K8s
- Science Projects software to produce the environments for the Jupyterhub instance
- scientific code to be shared
- reana.yaml files to reproduce the analysis
- forums and discussions





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| README.md  |  |
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| Virtual Research Environment   |  |
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| researchers access to a wide web of FAIR data and related services.<br>Our team at CERN is developing and contribution to the infrastructure code b<br>More information can be found on our website. | base of EOSC.  |
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|  | vre-hub.github.io Public ::<br>user documentation  |
| Repositories   |  |
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| vre Public<br>VRE infrastructure template running at CERN<br>● Shell ☆ 3 Ф MIT 양 0 ⊙ 10 \$\$ 0 Updated 2 weeks ago   | M  |

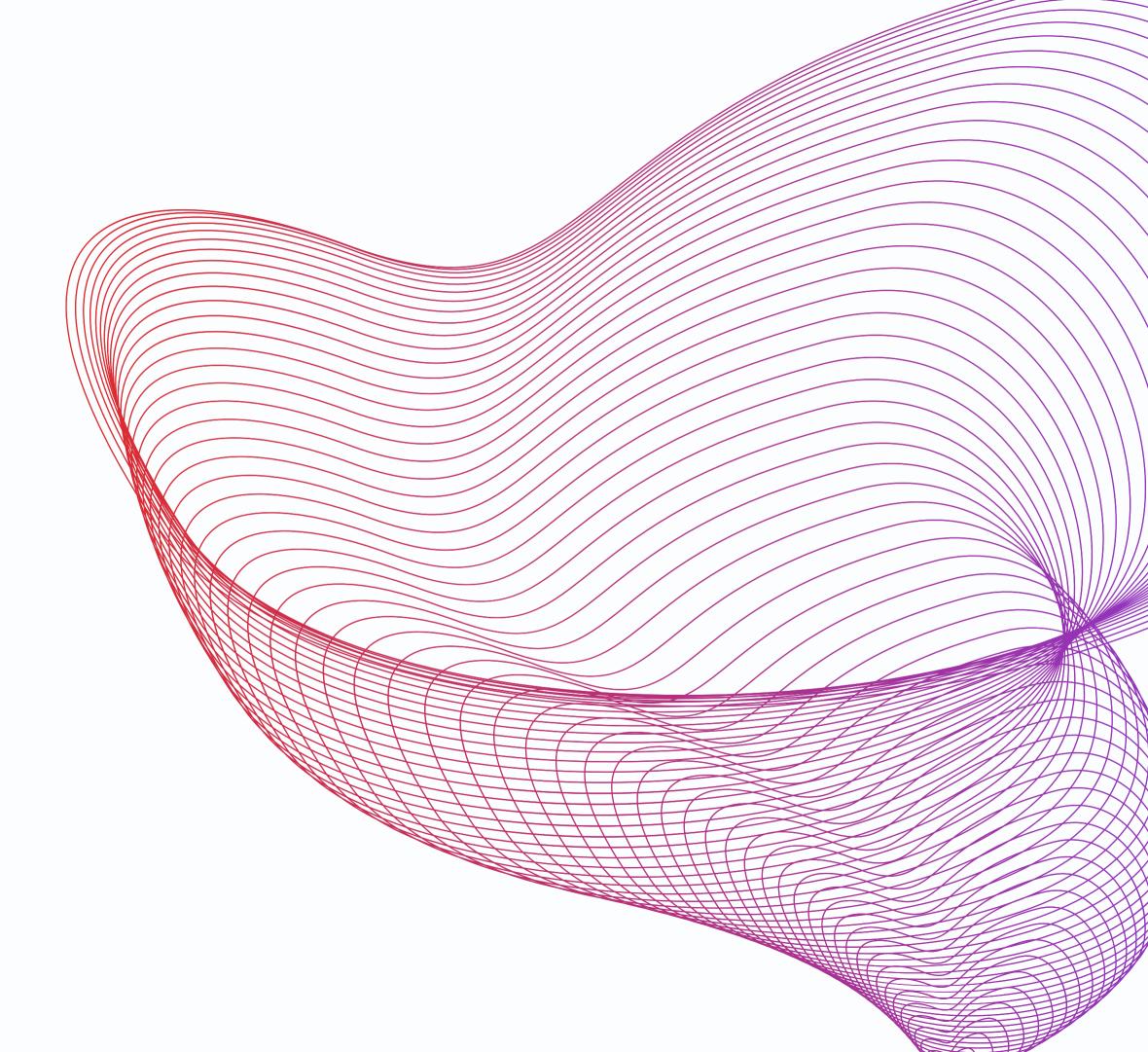
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| WRE@<br>CERN  |   | nent<br>DSC Future project to promote open science and o<br>e.eu ¥@EOSCFuture ⊠vre-admin@cern.ch | collaboration between astropa |
|---|---|--|-------------------------------|
| Overview  | Repositories 10 🖓 Discussions 🗄   | Projects 1 💮 Packages 🗛 Teams 1  | A People 5 龄 S                |
| README.md   | Research Environment  |  | Ø                             |
| researchers<br>Our team at  | e is an EU-funded H2020 project that is implementi<br>access to a wide web of FAIR data and related serv<br>CERN is developing and contribution to the infrastr<br>ation can be found on our website. | vices.   | OSC will give European        |
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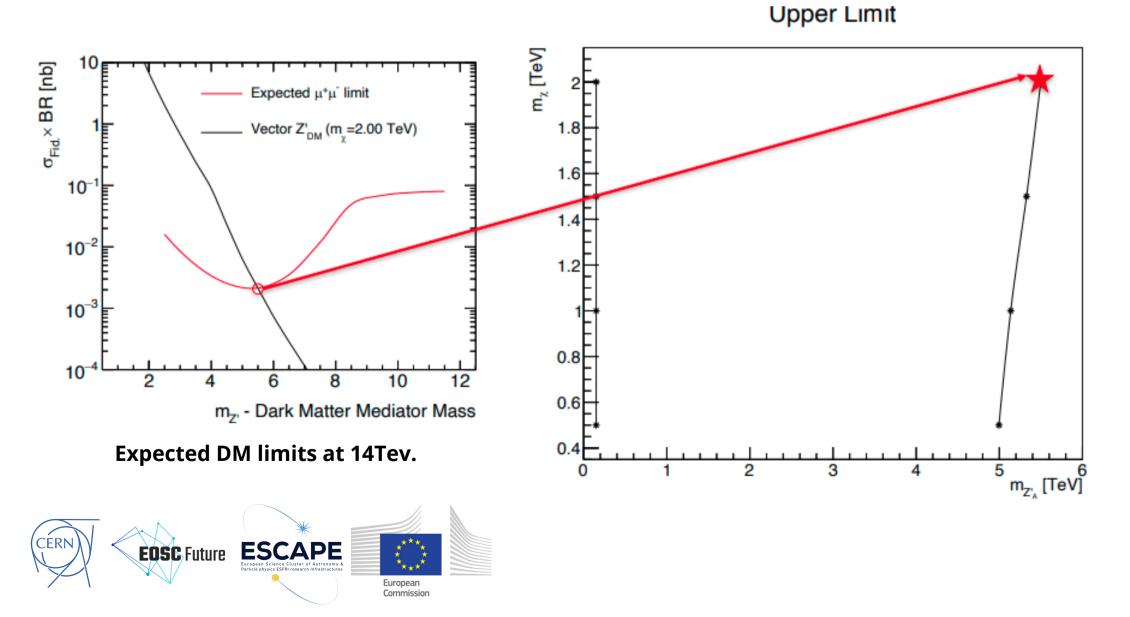
# Demo

