

# Cassandra - “Advanced” Topics

Big Data Systems

Dr. Rubi Boim

# Cassandra advanced topics

- Counters
- Collections
- UDTs
- Batches
- Lightweight transactions
- Tunable consistency
- Deletes & tombstones

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- **Counters**
- Collections
- UDTs
- Batches
- Lightweight transactions
- Tunable consistency
- Deletes & tombstones

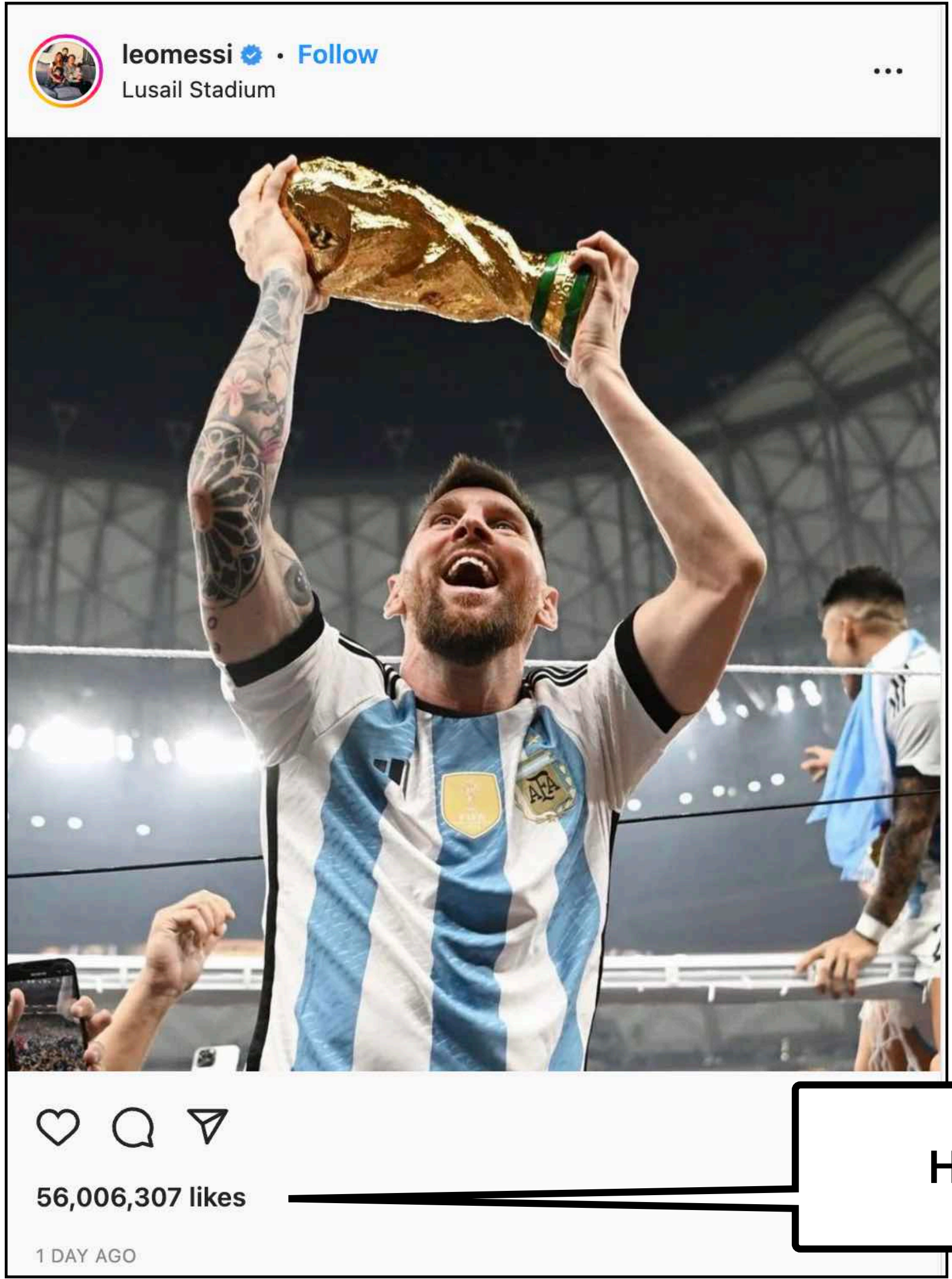


leomessi • Follow  
Lusail Stadium

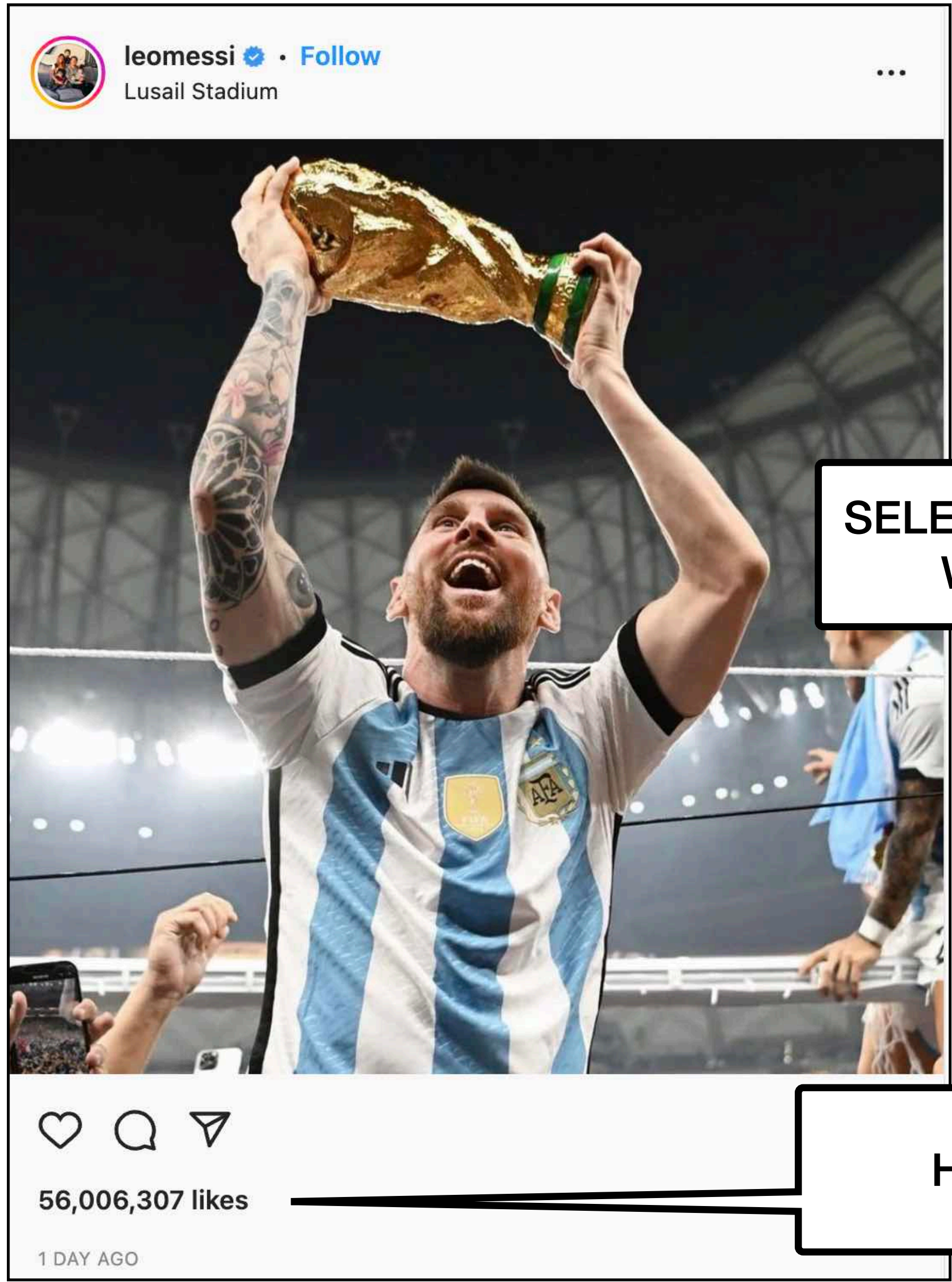


56,006,307 likes

1 DAY AGO

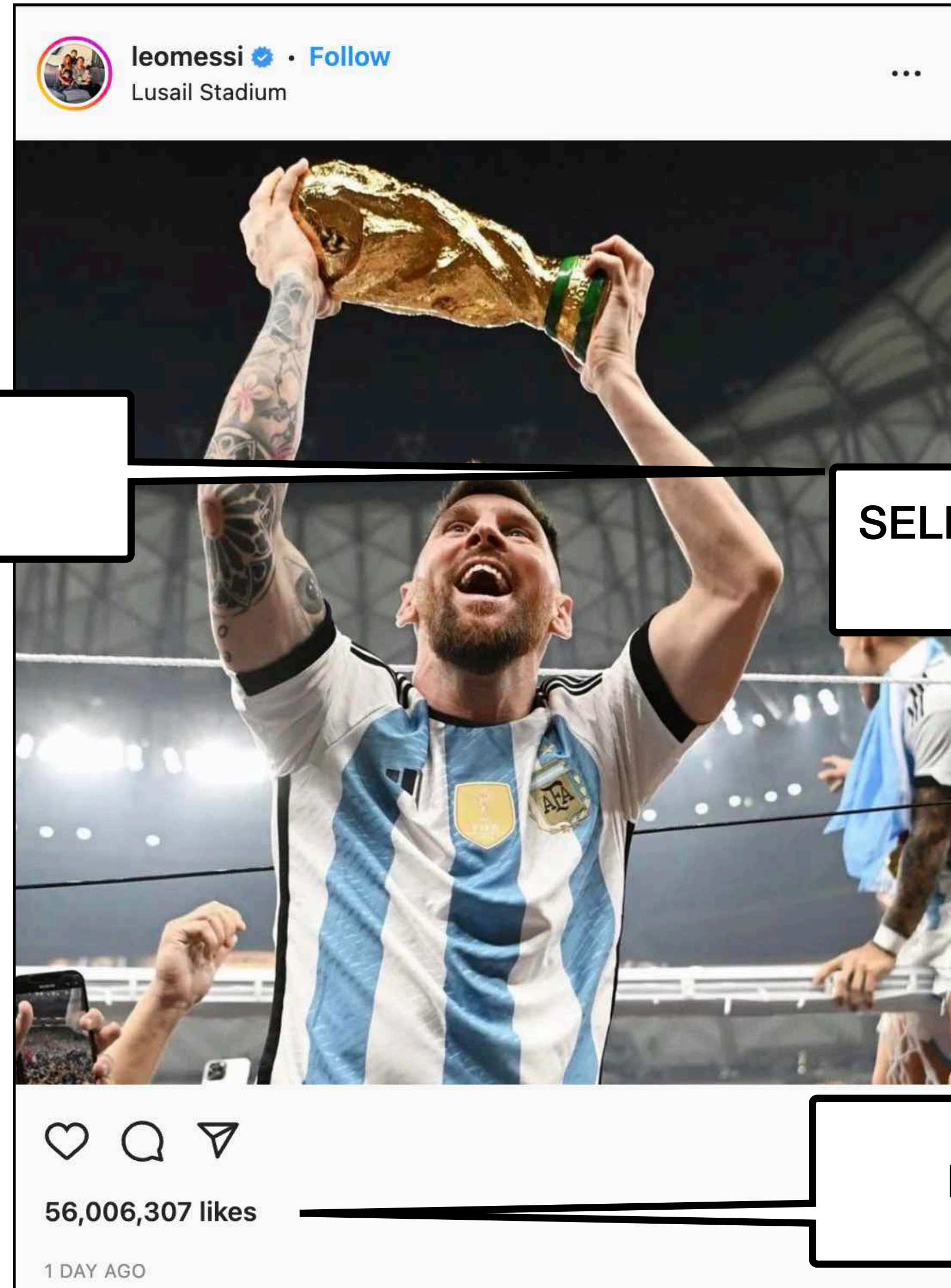


How can we calculate this?



```
SELECT count(*) FROM likes_by_item  
WHERE itemID = 123456789
```

