

# Data-driven Space Science at ESAC Science Data Centre (ESDC)

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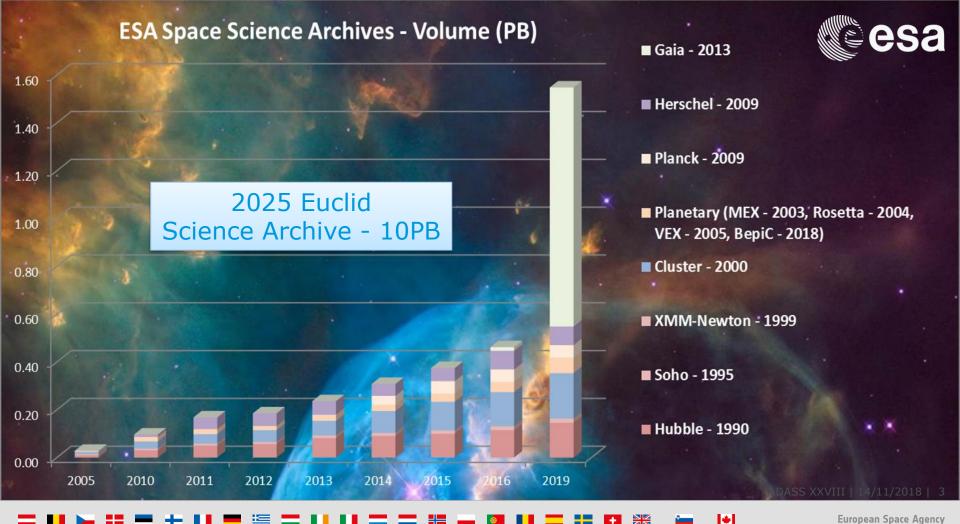
ADASS XXVIII | 14/11/2018 | 2

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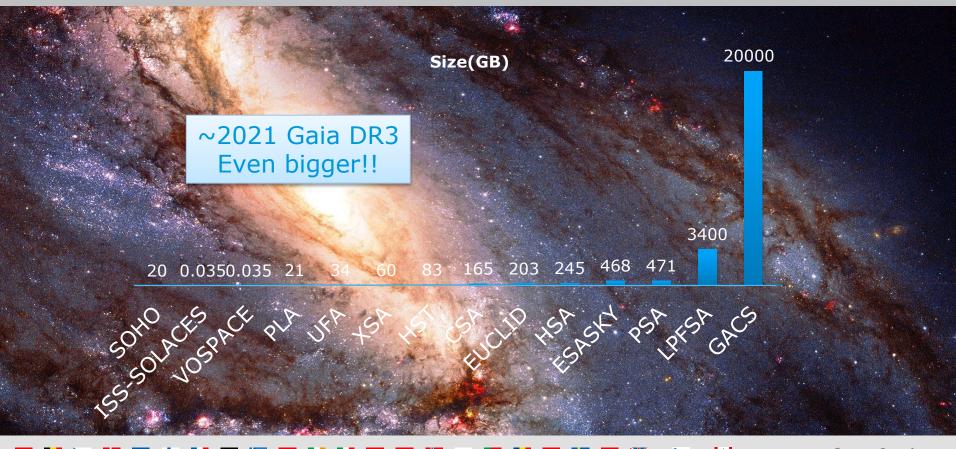
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Data-driven science

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# Databases Size at ESDC (October 2018)



European Space Agency

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# **ESDC Challenges**



Manage large volume of data and high heterogeneity

Enable collaboration between scientists

- Provide tools for exploring and mining the data
- Integrate data (the value of data explodes when it can be linked with other data)
- Manage data in context (track provenance, handle uncertainty and error)

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# Solutions adopted / implemented

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# Scientific collaboration and code to data via Interoperability







- **TAP+** parametric search for metadata in catalogues based on ADQL
- Universal Worker Service (UWS) to manage sync/async queries
- SAMP to interoperate with other analysis applications (Aladin, Topcat, Autoplot,...)
- **EPN-TAP** to query planetary datasets in a standard way, based on TAP

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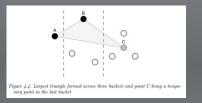
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# Handling of large datasets in RDBMS

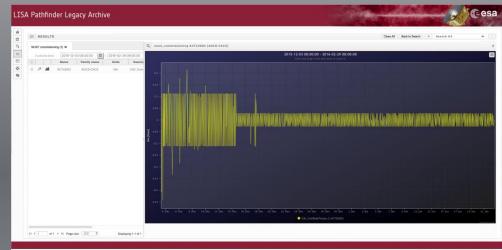
- Table partitioning with Postgresql 10+
- Down-sampling algorithm(s)

