



# Data Engineering with Databricks



# Course Objectives

- Leverage the Databricks Lakehouse Platform to perform core responsibilities for data pipeline development
- Use SQL and Python to write production data pipelines to extract, transform, and load data into tables and views in the lakehouse
- Simplify data ingestion and incremental change propagation using Databricks-native features and syntax
- Orchestrate production pipelines to deliver fresh results for ad-hoc analytics and dashboarding

# Course Agenda

- Module 1: Using the Databricks Lakehouse Platform
- Module 2: ETL With Spark SQL and Python
- Module 3: Incremental Data and Delta Live Tables
- Module 4: Managing Data Access and Production Pipelines

# Using the Databricks Lakehouse Platform

## Module 1 Learning Objectives

- Describe the components of the Databricks Lakehouse
- Complete basic code development tasks using services of the Databricks Data Science and Engineering Workspace
- Perform common table operations using Delta Lake in the Lakehouse

# Using the Databricks Lakehouse Platform

## Module 1 Agenda

- Introduction to the Databricks Lakehouse Platform
- Introduction to the Databricks Workspace and Services
  - Using clusters, files, notebooks, and repos
- Introduction to Delta Lake
  - Manipulating and optimizing data in Delta tables

# ETL With Spark SQL and Python

## Module 2 Learning Objectives

- Leverage Spark SQL DDL to create and manipulate relational entities on Databricks
- Use Spark SQL to extract, load, and transform data to support production workloads and analytics in the Lakehouse
- Leverage Python for advanced code functionality needed in production applications

# ETL With Spark SQL and Python

## Module 2 Agenda

- Working with Relational Entities on Databricks
  - Managing databases, tables, and views
- ETL with Spark SQL
  - Extracting data from external sources, loading and updating data in the lakehouse, and common transformations
- Just Enough Python for Spark SQL
  - Building extensible functions with Python-wrapped SQL

# Incremental Data and Delta Live Tables

## Module 3 Learning Objectives

- Incrementally process data to power analytic insights with Spark Structured Streaming and Auto Loader
- Propagate new data through multiple tables in the data lakehouse
- Leverage Delta Live Tables to simplify productionalizing SQL data pipelines with Databricks

# Incremental Data and Delta Live Tables

## Module 3 Agenda

- Incremental Data Processing with Structured Streaming and Auto Loader
  - Processing and aggregating data incrementally in near real time
- Multi-hop in the Lakehouse
  - Propagating changes through a series of tables to drive production systems
- Using Delta Live Tables
  - Simplifying deployment of production pipelines and infrastructure using SQL

# Managing Data Access and Production Pipelines

## Module 4 Learning Objectives

- Orchestrate tasks with Databricks Jobs
- Use Databricks SQL for on-demand queries
- Configure Databricks Access Control Lists to provide groups with secure access to production and development databases
- Configure and schedule dashboards and alerts to reflect updates to production data pipelines

# Managing Data Access and Production Pipelines

## Module 4 Agenda

- Task Orchestration with Databricks Jobs
  - Scheduling notebooks and DLT pipelines with dependencies
- Running Your First Databricks SQL Query
  - Navigating, configuring, and executing queries in Databricks SQL
- Managing Permissions in the Lakehouse
  - Configuring permissions for databases, tables, and views in the data lakehouse
- Productionalizing Dashboards and Queries in DBSQL
  - Scheduling queries, dashboards, and alerts for end-to-end analytic pipelines



# Using the Databricks Lakehouse Platform



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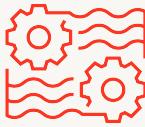
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# The Databricks Lakehouse Platform



