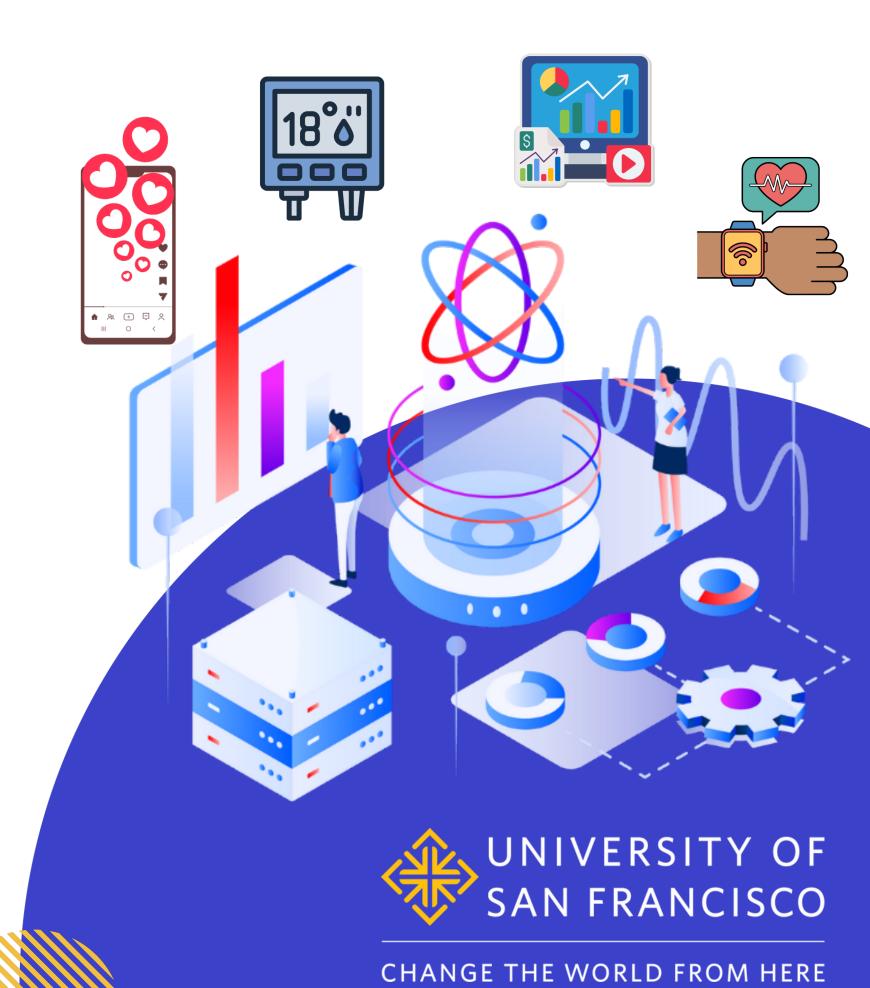
Data Stream Processing

Day 2. Kafka Basics

+ Diane Woodbridge, PH.D



Announcement

Individual Assignment - Due on Oct 26th

- Project Ideation
- Deliverable : Submit a 2-4 page slide
 - Project Idea and Goal
 - Data Source and Stream Design
 - Producers
 - Consumers and Analysis Goals

Office Hours

- Tue 9 10 AM (Virtual)
- Thu 5 5:20 PM (In Person)

Review

Intro of Data Stream Processing
Batch Processing vs. Stream Processing
Stream Processing Applications

- Spotify Data Stream
- Surveillance Camera Data Stream
- Basketball Play Data Stream

Messaging System and Pub/Sub Paradigm Kafka Architecture

- Producer
- Consumer
- Topic
 - Messages
- Kafka Cluster
 - Partitions
 - Replications

Confluent

Messaging System and Pub/Sub Paradigm

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Messaging System

Why messaging systems?

- Decouple data producers and consumers.
- Handle bursts of data gracefully.
- Enable scalable, fault-tolerant pipelines.

Example:

Web servers → Kafka → Analytics service → Database

Pub-Sub Paradigm in Messaging System

Pub-Sub Paradigm

- A communication pattern where producers (publishers) send messages to topics, and consumers (subscribers) receive messages from those topics — decoupled in time and logic.
- Benefits
 - Decoupling: Publishers and subscribers operate independently.
 - Scalability: Multiple producers/consumers can produce/consume in parallel.
 - Asynchronicity: Real-time data flow without direct request—response.
 - Fault tolerance: Messages can persist even if consumers are temporarily offline.

Apache Kafka

A high-throughput, fault-tolerant, distributed messaging system designed for real-time data pipelines and stream processing.

- In a pub/sub system, Kafka acts as a broker, that stores data and handles requests.
- Written in Scala, and Java.



"I thought that since Kafka was a system optimized for writing using, a writer's name would make sense. I had taken a lot of lit classes in college and liked Franz Kafka."

- Jay Kreps

Messaging System and Pub/Sub Paradigm

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Kafka

Architecture

Message

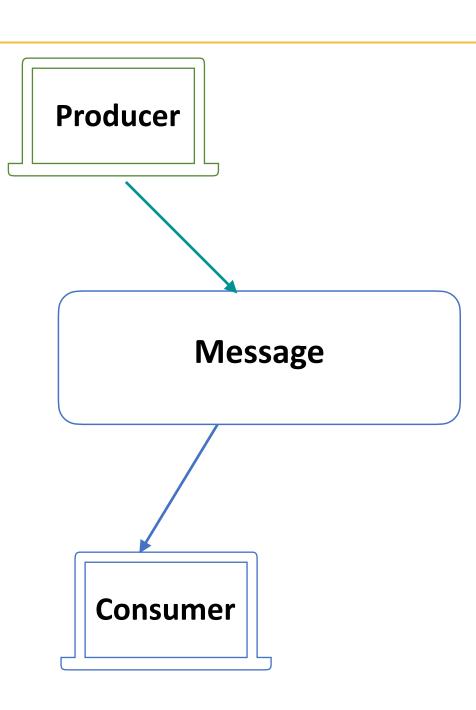
- The fundamental unit of data in Kafka, also known as a record.
- Represents a single piece of data using a key, a value, and a timestamp, and optionally, headers.

Producer

Client applications that publish (write) messages

Consumer

- Applications or systems that subscribe to (read and process) these messages
- In Kafka, producers and consumers are fully decoupled and agnostic of each other, which is a key design element to achieve the high scalability.



