NDBI040

Big Data Management and NoSQL Databases

Lecture 7. Column-family stores

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Column-Family Stores Basic Characteristics

Note: two different meanings of column-oriented!!

- Also "columnar" or "column-oriented"
- Column families = rows that have <u>many</u> columns associated with a row key
- Column families are groups of related data that is often accessed together
 - e.g., for a customer we access all profile information at the same time, but not orders



Column-Family Stores Suitable Use Cases

Event Column family	POW	
event fc9866e48ca6	appName:Atlas eventName:Login appUser:wspirk	

Event Logging

• Ability to store any data structures \rightarrow good choice to store event information

Content Management Systems, Blogging Platforms

- We can store blog entries with tags, categories, links, and trackbacks in different columns
- Comments can be either stored in the same row or moved to a different keyspace
- Blog users and the actual blogs can be put into different column families

Column-Family Stores When Not to Use

Systems that Require ACID Transactions

Column-family stores are <u>not</u> just a special kind of RDBMSs with variable set of columns!

Aggregation of the Data Using Queries

- (such as SUM or AVG)
- Have to be done on the client side

For Early Prototypes

- We are not sure how the query patterns may change
- As the query patterns change, we have to change the column family design

Column-Family Stores Representatives

Google's BigTable







Apache Cassandra



- Developed at Facebook
- Initial release: 2008
- Stable release: 2013
 - Apache Licence
- Written in: Java
- OS: cross-platform
- Operations:
 - CQL (Cassandra Query Language)
 - MapReduce support
 - Can cooperate with Hadoop (data storage instead of HDFS)

http://cassandra.apache.org/

Terminology

RDBMS	Cassandra	
database instance	cluster	Usually one per
database	keyspace	application
table	column family	
row	row	
column (same for all rows)	column (can be different per row)	

- Column = basic unit, consists of a name-value pair
 - Name serves as a key
 - □ Stored with a **timestamp** (expired data, resolving conflicts, ...)
- Row = a collection of columns attached or linked to a key
 - Columns can be added to any row at any time without having to add it to other rows
- Column family = a collection of <u>similar</u> rows
 - Rows do not have to have the same columns



3-tuple

Data Model – Example

name: "firstName", value: "Martin", timestamp: 12345667890

Column key of firstName and the value of Martin

```
{ "pramod-sadalage" : {
    firstName: "Pramod",
    lastName: "Sadalage",
    lastVisit: "2012/12/12" }
    "martin-fowler" : {
      firstName: "Martin",
      lastName: "Fowler",
      location: "Boston" } }
```

pramod-sadalage row and martin-fowler row with different columns; both rows are a part of a column family

Column-families vs. Relations

- We do not need to model all of the columns up front
 - Each row is not required to have the same set of columns
 - □ Usually we assume similar sets of columns
 - Related data
 - Can be extended when needed
- No formal foreign keys
 - Joining column families at query time is not supported
 - We need to pre-compute the query / use a secondary index



blog keyspace



subscribes_to				
jbellis	dhutch	egilmore		
dhutch	jbellis			
egilmore	jbellis	dhutch		

time_ordered_blogs_by_user



blog entries			
0246-65	body	user*	category*
9200605	Today I	jbellis	tech
4410-55	body	user	category
0418866	I am	dhutch	fashion
6-0b/192	body	user	category
0400465	This is	egilmore	sports
* = secondary indexes			
subscribers_of			
jbellis	dhutch	egilmore	
dhutch	egilmore	dhutch	
egilmore	jbellis		
			Oth
			<u>د</u>

families / secondary indexes for special queries

Column-families

Can define metadata about columns

- □ Actual columns of a row are determined by client application
- Each row can have a different set of columns
- Static similar to a relational database table
 - Rows have the same set of columns
 - Not required to have all of the columns defined
- Dynamic takes advantage of Cassandra's ability to use arbitrary application-supplied column names
 - Pre-computed result sets
 - □ Stored in a single row for efficient data retrieval
 - \square Row = a snapshot of data that satisfy a given query
 - Like a materialized view

Cassandra Column-families



Users that subscribe to a particular user's blog

Columns

- Column is the smallest increment of data
 - □ Name + value + timestamp
 - □ Value can be empty (e.g., materialized views)
- Can be indexed on their name
 - □ Using a secondary index
 - Primary index = row key
 - Ensure uniqueness, speeds up access, can influence storage order

Types:

- Expiring with optional expiration date called TTL
 - Can be queried
- Counter to store a number that incrementally counts the occurrences of a particular event or process
 - E.g., to count the number of times a page is viewed
 - Operation increment/decrement with a specified value
 - Internally ensures consistency across all replicas
- Super add another level of nesting
 - To group multiple columns based on a common lookup value



column_name value timestamp

Cassandra Super columns



- super column a column consisting of a map of columns
 - □ It has a name and value involving the map of columns
- super column family a column family consisting of super columns
 - □ vs. standard column family



Cassandra Column Families

- A key must be specified
- Data types for columns <u>can</u> be specified
- Options <u>can</u> be specified

```
CREATE COLUMNFAMILY Fish (key blob PRIMARY KEY);
CREATE COLUMNFAMILY FastFoodEatings (user text PRIMARY KEY)
WITH comparator=timestamp AND default_validation=int;
CREATE COLUMNFAMILY MonkeyTypes (
    KEY uuid PRIMARY KEY,
```

```
species text,
alias text,
population varint
```

) WITH comment='Important biological records' AND read_repair_chance = 1.0;

Cassandra Column Families

- Comparator = data type for a column name
- Validator = data type for a column (or row key) value
- Data types do not need to be defined
 Default: BytesType, i.e. arbitrary hexadecimal bytes
- Basic operations: GET, SET, DEL

From new versions of Cassandra and CQL: new strategy
 But the capabilities remain the same

• i.e., we can still create tables with arbitrary columns

Column Families – Example

```
different syntax (different version)
CREATE COLUMNFAMILY users
with key validation class = 'UTF8Type'
 and comparator = 'UTF8Type'
and column metadata = [
       {column name : 'name', validation class : UTF8Type},
       {column name : 'birth year', validation_class : Int32Type}];
SET users['jbellis']['name'] = 'Jonathan Ellis';
SET users['jbellis']['birth year'] = 1976;
SET users['jbellis']['home'] = long(1112223333);
SET users['jbellis']['work'] = long(2223334444);
GET users['jbellis'];
GET users['jbellis']['home'];
DEL users['jbellis']['home'];
DEL users['jbellis'];
```

Column Families – Best Practice

Validators

- Define a default row key validator using property key_validation_class
- Static column families:
 - Define each column and its associated type
- Dynamic column families
 - Column names are not known ahead
 - Specify default_validation_class
- Comparators
 - □ Within a row, columns are stored in sorted order by their column name
 - Static column families:
 - Typically strings
 - Order unimportant
 - Dynamic column families
 - Order is usually important (e.g. timestamps)

CQL – New Approach

- Cassandra query language
- SQL-like commands
 - CREATE, ALTER, UPDATE, DROP, DELETE, TRUNCATE, INSERT, ...
- Much simpler than SQL
 - □ Does <u>not allow</u> joins or subqueries
 - Where clauses are simple

□ ...

- Different approach than column families (since CQL 3 called tables)
 - □ More general
 - Closer to key/value and document databases

Cassandra CQL Data Types

ascii	ASCII character string
bigint	64-bit signed long
blob	Arbitrary bytes (no validation)
boolean	true or false
counter	Counter column (64-bit long)
decimal	Variable-precision decimal
double	64-bit IEEE-754 floating point
float	32-bit IEEE-754 floating point
int	32-bit signed int
text	UTF8 encoded string
timestamp	A timestamp
uuid	Type 1 or type 4 UUID
varchar	UTF8 encoded string
varint	Arbitrary-precision integer

Cassandra Working with a Key Space

```
CREATE KEYSPACE Excelsior
```

WITH replication = { 'class': 'SimpleStrategy',

'replication_factor' : 3};

Create a key space with a specified replication strategy and parameters

USE Excelsior;

Set a keyspace as the current working keyspace

```
ALTER KEYSPACE Excelsior
WITH replication = {'class': 'SimpleStrategy',
'replication_factor' : 4};
```

Alter the properties of an existing keyspace

```
DROP KEYSPACE Excelsior;
```

Drop a keyspace

Cassandra Working with a Table – Primary Key

```
CREATE TABLE timeline (
```

```
userid uuid,
posted_month int,
posted_time uuid,
body text,
posted_by text,
PRIMARY KEY (userid, posted_month, posted_time) )
WITH compaction = { 'class' : 'LeveledCompactionStrategy' };
```

- Creating a table with name, columns and other options
- Primary key is compulsory
 - □ Partition key = the first column (or a set of columns if parenthesised)
 - Records are stored on the same node
 - □ Clustering columns
 - Determine per-partition clustering, i.e., the <u>order</u> for physical storing rows