# Lakehouse

One simple platform to unify all of  
your data, analytics, and AI workloads

## Customers

**5000+**

across the globe



## Original creators of:



# Supporting enterprises in every industry

## Healthcare & Life Sciences



## Manufacturing & Automotive



## Media & Entertainment



## Financial Services



## Public Sector



## Retail & CPG



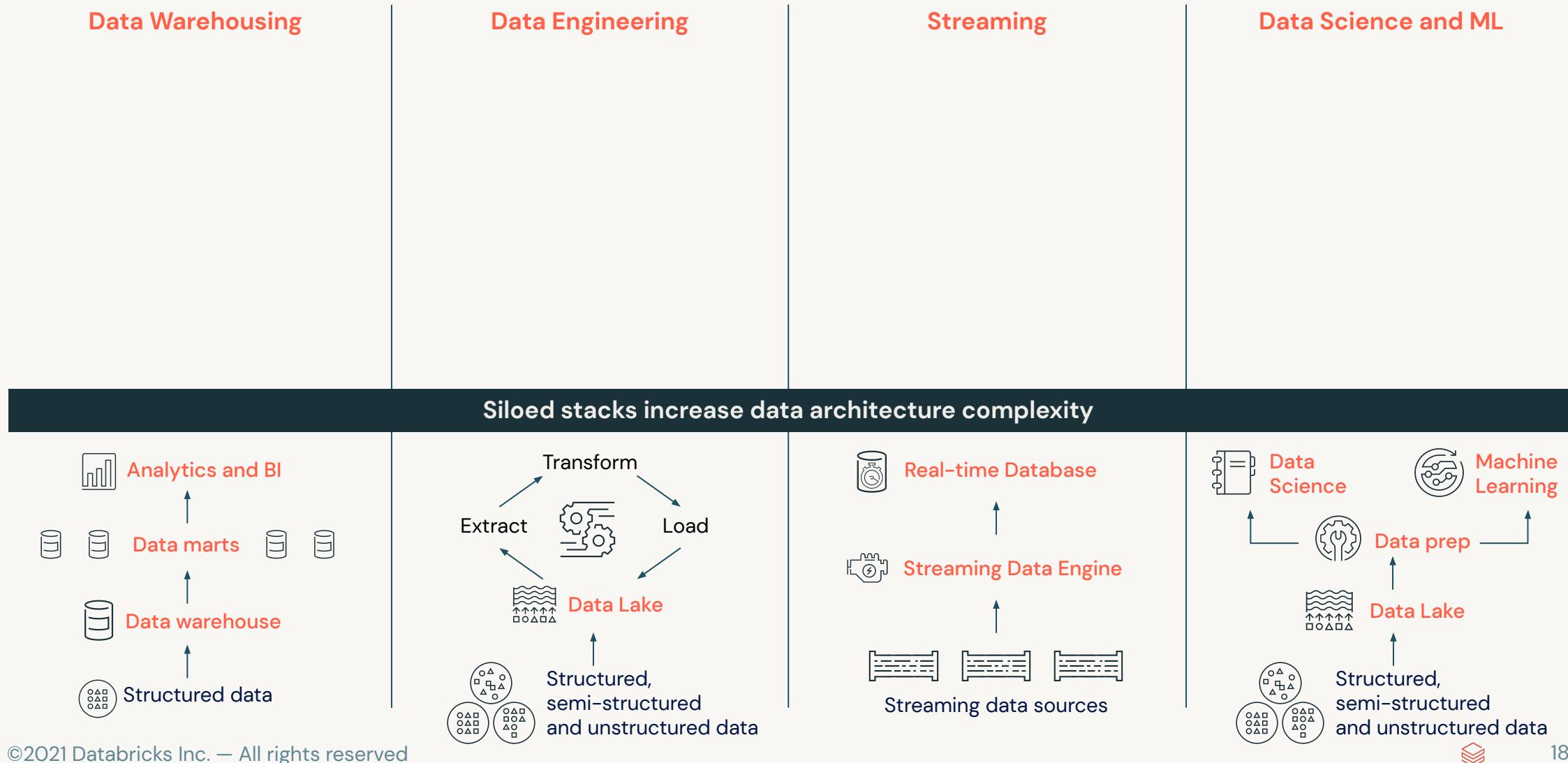
## Energy & Utilities



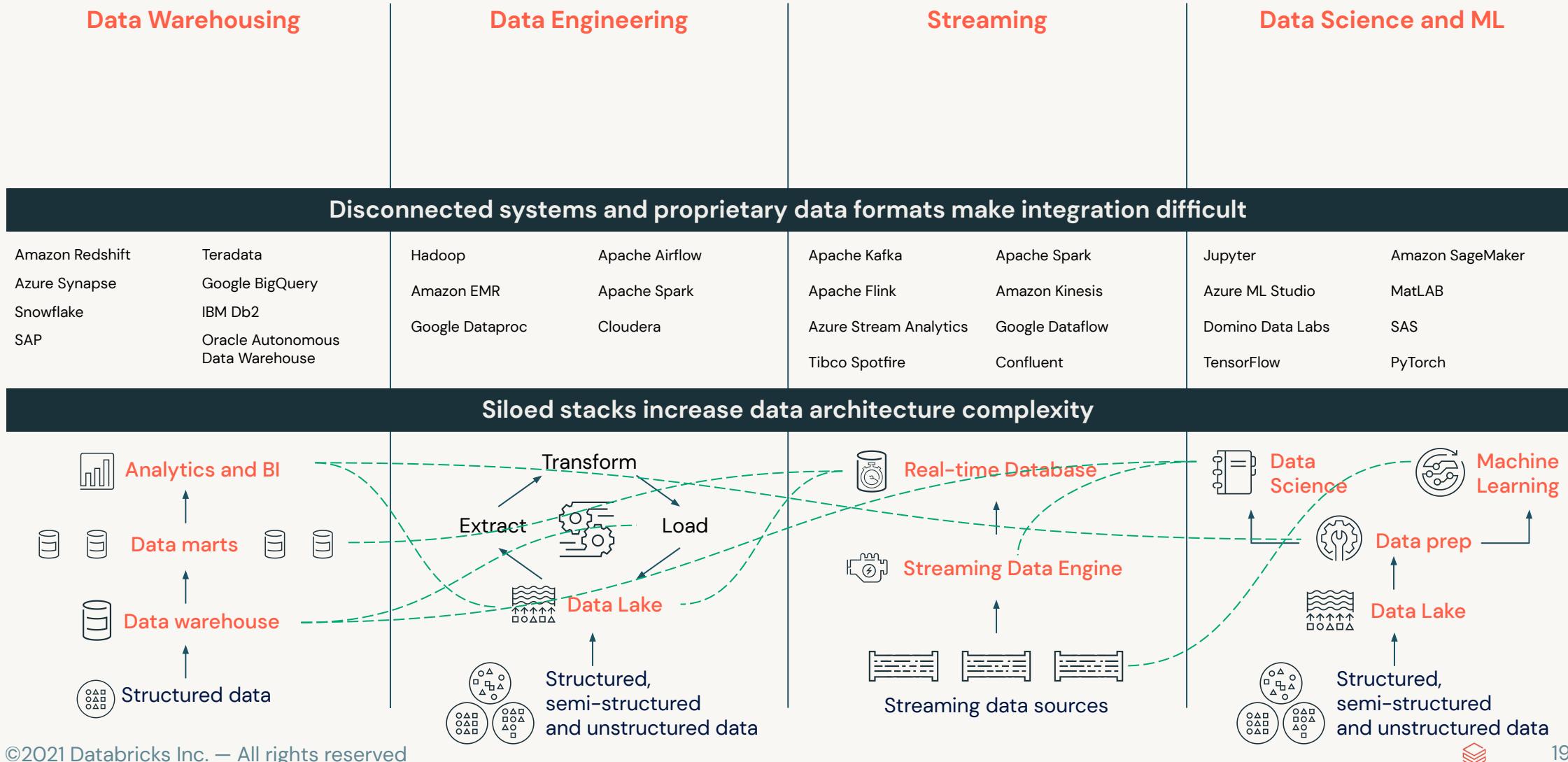
## Digital Native



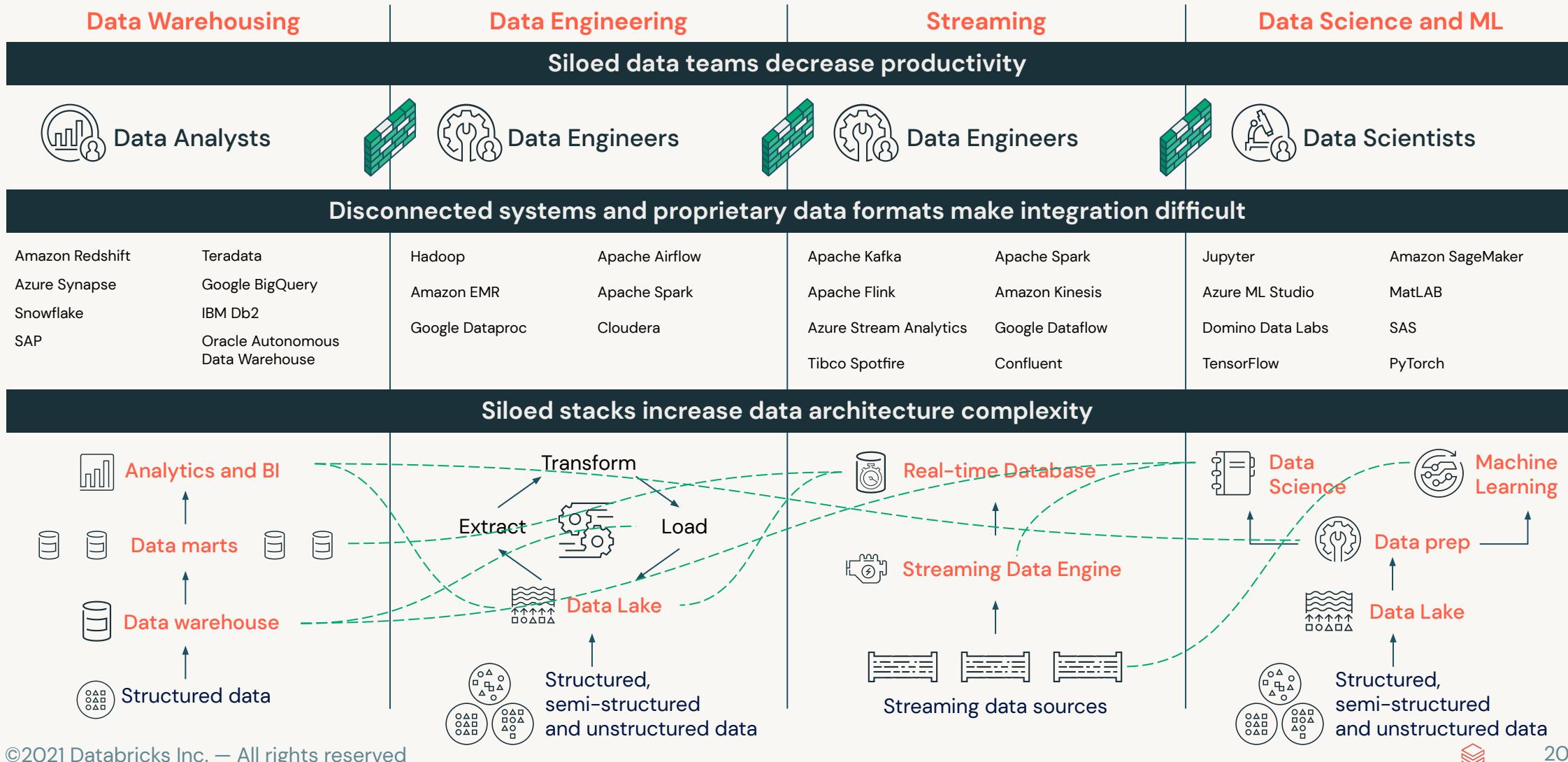
# Most enterprises struggle with data



# Most enterprises struggle with data



# Most enterprises struggle with data





Data  
Lake

# Lakehouse

One platform to unify all of  
your data, analytics, and AI  
workloads



Data  
Warehouse



## Data Lake



**DELTA LAKE**

An open approach to bringing  
**data management and**  
governance to data lakes

Better reliability with transactions

48x faster data processing with indexing

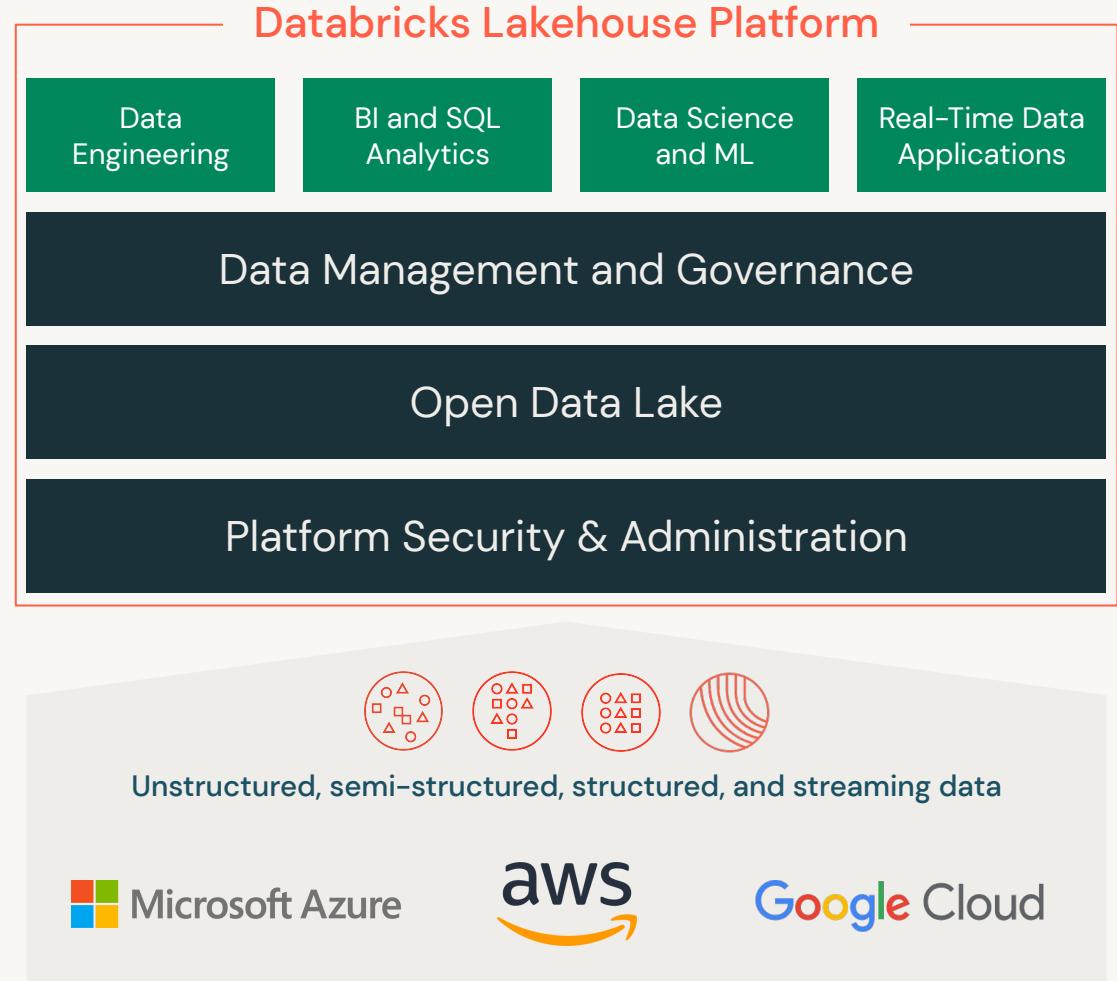
Data governance at scale with  
fine-grained access control lists



## Data Warehouse

# The Databricks Lakehouse Platform

-  Simple
-  Open
-  Collaborative



# The Databricks Lakehouse Platform



## Simple

Unify your data, analytics, and AI on one common platform for all data use cases

### Databricks Lakehouse Platform

Data Engineering

BI and SQL Analytics

Data Science and ML

Real-Time Data Applications

Data Management and Governance

Open Data Lake

Platform Security & Administration



Unstructured, semi-structured, structured, and streaming data

 Microsoft Azure

 aws

 Google Cloud

# The Databricks Lakehouse Platform



Open

Unify your data ecosystem with open source standards and formats.

