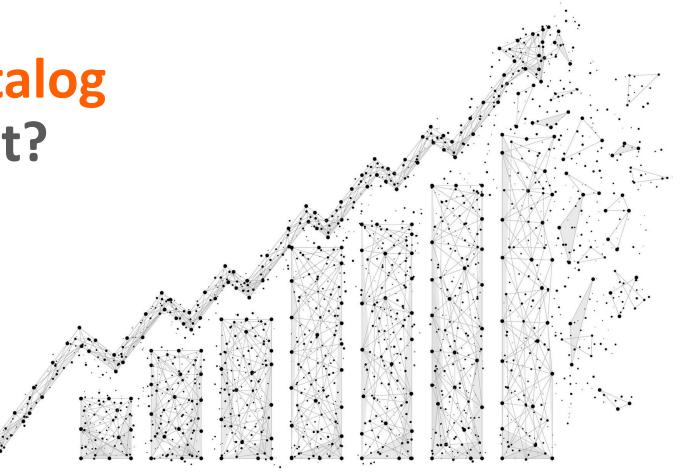
Future Processing

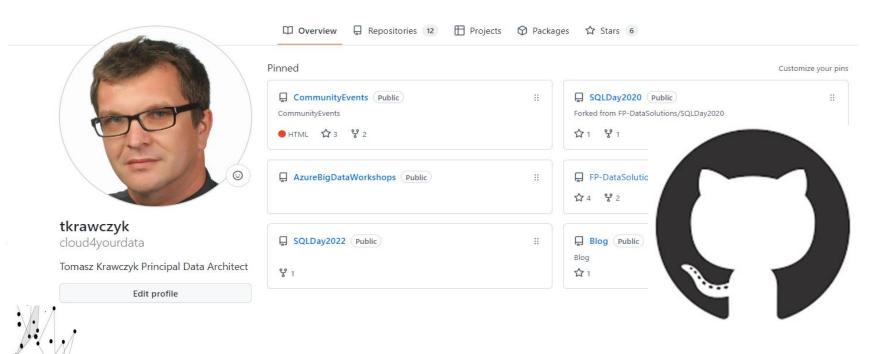


- do we really need it?

Tomasz Krawczyk Future Processing - Data Solutions



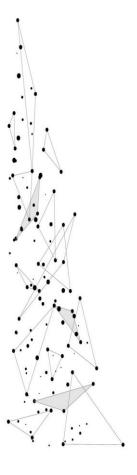
Future Processing



https://github.com/fp-datasolutions
https://github.com/cloud4yourdata/CommunityEvents

PLAN

- Hive/Spark/Databricks Metastore
- Unity Catalog
 - Setup (on Azure)
 - Structure (Unity Catalog Objects)
 - Access Control
 - Data Lineage
 - Data Security (Row and Column)
 - Data Lakehouse Federation
- Demo(s)
- Q&A



Hive and Spark Metastore

Apache Hive is a distributed, fault-tolerant **data warehouse** system that enables analytics at a **massive scale**.



Hive Metastore is a repository containing metadata (databases, tables, column names, data types, comments, etc.) about objects we create in Hive. By default, Hive uses a built-in **Derby SQL server** to store its metadata, but in production solutions usually RDBS solution are used (MySQL, MariaDB, PostgreSQL, SQL Server ...).



Apache Spark™ is a multi-language engine for executing **data engineering**, **data science**, and **machine learning** on single-node machines or clusters.

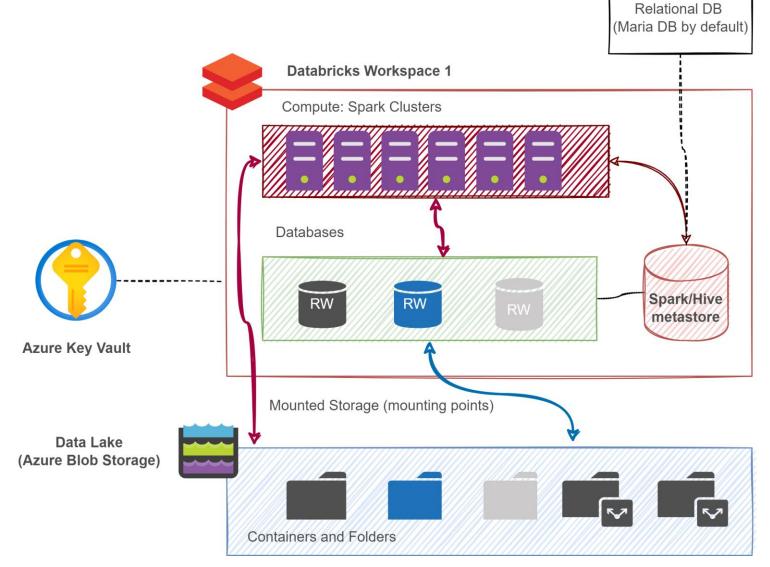
Spark SQL was released in May 2014 as an enhancement to Shark, which was principally a SQL front end to Hive. Spark SQL provides a programming abstraction called DataFrame that can act as distributed **SQL query engine**.

