# Database 2 course notes

Vittorio Romeo http://vittorioromeo.info

# Contents

1	DB	MS types	6
	1.1	Relational DBMSs	6
		1.1.1 Disadvantages	6
	1.2	Object-oriented DBMSs	6
		1.2.1 Disadvantages	7
		1.2.2 Advantages	7
	1.3	Object-relational DBMSs	7
2	Dist	tributed systems	8
	2.1	General information	8
		2.1.1 Transparency	8
		2.1.2 Openness	9
		2.1.3 Scalability	9
	2.2	Types	9
		2.2.1 Distributed Computing Systems	9
		2.2.2 Distributed Information Systems	10
		2.2.3 Distributed Pervasive Systems	10
	2.3	Architectures	10
			10
		· ·	11
			11
			12
			12
3	Dist	tributed architectures	13
	3.1	Distributed DBMSs	13
		3.1.1 Basics and data fragmentation	13
		· · · · · · · · · · · · · · · · · · ·	13
			13
	3.2		14
			14
		· · · · · · · · · · · · · · · · · · ·	14
			14
		v	14
			15

	3.3	Distrib	outed transaction atomicity	5
		3.3.1	2-phase commit protocol	5
			3.3.1.1 Recovery protocols	6
			3.3.1.2 Optimizations	6
		3.3.2	Other commit protocols	6
			3.3.2.1 4-phase commit protocol	7
			3.3.2.2 3-phase commit protocol	7
			3.3.2.3 Paxos commit	
			3.3.2.4 X-Open DTP	
	3.4	DBMS	replication	
	-			_
4	Para	allel D	BMSs and cloud architectures 19	9
	4.1	Paralle	elism	9
		4.1.1	Relationship with data fragmentation	9
		4.1.2	Speed-up and scale-up	9
	4.2	Cloud	computing architectures	0
		4.2.1	Classification	0
			4.2.1.1 Features	0
			4.2.1.2 Types	
			4.2.1.3 Service models	
		4.2.2	Google ecosystem	
		11-1-	4.2.2.1 GFS	
			4.2.2.2 MapReduce	
			4.2.2.3 BigTable	
			4.2.2.4 Chubby	
		4.2.3	Hadoop ecosystem and MapReduce	
		4.2.0	4.2.3.1 ZooKeeper	
			4.2.3.2 HDFS	
			4.2.3.3 MapReduce	
			•	
			1 0 0	
			4.2.3.5 Apache Hive and Hive QL	4
5	Clo	ud con	aputing 25	3
	5.1		ions	3
	5.2		e models	
	٠.ــ	5.2.1	Layers	
		5.2.2	IaaS	
		0.2.2	5.2.2.1 Virtualization	
		5.2.3	PaaS	
		5.2.4	SaaS	
		0.2.4	5.2.4.1 Maturity model	
			o.z.i.i mauning model	J
6	$\mathbf{SQI}$	vs No	m oSQL	6
	6.1		haracteristics	6
	6.2	Big da	ta 2	6

		6.2.1 6.2.2	3-layer processing architecture	26 27
	6.3	-		$\frac{27}{27}$
	0.0	1100001	u	41
7	Orac	cle and	m d~PL/SQL	29
	7.1	Oracle	RDMBS	29
0	DI /	COL		30
8	PL/ 8.1	-	structure	30
	0.1	8.1.1	Server output	30
		8.1.2	Example	30
	8.2	Variabl	•	31
	8.3		Пев	31
	8.4		-	$\frac{31}{32}$
	8.5		mple	$\frac{32}{32}$
	0.5	Loops 8.5.1	I DOD everple	$\frac{32}{32}$
		8.5.2	LOOP example	32 32
			FOR example	
	0.0	8.5.3	WHILE example	33
	8.6	Proced		33
		8.6.1	Syntax	33
	o <b>=</b>	8.6.2	Example	33
	8.7		ons	34
	0.0	8.7.1	Syntax	34
	8.8	_	ges	34
		8.8.1	Specification example	34
		8.8.2	Body definition syntax	35
	8.9		rs	35
		8.9.1	Syntax example	35
	8.10	Cursor	S	35
			Syntax example	35
	8.11	Dynam	nic $\mathrm{SQL}$	36
9	NoS	OL and	d NoSQL types	37
•	9.1	•	ation	37
	0.1	9.1.1	Parallel databases and data stores	37
		9.1.2	Sharding	37
		9.1.3	Parallel key-value data stores	37
		9.1.4	Scalability	38
	9.2	-	heorem	38
	9.4	9.2.1		38
		9.2.1	Network partitions	
		9.2.2	C-A-P	38
	0.2		Log-based transactions	38
	9.3		L types	39
		9.3.1	Categories	39
		9.3.2	Key-value stores	39

		9.3.3	Document stores				 								39
			9.3.3.1 MongoDB .												
		9.3.4	Column-oriented				 								40
			9.3.4.1 Cassandra .				 								40
		9.3.5	Graph database				 								40
10	Cass	sandra													41
			ound				 								41
		_	History												
			Motivation and function												
	10.2														
		_	Data organization												
			P2P clustering												
			Fault tolerance												
	10.3		nodel												
			Key-value model												
	10.4		xamples												
		-	Keyspaces												
			Tables												
			Queries												
	10.5	Archite	ecture				 								43
			operations												
			Stages												
			10.6.1.1 Memtable												
			10.6.1.2 SSTable												
		10.6.2	Consistency				 								45
	10.7		operations												
			Tombstones												
		10.7.2	Compaction				 								45
			Anti-entropy												
	10.8	Read o	perations				 								46
			Read repair												
		10.8.2	Bloom filters				 								46
	10.9	Conclu	sion				 								47
		10.9.1	Advantages				 								47
		10.9.2	Disadvantages				 								47
			Considerations												
11	Mor	goDB													48
		_	ound		 _				_		_	_	_		_
		0													
	· <b>-</b>		Examples												
10	un-														
	HBa		OM												<b>50</b>
	12.1	Overvi	ew				 								50

