



SUMMIT  
ONLINE

# AWS를 통한 데이터 분석 및 처리의 새로운 혁신 기법

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사업개발 담당  
AWS Korea

# Agenda

인사이트 획득을 위한 데이터

데이터 레이크 구축

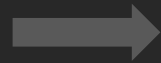
데이터 분석을 통한 인사이트 획득

# 인사이트 획득을 위한 데이터

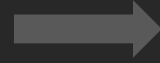
# 인사이트 획득을 위한 이상적 모습



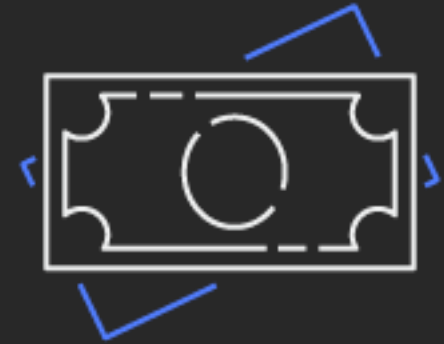
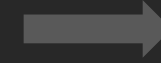
CSV



Dataset

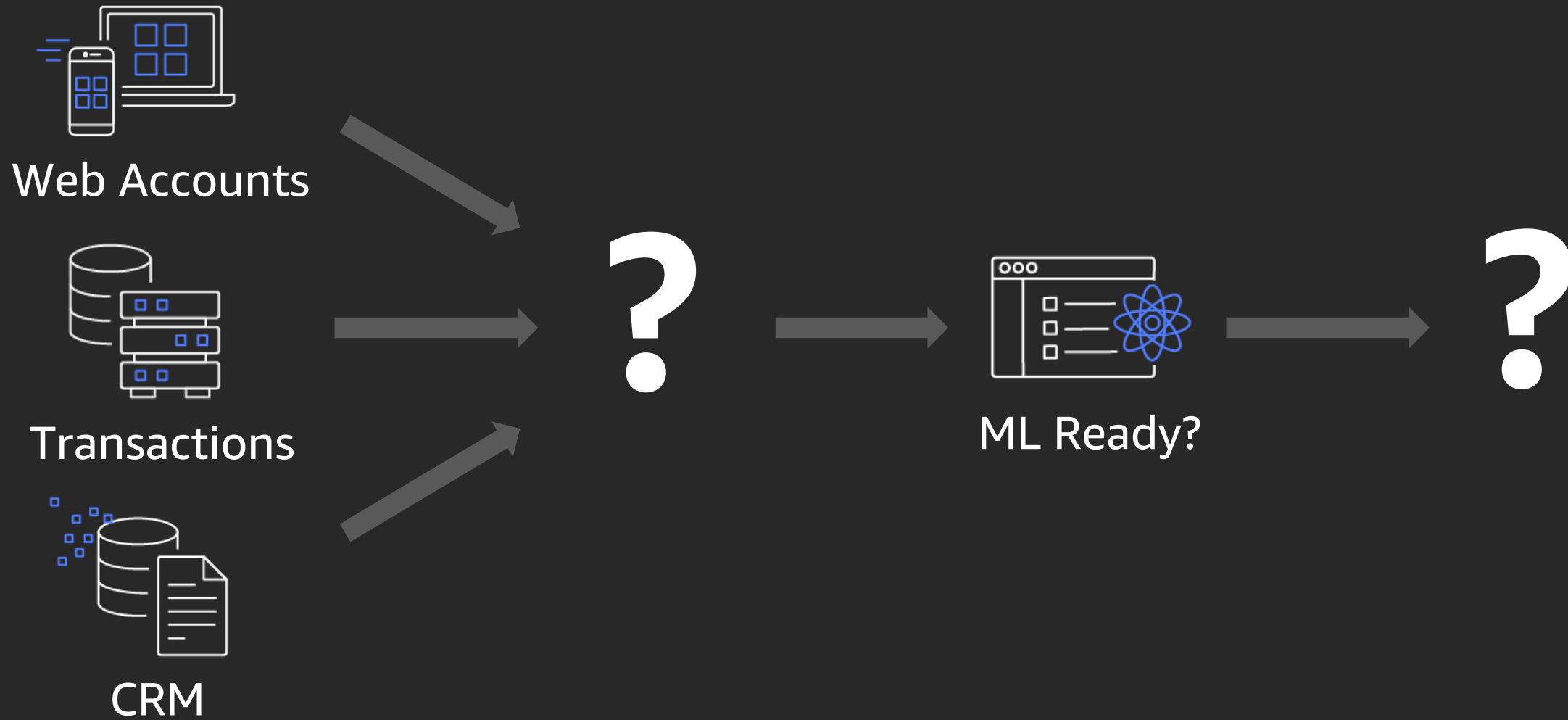


Model



Profit !

# 현실의 어려움



# 현실의 장애물들

데이터 구조	<ul style="list-style-type: none"><li>• 여러 시스템에 산재</li><li>• 분석에 부적합한 형태</li><li>• 레이블이 없는 데이터</li></ul>
데이터 가치	<ul style="list-style-type: none"><li>• 포맷: 철자, 단위</li><li>• 결측치</li><li>• 편향된 데이터</li><li>• 무상관성 데이터</li></ul>
데이터 중요도	<ul style="list-style-type: none"><li>• 비선호 데이터</li><li>• 높은 수집비용</li><li>• 본연적 상관성 데이터</li></ul>

# 현실의 장애물들

데이터 구조	<ul style="list-style-type: none"><li>• 여러 시스템에 산재</li><li>• 분석에 부적합한 형태</li><li>• 레이블이 없는 데이터</li></ul>	Data Transformation
데이터 가치	<ul style="list-style-type: none"><li>• 포맷: 철자, 단위</li><li>• 결측치</li><li>• 편향된 데이터</li><li>• 무상관성 데이터</li></ul>	Feature Engineering
데이터 중요도	<ul style="list-style-type: none"><li>• 비선호 데이터</li><li>• 높은 수집비용</li><li>• 본연적 상관성 데이터</li></ul>	Feature Selection



# 머신러닝: 분류

범주형

훈련


테스트


예측

# 머신러닝: 회귀

수치형

훈련


테스트


예측

# 머신러닝: 이상탐지

[illegible]

# 머신러닝: 군집분석

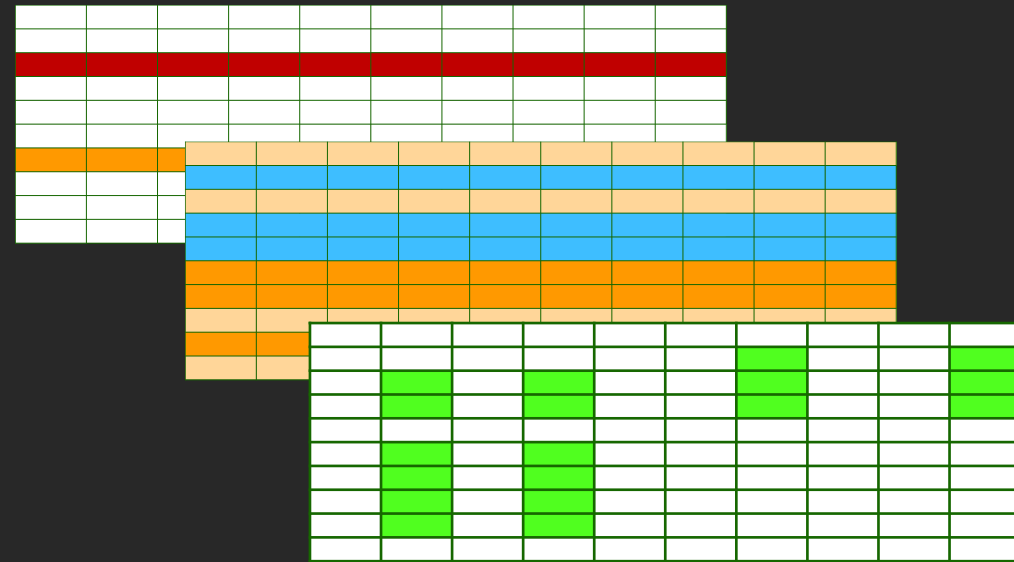
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# 머신러닝: 연관성 분석

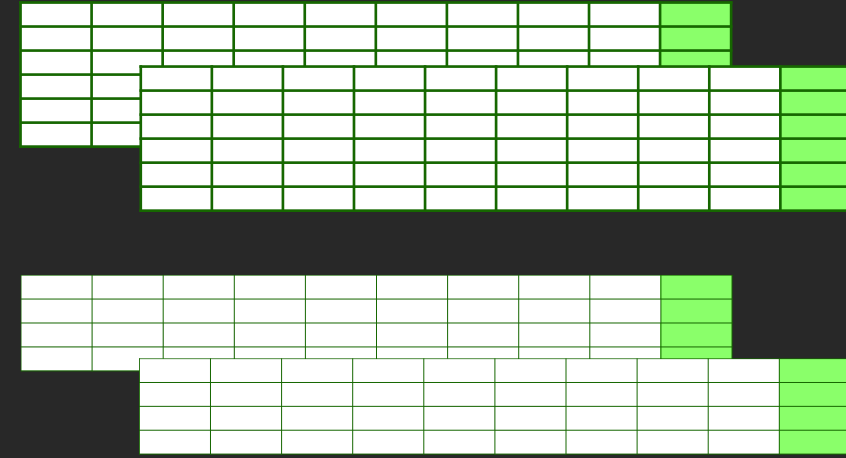
[illegible]



# 데이터 레이블링



# 레이블의 유무



# 데이터 레이블링

## 레이블 없는 데이터

Name	Month - 3	Month - 2	Month - 1
Joe Schmo	123.23	0	0
Jane Plain	0	0	0
Mary Happy	0	55.22	243.33
Tom Thumb	12.34	8.34	14.56

## 레이블 있는 데이터

Name	Month - 3	Month - 2	Month - 1	Default
Joe Schmo	123.23	0	0	FALSE
Jane Plain	0	0	0	TRUE
Mary Happy	0	55.22	243.33	FALSE
Tom Thumb	12.34	8.34	14.56	FALSE



# 데이터 레이블링

오리지널 데이터

Name	Date	Duration (s)	Genre	Plays
Highway star	1984-05-24	-	Rock	139
Blues alive	1990/03/01	281	Blues	239
Lonely planet	2002-11-19	5:32s	Techno	42
Dance, dance	02/23/1983	312	Disco	N/A
The wall	1943-01-20	218	Reagge	83
Offside down	1965-02-19	4 minutes	Techno	895
The alchemist	2001-11-21	418	Bluesss	178
Bring me down	18-10-98	328	Classic	21
The scarecrow	1994-10-12	269	Rock	734

정제된 데이터

Name	Date	Duration (s)	Genre	Plays
Highway star	1984-05-24		Rock	139
Blues alive	1990-03-01	281	Blues	239
Lonely planet	2002-11-19	332	Techno	42
Dance, dance	1983-02-23	312	Disco	
The wall	1943-01-20	218	Reagge	83
Offside down	1965-02-19	240	Techno	895
The alchemist	2001-11-21	418	Blues	178
Bring me down	1998-10-18	328	Classic	21
The scarecrow	1994-10-12	269	Rock	734



# 데이터 취합

오리지널 데이터

Content	Genre	Duration	Play Time	User	Device
Highway	Rock	190	2019-05-12	User001	TV
Blues alive	Blues	281	2019-05-14	User005	Tablet
Lonely planet	Tech	332	2019-05-14	User003	TV
Dance, dance	Disco	312	2019-05-14	User001	Tablet
The wall	Reaggae	218	2019-05-14	User002	Smartphone
Offside down	Tech	240	2019-05-14	User005	Tablet
The alchemist	Blues	418	2019-05-14	User003	TV
Bring me down	Class	328	2019-05-15	User001	Tablet
The one	Rock	269	2019-05-15	User003	Smartphone

취합된 데이터

User	Num.Playbacks	Total Time	Pref.Device
User001	3	830	Tablet
User002	1	218	Smartphone
User003	3	1019	TV
User004	2	521	Tablet

# 데이터 피벗

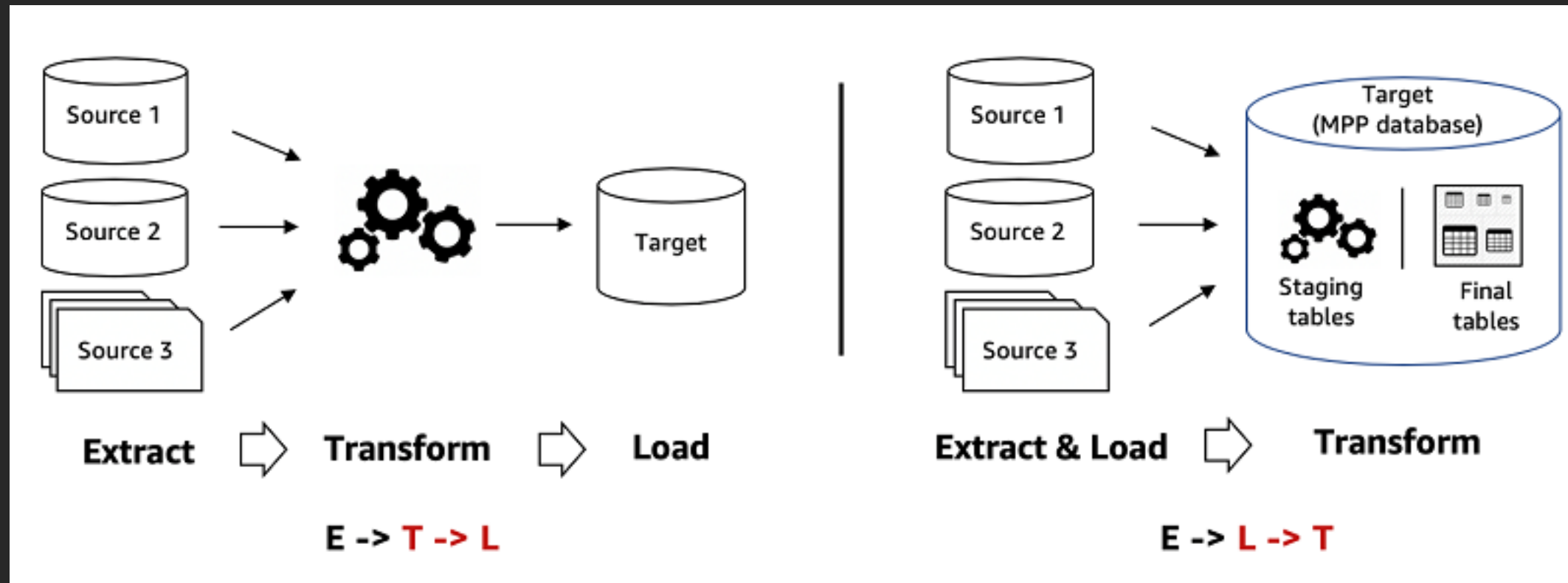
오리지널 데이터

Content	Genre	Duration	Play Time	User	Device
Highway	Rock	190	2019-05-12	User001	TV
Blues alive	Blues	281	2019-05-14	User005	Tablet
Lonely planet	Tech	332	2019-05-14	User003	TV
Dance, dance	Disco	312	2019-05-14	User001	Tablet
The wall	Reaggae	218	2019-05-14	User002	Smartphone
Offside down	Tech	240	2019-05-14	User005	Tablet
The alchemist	Blues	418	2019-05-14	User003	TV
Bring me down	Class	328	2019-05-15	User001	Tablet
The one	Rock	269	2019-05-15	User003	Smartphone

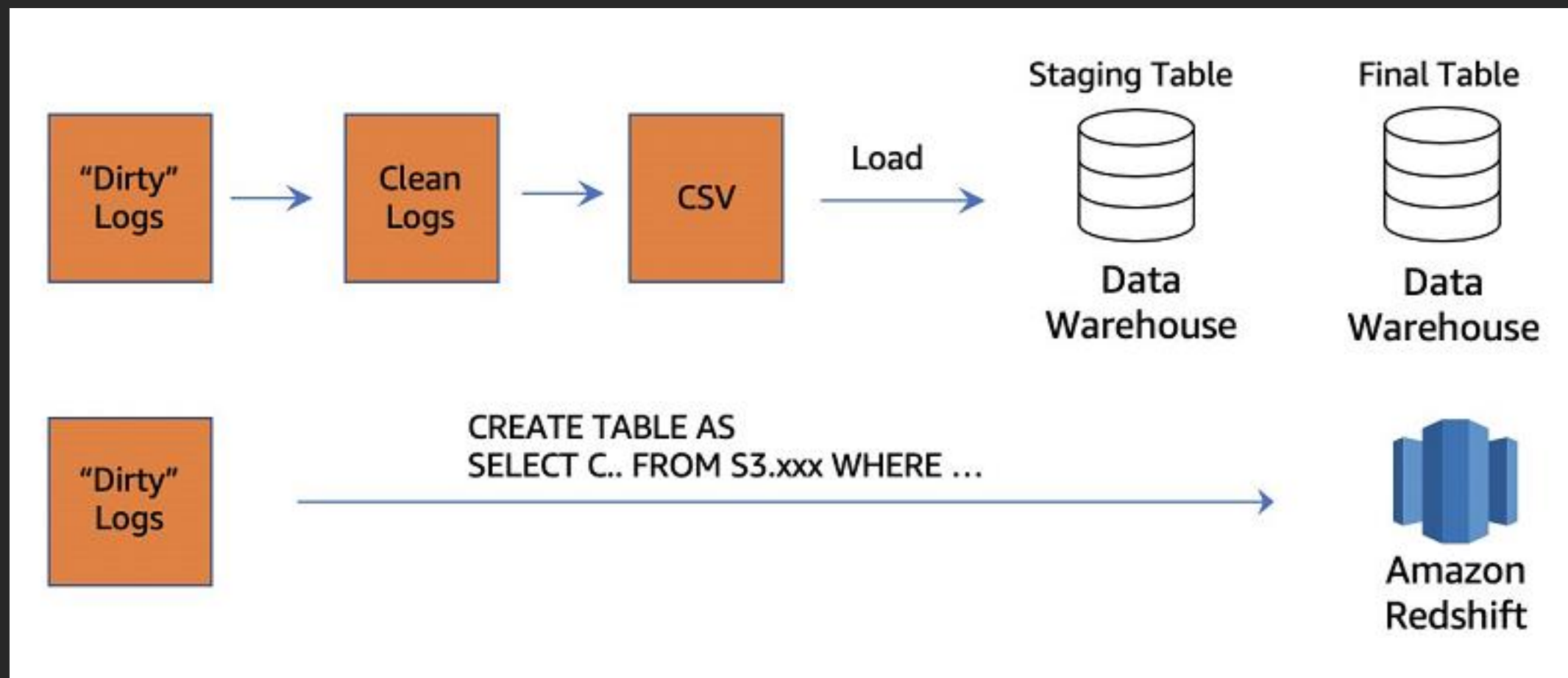
취합되고 피벗된 컬럼

User	Num.Playbacks	Total Time	Pref.Device	NP_TV	NP_Tablet	NP_Smartphone	TT_TV	TT_Tablet	TT_Smartphone
User001	3	830	Tablet	1	2	0	190	640	0
User002	1	218	Smartphone	0	0	1	0	0	218
User003	3	1019	TV	2	0	1	750	0	269
User004	2	521	Tablet	0	2	0	0	521	0