Built on the innovation of some of the most successful open source data projects in the world

30 Million+  
Monthly downloads



# The Databricks Lakehouse Platform



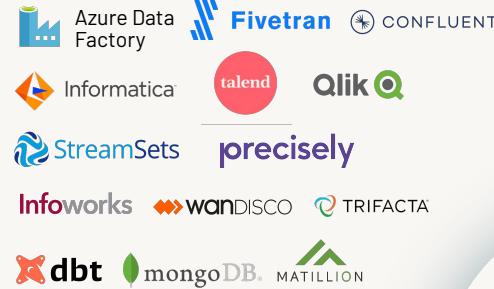
Open

Unify your data ecosystem  
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450+

Partners across the  
data landscape

## Visual ETL & Data Ingestion



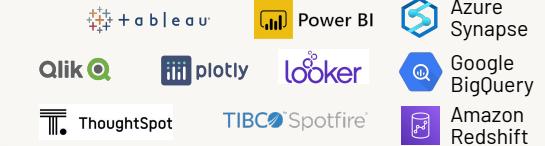
## Data Providers



## Top Consulting & SI Partners



## Business Intelligence



## Machine Learning



## Centralized Governance

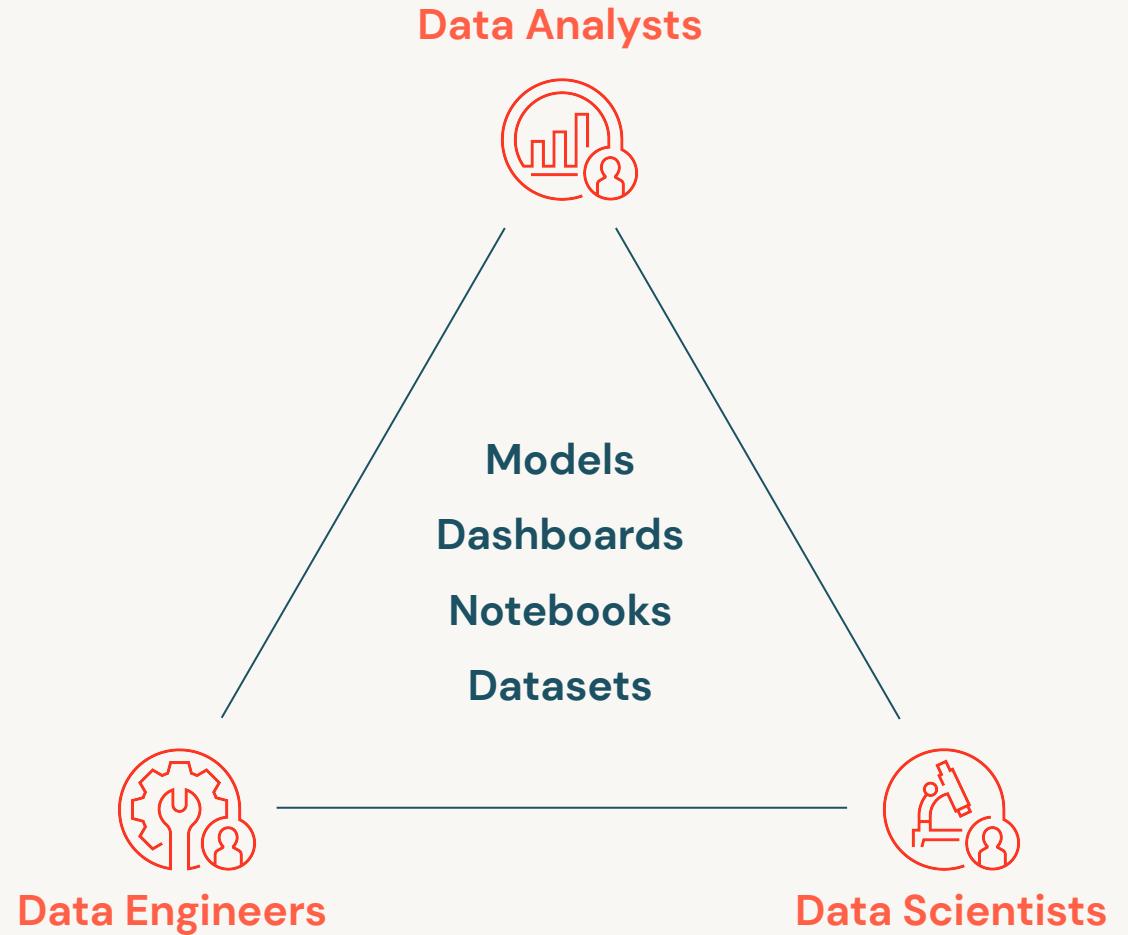


# The Databricks Lakehouse Platform



## Collaborative

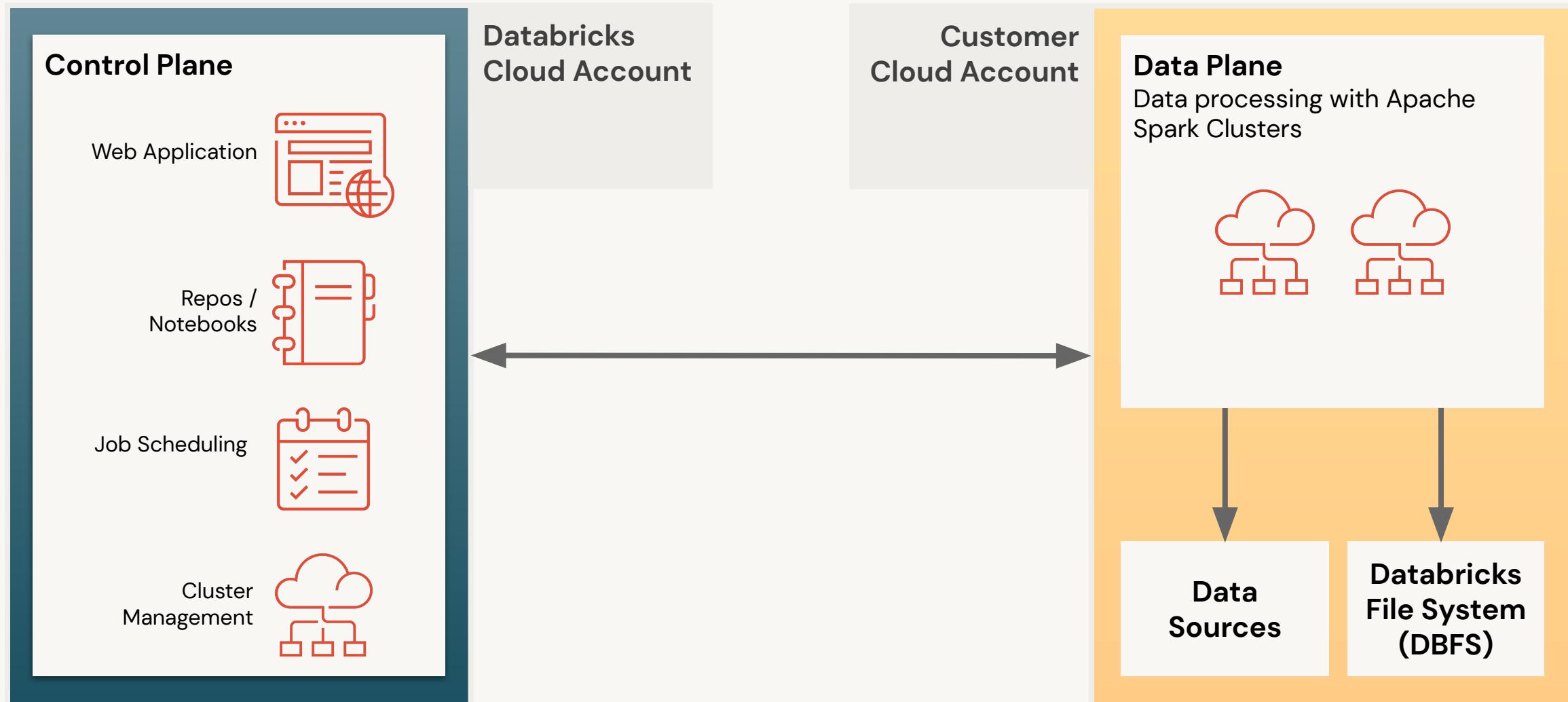
Unify your data teams to collaborate across the entire data and AI workflow