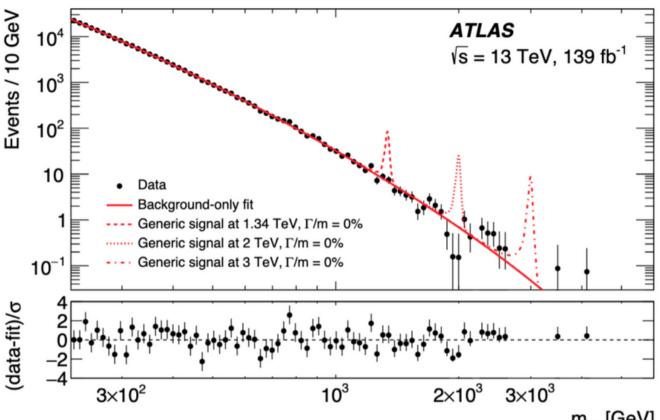




### DM@LHC with ATLAS

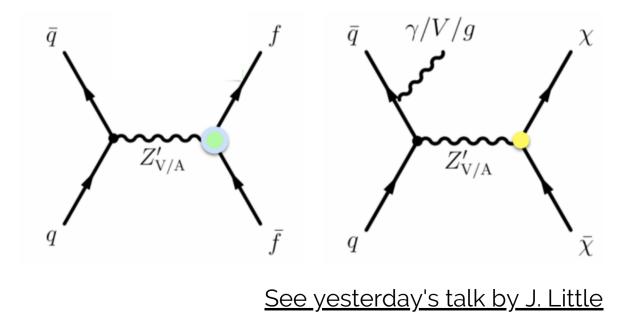
- 1. Dark Matter Reinterpretation: setting limits on High-Luminosity LHC contraints on  $Z' \rightarrow \chi \chi$
- (Z' mediated Dark Matter models).
- 2. The dilepton inclusive search (right) concluded in 2019
  - a objective: projecting limits to 14 TeV and computing the fiducial cross-sections in **lower mass regions.**





m<sub>ee</sub> [GeV]

