



Scalable data modelling by example

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Jobandtalent

- Revolutionising how people find jobs and how businesses hire employees.
- Leveraging data to produce a unique job matching technology.
- 10M+ users and 150K+ companies worldwide
- @jobandtalentEng / <http://jobandtalent.com>
- We are hiring!!





Cassandra Concepts

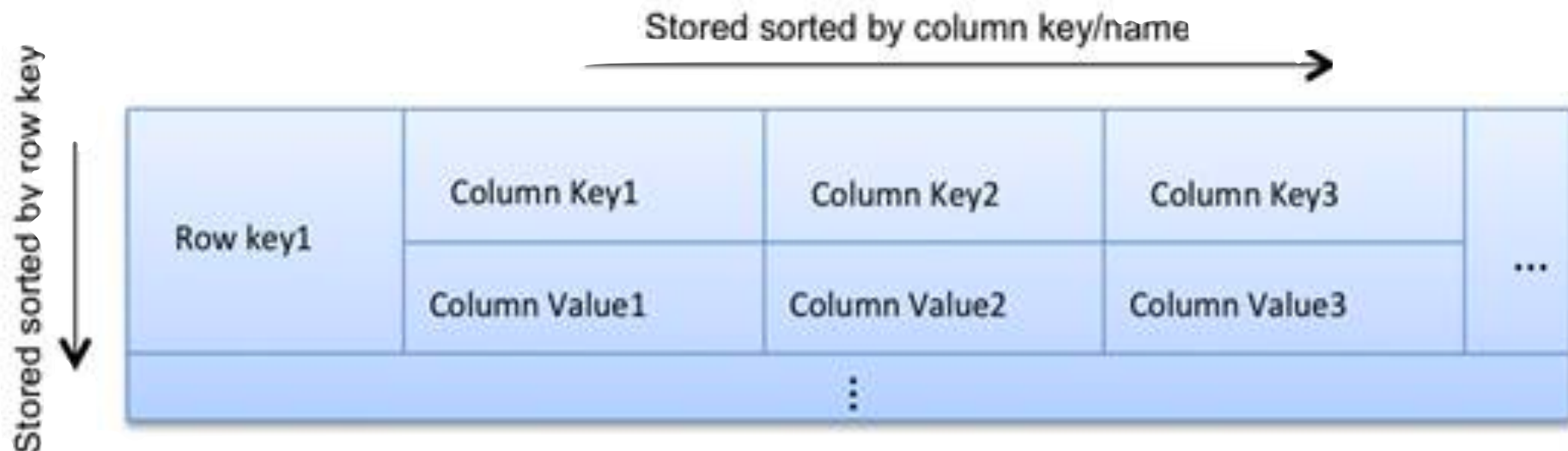


The data model is the only thing you can't change
once in production.

