UNIVERSITY OF CENTRAL MISSOURI®

DSA 5600 – NoSQL Database Systems
Section 3: Apache Cassandra

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What is Cassandra?

•**Apache Cassandra** is a **distributed, NoSQL database** designed for handling large volumes of structured data across many servers without a single point of failure.

•Originally developed at **Facebook** to power their inbox search, later open-sourced and adopted by the **Apache Software Foundation**.

•**Key Characteristics:**

- **Scalability:** Easily scales horizontally by adding more nodes.
- **High Availability:** No single point of failure; data is replicated across multiple nodes.
- **NoSQL Model:** Uses a schema-less, column-family-based storage model.
- **Optimized for Write-Intensive Workloads:** Handles high-speed inserts and updates efficiently.
- **Eventual Consistency:** Ensures availability over strict consistency (CAP theorem).

•**Used By:** Netflix, Twitter, eBay, Uber, and many more for high-performance, globally distributed applications.

Key Features of Cassandra (1)

1. **Distributed & Decentralized Architecture**
   - No master-slave structure; all nodes are equal (peer-to-peer model).
   - Ensures high availability and fault tolerance.
2. **Horizontal Scalability**
   - Easily add more nodes to handle increasing data loads.
   - Supports massive datasets with linear scalability.
3. **High Availability & Fault Tolerance**
   - Data is replicated across multiple nodes.
   - If a node fails, another node takes over without downtime.
4. **Tunable Consistency**
   - Supports different levels of consistency (`ONE` , `QUORUM` , `ALL`).
   - Balances availability vs. consistency based on application needs.

Key Features of Cassandra (2)

5. **Optimized for High Write Performance**
    - Designed for fast inserts and updates with **log-structured storage**.
    - Ideal for real-time big data applications.
6. **Flexible Schema (NoSQL Model)**
    - Uses a column-family-based data model.
    - Allows dynamic addition of columns without altering the schema.
7. **Built-in Data Replication**
    - Automatic replication across multiple data centers.
    - Ensures disaster recovery and global accessibility.
8. **Support for Multi-Datacenter Deployments**
    - Allows replication across geographically distributed data centers.
    - Improves performance for globally distributed users.

When to use Cassandra?

- **High Availability & Fault Tolerance** – No single point of failure, automatic failover.
- **Massive Scalability** – Handles large datasets and high transaction volumes.
- **Fast Write Performance** – Optimized for real-time applications with heavy writes.
- **Global Distribution** – Replicates data across multiple regions/data centers.
- **Schema Flexibility** – No rigid structure; adaptable to dynamic data models.

Cassandra vs. Relational Database (RDBMS)

Feature	Cassandra (NoSQL)	Relational DB (SQL)
Architecture	Distributed, decentralized	Centralized or master-slave
Scalability	Horizontal (add more nodes)	Vertical (upgrade server)
Performance	Optimized for fast writes	Optimized for structured transactions
Schema	Flexible, schema-less	Fixed schema, predefined tables
Consistency	Eventual consistency (CAP theorem)	Strong consistency (ACID transactions)
Use Case	Large-scale, real-time applications	Traditional transactional applications

✔ **Choose RDBMS** when you need strict consistency (e.g., banking, inventory).

✔ **Choose Cassandra** when you need distributed, highly available systems (e.g., real-time analytics, IoT, messaging apps).

Cassandra vs. NoSQL Database

Feature	Cassandra	MongoDB	HBase
Data Model	Wide-column store	Document store	Wide-column store
Scalability	Highly scalable	Moderate scalability	Good for large-scale batch processing
Write Performance	High	Moderate	High
Read Performance	Moderate	High (indexed JSON)	High (batch reads)
Best Use Case	High-write workloads	Document-based storage	Large-scale batch analytics

- ✔ **Choose MongoDB** if you need flexible JSON document storage.
- ✔ **Choose HBase** for **big data batch processing** (Hadoop integration).
- ✔ **Choose Cassandra** for high-throughput, real-time applications with global scalability.

