El Port d'Informació Científica

PIC

port d'informació científica

Services





Outline

- PIC Introduction
- Landing at PIC
- PIC services
 - Batch system: HTCondor
 - Storage
 - Notebooks ecosystem: Jupyter
 - Version Control System: Gitlab
 - Big Data: Cosmohub & Spark

- Founded in 2003: collaboration between IFAE and CIEMAT
- Team of 23 people (50% scientists 50% engineers)
 - Agile teams that embed in scientific groups to
 - Understand the experiment
 - Follow the evolution of data analysis requirements
 - Develop & prototype tools for data management and analysis
- What we do

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- R&D in methodologies and tools for advanced data analysis.
 - Participate in R&D projects. Software and Computing WPs.
- Operate services for the preservation, analysis and sharing of data.
 - Run prod. services for experiments: LHC, MAGIC, CTA, PAUs, Euclid, VIRGO/LIGO, DUNE
 - Provide data analysis services for research groups: IFAE, CIEMAT + others



Red Española de Supercomputación

- RES was founded in 2007 as a network of supercomputers in Spain.
 - Competitive calls for CPU resources open to all research groups in Spain.
- In 2020 RES increased its scope to include **data services**
 - PIC joined RES in 2020.

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• Annual calls for data projects published in December.



https://www.res.es/

MAPA DE INFRAESTRUCTURAS CIENTÍFICAS Y TÉCNICAS SINGULARES 🚑



PIC data center

• Connectivity

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- 2x100 Gbps to Academic Network
- Largest data mover in Spanish academic network: 100 PB in+out per year
- Data processing services
 - Disk dCache: 20 PB
 - Tape Enstore: 63 PB
 - Computing HTCondor: 12000 cores, 18 GPUs
 - Computing Hadoop: 720 cores, 2.5 PB disk
- Facilities, ~120 kW IT
 - \circ ~80 kW in 150 m² air-cooled room
 - high efficiency, PUE 1.44
 - \circ ~40 kW in 25 m² liquid immersion cooling system
 - very high efficiency, PUE 1.1









PIC public wiki

https://pwiki.pic.es

V						Log in
PIC	Page Discussion	Read	View source	View history	Search	Q
Wiki	Main Page					
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What links here Related changes	Getting started					
Printable version Permanent link Page information	 PIC in an image Get a PIC account User manual 					
	Services					
	HTCondor Storage					
	JupyterHub Gitlab CosmoHub					
	Spark: on Hadoop					
	on HTCondor dCache webdav i dCacheView					

Evnorimonte



Get a PIC account

PIC Account	Request Form Show Help
Applicant	Affiliation
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• HTCondor is a batch system

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- Software that manages the execution of several other programs (called jobs)
- It allows the execution of a program without the direct supervision of the user
- The execution can be in remote machines
- Other popular batch systems: SLURM, Torque, LSF, SGE
- HTCondor is a batch system meant for High-Throughput Computing (HTC) while others are for High-Performance Computing (HPC)
 - HTC favours the execution of a lot of jobs consuming few resources each (CPU, memory, etc.)
 - HPC favours the execution of parallel computing, few jobs consuming a lot of resources (MPI, low-latency interconnection)



• Batch systems generally rely on queues

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- Users submit jobs to queues that have different limits (maximum time, CPUs per job, etc.)
- The jobs are executed in the remote WorkerNodes (WNs) according to a priority and the resources available
- HTCondor is different. Your job has requirements and the WNs have resources, if they match, your job will run
- HTCondor uses the fair-share concept
 - You or your group have a quota, a percentage of resources you can use. It is allowed to exceed that quota but your priority will be reduced the next time



HTCondor: Introduction

- HTCondor scales to thousands of jobs and resources
 - There are ~160 WNs, ~12000 cpus and 18 GPUs in our cluster
- We manage more than 20 projects in the same cluster. From the large grid experiments (LHC, CTA, etc.) to the local ones
- HTCondor User Guide:
 - <u>https://pwiki.pic.es/index.php?title=HTCondor_User_Guide</u>



HTCondor: Access the cluster

UI (User Interface)

- To obtain access to PIC HTCondor cluster you can ssh to ui.pic.es
- UIs have access to shared data and allow you to submit and check your job status. They are NOT for interactive execution

```
$ ssh user@ui.pic.es
user@ui.pic.es's password:
Last login: Wed Oct 4 10:40:06 2023
      The "ui.pic.es" Public Login Unix Service
                        CentOS 7.8.2003 x86 64
* Our Login Service grants you access to PIC datacenter and its batch
* system (HTCondor) on batch and interactive mode (condor submit -i).
* We recommend consulting our HTCondor User Guide:
* https://pwiki.pic.es/index.php?title=HTCondor User Guide
* In case of problems, please contact the support:
                    user.support@pic.es
           e-mail
                                     PIC WebSite: http://www.pic.es/
                            [user@ui02 ~]$
```



HTCondor: Quick Start

Submit file: communicate everything of your job to HTCondor (test.sub)

\$ cat test.sh
#!/bin/bash

/bin/stress \$@

\$ condor_submit test.sub Submitting job(s). 1 job(s) submitted to cluster 7952359. \$ cat test.sub executable = test.sh arguments = -c 1 -t 60 output = condor.out error = condor.err log = condor.log

queue

\$ condor_rm 7952359
All jobs in cluster 7952359 have been marked for removal

condor_submit to submit your job, condor_q to monitor, condor_rm to kill

\$ condor_q 7952359

-- Schedd: submit01.pic.es : <193.109.174.82:9618?... @ 10/26/23 15:43:44 OWNER BATCH_NAME SUBMITTED DONE RUN IDLE TOTAL JOB_IDS cacosta ID: 7952363 10/26 15:43 _ 1 7952359.0

