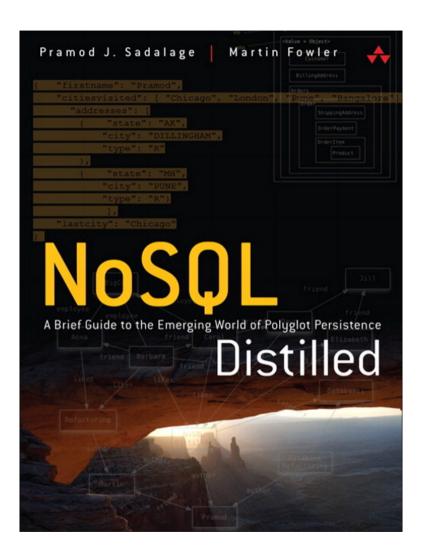
Data Models Intro

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Reference Book



Data Model

Two overlapping point of views:

- How the data is modelled at the application level
- How the data is modelled at the database level, affecting both its physical and logical representation

Data Model: RDBMS

In a RDBMS you normally have:

- A set of tables
- Comprised by a set of rows (tuples)
- Rows have a pre-defined set of elements with fixed type and order
- Tuples can have references to other tuples, creating relationships

Data Model: RDBMS

Tuples are limited in that:

- You can't nest them
- You can't mix tuples with tuples values in structures such as lists

Oracle Nested Tables (http://www.orafaq.com/wiki/NESTED_TABLE)

MSSQL Nested Tables (https://technet.microsoft.com/en-us/library/ms175659%28v=sql.110%29.aspx)

PostgreSQL Composite Types (https://www.postgresql.org/docs/9.6/static/rowtypes.html)

Data Model: Aggregates

Instead of tuples with a fixed structure, a complex structure that can store lists and other complex structures.

```
In [8]: item
Out[8]: {'age': 1, 'name': 'test item', 'privileges': [1, 3, 34, 6, 'b']}
In [9]: item2
Out[9]:
{'age': 0.5,
   'depends': {'age': 1, 'name': 'test item', 'privileges': [1, 3, 34, 6, 'b']},
   'name': 'test item 2',
   'privileges': [1, 'c']}
```

Data Model: Aggregates

Aggregate: A collection of related objects to be treated as a unit. [Domain-Driven Design, Evans]

In particular, a unit for data manipulation and consistency management. Typically:

- Aggregates are updated in atomic operations
- Storage layer communication is done in term of aggregates
- Dealing in aggregates makes is easier for database systems to handle operations a distributed setting, with the aggregate as the natural unit for replication and sharding

Data Model: Consequences

In the relational model Foreign Keys (external references) can be used to express relations between tuples and logically compose an *aggregate equivalent* from said tuples.

These compositions (via JOIN operations) are computationally expensive and grow complex to express and operate with the complexity of the *aggregate*.

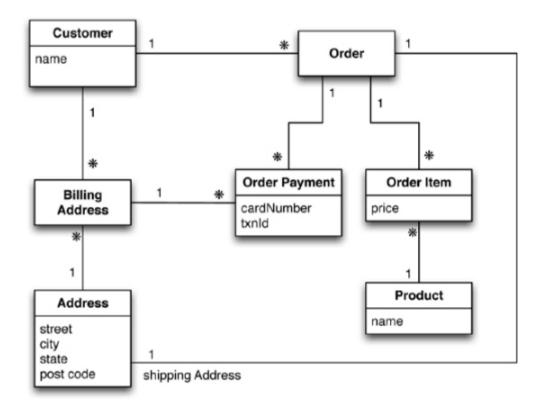
The database system is not aware of which relations indicate a conceptual entity, and can't use the information to optimize data distribution or partition for distributed access.

Data Model: Consequences

A note about transactions:

- RDMBS allow to manipulate a combination of rows from any tables in a single transaction (ACID)
- In general, aggregate oriented databases don't have ACID transactions spanning multiple aggregates but operations on a single aggregate are atomic

Data Model Example: RDBMS



Data Model Example: RDBMS

Customer	
Id	Name
1	Martin

Order		
Id	CustomerId	ShippingAddressId
99	1	77

Product	
Id	Name
27	NoSQL Distilled

Bill	in	αA	dd	re	s	s
DICC	-	ցո	uu		3	9

-			
Id	CustomerId	AddressId	
55	1	77	

OrderItem			
Id	OrderId	ProductId	Price
100	99	27	32.45

Address	
Id	City
77	Chicago

OrderPayment				
Id	OrderId	CardNumber	BillingAddressId	txnId
33	99	1000-1000	55	abelif879rft

Aggregate Model (JSON)

```
// in customers
{
"id":1,
"name": "Martin",
"billingAddress":[{"city":"Chicago"}]
}
// in orders
{
"id":99.
"customerId":1,
"orderItems":[
  "productId":27,
  "price": 32.45,
  "productName": "NoSQL Distilled"
  ],
"shippingAddress":[{"city":"Chicago"}]
"orderPayment":[
  {
    "ccinfo":"1000-1000-1000-1000",
    "txnId": "abelif879rft",
    "billingAddress": {"city": "Chicago"}
  }
  ],
}
```

Aggregate Model (JSON)

```
// in customers
"customer": {
"id": 1,
"name": "Martin",
"billingAddress": [{"city": "Chicago"}],
"orders": [
  ł
   "id":99,
   "customerId":1,
   "orderItems":[
    ł
    "productId":27,
   "price": 32.45,
   "productName": "NoSQL Distilled"
    3
  ],
  "shippingAddress":[{"city":"Chicago"}]
```

Data Model: Aggregates

Aggregate oriented:

• Key-Value

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- Document
- Column-Family Stores

Other models:

- Graph
- Time Series

Key-Value

Information (Values) can be stored and accessed by "name" (key).