# ETL vs. ELT



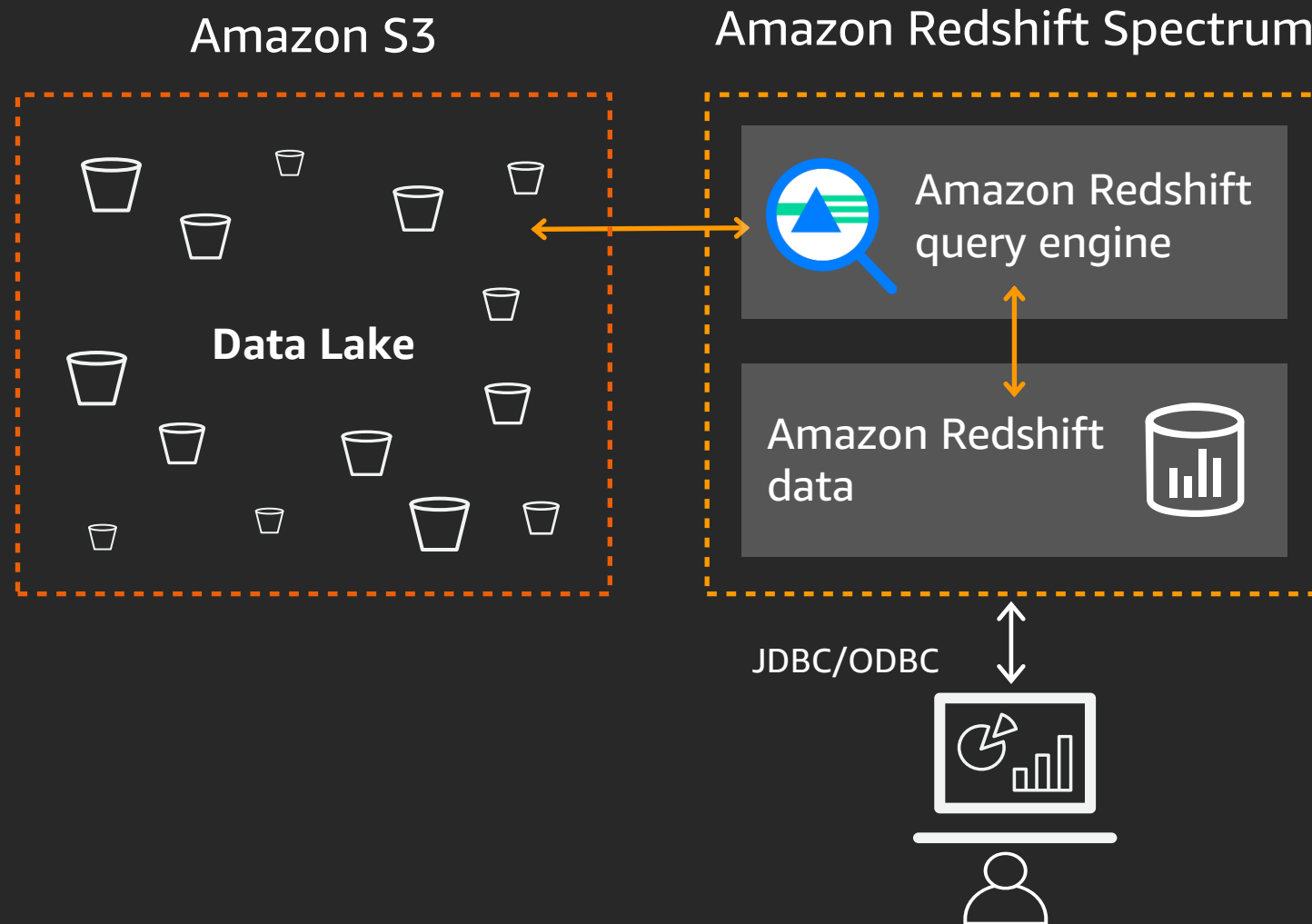
# ELT



# 데이터 스케일: 모든 데이터를 쿼리



Unified view: Local storage and Amazon S3 data lake



Directly query exabytes in Amazon S3

No data loading, eliminate ingestion time

Unified view of data across Amazon Redshift and Amazon S3

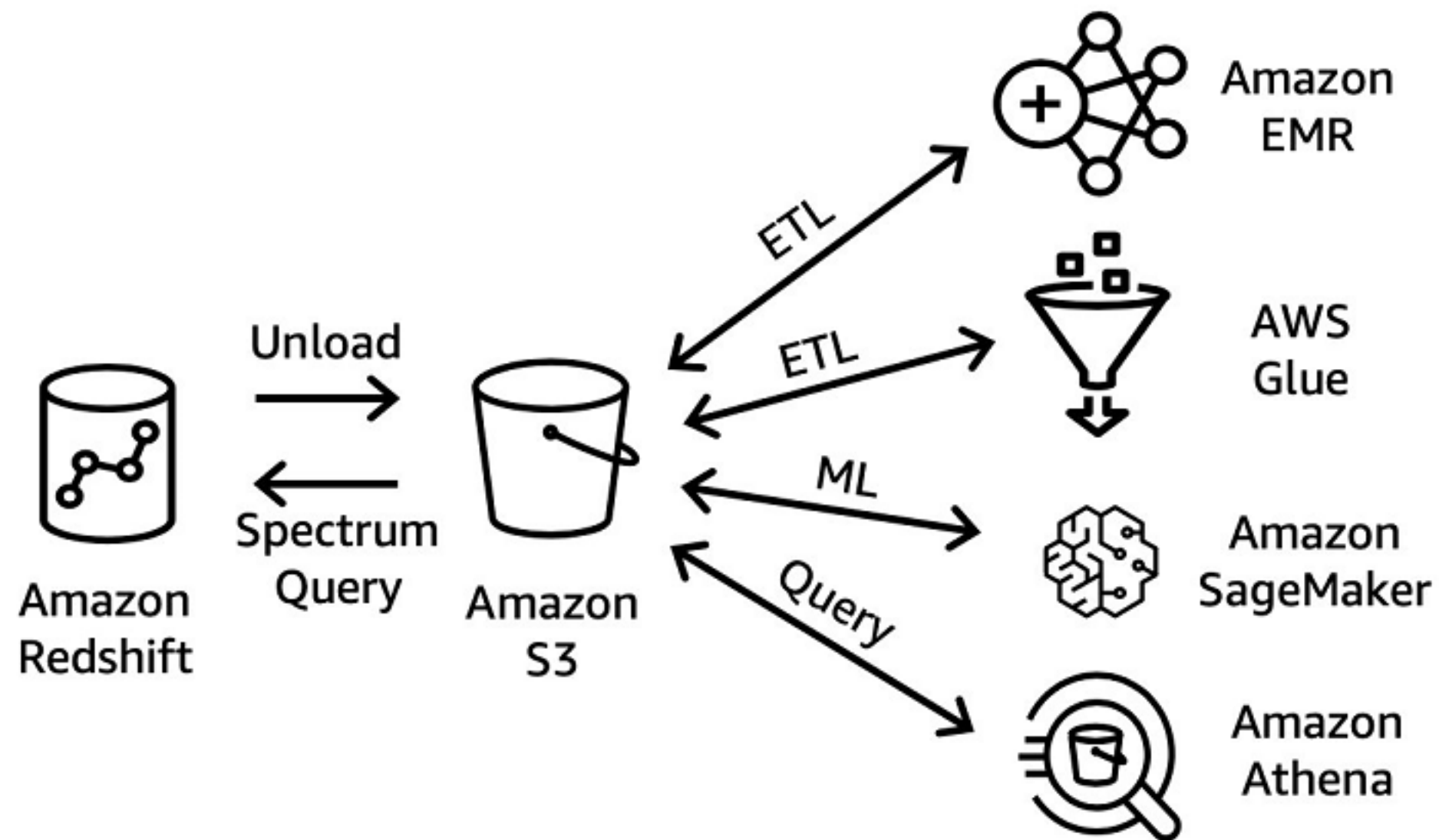
Scale compute and storage separately

No server to maintain for Amazon S3 query

Support for **Parquet, ORC, Avro, CSV, JSON, Grok**, and other open file formats

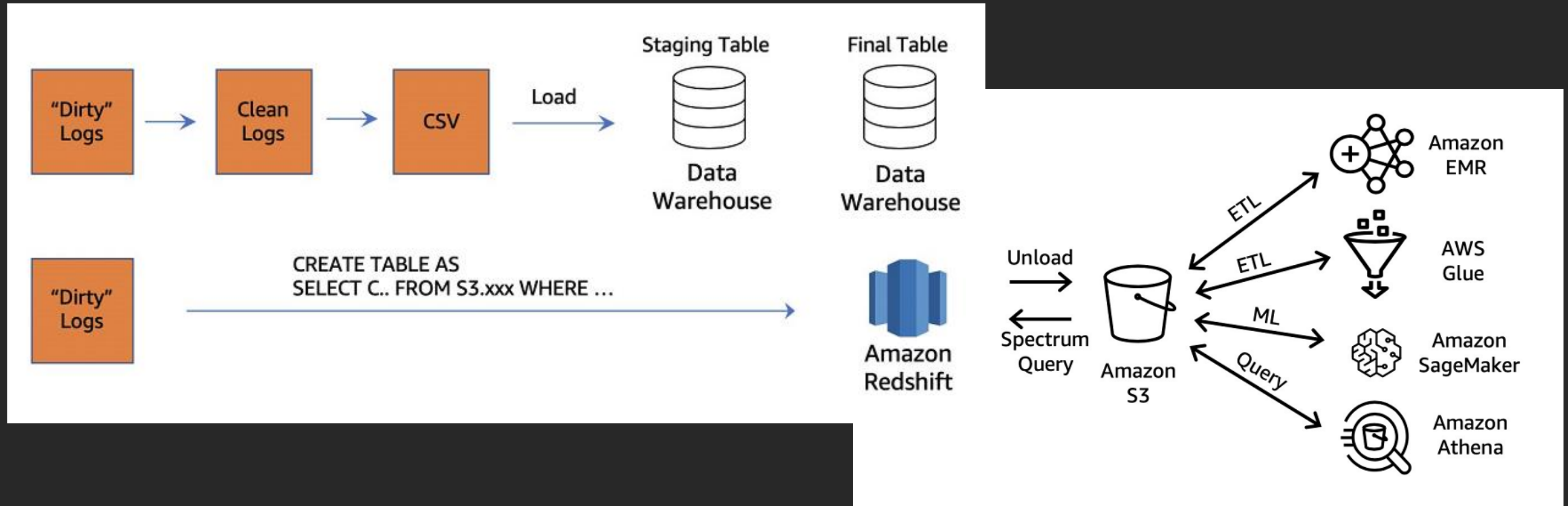
Pay only for the amount of data scanned

# ETL

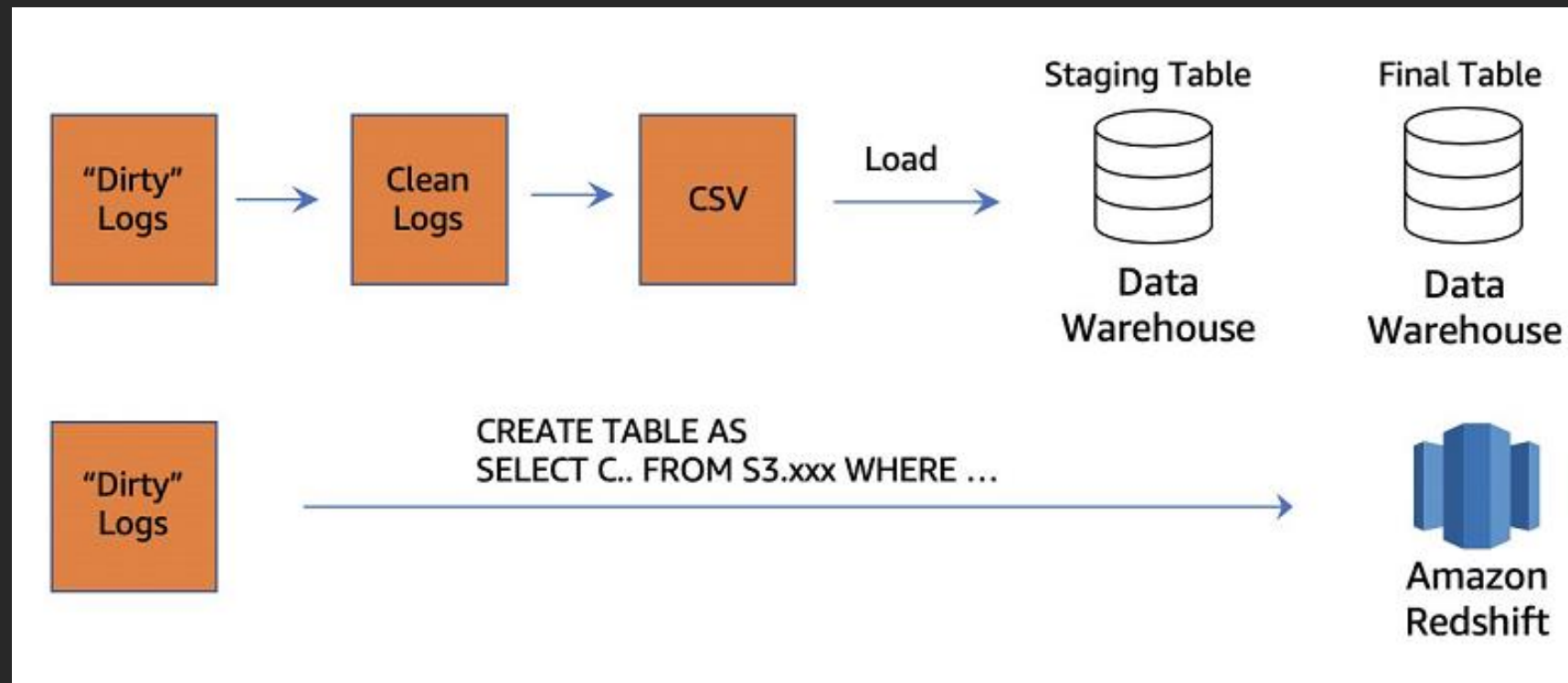




# ELT-ETL

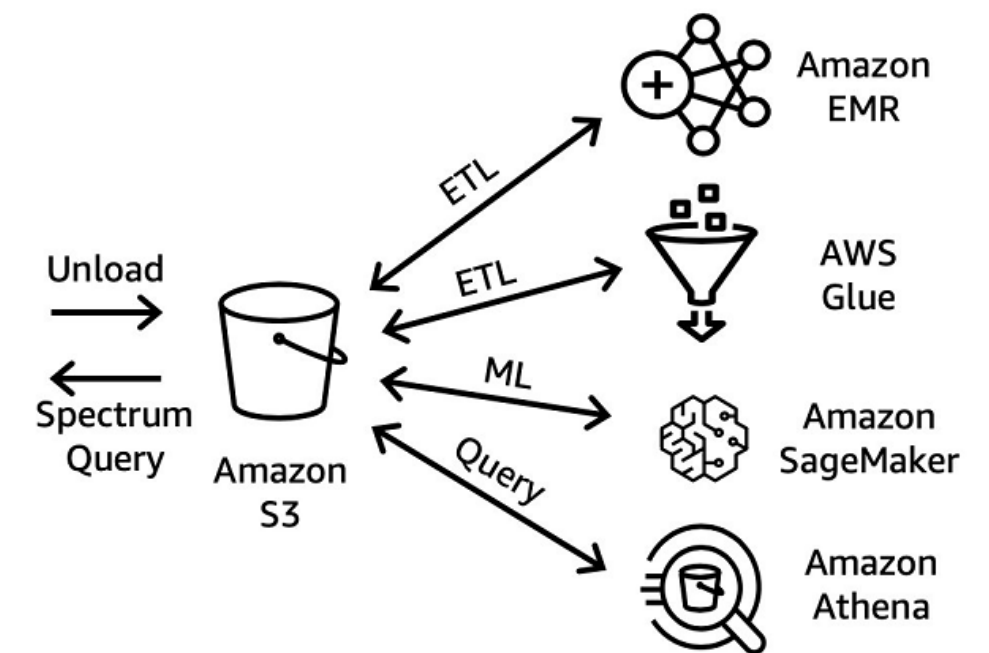


# ELT-ETL



데이터 레이크 구축

데이터를 통한 인사이트 획득



# 데이터 레이크 구축

# 데이터 레이크로 시작하는 인사이트 획득

## 데이터 분석을 통한 인사이트 획득



**Amazon Redshift**  
Data warehousing



**Amazon EMR**  
Hadoop + Spark



**Amazon Athena**  
Interactive analytics



**Amazon Kinesis**  
Real-time data analytics



**Amazon Elasticsearch Service**  
Operational Analytics

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## 데이터 레이크 구축



**Amazon  
S3/Glacier**

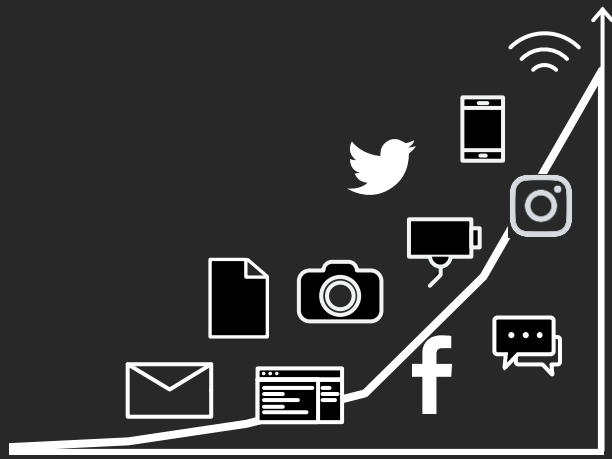


**AWS Lake  
Formation**



**AWS Glue**

# 고객들이 겪고 있는 새로운 현실



Explosion of data

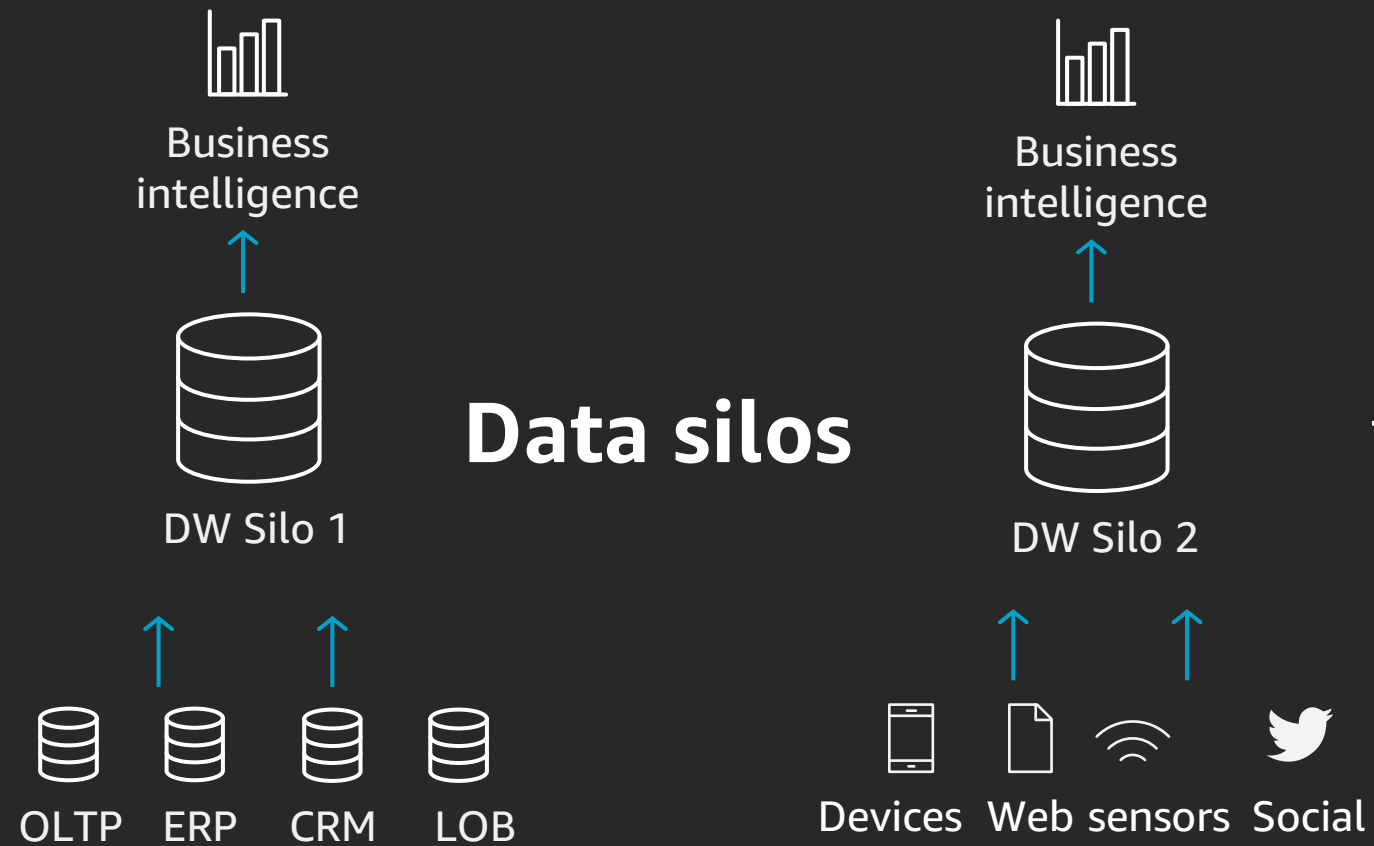


Explosion of personas

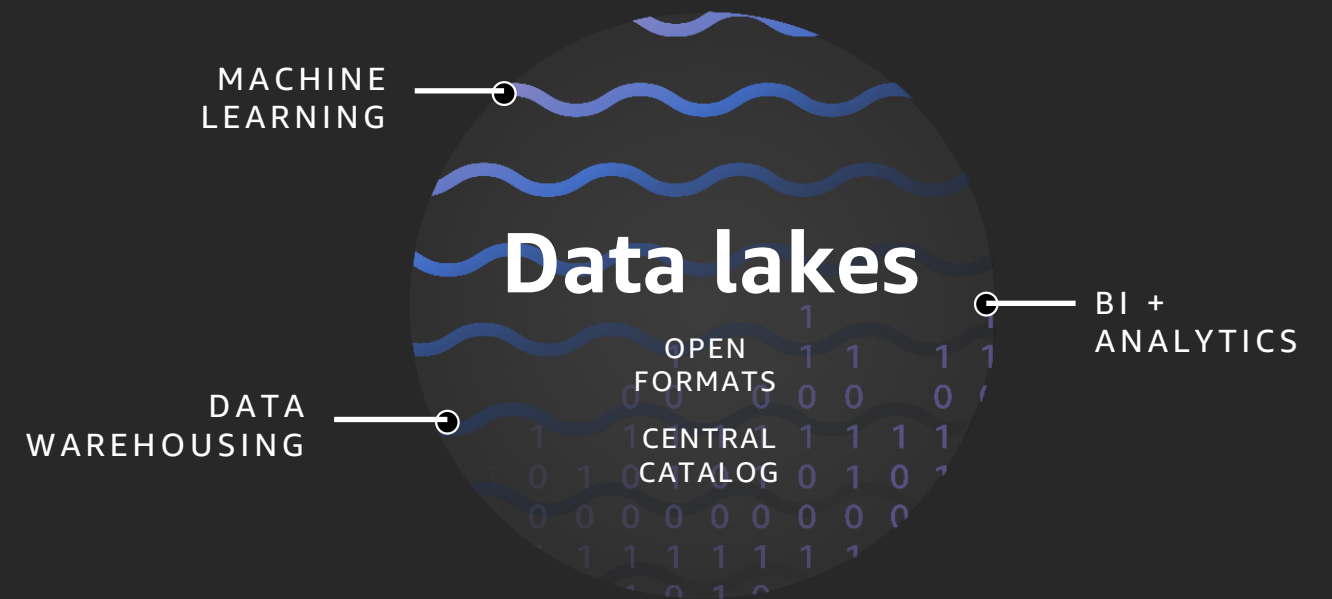


Demand for faster  
decision-making on  
real-time data

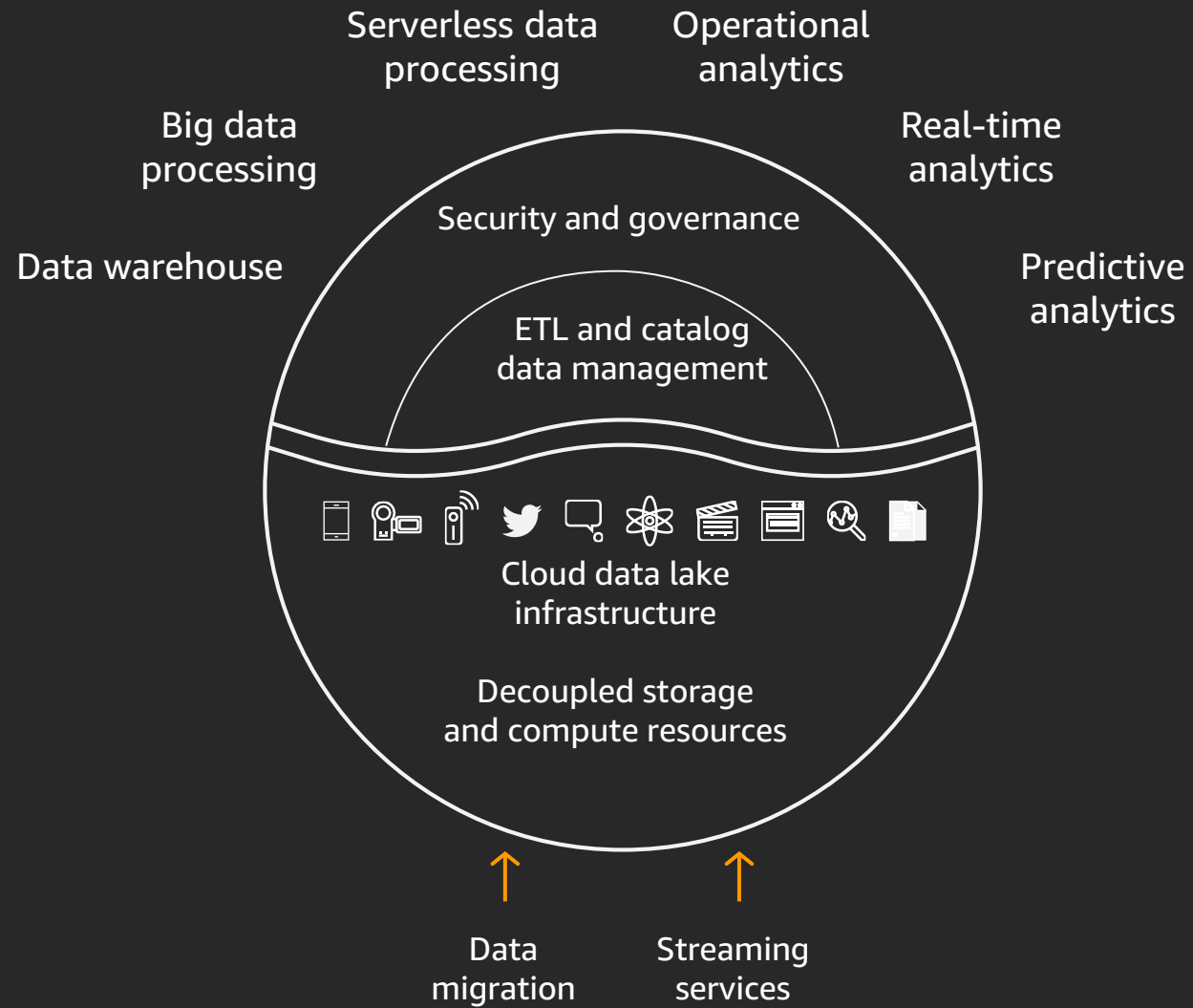
# 전통적인 사일로를 통합



to >



# 클라우드 데이터 레이크



Customers want:

A single data store that is scalable and cost-effective

To use the standards-based data format of their choice