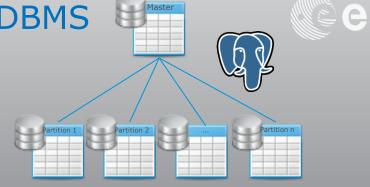
As example, the Lisa Path-Finder Science Archive:

- Tables > 10 billion rows, 10 partitions
- ↑ query performance → synchronous queries & DB is scalable
- Interactive plots of telemetry parametervalues (ex.: > 2 million points)



Largest-Triangle-Three-Buckets algorithm http://hdl.handle.net/1946/15343

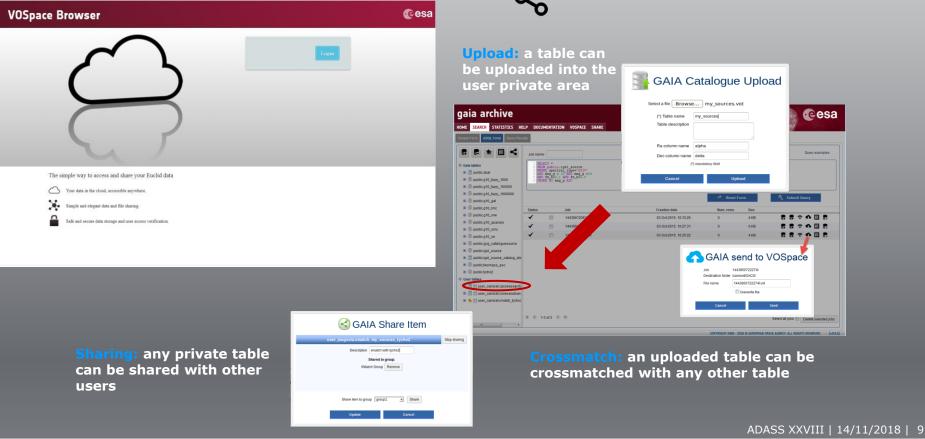




# Enabling scientific collaboration







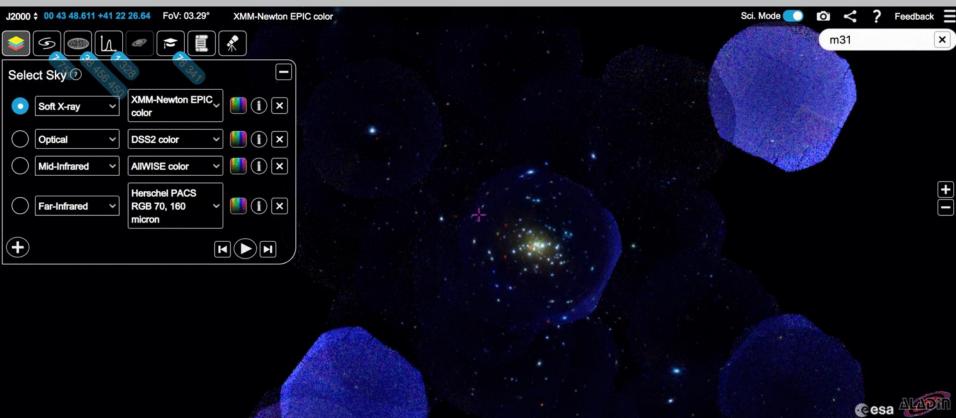
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### **European Space Agency**

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# Explore heterogeneous data: multi-mission, multi-wavelength





# Towards "Archive 2.0" concept



# Solutions under evaluation / prototyping

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# Massive Parallel Processing for big catalogues





As example, the Gaia archive:

 Stores in Postgres-XL time-series, spectra, etc... provided through Datalink service.

Exploring distributed relational DBs that scale-out **PostgreSQL**:

- Open source / Big community
- Specific extensions: Spherical queries (pg\_sphere, q3c),
  pg\_healpix, location queries (postgis)

Working on developing specific Query Profile per use case





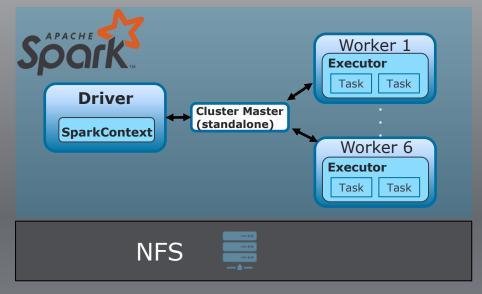
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# Interactive/Batch Data Analysis



Prototyping Massive Parallel Processing over large scale datasets for:

- Morphology analysis / classification of objects with machine learning, in batch mode
- Cutout service or customized source extraction, in interactive mode