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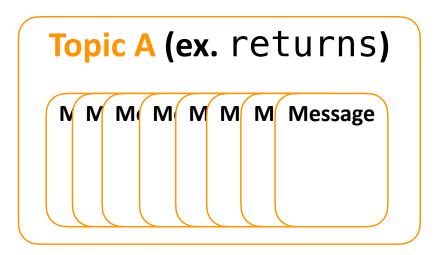
Kafka

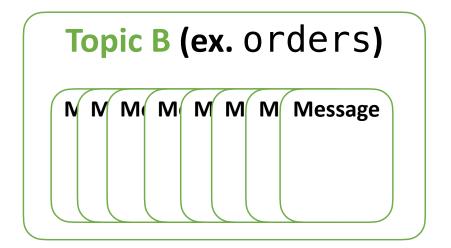
Architecture

- Messages
 - The fundamental unit of data in Kafka.
 - Represents a single piece of data using a key, a value, and a timestamp, and optionally, headers.

Topics

- A category or feed name for organizing and storing messages in Kafka.
- Mechanism for organizing and storing messages in Kafka.
 - Messages are the actual data units that are contained within topics.





Kafka Topics - Naming Conventions

Recommended Practices

- Lowercase only: Use lowercase letters for consistency.
- Descriptive: Name should reflect what the topic contains.
 - Example: sales.orders.transactions
- Hierarchical naming: Use dot notation to indicate structure.
 - Example: department.service.entity, sales.orders.transactions
- Environment prefix/suffix: Differentiate dev/test/prod if sharing clusters.
 - Example: dev_sales_orders_transactions
- Versioning: Add version numbers when schemas evolve.
 - Example: sales.orders.transactions.v1

In CAP theorem, what are C, A and P?

Consistency, Atomic, Partition Tolerance

Concurrency, Availability, Persistency

Consistency, Availability, Partition Tolerance

Concurrency, Atomic, Partition Tolerance

In CAP theorem, what are C, A and P?

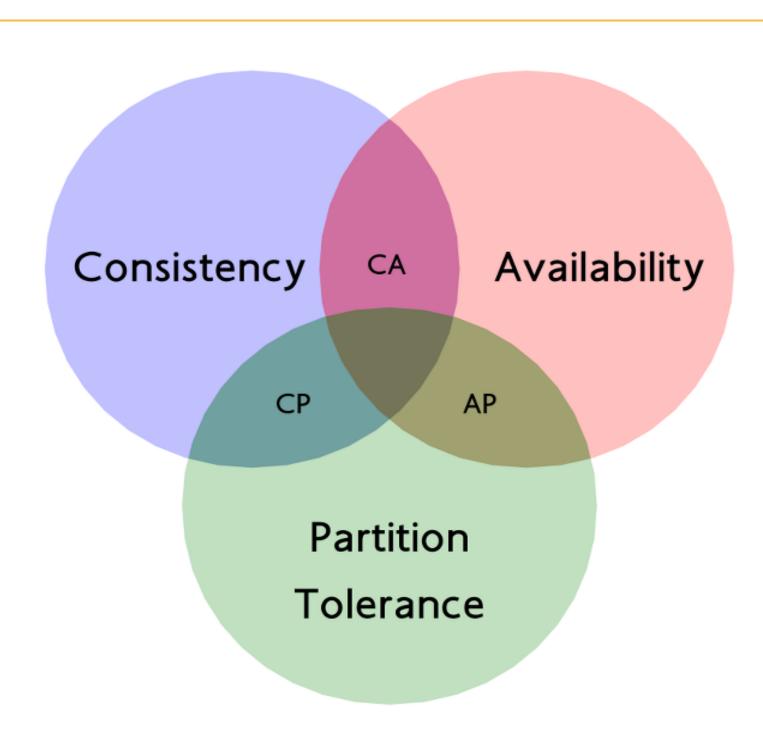


In CAP theorem, what are C, A and P?



Recap: CAP Theorem

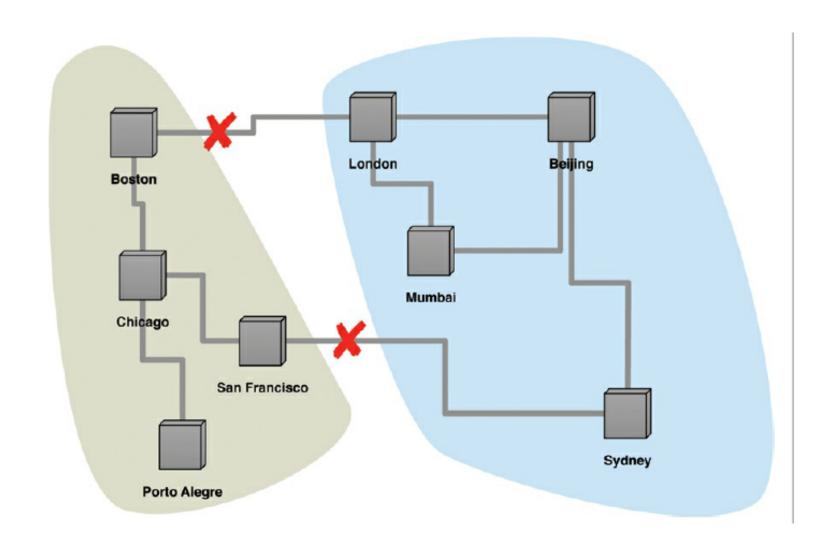
- CAP Theorem
 - 1. Consistency
 - All nodes have the most recent data.
 - 2. Availability
 - Every request received by a non-failing node must return a response.
 - 3. Partition Tolerance
 - Clusters can survive from communication breakages in the cluster.
 - → You can only get two.



Recap: CAP Theorem

- CAP Theorem
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ACID addresses an individual node's data consistency. CAP addresses cluster-wide data consistency .



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Kafka

Architecture

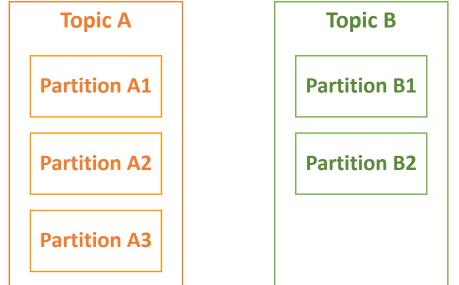
- Topic A category or feed name for organizing and storing messages in Kafka.
- Partition A partition is a fundamental unit of parallelism and scalability within a Kafka topic.
 - Each topic is divided into one or more partitions, and each partition is an ordered, immutable sequence of messages.
 - Using the hash value of the key or, if no key is available, uses a round-robin mechanism.
 - When an message is published to a topic, it is appended to one of its partitions.
- Kafka Cluster A distributed system consisting of one or more Kafka servers, called brokers.
 - These brokers store the partitions of topics and serve requests from producers and consumers. A cluster provides the underlying infrastructure for storing and managing Kafka topics and their partitions, ensuring data availability and fault tolerance through replication.