# Databricks Architecture and Services

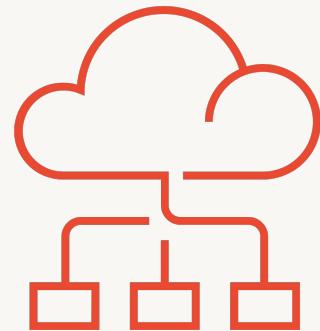
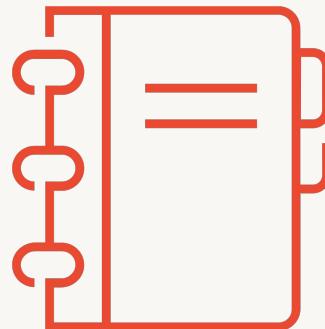
# Databricks Architecture



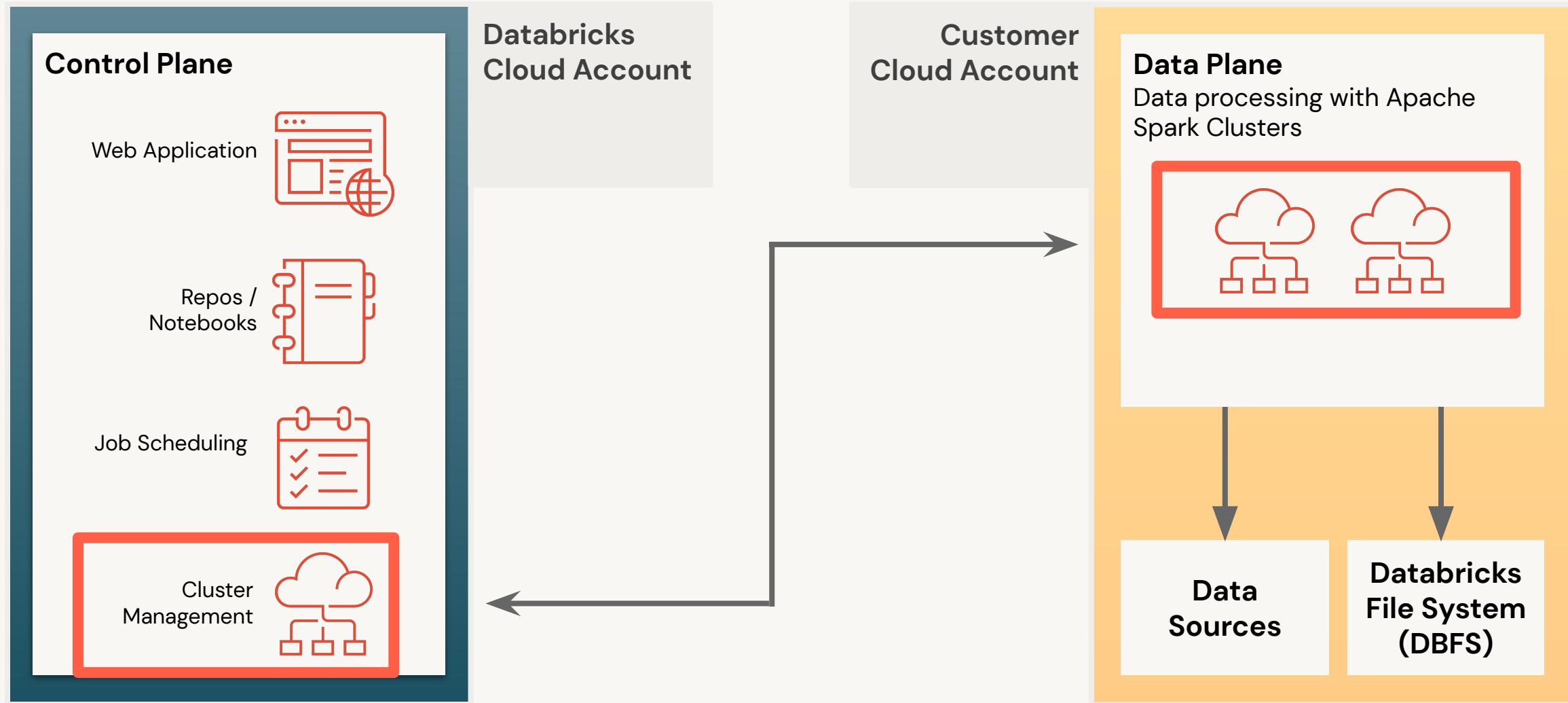
# Databricks Services

## Control Plane in Databricks

Manage customer accounts, datasets, and clusters



# Clusters



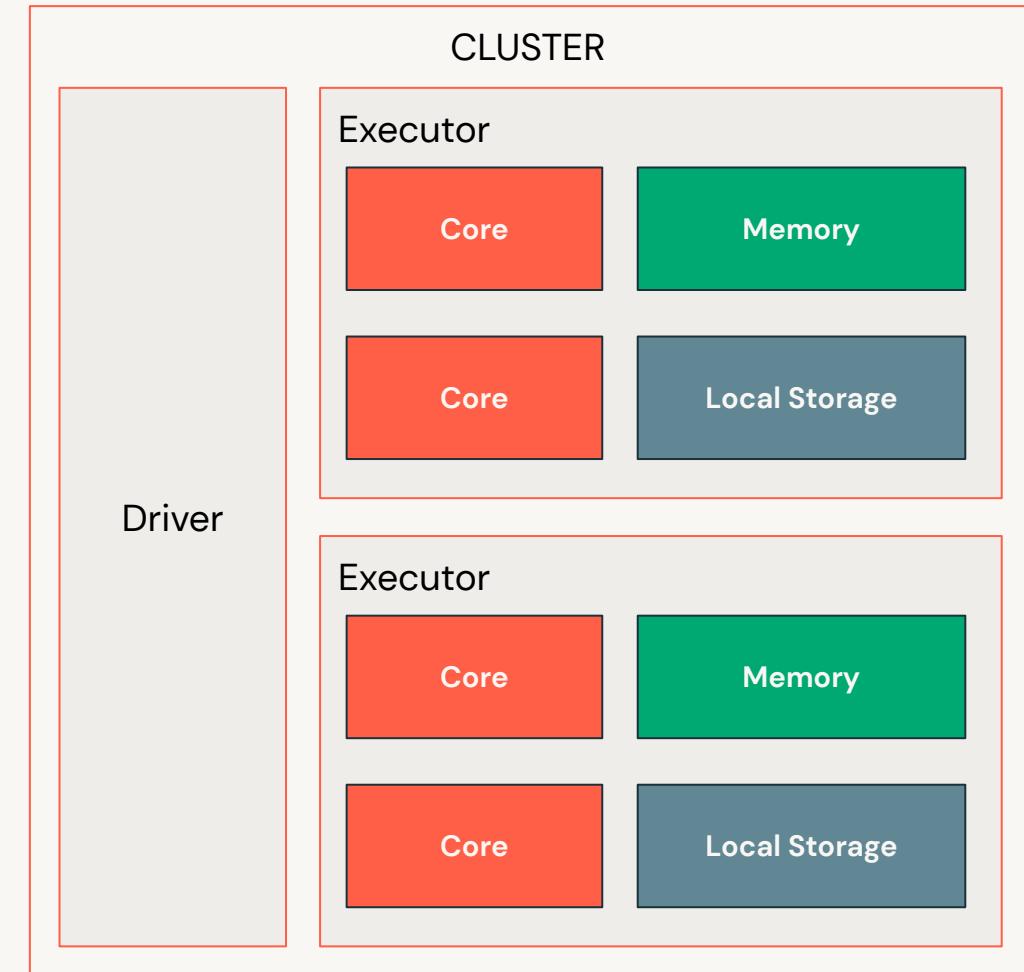
# Clusters

## Overview

Clusters are made up of one or more virtual machine (VM) instances

**Driver** coordinates activities of executors

**Executors** run tasks composing a Spark job



# Clusters

## Types

### All-purpose Clusters

Analyze data collaboratively using interactive notebooks

Create clusters from the Workspace or API

Retains up to 70 clusters for up to 30 days.

### Job Clusters

Run automated jobs

The Databricks job scheduler creates job clusters when running jobs.

Retains up to 30 clusters.