**Dilepton Inclusive Search.** Results of this analysis demonstrate good agreement with SM predictions.



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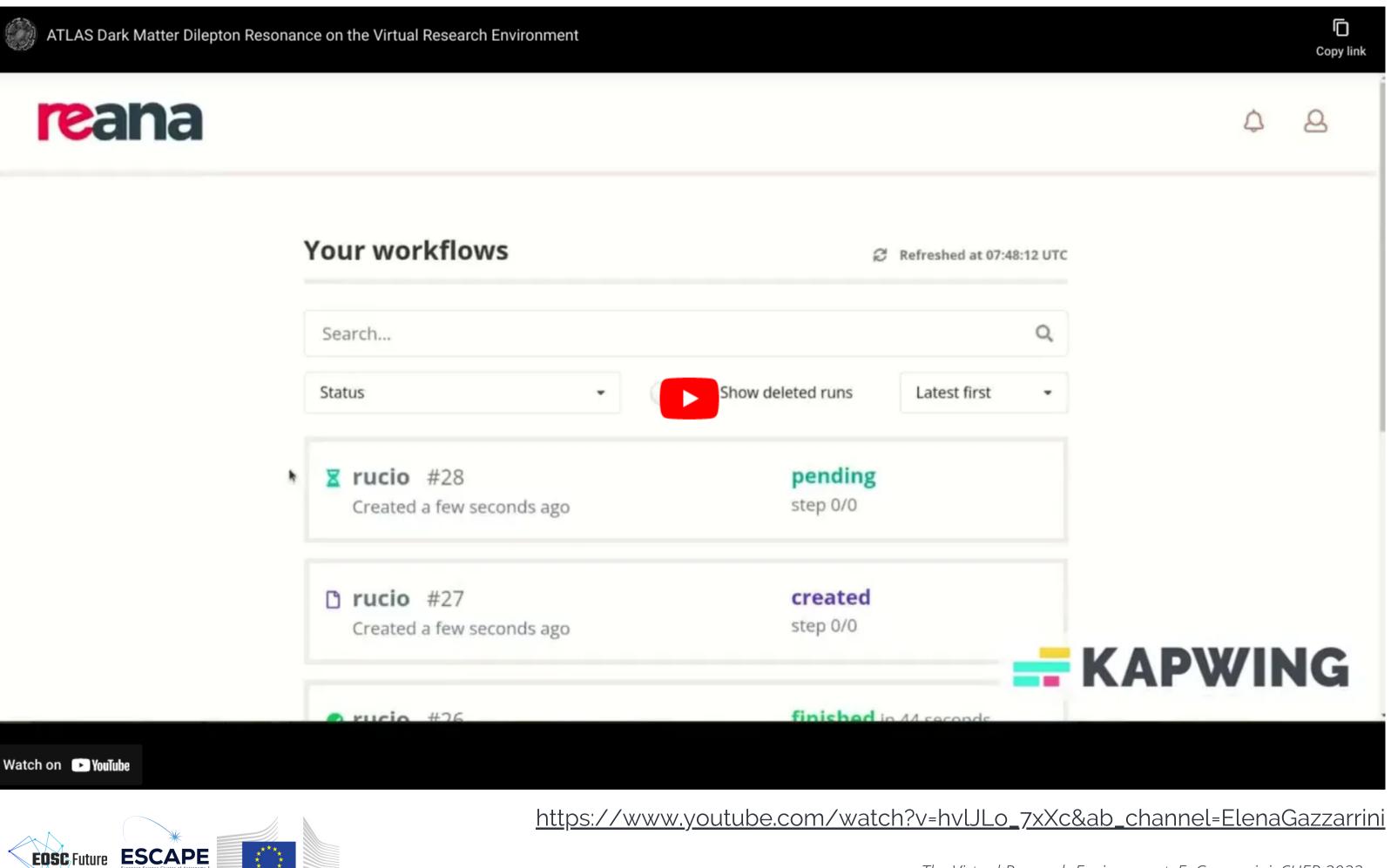
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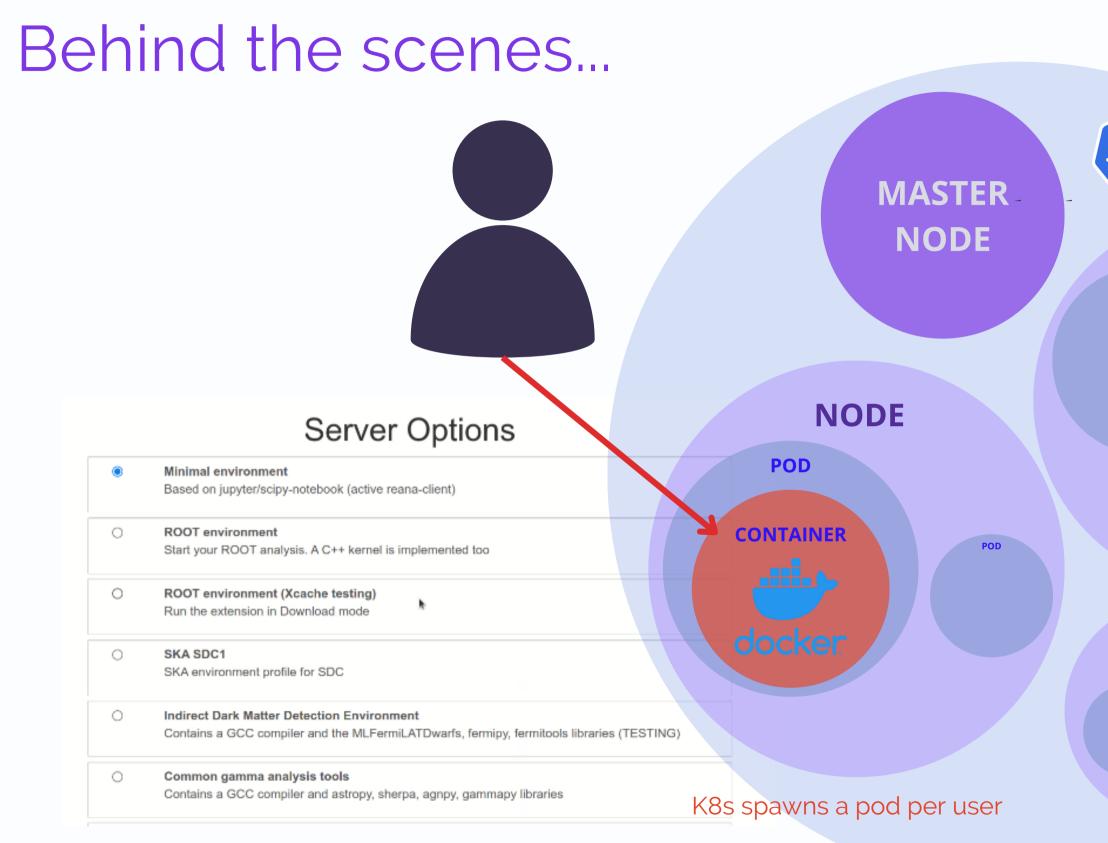