	12.1.1 History	50
	12.1.2 Characteristics	50
12.2		50
	12.2.1 Operators	51
12.3	Physical structures	51
12.4	System architecture	51
	12.4.1 Components	51
12.5	ACID properties	51
		53
<b>13 Nec</b> 13.1		<b>53</b> 53
13.1	Graph databases	
13.1 13.2	Graph databases	53
13.1 13.2 <b>14 XM</b>	Graph databases	53 53
13.1 13.2 <b>14 XM</b> 14.1	Graph databases  Features  L  DTD	<ul><li>53</li><li>53</li><li><b>54</b></li></ul>
13.1 13.2 <b>14 XM</b> 14.1 14.2	Graph databases Features  L DTD	53 53 <b>54</b> 54

# DBMS types

# 1.1 Relational DBMSs

- Formally introduced by **Codd** in 1970.
- ANSI standard: **SQL**.
- Composed of many relations in form of **2D tables**, containing **tuples**.
  - Logical view: data organized in tables.
  - Internal view: stored data.
  - Rows (tuples) are **records**.
  - Columns (fields) are attributes.
    - \* They have specific data types.
- Constraints are used to restrict stored data.
- SQL is divided in DDL and DML.

# 1.1.1 Disadvantages

- Lack of flexibility: all processing is based on values in fields of records.
- Inability to handle complex types and complex interrelationships.

# 1.2 Object-oriented DBMSs

- Integrated with an OOP language.
- Supports:
  - Complex data types.
  - Type inheritance.

- Object behavior.
- Objects have an **OID** (object identifier).
- ADTs (abstract data types) are used for encapsulation.
- OODBMSs were standardized by **ODMG** (Object Data Management Group).
  - Object model, **ODL**, **OQL** and OOP language bindings.
- OQL resembles SQL, with additional features (object identity, complex types, inheritance, polymorphism, ...).

# 1.2.1 Disadvantages

- Poor performance. Queries are hard to optimize.
- Poor scalability.
- Problematic change of schema.
- Dependence from OOP language.

#### 1.2.2 Advantages

- Composite objects and relations.
- Easily manageable class hierarchies.
- Dynamic data model
- No primary key management.

# 1.3 Object-relational DBMSs

- Hybrid solution, expected to perform well.
- Features:
  - Base datatype extension (inheritance).
  - Complex objects.
  - Rule systems.

# Distributed systems

# 2.1 General information

- A distributed system is a **software** that makes **a collection of independent machines** appear as **a single coherent system**.
  - Achieved thanks to a **middleware**.
- Goals:
  - Making resource available.
  - Distribution **transparency**.
  - Openness and scalability.

# 2.1.1 Transparency

Type	Description
Access	Hides data access
Location	Hides data locality
Migration	Hides ability of a system to change object location
Relocation	Hides system ability to move object bound to client
Replication	Hides object replication
Concurrency	Hides coordination between objects
Failure	Hides failure and recovery

- Hard to fully achieve.
  - Users may live in different continents.
  - Networks are unreliable.
  - Full trasparency is costly.

### 2.1.2 Openness

- Conformance to well-defined interfaces.
- Portability and interoperability.
- Heterogeneity of underlying environments.
- Requires support for **policies**.
- Provides **mechanisms** to fulfill policies.

### 2.1.3 Scalability

- Size: number of users/processes.
- Geographical: maximum distance between nodes.
- Administrative: number of administrative domains.
- Techniques to achieve scalability:
  - Hide communication latencies.
    - \* Use **asynchronous** communication.
    - \* Use separate response handlers.
  - Distribution.
    - \* Decentralized  $\mathbf{DNS}$  and information systems.
    - $\ ^*$  Try to compute as much as possible on clients.
  - Replication/caching.
- Issue: inconsistency and global synchronization.

# 2.2 Types

# 2.2.1 Distributed Computing Systems

- HPC (high-performance computing).
- Cluster computing:
  - Homogeneous LAN-connected machines.
    - \* Master node + compute nodes.
- Grid computing:
  - **Heterogeneous** WAN-connected machines.
  - Usually divided in **virtual organizations**.

# 2.2.2 Distributed Information Systems

- Transaction-based systems.
  - Atomicity.
  - Consistency.
  - **Isolation**: no interference between concurrent transaction.
  - **Durability**: changes are permanent.
- **TP Monitors** (transaction processing monitors) coordinate execution of a distributed transaction.
  - Communication middleware is required to separate applications from databases.
    - \* RPC (remote procedure call).
    - \* MOM (message-oriented middleware).

### 2.2.3 Distributed Pervasive Systems

- Small nodes, often mobile or embedded.
- Requirements:
  - Contextual change.
  - Ad-hoc composition.
  - Sharing by default.
- Examples:
  - Home systems.
  - Electronic health systems.
  - Sensor networks.

# 2.3 Architectures

# 2.3.1 Styles and models

- Architectural styles:
  - Layered: used for client-server systems.
  - Object-based: used for distributed systems.
- Decoupling models:
  - Publish/subscribe: uses event bus, decoupled in space.

 Shared dataspace: used shared persistent data space, decoupled both in space and time.

#### 2.3.2 Centralized architectures

- Client-server.
- Three-layered view:
  - User-interface layer.
  - Processing layer.
  - Data layer.
- Multi-tiered architecture:
  - Single-tiered: dumb terminal/mainframe.
  - Two-tiered: client-server.
  - Three-tiered: each layer on separate machine.

#### 2.3.3 Decentralized architectures

- **P2P** (peer-to-peer):
  - P2P architectures are **overlay networks**: application-level multicasting.
  - Structured: nodes follow a specific data structure.
    - \* Example: ring, kd-tree.
  - **Unstructured**: nodes choose random neighbors.
    - \* Example: random graph.
      - · Each node has a **partial view** of the network which is shared with random nodes selected periodically, along with data.
  - **Hybrid**: some nodes are special (and structured).
- Topology management:
  - 2 layers: structured and random.
    - \* Promote some nodes depending on their services.
    - \* Torus construction: create N\*N grid, keep only **nearest neighbors** via distance formula.
    - \* Superpeers: few specific nodes.
      - · Examples: indexing, coordination, connection setup.
- Hybrid architectures (P2P + client-server):
  - CDNs: edge-server architectures.