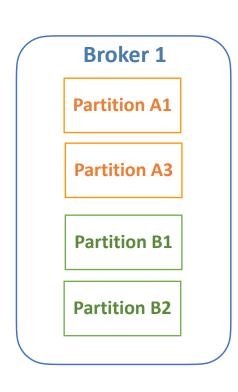


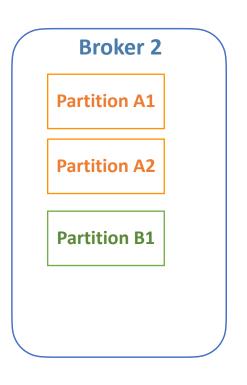


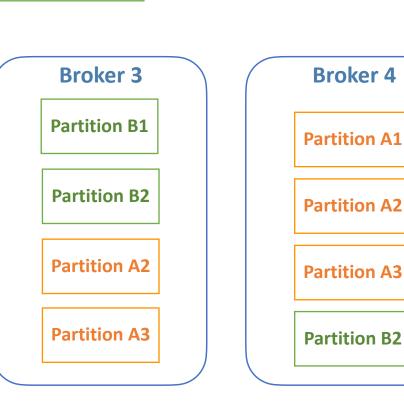
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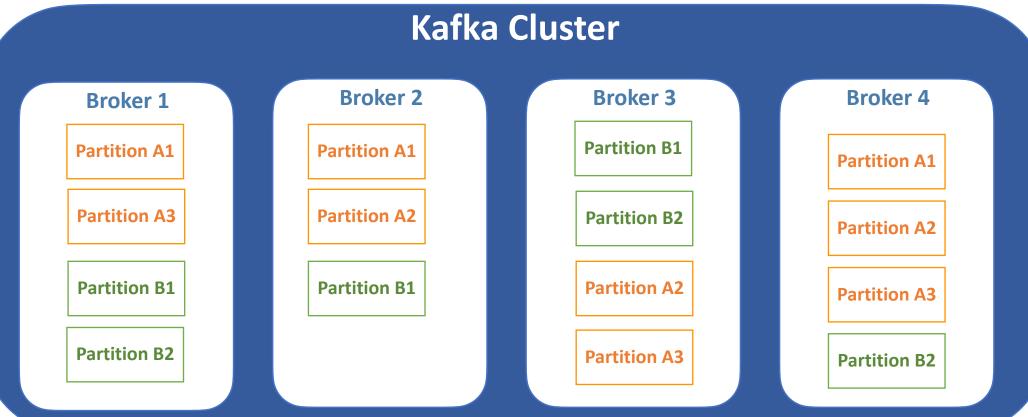






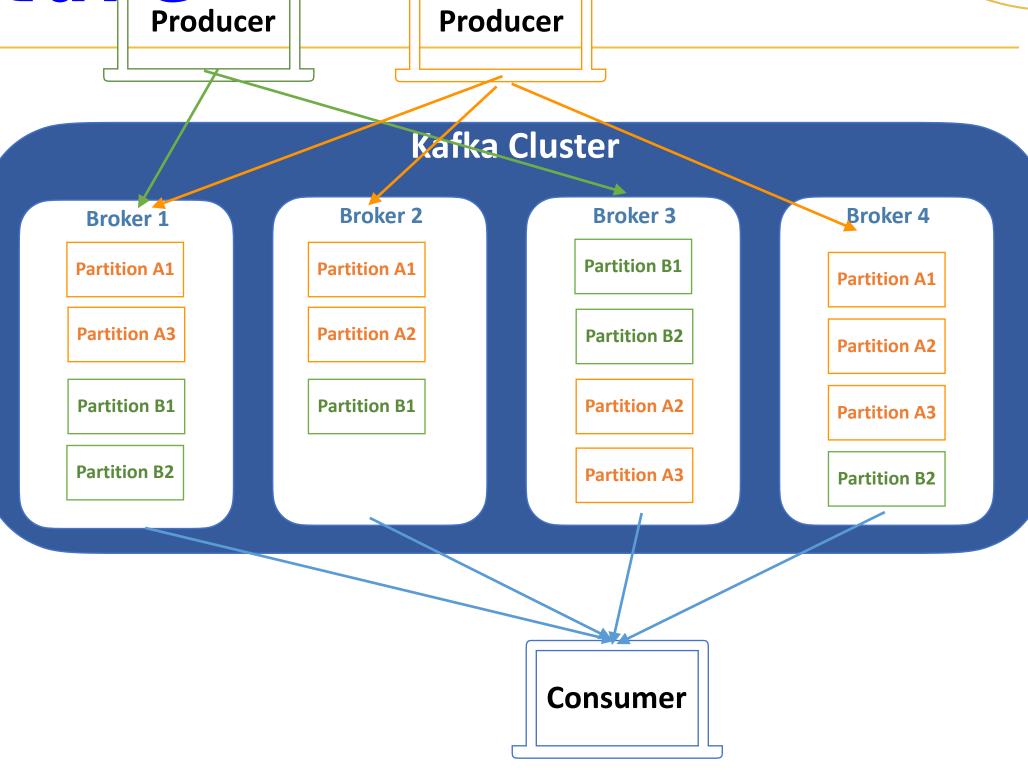
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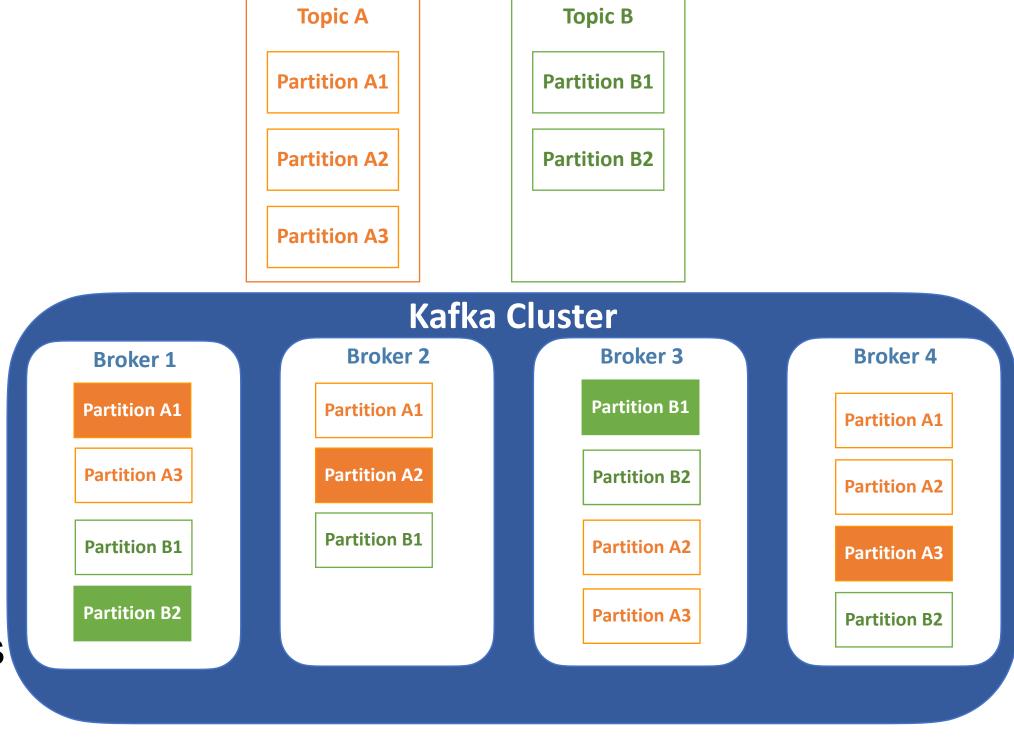
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Kafka Partitions