Total for query: 1 jobs; 0 completed, 0 removed, 1 idle, 0 running, 0 held, 0 suspended Total for all users: 1661 jobs; 0 completed, 0 removed, 1387 idle, 267 running, 7 held, 0 suspended Your job identification is a **\$(ClusterID).\$(ProcID):** 7952359.0



Submit file. Executable, input, arguments, output, error and logs

- You **have to** specify the executable and optionally you can specify your input, output (stdout) and error (stderr) logs.
- Make sure that your script is correct (location, **permissions** and shebang)!
- You can set the global path. However, if no path is specified, the directory from which the job was submitted is used





Submit file. Requesting resources

- You can request cpu, gpu, memory and disk for your job using request_cpus, request_gpus, request_memory and request_disk respectively
- If request options are not present in your submit file, these default values are taken:
 1 cpu, 2 GB of memory per cpu, 15 GB of local disk per cpu and no GPUs

This job asks for 4 GB of RAM (use units!) and 8 CPUs

```
$ cat test-req.sub
executable = test.sh
arguments = -c 8 -t 60
output = test-req-$(ClusterId).$(ProcId).out
error = test-req-$(ClusterId).$(ProcId).err
log = test-req-$(ClusterId).$(ProcId).log
request_memory = 4 GB
request_cpus = 8
queue
```

\$ condor_q 1462.0 -af RequestCpus RequestMemory
8 4096

Querying the resources requested, memory is in MB



Submit file. Requesting GPUs

- At PIC there are right now only 18 GPUs available
 - 8 GPUs for jupyter.pic.es (RTX 2080 Ti)
 - 8 GPUs for Magnesia group (V100)
 - 2 old GPUs for testing (GTX 1050 Ti)
- You can access any of them through HTCondor
 - However, RTX 2080 and V100 GPU work with **preemption enabled**: if a higher priority job needs the resources, your job will be killed and put in queue again
 - Contact us if you need to access to RTX2080 or V100 GPUs through HTCondor



Submit file. Requesting resources

- The default resources are 1 core and 2 GB of RAM. But you can access up to 8 cores and 32 GB without expecting long queue waits
 - You can access to more resources if needed, but first contact us
- The amount of resources requested determines the queue time: less resources, less time in queue
- Last 2 months Average Queue Time: 1.8 hours



Submit file. The flavours

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- 3 general flavours to limit the job's walltime
 - short: 3 hours
 - medium: 48 hours
 - long: 96 hours
- Default flavour is **medium**

```
$ cat test-flavour.sub
executable = test.sh
arguments = -c 1 -t 60
output = test-flavour-$(ClusterId).$(ProcId).out
error = test-flavour-$(ClusterId).$(ProcId).err
log = test-flavour-$(ClusterId).$(ProcId).log
+flavour="long"
```

queue

- When the job arrives to the time limit, it will be held and it remains in this status for 6 hours in the queue (condor_q -af HoldReason)
- Jobs that exceed 50% over the requested memory will be also held
- If you need more than 96 hours, consult us



Submit file. The queue statement

- queue N, to submit N number jobs
- Powerful command. Several ways to use queue. Example:
 - From file: Queue commands reads the information contained in a file

4 jobs submitted, considering we have multiple options in a list file arg_list.txt

\$ cat test-queue3.sub executable = test.sh arguments = -c \$(option1) -t \$(option2) output = test-queue3-\$(ClusterId).\$(ProcId).out error = test-queue3-\$(ClusterId).\$(ProcId).err log = test-queue3-\$(ClusterId).\$(ProcId).log

queue option1,option2 from args/arg_list.txt

<pre>\$ cat arg_list.txt</pre>
1, 15
2, 10
1, 12
4. 13



The priority and the Accounting Group

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- The priority of your job is calculated depending on the Accounting Group
 - Your Accounting Group is defined by your primary group
 - HTCondor adds automatically the user to the Accounting Group
 - Each group have a quota of resources assigned to them
- If your primary group does not fit with the experiment you want to account for, you can add +experiment="experiment" in your submit file

\$ cat test-experiment.sub executable = test.sh arguments = -c 1 -t 120 output = output-\$(ClusterId).\$(ProcId).out error = error-\$(ClusterId).\$(ProcId).err log = log-\$(ClusterId).\$(ProcId).log +experiment="virgo" queue



Interactive submission

• There is the possibility to submit interactive jobs: condor_submit -i/-interactive

\$ condor_submit -interactive Submitting job(s). 1 job(s) submitted to cluster 7952079. Waiting for job to start... Welcome to slot1_6@tds228.pic.es! You will be logged out after 7200 seconds of inactivity. bash-4.2\$



Use of containers

- The use of containers is always encouraged. Apptainer (old singularity) recommended
- You just need to add +SingularityImage to run inside a container
- All the shared filesystems are available inside the container

+SingularityImage = "/opt/apptainer-images/pic-centos7.sif"



DAGMAN

• HTCondor Dagman (Directed Acyclic Graph Manager) is a meta-scheduler. You submit to the queue a scheduler that manages the execution order of several jobs





HTCondor: The generated files

The generated files

- \$_CONDOR_SCRATCH_DIR is the directory where your job runs temporarily in the WN
 - All the data stored there is removed when the job finishes
 - It is recommended to avoid working directly in shared FS, work in the scratch of the node and copy at the end of your job if possible!
- The WNs have all your storage available, you can just decide how to move your data in your executable script
- The standard output and error are always transferred back when the job finishes (completed, removed or held)



condor_q

- allows constraints and several output formats
- Use condor_q -1 \$ClusterId.\$ProcId to obtain all the job attributes