To analyze their data in a variety of ways

# Amazon S3: 데이터 레이크를 위한 탁월한 선택







# AWS의 서비스 구성


## Analytics

 **Amazon Redshift**  
Data warehousing


 **Amazon EMR**  
Hadoop + Spark

 **Amazon Athena**  
Interactive analytics

 **Amazon Kinesis Data Analytics**  
Real time


 **Amazon Elasticsearch Service**  
Operational Analytics


## Business intelligence and machine learning

 **AWS Data Exchange**


 **QuickSight**  
Visualizations


 **Amazon SageMaker ML**

 **Comprehend**  
NLP


 **Transcribe**  
Speech-to-text

 **Textract**  
Extract text

 **Personalize**  
Recommendation

 **Forecast**  
Forecasts

 **Translate**  
Translation

 **Kibana in ES**  
Operational dashboarding

 **Third-party BI tools**

## Analytics-optimized storage

Amazon Redshift AQUA  
Amazon Elasticsearch Ultrawarm

## Data lake

Amazon S3 | AWS Glue  
AWS Lake Formation

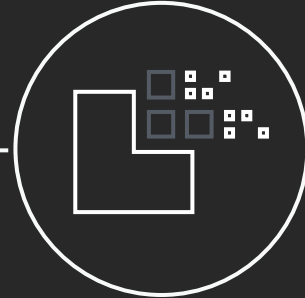
## Data movement

AWS Database Migration Service | AWS Snowball | AWS Snowmobile | Amazon Kinesis Data Firehose | Amazon Kinesis Data Streams  
Managed Streaming for Kafka

# 새로운 현실을 위한 설계



**Cloud-optimized:** Architect services ground-up for the cloud and for the explosion of data



**Purpose-built:** Offer a portfolio of purpose-built services, optimized for your workloads



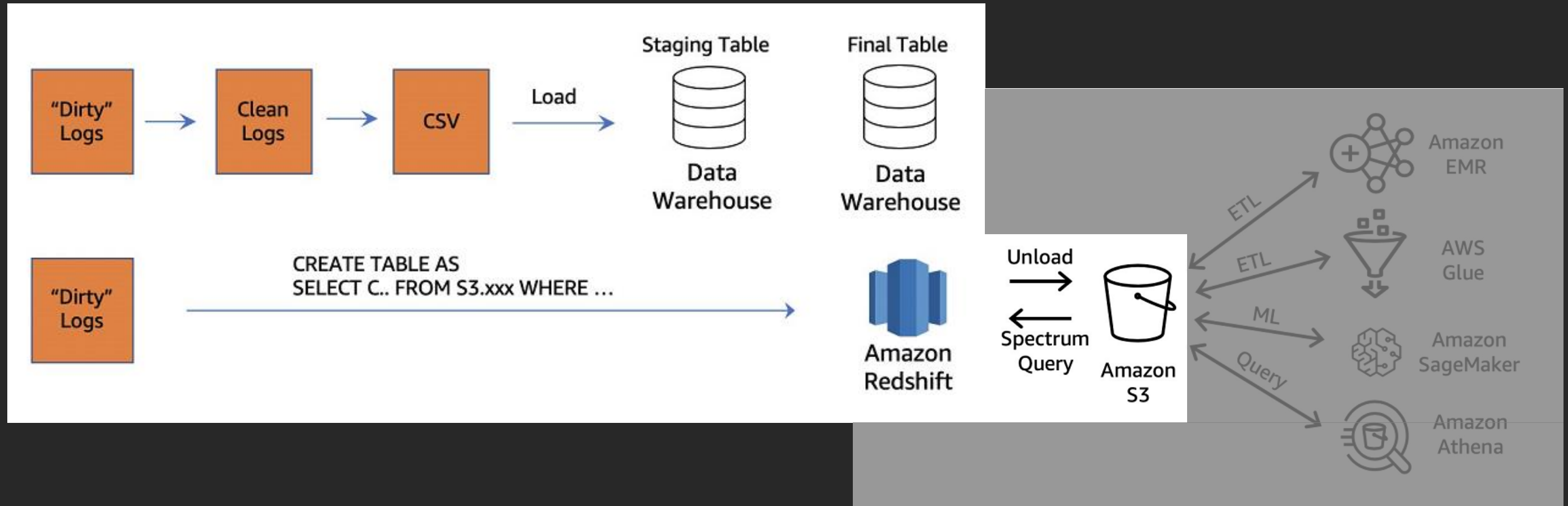
**Fully managed:** Help you innovate faster through managed services

Now used by a **very large number of customers** for mission-critical applications

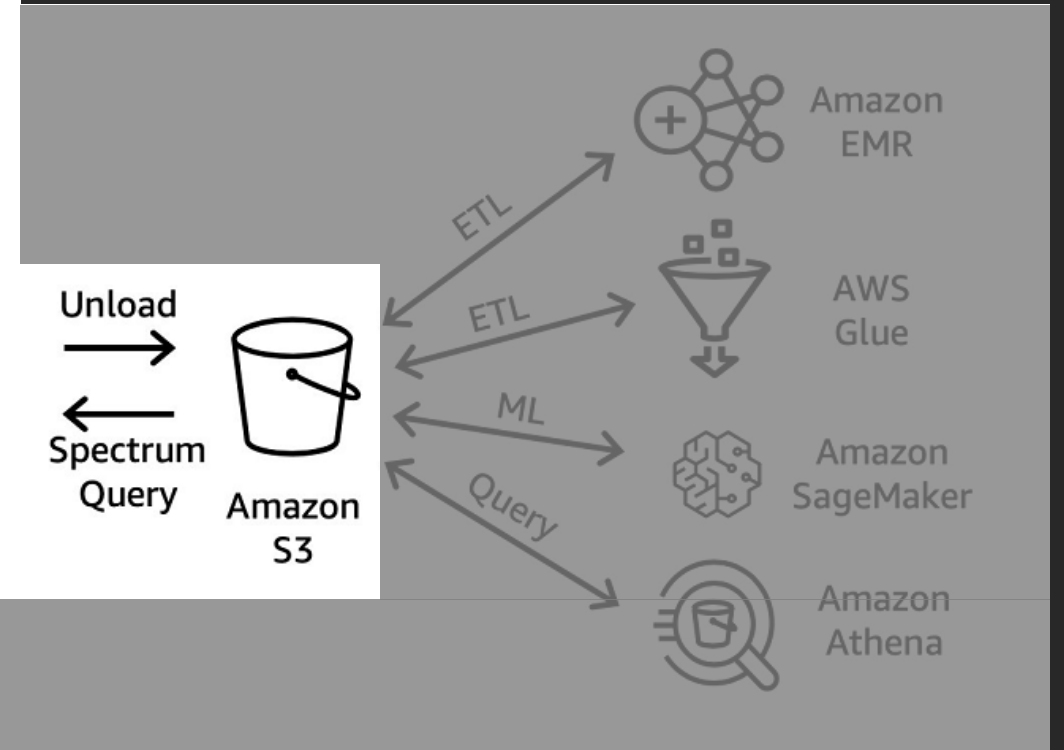
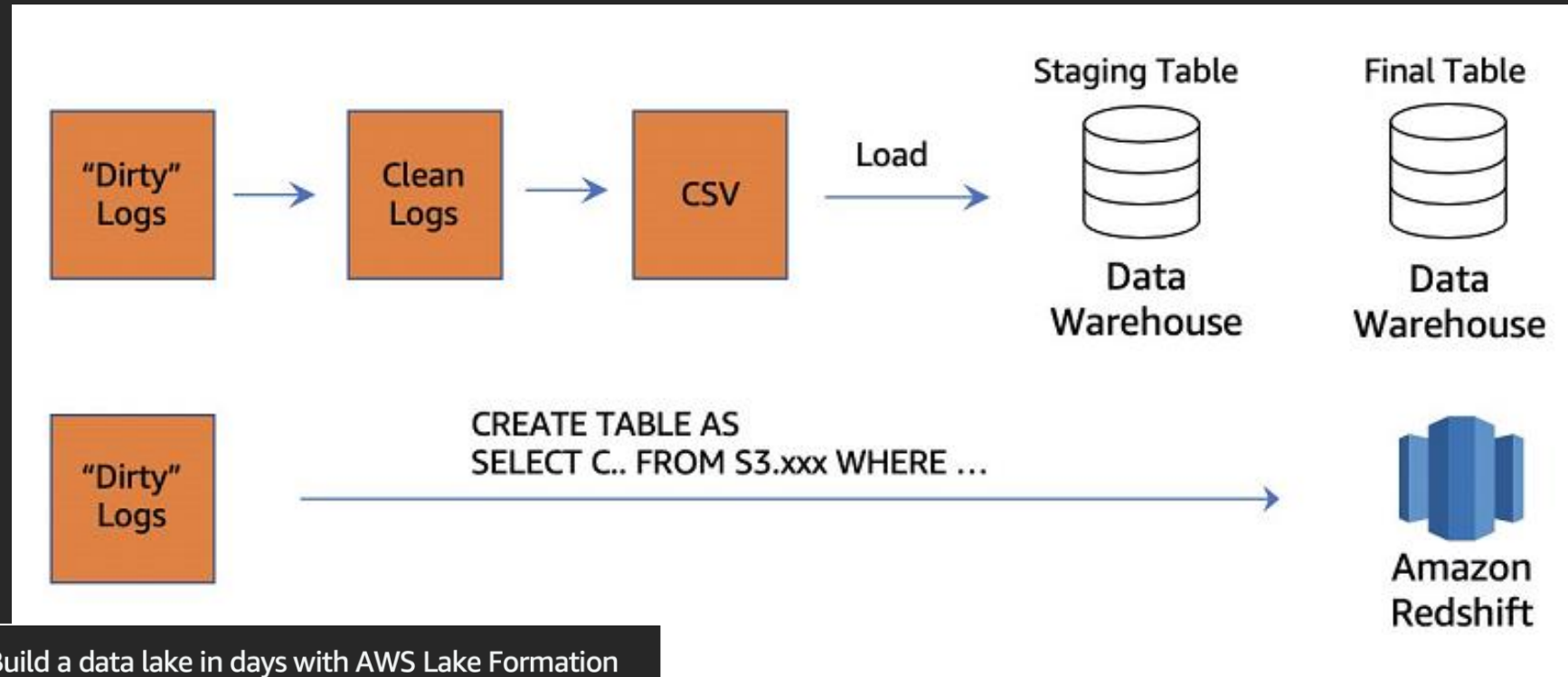
# 가장 많은 데이터 레이크와 분석 고객을 보유



