

Big Data Analytics

Introduction

2019

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France

Agenda

Big Data

- **Data Concept**
 - Data
 - Information
 - Knowledge
- **Big Data Concept**
 - Volume
 - Variety
 - Velocity
 - Veracity
- **Big Data Life Cycle**
 - Data Acquisition
 - Multi-Channels
 - Internet of Things
 - Cloud/Grid Computing
 - Data Storage
 - Data Base
 - Data Warehouse
 - Data Lake
 - Data Security

Analytics

- **Concept**
- **Types**
 - Traditional Analytics
 - Business Intelligence (BI)
 - OnLine Analytical Processing (OLAP)
 - Advanced Analytics
 - Artificial Intelligence
 - Data Mining
 - Machine Learning

Big Data Analytics

- **Concept**
- **Role**
- **As a field**
- **Technically**
- **Big Data Analytics Life Cycle**
 - Data Processing
 - Hadoop
 - MapReduce
 - Data Quality
- **Big Data Analytics Project**
- **Technological and Social Mutations**
- **In Management**
 - Applications
 - Predictive Management
 - Prediction in Unstructured BPM
 - Marketing/Sales Compliance
 - Supply Chain Advanced Risk Management
 - Supply Chain Predictive Risk Management

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What is 'Data' ?!

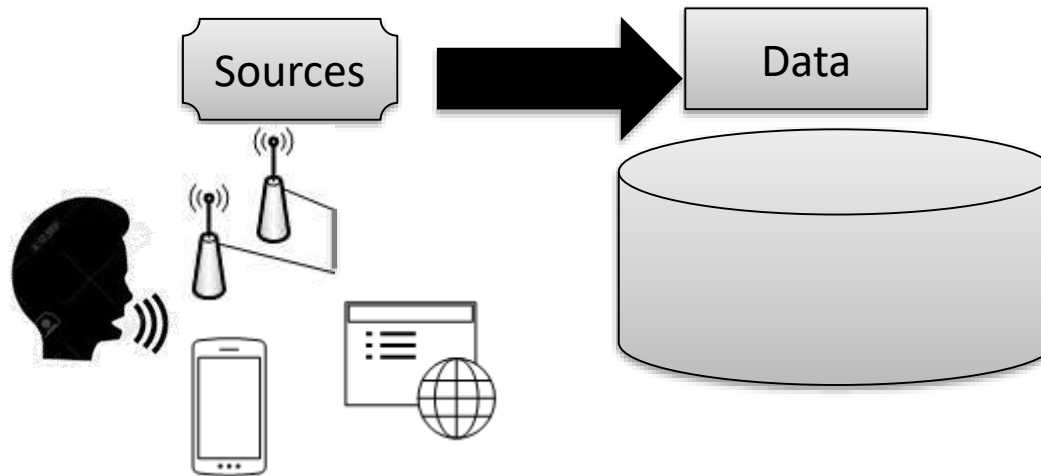
5min to answer...



■ Data

Are the raw facts (or descriptions of facts) that were taken, observed, recorded, agreed, such as words, numbers, observations, surveys, etc.

- Data are unprocessed facts, figures, schemas, etc.
- In Information Systems (Computerized), Data is the input in the computer system.
- Data doesn't have a meaning !



■ Data

- 2 kinds of Data :
 - **Qualitative:** textual or symbolic
 - **Quantitative:** numerical

	Quantitative	Qualitative
Concept/Definition	Valuated facts	Described facts
Methodology	Collected by measurement tools	Collected by observation
Analysis	Performed by statistical and numerical methods	Performed by specific adapted methods of classification, quantification, etc.
Results	Reported through statistic methods	Reported through a specific format/language