Cassandra Working with a Table – Column Expiration

CREATE TABLE excelsior.clicks (
 userid uuid,
 url text,
 date timestamp,
 name text,
 PRIMARY KEY (userid, url));

When the data will expire

SELECT TTL (name) from excelsior.clicks
WHERE url = 'http://apache.org' ALLOW FILTERING;

Determine how much longer the data has to live

```
ttl(name)
-----
85908
```

Working with a Table – Collections

- Collection types:
 - set unordered <u>unique</u> values
 - Returned in <u>alphabetical</u> order, when queried
 - □ **list** ordered list of elements
 - Can store the same value multiple times
 - Returned sorted according to index value in the list
 - □ map name + value pairs
 - Each element is internally stored as one Cassandra column
 - Each element can have an individual time-to-live

Cassandra Working with a Table – Set

```
CREATE TABLE users (
```

user_id text PRIMARY KEY, first_name text, last_name text, emails set<text>);

Cassandra Working with a Table – List

ALTER TABLE users ADD top places list<text>;

```
UPDATE users SET top_places = [ 'rivendell', 'rohan' ]
WHERE user id = 'frodo';
```

```
UPDATE users SET top_places = [ 'the shire' ] + top_places
WHERE user id = 'frodo';
```

```
UPDATE users SET top_places = top_places + [ 'mordor' ]
WHERE user id = 'frodo';
```

```
UPDATE users SET top_places[2] = 'riddermark'
WHERE user id = 'frodo';
```

```
DELETE top places[3] FROM users WHERE user id = 'frodo';
```

```
UPDATE users SET top_places = top_places - ['riddermark']
WHERE user_id = 'frodo';
```

Cassandra Working with a Table – Map

ALTER TABLE users ADD todo map<timestamp, text>;

```
UPDATE users SET todo = { '2012-9-24' : 'enter mordor',
'2012-10-2 12:00' : 'throw ring into mount doom' }
WHERE user id = 'frodo';
```

```
UPDATE users SET todo['2012-10-2 12:00'] =
'throw my precious into mount doom'
WHERE user id = 'frodo';
```

```
INSERT INTO users (todo) VALUES ( {
 '2013-9-22 12:01' : 'birthday wishes to Bilbo',
 '2013-10-1 18:00' : 'Check into Inn of Prancing Pony' });
```

```
DELETE todo['2012-9-24'] FROM users
WHERE user id = 'frodo';
```

Cassandra Working with a Table

DROP TABLE timeline;

Delete a table including all data

TRUNCATE timeline;

Remove all data from a table

CREATE INDEX userIndex ON timeline (posted_by);

- Create a (secondary) index
- Allow efficient querying of other columns than key

DROP INDEX userIndex;

Drop an index

Cassandra Querying

Remember: no joins, just simple conditions
 For simple data reads

SELECT * FROM users
WHERE first_name = 'jane' and last_name='smith';
Filtering (WHERE)

SELECT * FROM emp WHERE empID IN (130,104) ORDER BY deptID DESC; Ordering (ORDER BY)

Cassandra Querying

optional SELECT select_expression FROM keyspace_name.table_name WHERE relation AND relation ... ORDER BY (clustering_key (ASC | DESC)...) LIMIT n ALLOW FILTERING

- select expression:
 - □ List of columns
 - DISTINCT
 - 🗆 COUNT
 - □ Aliases (AS)
 - TTL(column_name)
 - WRITETIME(column_name)

Cassandra Querying

relation:

column_name (= | < | > | <= | >=) key_value
 column_name IN ((key_value,...))
 TOKEN (column_name, ...) (= | < | > | <= | >=)
 (term | TOKEN (term, ...))

- term:
 - constant
 - □ set/list/map

Cassandra Querying - ALLOW FILTERING

Non-filtering queries

- Queries where we know that all records read will be returned (maybe partly) in the result set
- Have predictable performance
- Attempt a potentially expensive (i.e., filtering) query

ALLOW FILTERING

- "We know what we are doing"
- □ Usually together with LIMIT n

Bad Request: Cannot execute this query as it might involve data filtering and thus may have unpredictable performance. If you want to execute this query despite the performance unpredictability, use ALLOW FILTERING.