CERN

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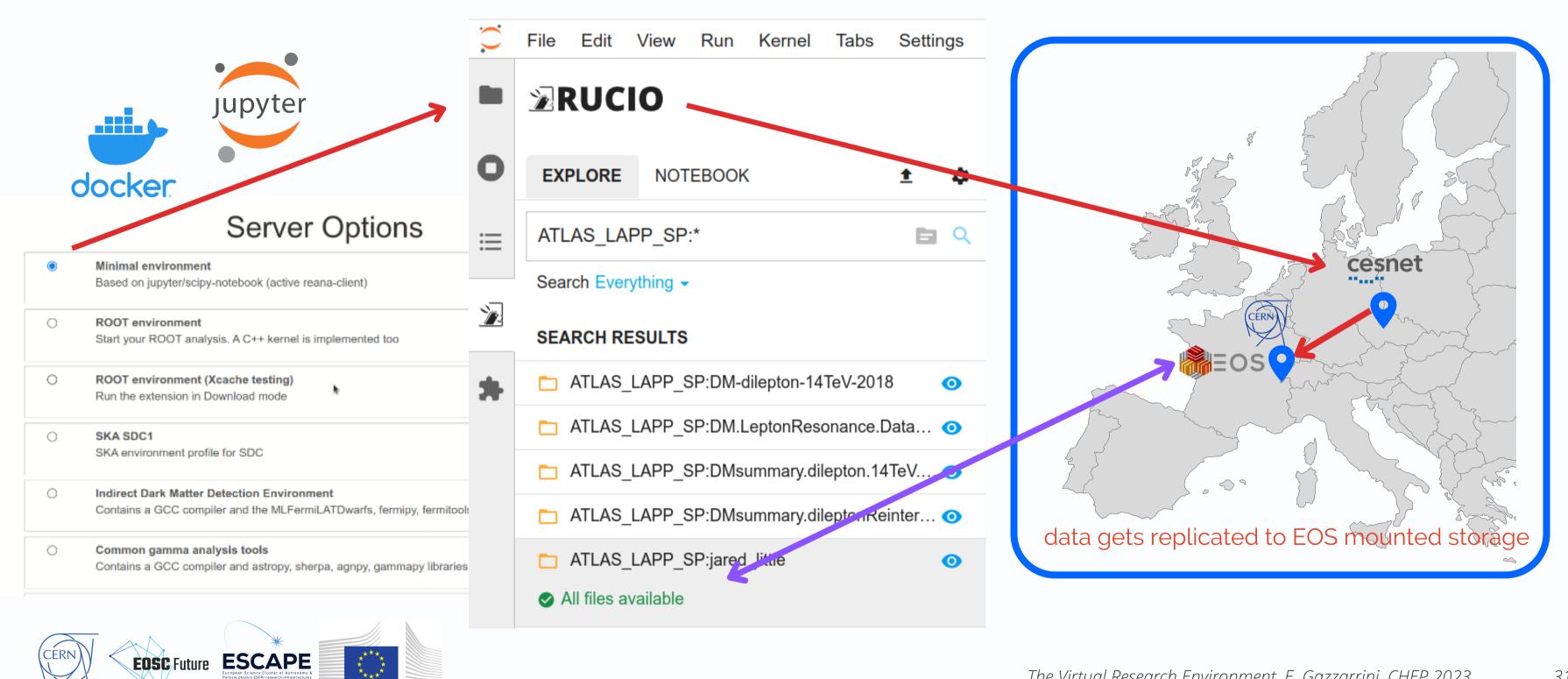