\$ condor q -const 'RequestCpus > 1 && JobStatus == 1' -nobatch Use constraint (-const) to filter your jobs, remember that -nobatch shows the jobs ungrouped -- Schedd: submit01.pic.es : <193.109.174.82:9618?... @ 03/14/19 09:42:46 TD OWNER SUBMITTED RUN TIME ST PRI SIZE CMD cacosta 3/14 09:42 0+00:00 I 0 0.0 test.sh --cpu 1 --timeout 10s 630.0 630.1 cacosta 3/14 09:42 0+00:00:00 I 0 0.0 test.sh --cpu 1 --timeout 10s 3/14 09:42 0+00:00:00 I 0 0.0 test.sh --cpu 1 --timeout 10s 630.2 cacosta Total for query: 3 jobs; 0 completed, 0 removed, 3 idle, 0 running, 0 held, 0 suspended Total for cacosta: 7 jobs; 0 completed, 0 removed, 5 idle, 2 running, 0 held, 0 suspended Total for all users: 7 jobs; 0 completed, 0 removed, 5 idle, 2 running, 0 held, 0 suspended \$ condor q -const 'RequestCpus > 1 && JobStatus == 1' -nobatch -af ClusterId ProcId RequestCpus RequestMemory 630 0 4 2048 Autoformat (-af) allows you to control the format of condor g output 630 1 4 2048 630 2 4 2048



condor_q -analyze/-better/-better-analyze

• allows you to check if there are WNs that can run your jobs

```
$ condor g -better 7937412
[..]
         Slots
Step
        Matched Condition
       ------
          1842 TARGET.WN property == ifThenElse(MY.WN property is undefined, "default", MY.WN property)
[0]
[5]
           423 TARGET.Disk >= RequestDisk
[6]
           394 [0] && [5]
[7]
             2 TARGET.Memory >= RequestMemory
[8]
             0 [6] && [7]
           2055 TARGET.FileSystemDomain == MY.FileSystemDomain
[9]
No successful match recorded.
Last failed match: Fri Oct 6 15:27:08 2023
Reason for last match failure: no match found
7937412.000: Run analysis summary ignoring user priority. Of 161 machines,
    161 are rejected by your job's requirements
     0 reject your job because of their own requirements
      0 match and are already running your jobs
      0 match but are serving other users
      0 are able to run your job
WARNING: Be advised:
   No machines matched the jobs's constraints
```



condor_history

- For finished and removed jobs that do not appear in the queue
- It allows similar constraints as condor_q (some of the attributes are slightly different, for instance LastRemoteHost for RemoteHost)
- Use -limit N to avoid very long queries
- You can check finished jobs up to 2 months ago



condor_rm

- Use condor_rm and the ClusterId and/or ProcId of your job
- It allows the use of constraints and "-all" to remove all your jobs



HTCondor: News and future

- Migration to AlmaLinux 9 OS in the coming month
 - Forced by the discontinuation of CentOs7
- Major upgrade from HTCondor 9 to 10
 - Shouldn't have an impact on the users
- You will receive new information soon
- Remember that other changes and new features will be in the wiki



Storage at PIC is separated in:

- Disk storage for internal access: **3.5 PB**
 - User Home. Small space, for scripts, logs, etc. Backups.
 - Software. Common space for group's users. Small space. Backups.
 - Common. Common data for members of a group. Backups.
 - Scratch. No critical data. No backups.
- Mass Storage for internal and external access:
 - Disk: **20 PB**. Tape: **63 PB**.
 - Local access on PICs resources (UIs, nodes)
 - Allow sharing data between centers/users.
 - Optional use of tape for long term data or backups.



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Storage (II)



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Storage (backups)

Backup policies for disk internal storage

- Snapshots
 - Hourly (3 last snapshots) / daily (14) / weekly (3)
- Backup
 - Nightly copy to an external server

Endpoint	Snapshots	Backups
Home	yes	yes
Software	yes	yes
Common	yes	yes
Scratch	no	no



Storage (https access)

Web interface /pnfs external access

- Webdav door
 - Read / Download files
 - Command line access (upload included)

 Frontend dCacheVie 	W
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• Upload/download files

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	182707_0000002058.raw 📥		3145750316		Tue Oct 04 12:56:48 CEST 2016	
	test.20140614 🛆		117024		Sat Jun 14 21:20:22 CEST 2014	
	tmp.cozNfnWZNY 🕰		1		Thu Jul 27 11:02:40 CEST 2017	
-	testdata_megajunk				Fri Sep 14 09:11:10 CEST 2018	
-	tpotest				Tue Nov 01 10:15:31 CET 2022	
-	tape				Tue May 30 19:12:40 CEST 2023	
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• jupyter.pic.es

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- Launch a jupyter notebook server on PIC's HTC cluster
- User-defined resources
 - CPUs
 - Memory
 - GPUs
- Only a web browser and internet connection needed
- Access to PIC's massive storage
- No need to download data anymore !!

Server Options

Select custom options for your profile

Memory (RSS)

~
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~

User options



Jupyter: jupyterlab

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Jupyter: jupyterlab

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Jupyter: jupyterlab



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Jupyter: jupyterlab

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We provide a python environment with the most common scientific libraries

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Jupyter: environments

If this is not enough, you can still create custom environments and make them available to be used in your notebooks

- > mamba create (-n {name} | -p {path}) ipykernel [pkg1 pkg2 ...]
- > mamba activate ({name} | {path})
- > python -m ipykernel install -user -name {display name}

Detailed instructions here:

https://pwiki.pic.es/index.php?title=JupyterHub#Python_virtual_environments



Jupyter: GPUs

• GPUs available

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- gpu01: 8 x RTX 2080 Ti, available via jupyter and HTCondor with preemption
- gpu05: 8 x V100, available via HTCondor with preemption, and a subset of 4 available via jupyter
- gpu02 & gpu03: 1 x GeForce 1050 Ti, available via HTCondor
- GPUs are a scarce resource. Don't request for a GPU unless you are really going to use it
- GPU dashboards in jupyterlab show the GPU usage
- No GPU libraries in the base environment







Dask provides the ability to scale Python data analytics to multiple machines

Why Dask?



