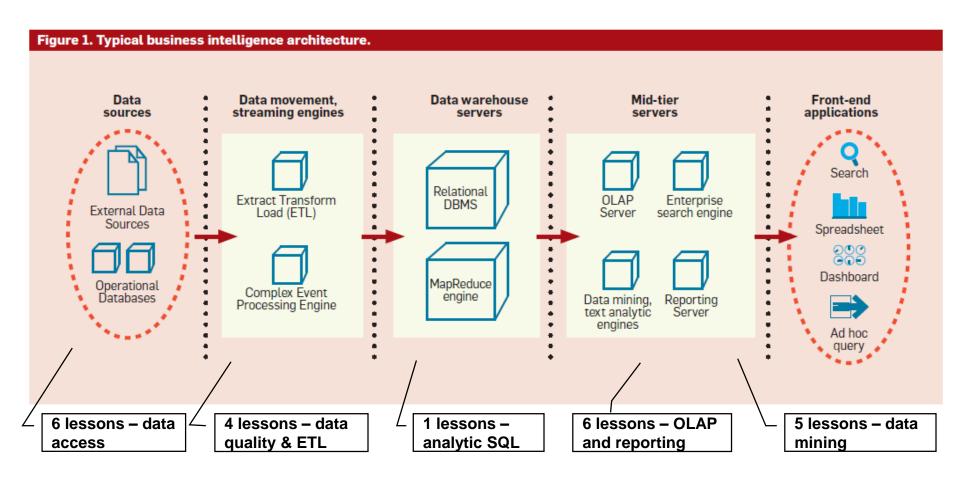
LABORATORY OF DATA SCIENCE

Business Intelligence Architectures

BI Architecture

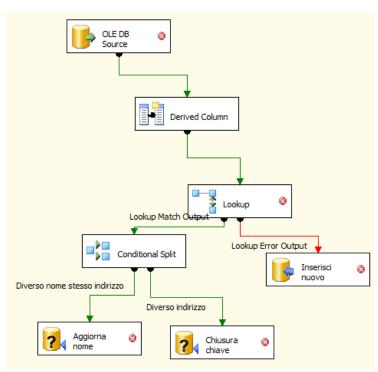


Data sources

- Multiple operational data sources
 - Across departments of the organization, and external sources
 - Type and formats
 - Relational, multidimensional, time-seriers, spatial, text, multimedia, ...
 - Issues
 - Standards for representations, codes, formats of text files
 - Standards for querying relational data sources
 - Basic programs for data manipulation
- □ We will study:
 - Python access to text files
 - Python access to RDBMS

Extract, Transform and Load

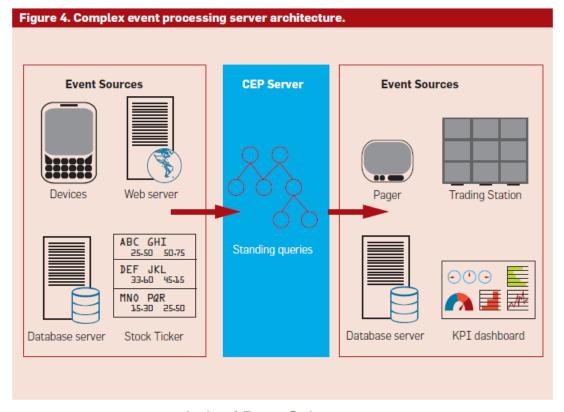
- **ETL** (extract transform and load) is the process of extracting, transforming and loading data from heterogeneous sources in a data base/warehouse.
 - Typically supported by (visual) tools
- We will study:
 - SQL Server 2016 Integration Services



Extract, Transform and Load

Incremental and real-time ETL

Complex Event Processing (CEP)



Lab of Data Science

Data warehouse

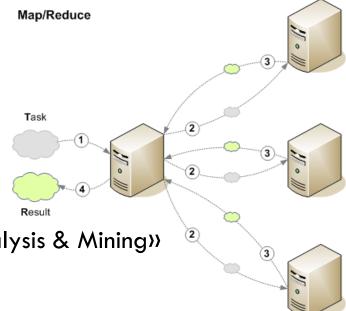
"A data warehouse is a <u>subject-oriented</u>, <u>integrated</u>, <u>time-variant</u>, and <u>nonvolatile</u> collection of data in support of management's decision-making process."