Cassandra Querying - ALLOW FILTERING

```
CREATE TABLE users (
    username text PRIMARY KEY,
    firstname text,
    lastname text,
    birth year int,
    country text
);
CREATE INDEX ON users (birth year);
                                queries performance proportional
                                 to the amount of data returned
SELECT * FROM users;
SELECT firstname, lastname FROM users
WHERE birth year = 1981;
```

Cassandra Querying - ALLOW FILTERING

```
SELECT firstname, lastname
FROM users
WHERE birth_year = 1981 AND country = 'FR';
```

No guarantee that Cassandra won't have to scan large amount of data even if the result is small

```
SELECT firstname, lastname
FROM users
WHERE birth_year = 1981 AND country = 'FR'
ALLOW FILTERING;
```





- 1. When a write occurs:
 - a. The data are stored in memory (memtable)
 - b. Writes are appended to commit log on disk
 - Durability after HW failure
- 2. The more a table is used, the larger its memtable needs to be
 - Size > (configurable) threshold \Rightarrow the data is put in a queue to be flushed to disk
- 3. The memtable data is flushed to SSTables on disk
 - Sorted string table
- 4. Data in the commit log is purged after its corresponding data in the memtable is flushed to the SSTable

Cassandra Writes

- Memtables and SSTables are maintained per table
- SSTables are immutable
 - \Rightarrow A row is typically stored across multiple SSTable files
 - ⇒ Read must combine row fragments from SSTables and unflushed Memtables
- Memory structures for each SSTable:
 - Partition index a list of primary keys and the start position of rows in the data file
 - □ Partition summary a subset of the partition index
 - By default 1 primary key out of every 128 is sampled
 - To speed up searching

Cassandra Writes

Write example: write (k1, c1:v1) write (k2, c1:v1 c2:v2) write (k1, c1:v4 c3:v3 c2:v2)



Cassandra Write Request

- Goes to any node (coordinator)
 - A proxy between the client application and the nodes
- Sends a write request to all replicas that own the row being written
 - □ Write consistency level = how many replicas must respond with success
 - Success = the data was written to commit log and memtable
- Example:
 - 10 node cluster, replication factor = 3, write consistency level = ONE
 - The first node to complete the write responds back to coordinator
 - Coordinator proxies the success message back to the client



Reads

- Types of read requests a coordinator can send to a replica:
 - Direct read request limited by the read consistency level
 - Background read repair request
- Steps:
 - 1. The coordinator contacts replicas specified by the read consistency level
 - Sends requests to those that currently respond fastest
 - 2. Data from replicas are compared to see if they are consistent
 - The most recent data (based on timestamp) is used
 - 3. Read repair: The coordinator contacts and compares the data from all the remaining replicas that own the row in the background
 - If the replicas are inconsistent, the coordinator issues writes

Updates

- Insert and update operations are identical
- Any number of columns can be inserted/updated at the same time
- Cassandra does not overwrite the rows
 - It groups inserts/updates in the memtable
 - □ See the example for writes
- Upsert = insert or update depending on the (non)existence of the data → inserting a duplicate primary key
 - Columns are overwritten only if the timestamp in the new version is more recent
 - Timestamp is provided by the client \Rightarrow the clients should be synchronized
 - □ Otherwise the updates are stored into a new SSTable
 - Merged periodically on background using compaction process

Cassandra Updates



Deletes

- Delete of a row = a delete of its columns
- After an SSTable is written, it is immutable ⇒ a deleted column is not removed immediately
- A tombstone is written
 - A marker in a row that indicates a column was deleted
 - Signals Cassandra to retry sending a delete request to a replica that was down at the time of delete
- Columns marked with a tombstone exist for a (configurable) grace period
 - □ Defined per table
 - □ When expires, the compaction process permanently deletes the column
 - The same process that merges multiple SSTables
- If a node is down longer, the node can possibly miss the delete \Rightarrow deleted data comes back up again

□ Administrators must run regular node repair

Synchronizes and corrects all replicas

Compaction Process

- Cassandra does not insert/update/delete in place
 - Inserts/updates = new timestamped version of the inserted/updated data in another SSTable
 - Delete = tombstone mark for data
- From time to time compaction has to be done
- Compaction steps:
 - 1. Merging the data in each SSTable data by partition key
 - Selecting the latest data for storage based on its timestamp
 - We need synchronization!
 - $\square \quad \text{Remember: SSTables are sorted} \rightarrow \text{random access is not needed}$
 - 2. Evicting tombstones and removing deleted data
 - 3. Consolidation of SSTables into a single file
 - 4. Deleting old SSTable files
 - □ As soon as any pending reads finish using the files