- When going to large datasets, the analysis may not fit in a single machine
- Numpy and Pandas were not intended to scale to multiple machines
- Similar API (arrays and dataframes) but with lazy loading
- Can scale down to a single computer (e.g. for testing)
- Suited to scale up using PIC's HTC cluster (with your account limitations) using a lot of small workers

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Jupyter: Dask

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	WORK IRS TRANSFER BYTES					Comm: tls://192.168.101.59:39314	Workers: 5	i				
1						Dashboard: http://192.168.101.59:8787/status	Total threa	ds: 5				
	CLUSTERS (+ NEW					Started: 19 minutes ago	Total memo	ory: 9.30 GiB				
9 9 E	SecureHTCondor 1 cheduler Address: tls://192.168.101.59:39314 Jaashboard URL: http://192.168.101.59:8787/status lumber of Cores: 5					► Workers						
	lemory: 9.30 GIB lumber of Workers: 5 linimum Workers: 5 laximum Workers: 10	I.]:			And use it in your	notebo	ooks				
	<> SCALE SHUTDOWN											

Jupyter: Dask



PIC



Gitlab: introduction

- Version Control System (VCS)
 - A tool to track and manage changes to digital assets (e.g. code)
 - Single source of truth
 - Enables parallel development / team collaboration
 - Full history
- Git
- Started by Linus Torvald in 2005
- Open source and free distributed VCS
- Fast, Flexible, Secure ... very good!
- Has become the de facto standard
- Is a MUST-have skill in software development
- Has some learning curve

- Gitlab
 - Web-based Dev(Sec)Ops platform
 - Git repository manager
 - Many more features: CI/CD, issues, wiki





Gitlab: git overview

• Commit: snapshot of your code

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- Branch: dynamic pointer to a commit
- Tag: immutable pointer to a commit



The gitflow branching strategy

Gitlab: git overview

Commands

PIC

- commit: make a snapshot of your code
- push: upload your changes to the remote repository
- checkout: change your local copy to another snapshot
- pull: download changes from the remote repository
- add: select changes to be commited
- clone: create a local copy of a remote repository
- merge: add changes made in a snapshot to the current version of the code
- log, branch, status, diff, config, init, etc





Gitlab: git best practices / suggestions

- General rules
 - Make small and atomic changes. Commit/push often.
 - **Use branches** for dedicated/long developments
 - Keep the main branch stable: the tests should always pass (yes you should have tests!!)
 - Write descriptive commit messages: avoid messages like "changes", "test" or "."
 - Adopt a branching strategy: gitflow, trunk-based,...
 - Do code reviews if feasible
- Our contributions
 - **Use git**. If you work alone or in a team, use it!
 - **Do not upload big binary files** to a git repository. Git is not for data, it is for code.
 - **Use .gitignore** to track only relevant files
 - **Do not track jupyter notebooks** (.ipynb) directly, pair them with a script
 - Do not upload confidential data (NEVER!) passwords, ssh keys, etc will be there forever



Gitlab: CI/CD

- Continuous Integration / Continuous Deployment
- Automate the stages of software development, that come after writing the code
 - Build
 - Test
 - Deploy
- When should you use it?
 - Whenever you want to automate some of these steps
 - Nearly always





- Already being actively used by many groups / users
 - 795 projects
 - **82 groups**
 - o 358 users
 - 160k commits
 - **700 issues**
 - **1100 MRs**
- CI /CD

PIC

- ~6.4k pipelines
- ~22k jobs
- Hardware
 - VM with 4 cores and 8GB RAM
 - **75GB of disk**



Group	N pipelines				
IFAE websites	2318				
Magic	762				
Hadoop (PIC)	598				
Virgo SW	565				
Rucio (PIC)	488				

Big Data service

• Cluster

PIC

- 30 nodes, 720 cores, 15 TiB RAM, 60 TiB NVMe cache, **2.5 PiB net storage**
 - ⅔ in production next month
- Based on a custom developed in-house Hadoop distribution
- CosmoHub (based on 🍇
 - Interactive exploration and distribution of astronomical catalogs
 - Suited for very large tables (>100 million rows)
 - User Defined Functions
 - Bring your own data!
- Spark
 - Parallel processing framework (similar to Dask)
 - Supports Python, Scala and R
 - Oriented towards accessing/processing catalogs stored on Hive





CosmoHub

Login / Sign Up



Build your own Universe

Interactive data analysis of massive cosmological data without any SQL knowledge

Billions of observed and simulated galaxies Superfast queries means superfast results



Features to make you work faster and easier

Online plotting preview and data download

Learn more

User Defined Functions (UDFs)