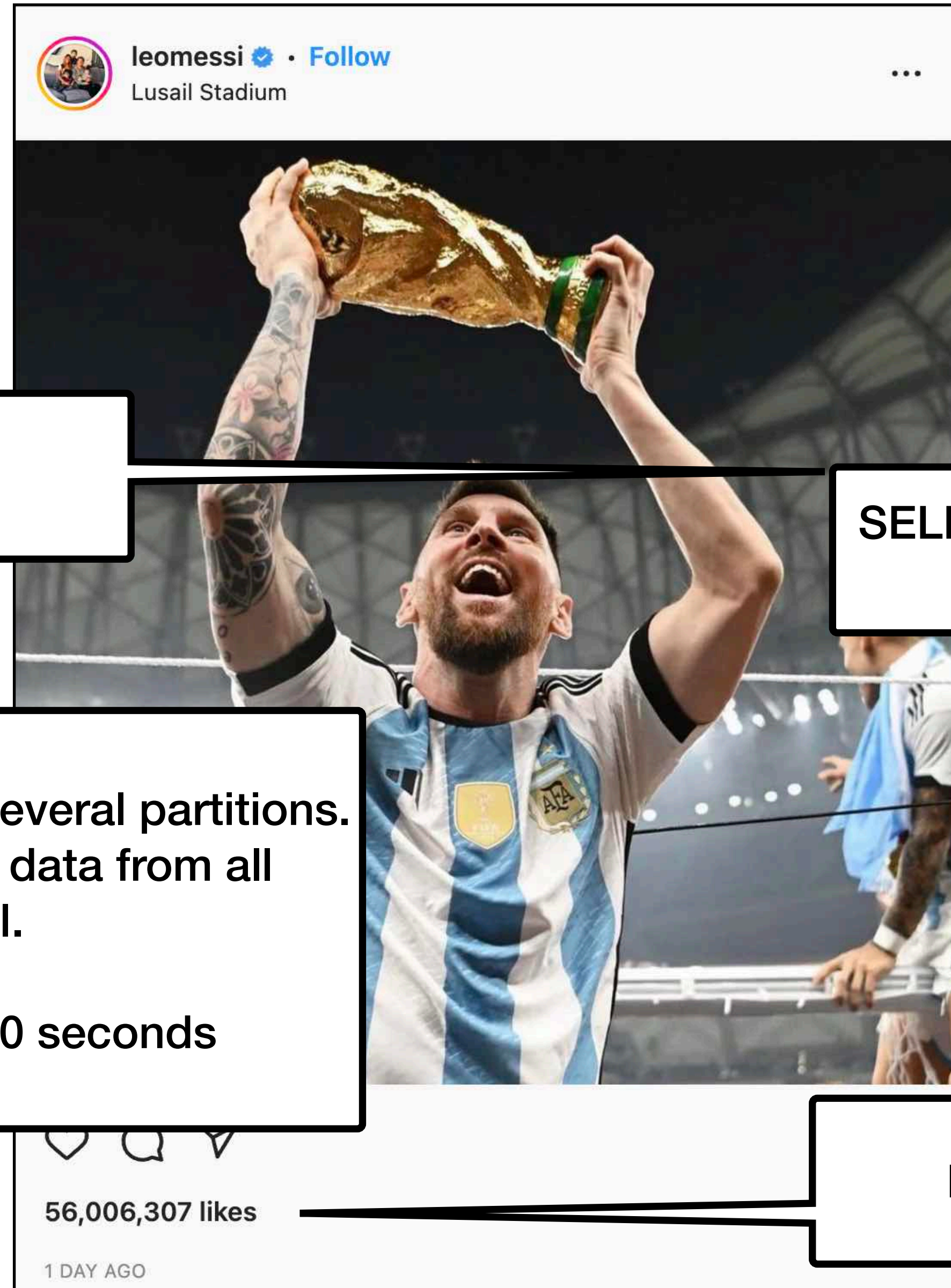
How can we calculate this?



What is the problem?

```
SELECT count(*) FROM likes_by_item  
WHERE itemID = 123456789
```

How can we calculate this?



What is the problem?

```
SELECT count(*) FROM likes_by_item  
WHERE itemID = 123456789
```

The “like” data is probably saved on several partitions.  
Will take too much time to read all data from all  
partitions and count all.  
  
We need this data in 1ms, not 10 seconds

How can we calculate this?



# Cassandra counters

- A special (powerful) data type
- 64bit signed integer (long)
- Cannot be set - only increment/decrement  
(initial value == 0)
- Used with “UPDATE”

# Cassandra counters - example

```
CREATE TABLE movie_view_counts (  
  movie_id      BIGINT,  
  view_count    COUNTER,  
  PRIMARY KEY  (movie_id)  
);
```

```
UPDATE movie_view_counts  
SET view_count = view_count + 1  
WHERE movie_id = 123
```

```
SELECT view_count FROM movie_view_counts  
WHERE movie_id = 123
```

# Cassandra counters - example

```
CREATE TABLE movie_view_counts (  
  movie_id      BIGINT,  
  view_count    COUNTER,  
  PRIMARY KEY  (movie_id)  
);
```

You can also use “-“ and values different than 1

```
UPDATE movie_view_counts  
SET view_count = view_count + 1  
WHERE movie_id = 123
```

```
SELECT view_count FROM movie_view_counts  
WHERE movie_id = 123
```

# Cassandra counters - limitations

- Counter cannot be part of the primary key
- A table that contains a counter can only contain counters  
either all the columns of a table outside the PRIMARY KEY have the counter type, or none of them have it
- Counters does not support expiration (TTL)
- Not idempotent by nature
- Slight consistency issues in distributed scenarios  
due to in-memory and speed optimizations to deal with “read before write”
- Counters can be deleted, but not reused  
can you think of an example this might cause a problem?

# Cassandra counters - limitations

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can you think of an example this might cause a problem?

Think about an eCommerce store which saves a counter for the number of views for a specific item. The item is removed from the dataset and after a few months it is added again with the same id (key)

# Question on the example

- Previous implementation counted the total views
- How can we support the query “views per day”?

```
CREATE TABLE movie_view_counts (  
    movie_id      BIGINT,  
    view_count    COUNTER,  
    PRIMARY KEY  (movie_id)  
);
```

(previous implementation)

# Question on the example - answer

- Add a timestamp column to the key
- Describe a day by rounding (down) to 00:00:00 UTC

```
// a quick version instead of using calendar...
public static long getTSDayRound(long timestamp) {
    long portion = timestamp % MILLISECONDS_IN_DAY;
    return timestamp - portion;
}
```

```
// returns the round day for the current time
return getTSDayRound(System.currentTimeMillis());
```

# Question on the example - answer

```
CREATE TABLE movie_view_counts_by_day (  
  movie_id      BIGINT,  
  ts            TIMESTAMP,  
  view_count    COUNTER,  
  PRIMARY KEY  (movie_id, ts)  
);
```

```
UPDATE movie_view_counts  
SET view_count = view_count + 1  
WHERE movie_id = 123 AND  
      ts = 1627344000000
```

```
SELECT view_count FROM movie_view_counts  
WHERE movie_id = 123 AND  
      ts = 1627344000000
```

July 27 2021





# Question on the example (2)

- How can we support the query “views per day” and “views per month”?

```
CREATE TABLE movie_view_counts_by_day (  
    movie_id      BIGINT,  
    ts            TIMESTAMP,  
    view_count    COUNTER,  
    PRIMARY KEY  (movie_id, ts)  
);
```

(previous implementation)

# Question on the example (2) - answer

- Use the same table
- Use the same “day rounding (down)”
- Use a different query
- Group and sum results on **client side**



Client is the backend which uses  
Cassandra, not the end user

# Question on the example (2) - answer

```
SELECT ts, view_count FROM movie_view_counts
WHERE movie_id = 123 AND
      ts >= 1625097600000 AND
      ts <= 1627689600000
```

July 01 2021 →

July 31 2021 →

Query result

ts	view_count
1625097600000	50,023
1625184000000	78,288
...	...
1627689600000	28,052

Client is the backend which uses Cassandra, not the end user

final result - sum of all values (on client)

# Question on the example (3)

- How can we support the query “views per day”, “views per month” **AND** “views per hour”?

```
CREATE TABLE movie_view_counts_by_day (  
  movie_id      BIGINT,  
  ts            TIMESTAMP,  
  view_count    COUNTER,  
  PRIMARY KEY  (movie_id, ts)  
);
```

(previous implementation)

# Question on the example (3) - answer

- Use the same table
- Use the a different rounding function:  
“hour rounding (down)”

```
// a quick version instead of using calendar...
public static long getTSHourRound(long timestamp) {
    long portion = timestamp % MILLISECONDS_IN_HOUR;
    return timestamp - portion;
}
```

# Discussion (1)

- What is the partition key in the examples?  
why is this super important here?

```
CREATE TABLE movie_view_counts_by_day (  
    movie_id      BIGINT,  
    ts            TIMESTAMP,  
    view_count    COUNTER,  
    PRIMARY KEY  (movie_id, ts)  
);
```

# Discussion (1)

- What is the partition key in the examples?  
why is this super important here?

```
CREATE TABLE movie_view_counts_by_day (  
    movie_id      BIGINT,  
    ts            TIMESTAMP,  
    view_count    COUNTER,  
    PRIMARY KEY  (movie_id, ts)  
);
```

We need to read a range of data and we want to do it in a single (read) call

## Discussion (2)

- Are there any performance differences between using “round by hour” vs “round by day”?