Partitions: Fundamental unit of parallelism in Kafka.

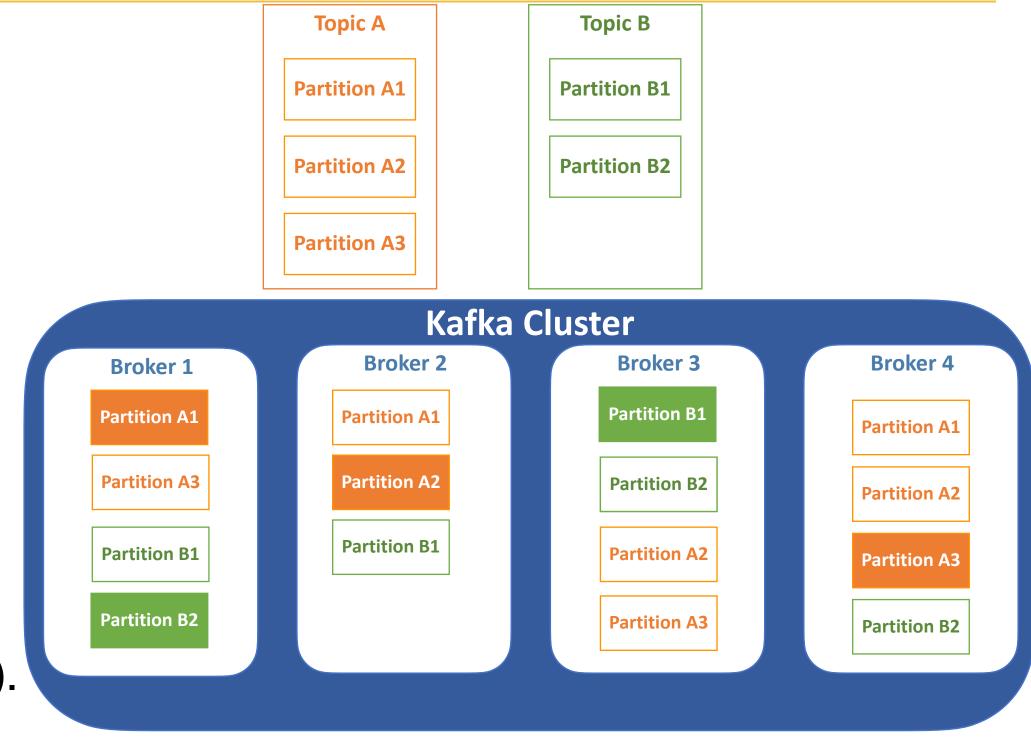
- Each topic is divided into multiple partitions, which enables distributed data processing.
- Replicated across brokers for fault tolerance and high availability.
- Each partition has:
 - One leader (handles reads/ writes).
 - One or more followers (replicas for backup, handles read).



Kafka Partitions

Partition Characteristics

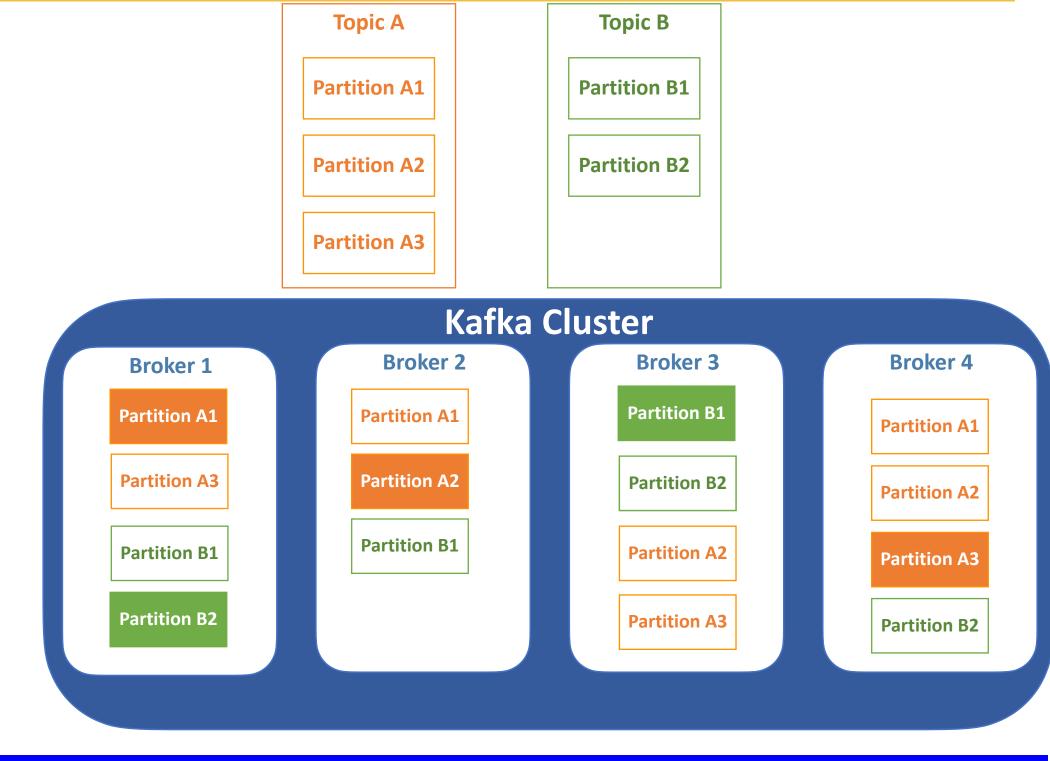
- Distributed: Partitions are spread across multiple brokers.
- Replicated: Provides redundancy. Copies exist on multiple brokers.
- Ordered: Message order is guaranteed only within a partition, not across partitions.
- Offset: Each message within a partition has a unique offset ID (used for tracking and recovery).