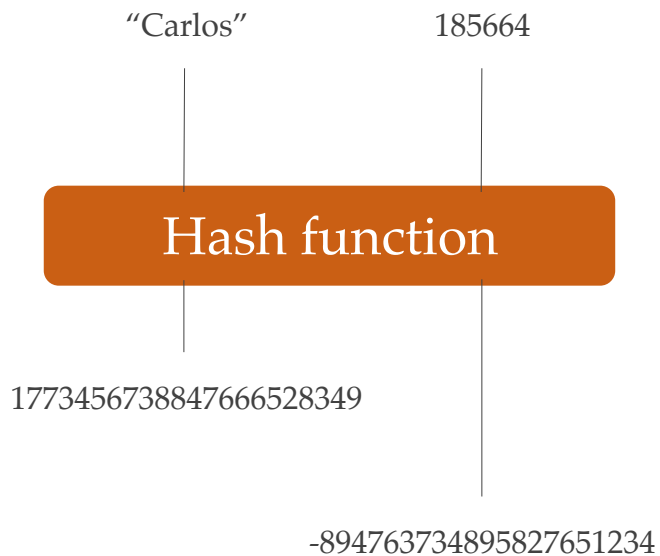
Data organisation



Physical Data Layout

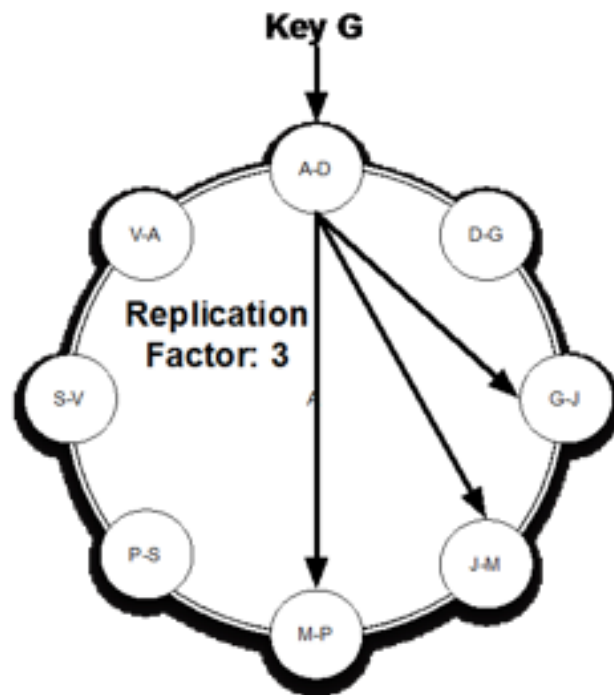


Consistent Hashing



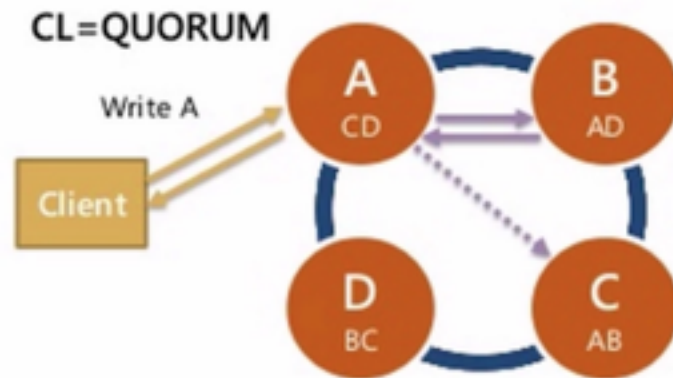
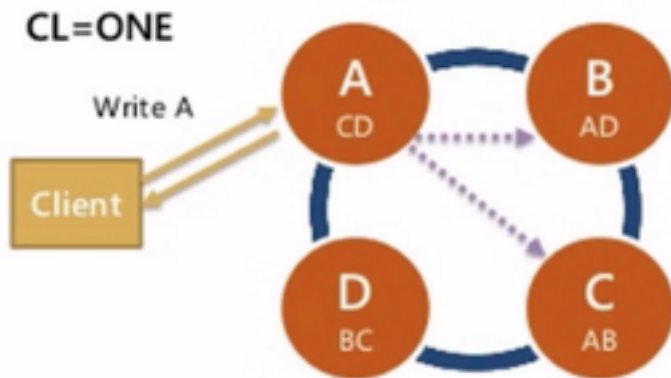
Replication factor