Databricks

Databricks is a unified, open **analytics platform** for building, deploying, sharing, and maintaining enterprisegrade data, analytics, and **AI solutions** at **scale**.

The Databricks Lakehouse Platform combines the best elements of data lakes and data warehouses to help you reduce costs and deliver on your data and Al initiatives faster.

Built on **open source** and **open standards**, a lakehouse simplifies your data estate by eliminating the silos that historically complicate data and AI.



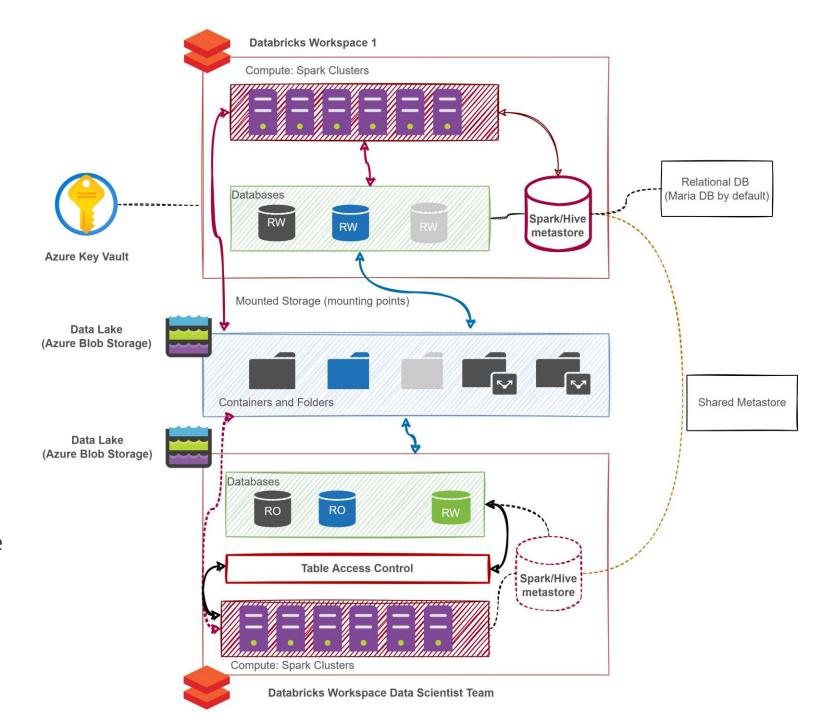
Databricks – "Data Mesh"

OUR CASE

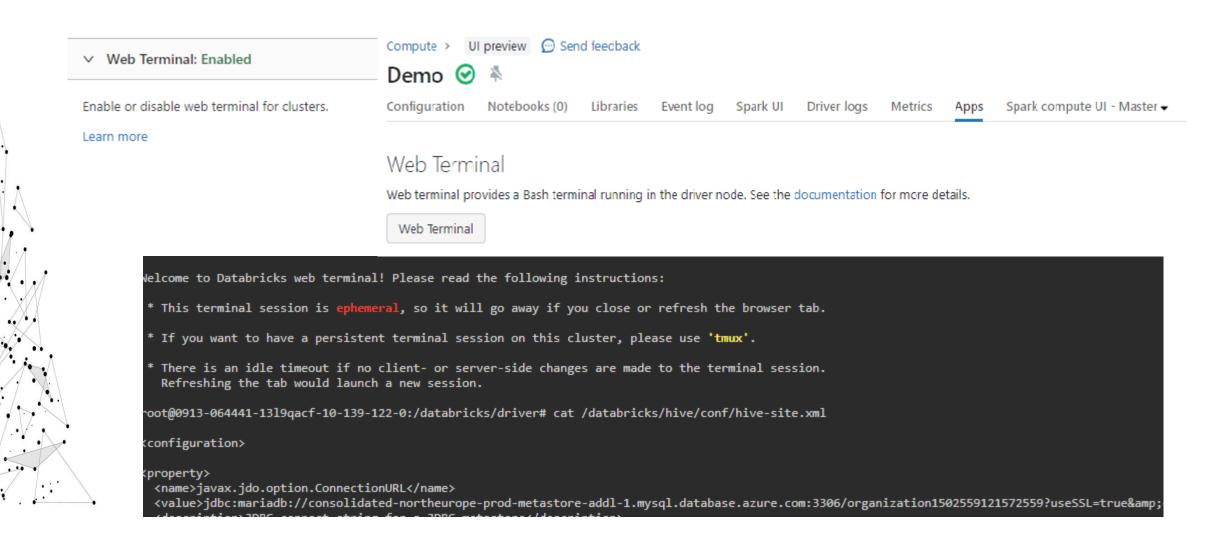
- One Workspace for ETL processes
- Additional Workspaces for Data Scientist's teams
 - Read Only Access