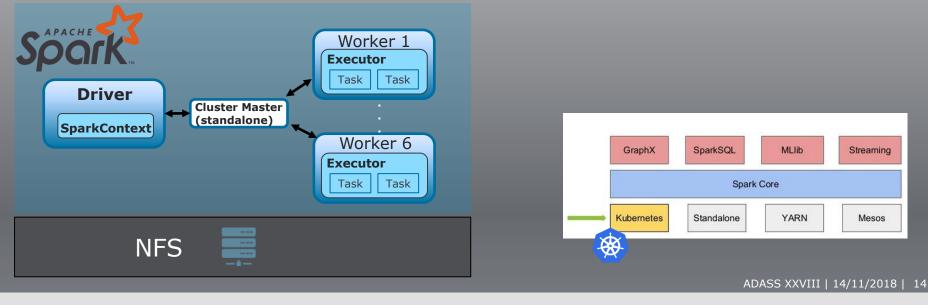
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# Interactive/Batch Data Analysis



Prototyping Massive Parallel Processing over large scale datasets for:

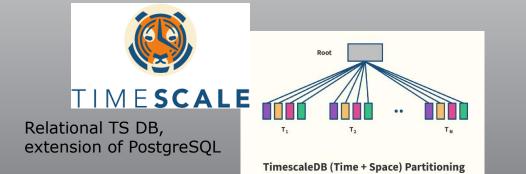
- Morphology analysis / classification of objects with machine learning, in batch mode
- Cutout service or customized source extraction, in interactive mode



# Specific searches by data nature



Exploring Time Series oriented databases for large Time Series data:

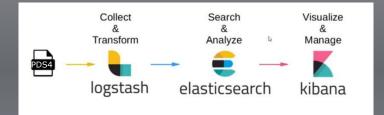


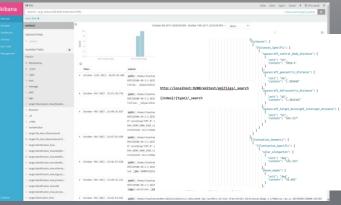
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Non-SQL solutions (pending of evaluation)

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## Prototyping full text search on planetary data:





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# Code to the Data and Scientific Collaboration

Astropy: ESDC open contributed libraries

- Gaia module: TAP+ access to GACS
  - Reusable to build access to any TAP based archive
- pyESASky module
  - Visualization app to visualize data for any Astro archive
- Hubble module: TAP+AIO access to HST
  - Reusable to build access to any ABSI/legacy based archive

First step to provide Jupyter Notebook "code to the data" services



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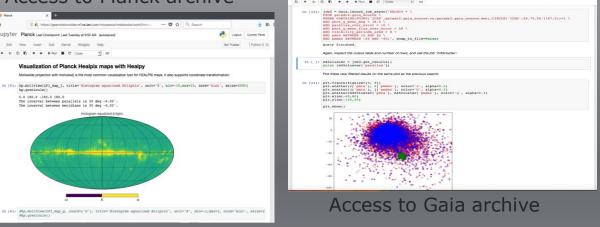
# Prototype of a **JupyterHUB** environment at ESDC



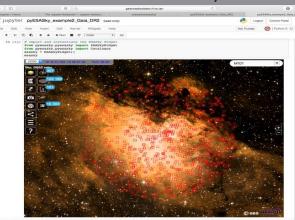
Within a future **S**cience **E**xploitation and **P**reservation **P**latform (SEPP) a collaborative data analysis environment with Jupyter Notebooks will be available.



## Access to Planck archive



## Access to ESASky



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# Improving scalability - studies



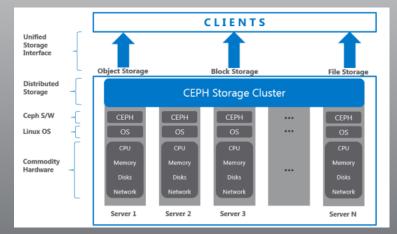
## Scale-out ESDC VOSpace storage using **Ceph**.

Ceph is a software defined storage solution:



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- Massive scalable (to Exa-Bytes)
- Highly reliable
- Easy to manage
- Open source



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Increase Jupyter Notebooks data analysis using Spark clusters via **PySpark** library

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# ESDC proposed solutions



storage of big catalogues through distributed databases,

storage of long time series in high resolution via time series oriented databases,

data search and processing via specialized analysis engines,

and enabling scientific collaboration and closer access to data via JupyterLab, Python client libraries and integration with pipelines using containers.

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# Thank you

## http://archives.esac.esa.int

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ADASS XXVIII | 14/11/2018 | 20