How many copies (replicas) for your data



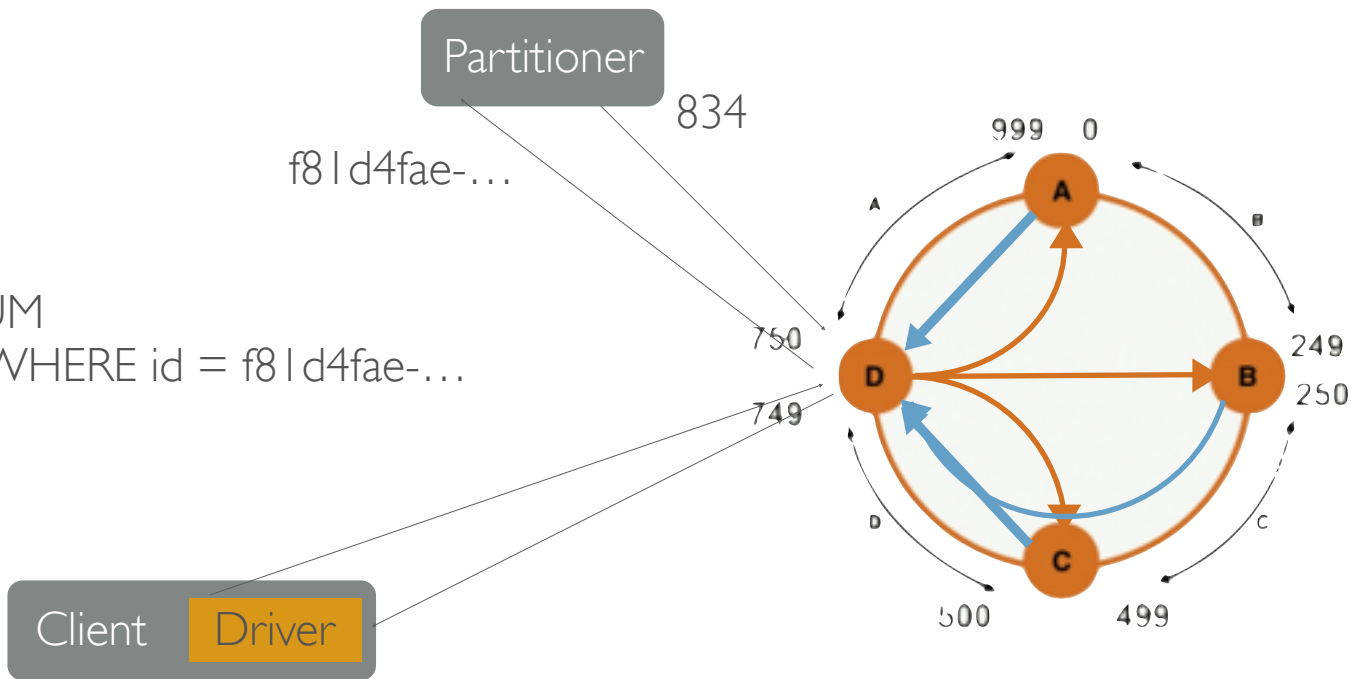
Consistency Level

How many replicas of your data must acknowledge?



A complete read/write example

- RF = 3
- CL = QUORUM
- `SELECT * ... WHERE id = f81d4fae-...`



Coordinator

Write
<3, Betty, Blue, 63>
Acknowledge

Periodically ...

Memtable (corresponds to a CQL table)

partition key1	first:Oscar	last:Orange	level:42
partition key2	first:Ricky	last:Red	
partition key3	first:Betty	last:Blue	level:63

Flush current state to SSTable

Node memory

Node file system



CommitLog

Append Only

...
...
...

...
...
...
...

...
...
...
...

SSTables

Row and Key miss

Off Heap

On Heap

Coordinator

Read
<pk7>

Row Cache (optional)

pk1, pk2, pk7

Miss

Bloom Filter

Bloom Filter

Bloom Filter

Key Cache
pk7

Miss

Miss

Partition Summary

Partition Summary

Partition Index

Partition Index

pk1

pk7

pk2

pk7

pk1

pk2

...

first: Betty

...

first: Elizabeth

...

...

...

last: Blue

...

last: Blue

...

...

...

level: 63

...

level: 42

...

...

...

timestamp: 541

...

timestamp: 994

...

...

...

timestamp: 541

...

timestamp: 541

...

...

...

level: 63

...

level: 42

...

...

...

timestamp: 541

...

timestamp: 541

...

...

...

level: 63

...

level: 42

...

...

...

timestamp: 541

...

timestamp: 541

...

...

...

level: 63

...

level: 42

...

...

...

timestamp: 541

...

timestamp: 541

...

...

...

level: 63

...

level: 42

...

...