### NODE

### NODE

### Behind the scenes...

European Commission

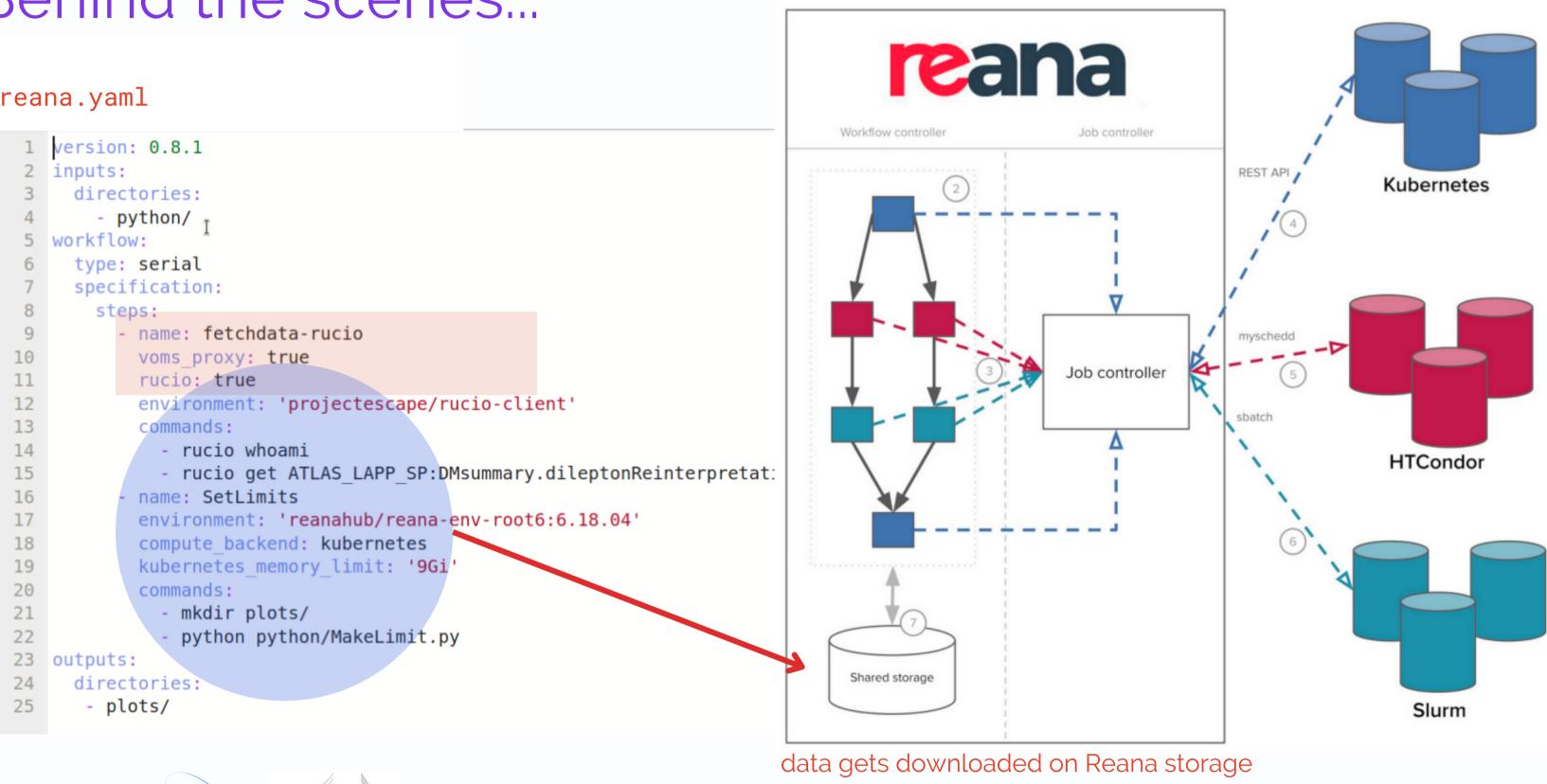


### Behind the scenes...

### reana.yaml

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The Virtual Research Environment, E. Gazzarrini, CHEP 2023

# Future outlook

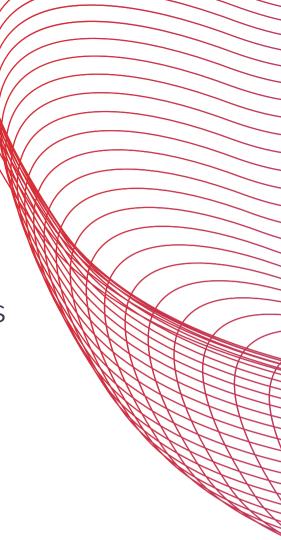
Success stories

- Escape Open Collaboration Agreement ensures the collaboration and joint common activities across scientific communities in the development of VREs
- VRE awoke interest from scientific domains who are in early-stage prototype phase
  - Einstein telescope (next generation gravitational waves detector)
  - NUCLEUS experiment (elastic neutrinos scattering)
  - VdR Würzburg German centre for Data-Intensive Radio Astronomy
- Interest from new digital models (i.e. <u>digital twins</u>) developed within European projects

Future plans

- connection with HPCs, commercial clouds and other external computing resources
  - FENIX and the EuroHPC Joint Undertaking work (eg: FTS delivering files to Julich-HPC with S3 protocol)
- Use VRE as a performance evaluation between workload managers
- Caching data on distributed storage





# The VRE is ...

### • modular

- $\circ\,$  integrates software, tools and packages
- can be configured to connect to remote storage and computing resources