# Discussion (2)

- Are there any performance differences between using “round by hour” vs “round by day”?
  - The number of events should be the same (unless you allow a daily event to be saved several times during the day)
  - The number of counters can be X24
    - Query / client runtime
    - storage

# Discussion (2)

- Are there any performance differences between using “round by hour” vs “round by day”?
  - The number of events should be the same (unless you allow a daily event to be saved several times during the day)
  - The number of counters can be X24
    - Query / client runtime
    - storage



It can be either negligible or crucial - depends on the exact use case

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- **Collections**
- UDTs
- Batches
- Lightweight transactions
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# Cassandra collections

- Multi value columns  
Set / List / Map
- Designed for relatively small amount of data
- Retrieved all together  
no paging / indexes
- Type is fixed for all elements
- Cannot nest (\*only FROZEN)  
more on FROZEN later



# SET

- Unique, unordered, returned sorted

```
CREATE TABLE movies (  
    movie_id      BIGINT,  
    title         TEXT,  
    genres        SET<text>  
    PRIMARY KEY (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```

```
UPDATE movies  
SET genres = {"Action", "Comedy", "Teen"}  
WHERE id = 123
```

```
UPDATE movies  
SET genres = genres + {"Teen"}  
WHERE id = 123
```

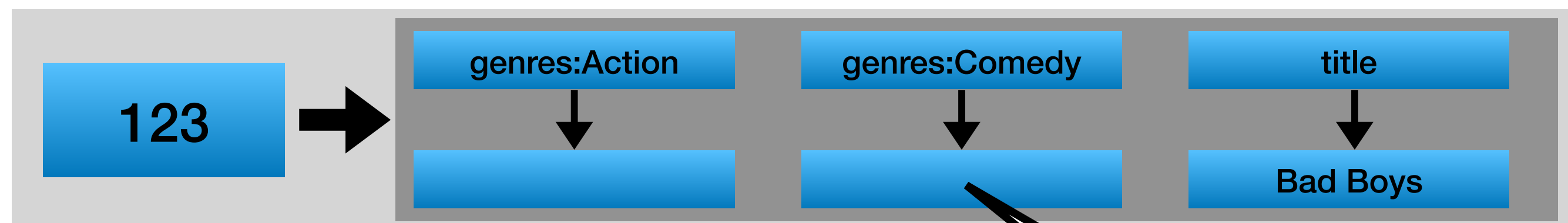
```
UPDATE movies  
SET genres = genres - {"Teen"}  
WHERE id = 123
```

# SET

- In practice

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  genres        SET<text>  
  PRIMARY KEY (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```

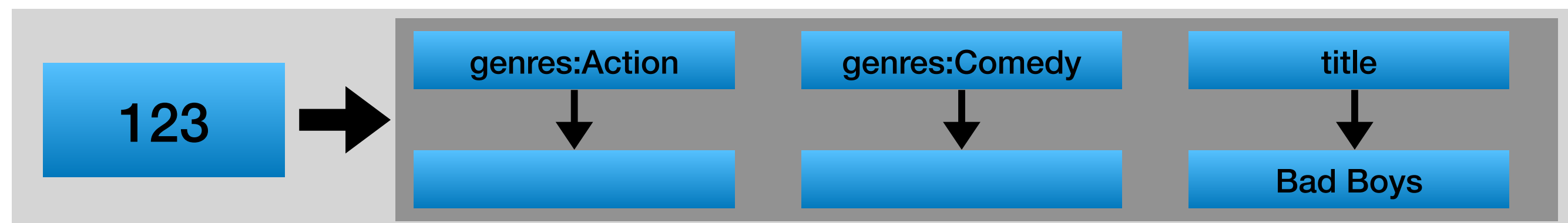


There are no values for the set columns

# SET

- In practice

```
INSERT INTO movies
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```



```
UPDATE movies
SET genres = genres + {"Teen"}
WHERE id = 123
```

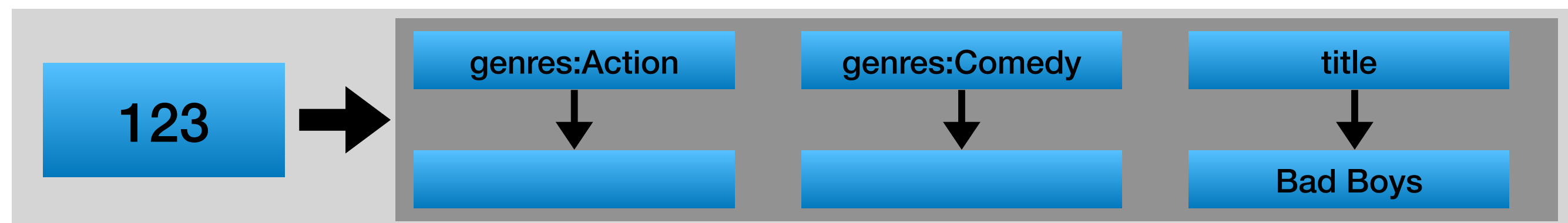
```
CREATE TABLE movies (
  movie_id      BIGINT,
  title         TEXT,
  genres        SET<text>
  PRIMARY KEY (movie_id)
);
```

# SET

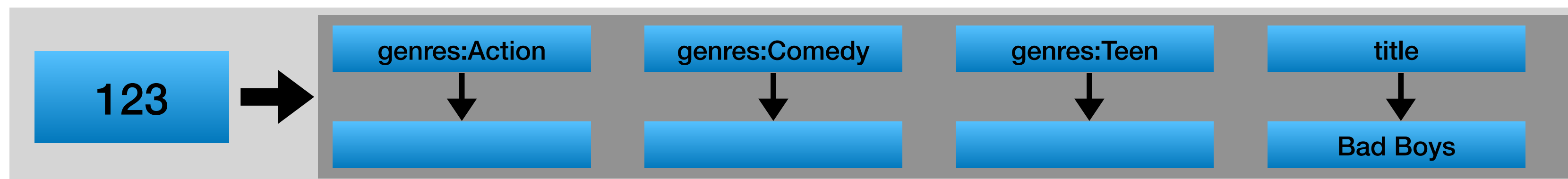
- In practice

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  genres        SET<text>  
  PRIMARY KEY  (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```



```
UPDATE movies  
SET genres = genres + {"Teen"}  
WHERE id = 123
```





# LIST

- Duplicated, ordered
- (may) requires read before write

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  cast          LIST<text>  
  PRIMARY KEY  (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Will Smith", "Martin Lawrence"})
```

```
UPDATE movies  
SET cast = cast - {"Martin Lawrence"} // all matching elements  
WHERE id = 123                       NOT thread-safe
```

```
UPDATE movies  
SET cast[1] = {"Martin Lawrence"}  
WHERE id = 123
```

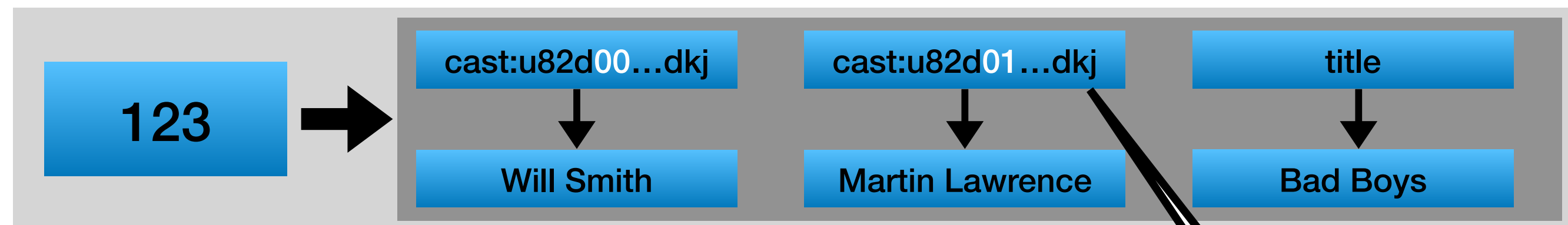
```
DELETE cast[1] FROM movies WHERE id = 123
```

# LIST

- In practice

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  cast          LIST<text>  
  PRIMARY KEY  (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Will Smith", "Martin Lawrence"})
```



List values are column values

Column name is added with unique String based on the list order

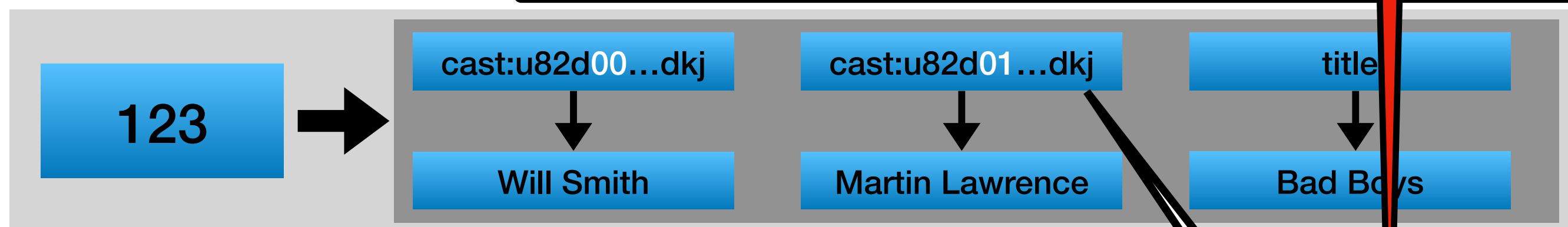
# LIST

- In practice

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  cast          LIST<text>  
  PRIMARY KEY (movie_id)  
);
```

```
INSERT INTO m  
VALUES (123,
```

Again - list may required read before write.  
Do NOT use unless you know what you are doing



List values are column values

Column name is added with unique String based on the list order

# MAP

- Key-Value pair, ordered by keys

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  cast          MAP<BIGINT, text>  
  PRIMARY KEY (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {44: "Will Smith", 45: "Martin Lawrence"})
```