Cassandra Compaction Process

Start compaction



Cassandra Compaction Process

- Different strategies
 - □ Can be specified per table
- Simple: trigger compaction when there are more than min_threshold SSTables for a column family
 - □ SizeTieredCompactionStrategy (default) creates similar sized SSTables
 - For write-intensive workloads
 - DateTieredCompactionStrategy stores data written within a certain period of time in the same SSTable
 - For time-series and expiring data
- Complex: LeveledCompactionStrategy
 - □ Small fixed-sized (5MB by default) SSTables are organized into levels
 - □ SSTables do not overlap within a level (= immediate compaction)
 - □ When a level is filled up, another level is created
 - Each new level is 10x larger
 - □ For read-intensive workloads
 - 90% of all reads are satisfied from a single SSTable
 - Assuming row sizes are nearly uniform
 - In the worst case we read from all levels

Architecture

Peer-to-peer distributed system

- Assumption: System and hardware failures can and do occur
- Coordinator = any node responsible for a particular client operation

Key components:

- □ Virtual nodes assign data ownership to physical nodes
- □ Gossip exchanging information across the cluster
- Partitioner determines how to distribute the data across the nodes
- Replica placement strategy determines which nodes to place replicas on
- Cluster stores data partitions of a Cassandra ring

Virtual Nodes

- Allow each node to own a large number of small partition ranges
 - Easier for adding/removing nodes – the small partition ranges are simply transferred
- Still use consistent hashing to distribute data

Example: replication factor = 3



Node 4

Node 6

Node 5

Gossip

Gossip process

- Runs every second
- Exchanges state messages with up to 3 other nodes in the cluster
- Enables to detect failures
- Gossiped message:
 - Information about a gossiping node + other nodes that it knows about
 - □ Acquired:
 - Directly = by direct communication
 - Indirectly = second hand, third hand, ...
 - Has a version
 - Older information is overwritten with the most current state

Partitioner

- Determines how data is distributed across the nodes
 Including replicas
- Hash function for computing the token (hash) of a row key
- Types of partitioners:
 - Murmur3Partitioner (default) uniformly distributes data across the cluster based on MurmurHash hash values
 - Non-cryptographic hash function
 - Values from -2⁶³ to +2⁶³
 - RandomPartitioner (default for previous versions) uniformly distributes data across the cluster based on MD5 hash values
 - Values is from 0 to 2¹²⁷ -1
 - □ ByteOrderedPartitioner orders rows lexically by key bytes
 - "Hash" = hexadecimal representation of the leading character(s) in key
 - Allows ordered scans by primary key
 - Can have problems with load balancing

Replication

- All replicas are equally important
 - There is no primary or master replica
- When replication factor exceeds the number of nodes, writes are rejected
 - Reads are served as long as the desired consistency level can be met

Replica placement strategies:

- 1. SimpleStrategy
 - Places the first replica on a node determined by the partitioner
 - Additional replicas are placed on the next nodes clockwise in the ring
 - For a single data center only
 - □ We can divide the nodes into (optional racks forming) data centers
 - Collection of related nodes, physical or virtual

Cassandra Replication

2. NetworkTopologyStrategy

- Places replicas within a data center
 - □ We set number of replicas per a data center
- 1. The first replica is placed according to the partitioner
- 2. Additional replicas are placed by walking the ring clockwise until a node in a different rack is found
 - □ Motivation: nodes in the same rack often fail at the same
 - e.g., power, cooling, or network issue
- 3. If no such node exists, additional replicas are placed in different nodes in the same rack

Cassandra Replication – Examples



Data centers = 2 Total replication factor = 4 (set per data center)



R# Replica for a particular row key

Replicas assigned to different racks

Cassandra Replication

- How many replicas to configure in each data center?
 - Compromise between:
 - 1. Need for being able to satisfy reads locally
 - Without cross data-center latency
 - 2. Failure scenarios
 - □ Most commonly: 2-3 replicas in each data center
 - Can be asymmetric (= different replication factors for different data centers)

Cassandra Replication – Snitch



- Informs about the network topology
 - Determines which data centers and racks are written to and read from
- All nodes must have exactly the same snitch configuration

Various types:

- □ SimpleSnitch does not recognize data centers/racks
- RackInferringSnitch racks and data centers are assumed to correspond to the 3rd and 2nd octet of the node's IP address
- PropertyFileSnitch uses a user-defined description of the network
- Dynamic snitching monitors performance of reads, chooses the best replica based on this history
 - Special case: optimization of read requests

□ ..

References

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 - Getting Started: <u>http://www.datastax.com/documentation/gettingstarted/index.html?page</u> <u>name=docs&version=quick_start&file=quickstart</u>
 - CQL 3.1: <u>http://www.datastax.com/documentation/cql/3.1/webhelp/index.html</u>
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