- **BitTorrent**: tracker and peers.

#### 2.3.4 Architectures versus middleware

- Sometimes the middleware needs to **dyamically adapt its behavior** to distributed application/systems.
  - **Interceptors** can be used.
  - Adaptive middleware:
    - \* Separation of concerns.
    - \* Computational reflection (self runtime inspection).
    - \* Component-based design.

# 2.3.5 Self-managing distributed systems

- Self-x operations:
  - Configuration.
  - Management.
  - Healing.
  - Optimization.
- Feedback control model.
  - Example: globule (collaborative CDN driven by cost model).

# Distributed architectures

# 3.1 Distributed DBMSs

#### 3.1.1 Basics and data fragmentation

- Based on **autonomy** and **cooperation**.
- Data **fragmentation** and **allocation**:
  - A relation R is split in  $R_i$  fragments.
  - **Horizontal** fragmentation:
    - \*  $R_i$ : set of tuples with same schema as R.
    - \* Like the where SQL clause.
  - **Vertical** fragmentation:
    - \*  $R_i$ : set of tuples with subschema of R.
    - \* Like the select SQL clause.

# 3.1.2 Transparency levels

- **Fragmentation** transparency: independence of a query from data fragmentation and allocation.
- Allocation transparency: fragment structure must be specified in a query, but not location.
- Language transparency: both fragment structure and location have to be specified in a query.

#### 3.1.3 Transaction classification

• Remote request: readonly (select) transactions towards a single DBMS.

- Remote transaction: general transactions towards a single DBMS.
- **Distributed transaction**: towards multiple DBMSs, but every SQL operation targets a single DBMS.
- Distributed request: arbitrary transaction, language-level transparency.

# 3.2 Distributed DBMSs technology

### 3.2.1 Consistency and persistency

- Consistency: does not depend on data distribution. Constraints are only properties local to a specific DBMS. This is a limitation of DBMSs.
- **Persistency**: does not depend on data distribution. Every sistem guarantees persistency thanks to dumps and backups.

#### 3.2.2 Optimization

- Global optimization is performed through a cost analysis.
  - A tree of possible alternatives is examined.
  - IO, CPU and bandwidth coss are taken into account.

# 3.2.3 Concurrency control

- Problem: two transactions  $t_1$  and  $t_2$  can be composed of subtransactions whose execution is in conflict.
  - The transactions are **locally serializable**.
  - The transactions are **not globally serializable**.
- Global serializability: two transactions are globally serializable if  $\exists S \ (serial \ schedule)$  that is equivalent to every local schedule  $S_i$ .
  - For every node i, the projection S[i] of S needs to be equivalent to  $S_i$
  - This property can fulfilled using **2-phase locking** or **timestamping**.

#### 3.2.3.1 Lamport's method for timestamping

- Every transaction needs a timestamp of the time instant where it needs to be synchronized with other transactions.
- A timestamp is composed by two numbers: **node ID** and **event ID**.
- Nodes have a local counter that helps ordering transactions.

#### 3.2.3.2 Distributed deadlock detection

- Two subtransactions may be waiting for one another in the same or in different DBMSs.
- A waiting sequence can be built for every transaction.
- Algorithm:
  - 1. DBMSs share their waiting sequences.
  - 2. Waiting sequences are composed in a **local waiting graph**.
  - 3. Deadlocks are detected locally and solved by aborting transactions.
  - 4. Updated waiting sequences are sent to other DBMSs.

# 3.3 Distributed transaction atomicity

#### 3.3.1 2-phase commit protocol

- Conceptually similar to marriage.
- Servers are called **RMs** (resource managers).
- A coordinator is called **TM** (transaction manager).
- Both RMs and the TM have local logs.
- TM log records:
  - prepare: contains RMs identities.
  - global commit/abort: atomic and persistent decision regarding the entire transaction.
  - complete: conclusion of the protocol.
- RM log records:
  - ready: signals availability of the node.
- Algorithm (ideal situation):
  - Phase one (preparation):
    - 1. TM sends prepare, sets a timeout for RM responses.
    - RMs wait for prepare messages. On arrival, they send ready. If an RM is
      in a bad state, not-ready is sent instead, terminating the protocol (global
      abort).
    - 3. TM collects RM messages. On success, sends global commit.
  - Phase two:
    - 1. TM sends global decision, setting a **timeout**.
    - 2. Ready RMs wait for the decision. On arrival, they either log commit or abort, and send an ack to the TM.

- 3. TM collects all ack messages. If all of them arrived, complete is set. If an ack is missing, a new timeout is set and transmissions are repeated.
- The period between ready and commit/abort is called uncertainty interval the protocol tries to minimize its length.

#### 3.3.1.1 Recovery protocols

- RM drops:
  - If last record was abort, actions will be undone.
  - If last record was commit, actions will be repeated.
  - If last record was ready, we are in a doubtful situation.
    - \* Information needs to be requested from TM.
- TM drops:
  - If last record as prepare, some RMs may be locked.
    - \* global abort will be sent, or the first phase will be repeated.
  - If last record was global commit/abort, the second phase needs to be repeated.
  - If last record was complete, everything is fine.
- Message loss: handled by timeouts, which cause a global abort in the first phase, or a retransmission in the second phase.

#### 3.3.1.2 Optimizations

- **Presumed abort protocol**: if in doubt during a RM recovery, and TM has no information, abort is returned.
  - Some synchronous record writes can be avoided.
- **Read-only optimization**: if an RM only needs to read, it will not influence the transaction's result it can be ignored during second phase.
- TODO: other commits, replication, cooperation

# 3.3.2 Other commit protocols

- The biggest issue with the 2-phase protocol is that an RM can become stuck if the TM drops.
  - The following protocols don't have this issue but are less performant.

#### 3.3.2.1 4-phase commit protocol

- The TM process can be replicated by a **backup process** on a different node.
  - On every phase, the TM first communicates with the backup, then with the RMs.

#### 3.3.2.2 3-phase commit protocol

- After receiving ready from every RM, the TM has an additional pre-commit state.
  - If the TM drops during that state, any RM can become the TM, because every RM has to be ready.
- Unusable in practice due to widened uncertainty interval and atomicity issues in case of network partitioning.

