The Goal:

Basic understanding of Cassandra data modeling

- Fundamental Cassandra storage constructs
- How data modeling differs between Cassandra and relational
- Learn a Cassandra data modeling process



Relational Expectations...

Given this table

You might expect to execute this query

```
SELECT * FROM killrvideo.users WHERE email = 'me_email@gmail.com';
```

Column Name	Column Type
userid	UUID
created_date	TIMESTAMP
email	TEXT
firstname	TEXT
lastname	TEXT

Relational Expectations...

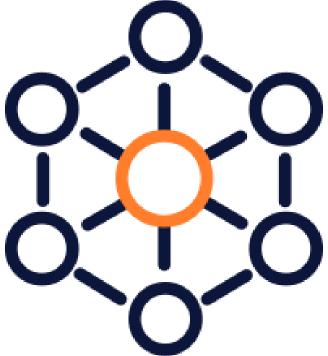
Column Name	Column Type
userid	UUID
created_date	TIMESTAMP
email	TEXT
firstname	TEXT
lastname	TEXT

Execution Error

An error occurred on line 1:
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 (Hint: Ctrl-L to toggle line numbers.)

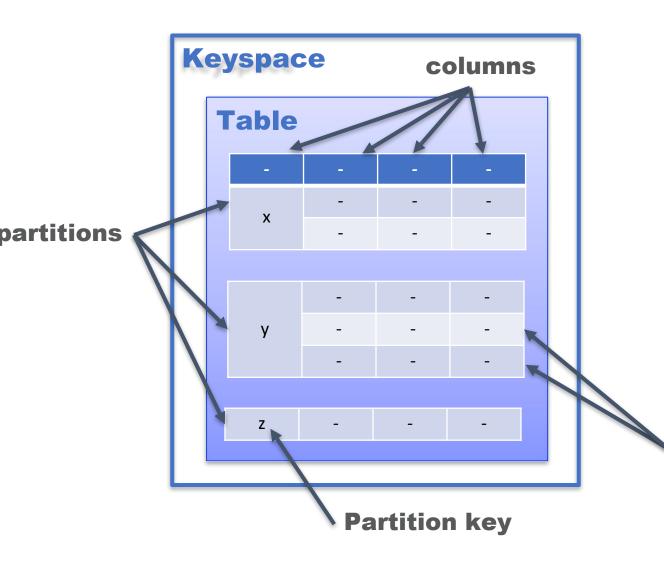
But it doesn't work!

Cassandra Tables Work Differently!



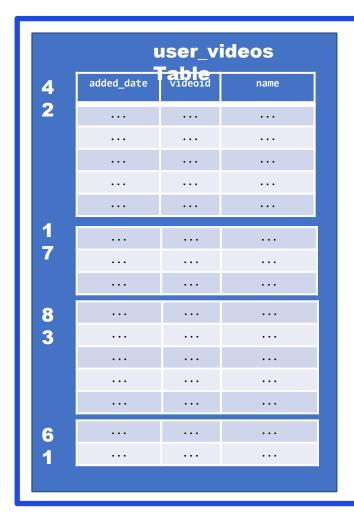
Let's see why...

How does Cassandra structure data?



- Tabular data model, with one twist
- Keyspaces contain tables
- Tables are organized in rows and columns
- Groups of related rows, called partitions, are stored together on the same node (or nodes)
- Each row contains a partition key
 - One or more columns that are hashed to determine which node(s) store that data

killrvideo Keyspace



	users		
2 5	added_date	videoid	able
5	• • •	•••	•••
	•••	•••	•••
	•••	•••	• • •
	•••	• • •	•••
1			
1 3		•••	• • •
	•••	•••	
	•••		•••
9		•••	
9 5		•••	
		• • • •	
	•••	•••	
2			
2 2	•••	•••	

user_credentials				
3 1	added_date	Videoid	name	
1	•••	•••		
	•••	• • •	•••	
	•••	• • • •		
	•••			
	•••	•••		
1	•••	• • •		
1	•••			
	•••	•••		
6		•••		
6 3	•••	•••	• • •	
	•••	•••	•••	
6	•••			
6 7	•••	• • •	• • •	

```
CREATE TABLE user_videos (
    userid uuid,
    added_date timestamp,
    videoid uuid,
    name text,
    PRIMARY KEY ((userid), added_date, videoid)
```

```
CREATE TABLE user_videos (
    userid uuid,
    added_date timestamp,
    videoid uuid,
                             Primary Key
    name text,
    PRIMARY KEY ((userid), added_date, videoid)
```

```
CREATE TABLE user_videos (
    userid uuid,
    added_date timestamp,
    videoid uuid,
                             Primary Key
    name text,
    PRIMARY KEY ((userid), added_date, videoid)
                 Partition Key
```

```
CREATE TABLE user_videos (
    userid uuid,
    added_date timestamp,
    videoid uuid,
                             Primary Key
    name text,
    PRIMARY KEY ((userid), added_date, videoid)
               Partition Key
                               Clustering Columns
```