■ Data

Example



24°

Data

~~Meaning~~

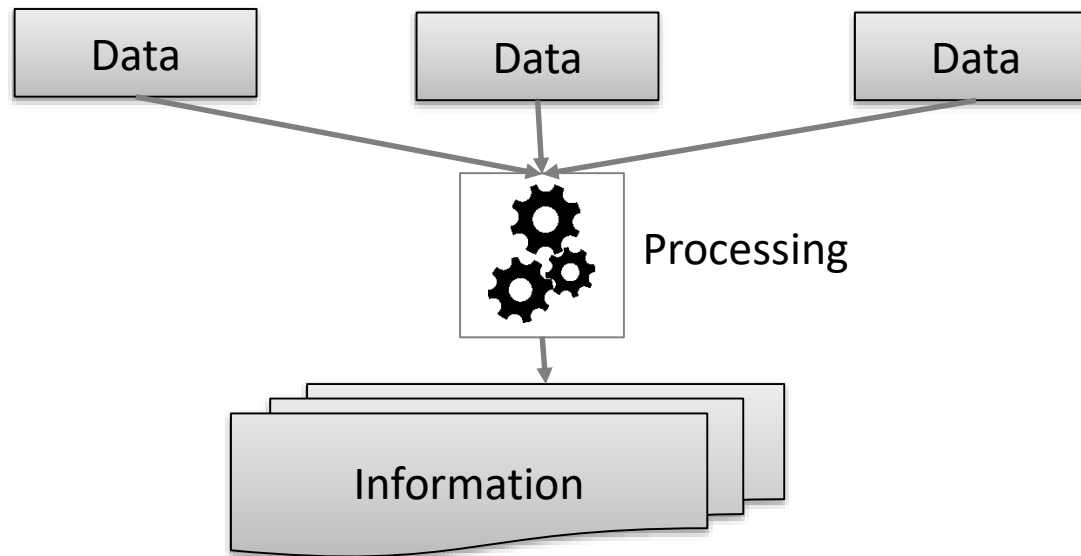
~~What context ?~~

~~Temperature of what ?~~

■ Information

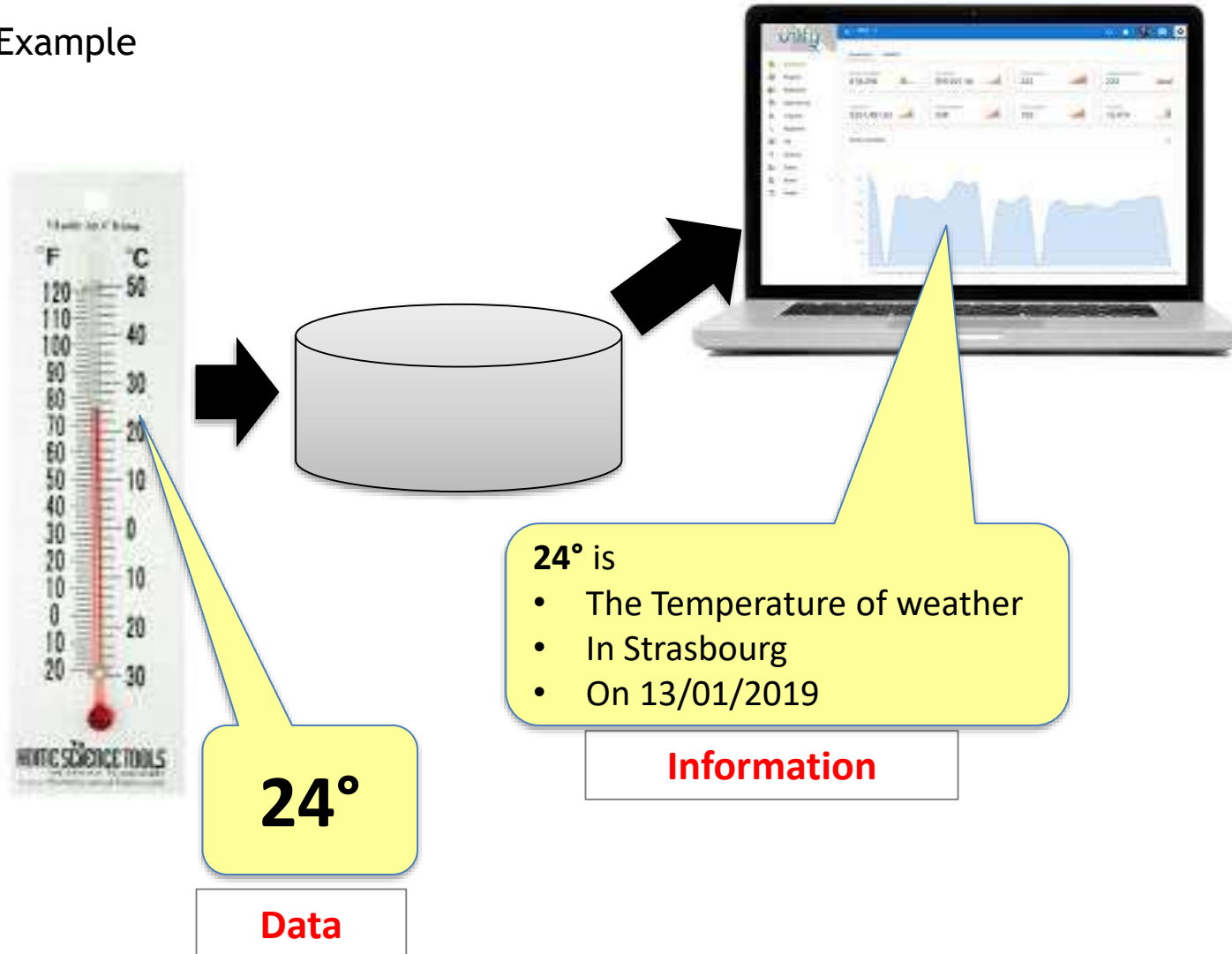
Is the raw fact that was taken, observed, recorded, agreed.

