



### Gaia DataMining platform

D Morris May 2023





### Data mining analysis platform for Gaia data

Analysis on the whole dataset – Wide Field Astronomy Unit (WFAU)

SELECT
floor(source\_id / 562949953421312) AS hpx5,
COUNT(\*) AS n, AVG(pmra), AVG(pmdec)
FROM
gaia\_source
GROUP BY
hpx5

Mean RA proper motion at HEALPix level 5
hpx5

Mean Dec proper motion at HEALPix level 5

Mean proper motions over the sky - 50 seconds to calculate and plot







### Machine learning applications

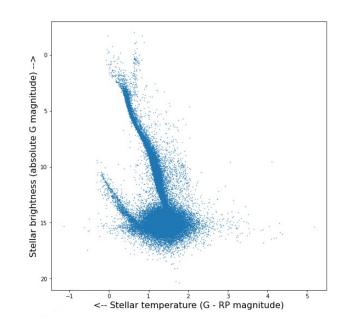
Based on the Gaia EDR3 performance verification "The Gaia Catalogue of Nearby Stars" (Smart et al. 2021).

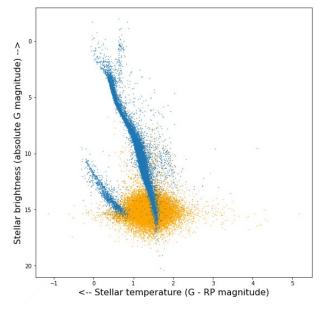
Training a supervised Random Forrest to classify astrometric solutions as 'good' or 'bad'.

SparkSQL queries to generate the training and validation data.

4min to train the classifier

25sec to classify 1,724,028 sources and plot the results





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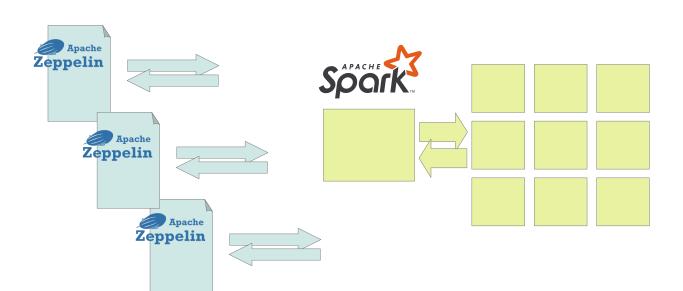




### Current deployment – shared Spark cluster

### Hadoop/Yarn

- Spark cluster deployed on static resources
- Zeppelin notebooks all interact with the same Spark cluster



Automated with Ansible



#### 99% automated

- create-all
- delete-all





Full DR3 dataset



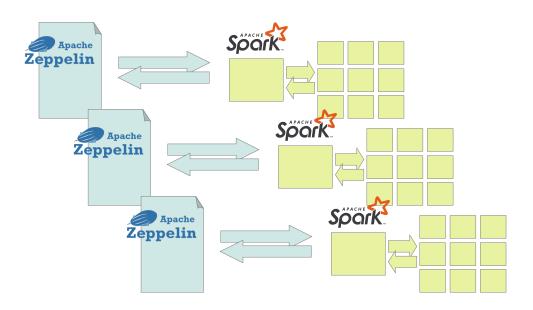






### In development – on demand deployment

- Notebook environment on demand
- Spark cluster on demand



Automated with Helm



#### 100% automated

- create-all
- delete-all



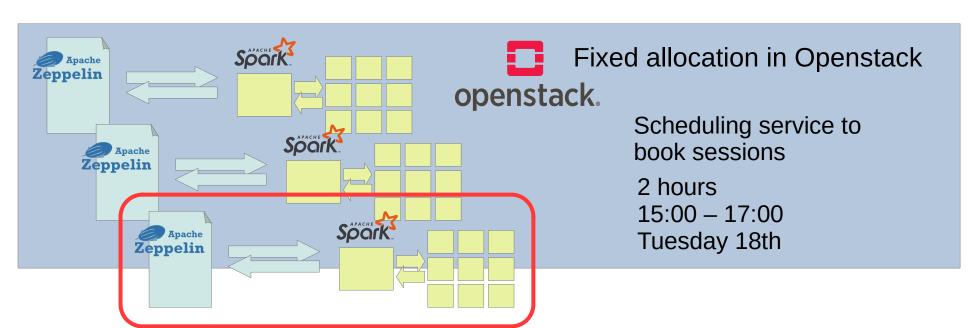






### Dynamic deployment on a fixed cloud

- Notebook environment on demand
- Spark cluster on demand







### **IVOA Execution Planner**

Will my code run on your platform?