Architecture Overview: Nodes, Partitions, Replication

🌎 Cassandra's Distributed Architecture

- ✅ **Peer-to-Peer Model** – No master-slave setup; all nodes are equal.
- ✅ **High Availability & Fault Tolerance** – Data is automatically distributed across nodes.
- ✅ **Ring-Based Architecture** – Nodes are logically arranged in a circle to balance load.

🖥️ Nodes & Partitions: How Cassandra Stores Data

- 🔹 **Node** – A single machine in the Cassandra cluster.
- 🔹 **Partitioning** – Data is divided into **partitions** using a **Partition Key**, ensuring even distribution.
- 🔹 **Data Centers & Clusters** – Nodes are grouped into **data centers** for geographical redundancy.

Architecture Overview: Nodes, Partitions, Replication

🔁 **Replication: Ensuring Reliability**

- **Replication Factor (RF)** – Defines how many copies of data exist in the system.
- **RF = 3** → Each piece of data is stored on **3 different nodes** for redundancy.
- **Replication Strategies:**
  - **SimpleStrategy** – Used for single data centers.
  - **NetworkTopologyStrategy** – Used for multi-region data replication.

⚖️ **The CAP Theorem & Cassandra's Trade-offs**

- Cassandra prioritizes:

✅ **Availability** – Always accessible, even if some nodes fail.

✅ **Partition Tolerance** – Can handle network failures without downtime.

❌ **Consistency (Eventual Consistency)** – Data updates propagate across nodes over time.

- Supports **Tunable Consistency** – Choose between stronger or weaker consistency based on needs.

Cassandra's Data Model

- **How Cassandra's Data Model is Different from SQL**

- No **strict schemas**, **foreign keys**, or **JOIN operations** like in relational databases.
- Optimized for **scalability and fast queries**, rather than **complex relationships**.
- Uses **denormalization** to store data **based on query patterns** instead of strict normalization.

- **Key Components of Cassandra's Data Model**

- ☑ **Keyspaces** – The highest-level container, similar to a database in SQL.
- ☑ **Tables (Column Families)** – Stores data but **does not enforce a strict schema**.
- ☑ **Primary Keys** – Unique identifier that **determines data distribution**.

Key Features of Cassandra

- **Partition Keys: Data Distribution in Cassandra**
  - The **Partition Key** decides **which node stores the data**.
  - Helps distribute data **evenly across the cluster**.
  - Ensures **fast and scalable queries** by keeping related data together.
- **Clustering Columns: Organizing Data Within Partitions**
  - Defines **how data is sorted inside a partition**.
  - Enables efficient **ordering and filtering** within a partition.
- **Denormalization: Why Cassandra Avoids Joins**
  - Data is **duplicated across tables** to **avoid costly JOIN operations**.
  - Ensures **faster queries** by storing **pre-aggregated** data.

Creating a Keyspace

```
CREATE KEYSPACE store
WITH replication = {'class': 'SimpleStrategy', 'replication_factor': 3};
```

- Keyspace `store` created with SimpleStrategy replication.
- Replication Factor = 3, meaning data is stored on three different nodes for redundancy.

Creating a Table with Primary and Clustering Keys

```
CREATE TABLE store.products (
  product_id UUID PRIMARY KEY,
  name TEXT,
  price DECIMAL,
  stock INT
);
```

- *product_id* is the Partition Key, which decides which node stores the data.
- The table is schema-flexible, allowing new columns to be added dynamically.

Inserting and Querying Data

```
INSERT INTO store.products (product_id, name, price, stock)
VALUES (uuid(), 'Laptop', 1200, 50);
```

```
SELECT * FROM store.products;
```

CRUD Operations in Cassandra

- **Create** – Insert new data into a table.
- **Read** – Retrieve data using optimized queries.
- **Update** – Modify existing records.
- **Delete** – Remove data while maintaining system efficiency.