ETL Workspace

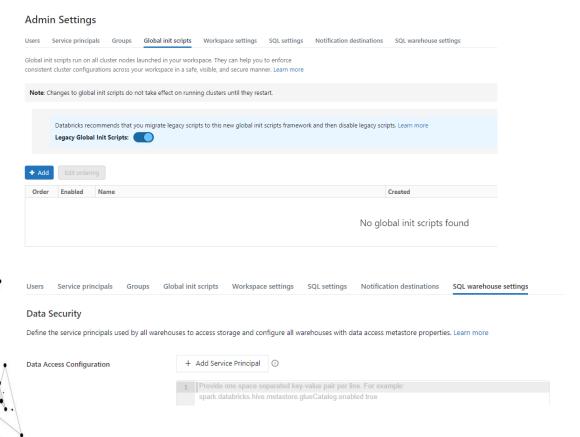
- Internal Metastore
- Mounted ADLS Gen2 Storage
- Databases, tables ...



Databricks Access to Internal Metastore



Databricks External Metastore



spark.hadoop.javax.jdo.option. ConnectionURL	Connection String to Metastore DB	jdbc:mariadb://consolidated- northeurope-prod-metastore-addl-1. mysql.database.azure.com:3306 /organization1502559121572559? useSSL=true it should be in KeyVault {{secrets/ <kv-secret-scope>/<metastore Connection String>}}</metastore </kv-secret-scope>
spark.hadoop.javax.jdo.option. ConnectionUserName	User Name for Metastore DB	Key Vault option {{secrets/ <kv-secret-scope>/<username>}}</username></kv-secret-scope>
spark.hadoop.javax.jdo.option. ConnectionPassword	User Password for Metastore DB	Key Vault option {{secrets/ <kv-secret-scope> /<userpassword>}}</userpassword></kv-secret-scope>
spark.hadoop.javax.jdo.option. ConnectionDriverName	Driver Name (Metastore DB)	org.mariadb.jdbc.Driver
spark.sql.warehouse.dir	Default location for new databases. It should point to mounting points to additional storage.	dbfs:/mnt/datascience/dbs
spark.databricks.acl. dfAclsEnabled	Enables Table ACL mechanism	true
spark.databricks.repl. allowedLanguages	Gives access to data from python and sql	python, sql

Global Init Script

Docs: https://docs.microsoft.com/en-us/azure/databricks/clusters/init-scripts#global-init-scrip

Databrick Access Control - TAC

Table access control lets you programmatically **grant** and **revoke access** to objects in your workspace's Hive metastore from **Python** and **SQL**. When table access control is enabled, **users can set permissions for data objects** that are accessed using that cluster.

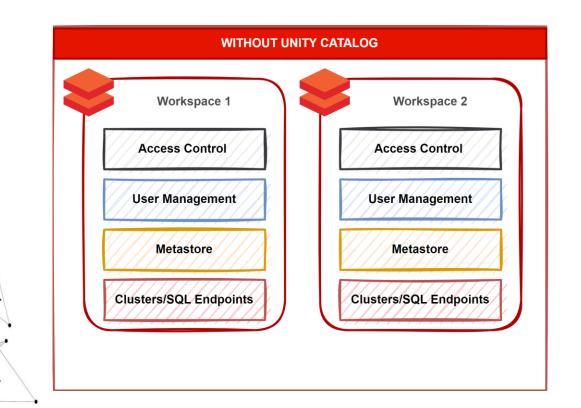
Cluster settings:

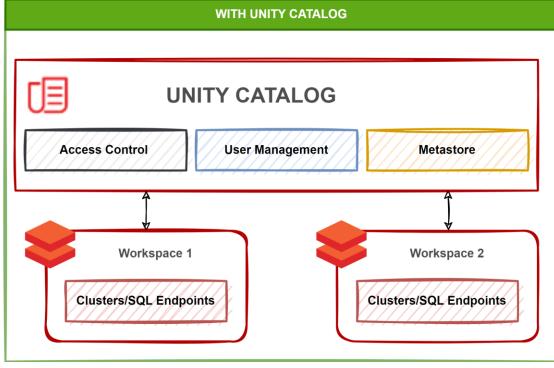
spark.databricks.acl.sqlOnly true spark.databricks.repl.allowedLanguages python,sql spark.databricks.acl.dfAclsEnabled true

- GRANT/REVOKE privilege_types ON securable_object TO principal
 - Privilege Types:
 - SELECT, CREATE, MODIFY, USAGE, READ_METADATA, ALL PRIVILEGES
 - Securable objects
 - DATABASE, TABLE, VIEW, FUNCTION, ANY FILES

Databrick Unity Catalog

Unity Catalog provides centralized access control, auditing, lineage, and data discovery capabilities across Databricks workspaces.





Databricks Unity Catalog on Azure

Account Console:

https://accounts.azuredatabricks.net/

Azure AD Global Administrator role

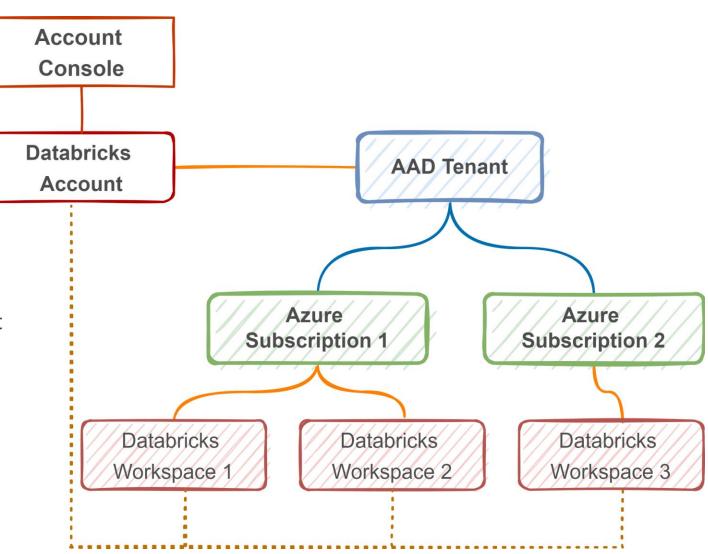


Access Connector for Azure Databricks

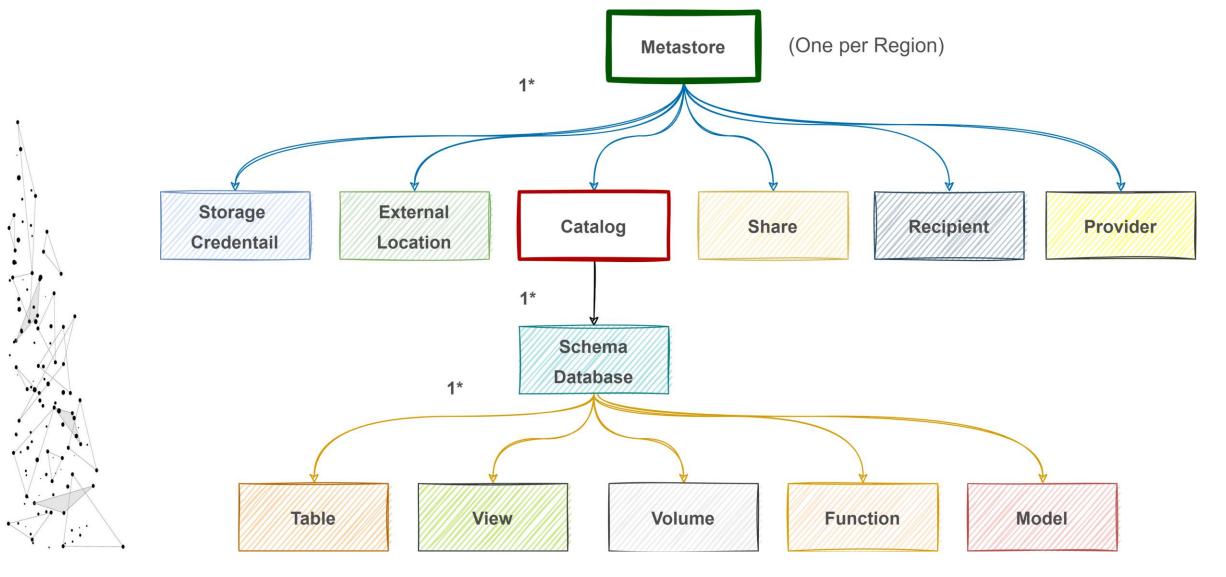
- is an Azure resource that lets you connect managed identities to an Azure Databricks account.