# Git Versioning with Databricks Repos

# Databricks Repos

## Overview

### Git Versioning

Native integration with Github, Gitlab, Bitbucket and Azure Devops

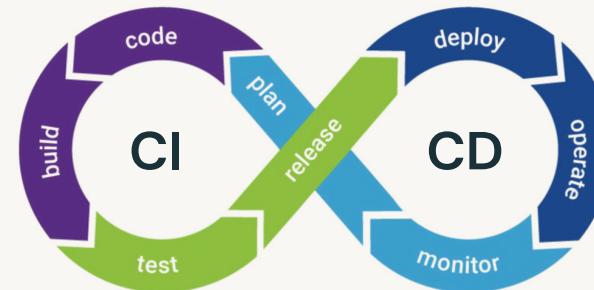
UI-based workflows



### CI/CD Integration

API surface to integrate with automation

Simplifies the dev/staging/prod multi-workspace story



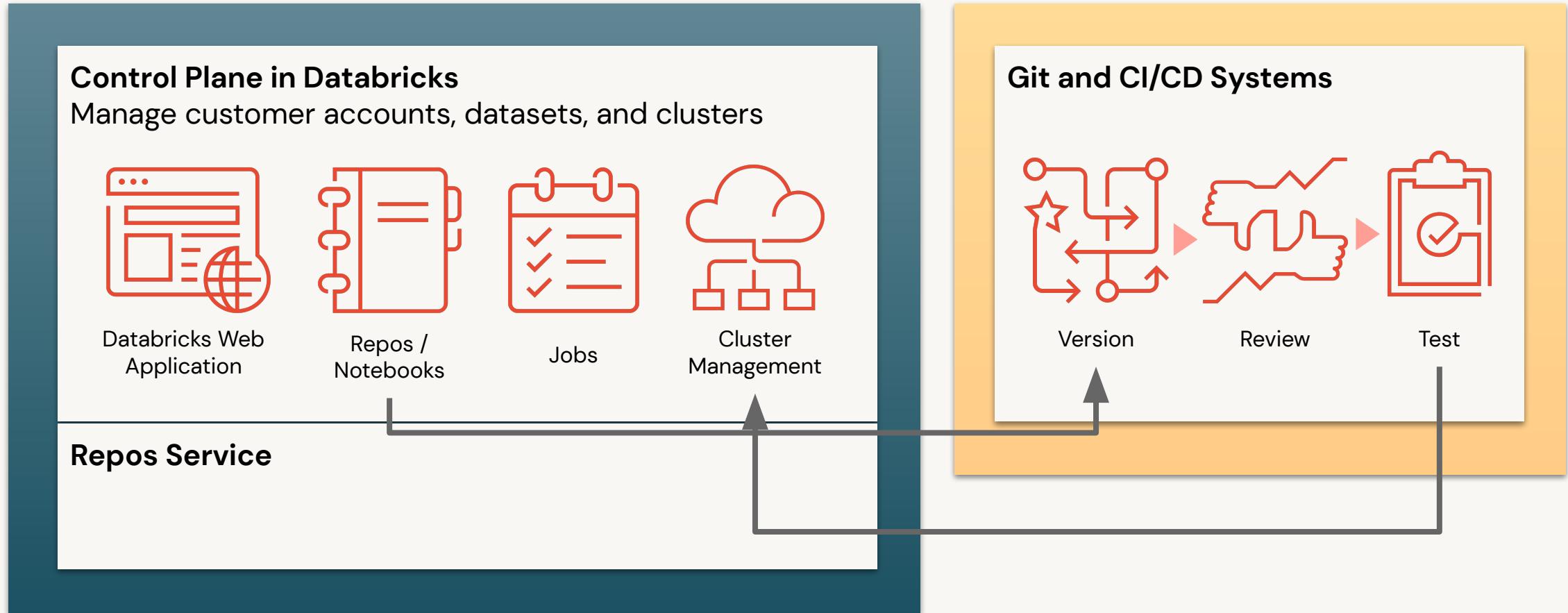
### Enterprise ready

Allow lists to avoid exfiltration

Secret detection to avoid leaking keys

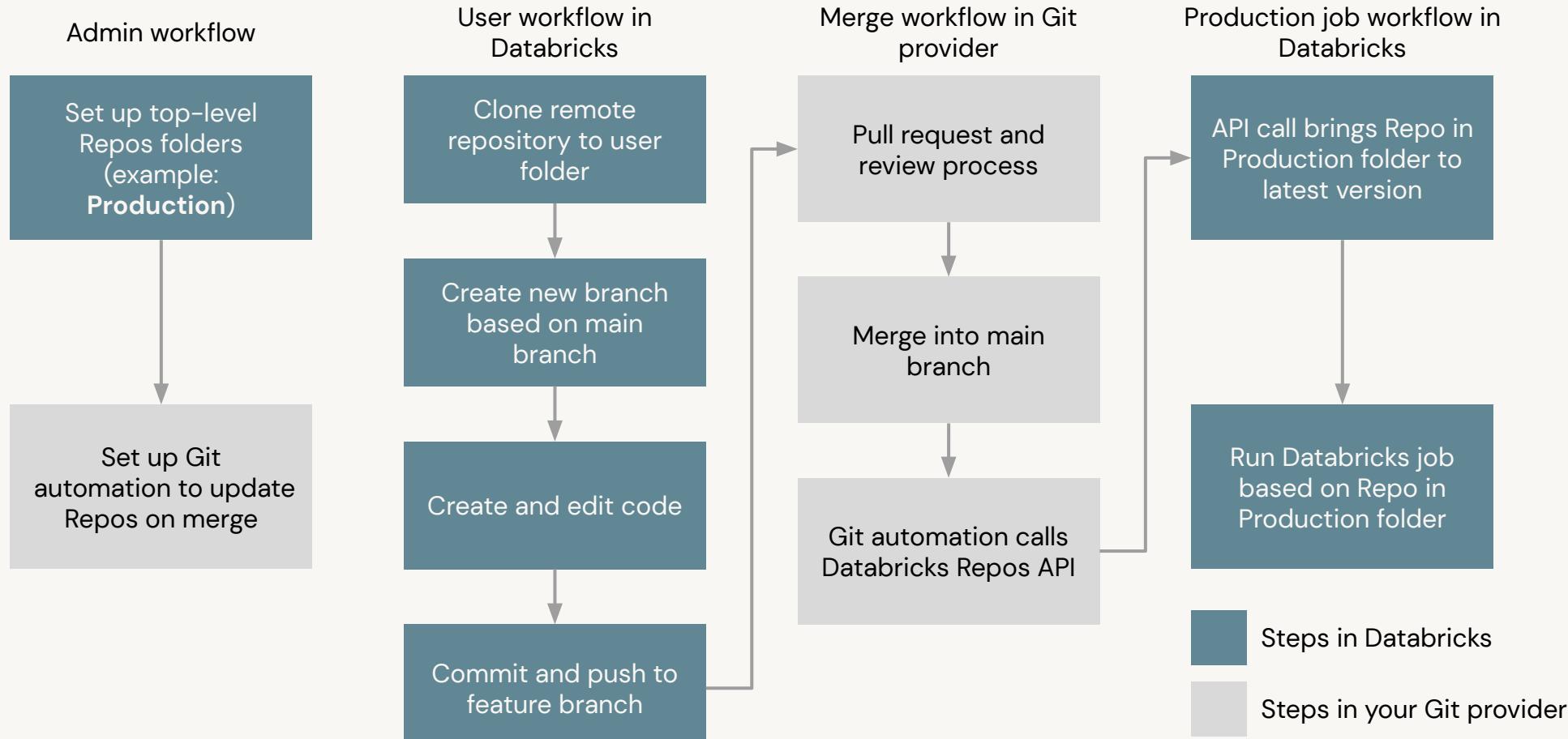
# Databricks Repos

## CI/CD Integration



# Databricks Repos

## Best practices for CI/CD workflows





# What is Delta Lake?

**Delta Lake is an open-source  
project that enables building a  
data lakehouse on top of  
existing storage systems**

# Delta Lake Is Not...

- Proprietary technology
- Storage format
- Storage medium
- Database service or data warehouse

# Delta Lake Is...

- Open source
- Builds upon standard data formats
- Optimized for cloud object storage
- Built for scalable metadata handling

# Delta Lake brings ACID to object storage

- Atomicity
- Consistency
- Isolation
- Durability



# Problems solved by ACID

1. Hard to append data
2. Modification of existing data difficult
3. Jobs failing mid way
4. Real-time operations hard
5. Costly to keep historical data versions



**Delta Lake is the default for all  
tables created in Databricks**



# ETL with Spark SQL and Python



# ETL With Spark SQL and Python

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# Incremental Data and Delta Live Tables



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# Incremental Data and Delta Live Tables

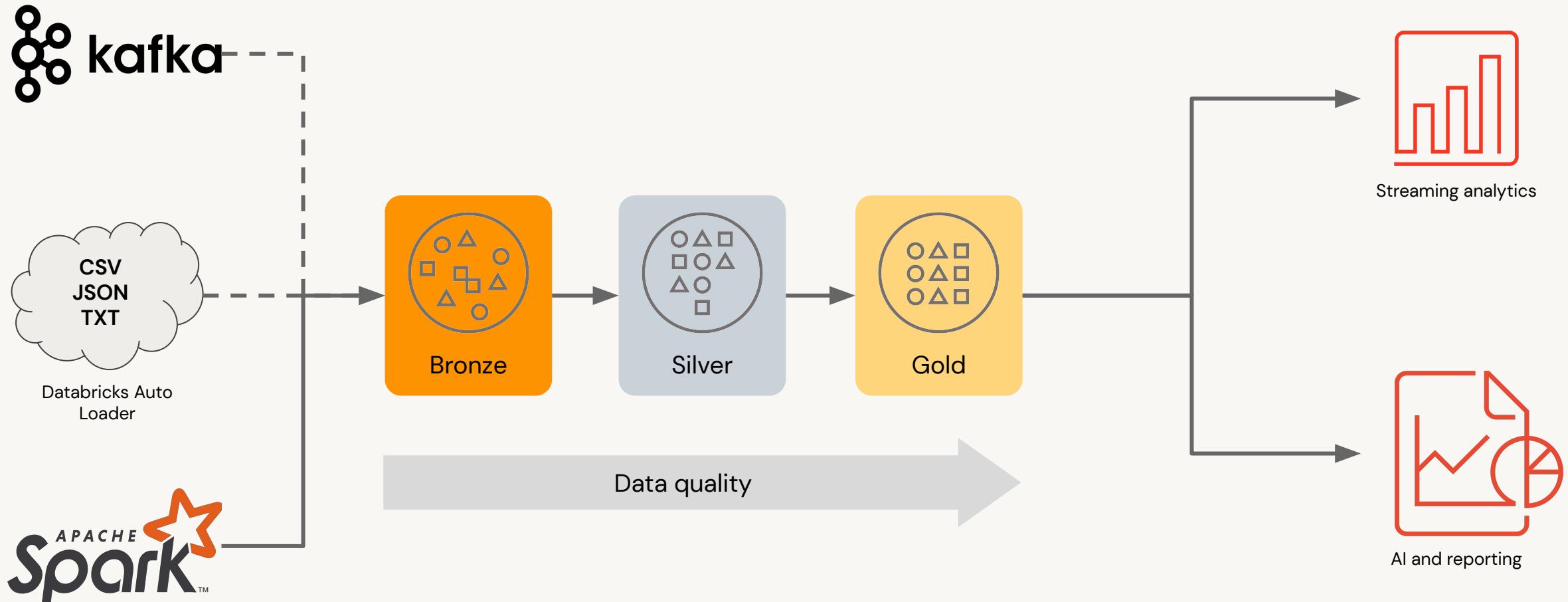
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# Multi-hop Architecture