MemTable (e.g., player)

...
pk7	level: 42 timestamp 1114

Node memory

Node file system

SSTables (e.g., player)

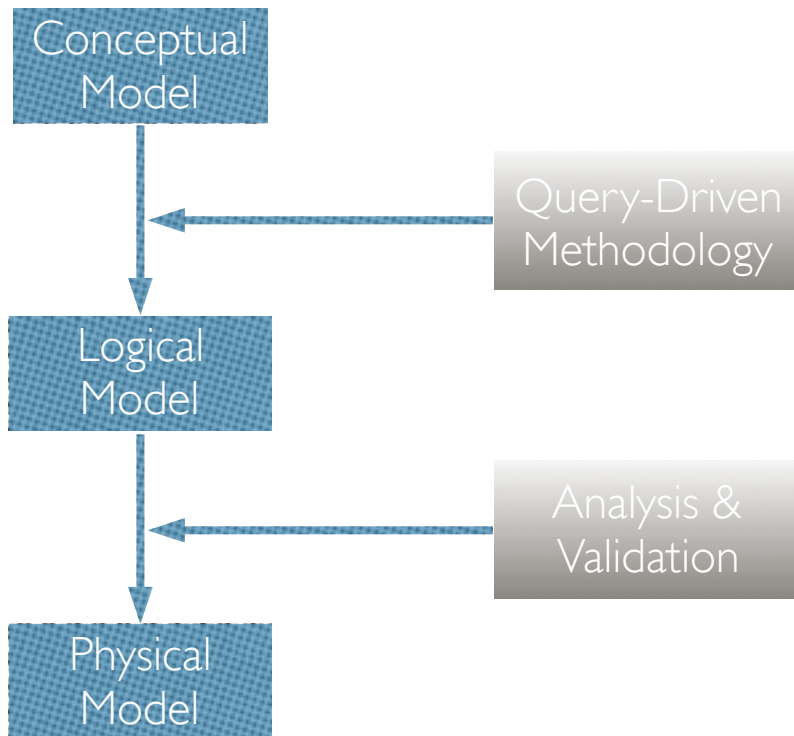


Data Modelling

Data Modelling

- Understand your data
- Decide (know) how you'll query the data
- Define column families to satisfy those queries
- Implement and optimise

Data Modelling



Query Driven Methodology: goals

- Spread data evenly around the cluster
- Minimise the number of partitions read
- Keep partitions manageable

Query Driven Methodology: process

- Entities and relationships: map to tables
- Key attributes: map to primary key columns
- Equality search attributes: must be at the beginning of the primary key
- Inequality search attributes: become clustering columns
- Ordering attributes: become clustering columns

The Primary Key

PARTITION
KEY

+

CLUSTERING
COLUMN(S)

```
CREATE TABLE . . .(  
    fields . . .  
    PRIMARY KEY (part_key, clust1, . . .)  
);
```

Analysis & Validation

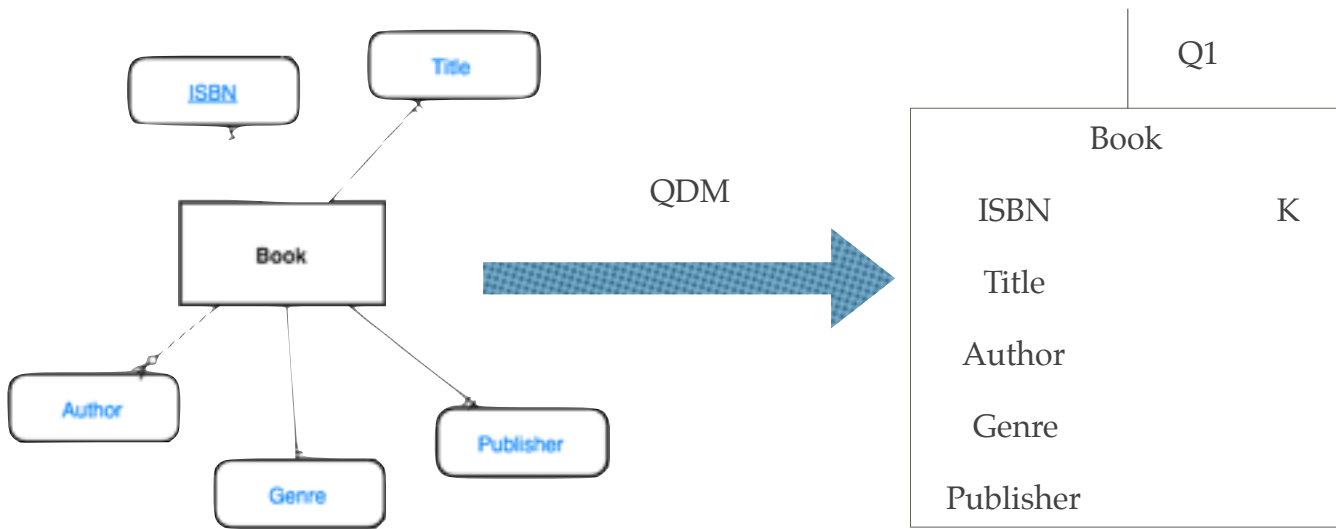
- Data evenly spread?
- 1 Partition per read?
- Are write conflicts (overwrites) possible?
- How large are partitions?
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
- How much data duplication? (batches)