# 데이터 레이크 구축



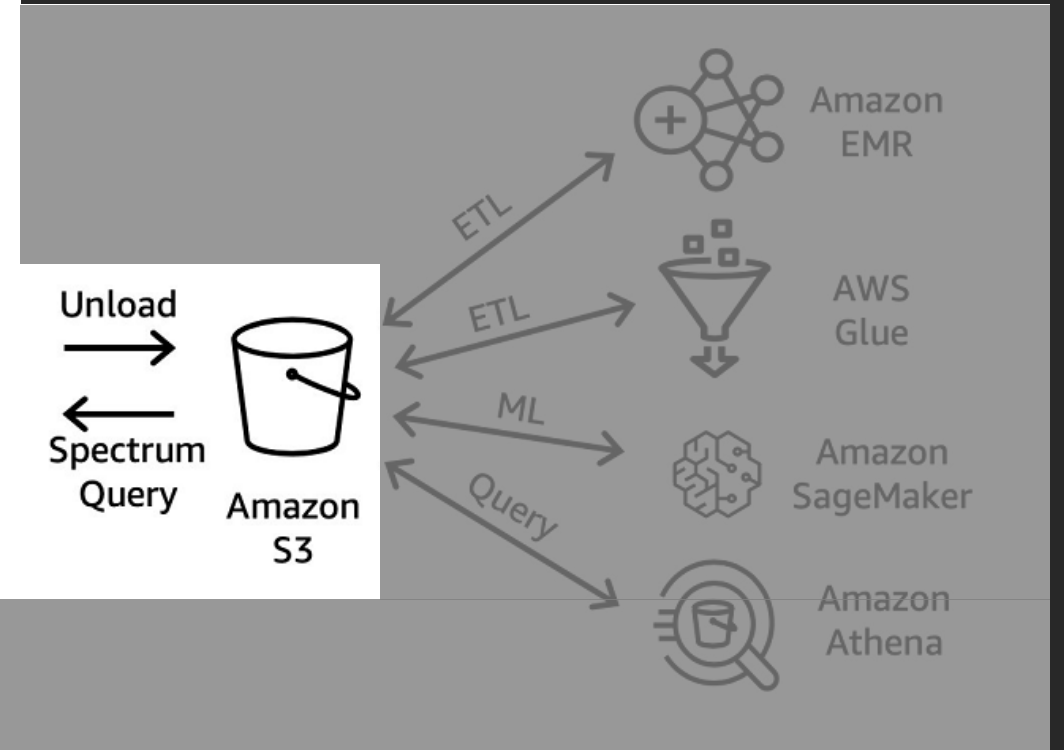
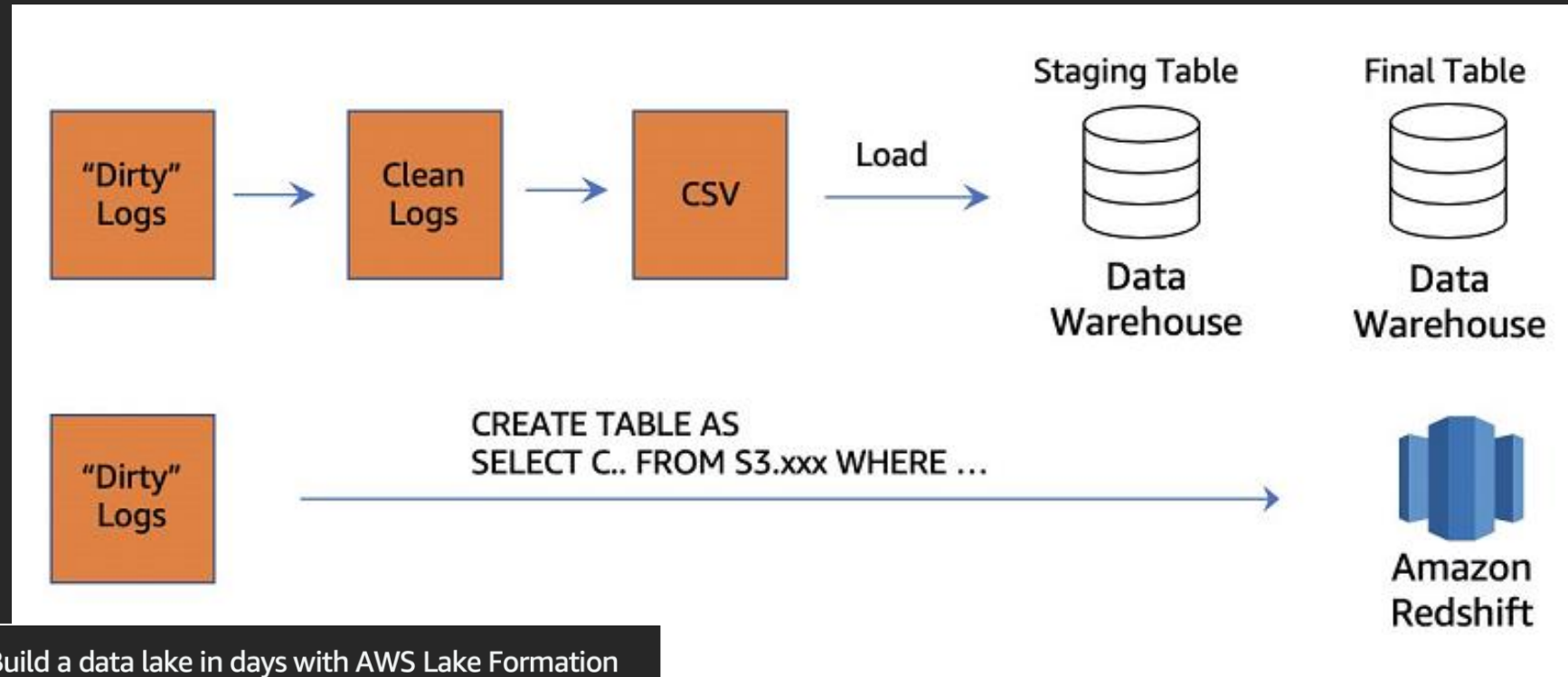
# 데이터 레이크 구축



**Build a data lake in days with AWS Lake Formation**  
Fastest to go from data to insights

Move, store, catalog, and clean your data faster	Enforce security policies across multiple services	Gain and manage new insights
Move, store, catalog, and clean your data faster with machine learning	Enforce security policies across multiple services	Empower analysts and data scientists to gain and manage new insights

# 데이터 레이크 구축



## Build a data lake in days with AWS Lake Formation

Fastest to go from data to insights

Move, store, catalog, and clean your data faster



Move, store, catalog, and clean your data faster with machine learning

## Streaming data services: Amazon Kinesis



Amazon Kinesis Data Streams

Capture and store data streams



Amazon Kinesis Data Firehose

Analyze data streams in real time



Amazon Kinesis Data Analytics

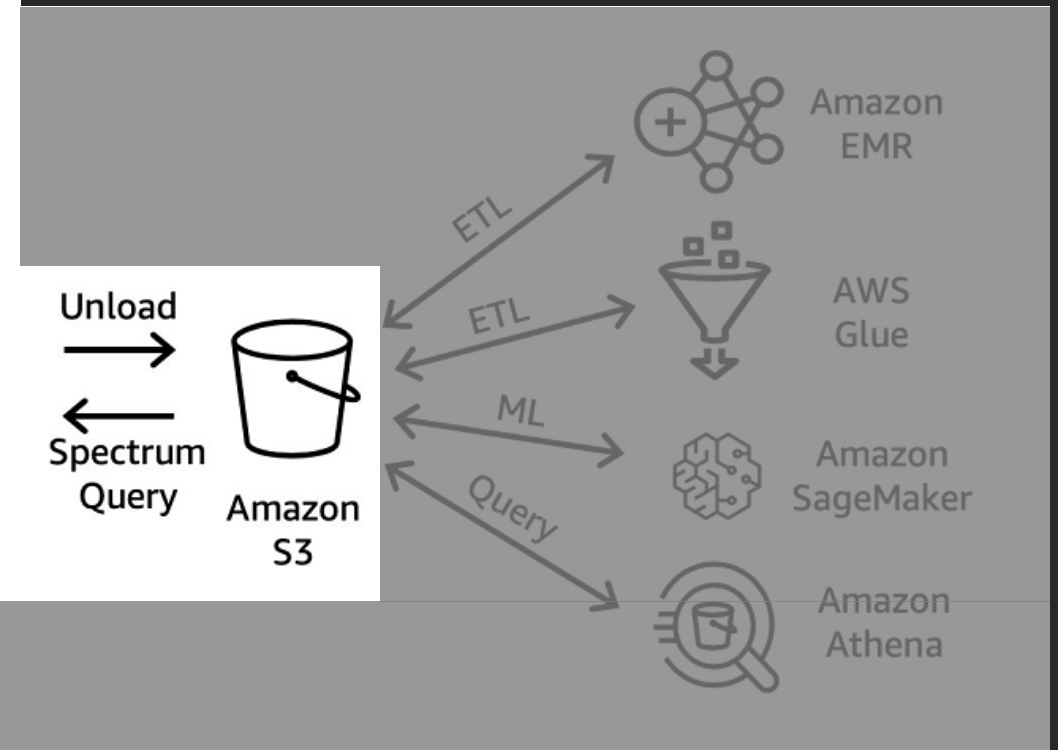
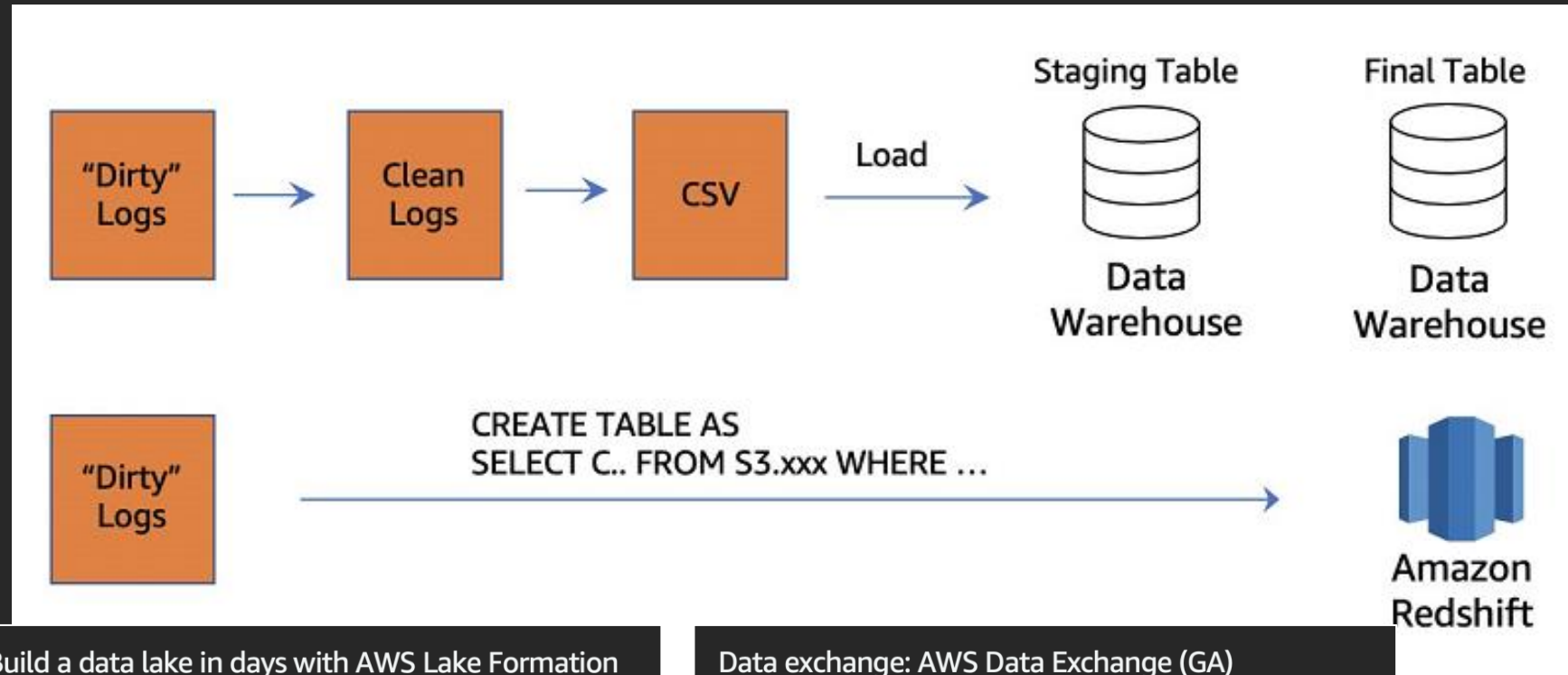
Load streaming data into streams, data lakes, and data warehouses



Amazon Managed Streaming for Apache Kafka (Amazon MSK)

Capture and store data streams

# 데이터 레이크 구축



### Build a data lake in days with AWS Lake Formation

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Move, store, catalog, and clean your data faster with machine learning

### Streaming data services: Amazon Kinesis

Amazon Kinesis Data Streams

Capture and store data streams

Amazon Kinesis Data Firehose

Analyze data streams in real time

Amazon Kinesis Data Analytics

Load streaming data into streams, data lakes, and data warehouses

### Data exchange: AWS Data Exchange (GA)

Easily find and subscribe to third-party data in the cloud

Quickly find diverse data in one place

>1,000 data products

>80 data providers including Dow Jones, Change Healthcare, Foursquare, Dun & Bradstreet, Thomson Reuters, Pitney Bowes, Lexis Nexis, and Deloitte

Capture and store data streams

Easily analyze data

Download or copy data to Amazon S3

Combine, analyze, and model with existing data

Analyze data with EMR, Redshift, Athena, and Glue

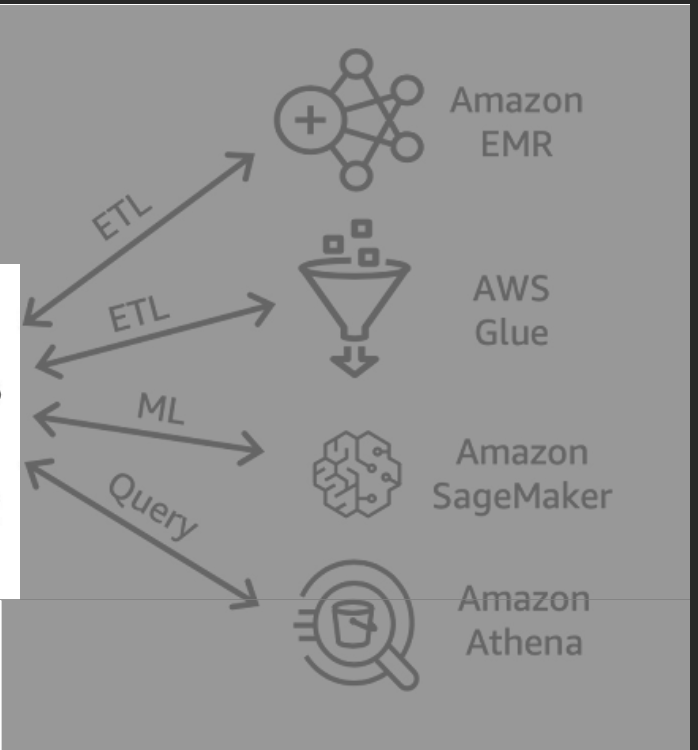
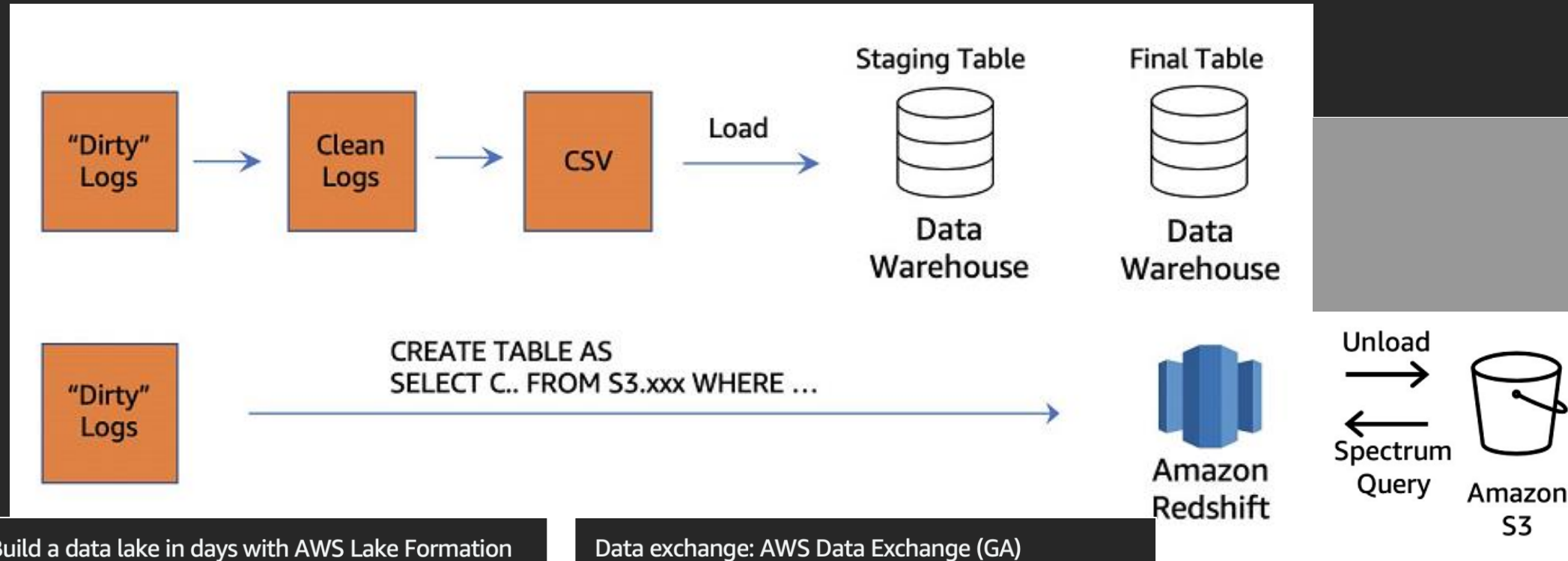
Efficiently access third-party data

Simplifies access to data No need to receive physical media, manage FTP credentials, or integrate with different APIs

Minimize legal reviews and negotiations



# 데이터 레이크 구축



### Build a data lake in days with AWS Lake Formation

Fastest to go from data to insights

Move, store, catalog, and clean your data faster

Move, store, catalog, and clean your data faster with machine learning

### Streaming data services: Amazon Kinesis

- Amazon Kinesis Data Streams**  
Capture and store data streams
- Amazon Kinesis Data Firehose**  
Analyze data streams in real time
- Amazon Kinesis Data Analytics**  
Load streaming data into streams, data lakes, and data warehouses

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- Easily analyze data**  
Download or copy data to Amazon S3  
Combine, analyze, and model with existing data  
Analyze data with EMR, Redshift, Athena, and Glue

### Data warehousing: Amazon Redshift

First and most popular cloud data warehouse

- Data lake & AWS integration**  
Analyze exabytes of data across data warehouse, data lakes, and operational database  
Query data across various analytics services
- Best performance, most scalable**  
AUQA and RA3: 10x faster than other cloud data warehouses  
Adds unlimited compute capacity on demand to meet unlimited concurrent access
- Most secure & compliant**  
AWS-grade security (e.g. VPC, encryption with AWS KMS, AWS CloudTrail)  
All major certifications such as SOC, PCI, DSS, ISO, FedRAMP, HIPAA
- Lowest cost**  
Cost-optimized workloads by paying compute and storage separately  
1/10th cost of traditional DW at \$1000/TB/year  
Up to 75% less than other cloud data warehouses & predictable costs



# AWS Lake Formation: 빠르게 데이터 레이크를 구축

Fastest to go from data to insights

**Move, store, catalog, and  
clean your data faster**



Move, store, catalog,  
and clean your data faster  
with machine learning

**Enforce security policies  
across multiple services**



Enforce security policies across  
multiple services

**Gain and manage new  
insights**



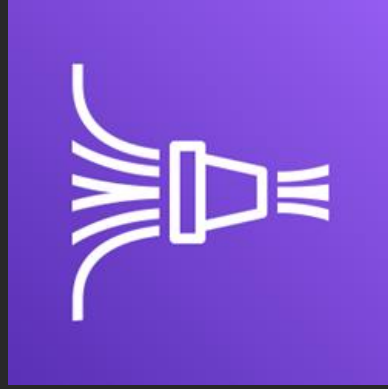
Empower analysts and data  
scientists to gain and manage  
new insights

# Amazon Kinesis: 스트리밍 데이터 분석



Amazon Kinesis  
Data Streams

Capture and store  
data streams



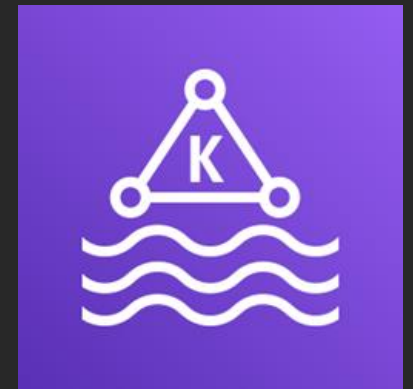
Amazon Kinesis  
Data Firehose

Analyze data streams  
in real time



Amazon Kinesis  
Data Analytics

Load streaming data  
into streams, data  
lakes, and data  
warehouses



Amazon Managed  
Streaming for  
Apache Kafka  
(Amazon MSK)