Query Data with CQL

- **Basic Querying with SELECT:**

```
-- Retrieve all records
SELECT * FROM store.products;

-- Retrieve specific columns
SELECT name, price FROM store.products;

-- Retrieve a specific product by Primary Key
SELECT * FROM store.products WHERE product_id = <some-uuid>;
```

Query Data with CQL

- **Filtering Data:**

```
-- Query using Partition Key (Recommended)
SELECT * FROM store.products WHERE product_id = <some-uuid>;

-- Querying with Clustering Columns
SELECT * FROM store.orders WHERE customer_id = 123
ORDER BY order_date DESC;

-- Using ALLOW FILTERING (Not Recommended for Large Datasets)
SELECT * FROM store.products WHERE price > 500 ALLOW FILTERING;
```

Query Data with CQL

- **Aggregation & Counting Records:**

```
-- Count total records (Not Optimized)
SELECT COUNT(*) FROM store.products;

-- Count records within a partition (Recommended)
SELECT COUNT(*) FROM store.products WHERE category = 'Electronics';
```

Materialized View

```
CREATE MATERIALIZED VIEW store.product_by_name AS
SELECT name, product_id, price, stock
FROM store.products
WHERE name IS NOT NULL
PRIMARY KEY (name, product_id);
```

Secondary Index

```
-- Create a Secondary Index on the 'name' column
CREATE INDEX ON store.products (name);

-- Query products using the indexed column
SELECT * FROM store.products WHERE name = 'Laptop';

-- Drop the Secondary Index if no longer needed
DROP INDEX store.products_name_idx;
```

Performance Optimization & Data Replication

- ✅ **Replication Strategies** – Distributes data across nodes for **fault tolerance & availability**.
- ✅ **Consistency Levels** – Controls **how strongly synchronized** data needs to be across nodes.
- ✅ **Read & Write Optimization** – Techniques like **batch queries, indexing, and partitioning** for better performance.
- ✅ **Caching & Compaction** – Improves **query speed and storage efficiency** by managing memory and disk usage.

Replication Strategies in Cassandra

```
-- SimpleStrategy (For single data centers)
CREATE KEYSPACE ecommerce
WITH replication = {'class': 'SimpleStrategy', 'replication_factor': 3};

-- NetworkTopologyStrategy (For multi-data center setups)
CREATE KEYSPACE ecommerce
WITH replication = {'class': 'NetworkTopologyStrategy', 'DC1': 3, 'DC2': 2};
```

Understanding Consistency Levels

Level	Reads Required	Writes Required	Best For
`ONE`	1 Node	1 Node	Fastest, lower consistency
`QUORUM`	Majority of Nodes	Majority of Nodes	Balance of availability & consistency
`ALL`	All Nodes	All Nodes	Strongest consistency, slowest

```
-- Writing with a specific consistency level
INSERT INTO store.products (product_id, name, price, stock)
VALUES (uuid(), 'Smartphone', 800, 150)
USING CONSISTENCY QUORUM;

-- Reading with a specific consistency level
SELECT * FROM store.products USING CONSISTENCY ONE;
```

Tuning Read & Write Performance

```
-- Creating an Index for Faster Reads (Use with caution)
CREATE INDEX ON store.products (category);

-- Using Materialized Views for Optimized Queries
CREATE MATERIALIZED VIEW store.products_by_category AS
SELECT category, name, price
FROM store.products
WHERE category IS NOT NULL
PRIMARY KEY (category, name);

-- Batched Writes for Efficiency
BEGIN BATCH
    INSERT INTO store.products (product_id, name, price, stock)
    VALUES (uuid(), 'Tablet', 300, 100);
APPLY BATCH;
```

Using Caching & Compaction Strategies

```
ALTER TABLE store.products
WITH caching = {'keys': 'ALL', 'rows_per_partition': '10'};
```

```
ALTER TABLE store.products
WITH compaction = {'class': 'SizeTieredCompactionStrategy'};
```

Backup and Restore in Cassandra

🛡️ Backup Strategies

- **Snapshots** 📸 – Captures a full backup of SSTables (nodetool snapshot)
- **Incremental Backups** ⏳ – Saves only changes since the last snapshot
- **Commit Log Archiving** 📂 – Ensures recovery of unflushed writes
- **Exporting Data** 🌍 – Use `cqlsh COPY` or `nodetool flush` to create backups