#### 3.3.2.3 Paxos commit

- More general goal: have nodes "agree" on a specific value in case of malfunction.
- Three node categories:
  - Proponent.
  - Acceptor.
  - Receiver.
- Three phases:
  - 1. Election of a coordinator.
  - 2. Acceptors agree on a value.
  - 3. The value is propagated to receivers.
- Algorithm:
  - 1. The coordinator sends n prepare messages to participants.
  - 2. Every participant sends ready to coordinator and to f acceptors.
  - 3. Every acceptor sends its state using f messages.
  - 4. Coordinator and acceptors are f + 1 nodes that know the state of the transaction. Any malfunction in f is not a problem.

#### 3.3.2.4 X-Open DTP

- Guarantees interoperability of transactions on different DBMSs.
- Two main interfaces:
  - 1. **TM-interface**: between client and TM.
    - tm xxx functions.

- 2. **XA-interface**: between TM and RM.
  - Database vendors must guarantee XA-interface availability.
  - xa\_xxx functions.
- Features:
  - RMs are passive. All control is in TM, which uses RPCs to enable RM functions.
  - Uses 2-phase commit with aforementioned optimizations.
  - Heuristical decisions are taken, which can harm atomiticy (notifying clients).

# 3.4 DBMS replication

- A data replicator handles replication and synchronization between copies.
  - Copies are updated asynchronously (no commit protocols).
- Replication data can be **batched** and reconciled with the copies all at once.
- Multidatabase systems: tree hierarchies of dispatchers and multiple DBs behind a single interface.

# Parallel DBMSs and cloud architectures

### 4.1 Parallelism

- Ideally speeds up computation by a factor of 1/n.
- Two types:
  - 1. **Inter-query**: different queries ran in parallel.
  - 2. **Intra-query**: parts of the same query (subqueries) ran in parallel.

# 4.1.1 Relationship with data fragmentation

• Data fragments are in different locations, which can be associated to different processors.

# 4.1.2 Speed-up and scale-up

- **Speed-up**: only related to inter-query parallelism. Measures *tps* as the number of processors grows.
- Scale-up: related to both parallelism types. Measures  $\frac{cost}{tps}$  aas the number of processors grows.

# 4.2 Cloud computing architectures

#### 4.2.1 Classification

#### **4.2.1.1** Features

- On-demand self-service: architecture elements can be defined depending on current needs through web interfaces.
- Remote access.
- Service measuring: architectural resources are rented using costs depending onuse.
- Elasticity.
- Resource sharing.

#### 4.2.1.2 Types

- Private cloud: of an organization/institution.
- Community cloud: of a community of organizations/institutions.
- Public cloud: like AWS or Azure.
- Hybrid cloud: private cloud that use public services when needed.

#### 4.2.1.3 Service models

- SaaS: clients rent finished applications.
- PaaS: clients rent hardware resources and base software.
- IaaS: clients rent only hardware resources.

### 4.2.2 Google ecosystem

#### 4.2.2.1 GFS

- Distributed file system.
- Two node types:
  - Chunk: nodes that store files.
    - \* Every file is 64MB.
    - \* Every chunk is assigned to a 64bit partition.
    - \* Chunks are periodically replicated.
  - Master: manage chunk metadata, 64bit partition tables, chunk copies locations.

#### 4.2.2.2 MapReduce

• Like Hadoop MapReduce.

#### **4.2.2.3** BigTable

• A key-value big data system based on GFS.

#### 4.2.2.4 Chubby

- Manages locks and agreements between nodes.
- A **cell** is a small set of servers (usually 5) called replicas.
  - Replicas use the Paxos protocol to elect a master.
- Similar to Apache Zookeeper.

### 4.2.3 Hadoop ecosystem and MapReduce

- Apache Hadoop is a suite of open-source components which serve as the building blocks of large distributed systems.
  - Focus on gradual, horizontal scaling.

#### 4.2.3.1 ZooKeeper

- ZooKeeper is a distributed coordination service which is used when nodes in a distributed system need a single source of truth.
  - Similar to Google Chubby.
- Implemented as a single moveable master, with n coordinated nodes.
  - A majority (n/2+1) must agree on a write.
  - Reads can be answered by any node.

#### 4.2.3.2 HDFS

- HDFS: distributed filesystem developed in Java.
  - Uses TCP/IP for communication.
  - Files are fragmented in separate nodes and are replicated.
  - The main node is called **NameNode**, others are called **workers**.

#### 4.2.3.3 MapReduce

- MapReduce: parallel computation model.
  - Jobs are handled by a job tracker.
  - Jobs assign **tasks**, which are handled by a **task tracker**.

### 4.2.3.4 Apache Pig and Pig Latin

- Query system based on Hadoop.
- Data model is similar to OODBMSs, but does not support inheritance.
  - Data is organized in relationships.
  - Relations can contain duplicated elements (tuple bags).
  - There is no explicit primary key.
- Example query: FOREACH table GENERATE attribute0 attribute1;.

#### 4.2.3.5 Apache Hive and Hive QL

• Similar to Pig, but closer to SQL.

# Cloud computing

TODO: merge previous chapter into this one or viceversa?

TODO: add cloud federations to cloud models

# 5.1 Definitions

- Cloud computing describes a class of network-based computing:
  - A collection/group of networked hardware, software and infrastructure (platform).
  - Uses the Internet for communication/transport, providing hardware and software services to client.
- The complexity of the platforms is hidden behind simple **APIs**.
- Characteristics:
  - Remotely hosted.
  - **Ubiquitous**: services/data available from anywhere.
  - Commodified: pay for what you want/need.
  - Common characteristics:
    - \* Massive scale.
    - \* Resilient computing.
    - \* Homogeneity.
    - \* Geographic distribution.
    - \* Virtualization.
    - \* Service-orientation.
    - \* Low-cost.
    - \* Security.

- Essential characteristics:
  - \* On-demand self-service.
  - \* Broad network access.
  - \* Elasticity.
  - \* Resource pooling.
  - \* Measured service.