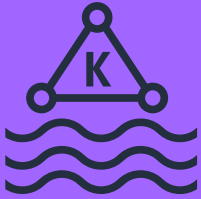
Capture and store  
data streams

# Amazon Kinesis: 스트리밍 분석 역량



## **Access resources within an Amazon VPC using Amazon Kinesis Data Analytics**

- Read and write data from resources within your VPCs like Amazon Elasticsearch Service clusters, RDS databases, and Redshift data warehouses



## **Amazon MSK releases Open Monitoring with Prometheus**

- Consume every Apache Kafka metric with low latency
- Enable time-series logging, alarming, and charting through Prometheus



## **Run Apache Flink and Apache Kafka together using fully managed services on AWS**

- Use Kinesis Data Analytics to process streaming data stored in Amazon MSK
- Run streaming solutions end-to-end using open source software in fully managed services

# AWS Data exchange: 외부 데이터 검색 및 구독

Easily find and subscribe to third-party data in the cloud

**Quickly find diverse data  
in one place**



>1,000 data products

>80 data providers including Dow Jones, Change Healthcare, Foursquare, Dun & Bradstreet, Thomson Reuters, Pitney Bowes, Lexis Nexis, and Deloitte

**Easily analyze data**



Download or copy data to Amazon S3  
Combine, analyze, and model with existing data  
Analyze data with EMR, Redshift, Athena, and Glue

**Efficiently access  
third-party data**



Simplifies access to data No need to receive physical media, manage FTP credentials, or integrate with different APIs  
Minimize legal reviews and negotiations

# Amazon Redshift: 데이터웨어하우스

First and most popular cloud data warehouse

## Data lake & AWS integration



Analyze exabytes of data across data warehouse, data lakes, and operational database

Query data across various analytics services

## Best performance, most scalable



AUQA and RA3: 10x faster than other cloud data warehouses

Adds unlimited compute capacity on demand to meet unlimited concurrent access

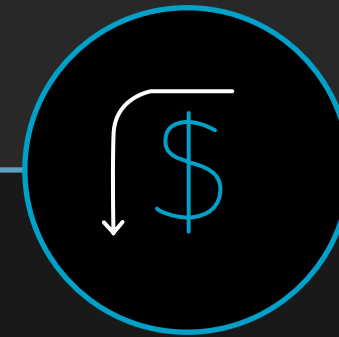
## Most secure & compliant



AWS-grade security (e.g. VPC, encryption with AWS KMS, AWS CloudTrail)

All major certifications such as SOC, PCI, DSS, ISO, FedRAMP, HIPAA

## Lowest cost



Cost-optimized workloads by paying compute and storage separately

1/10<sup>th</sup> cost of traditional DW at \$1000/TB/year

Up to 75% less than other cloud data warehouses & predictable costs

# 가장 광범위하게 사용되는 데이터웨어하우스

Tens of thousands of customers use Amazon Redshift

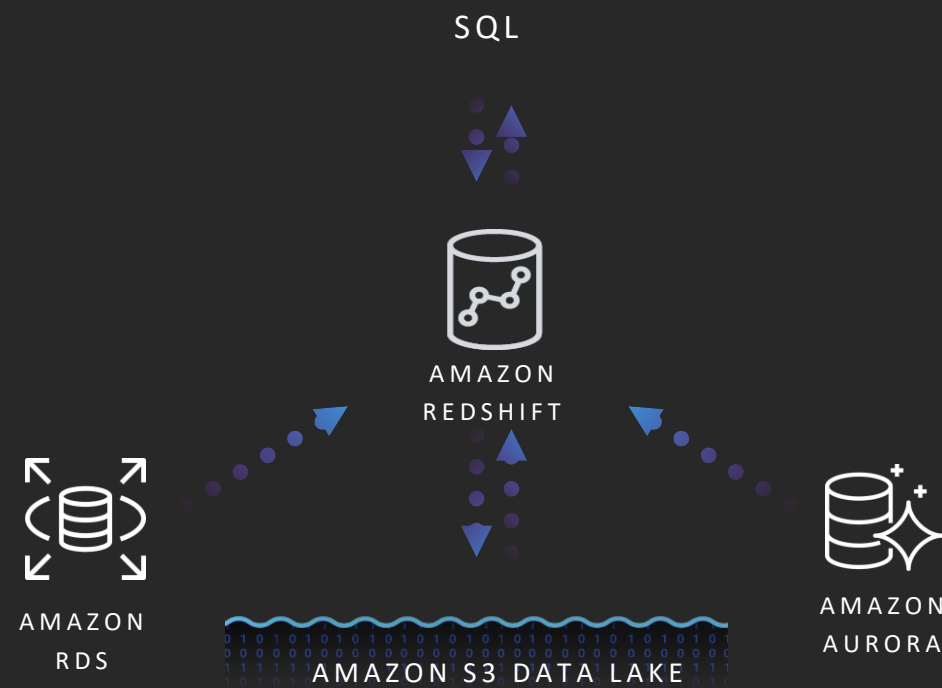


# Amazon Redshift는 급격한 혁신을 제공

Robust result set caching	Large # of tables support ~20000	Copy command support for ORC, Parquet	IAM role chaining	Elastic resize	Groups
Redshift Spectrum: Date formats, scalar json and ION file formats support, region expansion, predicate filtering	Auto analyze	Health and performance monitoring w/Amazon Cloud watch	Automatic table distribution style	Amazon CloudWatch support for WLM queues	Performance enhancements: Hash join, vacuum, window functions, resize ops, aggregations, console, union all, efficient compile code cache
Unload to CSV	Auto WLM	~25 Query Monitoring Rules (QMR) support		AQUA	
Concurrency scaling					
Manage multi-part query in AWS Management Console	Auto analyze for incremental changes on table			DC1 migration to DC2	Resiliency of ROLLBACK processing
				Spectrum Request Accelerator	Apply new distribution key
Redshift Spectrum: Row group filtering in Parquet and ORC, nested data support, enhanced VPC routing, multiple partitions	Faster Classic resize with optimized data transfer protocol			Performance: Bloom filters in joins, complex queries that create internal table, communication layer	Redshift Spectrum: Concurrency scaling
				AWS Lake Formation integration	Auto-vacuum sort, auto-analyze and auto table sort
Auto WLM with query priorities	Snapshot scheduler	Performance: Join pushdowns to subquery, mixed workloads temporary tables, rank functions, null handling in join, single row insert	Advisor recommendations for distribution keys	AZ64 compression encoding	Console redesign
Spatial processing	Stored procedures				
	Column level access control with AWS lake formation	RA3	Performance of inter-Region snapshot transfers	Federated query	Materialized views
					Manual pause and resume

# Amazon Redshift: Federated Query (Preview)

## Analyze data across data warehouse, data lakes, and operational databases



# Query across multiple systems from Amazon Redshift

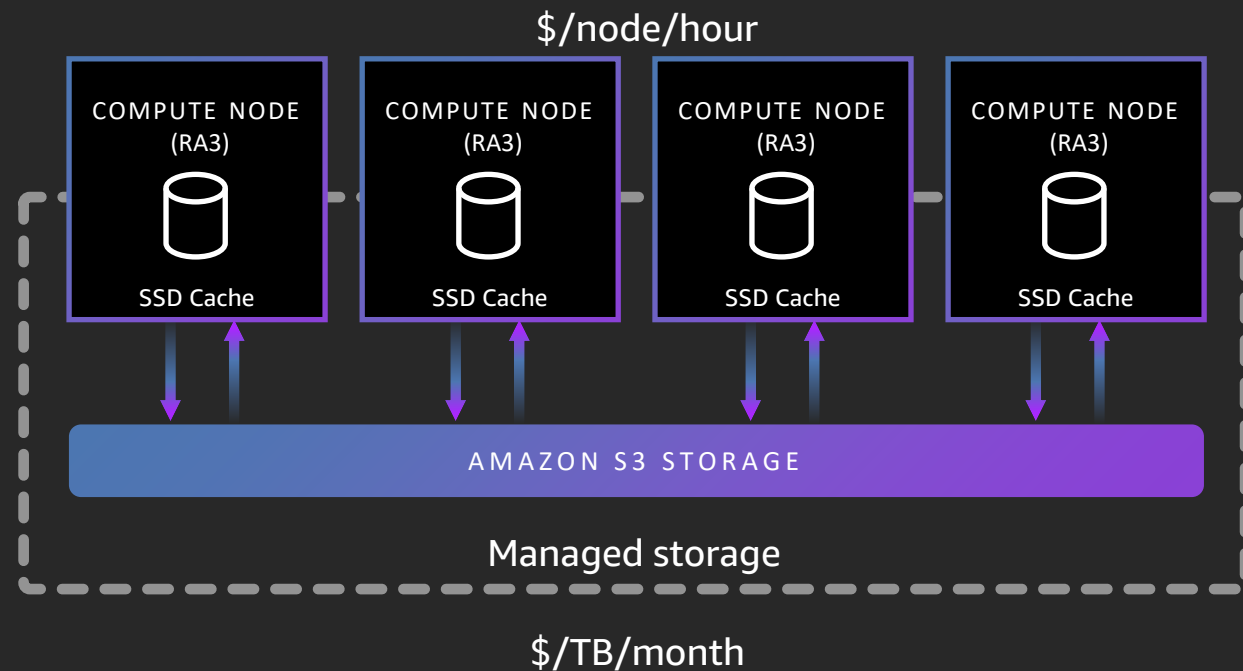
## Combine data warehouse and transactional data

## Compatible with Amazon RDS and Amazon Aurora (PostgreSQL)



# Amazon Redshift: RA3 instances

Optimize your data warehouse by paying for compute and storage separately



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Delivers 3x the performance of existing cloud DWs

---

DS2 customers can migrate and get 2x performance and 2x storage for the same cost

---

Automatically scales your DW storage capacity

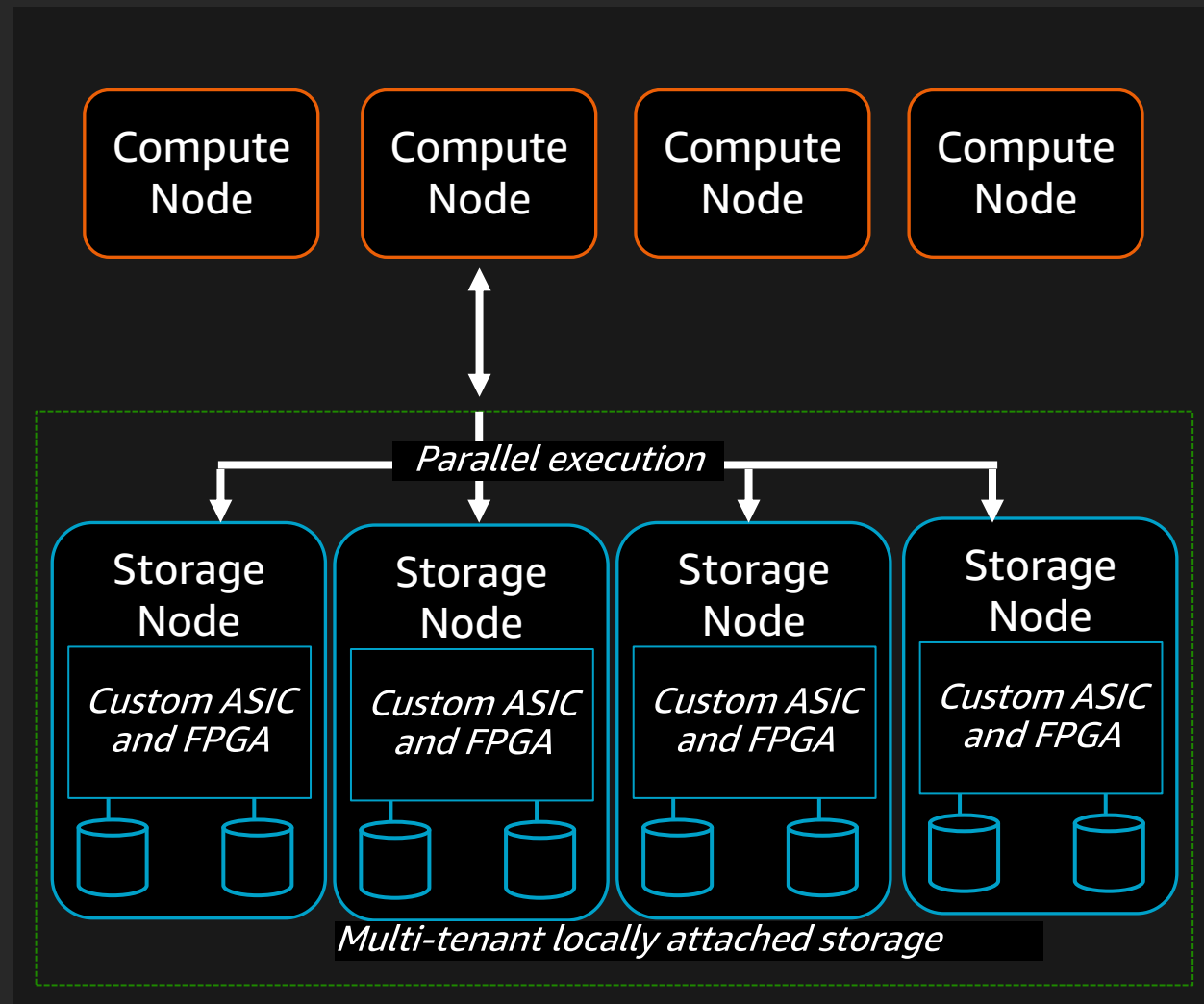
---

Supports workloads up to 8 PB (compressed)

# AQUA – Advanced Query Accelerator

COMING IN 2020

Redshift runs 10x faster than any other cloud data warehouse without increasing cost



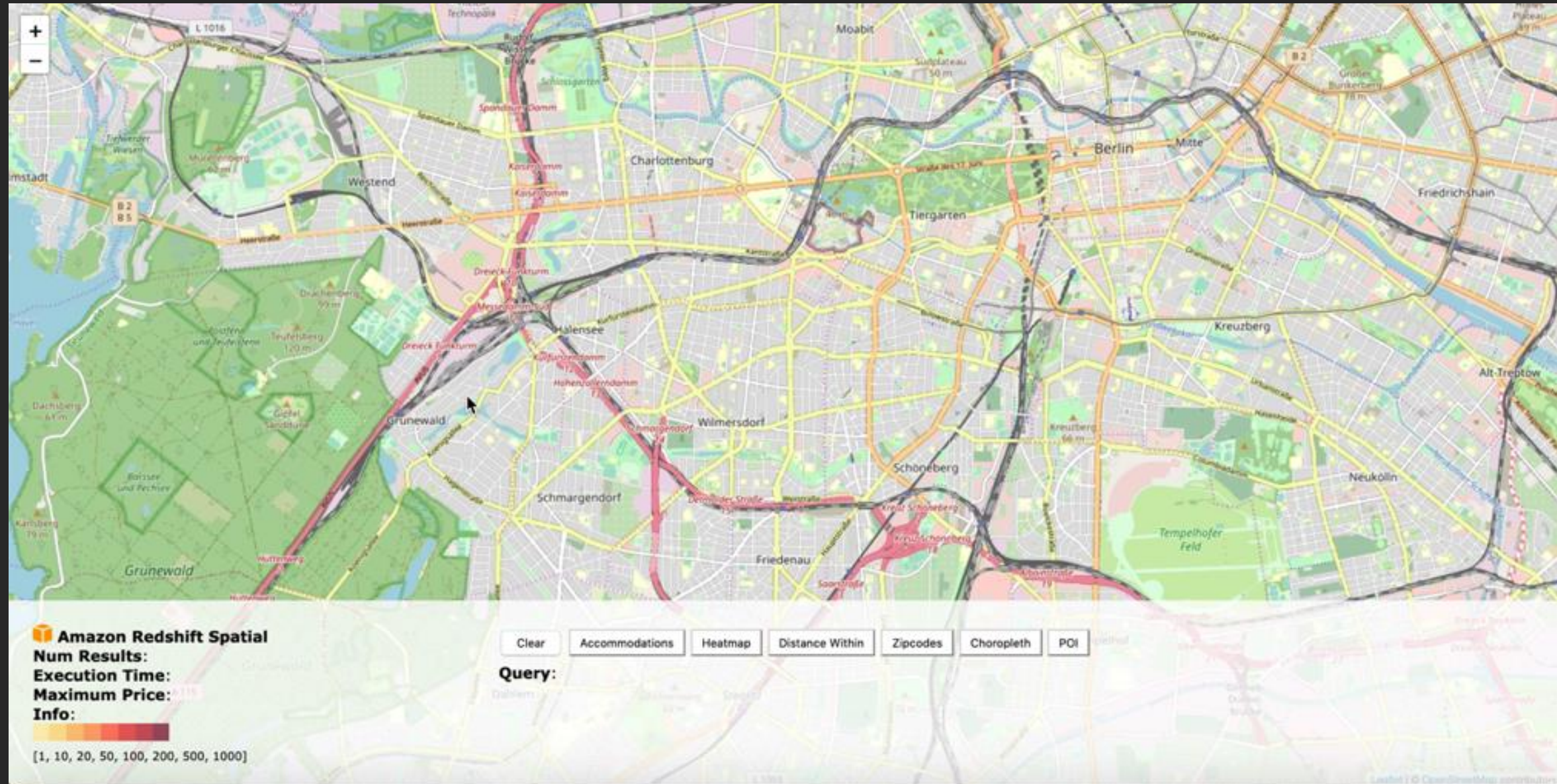
AQUA brings compute to the storage layer so data doesn't have to move back and forth

High-speed cache on top of S3 scales out to process data in parallel across many nodes

AWS custom-designed analytics processors accelerate data compression, encryption, and data processing