Kafka Partitions

Benefits

- Producer Scaling: Producers can write to multiple partitions simultaneously → Parallel ingestion.
- Consumer Scaling: Multiple consumers can read from different partitions concurrently
 → Higher throughput.
- Data Distribution: Data is allocated based on a partition strategy (e.g., hash, roundrobin).



Kafka Topics - Partitioning Topics

Choosing the Number of Partitions

- The optimal number of partitions depends on workload and scalability goals.
 - According to Confluent's best practices:
 - Over-partition to anticipate future growth.
 - Avoid too many partitions per broker may cause overhead.
 - Continuously monitor metrics and adjust configurations as needed.

Estimating from Throughput Needs

- To determine partition count:
 - Compare producer throughput and consumer throughput.
 - Ensure that neither producers nor consumers are bottlenecked.
 - Example Calculation:
 - Desired Throughput: 200 MB/s
 - Producers: 4 producers × 15 MB/s each
 - Consumers: 6 consumers × 20 MB/s each
 - Producers need 3.33 partitions, consumers 1.67 partitions

 Use 4 partitions (max of both).

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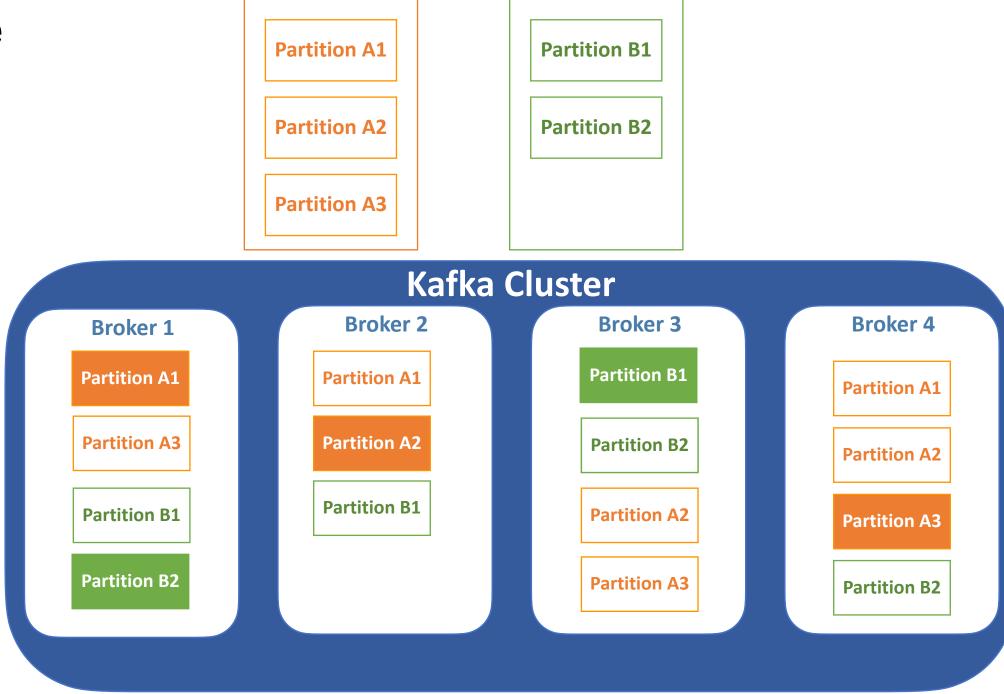
Kafka - Data Replication

Goal: Prevent data loss and ensure reliability in case of broker failure.

Replication Factor: Defines how many copies of each partition exist. Generally recommended to have a factor of 3 for quorum.

 Can't exceed number of brokers.

Trade-off: More replicas provides greater fault tolerance, but higher resource usage (I/O, bandwidth, storage).



Topic B

Topic A

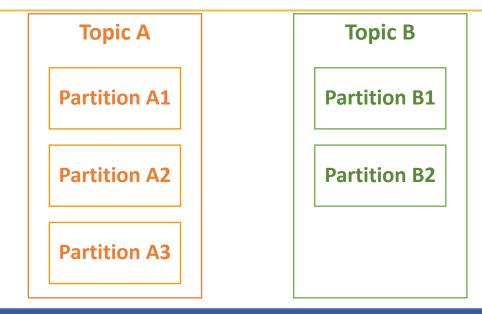
Kafka - Data Replication

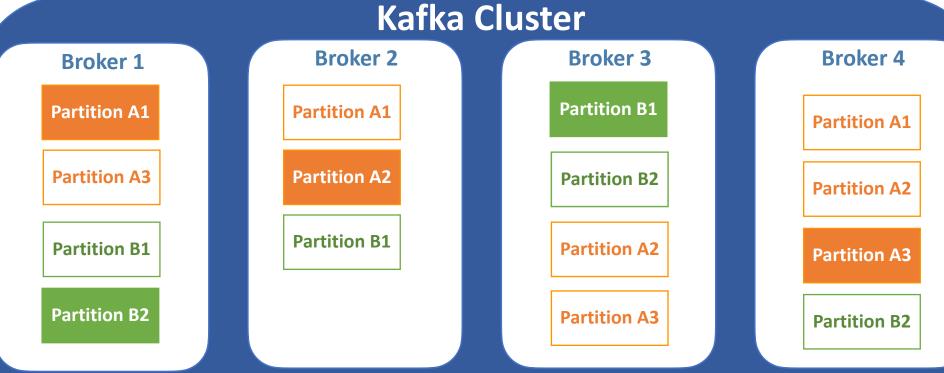
Leader and Follower

- Leader
 - Handles all read/write requests.
 - Ensures data integrity and durability.
- Followers
 - Continuously replicate data from the leader.
 - Stay in sync to take over if the leader fails.