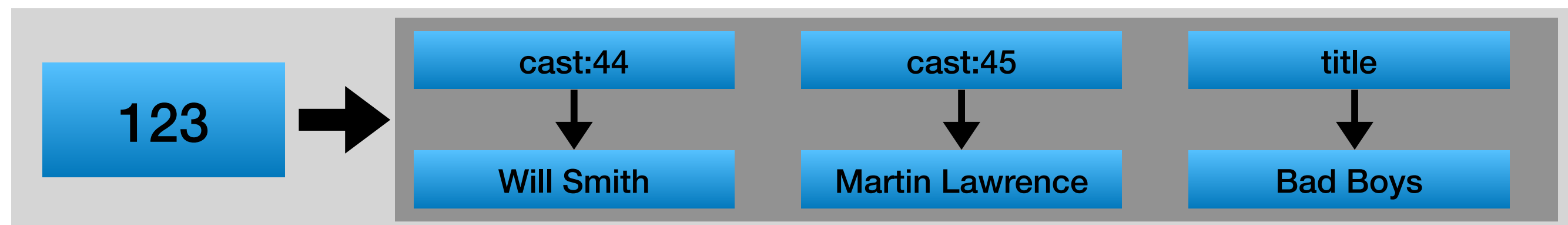
```
UPDATE movies  
SET cast = cast - {44}  
WHERE id = 123
```

# MAP

- In practice

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  cast          MAP<BIGINT, text>  
  PRIMARY KEY (movie_id)  
);
```

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {44: "Will Smith", 45: "Martin Lawrence"})
```



# Cassandra advanced topics

- Counters
- Collections
- **UDTs**
- Batches
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- Tunable consistency
- Deletes & tombstones

# User defined types

frozen == blob for Cassandra  
—> all data needs to be set at once

- Attach multiple data fields to a single column
- Any type of field is valid (UDT, Collections)
- Use with FROZEN  
new versions can support non frozen UDT without collections



```
CREATE TYPE full_name (  
    first_name TEXT,  
    last_name TEXT  
);
```

```
CREATE TYPE address (  
    country TEXT,  
    city TEXT,  
    street TEXT,  
    phones SET<TEXT>  
);
```

# User defined types - example

```
CREATE TYPE full_name (  
    first_name TEXT,  
    last_name TEXT  
);
```

```
CREATE TABLE users (  
    user_id BIGINT,  
    name FROZEN <full_name>,  
    age INT  
);
```

```
INSERT INTO user  
VALUES (123, {first_name: "Lebron", last_name: "James"}, 36)
```



# User defined types - notes

- You can love them or hate them
- Useful with collections

```
CREATE TYPE address (  
    country      TEXT,  
    city         TEXT,  
    street       TEXT,  
    phones       SET<TEXT>  
);
```

```
CREATE TABLE users (  
    user_id      BIGINT,  
    addresses    SET<FROZEN <ADDRESS>>  
);
```

# Cassandra advanced topics

- Counters
- Collections
- UDTs
- **Batches**
- Lightweight transactions
- Tunable consistency
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# Important note

- Batches in Cassandra are different from relational databases
- TLDR; they are “half” relational transactions  
batch is isolate and atomic in a single partition

# In relational databases

- Batches & Transactions are collections of commands (Insert/Update/Delete) sent together to the server
- Batch
  - NO rollback / ACID
  - **used to increase performance by reducing server calls**
- Transaction
  - full ACID

# In relational databases

**Atomicity**  
**Consistency**  
**Isolation**  
**Durability**

**No ACID**

```
"DRIVER START BATCH"  
  INSERT INTO users VALUES ("Rubi");  
  ...  
  INSERT INTO users VALUES ("Tova");  
"DRIVER END BATCH"
```

If "Tova" fails, "Rubi" is still added

**ACID**

```
START TRANSACTION  
  INSERT INTO flights VALUES ("Rubi", "TLV-NY");  
  ...  
  INSERT INTO hotels VALUES ("Rubi", "Hilton-NY");  
COMMIT
```

If "Hilton-NY" fails, the flight is NOT added

# Cassandra Batch

- Executes several commands
- If statement apply to the same partition:  
**atomic & isolated**

```
BEGIN BATCH
  INSERT INTO users_by_country VALUES ("Israel", 123, "Rubi");
  ...
  INSERT INTO users_by_country VALUES ("Israel", 123, "Tova");
APPLY BATCH
```

Same partition

If "Tova" Fails, "Rubi" will not be added

Isolation - can NOT read "Rubi" until "Tova" is added

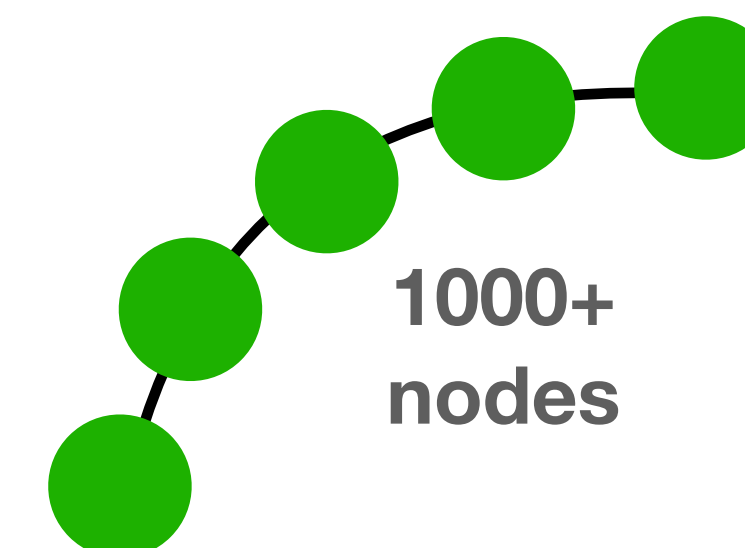
# Cassandra Batch - performance?

users	
user_id	K
name	

- Each batch is sent to a single coordinator (node), logged and then executed
- What happens in each scenario?

- ```
BEGIN BATCH
  INSERT INTO users VALUES (123, "Rubi");
  ...
  INSERT INTO users VALUES (456, "Tova");
APPLY BATCH
```

- ```
INSERT INTO users VALUES (123, "Rubi");
...
INSERT INTO users VALUES (456, "Tova");
```



# Cassandra Batch - performance?

users	
user_id	K
name	

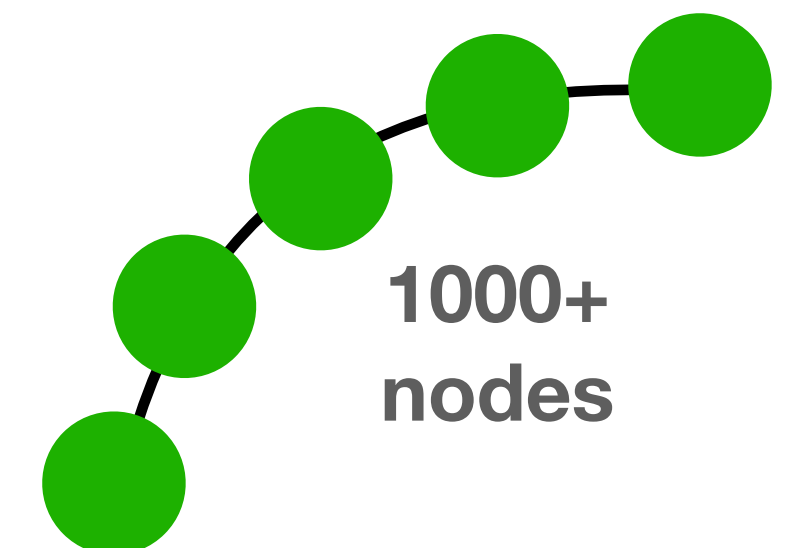
- Each batch is send to a single coordinator (node), logged and then executed
- What happens in each scenario?

- ```
BEGIN BATCH
  INSERT INTO users VALUES (123, "Rubi");
  ...
  INSERT INTO users VALUES (456, "Tova");
APPLY BATCH
```

- ```
INSERT INTO users VALUES (123, "Rubi");
...
INSERT INTO users VALUES (456, "Tova");
```

Contact the node of the first partition key (123) and log the batch.

Then that node contacts the node of partition 456





# Cassandra Batch - performance?

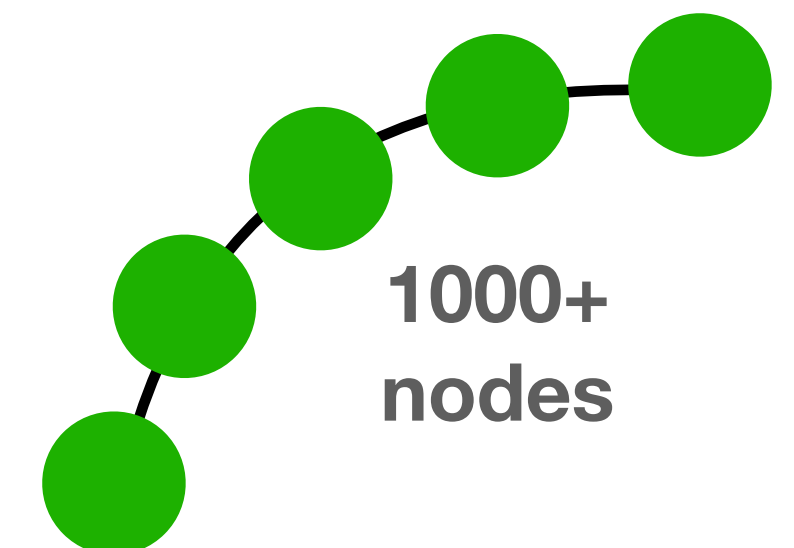
users	
user_id	K
name	

- Each batch is send to a single coordinator (node), logged and then executed
- What happens in each scenario?

- ```
BEGIN BATCH
  INSERT INTO users VALUES (123, "Rubi");
  ...
  INSERT INTO users VALUES (456, "Tova");
APPLY BATCH
```

- ```
INSERT INTO users VALUES (123, "Rubi");
...
INSERT INTO users VALUES (456, "Tova");
```

Each insert calls directly the relevant node



# Cassandra Batch - performance?

users	
user_id	K
name	

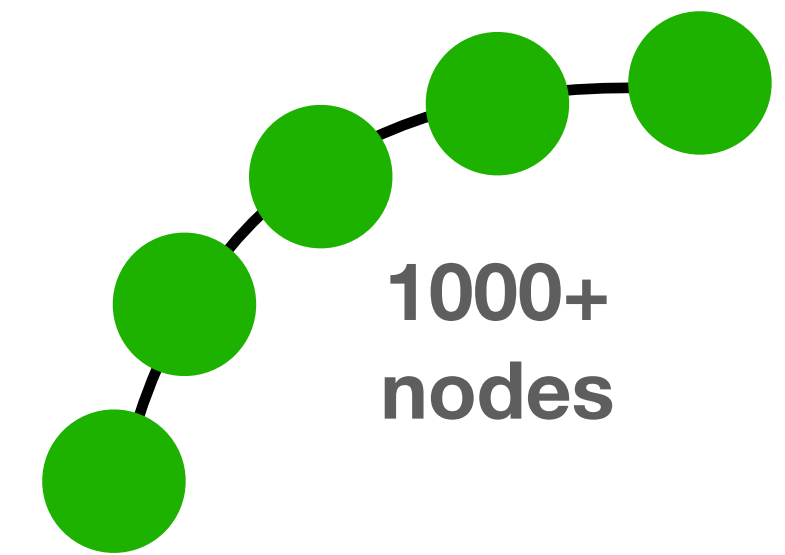
- Each batch is applied to a single node (node),  
logged
- What happens if you have a large batch?