W.H. Inmon

 Data warehousing: the process of building and using a datawarehouse

Data warehouse servers

- Relational DBMS (RDBMS)
 - With specialized index and optmizations
 - star-join query, bitmap index, partitioning, materialized views
 - We will study:
 - SQL Server 2016 with analytic SQL
- MapReduce engine
 - Big data challenge
 - Architect (low-cost) data platform
 - Covered by 687AA "Distributed Data Analysis & Mining"



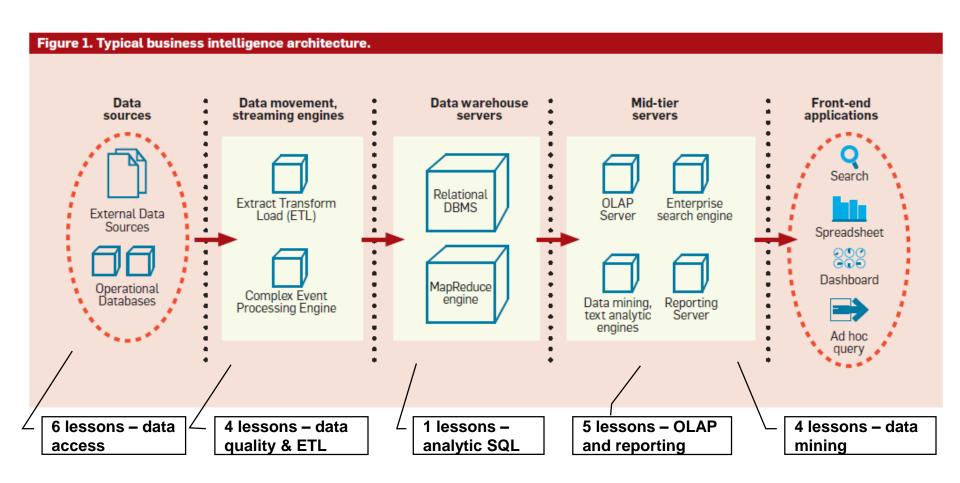
Which DBMS for DW?

<u>Gartner Magic Quadrant – February 2016</u>



Lab of Data Science

BI Architecture



Mid-tier server



- OnLine Analytical Processing (OLAP)
 - Provides a multidimensional view of data warehouses
 - Pre-compute aggregates
 - in ad-hoc structures (multidimensional OLAP MOLAP)

Figure 2. Multidimensional data.

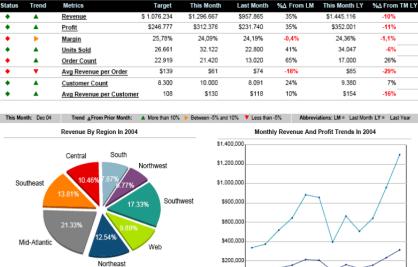
- in relational DB (relational OLAP ROLAP)
- in-memory OLAP
- We will study:
 - SQL Server 2016 Analysis Services and MDX Query Language

Mid-tier servers

Reporting Servers

- Enable definition, efficient execution, and rendering of reports
- Data is retrieved from datawarehouse or OLAP servers
- We will study:
 - Microsoft Power BI





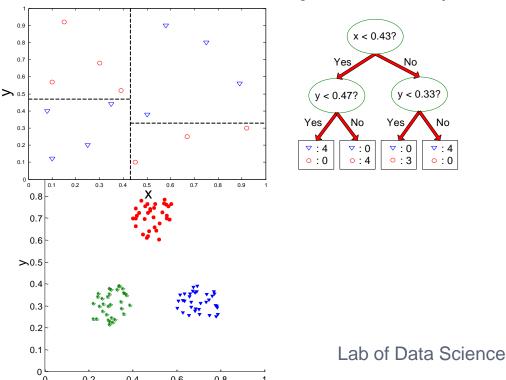
Mar 2004 May 2004 Jul 2004 Sep 104 Apr 2004 Jun 2004 Aug 2004