An E-Library project.

Requirement: 1

Books can be uniquely identified and accessed by ISBN, we also need a title, genre, author and publisher.



Q1: Find books by ISBN

Analysis & Validation

- Data evenly spread? ✓
- 1 Partition per read? ✓
- Are write conflicts (overwrites) possible? ✓
- How large are partitions? ✓
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
 - $1 \times (5 - 1 - 0) + 0 < 1\text{M}$
- How much data duplication? 0 ✓

Q1: Find books by ISBN

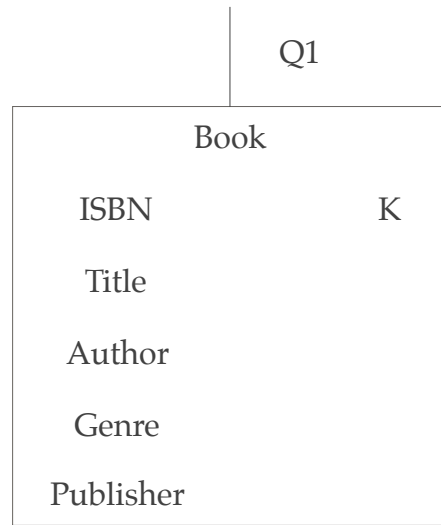
Q1	
Book	
ISBN	K
Title	
Author	
Genre	
Publisher	

Physical data model

```
CREATE TABLE books (  
  ISBN VARCHAR PRIMARY KEY,  
  title VARCHAR,  
  author VARCHAR,  
  genre VARCHAR,  
  publisher VARCHAR  
);
```

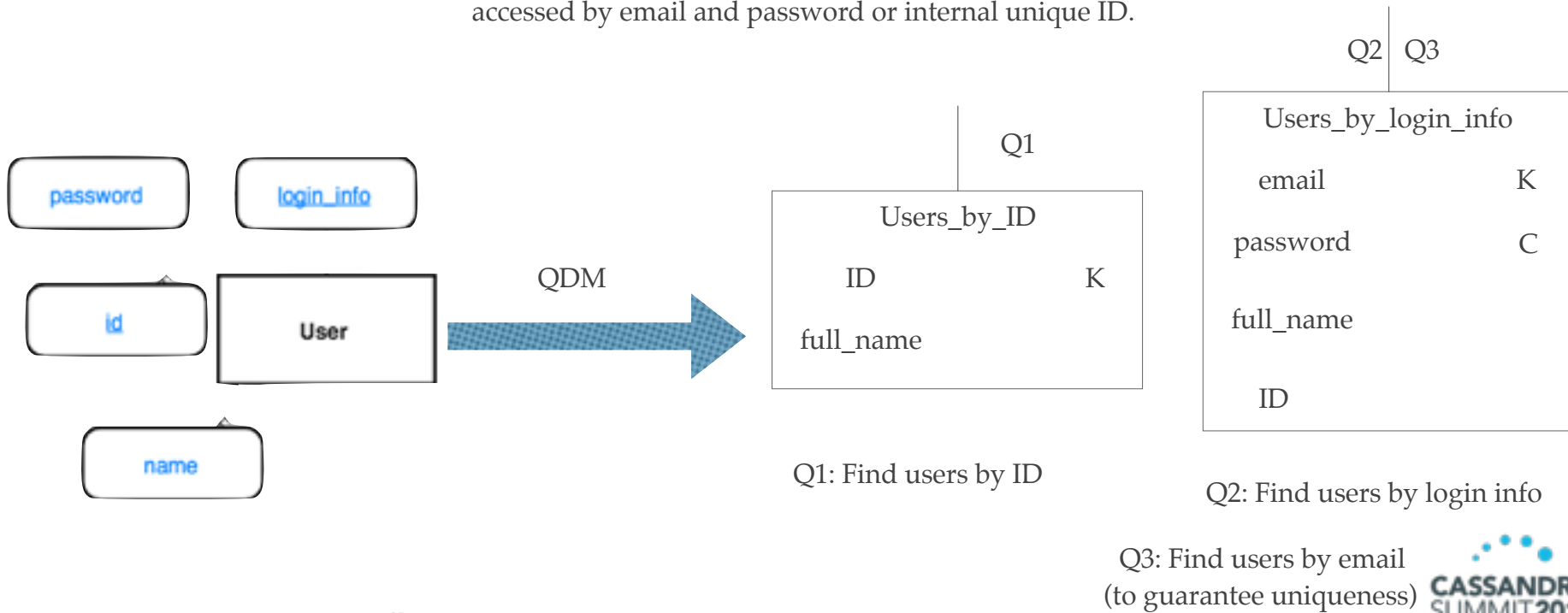
```
SELECT * FROM books WHERE ISBN = '...';
```