- Information is processed
- Processed Data become information.
- Information is based on Data



■ Information

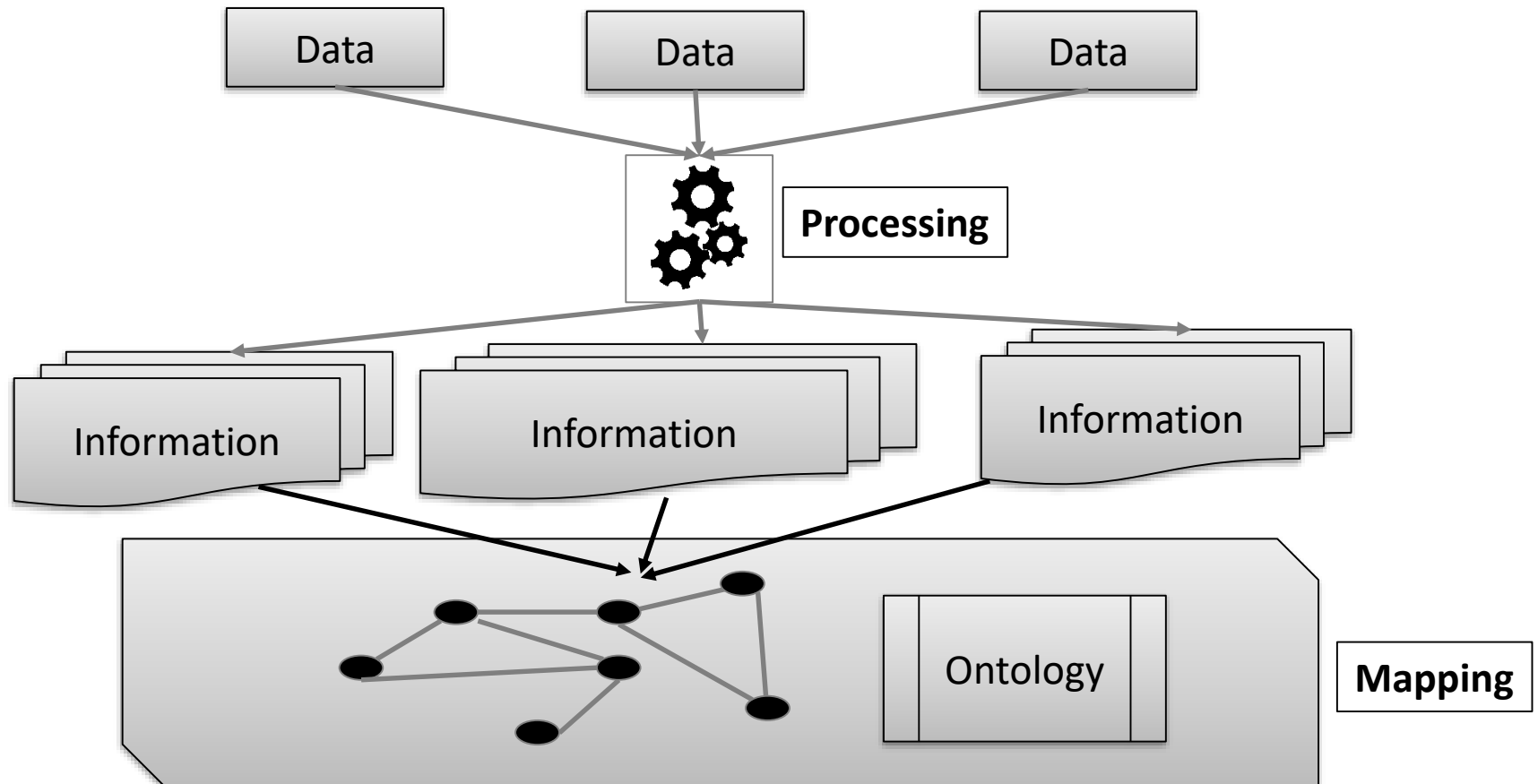