# Multi-Hop in the Lakehouse



# Multi-Hop in the Lakehouse

## Bronze Layer

Typically just a raw copy of ingested data

Replaces traditional data lake

Provides efficient storage and querying of full, unprocessed history of data



# Multi-Hop in the Lakehouse

## Silver Layer

Reduces data storage complexity, latency, and redundancy

Optimizes ETL throughput and analytic query performance

Preserves grain of original data (without aggregations)

Eliminates duplicate records

Production schema enforced

Data quality checks, corrupt data quarantined



# Multi-Hop in the Lakehouse

## Gold Layer

Powers ML applications, reporting, dashboards, ad hoc analytics

Refined views of data, typically with aggregations

Reduces strain on production systems

Optimizes query performance for business-critical data

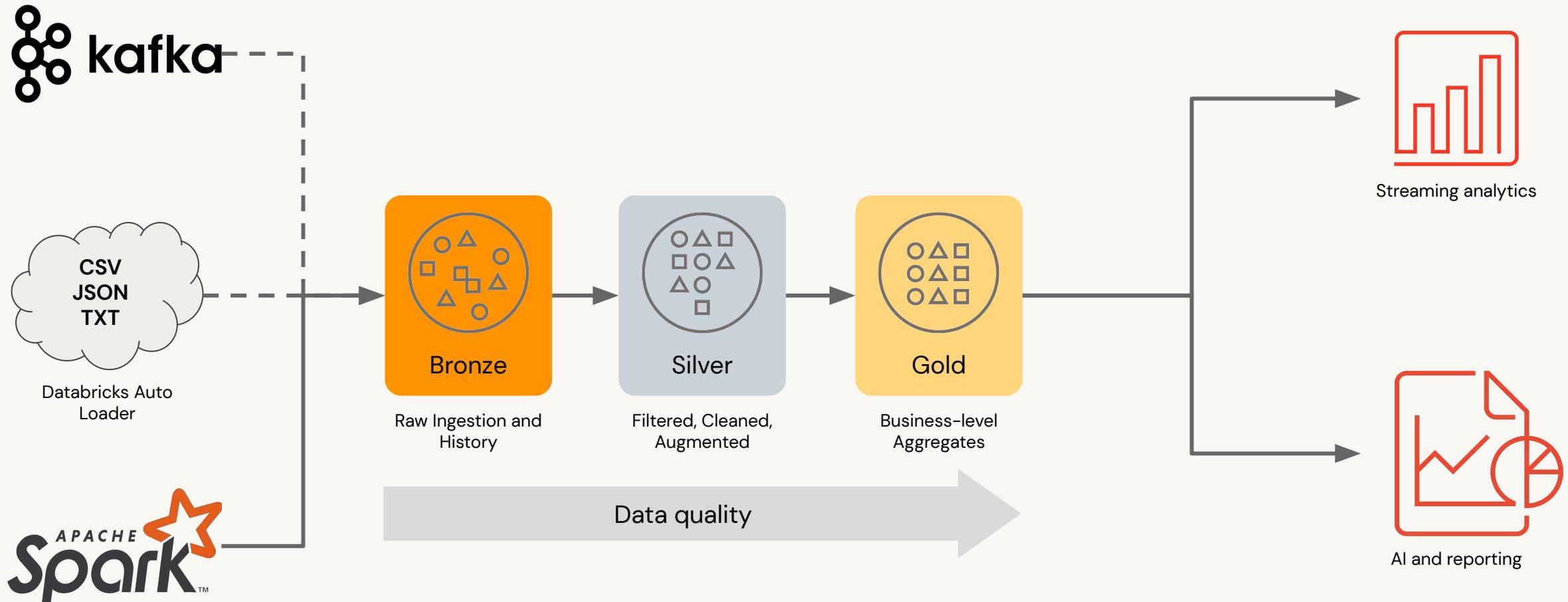




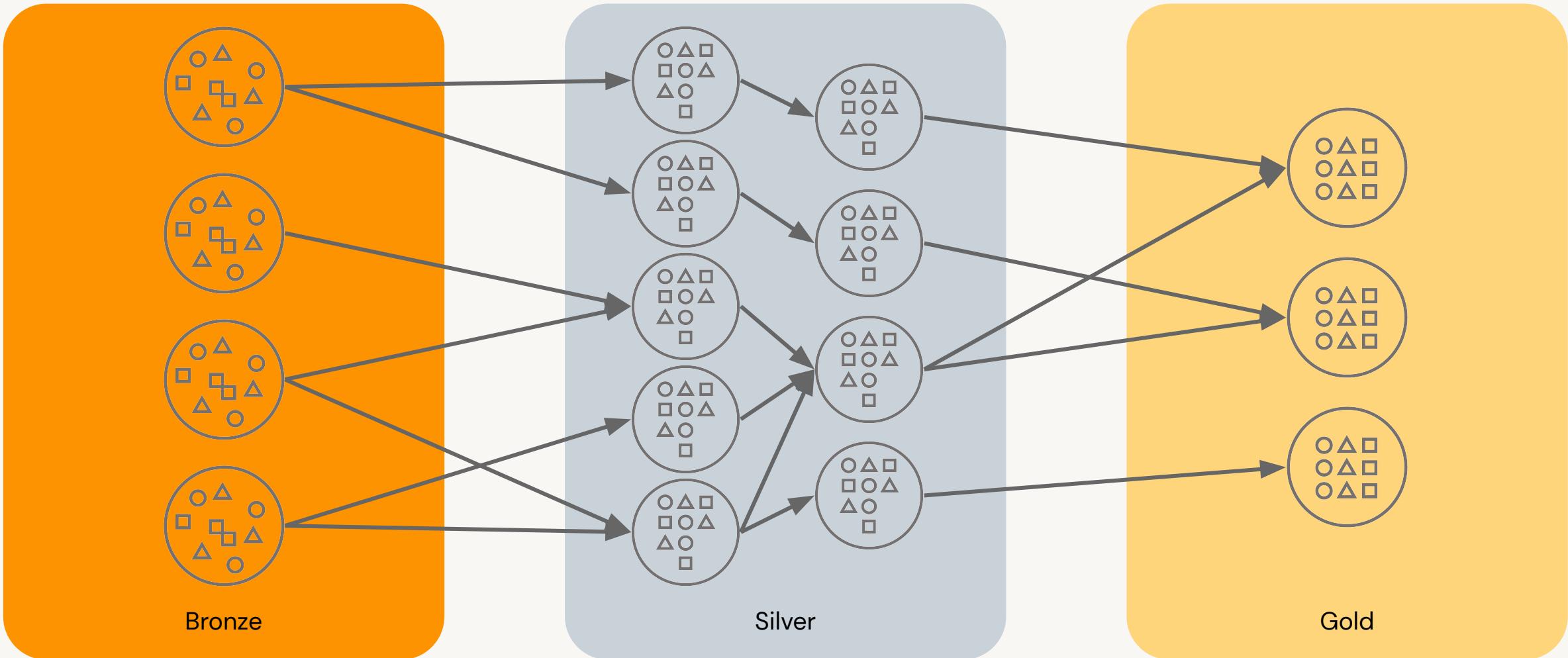
# Introducing Delta Live Tables



# Multi-Hop in the Lakehouse



# The Reality is Not so Simple



# Large scale ETL is complex and brittle

## Complex pipeline development

Hard to build and maintain table dependencies

Difficult to switch between **batch** and **stream** processing

## Data quality and governance

Difficult to monitor and enforce **data quality**

Impossible to trace data **lineage**

## Difficult pipeline operations

Poor **observability** at granular, data level

Error handling and **recovery** is laborious