• HEALPix

port d'informació científica

PIC

- Following healpy calling semantics BUT using resolution **order** instead of nside
- Implemented functions:
 - Pixel conversion: ang2pix, ang2vec, pix2ang, pix2vec, vec2ang, vec2pix
 - Ordering conversion: nest2ring, ring2nest
 - Other:angdist, neighbours, npix2nside, nside2npix, nside2order
- Аггау
 - To aggregate on equinumerous array columns (e.g. spectra, pdf, ...)
 - Implemented functions:
 - array_min, array_max, array_count, array_sum
 - array_avg, array_stddev_pop, array_stddev_samp, array_var_pop, array_var_samp
- Geometric (ADQL)
 - Deal with spherical geometries: POINT, CIRCLE, BOX/POLYGON and REGION
 - Implemented functions:
 - Initialize geometries: adql_point, adql_circle, adql_box, adql_polygon, adql_region
 - Basic operations: adql_area, adql_centroid, adql_coord1, adql_coord2, adql_distance
 - Set operations: adql_contains, adql_intersects, adql_complement
 - Aggregations: adql_union, adql_intersection



Public catalogs

- Gaia (DR3, Mean Spectrum, EDR3, DR2 & DR1)
- DESI Legacy Survey (DR9, DR8 PZ)
- DESI Legacy Survey with Photoz (DR8)
- COSMOS 2020 (Classic | Farmer)
- COSMOS 2015 Laigle (v2.1)
- LSST DESC DC2 (Truth-match | Object table)
- DES DR2
- DES Y1A1 Morphological catalog (v1.0)
- DES Y1A1 Gold Data (v1.0)
- GLADE (v2.3, v2.4) & GLADE +
- VIPERS photometry and spectroscopy (PDR2)

- KiDS (DR4)
- CANDELS Bulge-Disk decomposition (2018)
- CFHTLenS (good fields) (v1.2)
- Alhambra photometric redshifts (v1.0)
- ALHAMBRA S/G CLASSIFIED (v1.0)
- PAUS+COSMOS photo-z catalog (v0.4)
- PAUS-COSMOS Early Data Release (v1.0)
- PAU.MillGas Lightcone (2016-07-18)
- DEEP2 Redshift catalog (DR4)
- MICE halo properties
- MICECAT (v2.0, v1.0)



Bring your own data!!!

How to upload new catalogs into Hive/CosmoHub

- Catalog data
 - Download into any PIC storage (pnfs, scratch)
 - Or provide clear download information (URL, path and credentials)
 - Preferred formats, in order (Parquet, FITS, CSV)
- Metadata
 - For each catalog
 - provide a name, version, short and long description, in Markdown
 - specify whether this data is simulated or comes from observations
 - list which groups/projects have access, or public otherwise
 - For each column, specify its data type, units and description, in plain text.





- Parallel processing framework
 - 3 compatible APIs
 - SQL
 - Dataframes
 - RDD
 - Interfaces with Hive/CosmoHub tables
 - Can also access massive storage (PNFS/Ceph/NFS)
 - Dual execution: notebook and batch

```
df = spark.sql("""
   SELECT id, ra, dec
   FROM cosmohub.micecatv1_0_hpix
   LIMIT 100
""")
df
```

DataFrame[id: int, ra: double, dec: double]

df.show(5)

dec	ra	id
.887398	18.523232 79.	191225057
.816753	59.949303 20.	49810401
5.971172	22.78075 46.	9887201
17.27203	51.193577 17	11503841
5.733221	8.418952 16.	43089377



Backup slides

PIC - Barcelona



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Google

MAPA DE INFRAESTRUCTURAS CIENTÍFICAS Y TÉCNICAS SINGULARES 🔠







- Computing, data processing and analysis
 - Batch processing through <u>HTCondor</u>
 - <u>JupyterHub</u>
- Mass storage (tens of Petabytes)
 - Tape
 - o Disk
- Big Data Hadoop Cluster
 - <u>CosmoHub</u>
 - Spark Notebooks*
- Web Services (Gitlab, Wiki, Redmine, Webdav, Monitoring, etc.)
- Consulting support



Big Data service

- New cluster
 - 30 nodes, 720 cores, 15 TiB RAM, 60 TiB NVMe cache, 2.5 PiB net storage
 - Based on a custom developed in-house Hadoop distribution
 - (intro hadoop, replica, ec, hdfs, yarn)
- Hive
 - Data warehouse based on distributed architecture
 - Better suited for very large tables (>100 million rows, >100 columns)
- CosmoHub
 - Custom web interface in front of Hive
 - Interactive plots
 - Download custom subsets
 - Standard formats: CSV, FITS, ASDF, Parquet
 - Additional functions: HEALPix, Array, Geometric

• Spark



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Catalog list

Help Help			Catalogs	Activity 👤 tallada@pic.es	T
				Q gaia	
Name	Version	Description	Origin	Date	•
Gaia mean spectrum 🗗	DR3	RVS_MEAN_SPECTRUM	Observed	2023-02-14	
Gaia 🗬	DR3	Gaia Data Release 3	Observed	2022-06-13	
Gaia 🗬	EDR3	Gaia Early Data Release 3	Observed	2020-12-03	
Gaia 🗬	DR2	Gaia Data Release 2	Observed	2018-04-25	
Gaia 🗗	DR1	Gaia Data Release 1	Observed	2016-12-15	