Example



■ Knowledge

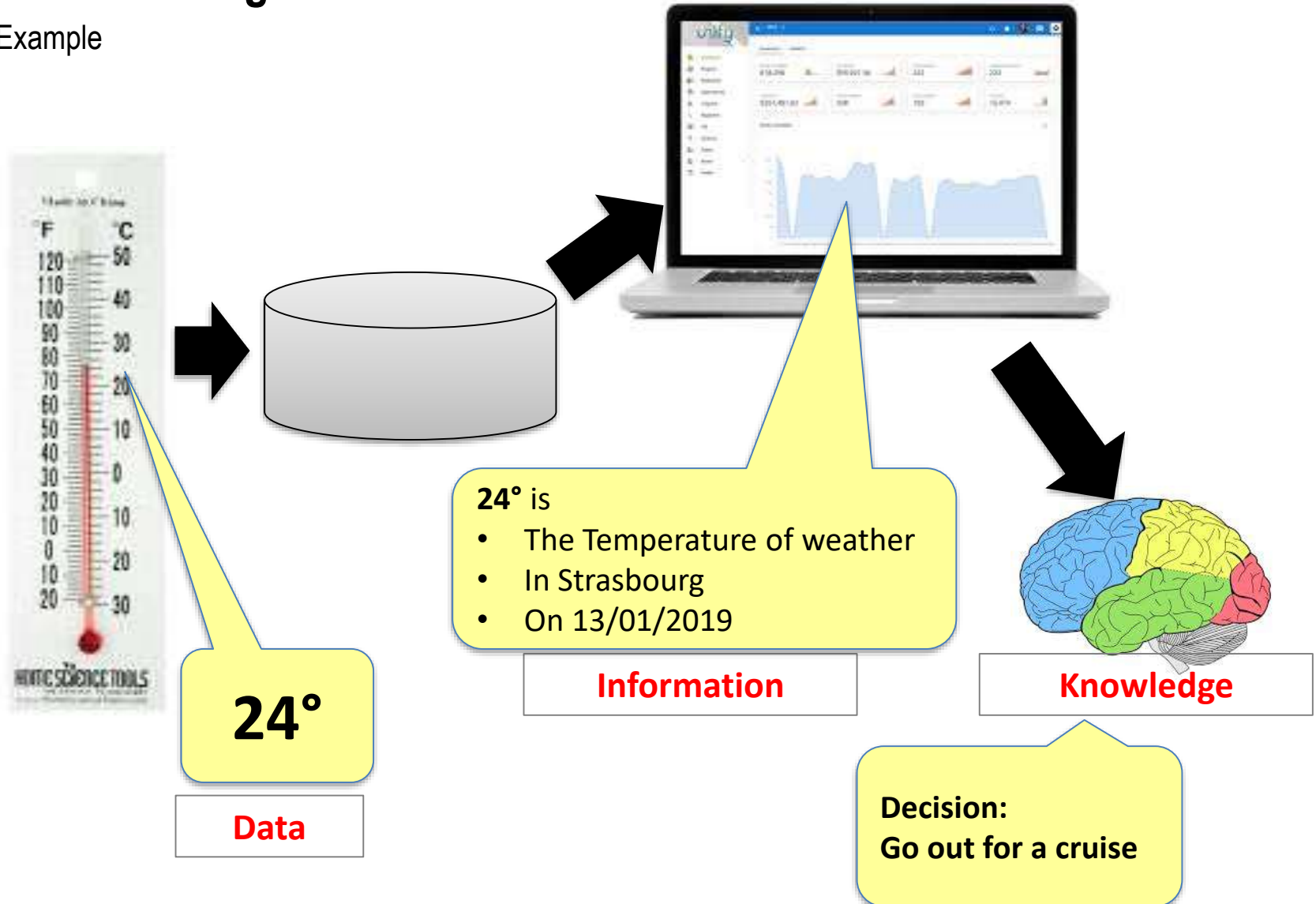
Is the set of relationships between information elements following an ontology