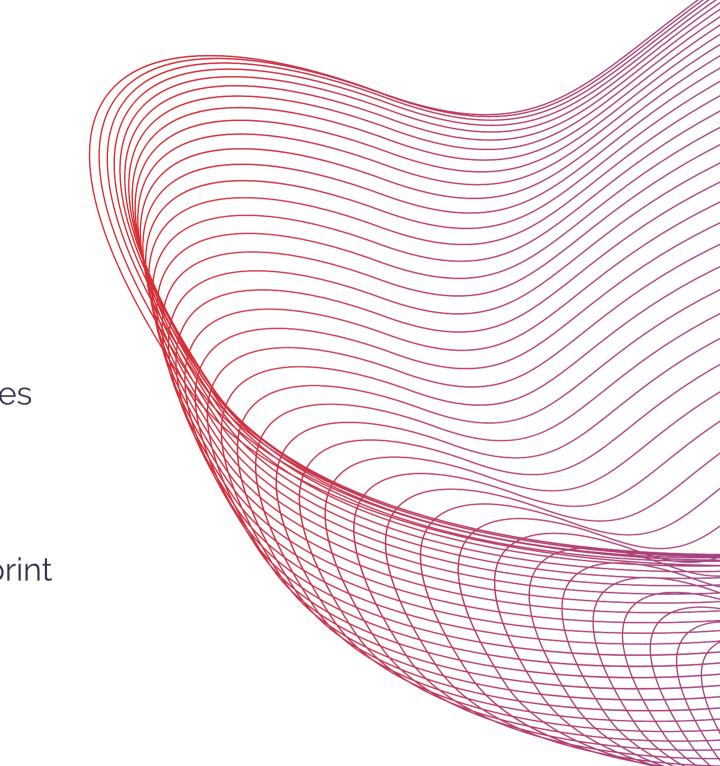
### • flexible

- ad-hoc workflows can be created via easily editable declarative files
- $\circ\,$  can be installed on different machines
- $\circ~$  independent of CERN restrictions

### reproducible/sustainable

- deployment is kept simple and documented to be used as a blueprint for other research infrastructures
- allows analysis preservation
- useful for sharing and collaboration
  - $\circ\,$  common entry point with same authentication for all services





# Thank you

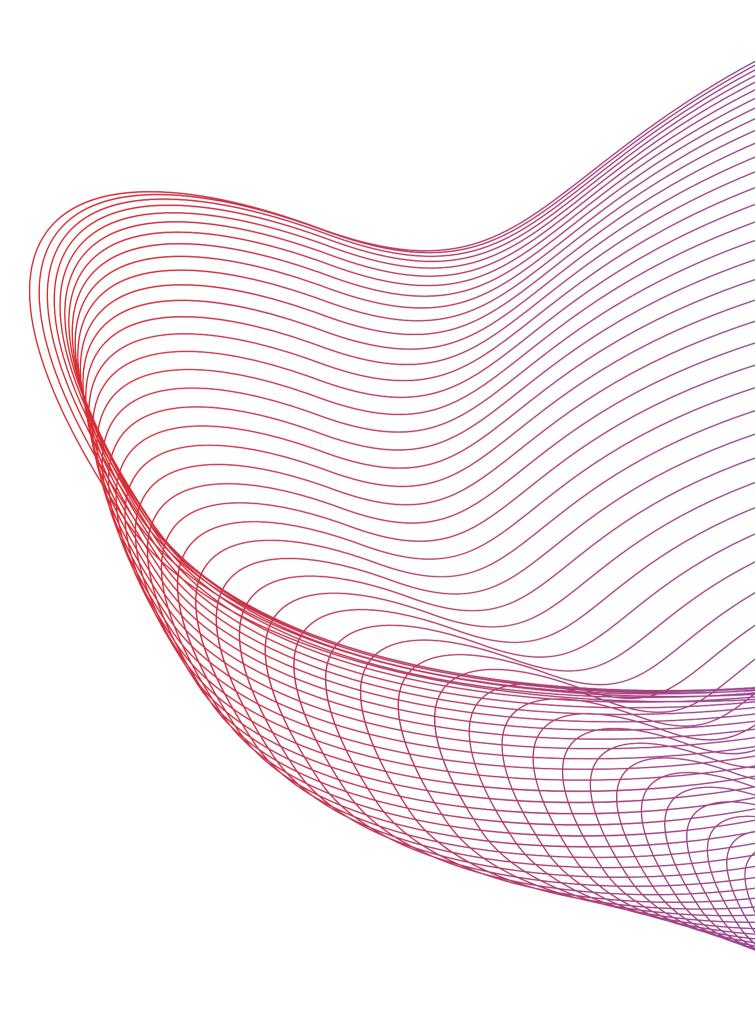
### special thanks to

Tibor Simko & Reana team, Martin Barisits & Rucio team, Xavier Espinal, Ian Bird, CNAF IAM team and all the Science Projects researchers (Jared Little, Caterina Doglioni, Christopher Eckner, Alexander Ekman, Axel Gallen, Mikhail Smirnov, Francesca Calore, Pooja Bhattacharjee, Valerio Ippolito, Estelle Pons, Elena Cuoco, Alberto Iess, Alessandro Parisi, Dany Vohl)