Automatic Failover

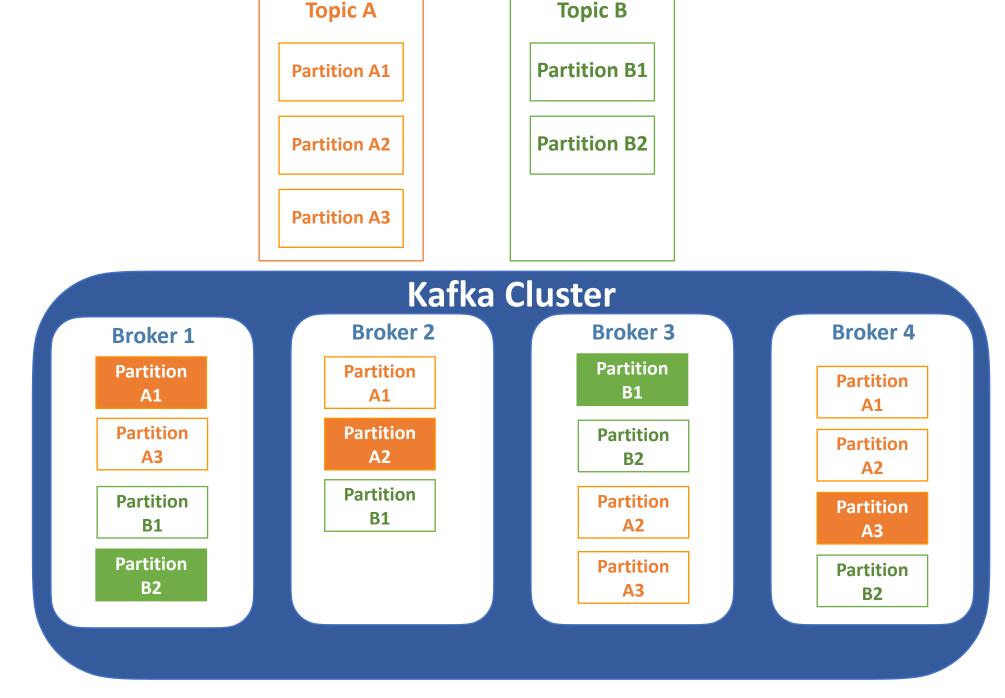
- If the leader goes down, a follower is promoted to leader → minimal downtime.
- * Balancing replication and resource cost is key for production environments.





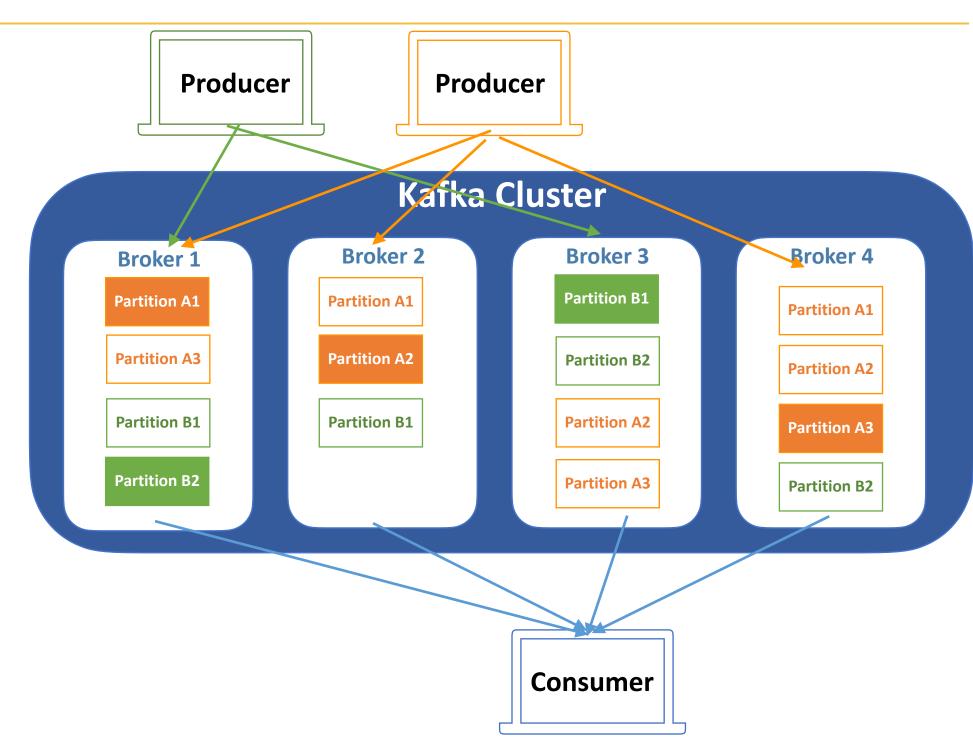
In this example,

- There are 4 brokers in the Kafka cluster.
- Each partition has a replication with a replica factor of 3 for quorum.
 - For each partition, it has a partition leader for handling all read and write requests for a given partition, acting as the primary point of contact for producers and consumers.
 - The followers replicate the leader.
 If the leader fails, one of the followers will automatically become the new leader.



In this example,

- Producers send messages to
 - Broker 1 for Partition A1, Broker 2 for Partition A2, and Broker 4 for Partition A3.
 - Broker 1 for Partition B2, and Broker 3 for Partition B1.



Note:

While the leader typically handles all reads, Kafka introduced the ability for consumers to read from follower replicas in version 2.4.

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Confluent

Data streaming platform built around Apache Kafka, created by the original Kafka developers at LinkedIn.

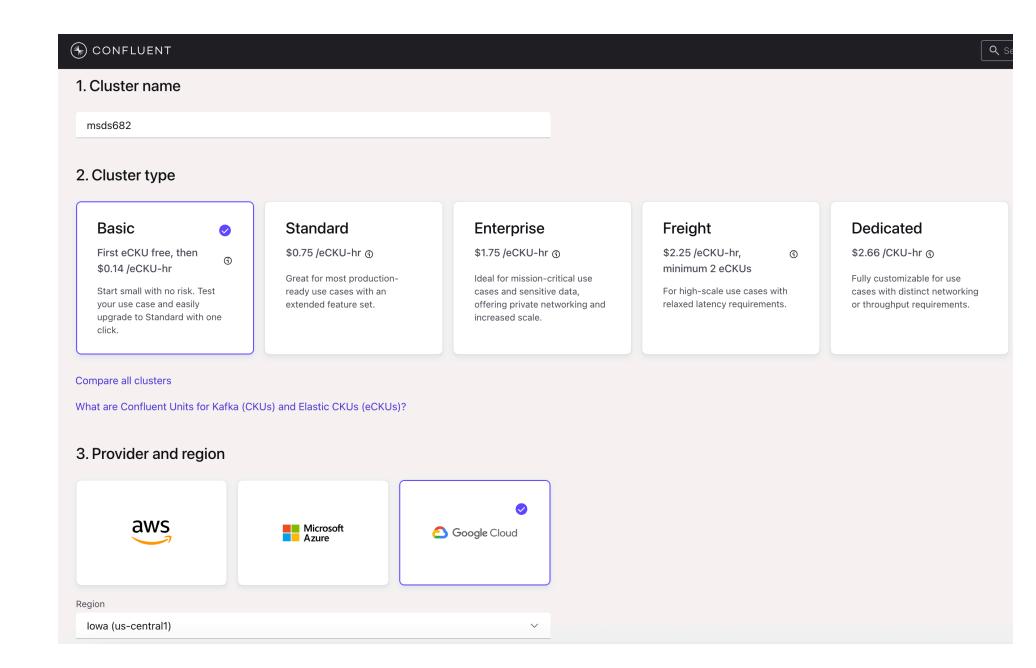
- Key Components
 - Confluent Platform: A self-managed distribution of Kafka for private deployment with additional enterprise features including schema registry, ksqIDB (streaming SQL engine), Kafka Connect connectors, REST Proxy, etc.
 - Confluent Cloud: A fully managed Kafka service, hosted on AWS, GCP, or Azure.