- Partition the fundamental unit of access
- A Partition has
 - A partition key
 - Associated rows with
 - Clustering columns
 - Data columns

userid	added_date	videoid	name
749b2843	2019-09-18 10:38:42	2370b72f	Cat videos
749b2843	2019-09-18 10:38:42	e860f31a	Dog videos
749b2843	2019-09-19 11:15:27	89e11f78	Parakeet videos
749b2843	2019-09-19 21:13:03	115ee279	Turtle videos
749b2843	2019-09-20 12:17:11	49ef2219	Moose videos

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- A Partition has
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 - Data columns

Partition Key:

749b2843-...

userid	added_date	videoid	name
749b2843	2019-09-18 10:38:42	2370b72f	Cat videos
749b2843	2019-09-18 10:38:42	e860f31a	Dog videos
749b2843	2019-09-19 11:15:27	89e11f78	Parakeet videos
749b2843	2019-09-19 21:13:03	115ee279	Turtle videos
749b2843	2019-09-20 12:17:11	49ef2219	Moose videos

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Partition	
Key:	

749b2843-...



userid	added_date	videoid	name
749b2843	2019-09-18 10:38:42	2370b72f	Cat videos
749b2843	2019-09-18 10:38:42	e860f31a	Dog videos
749b2843	2019-09-19 11:15:27	89e11f78	Parakeet videos
749b2843	2019-09-19 21:13:03	115ee279	Turtle videos
749b2843	2019-09-20 12:17:11	49ef2219	Moose videos

- Partition the fundamental unit of access
- A Partition has
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 - Associated rows with
 - Clustering columns
 - Data columns

Partition	Hash
Key:	Function 42
749h2843-	

userid	added_date	videoid	name
749b2843	2019-09-18 10:38:42	2370b72f	Cat videos
749b2843	2019-09-18 10:38:42	e860f31a	Dog videos
749b2843	2019-09-19 11:15:27	89e11f78	Parakeet videos
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749b2843	2019-09-20 12:17:11	49ef2219	Moose videos

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 - A partition key
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Partition Key:

749b2843-...



userid	added_date	videoid	name
749b2843	2019-09-18 10:38:42	2370b72f	Cat videos
749b2843	2019-09-18 10:38:42	e860f31a	Dog videos
749b2843	2019-09-19 11:15:27	89e11f78	Parakeet videos
749b2843	2019-09-19 21:13:03	115ee279	Turtle videos
749b2843	2019-09-20 12:17:11	49ef2219	Moose videos

Partition 42

- Partition the fundamental unit of access
- A Partition has
 - A partition key
 - Associated rows with
 - Clustering columns
 - Data columns

 userid
 added_date
 videoid
 name

 749b2843-...
 2019-09-18 10:38:42
 2370b72f-...
 Cat videos

 749b2843-...
 2019-09-18 10:38:42
 e860f31a-...
 Dog videos

 749b2843-...
 2019-09-19 11:15:27
 89e11f78-...
 Parakeet videos

115ee279-... Turtle videos

Moose videos

49ef2219-...

Clustering Columns

749b2843-... 2019-09-19 21:13:03

749b2843-... 2019-09-20 12:17:11

- Partition the fundamental unit of access
- A Partition has
 - A partition key
 - Associated rows with
 - Clustering columns
 - Data columns

Partition 42

userid added date videoid name 749b2843-... 2019-09-18 10:38:42 2370b72f-... Cat videos 749b2843-... 2019-09-18 10:38:42 Dog videos e860f31a-... Parakeet videos 749b2843-... 2019-09-19 11:15:27 89e11f78-... 749b2843-... 2019-09-19 21:13:03 115ee279-... Turtle videos

49ef2219-...