Managed storage

- location in an Azure Data Lake Storage Gen2 container to store data and metadata



Unity Catalog



Unity Catalog – Objects Metadata

The *INFORMATION_SCHEMA* is a SQL standard based schema, provided in every catalog created on **Unity Catalog**.

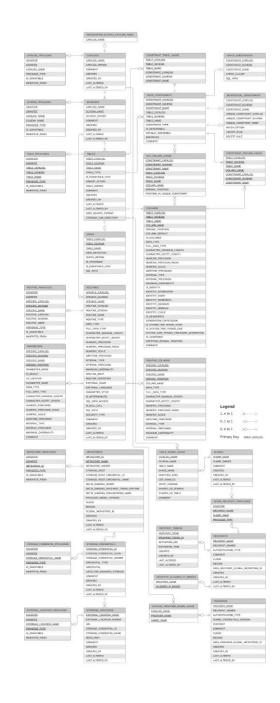
```
SELECT * FROM information_schema.catalogs;

SELECT * FROM information_schema.catalog_privileges;

SELECT * FROM information_schema.tables;
```

System tables are an Databricks-hosted analytical store of your account's operational data

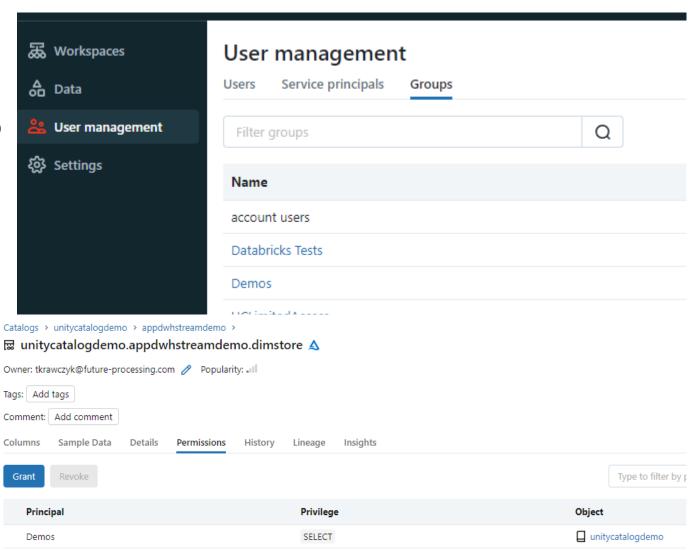
- Audit logs: Located at system.access.audit.
- Billable usage logs: Located at system.billing.usage.
- **Pricing table**: Located at system.billing.list_prices.
- **Table and column lineage**: Both tables located under system.access.
- Marketplace listing access: Located at system.marketplace.listing_access_events.