Batches in Cassandra almost always do not help with performance

Use it only if you need single partition isolation

```
BEGIN BATCH
  INSERT INTO users VALUES (123, "Rubi");
  ...
  INSERT INTO users VALUES (456, "Tova");
APPLY BATCH
```

```
INSERT INTO users VALUES (123, "Rubi");
...
INSERT INTO users VALUES (456, "Tova");
```



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# Lightweight Transactions

- Checks a condition prior to Insert/Update/Delete
- Expensive (more than a read and write)
- An “ACID Transaction” at the partition level

# Lightweight Transactions - examples

```
INSERT INTO movies  
VALUES (3, "American Pie", 1999, 96)  
IF NOT EXISTS
```

```
UPDATE movies  
SET duration = 96  
WHERE id = 3  
IF year = 1999
```

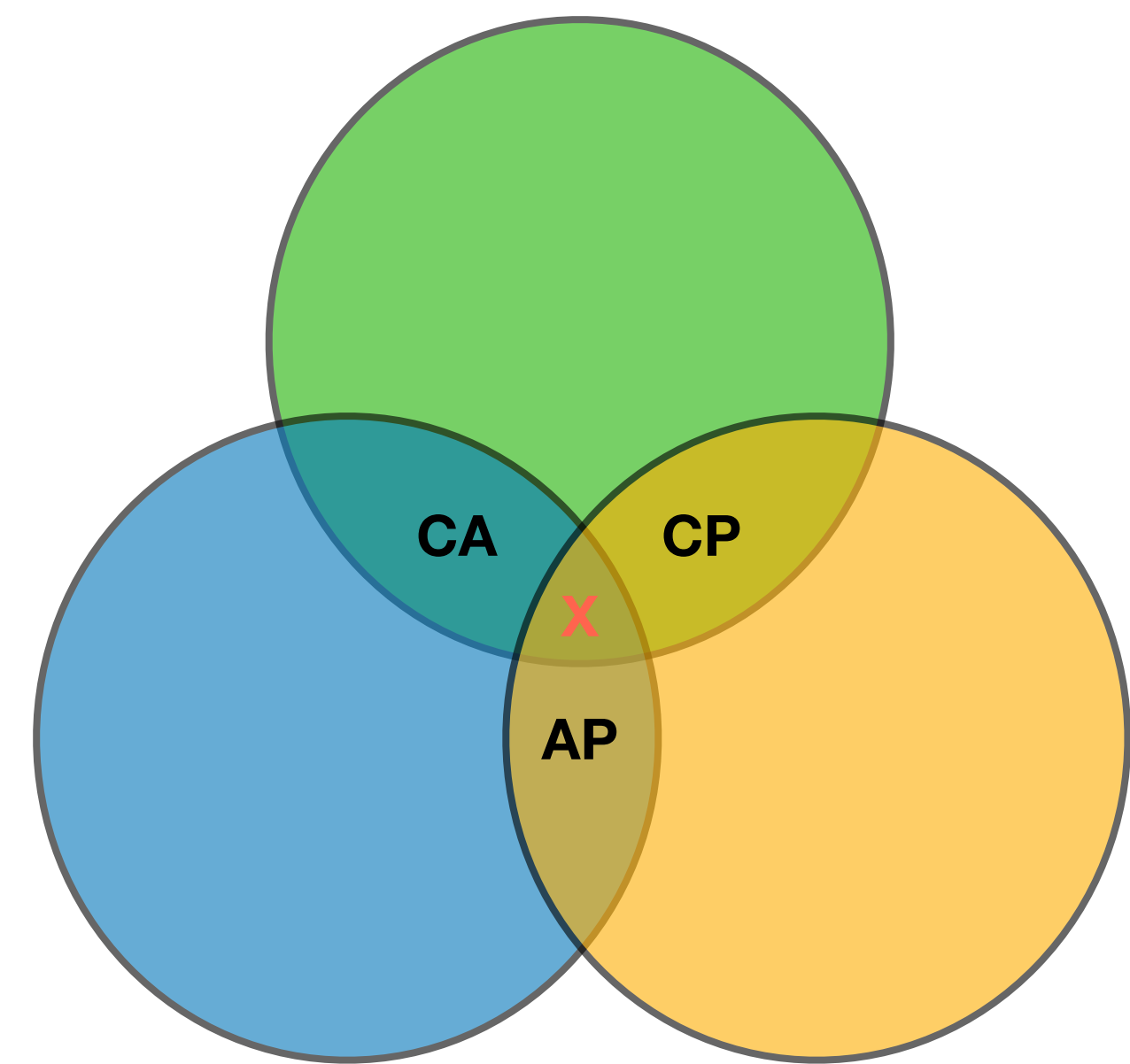
movies	
id	K
title	
year	
duration	

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- **Tunable consistency**
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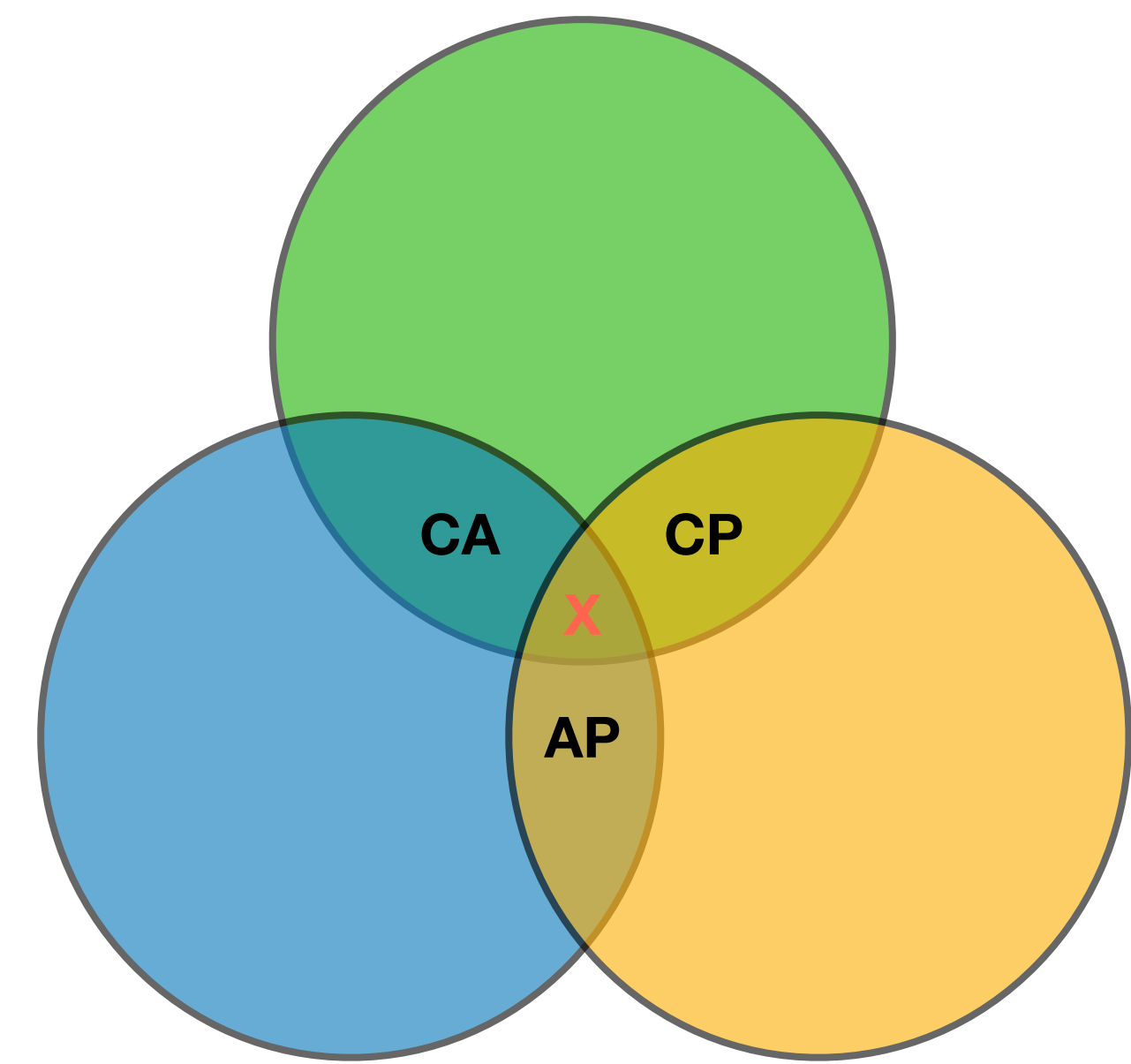
# Recap - CAP

- **Consistency**  
Every read receives the most recent write or an error
- **Availability**  
Every request receives a (non-error) response, without the guarantee that it contains the most recent write
- **Partition tolerance**  
The system continues to operate despite an arbitrary number of messages being dropped (or delayed) by the network



# Recap - CAP

- TLDR; If a node is down/unreachable
  - Cancel the operation (CP)
  - Return result with (maybe) inconsistency (AP)





# Tunable consistency in Cassandra

- When performing read/write, consistency level can be specified

Consistency level = # of nodes (replicas) needs to response

- ONE / TWO / QUORUM / LOCAL\_QUORUM / ALL / ...