ICE CSIC - IEEC

Catalog description

Catalogs Activity Lallada@pic.es -
Gaia DR3 Columns Sampling Filters Query Analysis Format Request
The third Gaia data release (Gaia DR3) consists of the set of data released as Gaia Early Data Release 3 on 3 December 2020 complemented with new data released on 13 lune 2022. The set of data released as Gaia Early Data Release 3 (Gaia EDR3) on 3 December 2020 comprises:
 The full astrometric solution — positions on the sky (α, δ), parallaxes, and proper motions — for around 1.46 billion (1.46 10^9) sources, with a limiting magnitude of about G ≈ 21 and a bright limit of about G ≈ 3. The astrometric solution is accompanied with some new quality indicators, like RUWE, and source image descriptors. The full astrometric solution has been done as 5-parameter solution for 585 million sources and as 6-parameter solution for 882 million sources. In the
6-parameter solution, the additional fitted quantity is the so-called pseudo-colour that had to be included for sources without high-quality colour information. In addition, two-parameters solutions - positions on the sky (α , δ) - for around 344 million additional sources.
 G magnitudes for around 1.806 billion sources (with the known issue present in EDR3 corrected in Gaia DR3). G_BP and G_RP magnitudes for around 1.54 billion and 1.55 billion sources, respectively.
In Gaia Data Release 3 (Gaia DR3), the above set of data is complemented with new products released on 13 June 2022:
 Object classifications for 1.59 billion sources and astrophysical parameters (T_eff, logg, [M/H], A_G, distance, etc.) from BP/RP spectra for 470 million objects, including MCMC samples for most sources with astrophysical parameters. Other astrophysical parameters from the BP/RP spectra include: Spectral types (217 million stars) and emission-line star classifications (57,000 stars); Spectrocopic parameters for 2.3 million hot stars, 94,000 ultra-cool stars, activity index for 1.3 million cool stars, and H-alpha emission for 235 million stars;
 Evolutionary parameters (mass and age) for 128 million stars; Astrophysical parameters for 348 million objects based on the assumption of an unresolved binary in the BP/RP spectra; Self-organised map (outlier) analysis based on 56 million sources with the weakest object classifications.
Astrophysical parameters (T_eff, logg, [M/H], [X/M] for 12 elements, etc.) from RVS spectra for 5.5 million objects, including diffuse interstellar bands for 472,000 objects.
 All-sky total galactic extinction maps at 4 different spatial resolutions (next-pix levels 6, 7, 8, and 9). Mean BP/RP spectra for 219 million sources, most of them with G < 17.6 mag. Mean RVS spectra for 1 million well-behaved objects.
• Mean radial velocities for 33 million stars and mean G_RVS magnitudes for 32 million objects with G_RVS <~ 14 mag with effective temperatures (T_eff) in



Gaia DR3 Columns Sampling Filters Query Analysis Format Request

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Catalog Playground Create and analyze your own sample of the catalog following some basic steps

Step 1: Columns - Select the fields you need	?
80 .	Q gal
V I double Galactic longitude	
⊘ b double Galactic latitude	
in_galaxy_candidates boolean Flag indicating the availability of additional information in the galaxy candidates table	
classprob_dsc_combmod_galaxy float Probability from DSC-Combmod of being a galaxy (data used: BP/RP spectrum, photometry,	astrometry)





~



SQL view, interactive plots

SELECT '1', 'b'				
TABLESAMPLE (BUCKET 1 OUT OF 256)				
	L+ Ex	pert Mode		
Step 5: Analysis · <i>Explore the selecte</i>	d data			?
I Table	🔅 Scatter	. , Histogram	🥒 Heatmap	

Step 6: Format · *Select a file type*

Parquet

A modern open-source self-describing columnar storage format with support for complex nested data structures

*

SQL editor, plot configuration

SELECT (`1` + 180) % 360 AS : FROM gaia_dr3_source	l_shifted, `b`							
TABLESAMPLE (BUCKET I OUT OF	250)							
							🖋 Edi	iting
			Э R	eset				
			יס R	leset				
Step 5: Analysis · Explore the	e selected data		ືອ R	leset				?
Step 5: Analysis · <i>Explore the</i>	e selected data	Scatter	ר כי	eset	ogram	1	Heatmap	?
Step 5: Analysis · <i>Explore the</i>	e selected data	∵ Scatter	"D R	eset . , Histo	ogram	1	Heatmap	?
Step 5: Analysis · Explore the Table	e selected data	Scatter	D R	eset . . Histo X max	ogram 360	Bins	Heatmap	?
Step 5: Analysis · Explore the Table X axis L_shifted Y axis b	e selected data	Scatter X min (Y min -	0 90	eset	ogram 360 90	Bins Bins	Heatmap 100	?

PIC port d'informació científica



SELECT (`1` + 180) % 360 AS 1_shi FROM gaia_dr3_source TABLESAMPLE (BUCKET 1 OUT OF 256)	ifted, `b`)		
			✓ Editing
	c	Reset	
	د	Reset	
Step 5: Analysis · <i>Explore the sel</i>	כ iected data	Reset	?
Step 5: Analysis · <i>Explore the sel</i>	ected data	Reset	?
Step 5: Analysis · <i>Explore the sel</i>	ected data	Reset	? Heatmap
Step 5: Analysis · <i>Explore the sele</i> 田 Table X axis L_shifted	ected data	Reset	P Heatmap Bins 100
Step 5: Analysis · Explore the sele Table X axis L_shifted Y axis b	ected data	Reset 	P Heatmap Bins 100 Bins 100

Heatmap plot



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Output format and Citation info (I)

(Gaia dr3	Columns	Sampling	Filters	Query	Analysis	Format	Request
						🚑 Exp	ert Mode	
s	tep 6: Forma	it · Select a f	ĩle type					?
	Parquet	A mod	lern open-sou	rce self-des	cribing co	lumnar stora	ge format w	ith support for complex nested data structures
	CSV.BZ2	Bzip2	compressed C	omma-sep	arated valu	ues file (pleas	se check Hel	p #4 if using Pandas DataFrame)
	FITS	The Fle	exible Image T	ransport S	/stem is th	ie most comr	nonly used o	Jigital file format in astronomy
	ASDF	The Ac	dvanced Scient	tific Data Fo	ormat pret	ends to be th	ne successor	for the immensely successful FITS format

Step 7: Request · *Review citation guides*

How to cite CosmoHub

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If you have used in your work any plots or data produced through CosmoHub please include in the Acknowledgments section the following snippet:

This work has made use of CosmoHub.