Unity Catalog

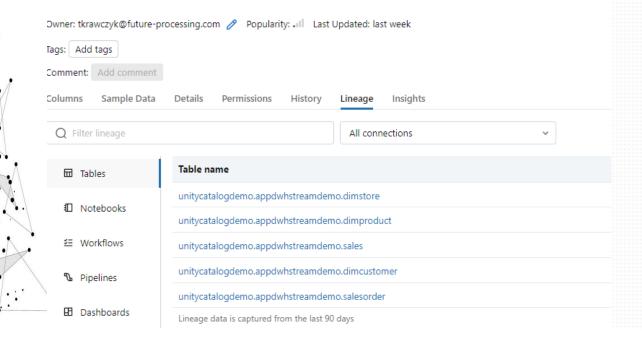
Managing Users and Access Control

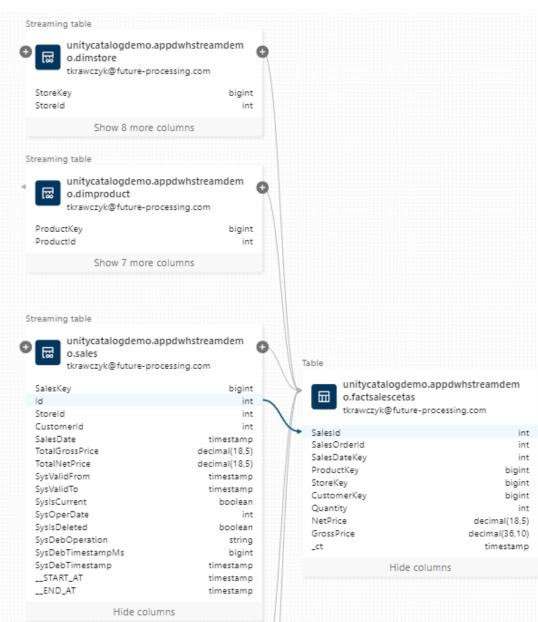
- Azure Databricks SCIM Provisioning Connector
 - synchronizes users and groups from AD to Azure Databricks (Docs)
- GRANT/REVOKE privilege_types ON securable_object TO principal
 - Privilege Types:
 - SELECT, CREATE, MODIFY, USAGE, READ_METADATA, ALL PRIVILEGES
 - Securable objects
 - DATABASE, TABLE, VIEW, FUNCTION ..



Unity Catalog Data Lineage

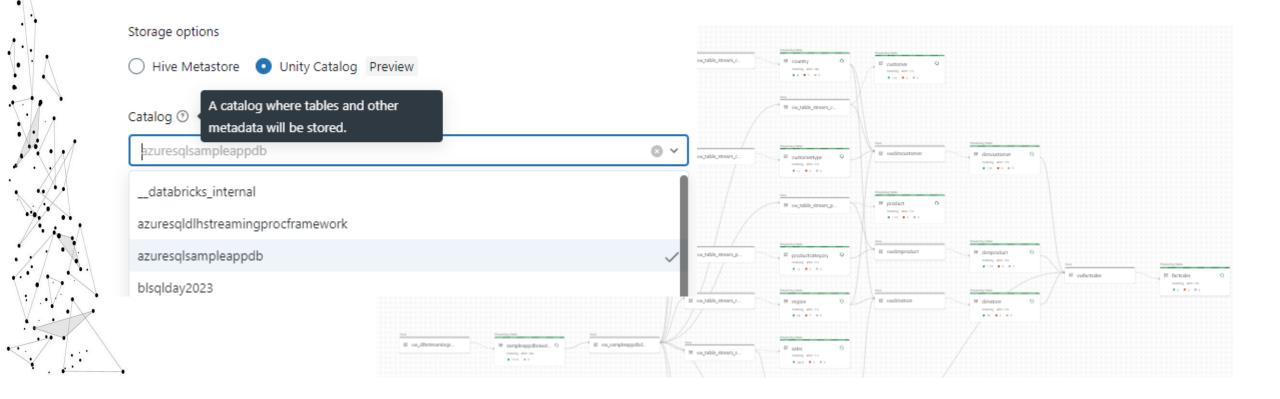
Data Lineage is supported for all languages and is captured down to the column level. Lineage data includes notebooks, workflows, and dashboards related to the query.





Unity Catalog Data Lineage and Delta Live Tables

Delta Live Tables is a declarative framework for building reliable, maintainable, and testable data processing pipelines.



Unity Catalog - Row filters and column

masking

- IS_ACCOUNT_GROUP_MEMBER (account level)
- IS_MEMBER (workspace local group)

ROW FILTER FUNCTION

CREATE FUNCTION us_filter(region STRING) **RETURN IF**(IS ACCOUNT GROUP MEMBER('admin'), true, region='US');

SQL		
ALTER TABLE <table_name></table_name>	<pre>SET ROW FILTER <function_name> ON (<column_name>,);</column_name></function_name></pre>	

COLUMN MASKING FUNCTION

CREATE FUNCTION ssn_mask(ssn STRING)		
<pre>RETURN IF(IS_ACCOUNT_GROUP_MEMBER('admin'),</pre>	ssn,	'****');