# 5.2 Service models

# 5.2.1 Layers

- From application-focused to infrastructure-focused:
  - 1. Services.
  - 2. Application.
  - 3. Development.
  - 4. Platform.
  - 5. Storage.
  - 6. Hosting.

#### 5.2.2 IaaS

• Provides hardware.

#### 5.2.2.1 Virtualization

- The basis of IaaS.
- Virtual workspaces: abstraction over the execution environment.
  - Has specific resource quota and software configuration.
- Implemented on VMs ( $virtual\ machines$ ).
  - Abstraction of the physical host.
  - Advantages:
    - \* OS flexibility. Easier deployment.
    - \* Versioning/backups/migrations.
- A VMM (virtual machine monitor, or hypervisor) is used to manage multiple VMs on a single machine.

#### 5.2.3 PaaS

- Deploys user-created applications.
- Highly-scalable architecture.

# 5.2.4 SaaS

- Provides applications.
- Examples: Facebook apps, Google apps.

# 5.2.4.1 Maturity model

- Level 1: ad-hoc/custom. One instance per customer.
- Level 2: configurable per customer.
- Level 3: configurable and multi-tenant-efficient.
- Level 4: scalable (uses load balancer) level 3.

# SQL vs NoSQL

# 6.1 SQL characteristics

- Data is stored in columns and tables.
- Relationships represented by data.
- DML and DDL.
- Transactions.
  - ACID properties.
- Abstraction from physical layer.
  - Declarative language.
  - Query optimization engine.

# 6.2 Big data

- Extremely large datasets.
- Challenges:
  - Analysis, capture, searching, storage, transfer, visualization, querying, security.
- Characteristics: volume, velocity and variety.
- Big data **analytics**: capture and analysis processes aiming to find patterns and correlations in huge heterogeneous datasets.

# 6.2.1 3-layer processing architecture

- 1. Online processing:
  - Real-time data capture/processing.

- Deals with **velocity**:
  - Algorithms need to be simple and fast.
- 2. Nearline processing:
  - Database-oriented.
  - Handles data storage and some processing (slightly more complex than online processing).
- 3. Offline processing:
  - Batch heavy-procesing of data.

#### 6.2.2 Lambda architecture

- Principles:
  - 1. **Human fault-tolerance**: data needs to survive human errors and hardware faults.
  - 2. Data immutability: no updates/deletes.
  - 3. **Recomputation**: recomputing previous results must always be possible.
- Levels:
  - 1. **Batch layer**: stores the master dataset and computes **views** (pre-computing) using MapReduce algorithms.
  - 2. **Speed layer**: computes **real-time** views only with new data, not total data. Uses an **incremental model**.
  - 3. **Serving layer**: output of the batch layer. Handles view indexing and provides views to the query system.
    - The query system uses both batch and speed views.

# 6.3 NoSQL

- Class of non-relational data storage systems.
  - Types:
    - \* Document store. Example: MongoDB.
    - \* Column based. Example: Cassandra.
    - \* Graph. Example: Neo4j.
    - \* Kev-value.
- Usually do not require fixed schema and do not use joins.
  - Can be distributed.

- One or more ACID properties are relaxed.
  - **BASE** transactions:
    - \* Basically available: failures do not affect the entire system.
    - \* Soft state: data copies may be inconsistent.
    - \* Eventually consistent: consistency is obtained over time.
  - Brewer's CAP theorem: a distributed system can support only two of the following:
    - \* Consistency.
    - \* Availability.
    - \* Partition tolerance.
- Compared to SQL: higher scalability and flexibility.

# Oracle and PL/SQL

# 7.1 Oracle RDMBS

TODO: ?

# PL/SQL

- Also known as **Embedded SQL**.
- More powerful than pure **SQL**:
  - Has iteration, branching, cursors, blocks, stored procedures, and more.

# 8.1 Basic structure

```
DECLARE

-- ...
BEGIN

-- ...
EXCEPTION

-- ...
END;
```

# 8.1.1 Server output

• Execute set serveroutput on before running.

```
BEGIN
     DBMS_OUTPUT.PUT_LINE('Hello world!');
END;
```

# 8.1.2 Example

```
DECLARE
   v_id INTEGER;
   v_empno NUMBER;
```

```
BEGIN
    v_id := 1234567;
    SELECT EMPNO
    INTO v_empno
    FROM EMP
    WHERE empno = v_id;
    DBMS_OUTPUT.PUT_LINE('Value is ' || v_empno);

EXCEPTION
    WHEN NO_DATA_FOUND THEN
    DBMS_OUTPUT.PUT_LINE('No record exists');

END;
```

# 8.2 Variables

- Common data types:
  - NUMBER.
  - DATE.
  - INTEGER.
  - VARCHAR2.
  - CHAR.
  - BOOLEAN.

# 8.3 SELECT INTO example

```
DECLARE
    v_job emp.job%TYPE;
    v_sal emp.sal%TYPE;
    v_empno emp.empno%TYPE;

BEGIN
    v_empno := 1234567;
    SELECT job, sal
    INTO v_job,v_sal
    FROM emp
    WHERE empno = v_empno;
END;
```

# 8.4 IF example

```
DECLARE
-- ...

BEGIN

IF v_dept = 10 THEN
    v_commision := 5000;

ELSIF v_dept = 20 THEN
    v_commison := 5500;

ELSIF v_dept = 30 THEN
    v_commison := 6200;

ELSE
    v_commision := 7500;

END IF;
-- ...

END;
```

- LOOP, EXIT WHEN, END LOOP.
- FOR, IN, LOOP, END LOOP.
- WHILE, LOOP, END LOOP.

### 8.5.1 LOOP example

```
LOOP
    INSERT INTO dept(deptno)
    VALUES(v_deptno);
    v_counter := v_counter + 1;
    v_deptno := v_deptno + 10;
    EXIT WHEN v_counter > 5;
END LOOP;
```

# 8.5.2 FOR example

```
FOR v_counter IN 1..5 LOOP
    INSERT INTO dept(deptno)
    VALUES(v_deptno);
```

```
v_deptno := v_deptno + 10;
END LOOP;
```

# 8.5.3 WHILE example

```
v_counter := 1;
WHILE v_counter <= 5 LOOP
    INSERT INTO dept(deptno)
    VALUES(v_deptno);
    v_deptno := v_deptno + 10;
END LOOP;</pre>
```

# 8.6 Procedures

### 8.6.1 Syntax

```
CREATE OR REPLACE PROCEDURE /*name*/(/*parameters*/) IS
-- local variables

BEGIN
-- ...

EXCEPTION
-- ...
```

• Parameters can be IN, OUT or IN OUT.