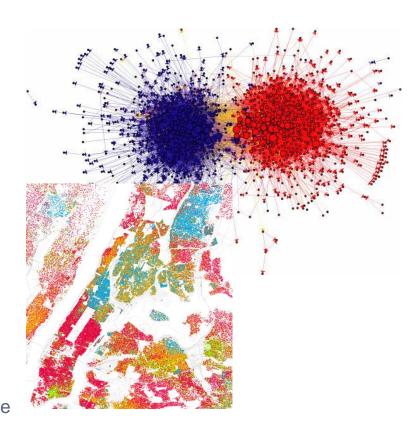
Operational Performance Scorecard

Mid-tier servers

Data/web/text mining servers

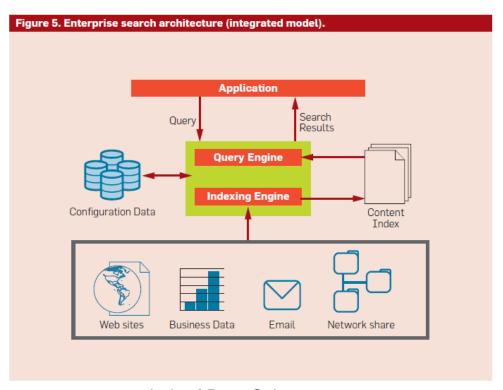
- Extract descriptive & predictive models from structured/graph/textual data
- □ We will study:
 - WEKA: a data mining software in Python





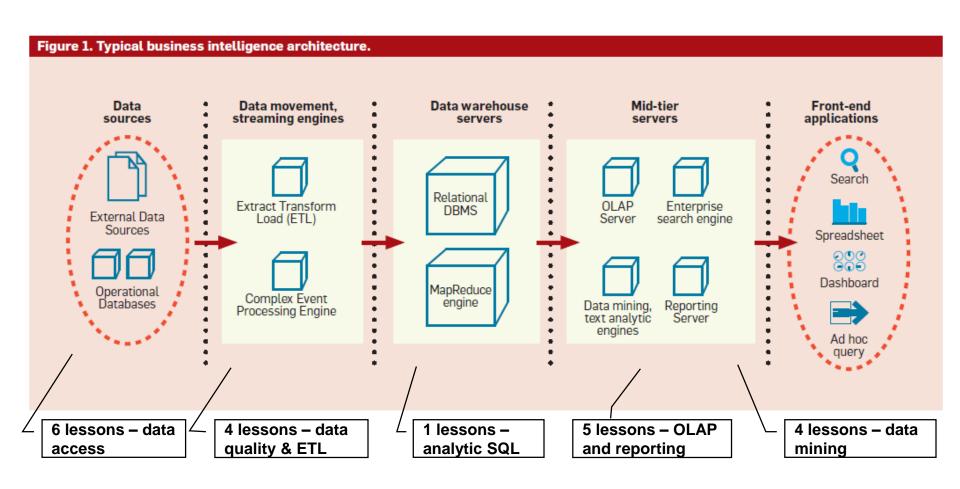
Mid-tier servers

- Enterprise Search Engine
 - Crawl, index and search by keywords over different types of data
 - Covered by 289AA (Information Retrieval)



Lab of Data Science

BI Architecture



Front-end applications

- Applications through which users perform BI tasks
 - Spreadsheets
 - for navigating multidimensional data
 - We will study: Excel
 - Enterprise portals
 - for accessing reports and dashboards
 - for searching through query
 - GUI
 - for accessing mining models
 - for exploratory data analysis
 - for ad-hoc queries
 - Vertical packaged applications for CRM, Supply-Chain, Finance, Opinion mining ...
 - More specialized tools for building storytellings to produce understandable stories to presents information to the users.
 - Covered by 602AA (Visual Analytics)

Front-end applications