CosmoHub has been developed by the Port d'Informació Científica (PIC), maintained through a collaboration of the Institut de Física d'Altes Energies (IFAE) and the Centro de Investigaciones Energéticas, Medioambientales y Tecnológicas (CIEMAT) and the Institute of Space Sciences (CSIC & IEEC), and was partially funded by the "Plan Estatal de Investigación Científica y Técnica y de Innovación" program of the Spanish government.

In addition, please cite the following publications:

Tallada et al. 2020 CosmoHub on Hadoop: Interactive analysis and distribution of cosmological data | PDF - BibTeX

Carretero et al. 2018 CosmoHub and SciPIC: Massive cosmological data analysis, distribution and generation using a Big Data platform | PDF - BibTeX

~

Output format and Citation info (II)

	• Gai	a Collabor	ration et	al. (2022g):	aala EDR3: TI	he celestial r	reterence fran	ie (Gala-CRF3));	
	• Line	degren et	al. (2020): Gaia EDR3	: Parallax bia	s versus ma	agnitude, colo	ur, and positio	in;	
	 Rov 	vell et al. ((2020): G	aia EDR3: M	odelling and	calibration of	of Gaia's point	and line sprea	ad functions;	
	• Mai	rrese et al	1. (2022):	Gala EDR3:	cross-match	with externa	al catalogues -	 Algorithms a 	nd results.	
	or refere	nce, the fo	ollowing	papers desc	ribe the perf	ormance ve	rification that	DPAC has per	formed on Gaia [DR3:
	- Cai	a Collabou	ration of	al (2022a)	Cala DR2: Ma	opping the p	cummotric dic	c of the Miller	Marr	
	• Gai	a Collabor	ration et	al. (2022e).	Gaia DRS, Ivia	leations in r	symmetric dis	OPAE ctore a	way, s obsorved by Ga	i
	• Gai	a Collabor	ration et	al (20220).	aia DR3: Ref	lectance sni	ectra of solars	vstem small k	odies:	11a,
	• Gai	a Collabor	ration et	al. (2022h):	Gaia DR3: Th	e Galaxy in r	vour preferred	i colours – svr	thetic photometr	ry from Gaia low-resolution spectra:
	• Gai	a Collabor	ration et	al. (2022a):	Gaia DR3: Ste	allar multipli	citv – a teaser	for the hidde	n treasure:	, nom data for resolution spectral,
	• Gai	a Collabor	ration et	al. (2022b):	Gaia DR3: Th	e extragalac	tic content;			
	• Gai	a Collabor	ration et	al. (2022i): 0	iaia DR3: Che	emical carto	graphy of the	Milky Way;		
	• Gai	a Collabor	ration et	al. (2022c): (Gaia DR3: The	e golden sar	mple of astrop	hysical param	eters;	
	• Gai	a Collabor	ration et	al. (2022j): 0	iaia DR3: Exp	loring and r	mapping the d	iffuse interste	llar bands at 862	nm.
2	The Gaia d	lata are o	pen and	free to use,	provided cre	dit is given f	to 'ESA/Gaia/D	PAC'. In gener	al, access to, and	use of, ESA's Gaia archive (hereafter called 'the
	website') o	onstitutes	s accepta	ance of the f	ollowing, gen	ieral terms a	and conditions	. Neither ESA	nor any other pa	rty involved in creating, producing, or delivering the
9	website sh	hall be liab	ole for ar	y direct, inc	dental, cons	equential, ir	ndirect, or pun	itive damages	arising out of us	er access to, or use of, the website. The website does
	not guara	ntee the a	iccuracy	of informati	on provided l	by external s	sources and a	ccepts no resp	oonsibility or liabi	lity for any consequences arising from the use of
22	such data.	1								
	= How	to distrih	ute this	catalog —						
			acc cino							
	The Gaia d	lata are o	pen and	free to use,	provided cre	dit is given t	to 'ESA/Gaia/D	PAC'.		
7	I have re	ad the in	structio	ns on how	to cite Cosm	hore dullo	this catalog i	o my publica	tions	



Activity panel

ID •	Query	Date	Q Search	
			Status	Results
14424	SELECT CAST('kind` AS FLOAT), CAST('x_gal` AS FLOAT), x CAST('y_gal` AS FLOAT), y CAST('z_gal` AS FLOAT), Show full query	 2023-06-08 13:36:18 2023-06-08 13:42:31 	SUCCEEDED	≵ fits (5.25 GiB)
14423	SELECT CAST('kind' AS FLOAT) AS kind, CAST('x_gal' AS FLOAT) AS x, CAST('y_gal' AS FLOAT) AS y, CAST('z_gal' AS Show full query	 2023-06-08 13:29:26 2023-06-08 13:36:37 	SUCCEEDED	▲ fits (4.37 GiB)
14407	SELECT * FROM `dmcount_edge_eli`	 2023-06-07 11:59:10 2023-06-07 12:05:20 	SUCCEEDED	📩 parquet (768.31 MiB
14386	select reflect("java.lang.Thread", "sleep", bigint(10000000))	 2023-06-01 14:40:36 2023-06-01 14:43:57 	CANCELLED	
13653	SELECT `ra_gal`, `halo_id`, `galaxy_id`, `kind`, `dec_gal`, `ra_mag_gal`, `dec_mag_gal`, `kappa`, `gamma1`, `gamma2`, Show full query	 2023-03-29 12:56:41 2023-03-29 13:36:35 	CANCELLED	
13191	SELECT `galaxy_id`, `random_index`, `ra_gal`, `dec_gal`, `l_gal`, `b_gal`, `mw_extinction`, `hpix_29_nest`, `euclid_nisp Show full query	 2023-01-20 16:00:36 2023-01-20 16:09:22 	DELETED	0 Info
13082	SELECT 'x_gal', 'y_gal' FROM mice2_ia_20210203_c TABLESAMPLE (BUCKET 1 OUT	2022-12-22 10:28:32	DELETED	1 Info