♻️ Restore Methods

- ✅ **Restore from Snapshots** 📂 – Copy SSTable files back and refresh the database
- ✅ **Replay Commit Logs** 🔄 – Recover unflushed writes after failure
- ✅ **Use Sstableloader** 🚀 – Import backed-up data into a new cluster

💡 *Tip: Automate backups with scripts & cloud storage for better disaster recovery!*

Security Features in Cassandra

🔐 Authentication & Authorization

- User Authentication 👤 – Verify identities before accessing Cassandra
- Role-Based Access Control (RBAC) 🎭 – Assign roles & permissions
- LDAP & Kerberos Support 🔑 – Integrate with enterprise security

🛡️ Data Encryption

- 🔒 Client-to-Node Encryption 🔄 – Protects data in transit
- 🔒 Node-to-Node Encryption 🔗 – Secures inter-node communication
- 🔒 At-Rest Encryption 🗄️ – Safeguards stored data using secure keys

Monitoring and Troubleshooting Cassandra

📊 Monitoring Cassandra Performance

- 🔹 **nodetool status** 📡 – Check cluster health & node availability
- 🔹 **nodetool tpstats** ⚙️ – View active thread pools & latency stats
- 🔹 **nodetool cfstats** 📈 – Get per-table statistics (reads, writes, compaction)
- 🔹 **JMX & Prometheus** 📊 – Collect metrics for real-time monitoring

🚨 Common Issues & Troubleshooting

- 🔴 **High Latency** 🕒 – Check read/write consistency levels & tuning
- 🔴 **Node Failure** ❌ – Verify logs & use `nodetool repair` for recovery
- 🔴 **Compaction Overhead** 🏗️ – Adjust compaction strategy for efficiency
- 🔴 **Out of Memory (OOM)** 💥 – Tune heap size & GC settings

🛠️ Tools for Troubleshooting

- ✅ **System Logs** 📜 – `/var/log/cassandra` for error tracking
- ✅ **nodetool describecluster** 🔍 – Check cluster-wide settings
- ✅ **Tracing Queries** 🧐 – Use `CONSISTENCY TRACE` for slow queries

Advanced Data Modeling in Cassandra

📐 Key Principles of Data Modeling

- **Denormalization Over Joins** 📌 – Store redundant data to avoid costly joins
- **Query-Driven Design** 🎯 – Model data based on how it will be queried
- **Partitioning Strategy** ⚡ – Choose efficient partition keys for even data distribution
- **Clustering Keys** 🔀 – Define sort order for query performance

🛠️ Best Practices for Schema Design

- ✅ **Use Composite Primary Keys** 🔑 – Combine partition & clustering keys wisely
- ✅ **Avoid Large Partitions** 🚨 – Distribute data evenly to prevent hotspots
- ✅ **Leverage Indexing** 📚 – Use **secondary indexes** or **materialized views** carefully
- ✅ **TTL & Expiration** ⏳ – Set Time-to-Live (TTL) for temporary data

Integration with Other Tools

🔗 Why Integrate Cassandra with Other Tools?

- **Real-Time Analytics** 📊 – Process and analyze large-scale data efficiently
- **Streaming Data Processing** 🚀 – Handle high-velocity event streams
- **Search & Indexing** 🔍 – Enhance querying capabilities beyond CQL

🔄 Common Integrations

- **Apache Spark** ⚡ – Distributed data processing & analytics
- **Apache Kafka** 📡 – High-throughput message streaming
- **Elasticsearch** 🔍 – Full-text search & indexing
- **Apache Flink** 🌊 – Real-time event processing

Case Studies of Cassandra in Production

🏢 How Leading Companies Use Cassandra

- **Netflix** 🎬 – Handles billions of daily video streaming requests
- **Instagram** 📸 – Stores and serves petabytes of user-generated content
- **Uber** 🚖 – Manages real-time geolocation and ride-matching
- **eBay** 🛒 – Powers distributed transactional data for marketplace operations

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