Data Column

Moose videos

749b2843-... 2019-09-20 12:17:11

Tables hold many partitions

Partition 749b2843-...

added_	date	videoid	name
2019-09-18	10:38:42	2370b72f	Cat videos
2019-09-18	10:38:42	e860f31a	Dog videos
2019-09-19	11:15:27	89e11f78	Parakeet videos
2019-09-19	21:13:03	115ee279	Turtle videos
2019-09-20	12:17:11	49ef2219	Moose videos

	Ш	20K		
	User Videos			
4	added_date	videoid	name	
2	2019-09-18 10:38:42	2370b72f	Cat videos	
	2019-09-18 10:38:42	e860f31a	Dog videos	
	2019-09-19 11:15:27	89e11f78	Parakeet videos	
	2019-09-19 21:13:03	115ee279	Turtle videos	
	2019-09-20 12:17:11	49ef2219	Moose videos	

Tables hold many partitions

added_date	videoid	name
2019-09-17 20:28:57	2370342f	Frog videos
2019-09-18 10:38:42	e860f91a	Lizard videos
2019-09-19 11:15:27	45e11f78	Horse videos

	U	ser	
	Vi	deos	
4	added_date	videoid	name
2	2019-09-18 10:38:42	2370b72f	Cat videos
	2019-09-18 10:38:42	e860f31a	Dog videos
	2019-09-19 11:15:27	89e11f78	Parakeet videos
	2019-09-19 21:13:03	115ee279	Turtle videos
	2019-09-20 12:17:11	49ef2219	Moose videos
1	2019-09-17 20:28:57	2370342f	Frog videos
7	. 2019-09-18 10:38:42	e860f91a	Lizard videos
	2019-09-19 11:15:27	45e11f78	Horse videos

Tables hold many partitions

added_date	videoid	name
2019-09-17 20:28:57	23efb72f	Mouse videos
2019-09-18 10:38:42	4560f31a	Bee videos
2019-09-19 11:15:27	89ebcf78	Eagle videos
2019-09-19 21:13:03	123ee279	Tuna videos
2019-09-20 12:17:11	49ef3719	Whale videos

A	User				
2019-09-18 10:38:42 2370b72f Cat videos 2019-09-18 10:38:42 e860f31a Dog videos 2019-09-19 11:15:27 89e11f78 Parakeet videos 2019-09-19 21:13:03 115ee279 Turtle videos 2019-09-20 12:17:11 49ef2219 Moose videos 2019-09-17 20:28:57 2370342f Frog videos 2019-09-18 10:38:42 e860f91a Lizard videos 2019-09-19 11:15:27 45e11f78 Horse videos 2019-09-18 10:38:42 4560f31a Bee videos 2019-09-19 11:15:27 89ebcf78 Eagle videos 2019-09-19 21:13:03 123ee279 Tuna videos					
2019-09-18 10:38:42 e860f31a Dog videos 2019-09-19 11:15:27 89e11f78 Parakeet videos 2019-09-19 21:13:03 115ee279 Turtle videos 2019-09-20 12:17:11 49ef2219 Moose videos 2019-09-17 20:28:57 2370342f Frog videos 2019-09-18 10:38:42 e860f91a Lizard videos 2019-09-19 11:15:27 45e11f78 Horse videos 2019-09-18 10:38:42 4560f31a Bee videos 2019-09-19 11:15:27 89ebcf78 Eagle videos 2019-09-19 21:13:03 123ee279 Tuna videos	4	added_date	videoid	name	
2019-09-19 11:15:27 89e11f78 Parakeet videos 2019-09-19 21:13:03 115ee279 Turtle videos 2019-09-20 12:17:11 49ef2219 Moose videos 1 2019-09-17 20:28:57 2370342f Frog videos 2019-09-18 10:38:42 e860f91a Lizard videos 2019-09-19 11:15:27 45e11f78 Horse videos 2019-09-18 10:38:42 4560f31a Bee videos 2019-09-19 11:15:27 89ebcf78 Eagle videos 2019-09-19 21:13:03 123ee279 Tuna videos	2	2019-09-18 10:38:42	2370b72f	Cat videos	
2019-09-19 21:13:03		2019-09-18 10:38:42	e860f31a	Dog videos	
2019-09-20 12:17:11		2019-09-19 11:15:27	89e11f78	Parakeet videos	
1		2019-09-19 21:13:03	115ee279	Turtle videos	
7 2019-09-18 10:38:42 e860f91a Lizard videos 2019-09-19 11:15:27 45e11f78 Horse videos 2019-09-17 20:28:57 23efb72f Mouse videos 2019-09-18 10:38:42 4560f31a Bee videos 2019-09-19 11:15:27 89ebcf78 Eagle videos 2019-09-19 21:13:03 123ee279 Tuna videos		2019-09-20 12:17:11	49ef2219	Moose videos	
2019-09-19 11:15:27	1	2019-09-17 20:28:57	2370342f	Frog videos	
8 2019-09-17 20:28:57	7	2019-09-18 10:38:42	e860f91a	Lizard videos	
2019-09-18 10:38:42 4560f31a Bee videos 2019-09-19 11:15:27 89ebcf78 Eagle videos 2019-09-19 21:13:03 123ee279 Tuna videos		2019-09-19 11:15:27	45e11f78	Horse videos	
2019-09-19 11:15:27 89ebcf78 Eagle videos 2019-09-19 21:13:03 123ee279 Tuna videos	8	2019-09-17 20:28:57	23efb72f	Mouse videos	
2019-09-19 21:13:03 123ee279 Tuna videos	3.	2019-09-18 10:38:42	4560f31a	Bee videos	
	***	2019-09-19 11:15:27	89ebcf78	Eagle videos	
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		2019-09-20 12:17:11	49ef3719	Whale videos	