Data streaming platform built around Apache Kafka, created by the original Kafka developers at Linkedln.

- Benefits
 - Simplified Kafka setup and management: No need to manage broker nodes and offers a web-based control center for monitoring cluster health, lag, and throughput.
 - Improved reliability: Automatic scaling
 - Built-in connectors: 120+ pre-built Kafka Connect connectors for databases, cloud services, and data warehouses and easy to integrate.
 - Schema management: Schema registry ensures consistent data formats across producers and consumers.

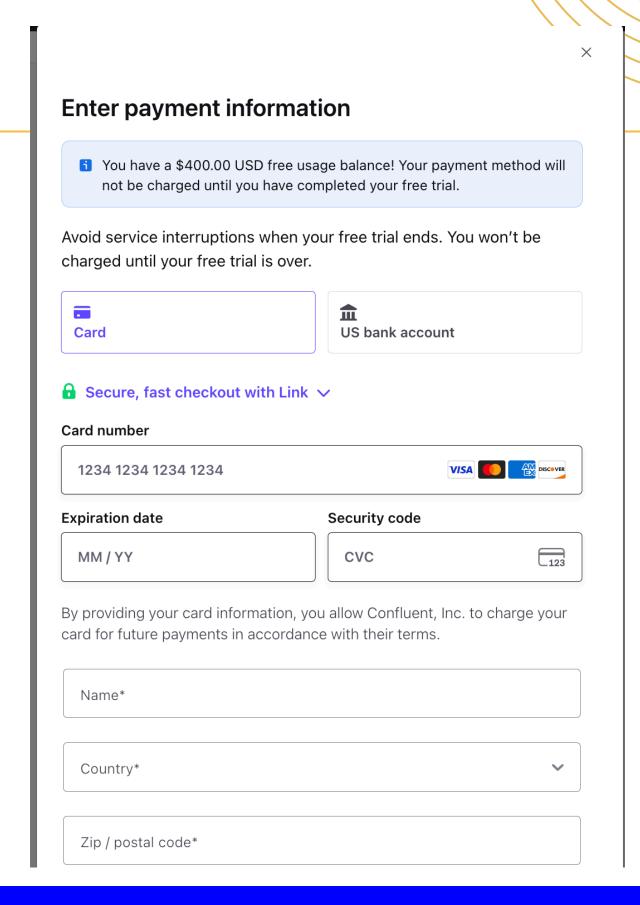
Account Creation

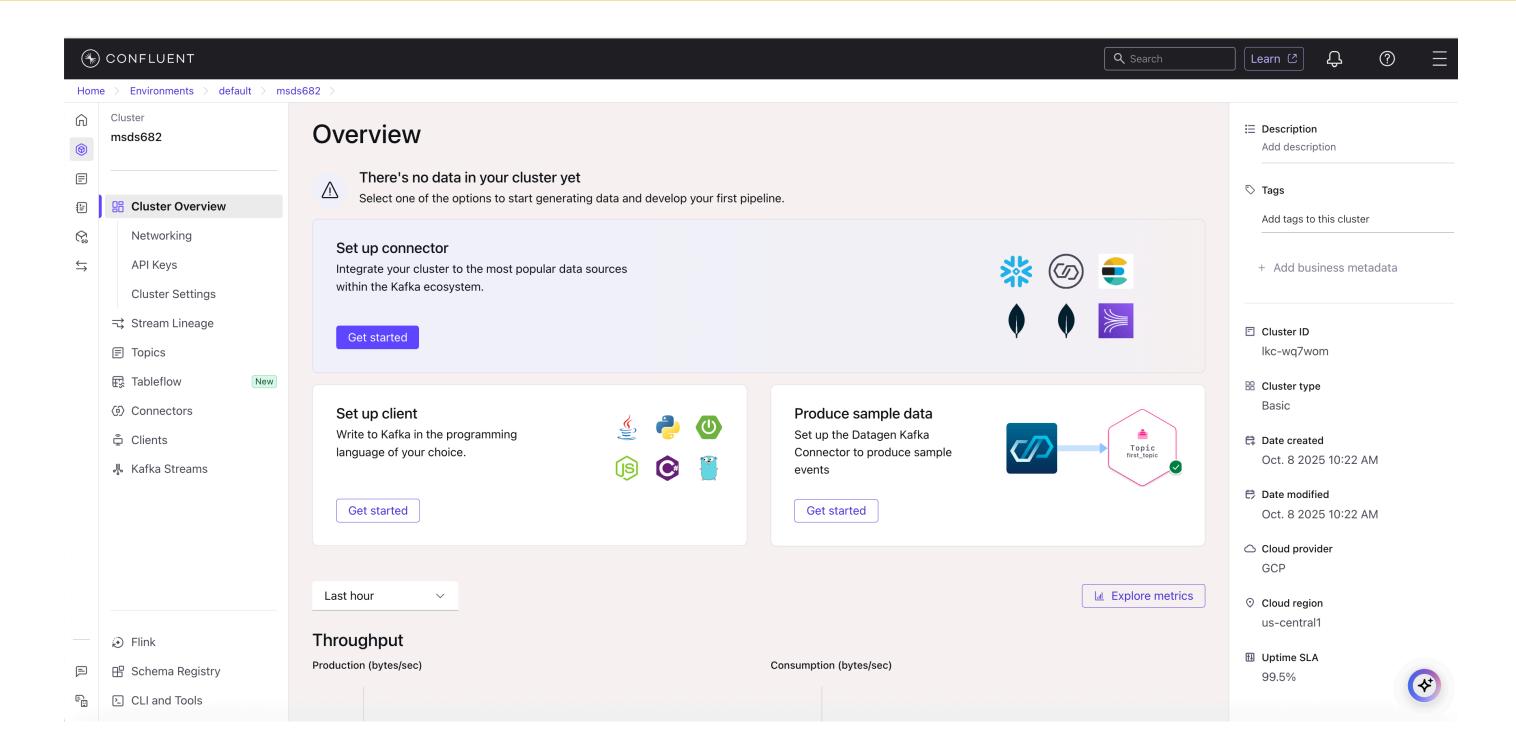
- Make sure to use the \$400 free credits (first month) before using your GCP credits.
 - Go to https://www.confluent.io/
 confluent-cloud/tryfree/
 - Choose Basic cluster, and GCP (us-central1)



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Confluent

Create a cluster, topic, and produce/subscribe messages.