Metadata schema to describe a task and the resources it needs

When can I run my code on your platform?

Scheduling service to book resources

Zeppelin notebook PySpark analysis 210 cpu cores 360G memory 1Tbyte disc

2 hours 15:00 – 17:00 Tuesday 18th





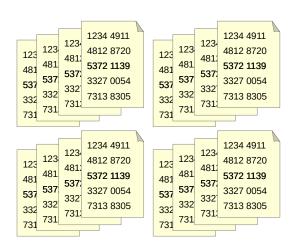




https://parquet.apache.org/

Apache Parquet columnar storage format

- A table maps to a directory of Parquet files
- Gaia DR3 sources 561Gbytes
- Partitioned as 2048 files per table
- Indexed based on Gaia source id (HEALPix)
- Technical metadata inside the Parquet files
  - Column names, data types etc
- Science metadata is missing
  - Units, UCDs, DataModels etc







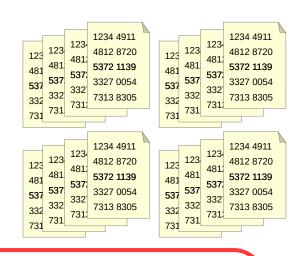




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  - Column names, data types etc
- Science metadata in a VOTable header
  - Units, UCDs, DataModels etc



### table-metadata.vot

FIELD name, units, ucd, datatype FIELD name, units, ucd, datatype

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Everyone uses S3, because it's easy ... right?

- A table maps to a directory bucket of Parquet files
- Bucket names have to be unique within the S3 service
- Ceph S3 service providing Peta bytes of storage for the whole country

GAIA SOURCE table name

• GDR3 GAIA SOURCE + data release

GaiaDMp-GDR3\_GAIA\_SOURCE + project brand

• Globally unique within the S3 service, but less 'findable' for users









Everyone uses S3, because it's easy ... right?

- S3 URL specifies the bucket name and object name
  - s3://{bucket}/{object}
  - s3://GaiaDMp-GDR3\_GAIA\_SOURCE/part-00749.....parquet
- S3 URL does not specify :
  - The hostname "s3.echo.stfc.ac.uk"
  - The URL template "s3.echo.stfc.ac.uk/%(bucket)"
  - A flag to use HTTPS "public\_url\_use\_https=true"





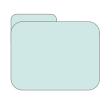




# **IVOA VOSpace**

Everyone uses S3, because it's easy ... right?

• The data is still stored in S3, VOSpace provides the directory structure and metadata



Project - GaiaDMp



Catalog – GAIA DR3





s3://{bucket}/









Everyone uses S3, because it's easy ... right?

VOSpace directories can include metadata about each level



Project - GaiaDMp

Publisher metadata



Catalog – GAIA DR3

- Catalog footprint
- Catalog DOI



Table - GAIA\_SOURCE

- TAP\_SCHEMA with JOINs
- Column metadata









Everyone uses S3, because it's easy ... right?

- VOSpace can provide access using more than one protocol
- The parameters for S3 can include all the details needed to access the data:
  - The S3 URL "s3://GaiaDMp-GDR3\_GAIA\_SOURCE/part-00749....parquet"
  - The hostname "s3.echo.stfc.ac.uk"
  - The URL format "s3.echo.stfc.ac.uk/%(bucket)"
  - A flag to use HTTPS "public\_url\_use\_https=true"









## **IVOA** wishlist

- Data descriptions
  - Gaia DR3 in parquet
- Data locations
  - Arcus HPC at Cambridge

- Software descriptions
  - Apache Spark cluster
  - Apache Zeppelin notebooks

- Software capabilities and data proximity
  - Apache Spark cluster
  - with fast access to
  - Gaia DR3 in parquet







# Questions and comments

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