## re:Invent

NOV. 28 - DEC. 2, 2022 | LAS VEGAS, NV

# Achieving your modern data architecture

Santosh Chandrachood

General Manager AWS Glue



### Agenda

Modern data architecture on AWS

End-to-end data life cycle on the modern data architecture

Data governance and data mesh in action

Journey towards modern data architecture



## Deriving insights from data is hard

AWS CAN HELP







**Data silos** 

People silos

**Business silos** 



## Challenges in data silos











Data is growing exponentially

From new sources

Increasingly diverse

More users needing secure access

Cost and performance



## Challenges in people silos



UNIQUE USER SKILLSETS



PREFERENCES



REQUIRED PROCESSES



## Challenges in business silos











## The five pillars of a modern data architecture

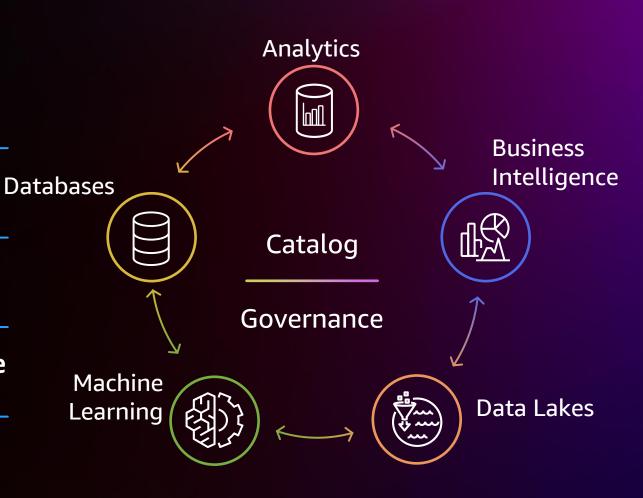
**Unified analytics** 

Highest performance at the lowest cost

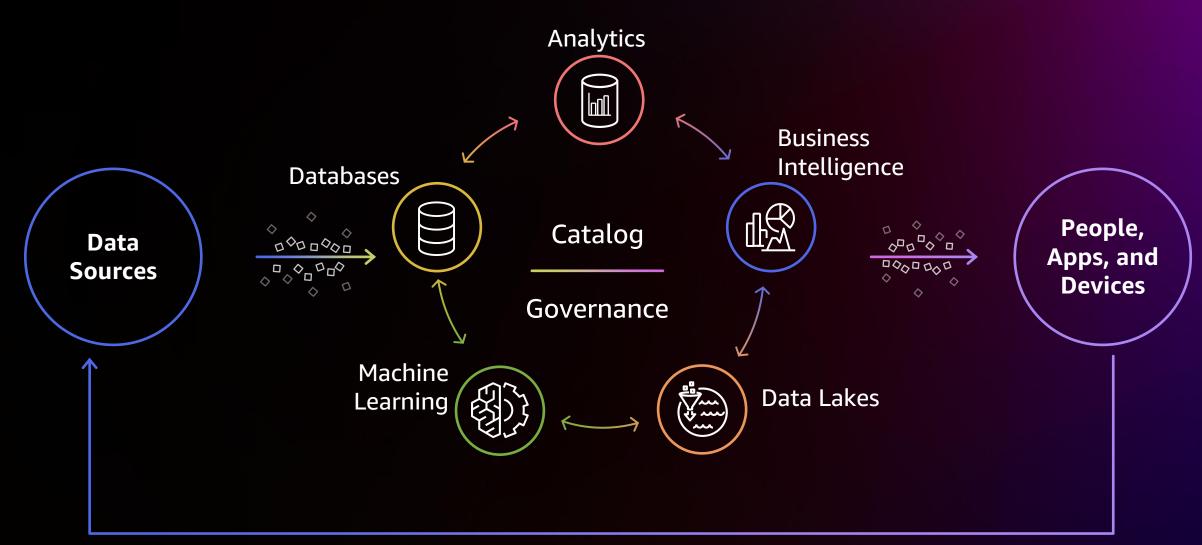
**Machine learning integration** 

Unified data access, security and governance

Insights for everyone



#### Modern data architecture



## Warner Bros. Games scales data analytics

#### Challenge:

Measure the business and provide meaningful feedback without getting in the way of the creative process. The business isn't static. They have data velocity, volume, variety, and voracity. They need a scalable infrastructure, data federation and democracy, and a way to act on the data.

#### **Solution:**

A modern data architecture with Amazon Redshift, Amazon EMR, and AWS Glue.

#### **Result:**

One version of the data for all stakeholders to access with increased scalability, lowered overhead costs, and more compute and memory for the same cost.