The system is unaware of the value structure and properties:

aggregate	e=# \d+ kv				
		Table "publ:	ic.kv"		
Column	Туре	Modifiers	Storage	Stats target	Description
+		-		+	+
5 1	character varying(32)		extended		
value	bytea		extended		

Most KV systems expand this functionality:

- Riak: Metadata links
- **Redis**: Complex values like lists or sets, plus extra functionality

Document

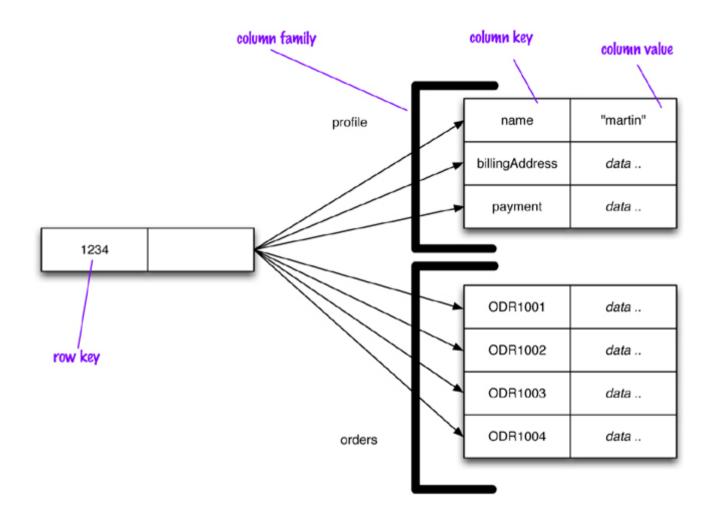
The system is aware of the value structure and properties:

aggregate=	aggregate=# \d+ document ; Table "public.document"					
Column	Туре	Modifiers	Storage	Stats target		
5	character varying(32) json		extended extended	+ 	+ 	
aggregate≕ CREATE IND	# create index on docu EX	ument((value->	>>'name'));			

This information can be used for indexing, partitioning, optimization, etc.

Conceptually can be thought of as a map of maps, or a two level aggregate structure.

```
{
    "1234": {
        "accesses": {
            "system1": {
                "duration": 57,
                "tstatmp": "Sat Oct 21 15:15:30 CEST 2017"
            },
            "system2": {
                "tstamp": "Sun Oct 22 18:16:30 CEST 2017"
            }
        },
        "acl": {
            "name": "user1",
            "privs": [
                "root",
                "system"
        }
   }
}
```



This kind of system was early defined by Google's BigTable

BigTable (https://static.googleusercontent.com/media/research.google.com/en//archive/bigtable-osdi06.pdf)

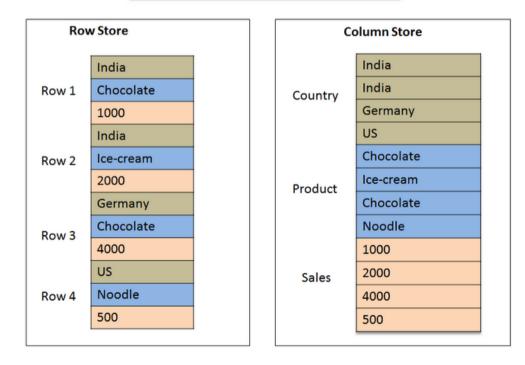
Two ways of looking at it:

- Row oriented: Each row is an aggregate formed by column families representing units of data (profile, history)
- Column oriented: Each column family defines a *record type*. A row can be seen as the *join* of all present records in the column families for a certain common key

Column families can be present or not. No fixed module and support for sparse data sets

Not to be confused with Columnar storage in RDBMS

Table					
	Country	Product	Sales		
Row 1	India	Chocolate	1000		
Row 2	India	lce-cream	2000		
Row 3	Germany	Chocolate	4000		
Row 4	US	Noodle	500		



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Graph

Two main concepts: Nodes and edges.

Nodes are connected by edges

Both nodes and edges can have attributes

Highly specialized. Very attractive for *social* data.

Graph



Time Series

Specialized systems for time-stamped data, mostly numeric in nature.

Typical Big Data use cases are

- To store metrics from a big number of sources (IoT).
- To store metrics generated at a very high speed (High throughput)

References

http://saphanatutorial.com/column-data-storage-and-row-data-storage-sap-hana/

Thank you

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