UDF (I)

• HEALPix

• Following healpy calling semantics

BUT using resolution order instead of NSIDE

• Implemented functions:

- Pixel conversion: ang2pix, ang2vec, pix2ang, pix2vec, vec2ang, vec2pix
- Ordering conversion: nest2ring, ring2nest
- Other:angdist, neighbours, npix2nside, nside2npix, nside2order

• Examples

• Get pixel from sky coordinates

- SELECT udf.hp_ang2pix(\$ORDER, ra, dec, True) AS hpix FROM ...
- SELECT udf.hp_vec2pix(\$ORDER, x, y, z) AS hpix FROM ...

• Generate PARTIAL maps

 SELECT udf.hp_ang2pix(\$ORDER, ra, dec) AS hpix, AVG(redshift) FROM ...

GROUP BY udf.hp_ang2pix(\$ORDER, ra, dec)
ORDER BY udf.hp_ang2pix(\$ORDER, ra, dec)



UDF (II)

• Аггау

• To aggregate on equinumerous array columns

• i.e. spectra, probability distribution functions...

• Implemented functions:

- array_min, array_max, array_count, array_sum
- array_avg, array_stddev_pop, array_stddev_samp, array_var_pop, array_var_samp

• Example

• Get average redshift probability distribution function of a sample

SELECT udf.array_avg(redshift_pdf) AS redshift_pdf
 FROM ...

WHERE ...



UDF (III)

• Geometric (ADQL)

• Deal with spherical geometries: POINT, CIRCLE, BOX/POLYGON and REGION

- All edges are great circle arcs, including for BOX (!)
- A REGION represents an arbitrary footprint (MOC)
- Any geometry can be converted into a REGION
- Performance is proportional to the number of pixels in the REGION/MOC, use moderate precision

• Implemented functions:

- Initialize geometries: adql_point, adql_circle, adql_box, adql_polygon, adql_region
- Basic operations: adql_area, adql_centroid, adql_coord1, adql_coord2, adql_distance
- Set operations: adql_contains, adql_intersects, adql_complement
- Aggregations: adql_union, adql_intersection



UDF (III)

Example

Compute approximate area of a sample Ο

- SELECT udf.adql_area(н. udf.adql_union(udf.adql_region(-- convert to region ra, dec), 5 FROM ... WHERE ...
 - -- compute total area
 - -- merge all regions
 - udf.adql_point(-- create a point for each object
 - -- use a coarse resolution; NSIDE=2^5=32



```
df = spark.sql("""
   SELECT id, ra, dec
   FROM cosmohub.micecatv1_0_hpix
   LIMIT 100
""")
df
```

DataFrame[id: int, ra: double, dec: double]

df.show(5)

id	ra	dec
++	++	++
191225057	18.523232	79.887398
49810401	59.949303	20.816753
9887201	22.78075	46.971172
11503841	51.193577	17.27203
43089377	8.418952	16.733221
+	+	++

df.rdd.take(5)

[Row(id=69631390, ra=18.716858, dec=9.833587), Row(id=152771998, ra=58.511005, dec=24.961664), Row(id=154729374, ra=35.783665, dec=8.607564), Row(id=130099870, ra=79.352654, dec=8.510796), Row(id=99296158, ra=89.297478, dec=0.731858)]



Spark

```
# Convert to Pandas chunks
from scipic.mocks import spark utils
df_chunks = df.rdd.mapPartitionsWithIndex(
    spark_utils.to_df_chunks(
        chunk_size = 5,
        index_cols = ['id'],
        dtypes = df.dtypes,
df_chunks.take(1)[0]
                ra
                        dec
       id
102285412 65.593170 51.391582
 25057892 25.937380 7.770375
 84641380 18.656963 11.537212
106692452 29.782038 80.949181
 45668449 11.779725 23.124931
```

df_chunks.count()



```
# Define pipeline
import healpy as hp
def my_pipeline(df):
    df['hpix'] = hp.ang2pix(32, df['ra'], df['dec'], lonlat=True)
    return df
```

```
df_result = df_chunks.map(
    my_pipeline
```

```
df_result.take(1)[0]
```

ra	dec	hpix
Id	ucc	пріх

id

102285412	65.593170	51.391582	1318
<mark>25057892</mark>	25.937380	7.770375	5193
84641380	18.656963	11.537212	4806
106692452	29.782038	80.949181	86
45668449	11.779725	23.124931	3652



Spark

```
# Store as Parquet into HDFS
count = df_result.mapPartitionsWithIndex(
    spark_utils.to_parquet('/user/tallada/data/euclid/test_result/{}.pq')
).sum()
# Map the Parquet files to a table i my own schema
```

spark.catalog.createTable('tallada.test_result', path='/user/tallada/data/euclid/test_result')

```
print(f"{count} objects stored.")
```

100 objects stored.

```
df = spark.sql("""
    SELECT *
    FROM tallada.test_result
""")
df
```

DataFrame[ra: double, dec: double, hpix: bigint, id: bigint]

```
df.show(5)
```

	ra	dec	hpix	id
	++	+	4	·+
	65.59317	51.391582	1318	102285412
	25.93738	7.770375	5193	25057892
	18.656963	11.537212	4806	84641380
	29.782038	80.949181	86	106692452
	11.779725	23.124931	3652	45668449
	++	4	4	++
-	++ only showin	g top 5 ro	ws	++