- Mapped information: how they are related, what is compound in what, where ?
- There is ontology (definition of meanings) that frame the set of information



■ Knowledge

Example



What is 'Big Data' ?!

5min to answer...



Big Data → Big Data Concept



■ Definition

Big Data is the field that gathers all activities and functions of :

- Acquisition of Data,
- Storage of Data,

from multiple sources that cannot be processed by common and **traditional** systems (for example ERP, Excel, etc.).

In Big Data, Data are :

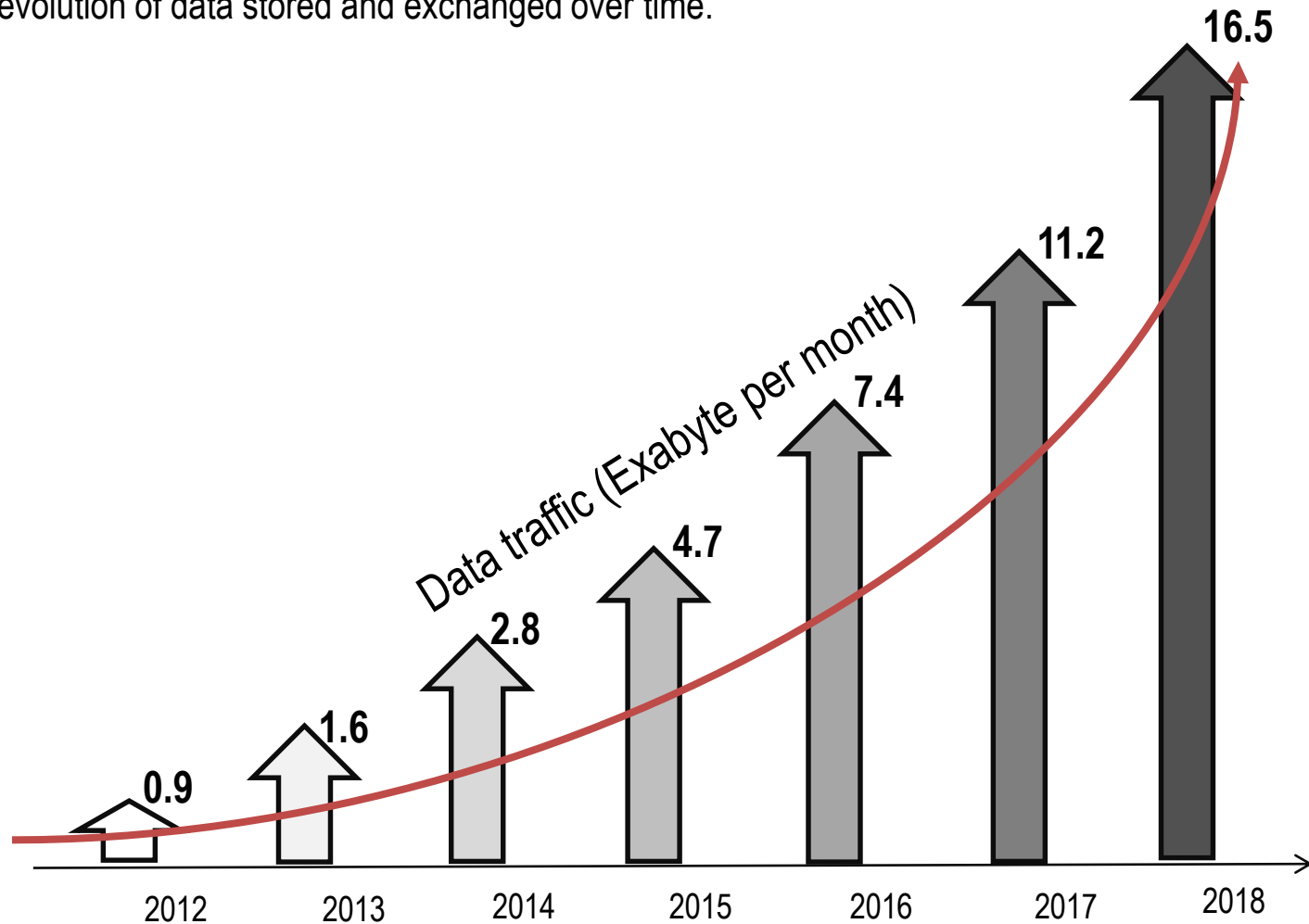
- Huge(Volume),
- hetereogenous (Variety),
- Dynamic (Velocity),
- Uncertain (Veracity).