#### Modern data architecture's five benefits

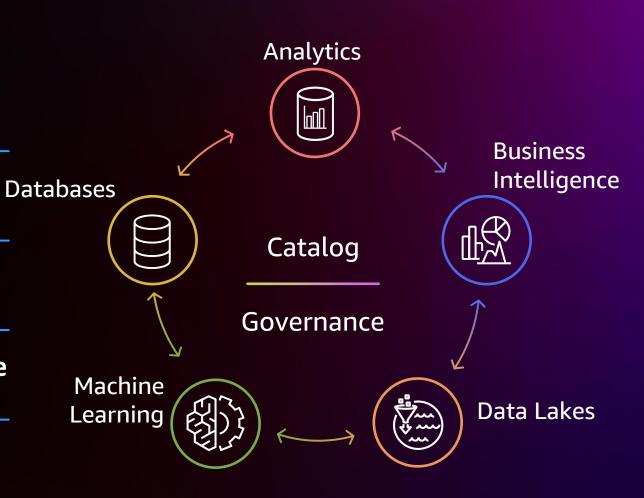
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## **Unified analytics**



Data access anywhere



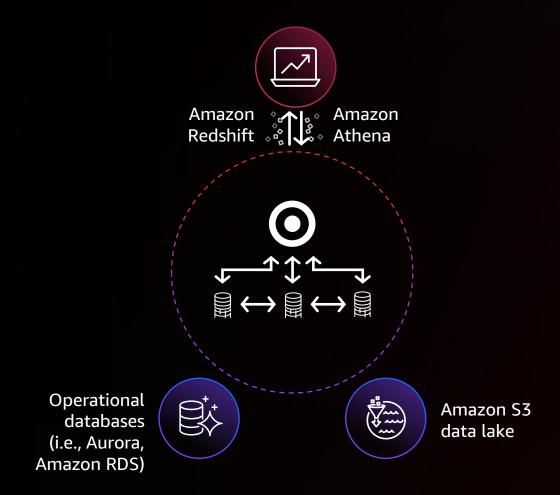
Bringing your data in



Right tools for analytics



## Federated query in Amazon Redshift and Amazon Athena



**Integrate varied data stores** with data warehouse and Amazon S3 data lake

Analytics on combined data without data movement and ETL delays

**Flexible and easy** way to ingest data, avoiding complex ETL pipelines



## Amazon Aurora Zero-ETL to Amazon Redshift



Eliminates the need to build and maintain complex ETL pipelines



Run near-real-time analytics and machine learning using Amazon Redshift on petabytes of transactional data from Amazon Aurora



Derive insights using advanced analytics in Amazon Redshift from data consolidated from multiple Amazon Aurora database clusters





# Amazon Redshift integration for Apache Spark

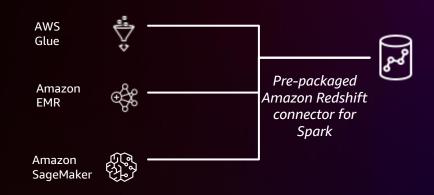
SIMPLIFY AND SPEED UP APACHE SPARK
APPLICATIONS ACCESSING AMAZON REDSHIFT
DATA FROM AWS ANALYTICS SERVICES

Author Apache Spark applications using Java, Python, Scala, with access to rich, curated data in your data warehouse

No manual setup and maintenance of uncertified versions of Spark-Amazon Redshift open-source connectors

Advanced pushdown optimizations in the Apache Spark-Amazon Redshift connector accelerate 3 TB out-of-the-box TPC-DS queries by 10x

Improved security with IAM-based credentials







#### **Interactive query**

Amazon Athena



#### Big data processing

Amazon EMR



#### **Operational and log analytics**

Amazon OpenSearch Service

# Broadest and most cost-effective set of analytics services



#### Real-time analytics

Amazon Kinesis and Amazon MSK



#### **Business intelligence**

Amazon QuickSight



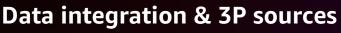
#### **Data warehouse**

Amazon Redshift



#### Governance & data lakes

Amazon S3, AWS Lake Formation, AWS Glue Data Catalog



AWS Glue, ADX, and Amazon AppFlow



#### Modern data architecture's five benefits

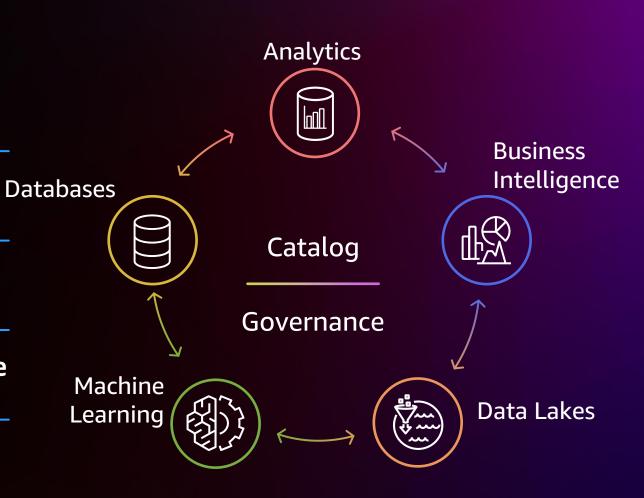
**Unified analytics** 

Highest performance at the lowest cost

**Machine learning integration** 

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**Insights for everyone** 



## Highest performance at the lowest cost



Scale linearly with predictable high performance



Maximize your cost savings

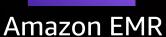


Self-learning, self-tuning system to enhance performance



## Price performance innovations in 2022







Amazon Athena



**AWS Glue** 



Amazon
OpenSearch Service



Amazon Redshift

**EMR Serverless GA** 

11-16% performance improvement with Graviton2 at 20%+ reduced cost

68% performance increase for Spark

19% performance boost on Graviton3

Applications start up in under a second

**Auto Scaling** 

Flex Jobs

2.4x performance increase for Spark

40% query boost on Graviton2

38% indexing boost on Graviton2

Up to 5x better price performance vs. other cloud data warehouses

Up to 7x better price performance vs. other cloud data warehouses on high concurrency