# Introducing Delta Live Tables

Make reliable ETL easy on Delta Lake

## Operate with agility

Declarative tools to build batch and streaming data pipelines



## Trust your data

DLT has built-in declarative quality controls

Declare quality expectations and actions to take



## Scale with reliability

Easily scale infrastructure alongside your data





# Managing Data Access and Production Pipelines



# Managing Data Access and Production Pipelines

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# Introducing Unity Catalog

# Data Governance Overview

## Four key functional areas

### Data Access Control

Control who has access to which data

### Data Access Audit

Capture and record all access to data

### Data Lineage

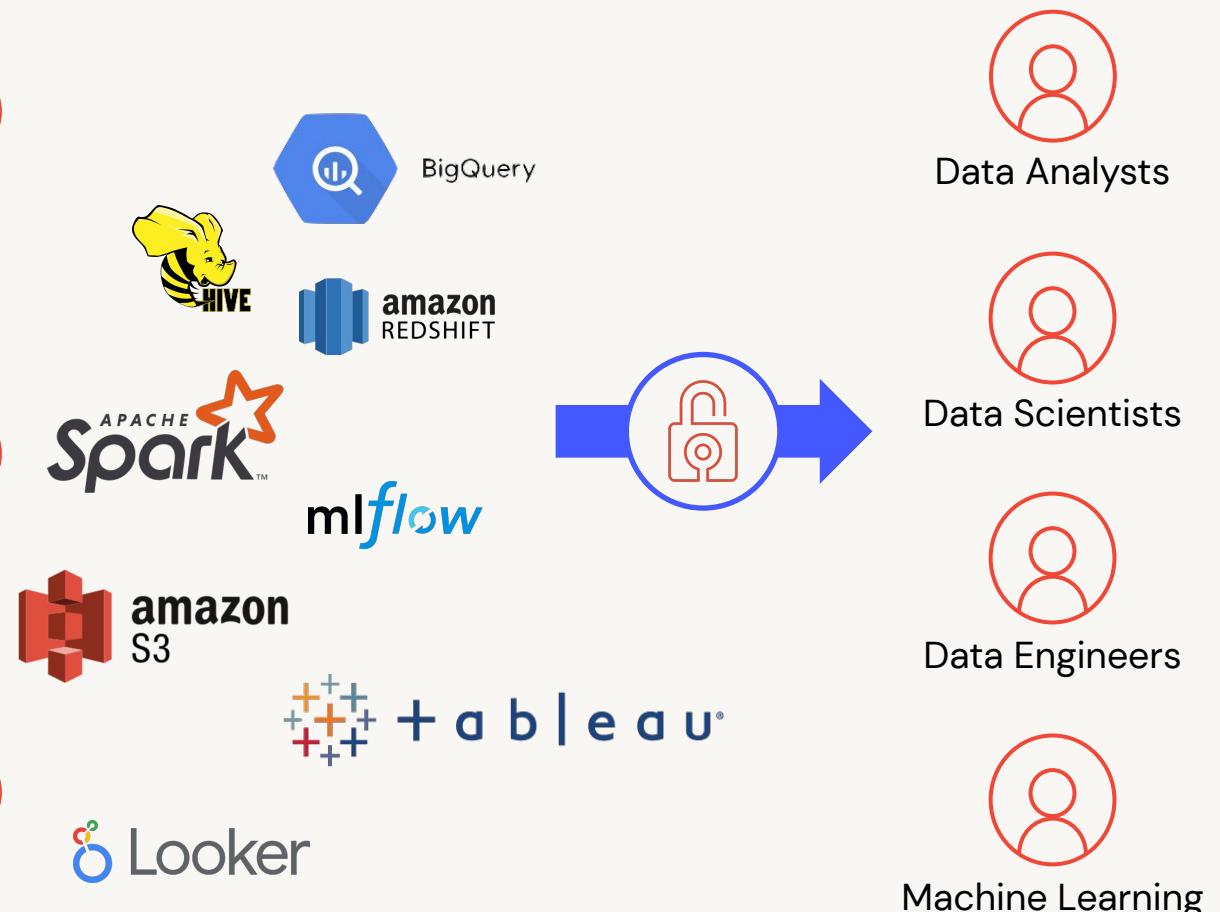
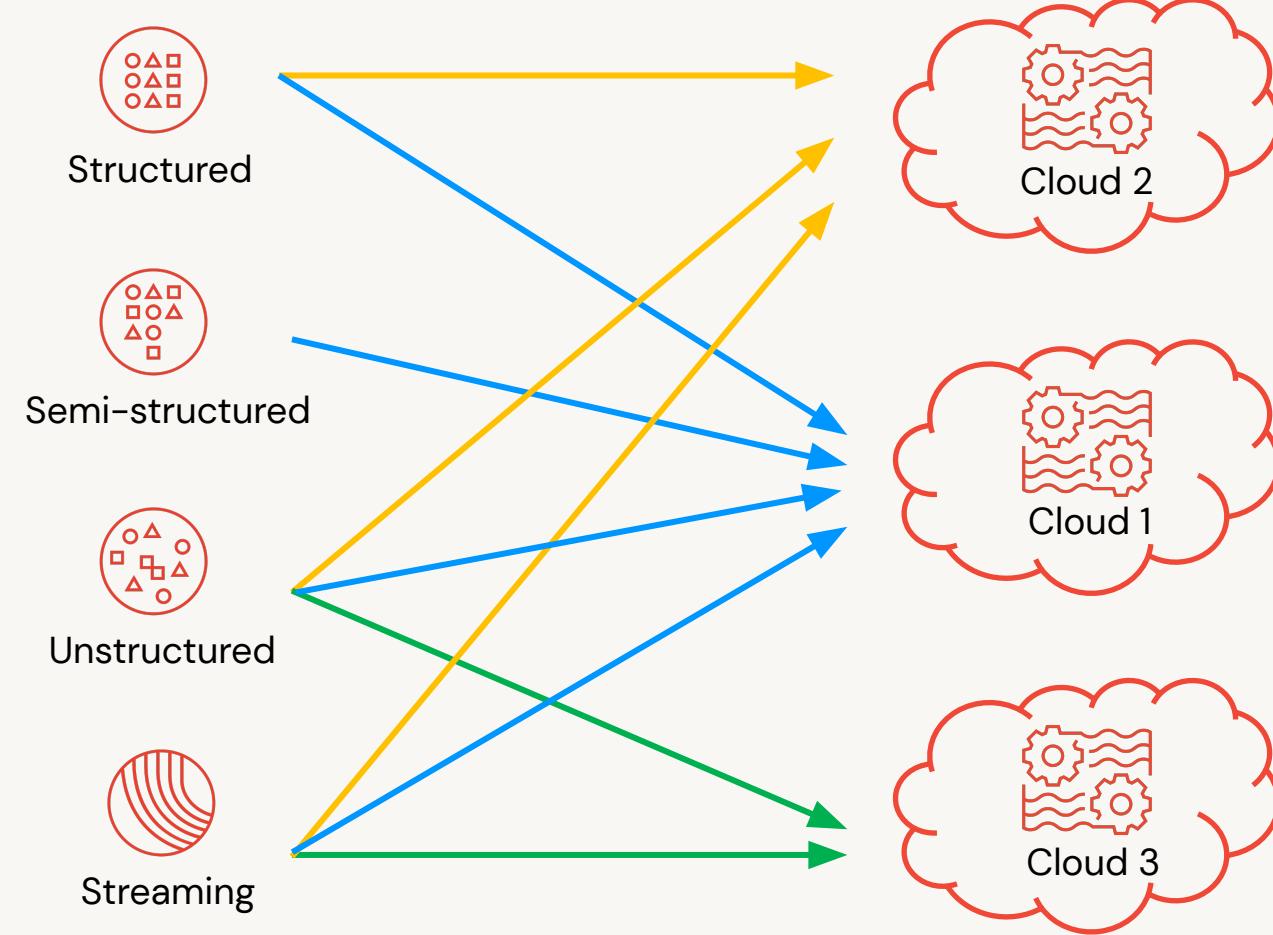
Capture upstream sources and downstream consumers

### Data Discovery

Ability to search for and discover authorized assets

# Data Governance Overview

## Challenges



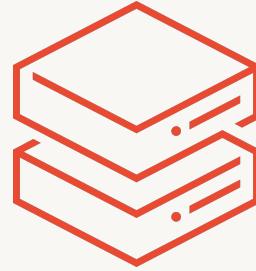
# Databricks Unity Catalog

## Overview



### Unify governance across clouds

Fine-grained governance for data lakes across clouds – based on open standard ANSI SQL.



### Unify data and AI assets

Centrally share, audit, secure and manage all data types with one simple interface.



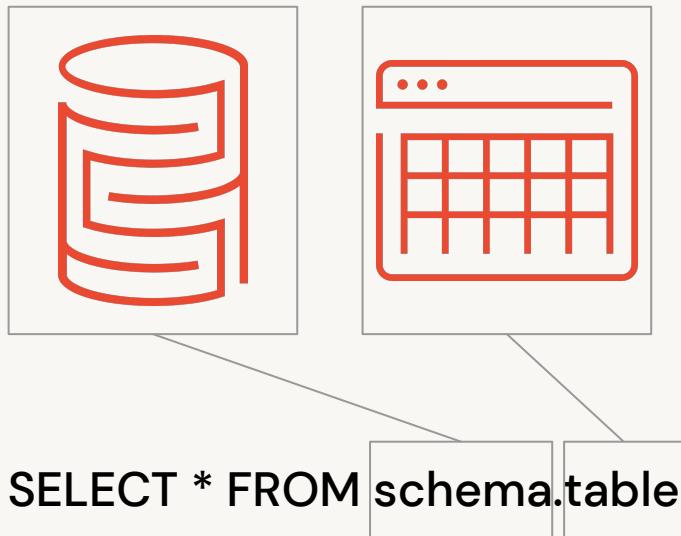
### Unify existing catalogs

Works in concert with existing data, storage, and catalogs – no hard migration required.