4 V

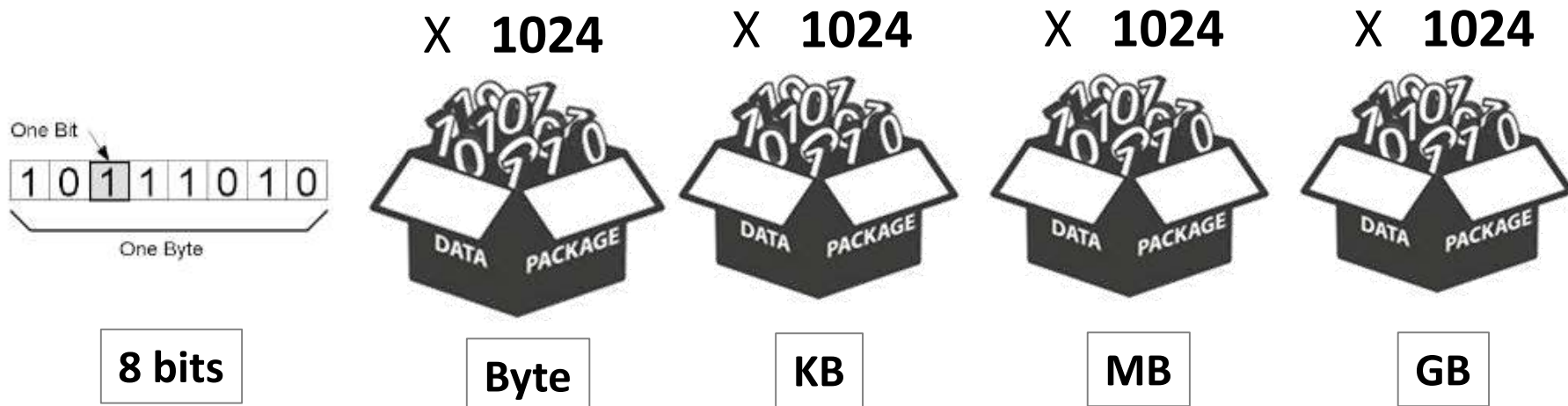
■ Volume

The evolution of data stored and exchanged over time.



■ Volume

The evolution of data stored and exchanged over time.



■ Volume

The evolution of data stored and exchanged over time.

■ Data Measurement Units

Unit	Abbreviation	Decimal	Binary	Size
bit	b	0 or 1	0 or 1	1/8 of a byte
byte	B	8 bits	8 bits	1 byte
kilobyte	KB	1,000 ¹ bytes	1,024 ¹ bytes	1,000 bytes
megabyte	MB	1,000 ² bytes	1,024 ² bytes	1,000,000 bytes
gigabyte	GB	1,000 ³ bytes	1,024 ³ bytes	1,000,000,000 bytes
terabyte	TB	1,000 ⁴ bytes	1,024 ⁴ bytes	1,000,000,000,000 bytes
petabyte	PB	1,000 ⁵ bytes	1,024 ⁵ bytes	1,000,000,000,000,000 bytes
exabyte	EB	1,000 ⁶ bytes	1,024 ⁶ bytes	1,000,000,000,000,000,000 bytes
zettabyte	ZB	1,000 ⁷ bytes	1,024 ⁷ bytes	1,000,000,000,000,000,000,000 bytes
yottabyte	YB	1,000 ⁸ bytes	1,024 ⁸ bytes	1,000,000,000,000,000,000,000,000 bytes

■ Volume

Distribution of Data centers around the world.