Low latency workloads like dashboarding applications



### **Amazon Redshift performance improvements**

CONTINUOUS OUT-OF-THE-BOX IMPROVEMENTS FOR BETTER PRICE PERFORMANCE AT ANY SCALE

#### Compute

System

**Autonomics** 

Vectorized scans for Amazon Redshift tables

String-encoding for in-memory perf

Performance mode

Write/Commit performance

CaaS cache pre-warming

Auto WLM enhancements

**Snapshot isolation** 

CaaS region expansion

ATO enhancements

Concurrency scaling writes (GA)

Incremental updates of MVs on datashares

Advisor enhancements



## Differentiated performance

ON SPARK, PRESTO, AND HIVE

3.9x

faster than standard Apache Spark 3.0 in TPC-DS 3TB benchmark 4.2x

faster than standard OSS Trino 388 in TPC-DS 3TB benchmarks 11-16%

performance improvement with Graviton2 at 20%+ reduced cost 100%

open-source API compliant 30%

Better priceperformance with Graviton2

### **AWS Glue cost optimization**

AWS GLUE JOB RUNS AT LOWER COST

#### **Auto scaling**

Automatically resize compute for lower cost



Reduce cost by 20-40%

Simplify capacity and performance planning

#### Flex

spare capacity execution



Up to 34% cost savings

Cost effective for one-time dataload workloads



#### Modern data architecture's five benefits

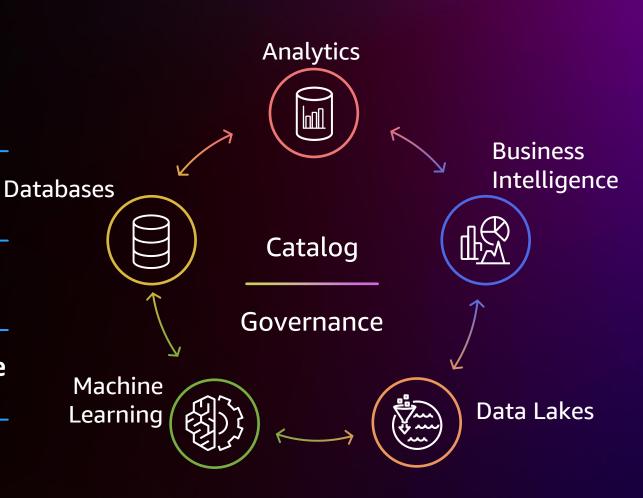
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# Connecting data services and ML to drive more value







Data warehouses and data lakes





Business intelligence tools

AMAZON AURORA ML



AMAZON NEPTUNE ML AMAZON REDSHIFT ML



AMAZON ATHENA ML



AMAZON QUICKSIGHT Q





#### **Amazon Redshift ML**

EASILY CREATE AND TRAIN ML MODELS USING SQL QUERIES WITH AMAZON SAGEMAKER

80+ billion

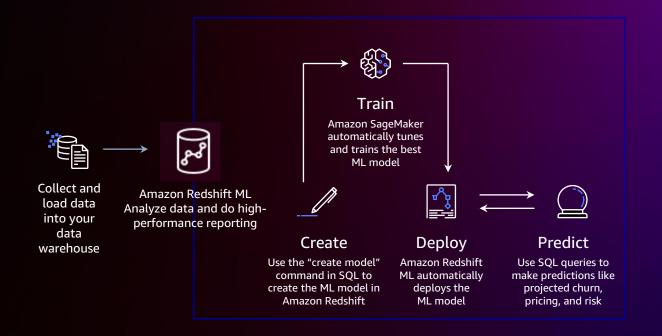
predictions per week

Train and create ML models using SQL

Automatic pre-processing, creation, training, deployment, and inferencing of models

SageMaker models for in-database or remote inference

Supervised and unsupervised trainings

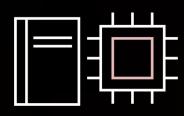






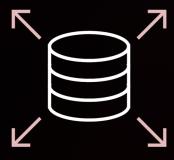
#### Amazon SageMaker Studio Universal Notebooks