Q1: Find books by ISBN



Requirement 2

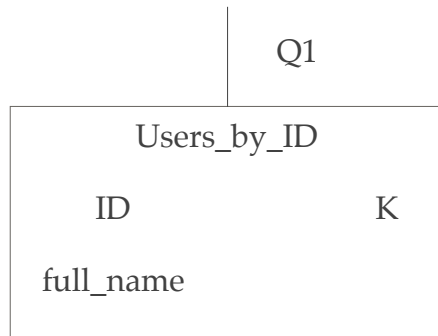
Users register into the system uniquely identified by an email and a password. We also want their full name. They will be accessed by email and password or internal unique ID.



Analysis & Validation

- Data evenly spread? ✓
- 1 Partition per read? ✓
- Are write conflicts (overwrites) possible? ✓
- How large are partitions? ✓
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
 - $1 \times (2 - 1 - 0) + 0 < 1\text{M}$
- How much data duplication? 0 ✓

Q1: Find users by ID

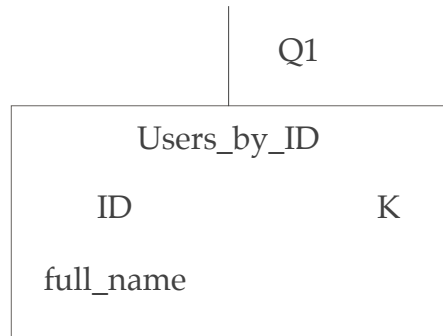


Physical Data Model

```
CREATE TABLE users_by_id (  
  ID TIMEUUID PRIMARY KEY,  
  full_name VARCHAR  
);
```

```
SELECT * FROM users_by_id WHERE ID = ...;
```

Q1: Find users by ID



Analysis & Validation

- Data evenly spread? ✓
- 1 Partition per read? ✓
- Are write conflicts (overwrites) possible? ✓
- How large are partitions? ✓
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
 - $1 \times (4 - 1 - 0) + 0 < 1\text{M}$
- How much data duplication? 1 ✓

Q2: Find users by login info

Q3: Find users by email
(to guarantee uniqueness)

Users_by_login_info	
email	K
password	C
full_name	
ID	

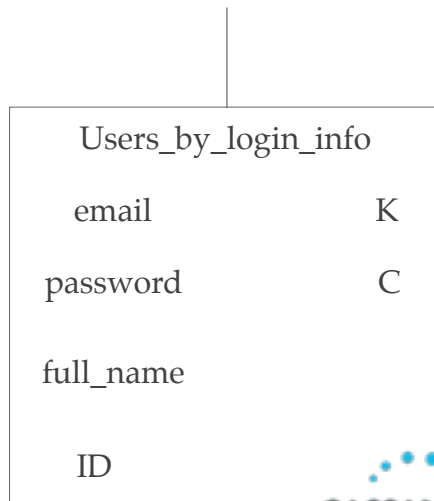
Physical Data Model

```
CREATE TABLE users_by_login_info (  
    email VARCHAR,  
    password VARCHAR,  
    full_name VARCHAR,  
    ID TIMEUUID,  
    PRIMARY KEY (email, password)  
);
```

```
SELECT * FROM users_by_login_info  
WHERE email = '...' [AND password = '...'];
```