North America: 45%

Europe : 32%

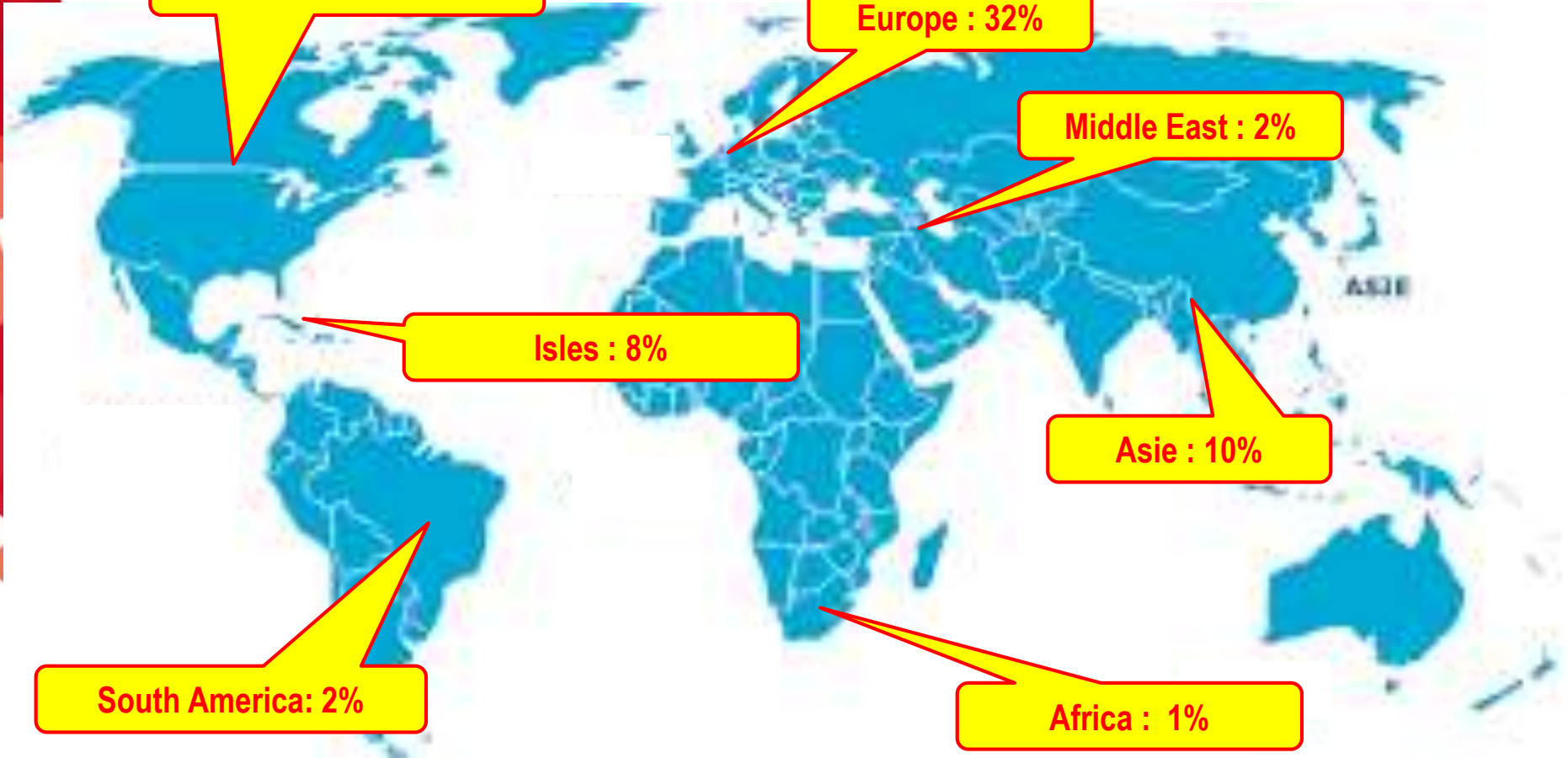
Middle East : 2%

Isles : 8%

Asie : 10%

South America: 2%

Africa : 1%



■ Volume

Multiple Data centers around the world.