PERFORM DATA ENGINEERING, ANALYTICS AND ML IN ONE NOTEBOOK



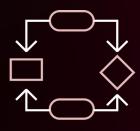
Built-in data and analytics integration

Connect with Amazon EMR, AWS Glue and data lakes on Amazon S3



Interactive data preparation

Interactively query, analyze and transform wide range of data



Inline debugging and monitoring

Visually debug and monitor Spark jobs inline in same notebook



**Build ML workflows** 

Build end to end ML workflows without leaving the notebook



#### Modern data architecture's five benefits

**Unified analytics** 

Highest performance at the lowest cost

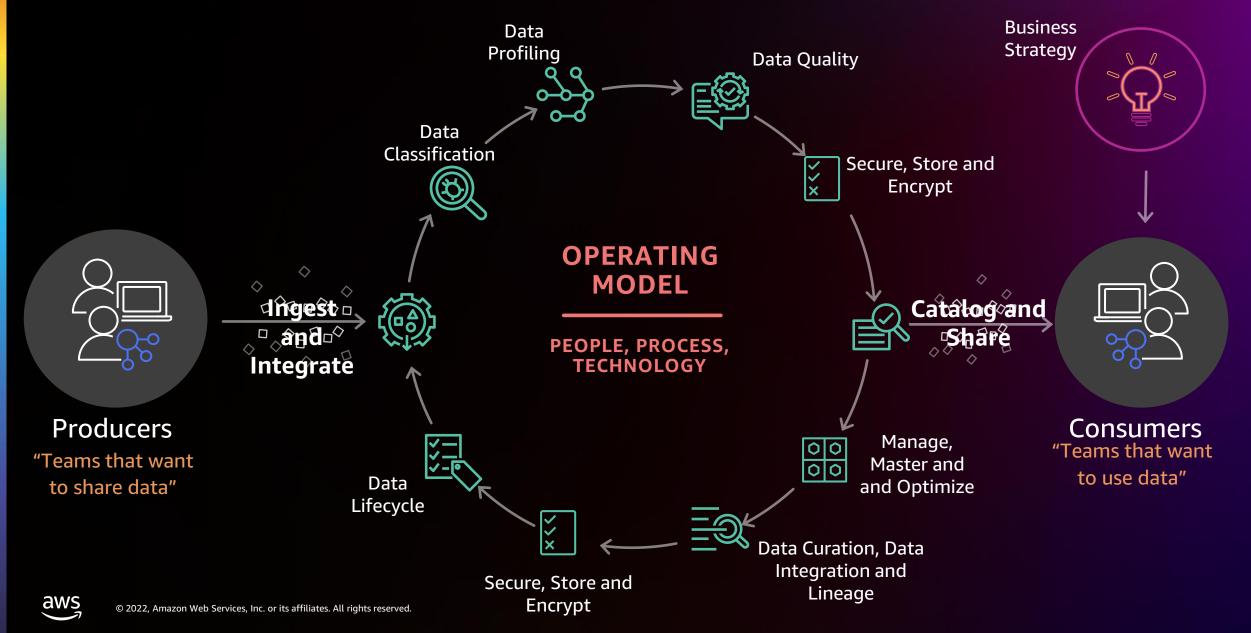
**Machine learning integration** 

Unified data access, security and governance

**Insights for everyone** 

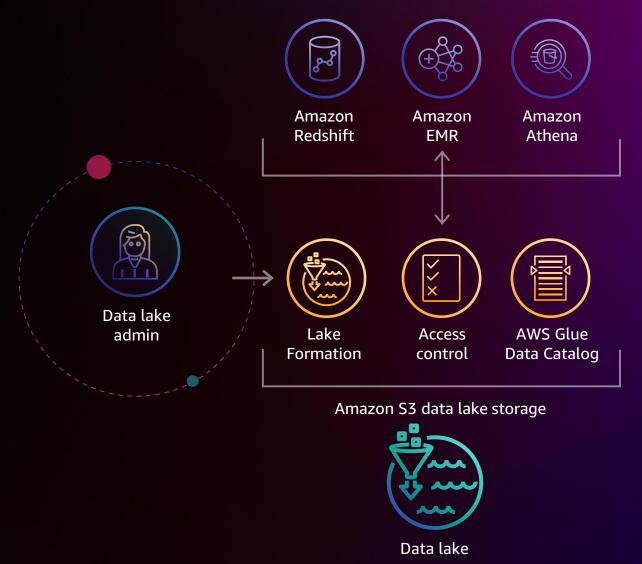


#### **Data Governance starts with business**



## **AWS Lake Formation unifies data governance**

Simplify security management with Lake Formation





## Amazon DataZone

UNLOCK DATA ACCESS FOR ALL USERS WITH TRUSTED AUTONOMY



Catalog your data with business context



Manage organization-wide governance in one place



Simplify access to analytics for everyone in your organization



Work with data to solve specific business use cases



#### Core components of Amazon DataZone



Data producers



Bring data from different sources, and across accounts/Regions

#### **Amazon DataZone**

Data portal

**APIs** 

#### **Organizational domains**

Business data catalog

Data projects

Governance and access control



Data consumers

Simplify access, collaboration, and consumption using different tools



#### Modern data architecture's five benefits

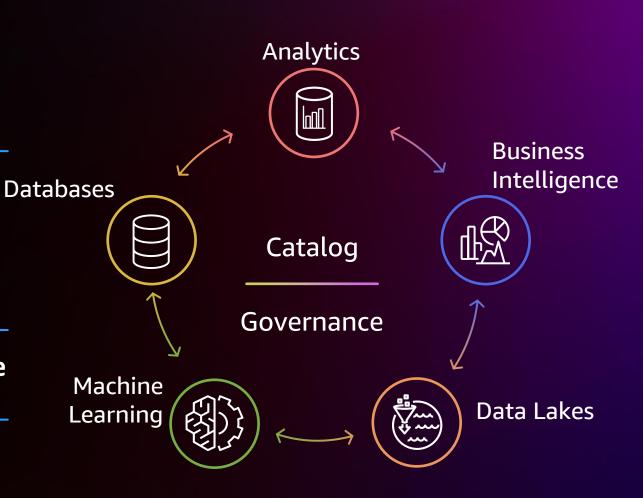
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## Insights for everyone



Focus on data without managing infrastructure





Choose your tools based on your skillset



Faster time to market

**Zero infrastructure management** 

Pay for what you use

YOU

focus on insights

Serverless is a key for your data infrastructure
The benefits of serverless

Automatic scaling

Compute provisioning

Automated patching

Automatic failover

Advanced monitoring

Backup and recovery

Routine maintenance

Security and industry compliance

aws

takes care of the rest



## A full stack of serverless options for data analytics in the cloud

Data integration, ETL, and Catalog







## Amazon OpenSearch Serverless

Amazon OpenSearch Service securely unlocks real-time search, monitoring, and analysis of operational data



#### **Easy to administer**

No sizing, scaling, and tuning of clusters, and no shard and index lifecycle management



#### **Fast**

Automatically scale resources to maintain consistently fast data ingestion rates and query response times



#### **Ecosystem**

Get started in seconds using the same OpenSearch Service clients, pipelines, and APIs



#### **Cost-effective**

Pay only for the resources consumed