# 8.6.2 Example

**EXCEPTION** 

```
CREATE OR REPLACE PROCEDURE proc_test(p_empno IN VARCHAR2) IS
    v_job EMP.job%TYPE;
    v_sal EMP.sal%TYPE;

BEGIN
    SELECT job, sal
    INTO v_job,v_sal
    FROM emp
        WHERE empno = p_empno;
    DBMS_OUTPUT.PUT_LINE('job is '||v_job);
```

```
WHEN OTHERS THEN
DBMS_OUTPUT.PUT_LINE('ERROR...');
END;
```

# 8.7 Functions

# 8.7.1 Syntax

```
CREATE OR REPLACE FUNCTION /*name*/(/*parameters*/)
RETURN /*datatype*/ IS
-- local variables

BEGIN
-- ...

EXCEPTION
-- ...
END;
```

- Paremeters can only be IN.
- Returns a single value.

# 8.8 Packages

# 8.8.1 Specification example

```
END emp_info;
```

### 8.8.2 Body definition syntax

```
CREATE OR REPLACE PACKAGE BODY emp_info IS

-- define declared procedures and functions

END emp_info;
```

# 8.9 Triggers

### 8.9.1 Syntax example

```
CREATE OR REPLACE TRIGGER del_emp( p_empno emp.empno%TYPE)
BEFORE DELETE ON emp
FOR EACH ROW
BEGIN
INSERT INTO emp_audit
VALUES(p_empno, USER, sysdate);
END;
```

# 8.10 Cursors

• A **cursor** is a pointer to a row.

# 8.10.1 Syntax example

```
DECLARE
    CURSOR c_emp IS
    SELECT empno, ename, job
    FROM emp
    WHERE deptno = 20;

BEGIN
    FOR v_c IN c_emp LOOP
        DBMS_OUTPUT.PUT_LINE(v_c.ename);
    END LOOP;
```

END;

# 8.11 Dynamic SQL

```
BEGIN
    EXECUTE IMMEDIATE 'CREATE TABLE tt(id NUMBER(3)'
END;
```

# NoSQL and NoSQL types

TODO: consider merging with 15

### 9.1 Motivation

- Explosion of social media sites with huge data needs.
- Explosion of storage needs and cloud-based solutions such as AWS.
- Shift to more dynamic data with frequent schema changes.

#### 9.1.1 Parallel databases and data stores

- Scaling server applications is easy, but not databases. Possible approaches:
  - 1. memcache or similar caching mechanisms. Limited in scalability.
  - 2. Use existing parallel databases. Expensive and most of them do not support **OLTP** (online transaction processing).
  - 3. Build parallel stores with databases underneath.

## 9.1.2 Sharding

- Consists in the use of multiple cheap databases.
- Sharding can be used to partition and scale RDBMSs.
  - Scales well, but it is **not transparent**.

## 9.1.3 Parallel key-value data stores

• Distributed and **transparently** partitionable/scalable.

• No support for joins or constraints.

# 9.1.4 Scalability

- Necessary due to big data growth.
- Vertical scalability (scale-up): increasing performance of a single machine.
  - Hard to manage.
  - Possible down times.
- Horizontal scalability (scale-out): increase the number of machines.
  - Elastically scalable.
  - Cheaper.
  - Heterogeneity.
- Issue with NoSQL and multiple machines: coordination between nodes.

## 9.2 CAP theorem

### 9.2.1 Network partitions

• A **network partition** occurs when a failure of a node splits the network.

#### 9.2.2 C-A-P

- Consistency, availability and partition-resilience.
- Choose two:
  - CA: available and consistent, unless there is a partition.
  - AP: a replica provides service even in case of a partition, but can be inconsistent.
  - CP: always consistent, but a replica may deny service to prevent inconsistency.

## 9.2.3 Log-based transactions

- In order to prevent partial transactions from being committed, a log is used.
  - After a crash, different actions are taken depending on the data present in the log.
- Commit protocols are used to prevent incoherences.

# 9.3 NoSQL types

### 9.3.1 Categories

- Key-value stores.
- Column NoSQL databases.
- Document-based.
- Graph databases.
- XML databases.

### 9.3.2 Key-value stores

- Extremely simple interface.
- Data model: key-value pairs.
  - No explicit relationships.
  - No queries-by-data.
  - No set operations.
- Operations:
  - insert(k, v).
  - fetch(k).
  - update(k, v).
  - delete(k).
- Implementation:
  - Records distributed to nodes depending on key.
  - Replication.
  - Single-record transactions (eventual consistency).
    - \* No multi-operation transactions.
- Examples: SimpleDB, Riak.
- Use for: storing session information, user profiles, shopping carts.

#### 9.3.3 Document stores

- Similar to key-value stores, except that values are **documents**.
- Data model: key-document pairs.
  - Document: **JSON**, **XML**, etc...

- Operations: like key-value stores.
- Examples: CouchDB, MongoDB, SimpleDB.
- Use for: event logging, CMSs, analytics, e-commerce.

#### 9.3.3.1 MongoDB

- Stores data as nested JSON-like field/value pairs.
- Multiple documents are grouped in collections.
- Collections can be queried/mutated by specific field filters.

#### 9.3.4 Column-oriented

- Data is stored in column order.
  - Key-value pairs can be stored and retrieved in massively parallel systems.
- Data model: **families of attributes** defined in a schema.
- Storing principle: big hashed distributed tables.
- Properties:
  - Horizontal and vertical partitioning.
  - High availability.
  - Transparency to application.