# Tunable consistency in Cassandra

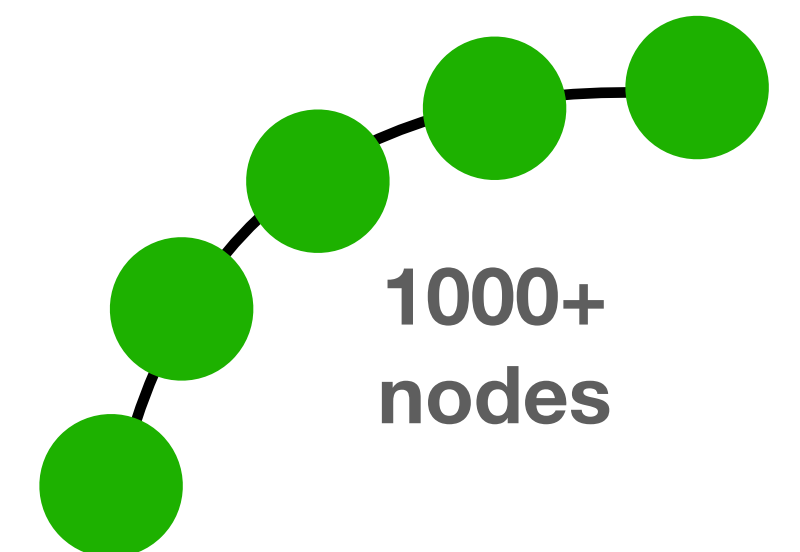
```
// within cqlsh session  
CONSISTENCY QUORUM  
INSERT INTO movies VALUES (3, "American Pie", 1999, 96)
```

# When to use which level?

- A function of application logic & resources (money)

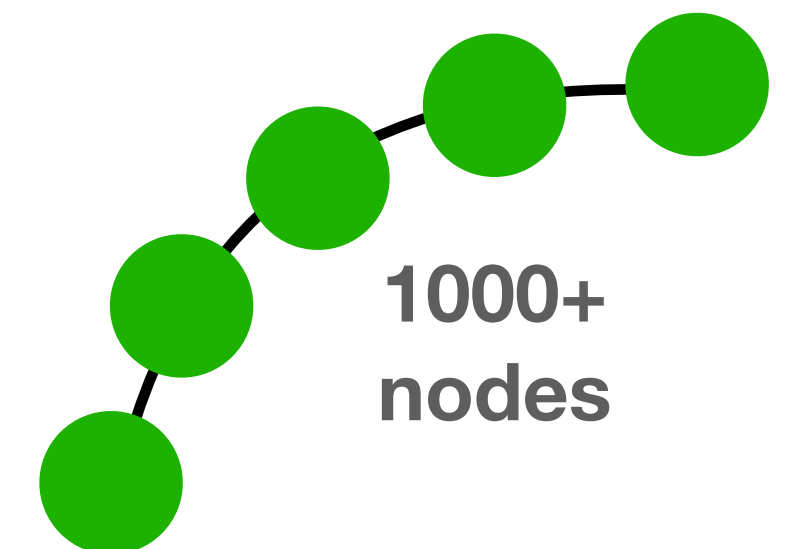
# When to use which level?

- A function of application logic & resources (money)
- For example:
  - A “like” event should get ONE or QUORUM?



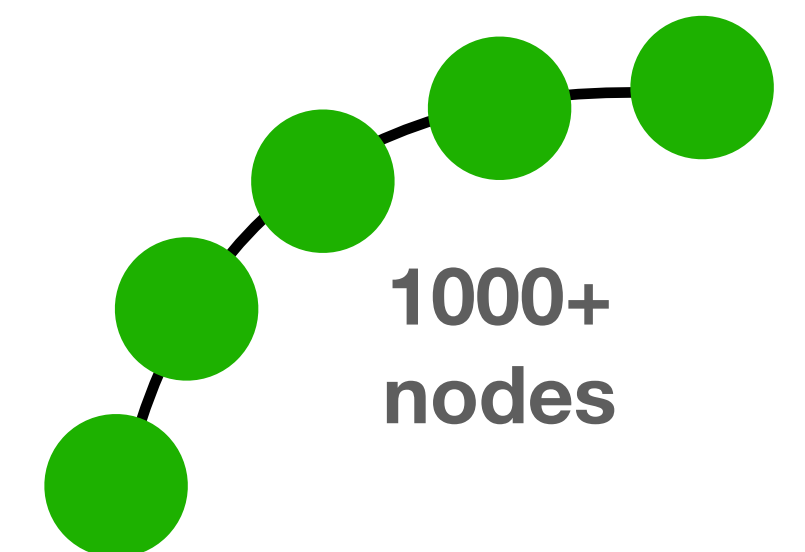
# When to use which level?

- A function of application logic & resources (money)
- For example:
  - A “like” event should get ONE or QUORUM?
  - A “buy” event should get ONE or QUORUM?



# When to use which level?

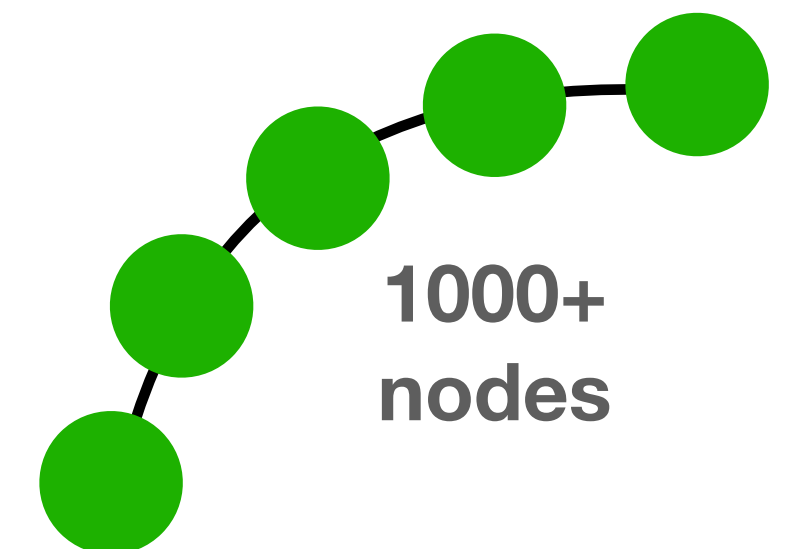
- A function of application logic & resources (money)
- For example:
  - A “like” event should get ONE or QUORUM?
  - A “buy” event should get ONE or QUORUM?
  - # of available rooms in a hotel should get ONE or QURUM?



# When to use which level?

- A function of application logic & resources (money)
- For example:
  - A “like” event should get ONE or QUORUM?
  - A “buy” event should get ONE or QUORUM?
  - # of available rooms in a hotel should get ONE or QURUM?

- Critical for performance on large scale



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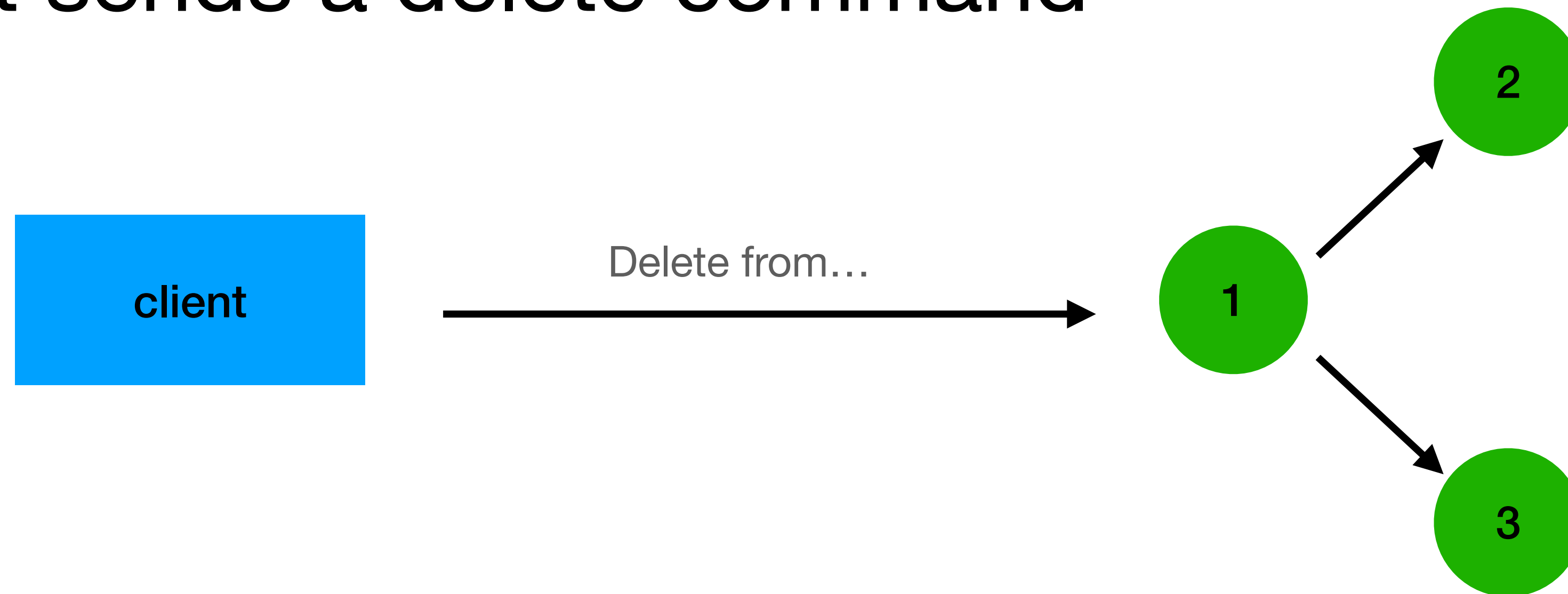


# Deletes in a distributed system

- A hard problem.  
Why?

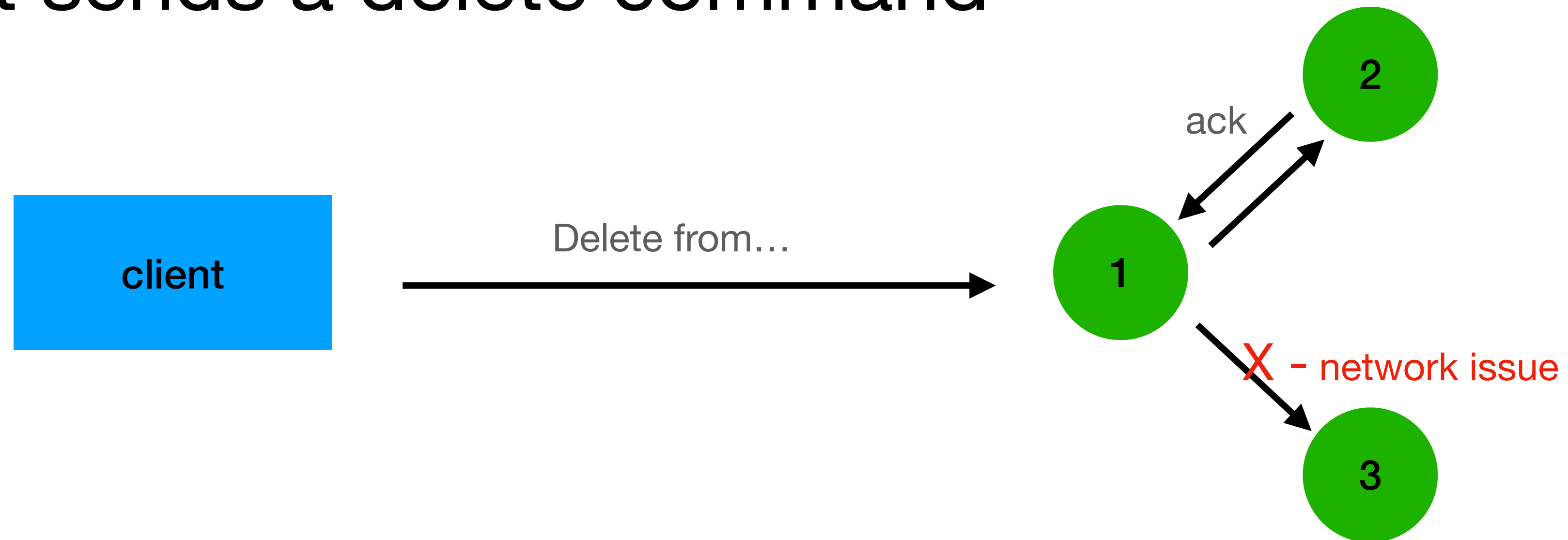
# Delete example - distributed system

- 3 nodes, replication factor = 3, consistency=quorum
- A client sends a delete command