Tables hold many partitions

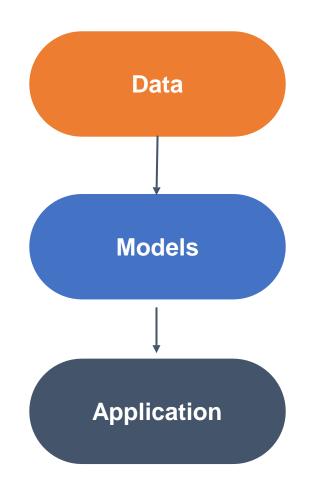
added_date	videoid	name
2019-09-17 20:28:57	23efb72f	Llama videos
2019-09-18 10:38:42	4560f31a	Rhino videos

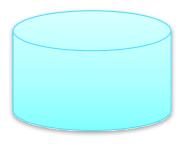
User				
	Vi	deos		
4	added_date	videoid	name	
2	2019-09-18 10:38:42	2370b72f	Cat videos	
	2019-09-18 10:38:42	e860f31a	Dog videos	
	2019-09-19 11:15:27	89e11f78	Parakeet videos	
	2019-09-19 21:13:03	115ee279	Turtle videos	
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6	2019-09-17 20:28:57	23efb72f	Llama videos	
1	2019-09-18 10:38:42	4560f31a	Rhino videos	

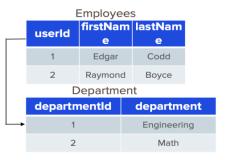
"Partitions are pre-computed queries"

"How do I figure out my schema?"