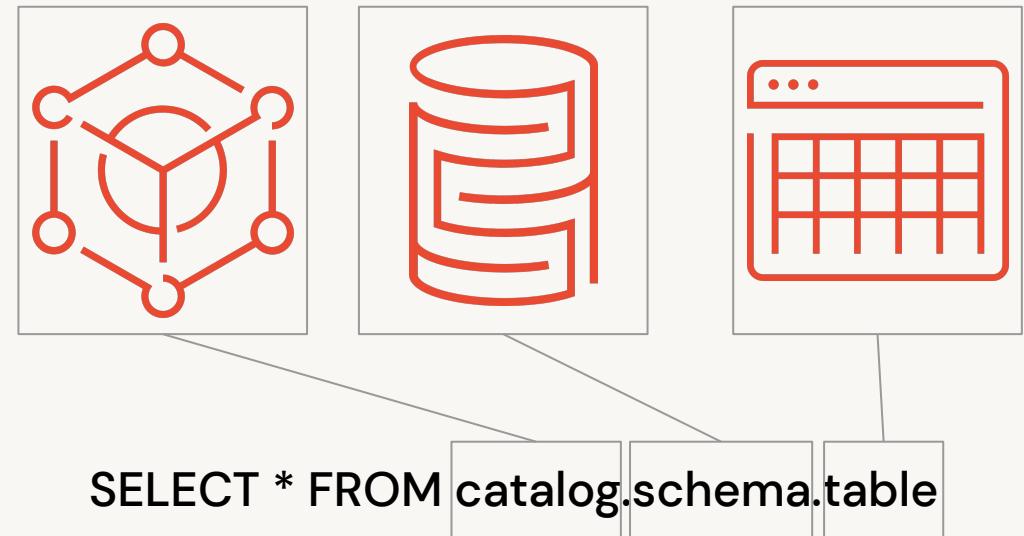
# Databricks Unity Catalog

## Three-layer namespace

### Traditional two-layer namespace



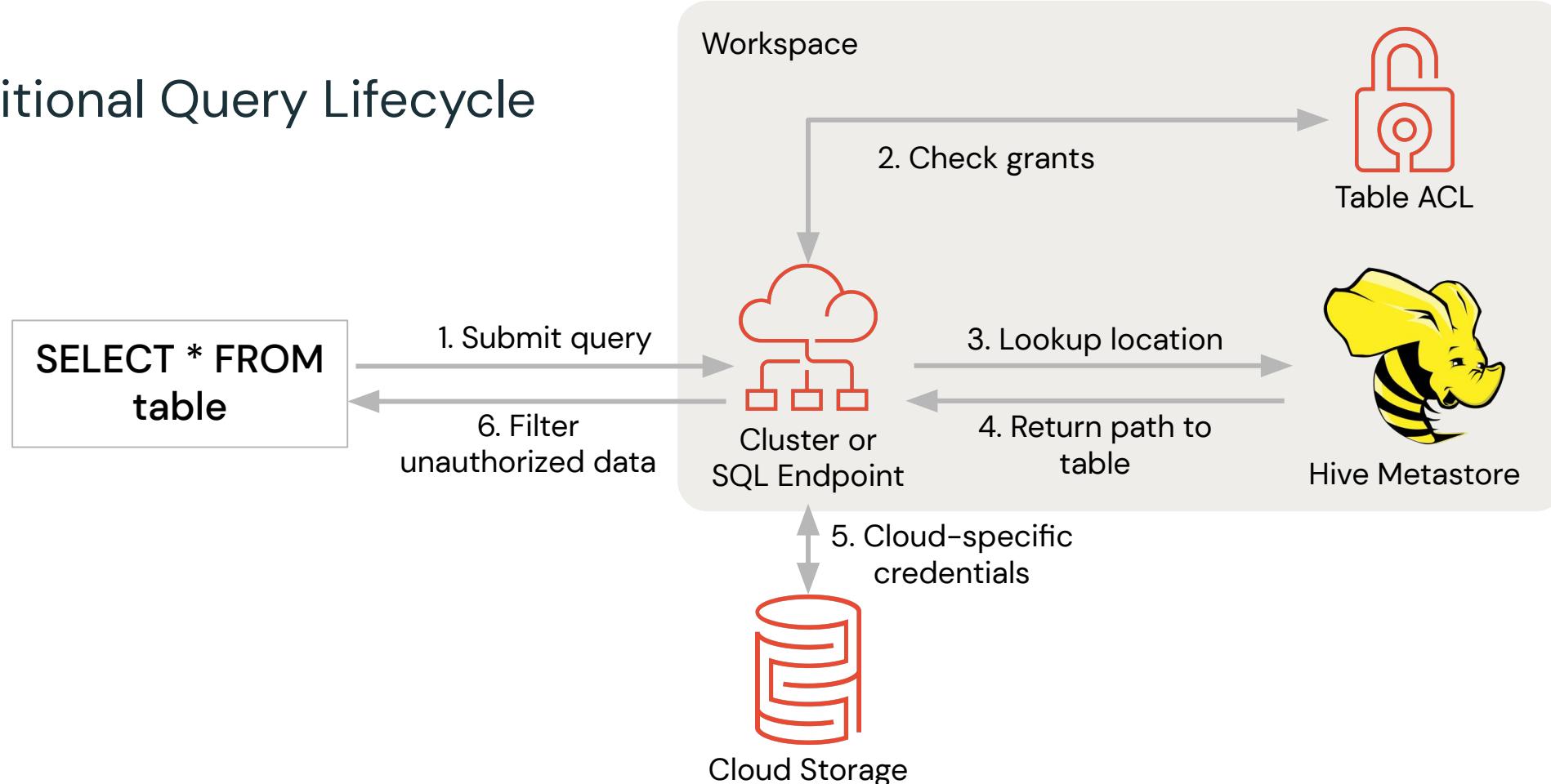
### Three-layer namespace with Unity Catalog



# Databricks Unity Catalog

## Security Model

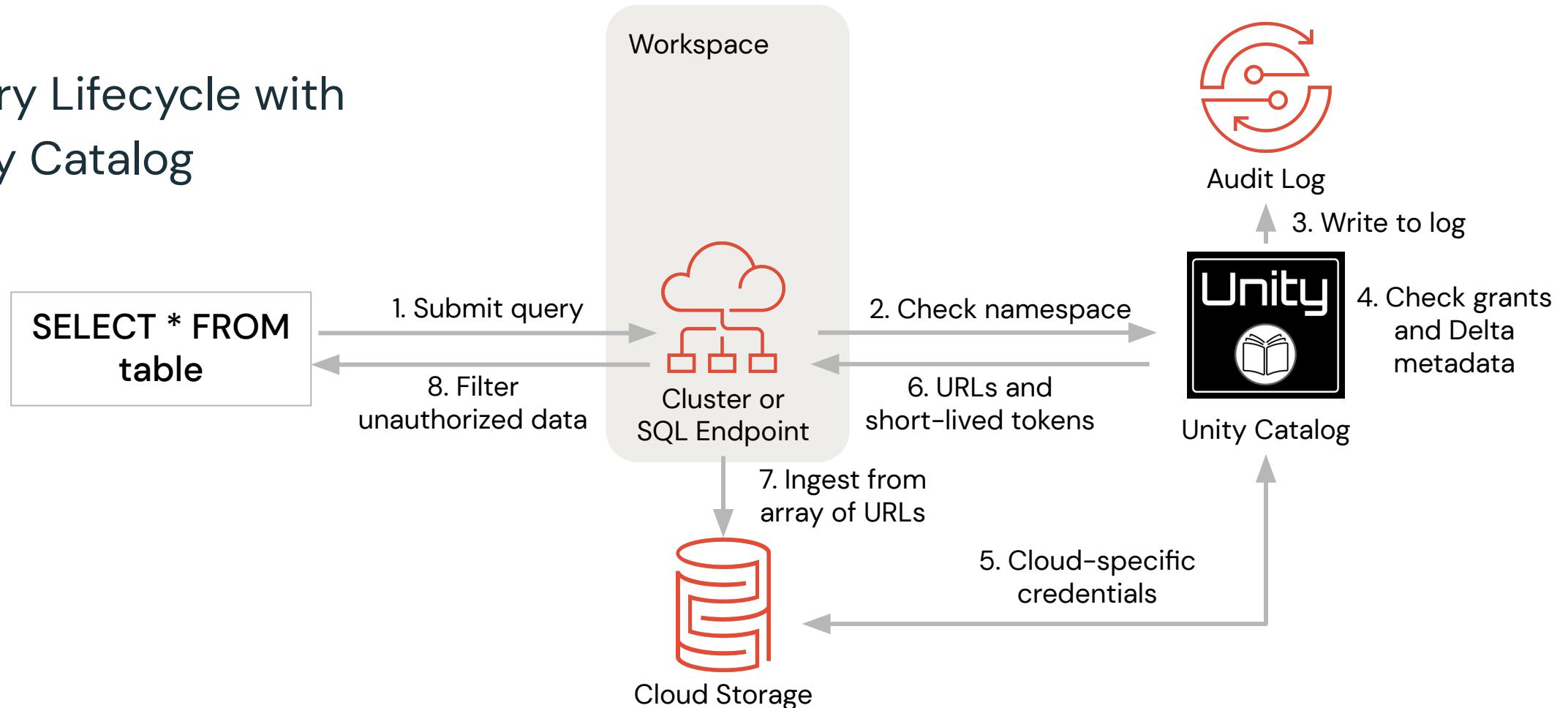
### Traditional Query Lifecycle



# Databricks Unity Catalog

## Security Model

### Query Lifecycle with Unity Catalog





# Course Recap

# Course Objectives

- Leverage the Databricks Lakehouse Platform to perform core responsibilities for data pipeline development
- Use SQL and Python to write production data pipelines to extract, transform, and load data into tables and views in the lakehouse
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