Quickly access and prepare data for Machine Learning

# Amazon SageMaker Canvas

Build ML models and generate accurate predictions — no code required



Built-in AutoML to build models and generate accurate predictions



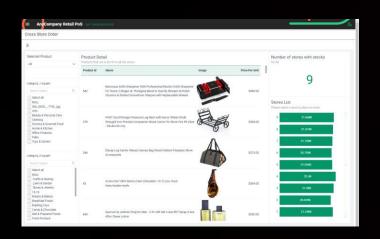
Share ML models and collaborate with data science teams



Usage-based pricing to avoid licensing fees and reduce TCO



## Insights through Amazon QuickSight



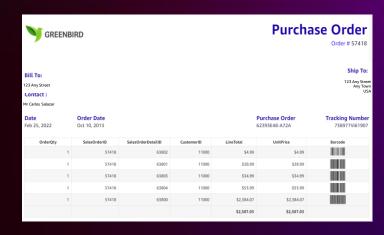
### Embedded insights

Enhance customer-facing products and monetize data assets



# Interactive dashboards, meaningful insights

Dashboards, visualizations, and ad-hoc analysis primarily for internal audiences



### **Enterprise reporting**

Static, highly formatted, email-based reporting distributed to large internal or external audiences



# Amazon QuickSight Q

Ask natural language questions about your data and get answers in seconds



Type your question and get instant answer



# Modern Data Architecture is making it easier to unlock the value of data across the end-to-end data journey



Scalable

Performance at scale



Unified

Connect to all your data



Comprehensive

Tools for all your workloads



Governed

End-to-end governance



### Agenda

Modern data architecture on AWS

End-to-end data life cycle on the modern data architecture

Data governance and data mesh in action

Journey towards modern data architecture



### End to end data life cycle

Ingest

Store

Transform & Catalog

Analyze & Visualize

**Predict** 

Share

From any source including onpremises, realtime Any amount of data at Exabyte scale

Data preparation, transformation, and providing seamless data access End-to-end analytics & visualization for any use case Most comprehensive set of ML and Al Services

With just a few lines of code

**Unified Security, Governance, and Data Access** 



### Typical architecture

### #1: Ingest

On-premises

**Databases** 

Ingesting data from any source including on-premise sources and data that is generated in real-time.

Streams

Logs



### #3: Transform & Catalog

Making it easy to access their data and keeping their data in sync regardless of where it lives





on dashboards

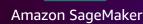
#4: Analyze & Visualize

Analyzing data using any of ad hoc queries, distributed frameworks and

search engines, and visualize the data

Amazon Redshift







Amazon Athena

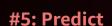


Amazon QuickSight

#2: Store

Storing both transactional data in databases and analytical data in data warehouses and data lakes at any scale.

Amazon S3



Adding ML-based intelligence to applications without needing ML skills

**AWS Glue** 

**Data Catalog** 

### #6: Share

Sharing new insights to take intelligent, data-driven actions



### Ingest

### #1: Ingest

Ingesting data from any source including on-premise sources and data that is generated in real-time.