#### 9.3.4.1 Cassandra

- The **keyspace** wraps all keys. Usually the name of the application.
- A column family is a structure containing an unlimited number of rows.
- A **column** is a **tuple** with name, value and timestamp.
  - A **super column** contains more columns.d
- A key is a name of a record.
- Use for: CMSs, blogging platforms, event logging.

## 9.3.5 Graph database

- Data model: **nodes** and **edges**.
- Interface and query languages vary.
- Examples: Neo4j, FlockDB, Prgel.

# Cassandra

TODO: merge with 17?

# 10.1 Background

• Cassandra is an open-source DBMS.

## 10.1.1 History

- Created to power Facebook Inbox Search.
- Open sourced in 2008 as an Apache Incubator project.

#### 10.1.2 Motivation and function

- Can handle large amounts of data across multiple servers.
- Mimics relational DBMS, using **triggers** and **lightweight** transactions.
- Raw and simple data structures.
- Focus on availability.

# 10.2 Design

• Emphasis on **performance** over analysis.

### 10.2.1 Data organization

- Rows are organized into tables.
- First component of a table's primary key is the **partition key**.
- Rows are clustered by the remaining columns of the key.
- Columns may be indexed separately from primary key.
- Tables can be altered at runtime without blocking queries.

## 10.2.2 P2P clustering

- Decentralized design.
  - Every node has same role.
  - No single point of failure.
  - No bottlenecking.

#### 10.2.3 Fault tolerance

- Automatic replication and replacement of faulty nodes.
- Distribution over multiple data centers.
- **AP**: availability and partitioning-tolerance.
  - Eventual consistency.

### 10.3 Data model

## 10.3.1 Key-value model

- Cassandra is column-oriented.
- Column families: sets of key-value pairs inside a keyspace.
  - Analogies:
    - \* A column family is like an SQL table.
    - \* Key-value pairs are like a SQL row.
- A Cassandra **row** is a sequence of key-value pairs.
- Schema is adjusted as new queries are introduced.
  - No joins.

## 10.4 CQL examples

## 10.4.1 Keyspaces

• Creation:

```
CREATE KEYSPACE demo
WITH replication = {'class': 'SimpleStrategy', replication_factor': 3};
• Usage:
USE demo;
```

#### 10.4.2 Tables

```
CREATE TABLE users(
email varchar,
bio varchar,
birthday timestamp,
active boolean,
PRIMARY KEY (email));
CREATE TABLE tweets(
email varchar,
time_posted timestamp,
tweet varchar,
PRIMARY KEY (email, time_posted));
```

## 10.4.3 Queries

• Insertion:

```
INSERT INTO users (email, bio, birthday, active)
VALUES ('john.doe@bti360.com', 'BT360 Teammate',
516513600000, true);
```

• Selection:

```
SELECT * FROM users;
SELECT email FROM users WHERE active = true;
```

## 10.5 Architecture

- P2P, distributed.
  - All nodes have he same node.
  - Data partitioned among all nodes in a cluster.

- Custom data replication to ensure fault tolerance.
- Transparent elasticy and scalability.
  - No downtimes.
  - Linear performance increase with addition of nodes.
- High availability.
  - No single point of failure.
  - Multi-geography/zone aware.
    - \* Supports multiple geographically dispersed datacenters.
- Data redundancy.
- Partitioning.
  - Nodes structured in **ring topology**.
  - Hashed value of key used to assign it to a node.
  - Nodes move around to alleviate loads.
- Gossip protocols.
  - Used for node communication. Inspired by real-life gossiping.
  - Periodic, pairwise node-to-node communication.
    - \* Low cost.
  - Failure detection:
    - \* Gossiping tracks heartbeats from other nodes.
    - \* A suspicion level variable is used to detect failures.

# 10.6 Write operations

# 10.6.1 Stages

- 1. Log data in commit log.
- 2. Write data to memtable.
- 3. Flush data from memtable.
- 4. Store data on disk in SSTables.

#### 10.6.1.1 Memtable

- Data structure in memory.
- Flushed to disk once a certain size is reached.
- Read operations start looking here.

#### 10.6.1.2 SSTable

- Kept on disk.
- Immutable once written.
- Periodically compacted for performance.

### 10.6.2 Consistency

- Read consistency:
  - Number of nodes that must agree before read request returns.
  - One to all.
- Write consistency:
  - Number of nodes that must be updated before a write is considered successful.
  - Any to all.
  - At an, a hinted handoff is all that is needed to return.
- Quorum:
  - Middle-ground consistency level.
  - Defined as:  $(replication_f actor/2) + 1$ .
- Example queries:
  - INSERT INTO table (column1, ...) VALUES (value1, ...) USING CONSISTENCY ONE
  - INSERT INTO table (column1, ...) VALUES (value1, ...) USING CONSISTENCY QUORUM

## 10.7 Delete operations

#### 10.7.1 Tombstones

- Deleted data is marked for deletion.
- Actual deletion will happen on major compaction or configurable timer.

# 10.7.2 Compaction

- Runs periodically to merge multiple SSTables.
  - Reclaims space.
  - Creates new index.

- Merges keys.
- Combines columns.
- Discards tombstones.
- Improves performance.
- Two types:
  - 1. Major.
  - 2. Read-only.

### 10.7.3 Anti-entropy

- Ensures synchronization of data across nodes.
- Compares data checksums across neighbors.
- Uses Merkle trees (hash trees).
  - Leaves are data, intermediate nodes are hashes.

# 10.8 Read operations

### 10.8.1 Read repair

- On read, nodes are queried until a number of nodes matching specified consistency level is reached.
- If consistency level is not met, nodes are updated with most recent value, which is then returned.
- If consistency level is met, value is returned immediately and old nodes are then updated.

#### 10.8.2 Bloom filters

- Bloom filters are used to check if a value is in a set.
- A value is hashed with multiple algorithms.
  - Bits of created hashes in a **bit vector** are set to 1.
- Checking for an element:
  - Hash the element again with same functions, check bits.
    - \* If the element is not there, it is **certain**.
    - \* Otherwise, there is a small chance of **false positives**.

## 10.9 Conclusion

## 10.9.1 Advantages

- High performance.
- Decentralization.
- Linear scalability.
- Replication.
- No single points of failure.
- MapReduce support.