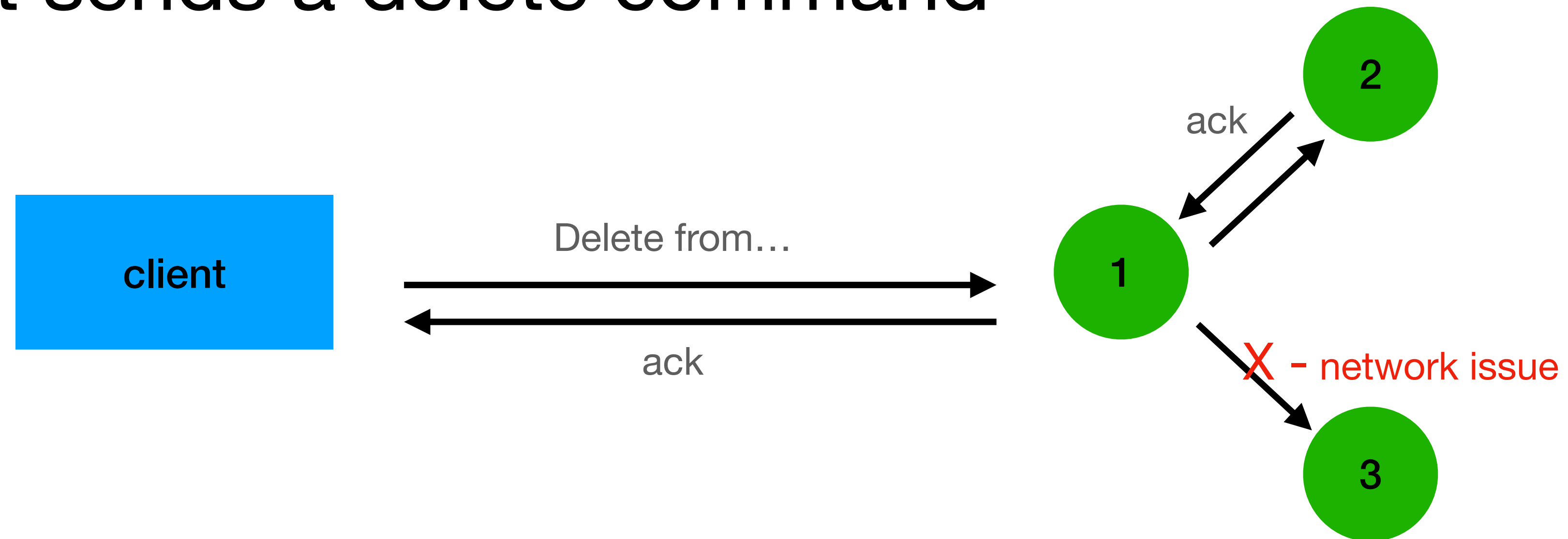
# Delete example - distributed system

- 3 nodes, replication factor = 3, consistency=quorum
- A client sends a delete command



# Delete example - distributed system

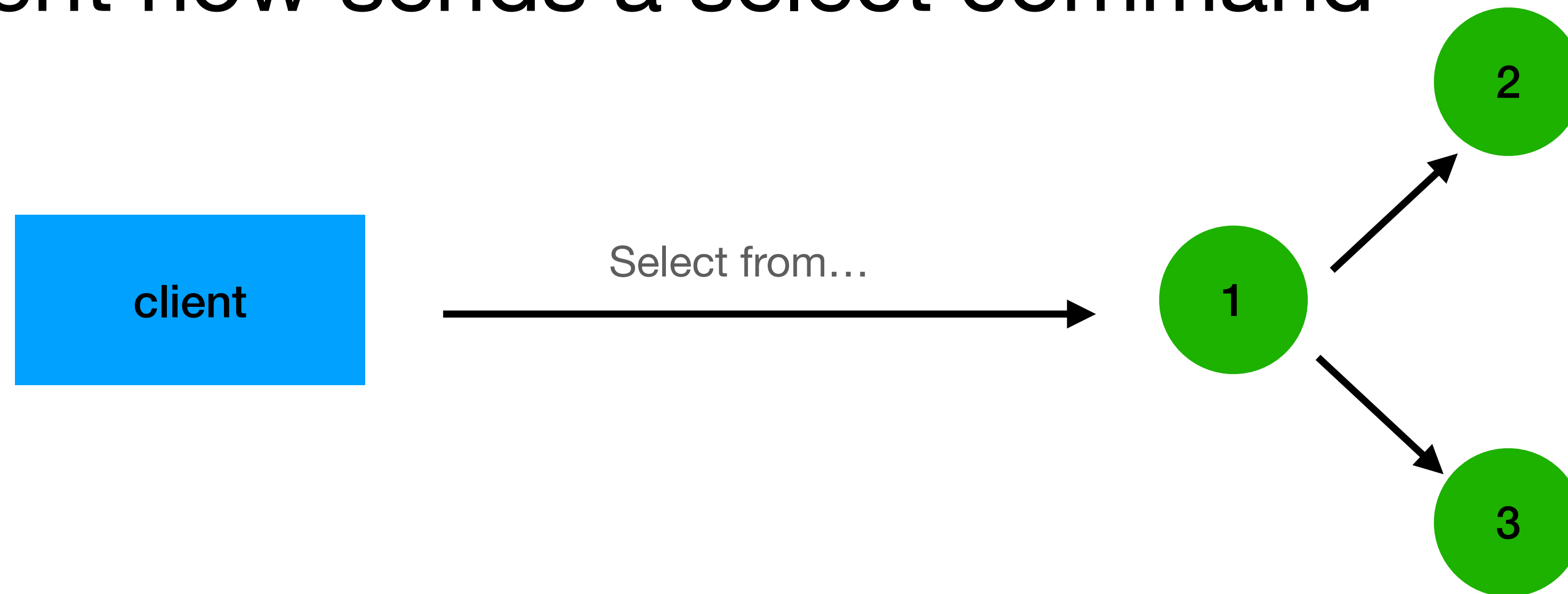
- 3 nodes, replication factor = 3, consistency=quorum
- A client sends a delete command



- Client receives success (2 out of 3)

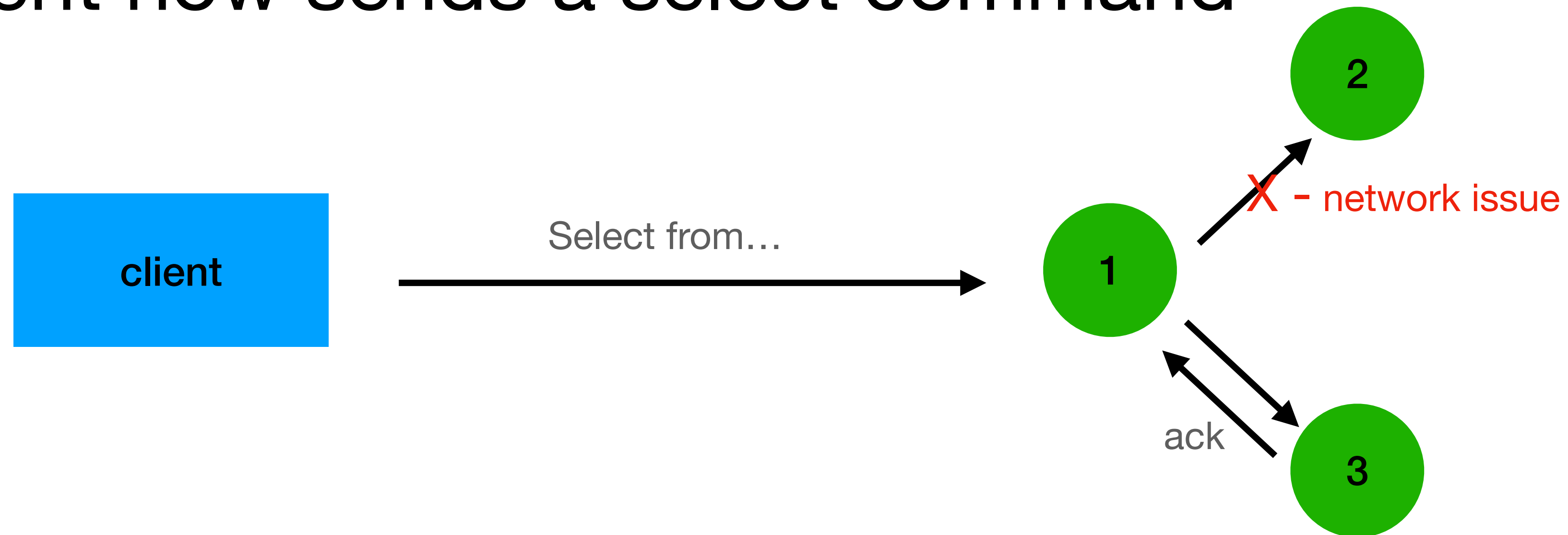
# Delete example - distributed system

- 3 nodes, replication factor = 3, consistency=quorum
- The client now sends a select command