Confluent CLI

The Confluent command-line interface (CLI) enables developers to manage both Confluent Cloud and Confluent Platform.

- Installation
- \$ brew install confluentinc/tap/cli
- Login
- \$ confluent login

Create a Confluent Cloud environment

- Confluent Cloud environment contains Kafka clusters and deployed components, such as Connect, ksqlDB, and Schema Registry
- \$ confluent environment create environment_name -o json
 - This will return ID, and name of the environment

Activate the environment to use to create a cluster

\$ confluent environment use environment_id

```
"is_current": false,
"id": "env-102dw3",
"name": "msdse682",
"stream_governance_package": "ESSENTIALS"
```

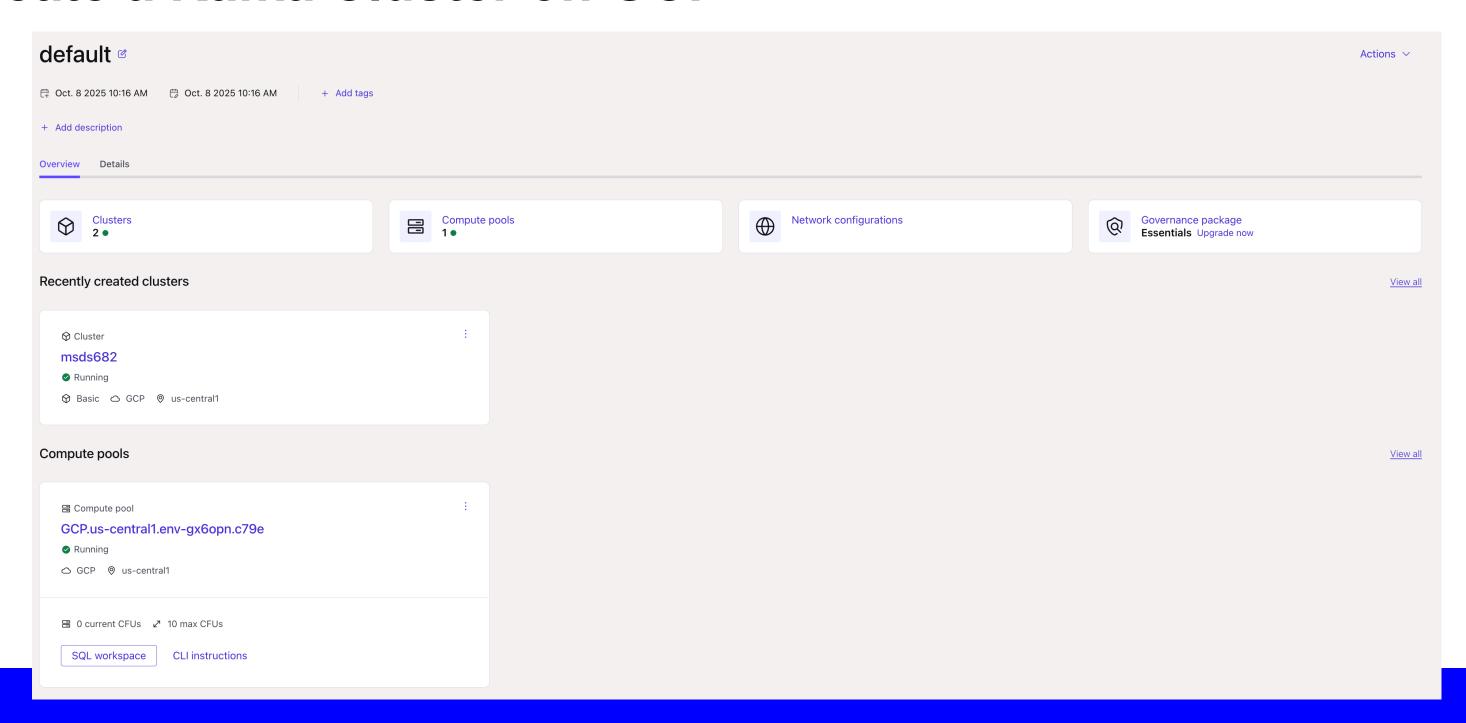
Create a Kafka Cluster on GCP

```
$ confluent kafka cluster create cluster_name
--cloud gcp --region us-west1
```

This will return ID, name, and endpoints of the Kafka cluster

```
false
Current
                       lkc-yp2gwj
ID
                       day2
Name
                       BASIC
Type
Ingress Limit (MB/s)
                       250
Egress Limit (MB/s)
                       750
                       5 TB
Storage
Cloud
                       qcp
Region
                       us-west1
                       single-zone
Availability
                       PROVISIONING
Status
                       SASL_SSL://pkc-lgk0v.us-west1.gcp.confluent.cloud:9092
Endpoint
                       https://pkc-lgk0v.us-west1.gcp.confluent.cloud:443
REST Endpoint
```

Create a Kafka Cluster on GCP



Create an API Key/Secret for authorization to produce topics

- \$ confluent api-key create --description "MSDS682
 credentials" --resource cluster_id -o json
 - This will return a json string Make sure to save it

Specify the API Key for the cluster to use

\$ confluent api-key use API_KEY --resource cluster_id

Create a topic and produce events

- Choose a cluster to use
- \$ confluent kafka cluster use cluster_id
- Create a Kafka topic within the cluster
- \$ confluent kafka topic create topic_name
- Start producing messages to the topic
- \$ confluent kafka topic produce topic_name
 - The CLI waits for data, and you can type on the terminal.

Consume messages from topic.

- In a separate terminal, read the message
 - Optional parameter: -b : read from the beginning
 - \$ confluent kafka topic consume topic_name [-b]
 - While keep producing messages on the producer's terminal, see what is happening on the consumer's terminal.

Clean up

- Delete topics
 - \$ confluent kafka topic delete topic_name
- Delete clusters
 - \$ confluent kafka cluster delete cluster_id
- Delete environment
 - \$ confluent environment delete environment_id

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Create a cluster, topic, and produce/subscribe messages.

Your feedback is important and will help shape the rest of the course. What aspects of the course have been most helpful? Do you have suggestions for changes that could make the course more engaging or effective for you?

Nobody has responded yet.

Hang tight! Responses are coming in.

Reference

Apache Kafka, https://kafka.apache.org/documentation/ Kafka Tools, Confluent, https://docs.confluent.io/kafka/operations-tools/kafka-tools.html

Confluent Documentation, https://docs.confluent.io/
Some of the lecture materials are from Jeremy Gu, a former instructor of MSDS682.

https://pandaisfast.github.io/msds682-fall2023-data-streaming