Relational Modeling

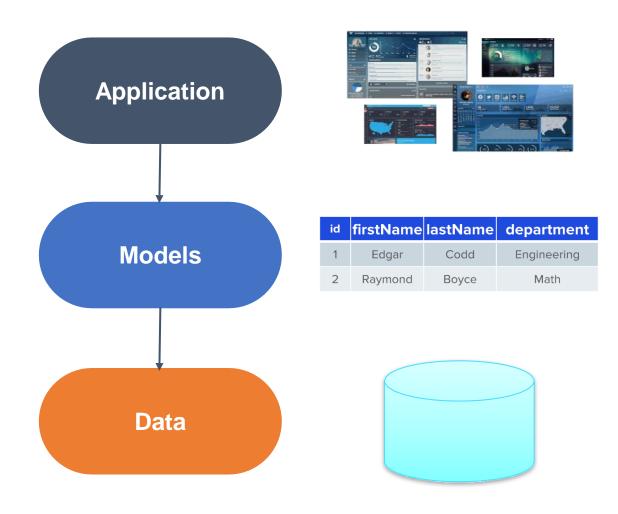








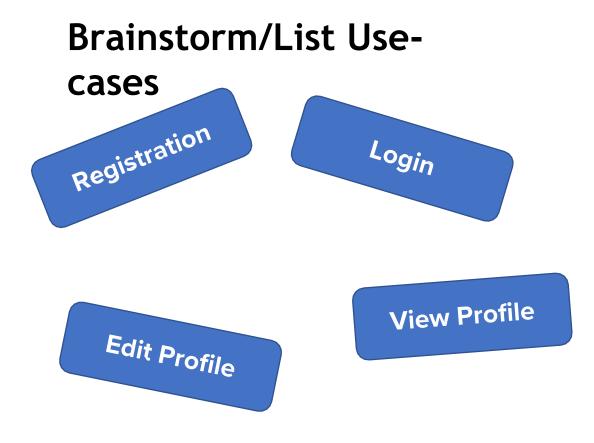
Cassandra Modeling



Cassandra Data Modeling Process

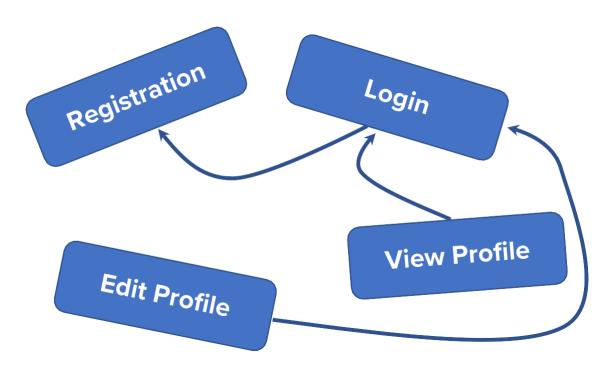


Example: User Management Usecases

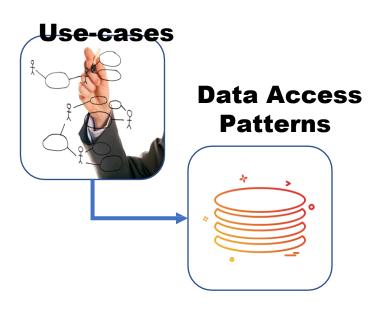


Example: User Management Usecases

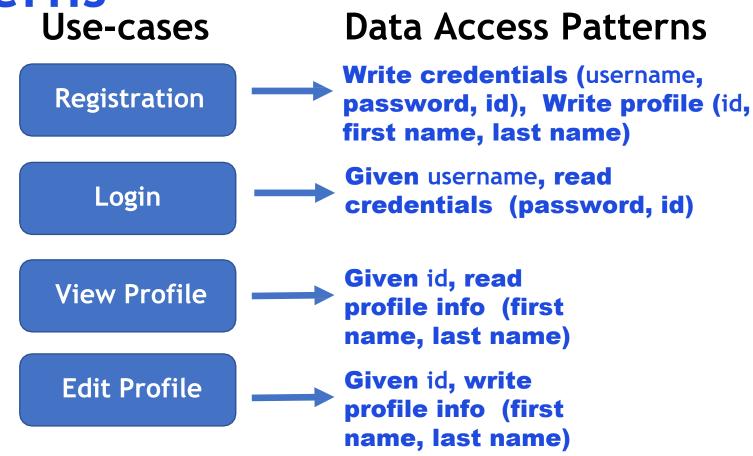
Identify Dependencies



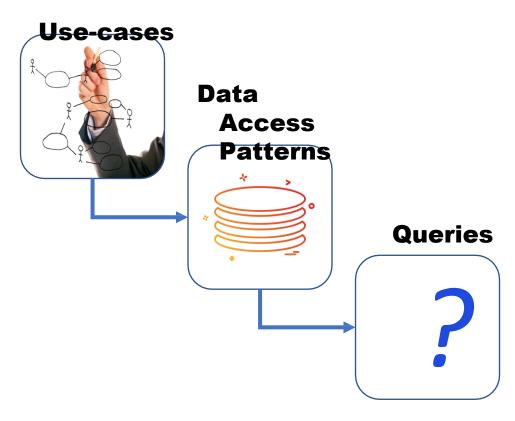
Cassandra Data Modeling Process



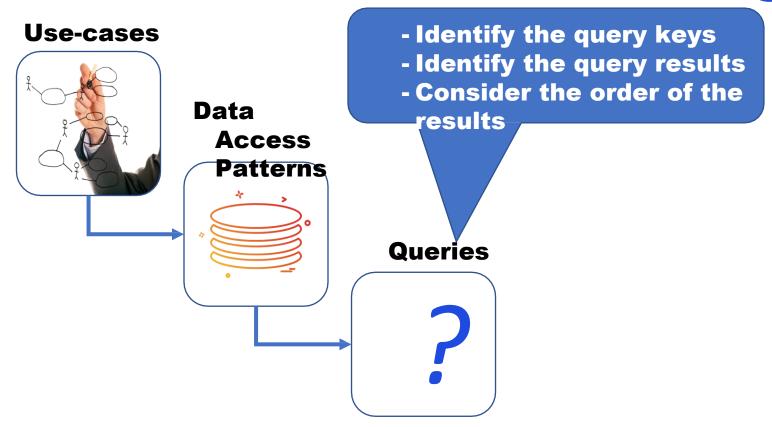
Example: User Management Access Patterns



Cassandra Data Modeling Process



Cassandra Data Modeling Process

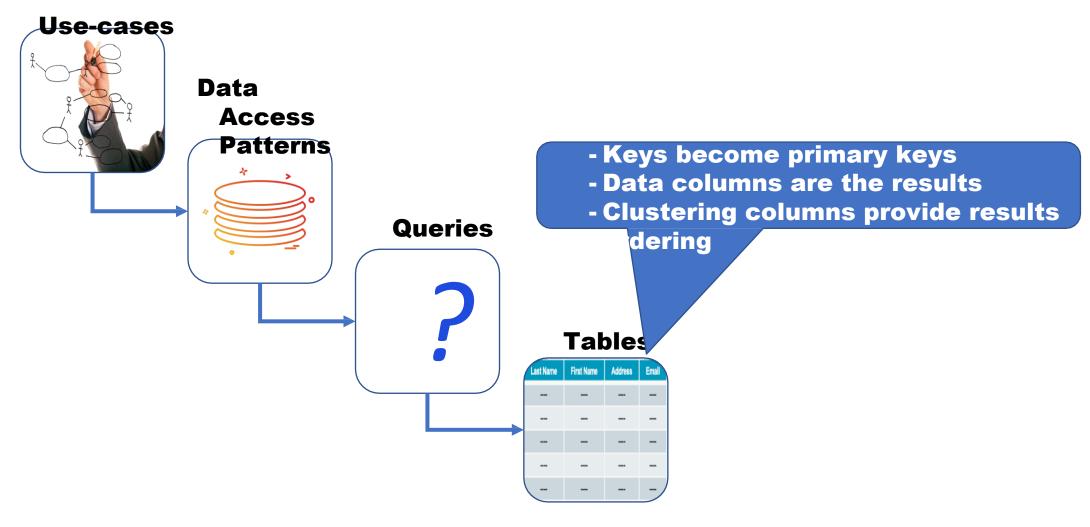


Example: User Management Queries

SFT firstname = $\Delta hhv'$

Use-cases Data Access Patterns/Queries Write credentials (username, Registration password, id), Write profile (id, first name, last name) INSERT INTO user_credentials (username, password, id) VALUES(...); INSERT INTO users (id, firstname, lastname) VALUES(...); Login Given username, read credentials (password, id) SELECT password, id FROM user_credentials WHERE username = 'killroy@gmail.com'; **View Profile** Given id, read profile info (first name, last name) **Edit Profile** SELECT firstname, lastname FROM users WHERE id = ...; Given id, write profile info (first name, last name) **UPDATE** users

Cassandra Data Modeling Process



Example: User Management Tables

user_credentials Table users Table

Name	Type
username	text
password	text
id	uuid

Name	Туре
id	uuid
lastname	text
firstname	text

"Are we talking denormalization?"

"Denormalization, oh no!"

We are Talking Denormalization! And it's OK!

We are Talking Denormalization! And it's OK!

Cassandra scales using denormalization

We are Talking Denormalization! And it's OK!

Cassandra scales using denormalization

And it works great!

Denormalization

example:



Upserts - Mutations with Side-effects

 No read-before-write - because it's fast!



Upserts - Mutations with Side-effects

 No read-before-write - because it's fast!

- Side-effects:
 - Inserts can update
 - Updates can insert



Summary

Learned how Cassandra is different

- Queries require partition key
- Upserts

Practice Cassandra's data modeling process

- List use-cases and dependencies
- Identify data-access patterns
- Formulate queries
- Define tables

Created the KillrVideo user_credentials table

Now You Know...

- Fundamental Cassandra storage constructs
- How data modeling differs between Cassandra and relational
- The Cassandra data modeling process