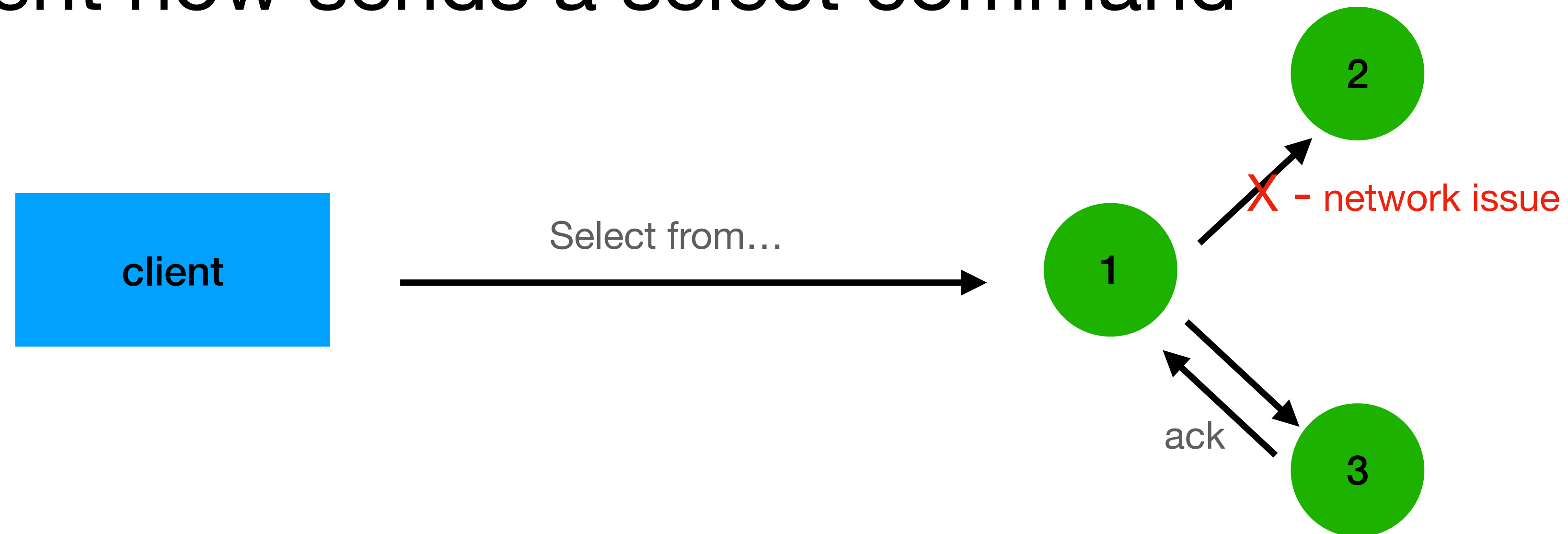
# Delete example - distributed system

- 3 nodes, replication factor = 3, consistency=quorum
- The client now sends a select command



# Delete example - distributed system

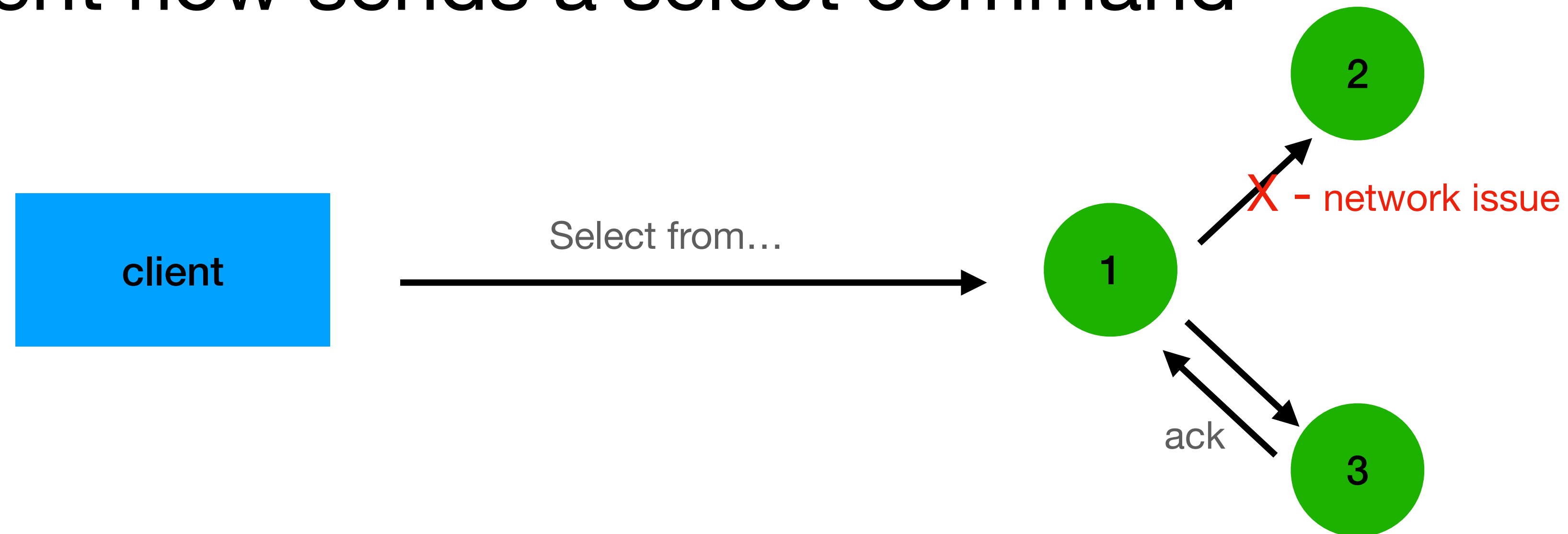
- 3 nodes, replication factor = 3, consistency=quorum
- The client now sends a select command



- Conflict! Node 3 contains data, Node 1 does not

# Delete example - distributed system

- 3 nodes, replication factor = 3, consistency=quorum
- The client now sends a select command



- Conflict! Node 3 contains data, Node 1 does not  
—> Cassandra will return “zombie” / “ghost” data



# Cassandra solution (simplified)

- When deleting, create a “delete entry” - **tombstone**
- Solves 2 problems:
  - the “ambiguous read”
  - immutable storage (SSTables)
- Before reads - Cassandra checks for relevant tombstones

# Tomestones

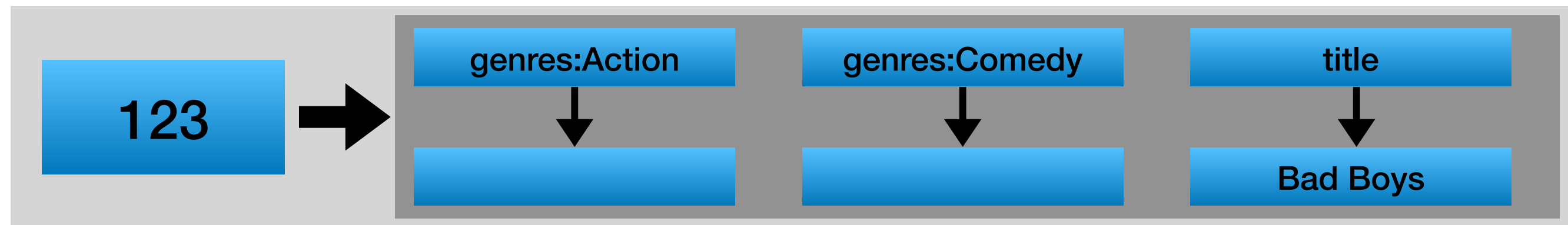
- Created when
  - DELETE
  - Setting TTLs
  - Inserting NULLs (avoid!)
  - Inserting data into a collection  
when inserting the entire collection



Why?

# Tombstone & SET

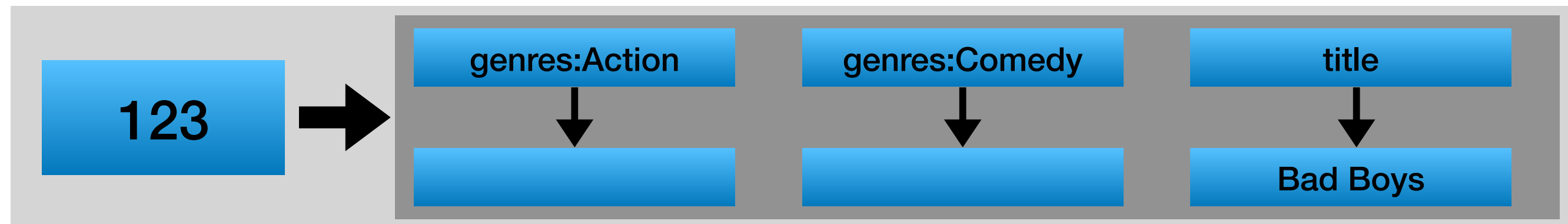
```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```



```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  genres        SET<text>  
  PRIMARY KEY (movie_id)  
);
```

# Tombstone & SET

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```

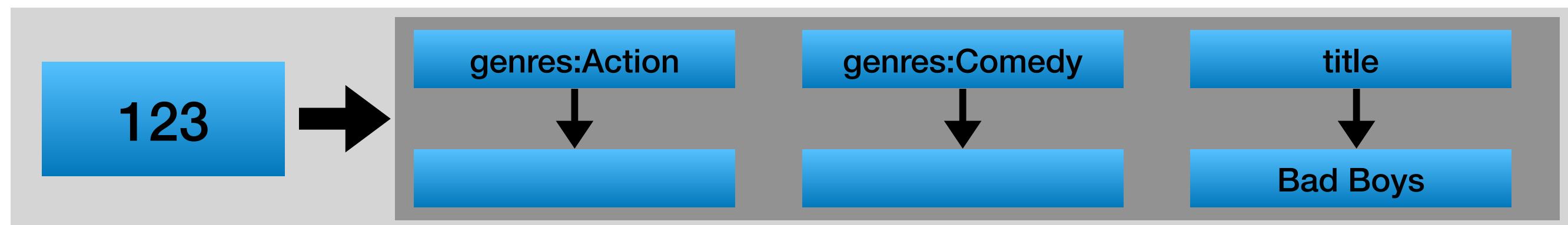


```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Teen", "Drama"})
```

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title         TEXT,  
  genres        SET<text>  
  PRIMARY KEY (movie_id)  
);
```

# Tombstone & SET

```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Action", "Comedy"})
```



```
INSERT INTO movies  
VALUES (123, "Bad Boys", {"Teen", "Drama"})
```

```
CREATE TABLE movies (  
  movie_id      BIGINT,  
  title        TEXT,  
  genres       SET<text>  
  PRIMARY KEY (movie_id)  
);
```

As data is stored in separate columns, we need to delete all previous existing columns

# Tomestones - how long do we keep them?

Any ideas?

# Tombstones - how long do we keep them?

Tombstones can be removed once:

- Creation time is longer than `gc_grace_seconds`  
default is 10 days
- A **repair** should run at least once every `gc_grace_seconds`  
repairs assures consistency among all nodes
- All sstables that could contain the relevant data are involved in the compaction

# Tomestones - problem

- Tombstones had performance hit for queries
- Warning in 1k tombstones per partition query
- Error in 100k tombstones per partition query



# Tomestones - problem - SOLUTION

- It all comes down to the data model
  - Adjusting and `gc_grace_seconds` and Repairs  
if you are doing this —> probably problems in production :(
- More on this later...  
modeling multi tenants for example