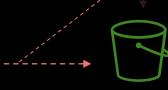


On-premises





**Databases** Logs



Amazon S3

databases and analytical data in datamazon AppFlow



AWS Transfer Family AWS DataSync



**AWS Database Migration** Service (AWS DMS)



**Amazon Kinesis Data Streams** 



**AWS Glue** 

Amazon Kinesis

Data Firehose



**Amazon Managed Streaming** for Apache Kafka (Amazon MSK)



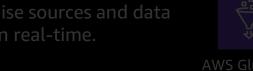
**AWS Data Exchange** 



### Store











Amazon Redshift













### #2: Store

Storing both transactional data in databases and analytical data in data warehouses and data lakes at any scale.

Amazon S3



### Amazon S3 for data lakes

AN OBJECT STORAGE SERVICE OFFERING INDUSTRY-LEADING SCALABILITY, DATA AVAILABILITY, SECURITY, AND PERFORMANCE



**Cold storage and archive** capabilities



# Transform & Catalog



### #3: Transform & Catalog

Making it easy to access their data and keeping their data in sync regardless of where it lives























## Analyze & Visualize







on dashboards

#4: Analyze & Visualize

Analyzing data using any of ad hoc queries, distributed frameworks and search engines, and visualize the data

Amazon Redshift



Amazon Athena



Amazon QuickSight

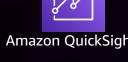
Amazon EMR











Amazon SageMaker



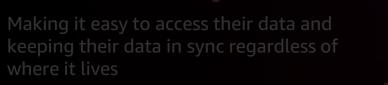
### **Predict and share**

### #1: Ingest

Ingesting data from any source including on-premise sources and data that is generated in real-time.



### #3: Transform & Catalog





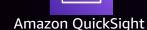
Amazon Redshift



Amazon EMR

Amazon SageMaker





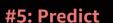




Amazon S3

### #2: Store

Storing both transactional data in databases and analytical data in data warehouses and data lakes at any scale.



Adding ML-based intelligence to applications without needing ML skills

### #6: Share

Sharing new insights to take intelligent, data-driven actions



### **Unified Security, Governance, and Data Access**

Ingest

Store

Transform & Catalog

Analyze & Visualize

**Predict** 

Share

From any source including onpremises, realtime Any amount of data at Exabyte scale

Data preparation, transformation, and providing seamless data access End-to-end analytics & visualization for any use case Comprehensive set of ML and Al Services

With just a few lines of code

**Unified Security, Governance, and Data Access** 



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Modern data architecture on AWS

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# Challenges securing and sharing data

### Challenge #2: Data sharing

Sharing across accounts and organizations is cumbersome

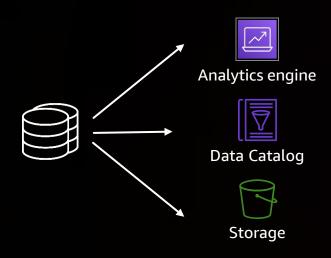


Managing fine grained permissions at

scale is difficult and error-prone

# Why is managing data lake permissions hard?

Unifying permissions across the data lake stack



Split storage, metadata, and compute Each system has different permissions Syncing permissions is error-prone Enforcing fine-grained permissions to restrict access

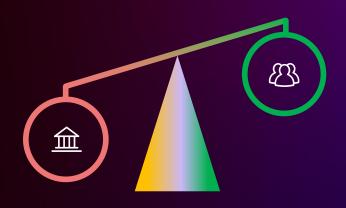


Data lakes contain a lot of data

Users should only access portions

Thousands of resources and tens of thousands of users

Ensuring that data access complies with regulations



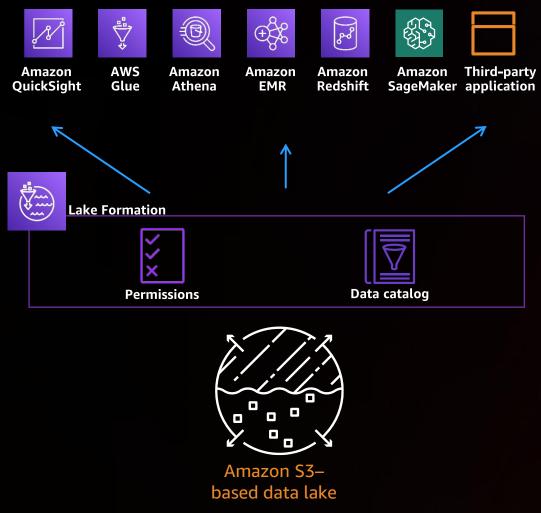
Democratize data access

Regulations and governance

Monitor and audit data access



# Lake Formation permissions model



DB-style fine-grained permissions on resources

Scale permissions management Lake Formation Tag-Based Access Control (LF-TBAC)