Q2: Find users by login info

Q3: Find users by email
(to guarantee uniqueness)



Physical Data Model

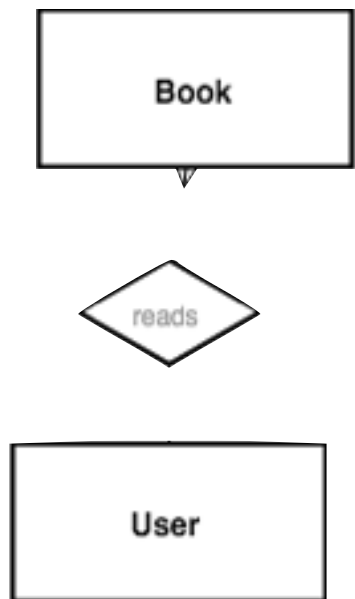
```
BEGIN BATCH
  INSERT INTO users_by_id (ID, full_name) VALUES (...) IF NOT EXISTS;
  INSERT INTO users_by_login_info (email, password, full_name, ID) VALUES (...);
APPLY BATCH;
```

Requirement 3

Users read books.

We want to know which books has a user read and
show them sorted by title and author

Q1: Find all books a logged
user has read



QDM



Q1

Books_read_by_user	
user_ID	K
title	C
author	C
full_name	S
ISBN	
genre	
publisher	

Analysis & Validation

- Data evenly spread? ✓
- 1 Partition per read? ✓
- Are write conflicts (overwrites) possible? ✓
- How large are partitions? ✓
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
 - $\text{Books} \times (7 - 1 - 1) + 1 < 1\text{M} \Rightarrow 200,000 \text{ books per user}$
- How much data duplication? 0 ✓

Q1: Find all books a logged
user has read

Q1

Books_read_by_user	
user_ID	K
title	C
author	C
full_name	S
ISBN	
genre	
publisher	

Physical Data Model

```
CREATE TABLE books_read_by_user (  
  user_id TIMEUUID,  
  title VARCHAR,  
  author VARCHAR,  
  full_name VARCHAR STATIC,  
  ISBN VARCHAR,  
  genre VARCHAR,  
  publisher VARCHAR,  
  PRIMARY KEY (user_id, title, author)  
);
```

```
SELECT * FROM books_read_by_user  
WHERE user_ID = ...;
```

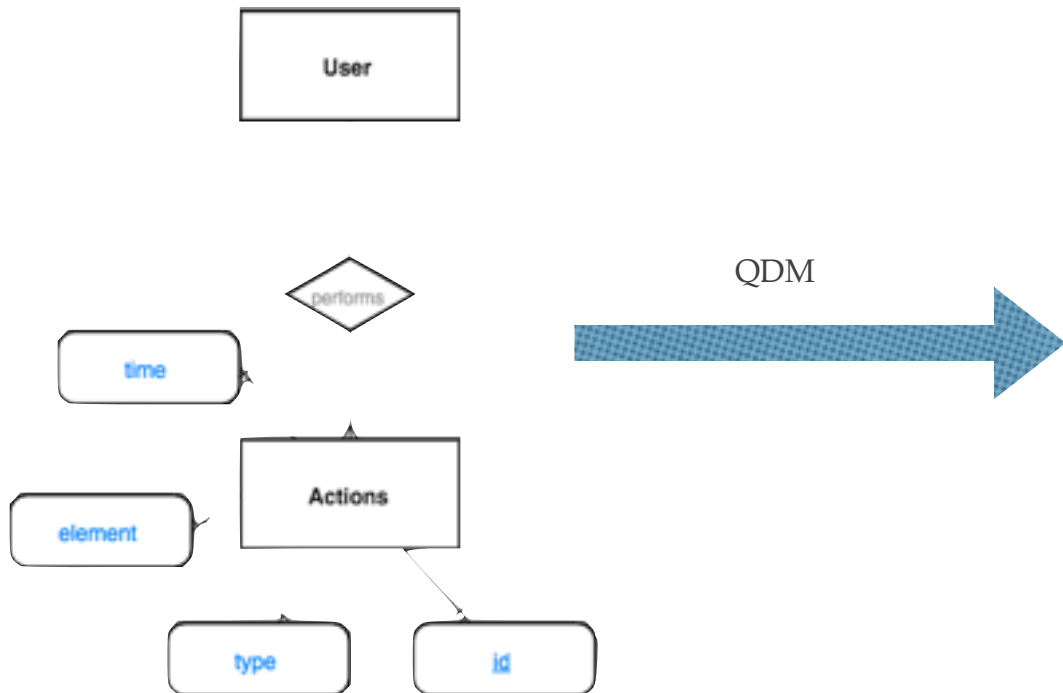
Q1: Find all books a logged
user has read