Table Name Country US John Eva 33 UK 32 US Jenny

AII	data

USUsers Group
ViewSensitveData Grou

Table		
Name	Age	Country
John	34	US
Jenny	32	US

Not in ViewSensitveData Group

Table		
Name	Age	Country
***	34	US
***	32	US

UKUsers Group ViewSensitveData Group

Table		
Name	Age	Country
Eva	33	UK

Not in ViewSensitveData Group

	Table	
Name	Age	Country
***	33	UK

```
    Copy

SQL
ALTER TABLE <table_name> ALTER COLUMN <col_name> SET MASK <mask_func_name> [USING COLUMNS <additional_columns>];
```

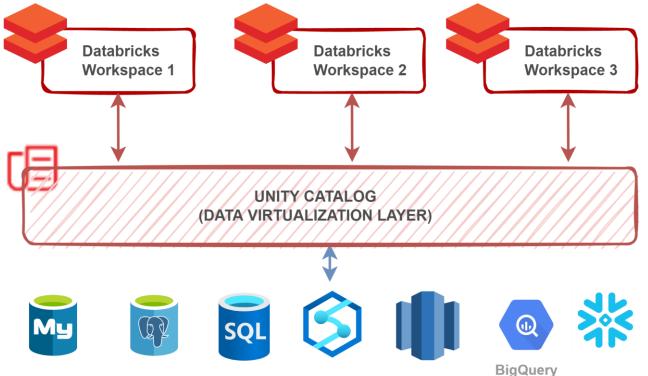
Unity Catalog - Lakehouse Query Federation

Lakehouse Query Federation provides one single secure access to all your data.
Supported data sources:

 MySQL ,PostgreSQL,Amazon Redshift, Snowflake, Azure SQL Database, Azure Synapse, Google's BigQuery ...

Unity Catalog provides:

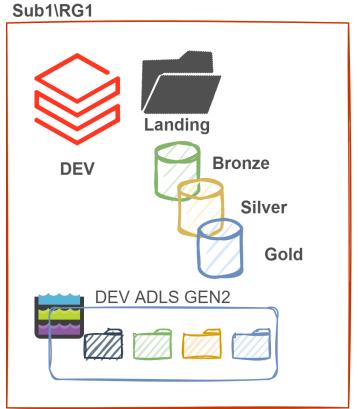
- Unified permission controls
- Intelligent pushdown optimizations
- Accelerated query performance with Materialized view
- Support for R/O operations

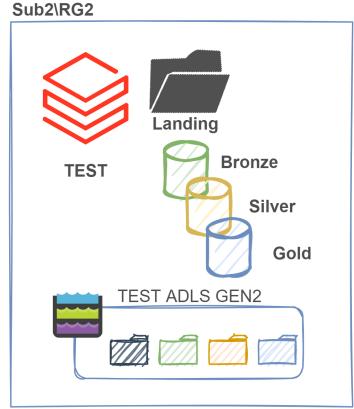


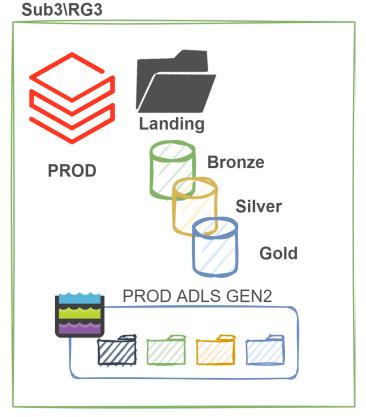
EXTERNAL DATA SOURCES

CREATE FOREIGN CATALOG [IF NOT EXISTS] <catalog-name> USING CONNECTION <connection-name>
OPTIONS (database '<database-name>');