Unified Amazon S3 permissions

Integrated with services and tools

Easy to audit permissions and access

## **Challenge: Data sharing**



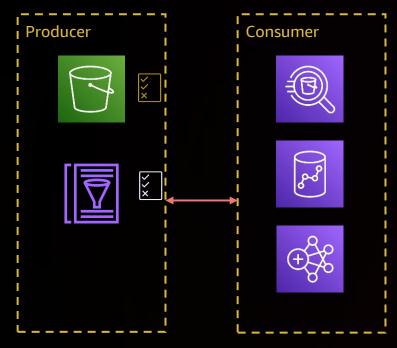
Challenge #2: Data sharing

Sharing across accounts and organizations is cumbersome



# Why is sharing data across accounts hard?

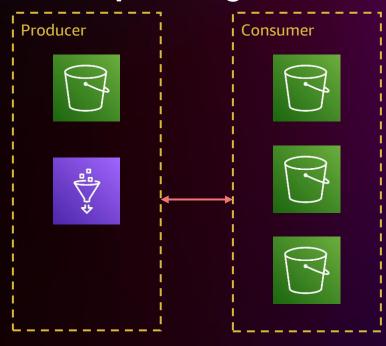
### To share data



Manges multiple Amazon S3 and IAM policies

Lacks discoverability
Policy size limits (coarse grained)

### **Duplicating data**



ETL pipelines

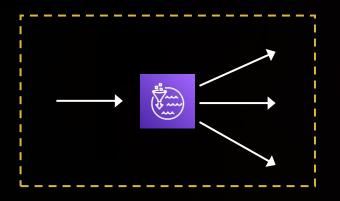
Multiple redacted copies

Expensive, brittle, and error-prone

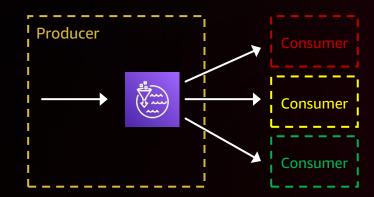


# Common data sharing patterns

Single account



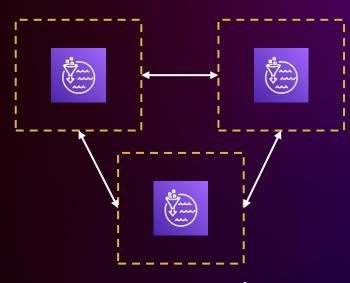
Centralized solution (Hub and spoke)



Hub and spoke multi-account

**Cross-organization** 

Data mesh



Data mesh central governance

**Organizational autonomy** 

Centralized single account

Simple to get started



# Centralized solution challenges

Central data team becomes the bottleneck

Fail to scale data consumers

Unable to discover and consume the data

No central Data Governance

Lack of data auditability





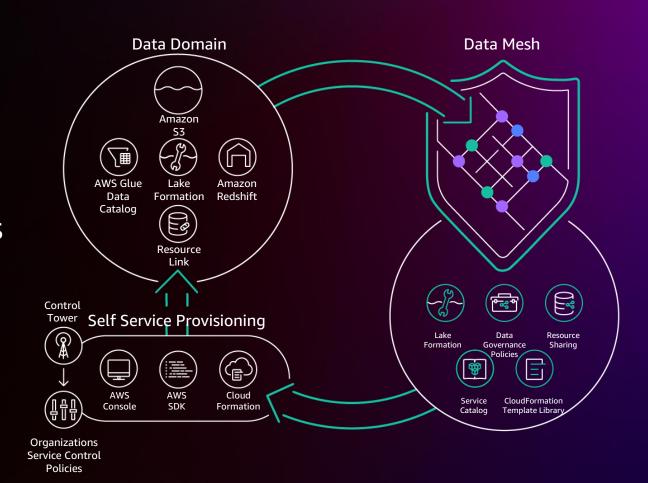
### Why data mesh?