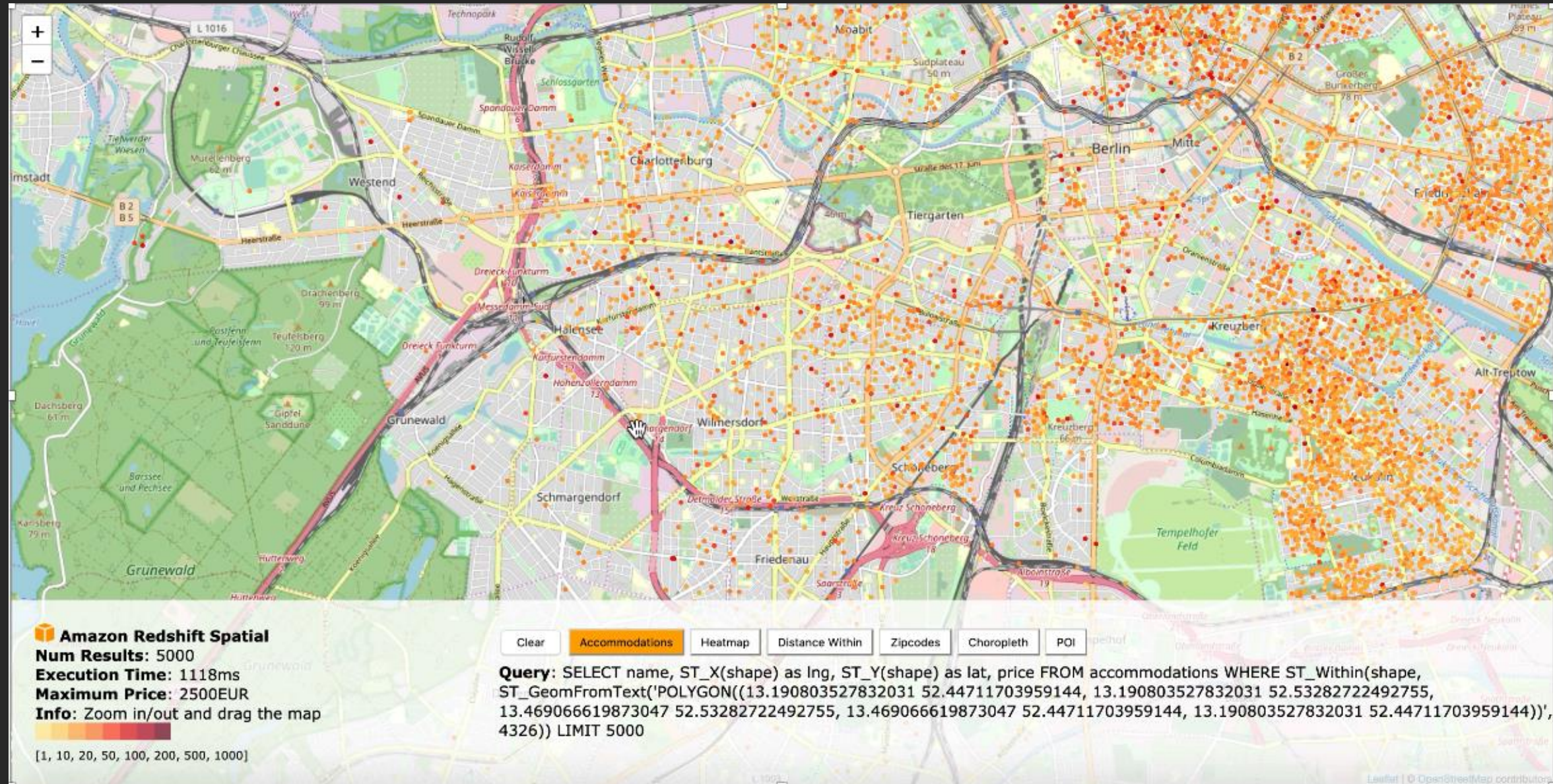
100% compatible with the current version of Redshift

# Amazon Redshift: spatial demo



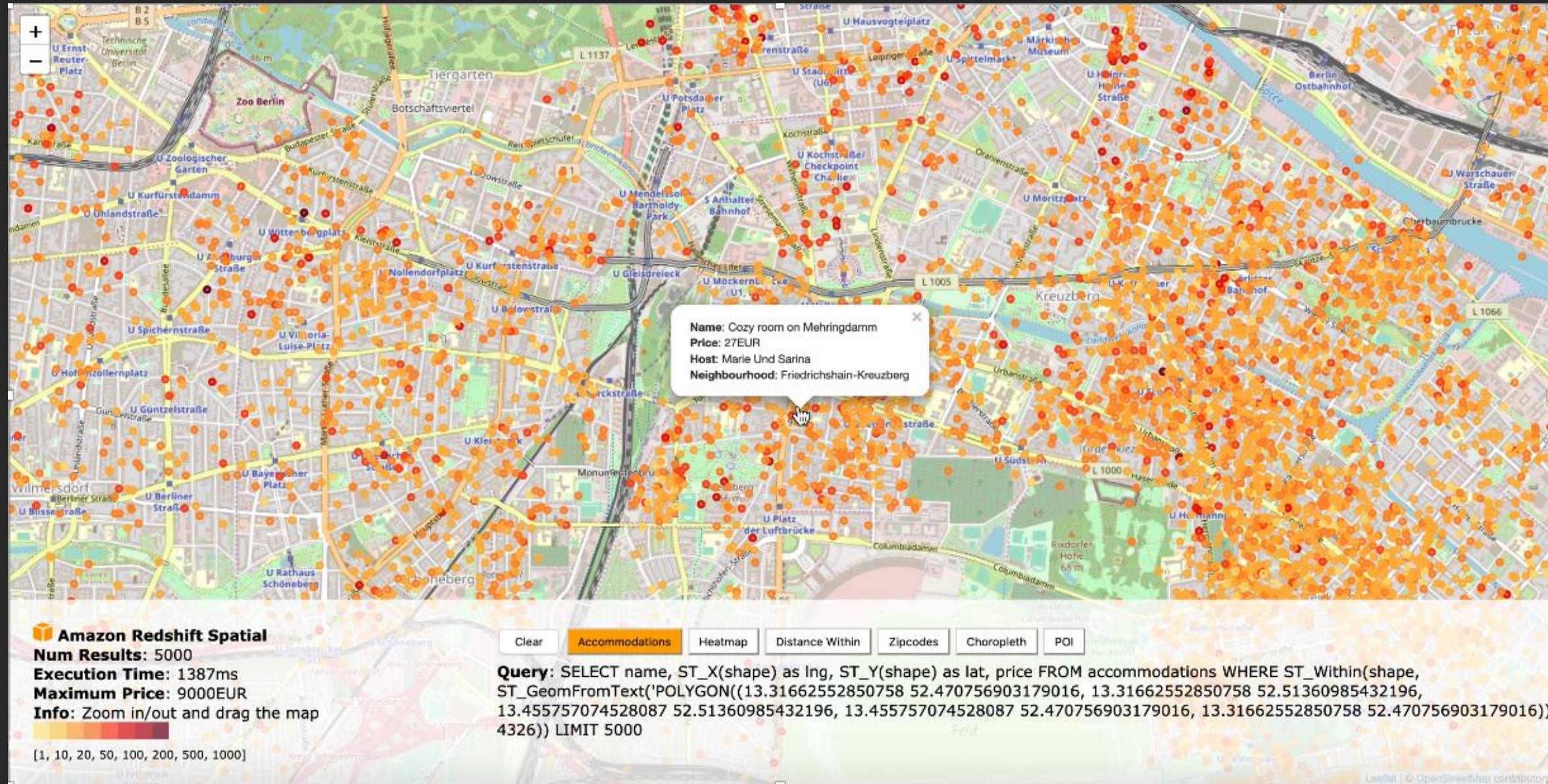


# Amazon Redshift: Zoom and Drag



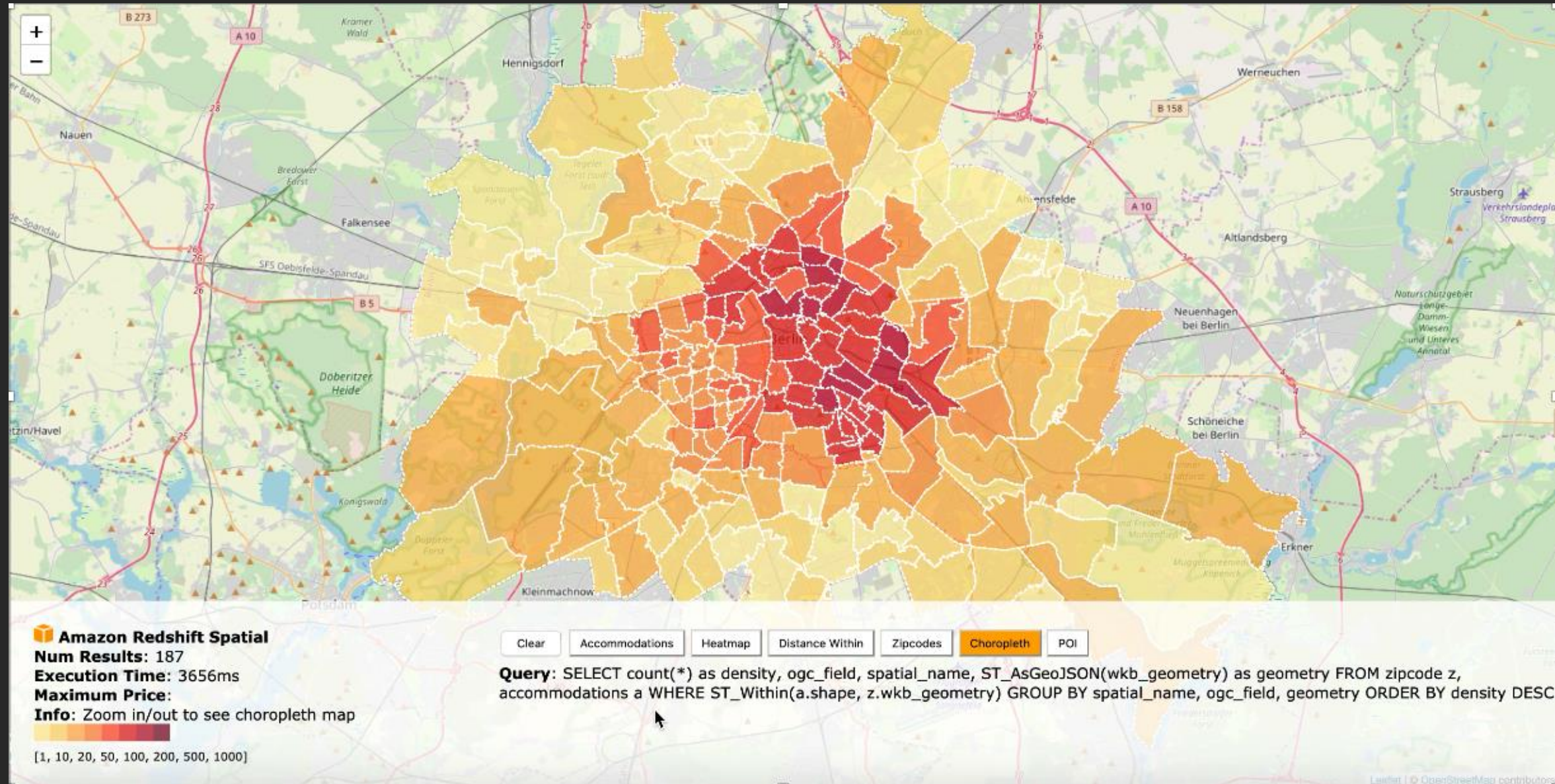


# Amazon Redshift: Zoom and Drag



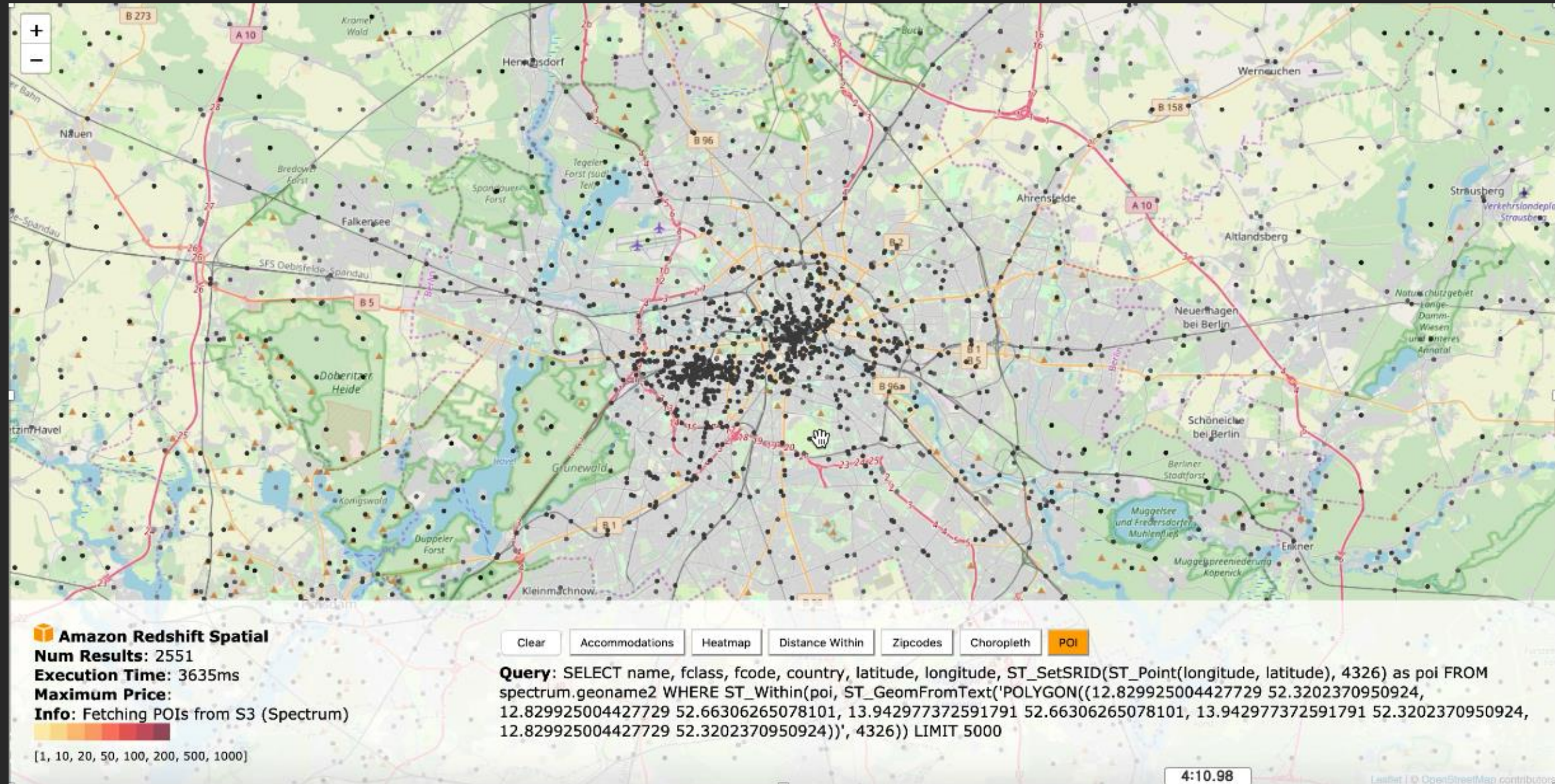


# Amazon Redshift: Choropleth with zip





# Amazon Redshift: Fetching POI from Spectrum



# 데이터 분석을 통한 인사이트 획득



# 데이터 레이크로 시작하는 인사이트 획득

## 데이터 분석을 통한 인사이트 획득



**Amazon Redshift**  
Data warehousing



**Amazon EMR**  
Hadoop + Spark



**Amazon Athena**  
Interactive analytics



**Amazon Kinesis**  
Real-time data analytics



**Amazon Elasticsearch Service**  
Operational Analytics

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## 데이터 레이크 구축



**Amazon  
S3/Glacier**

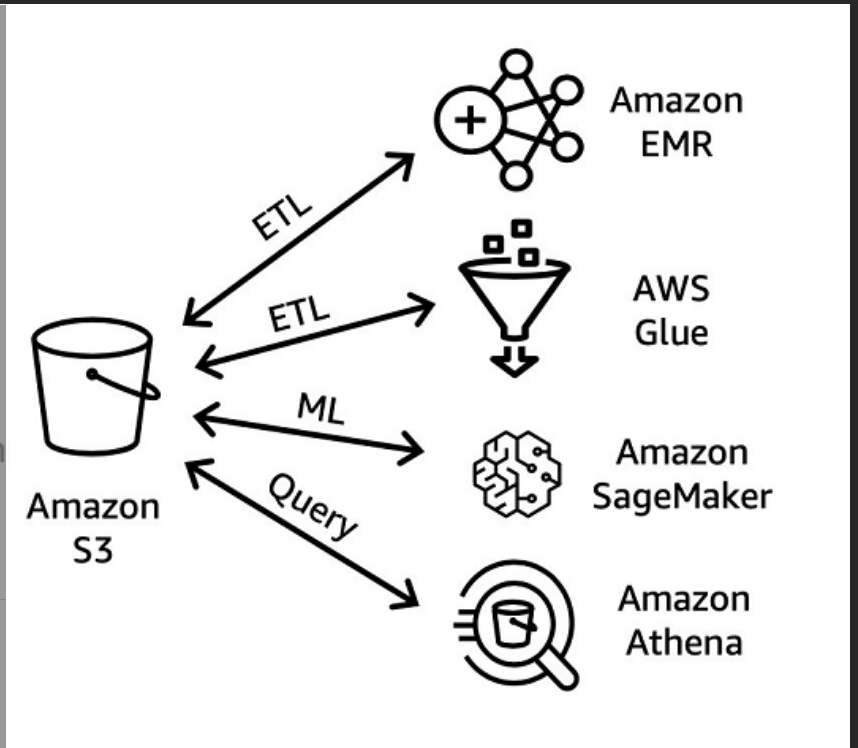
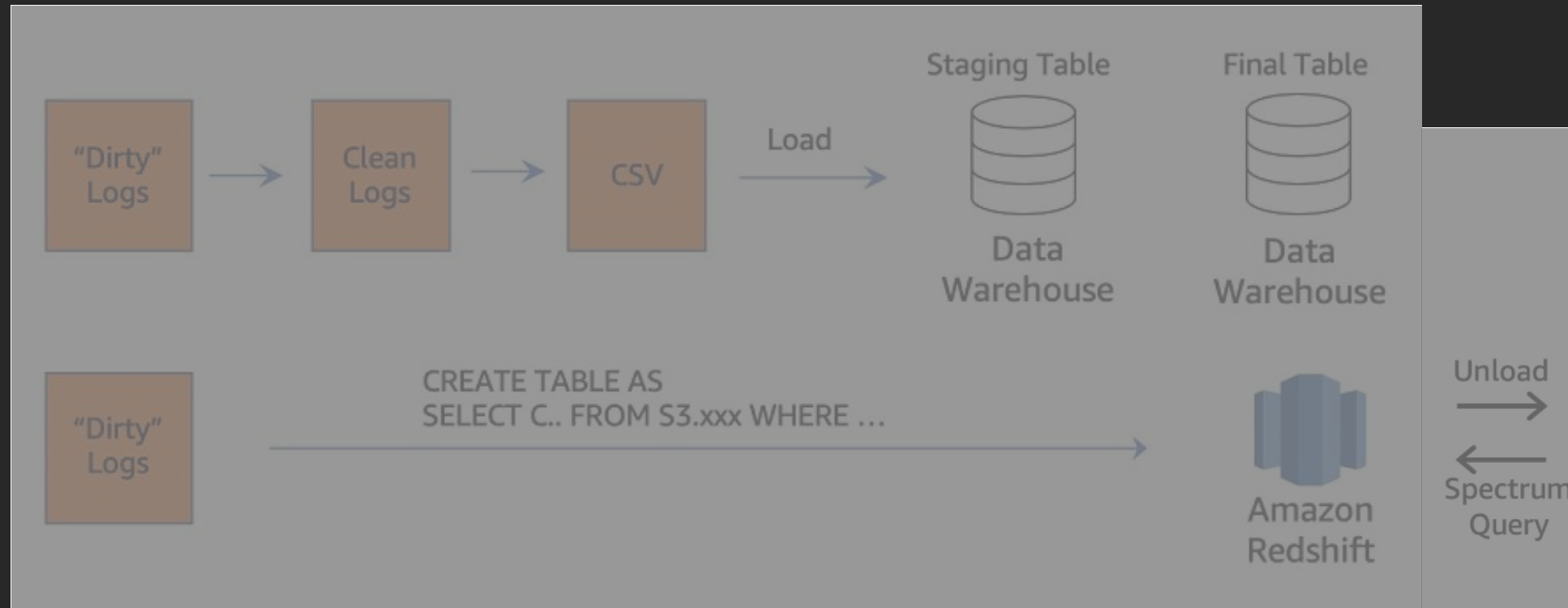


**AWS Lake  
Formation**



**AWS Glue**

# 데이터 분석을 통한 인사이트 획득



# 데이터 분석을 통한 인사이트 획득

## ETL and Data Catalog: AWS Glue

Simple, flexible, and cost-effective ETL

Less hassle



Integrated across AWS: Supports Amazon Aurora, Amazon RDS, Amazon Redshift, Amazon S3, and common database engines in your VPC running on Amazon EC2

Serverless

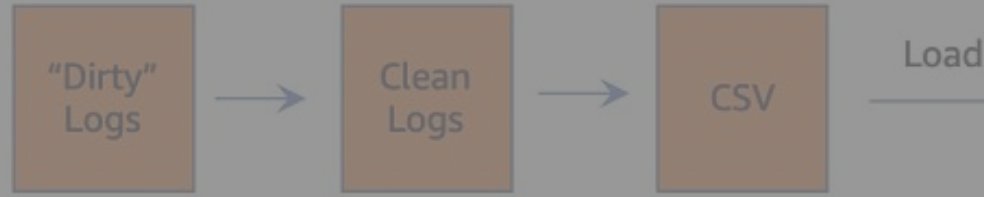


Serverless: No infrastructure to provision or manage

More power



Automatically generates the code to execute your data transformations and loading processes



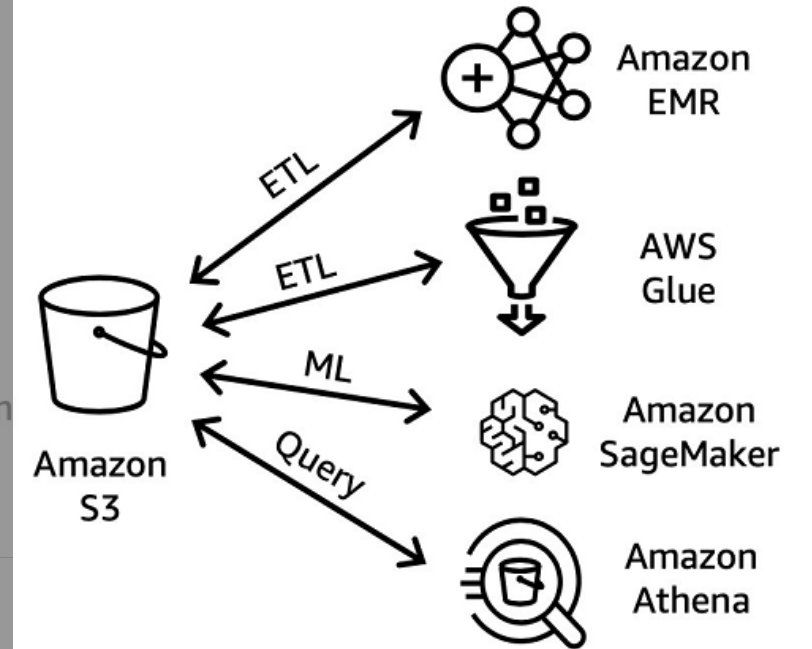
"Dirty" Logs

CREATE TABLE AS  
SELECT C.. FROM S3.xxx WHERE ...