### e-mail

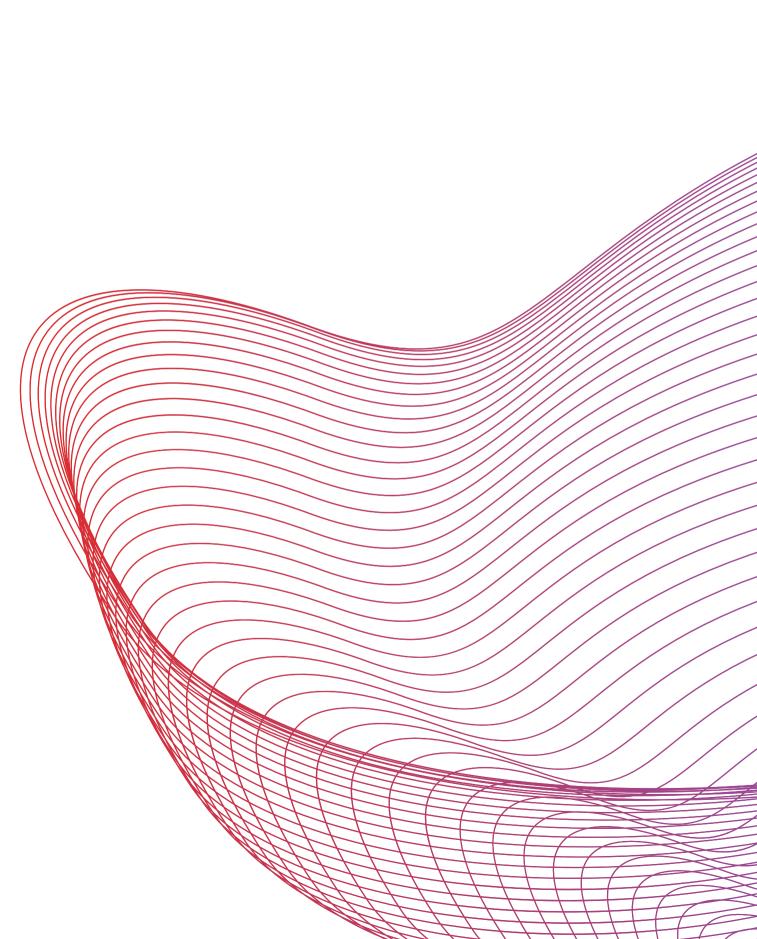
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# Back up





# Status

The VRE is an R&D project and it is not a production system. As such, the platform is maintained by a team of 3 people.

For the moment, ~ 230 users subscribed on the IAM platform and have therefore access to the resources.

VRE documentation and links to resources at: <u>https://vre-hub.github.io/</u>.

Links to useful related works are provided by clicking on the <u>underlined</u> text in the slides.

| vCPUs | RAM (GB) | Masters | Nodes | Remote Storage (TB) | Cep |
|-------|----------|---------|-------|---------------------|-----|
| 184   | 335.8    | 3       | 23    | 646                 |     |



| phFS | (TB) |
|------|------|
| 1.8  |      |

25 Openstack machines

- 14.6GB RAM
- 8 VCPU
- 80GB Disk
- Fedora CoreOS 35
- LINUX

## Two sides of the coin

A bipartite look at the ideal infrastructure ...

European

Ergonomic (onboarding, USEABILITY documentation) DATA ACCESS Various FAIR data/metadata types ANALYSIS Performance **REPRODUCIBILITY** / Software and analysis steps SUSTAINABILITY preservation EOSC Future ESCAPE \*\*\*\*

**SCIENTIST** 



### **IT ADMINISTRATOR**

Maintenance, portability, modularity

Security, varied protocols and technologies

Cost, energy consumption

Easy re - deployment