Treats existing data platforms as **independent** domains

Improves data governance by pushing access policy to data domains

Establishes a central mechanism for data discovery

Provides self-service data sharing features



# Data mesh – Four core principles



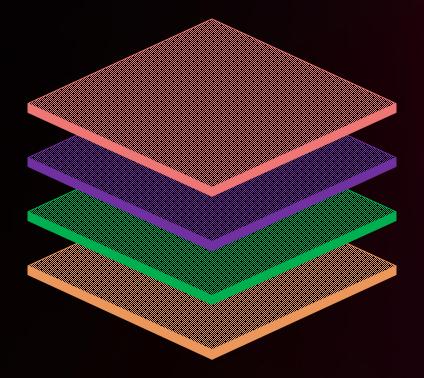
**Data Owner** 

Data Domain Ownership



**Data Engineer** 

Data as a Product





**Data Steward** 

Federated Computational Governance



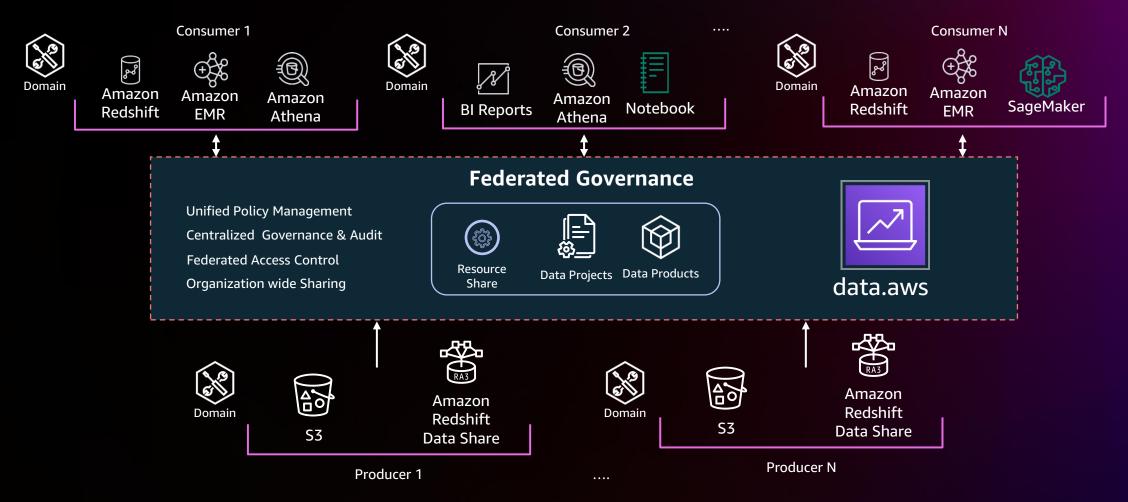
**Data Consumer** 

Self-Serve Sharing

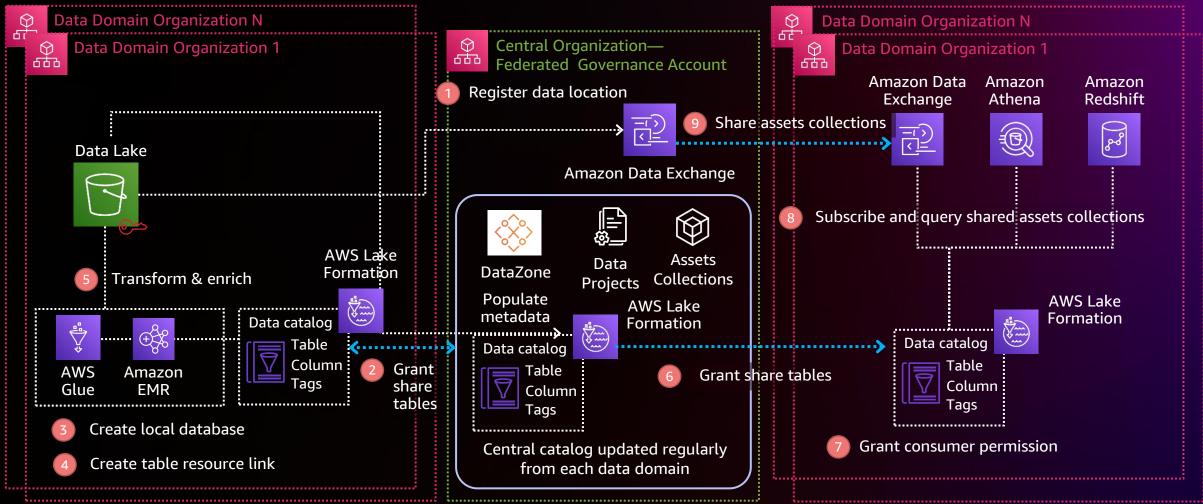


### Data mesh architecture

DECENTRALIZED, LIGHTWEIGHT FEDERATED GOVERNANCE ACROSS DOMAIN-ORIENTED DATA SYSTEMS TO DRIVE GOVERNED SHARING



# Data mesh architecture pattern: data lake assets collections sharing



### Security, Governance and Data Access with Data Mesh

Data mesh unifies Security, Governance, and Data Access of modern data architecture





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Start small



Scale fast



Think big





Start from **small subset** in your data platform

Start small





Scale fast

Scale **fast** to achieve your business goal based on data





Think big

Expand your data platform to support more workload and advanced goals



### Conclusion

**Unified analytics** 

Highest performance at the lowest cost

**Machine learning integration** 

Unified data access, security and governance

**Insights for everyone** 



### Learn more at re:Invent 2022

SESSIONS RELATED TO MODERN DATA ARCHITECTURE

Swami Sivasubramanian, Vice President of AWS Data and Machine Learning – Keynote Wednesday November 30 | 8:30 AM – 10:30 AM PST | The Venetian

ANT203-L (LVL 200) Unlock the value of your data with AWS analytics Wednesday November 30 | 2:30 PM - 3:30 PM PST | The Venetian

ANT223 (LVL 200) Simplify and accelerate data integration & ETL modernization with AWS Glue Wednesday November 30 | 12:15 PM – 1:15 PM PST | MGM Chairmans 368

ANT310 (LVL 300) Build a data mesh with AWS Lake Formation and AWS Glue Wednesday November 30 | 05:30 PM - 07:30 PM PST | MGM Grand

ANT344 (LVL 300) Democratize data with governance – Connect people, data, and tools with Amazon DataZone

Wednesday November 30 | 02:30 PM - 03:30 PM PST | MGM Grand



# Thank you!

Santosh Chandrachood sanchas@amazon.com



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