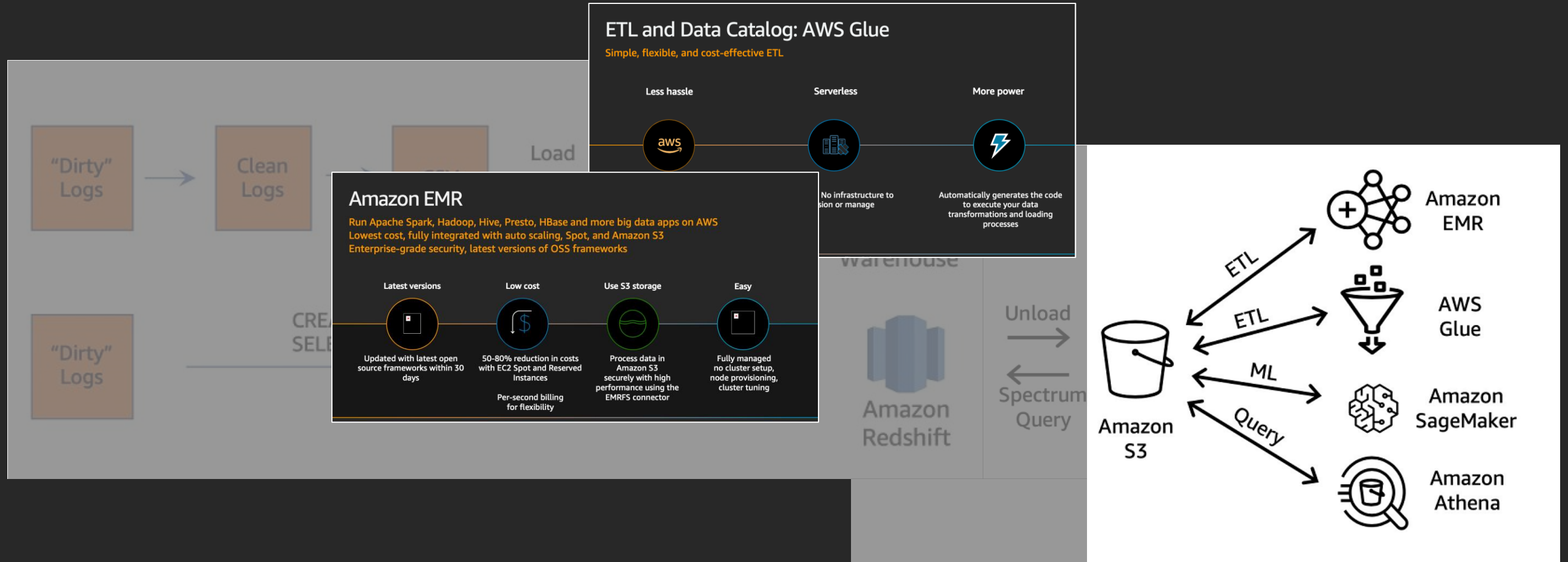


Amazon Redshift

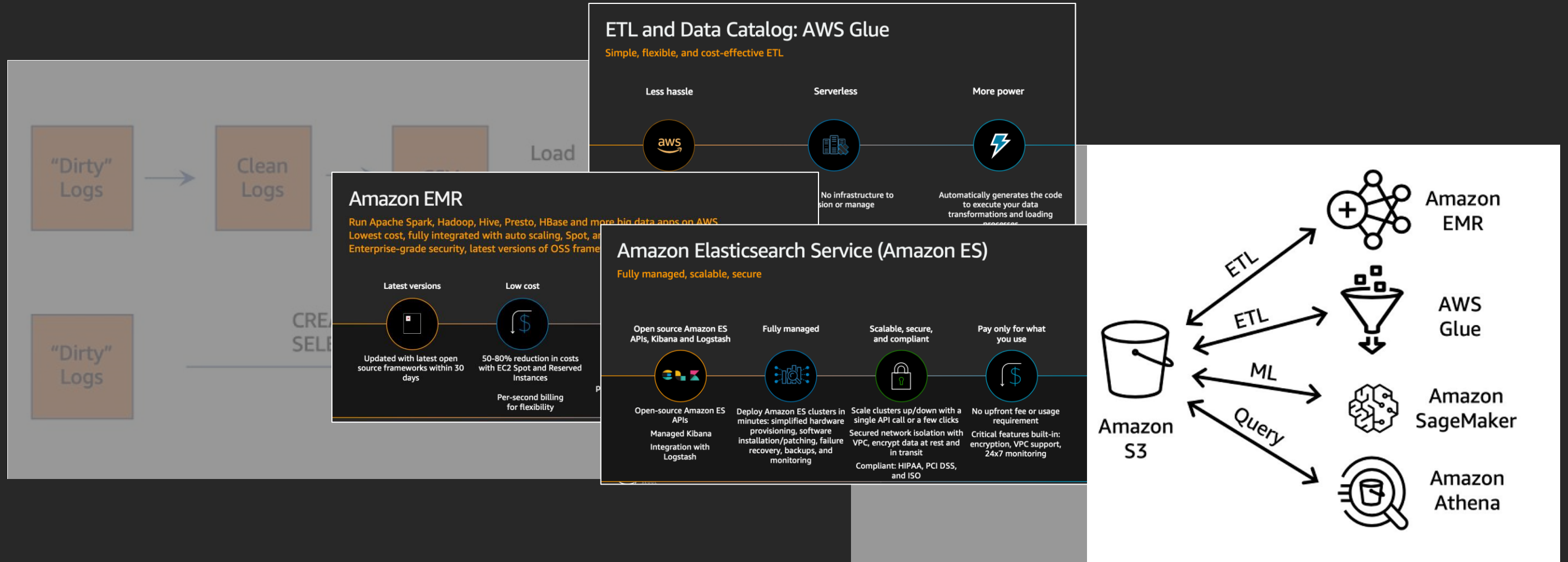
Unload  
→  
←  
Spectrum Query



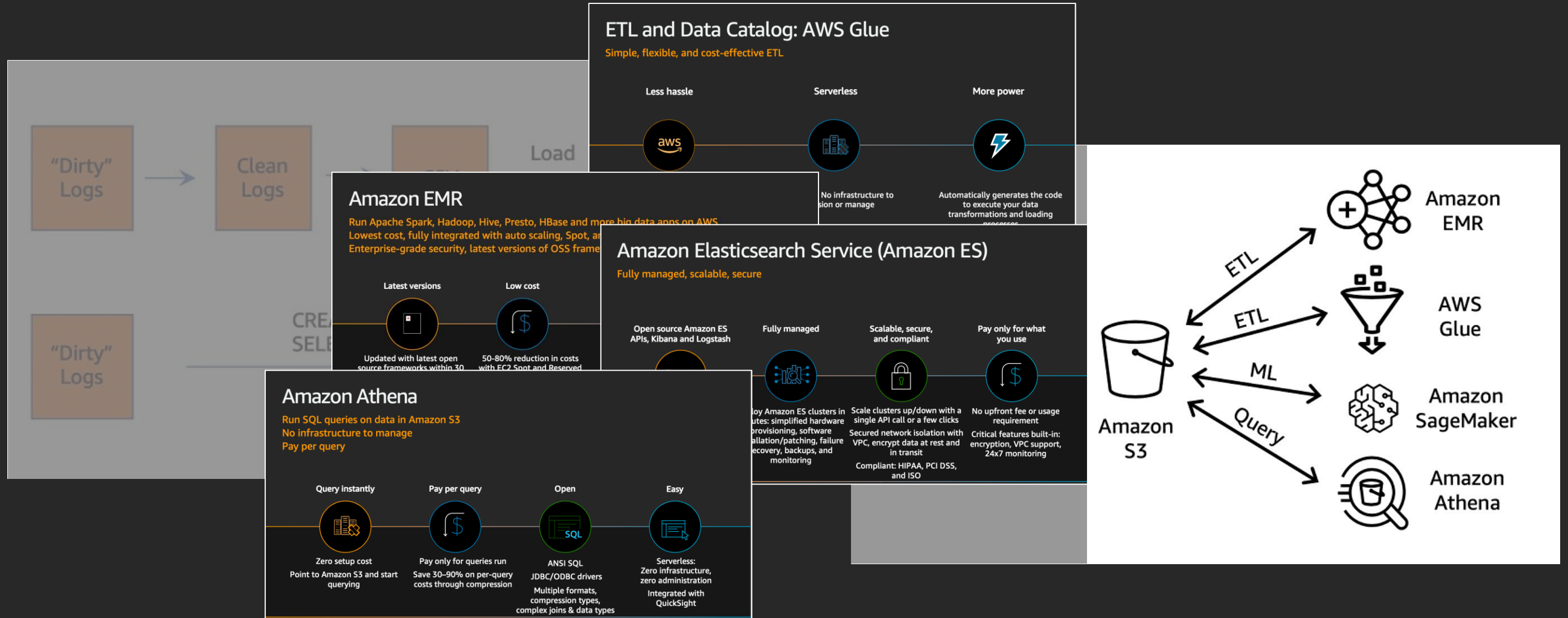
# 데이터 분석을 통한 인사이트 획득



# 데이터 분석을 통한 인사이트 획득

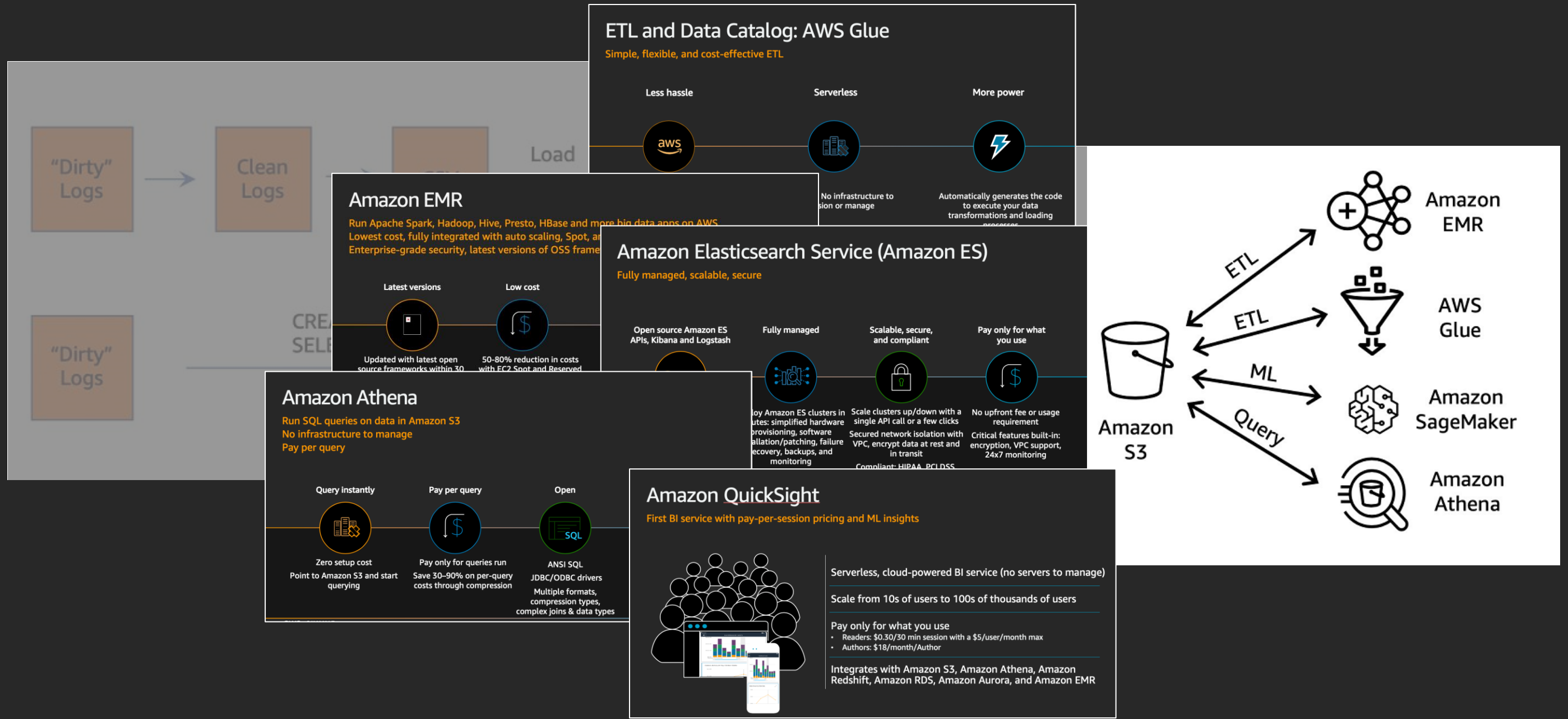


# 데이터 분석을 통한 인사이트 획득





# 데이터 분석을 통한 인사이트 획득



# AWS Glue: ETL and Data Catalog

Simple, flexible, and cost-effective ETL

Less hassle



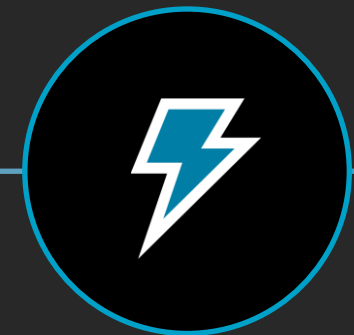
Integrated across AWS: Supports Amazon Aurora, Amazon RDS, Amazon Redshift, Amazon S3, and common database engines in your VPC running on Amazon EC2

Serverless



Serverless: No infrastructure to provision or manage

More power



Automatically generates the code to execute your data transformations and loading processes



# Amazon EMR

Run Apache Spark, Hadoop, Hive, Presto, HBase and more big data apps on AWS

Lowest cost, fully integrated with auto scaling, Spot, and Amazon S3

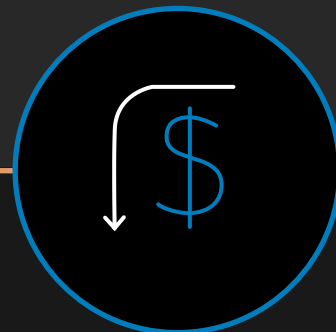
Enterprise-grade security, latest versions of OSS frameworks

## Latest versions



Updated with latest open source frameworks within 30 days

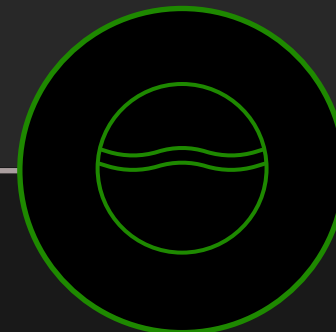
## Low cost



50-80% reduction in costs with EC2 Spot and Reserved Instances

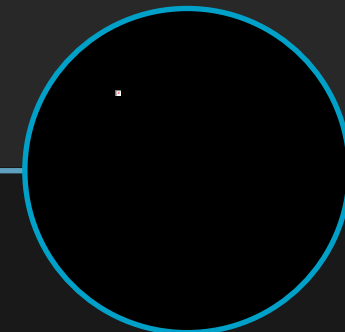
Per-second billing for flexibility

## Use S3 storage



Process data in Amazon S3 securely with high performance using the EMRFS connector