Q1

Books_read_by_user	
user_ID	K
title	C
author	C
full_name	S
ISBN	
genre	
publisher	

Requirement 4

In order to improve our site's usability we need to understand how our users use it by tracking every interaction they have with our site.



Q1	
Actions_by_user	
user_ID	K
time	C
element	
type	

Q1: Find all actions a user
does in a time range

Analysis & Validation

- Data evenly spread? ✓
- 1 Partition per read? ✓
- Are write conflicts (overwrites) possible? ✓
- How large are partitions? ✗
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
 - $\text{Actions} \times (4 - 1 - 0) + 0 < 1\text{M} \Rightarrow 333.333$
- How much data duplication? 0

Q1: Find all actions a user does in a time range

Q1	
Actions_by_user	
user_ID	K
time	C
element	
type	

Requirement 4: Bucketing

- $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
- $\text{Actions} \times (5 - 2 - 0) + 0 < 1\text{M} \Rightarrow 333.333$
per user every <bucket_size>

bucket_size = 1 year \Rightarrow 38 actions / h

bucket_size = 1 month \Rightarrow 462 actions / h

bucket_size = 1 week \Rightarrow 1984 actions / h

Actions_by_user	
user_ID	K
month	K
time	C
element	
type	

Analysis & Validation

- Data evenly spread? ✓
- 1 Partition per read? ✓
- Are write conflicts (overwrites) possible? ✓
- How large are partitions? ✓
 - $N_{\text{cells}} = N_{\text{row}} \times (N_{\text{cols}} - N_{\text{pk}} - N_{\text{static}}) + N_{\text{static}} < 1\text{M}$
 - $\text{Actions} \times (5 - 2 - 0) + 0 < 1\text{M} \Rightarrow 333.333 / \text{month}$
- How much data duplication? 0 ✓

Q1: Find all actions a user does in a time range

Q1	
Actions_by_user	
user_ID	K
month	K
time	C
element	
type	

Physical Data Model

```
CREATE TABLE actions_by_user (  
  user_ID TIMEUUID,  
  month INT,  
  time TIMESTAMP,  
  element VARCHAR,  
  type VARCHAR,  
  PRIMARY KEY ((user_ID, month), time)  
);
```

```
SELECT * FROM actions_by_user  
WHERE user_ID = ... AND month = ... AND time < ... AND time > ...;
```

Q1: Find all actions a user
does in a time range

Q1	
Actions_by_user	
user_ID	K
month	K
time	C
element	
type	

Further validation

$$\sum \text{sizeOf}(\text{pk}) + \sum \text{sizeOf}(\text{sc}) + \text{Nr} \times \sum (\text{sizeOf}(\text{rc}) + \sum \text{sizeOf}(\text{clc})) + 8 \times \text{Nv} < 200 \text{ MB}$$

- pk = Partition Key column
- sc = Static column
- Nr = Number of rows
- rc = Regular column
- clc = Clustering column
- Nv = Number of values

Next Steps

- Test your models against your hardware setup
 - `cassandra-stress`
 - <http://www.sestevez.com/sestevez/CassandraDataModeler/> (kudos Sebastian Estevez)
- Monitor everything
 - DataStax OpsCenter
 - Graphite
 - Datadog
 - . . .



Thanks!

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