# 10.9.2 Disadvantages

- No referential integrity.
  - No JOIN.
- Limited querying options.
- Sorting data is a design decision.
  - No group by.
- No support for atomic operations.
- "First think about queries, then data model".

#### 10.9.3 Considerations

- Use Cassandra when you have a lot of data spread across multiple servers.
- Write performance is always excellent, read performance depends on write patterns.
  - Schema must be designed for the queries.

# MongoDB

# 11.1 Background

- MongoDB is a document-oriented NoSQL DBMS.
- Uses **BSON** format.
- Schema-less.
- No transactions and no joins.

## 11.2 Basics

- A MongoDB instance contains databases.
- A database contains **collections**.
  - Conceptually similar to tables in SQL.
- A collection contains **documents**.
  - Conceptually similar to records in SQL.
  - Every document has an **unique key**.
- A document contains fields.
- Indexing support.
  - Uses B-trees.

## 11.2.1 Examples

• Documents:

```
- user = {
     name: "Z",
```

```
occupation: "A scientist",
          location: "New York"
• Collections:
    - {
          " id": ObjectId("4efa8d2b7d284dad101e4bc9"),
          "Last Name": "DUMONT",
          "First Name": "Jean",
          "Date of Birth": "01-22-1963"
      }
    - {
          "_id": ObjectId("4efa8d2b7d284dad101e4bc7"),
          "Last Name": "PELLERIN",
          "First Name": "Franck",
          "Date of Birth": "09-19-1983",
          "Address": "1 chemin des Loges",
          "City": "VERSAILLES"
      }
• Queries:
    - db.users.find( {last_name: 'Smith'} )
    - db.users.find( {age: {$gte: 23} } )
    - db.users.find( {age: {\$in: [23,25]} } )
```

# **HBase**

## 12.1 Overview

## **12.1.1** History

- Developed for massive natural language data search.
- Open-source implementation of Google BigTable.
  - Semi-structured data.
  - Cheap, horizontal scalability.
  - Integration with MapReduce.
- Developed as part of Hadoop, on top of HDFS.

#### 12.1.2 Characteristics

- Non-relational, distributed.
- Column-oriented.
- Multi-dimensional.
- High availability and performance.

# 12.2 Data model

- Sparse, multi-dimensional, sorted map.
  - {row, column, timestamp} -> cell
- Rows are lexicographically sorted on row key.
- Region: contiguous set of sorted rows.

## 12.2.1 Operators

- Operations are based on row keys.
- Single-row operations:
  - Put.
  - Get.
  - Scan.
- Multi-row operations:
  - Scan.
  - MutiPut.
- No joins use MapReduce.

# 12.3 Physical structures

- Region: unit of distribution and availability.
  - Split when grown too large.
  - Max size is a tuning parameter.
- Row keys are plain byte arrays.
- No support for secondary indexes.
  - Create new table with index and exploit sorting for complex queries.
  - Use libraries such as **Lily**.

# 12.4 System architecture

## 12.4.1 Components

- The  $\mathbf{HMaster}$  talks to n  $\mathbf{HRegionServer}$  instances.
- HRegionServers contain **HRegion** instances.
- HRegions contain **HLog** and multiple **memstores**.
- The memstores contain **StoreFiles** which are **HFiles** that interact with Hadoop.

# 12.5 ACID properties

- HBase is **not ACID compliant**.
- Guarantees:

- Atomicity:
  - \* All mutations are atomic within a row.
- Consistency and Isolation:
  - \* Eventual Consistency.
- Durability:
  - \* All visible data is durable data.

# Neo4J

# 13.1 Graph databases

- Schema-less.
- Efficient storage of semi-structured data.
- No O/R mismatch.
  - Natural to map a graph to OOP language.
- Express queries as traversals.
- Express graph-related problems.
  - Example: does a path exist between A and B?

# 13.2 Features

- Both **nodes** and **edges** can contain **properties**.
- Edges are **relationships**:
  - They have a start node and end node.
  - Have a relationship type.
  - Can have properties.
- ACID.
  - Transaction support.
- Query language: Cypher.
- Bad horizonal scalability:
  - Read-only scalability: all writes go to master, then fan out.

# XML

- XML (extensible markup language) is both a markup language and a meta-language to specify markup languages.
- A data model can be defined using **DTD** or **XSD**.
- Queries can be executed with **Xquery** or **XSL**.
- An XML document is **well-formed** when the syntax is valid.
- An XML document is **valid** when the contents respect a data model (schema).
- Namespaces are handled by using prefixes.

### 14.1 DTD

• Defining subelement occurrences:

```
<!ELEMENT product (description)>
<!ELEMENT product (description?)>
<!ELEMENT product_list (product+)>
<!ELEMENT product_list (product*)>
```

- Attributes/modifiers:
  - CDATA: character data.
  - ID: identifier.
  - IDREF: this value is an ID of anoter element.
  - ENTITY: this value is an entity.
  - NMTOKEN: this value is a valid XML name.
- Constraints:
  - #REQUIRED.
  - #IMPLIED: can be absent.

```
- #FIXED "x": value needs to be x.
```

```
- #DEFAULT "x".
```

### 14.2 XSD

- Another schema definition language.
- Compared to DTD:
  - More extensible and richer.
  - Can manage multiple namespaces.
  - Are XML themselves.

### 14.3 XSL

- Extensible stylesheet language.
- Specifies how XML output is reprsented.
- **XSLT** (XSL transformation) transforms an XML in another XML or a different type (like HTML).

## 14.4 Xquery

- Can use **Xpath** expressions to query XML documents.
  - Examples:

```
doc("books.xml")/List/Book
doc("books.xml")/List/Book[Editore = 'Bompiani']/Title
doc("books.xml")//Author
doc("books.xml")/List/Book[2]/*
```

- Can use complex **Xquery** expressions combined with Xpath.
  - FOR, LET, WHERE, ORDER BY, RETURN, INSERT, DELETE.
  - Examples:

```
for $book in doc("books.xml")//Book
return $book
for $book in doc("books.xml")//Book
WHERE $book/Editor = "Bompiani" and $book/@availability = "S"
return $book
```