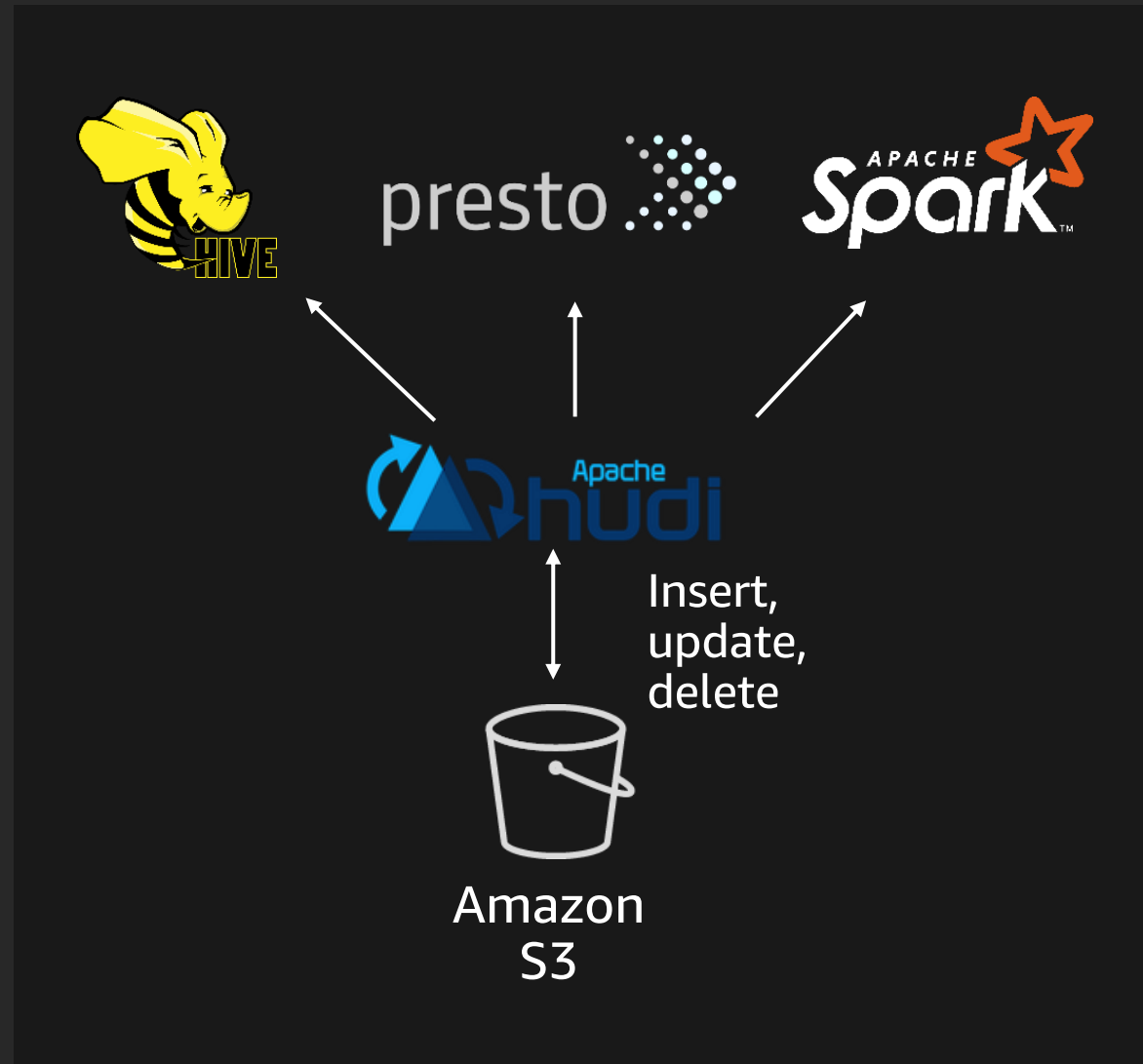
## Easy



Fully managed no cluster setup, node provisioning, cluster tuning

# Amazon EMR: Apache Hudi

Record-level insert, update, and delete on Amazon S3



**Apache Hudi is open source, and uses open data formats, enabling data lakes to:**

---

Comply with data privacy laws

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---

Consume real-time streams and change data capture

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---

Reinstate late-arriving data

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---

Track change history and rollback

---

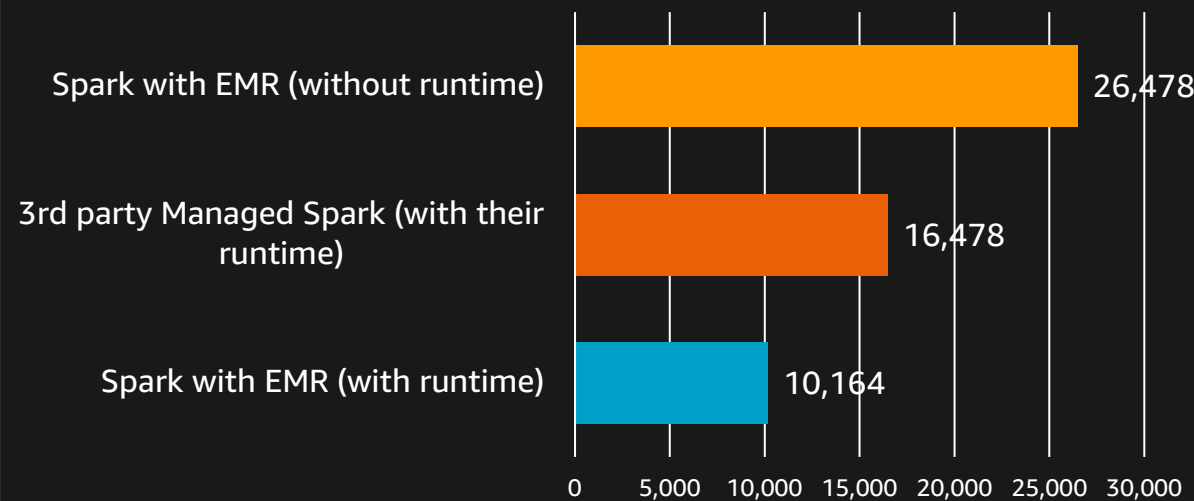
---

**Includes support for Spark, Hive, and Presto**

# Performance improvements in Spark for Amazon EMR

Performance-optimized runtime for Apache Spark, 2.6x faster performance at 1/10th the cost

Runtime total on 104 queries  
(seconds - lower is better)



*\*Based on TPC-DS 3TB Benchmarking running 6 node C4x8 extra large clusters and EMR 5.28, Spark 2.4*

## Runtime optimized for Apache Spark performance

### Best performance

- **2.6x faster** than Spark with Amazon EMR without runtime
- **1.6x faster** than third-party Managed Spark (with their runtime)

### Lowest price

- **1/10th** the cost of third-party Managed Spark (with their runtime)

## 100% compliant with Apache Spark APIs

# Amazon Elasticsearch Service (Amazon ES)

Fully managed, scalable, secure

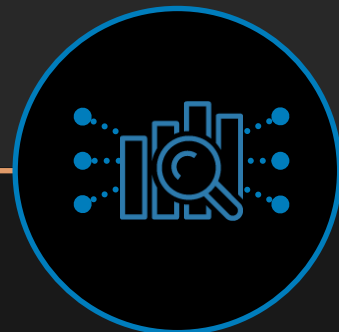
Open source Amazon ES  
APIs, Kibana and Logstash



Open-source Amazon ES  
APIs

Managed Kibana  
Integration with  
Logstash

Fully managed



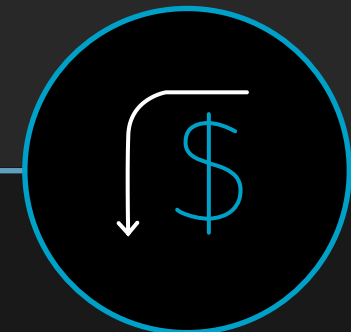
Deploy Amazon ES clusters in  
minutes: simplified hardware  
provisioning, software  
installation/patching, failure  
recovery, backups, and  
monitoring

Scalable, secure,  
and compliant



Scale clusters up/down with a  
single API call or a few clicks  
Secured network isolation with  
VPC, encrypt data at rest and  
in transit  
Compliant: HIPAA, PCI DSS,  
and ISO

Pay only for what  
you use



No upfront fee or usage  
requirement  
Critical features built-in:  
encryption, VPC support,  
24x7 monitoring

# Amazon Athena

Run SQL queries on data in Amazon S3

No infrastructure to manage

Pay per query

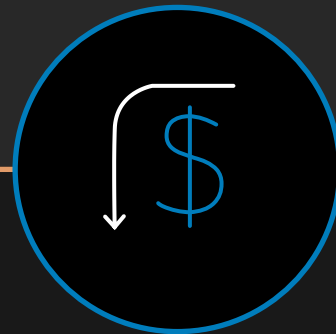
Query instantly



Zero setup cost

Point to Amazon S3 and start querying

Pay per query



Pay only for queries run

Save 30–90% on per-query costs through compression

Open



ANSI SQL

JDBC/ODBC drivers

Multiple formats,  
compression types,  
complex joins & data types

Easy



Serverless:

Zero infrastructure,  
zero administration

Integrated with  
QuickSight

# Amazon Athena: Federated Query (Preview)

Run SQL queries on data spanning multiple data stores



Run SQL queries on relational, non-relational, object, or custom data sources; in the cloud or on-premises

---

Open Source Connectors for common data sources

---

Build connectors to custom data sources

---

Run connectors in AWS Lambda: no servers to manage

# Amazon QuickSight

First BI service with pay-per-session pricing and ML insights



---

Serverless, cloud-powered BI service (no servers to manage)

---

---

Scale from 10s of users to 100s of thousands of users

---

---

Pay only for what you use

- Readers: \$0.30/30 min session with a \$5/user/month max
  - Authors: \$18/month/Author
- 

Integrates with Amazon S3, Amazon Athena, Amazon Redshift, Amazon RDS, Amazon Aurora, and Amazon EMR

# 일반적인 비즈니스 과제들

Predicting price

Employee attrition  
prediction

Scoring sales leads

Credit scoring

Text analytics

**Customer churn analysis**

Detecting fraudulent patterns

Demand forecasting

Assessing loan default risk



# BI분석가가 머신러닝을 활용하는 방법



## Step 1: Find a data scientist

Train, experiment, and build ML models for predicting customer churn



## Step 2: Find a data engineer

ETL, build, and productionize machine learning infrastructure

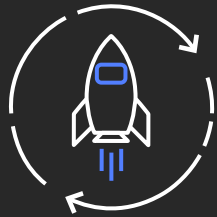


## Step 3: Build reports using data

Analyze and reports on ML predictions

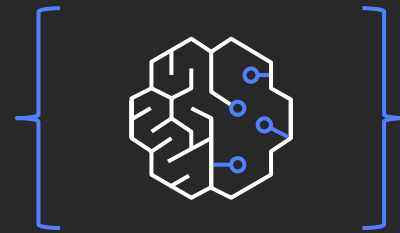
**Takes weeks to months and multiple teams to complete**

# 머신러닝은 알고리즘, 데이터, 파라미터의 복잡한 조합임



Largely explorative  
& iterative

+



Requires broad and  
complete knowledge  
of ML domain

+



Combinatorial



Time consuming, error prone  
process even for ML experts

# 잘못된 선택의 여지가 있음

## DIY model training

- Manual effort by experts
- Fully controlled and auditable
- Experts make tradeoff decisions
- Gets better over time with experience

## Automated ML

- Accessible to experts and non-experts alike
- No visibility into the training process
- Can't make tradeoffs between accuracy and other characteristics

# Amazon SageMaker Autopilot: 더 좋은 선택

## DIY model training

- Manual effort by experts
- Fully controlled and auditable
- Experts make tradeoff decisions
- Gets better over time with experience

## Automated ML

- Accessible to experts and non-experts alike
- No visibility into the training process
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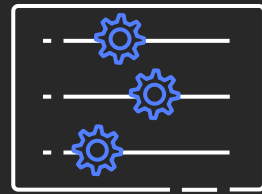
## Amazon SageMaker Autopilot

- Fully automatic model training for experts and non-experts alike
- Candidate generation notebook for control and auditing
- Easy tradeoffs by editing source code
- Learn from your experience
- Visibility into alternative candidate models

# Amazon SageMaker Autopilot: 자동화된 머신러닝



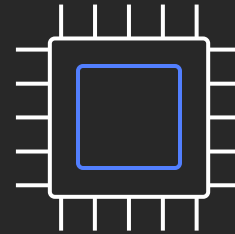
Specify  
prediction target



Regression &  
classification



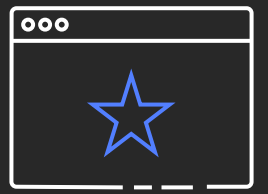
Automated  
feature  
engineering



Automated  
algorithm  
selection & HPO

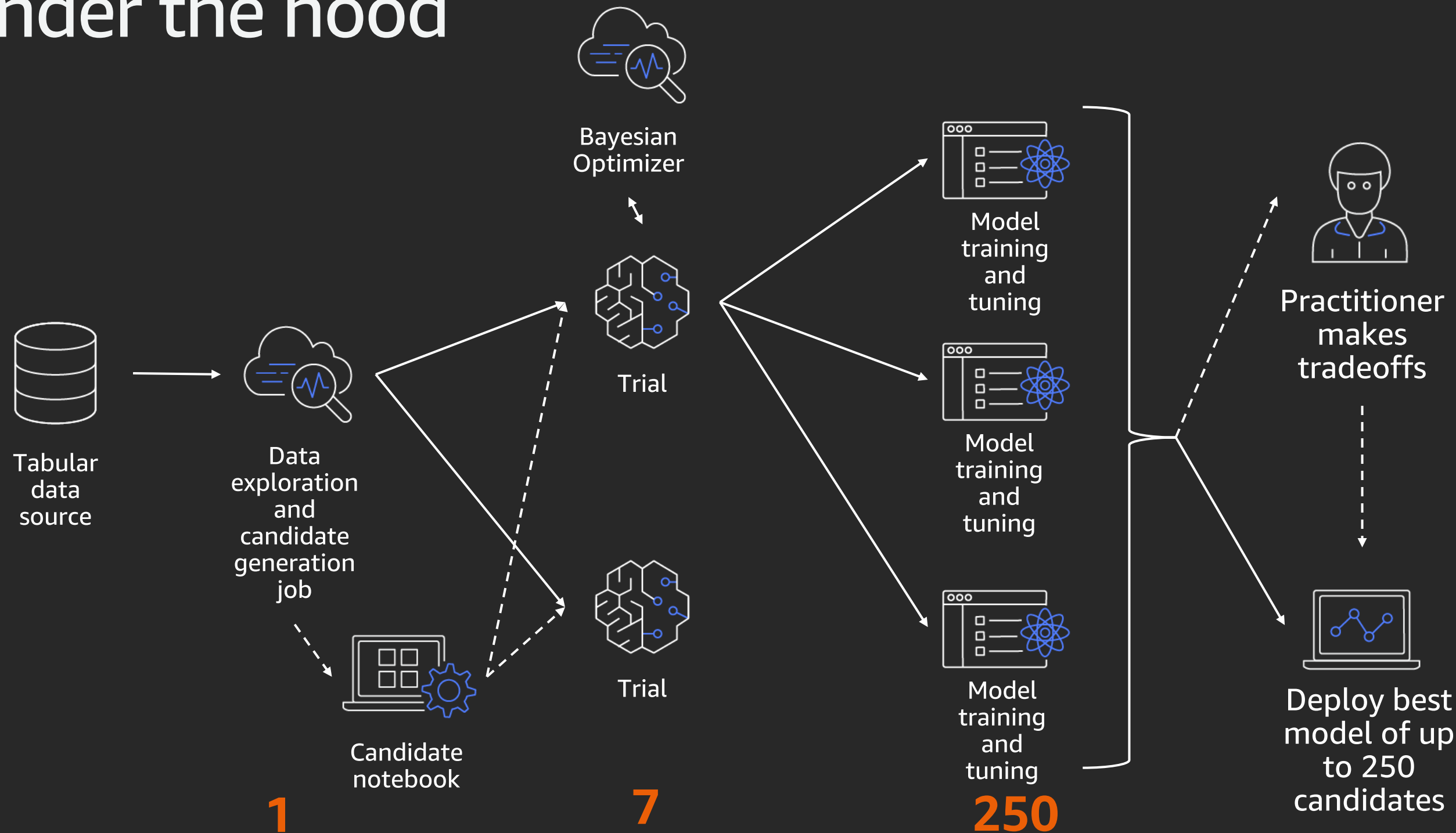


Commented  
notebook  
describing actions



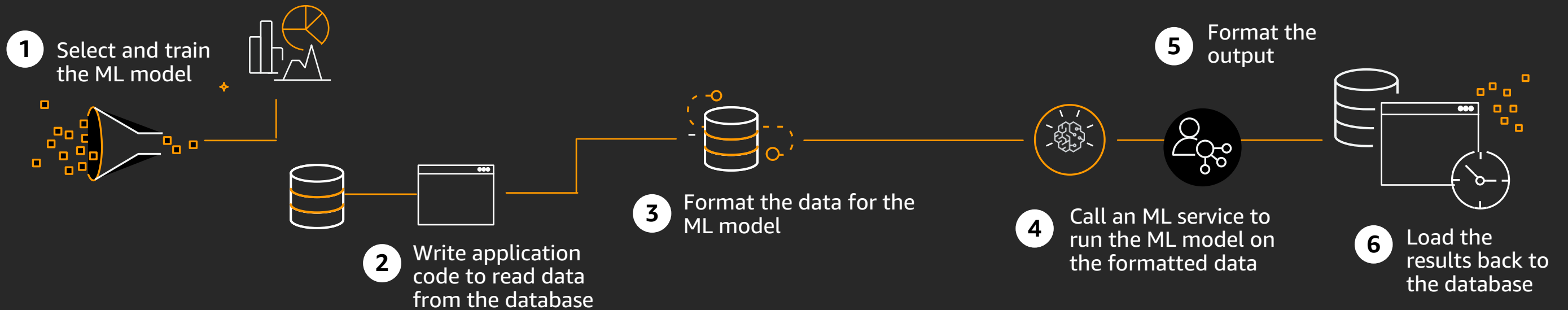
Integrated  
with Amazon  
SageMaker  
Studio

# Under the hood





# 머신러닝을 BI에 포함시키는 것은 쉽지 않음

Typical steps require ML expertise & manual work



# ML predictions in Amazon QuickSight (preview)

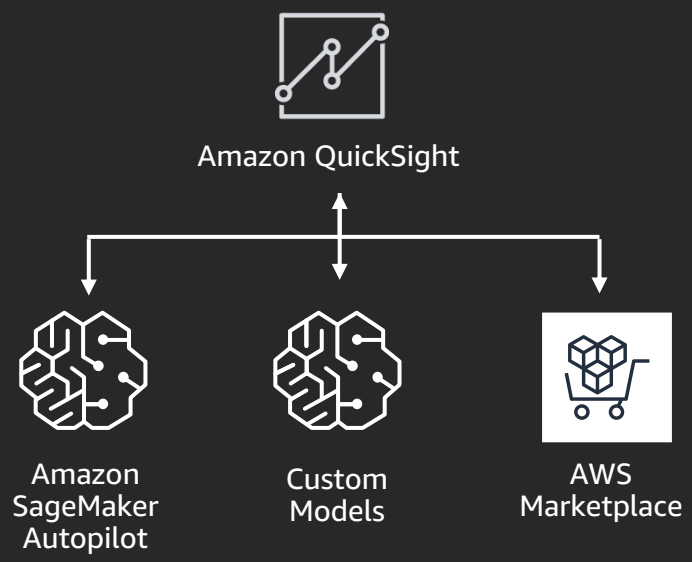
**1 Connect to any data:**  
Data lakes, SQL engines, 3<sup>rd</sup> party applications, and on-premises databases



### AWS/On-premise data sources

• Excel	• Amazon Redshift	• Salesforce
• CSV	• RDS	• Square
• MySQL	• S3	• Adobe Analytics
• Postgre SQL	• Athena	• Jira
• Maria DB	• Aurora	• ServiceNow
• Presto	• Amazon EMR	• Twitter
• Spark	• Snowflake	• Github
• SQL Server	• Teradata	

**2 Select an ML model:**  
Create models with Amazon SageMaker Autopilot, choose from existing custom models, and packaged models from AWS Marketplace.



**3 Visualize and share:**  
Analyze results, create visualizations, build dashboards / email reports, and share to business stakeholders







Build predictive dashboards in hours with point-and-click, no coding required

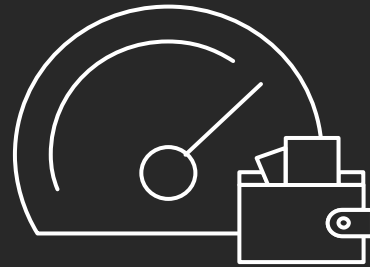
# AWS를 선택해야 하는 이유!

Fastest way to get answers from all your data to all your users



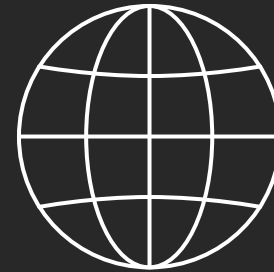
Easiest to build data lakes at scale

- AWS Lake Formation
- Redshift Data Lake Export
- Redshift Federated Query
- Query Federation for Amazon Athena
- Data Streaming for AWS Glue



Best performance at lowest cost

- AQUA for Redshift
- RA3 for Redshift
- Redshift Materialized Views
- UltraWarm Storage Tier for Amazon ES
- Performance improvements for Spark in Amazon EMR



Most comprehensive and open

- Amazon AWS Data Exchange
- Amazon EMR on AWS Outposts
- Record-level insert/updates for Amazon EMR
- ML in Amazon Athena
- ML in Amazon QuickSight



Most secure

- Amazon Westeros
- Amazon Macie
- AWS Lake Formation

여러분의 소중한 피드백을 기다립니다!  
강연 평가 및 설문 조사에 참여해 주세요.

# 감사합니다