Unity Catalog –Environments





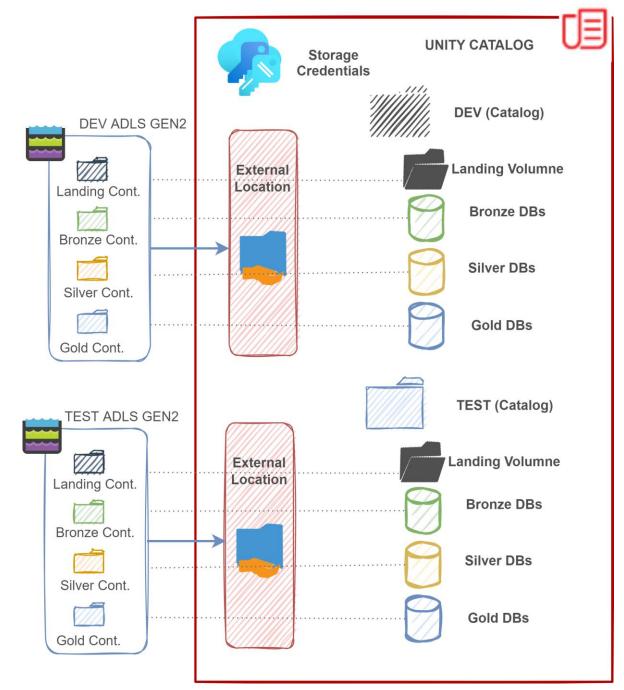




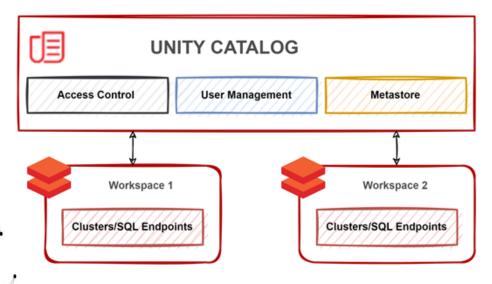
Unity Catalog -Environments

A storage credential represents an authentication and authorization mechanism for accessing data stored on your cloud tenant, using an Azure managed identity (strongly recommended) or service principal.

An external location is an object that combines a cloud storage path with a storage credential that authorizes access to the cloud storage path.



Data Mesh

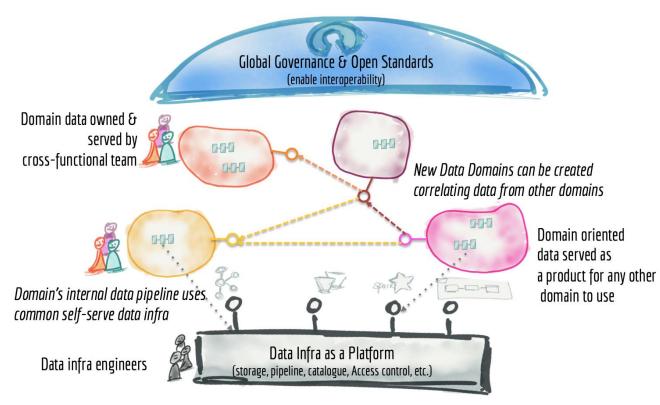


Centralized:

- Governance policies applied by a central team
- Production of data artifacts managed by a central team

Distributed:

- Domain driven production of data artifacts
- Entitlements on data owned by domain teams



Source:

 $\underline{\text{https://martinfowler.com/articles/data-monolith-to-mesh.html} \\ \text{\#TheParadigmShiftTowardsADataMesh.html} \\ \text{\#TheParadigmShiftTowardsADataMesh.html$



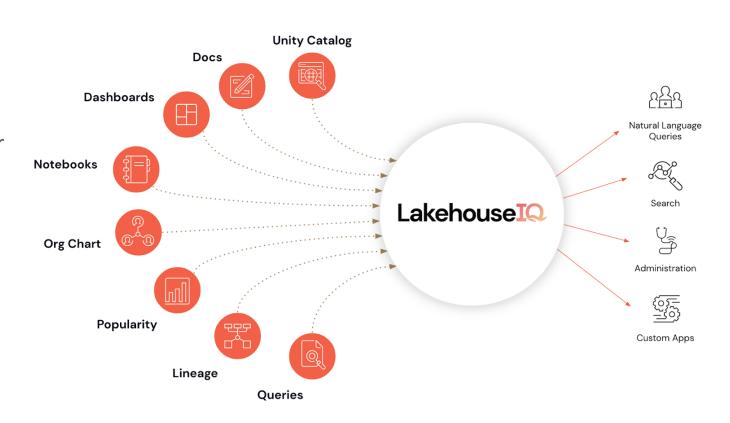
SUMMARY

Do we really need Databricks Unity Catalog?

IMO: Yes

Why:

- Centralized access control
- Single permission model for our data (tables, files, models)
- Auditing
- Data Lineage
- Data Discovery
- Data Sharing
- Data Lakehouse Federation
- What next:
 - Lakehouse IQ
 - Docs
 - Enzyme Engine









Resources



- https://www.databricks.com/product/unity-catalog
- https://www.databricks.com/resources/demos/tutor ials?itm_data=demo_center
- https://learn.microsoft.com/enus/azure/databricks/sql/language-manual/sql-refinformation-schema
- https://learn.microsoft.com/enus/azure/databricks/administration-guide/systemtables/