Data Center Utah (USA)



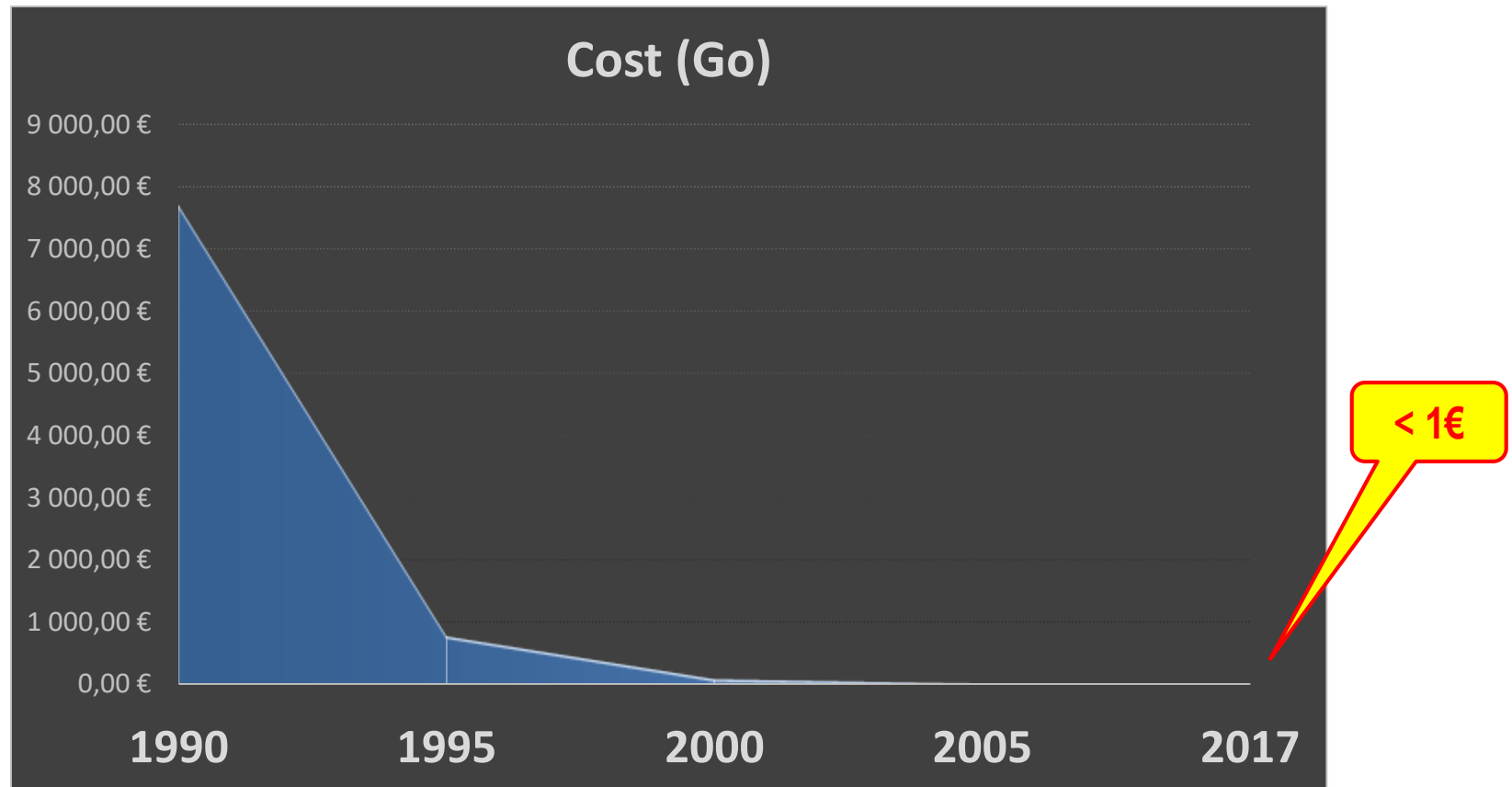
Data Center Vitry (France)



Data Center Busan (South Korea)

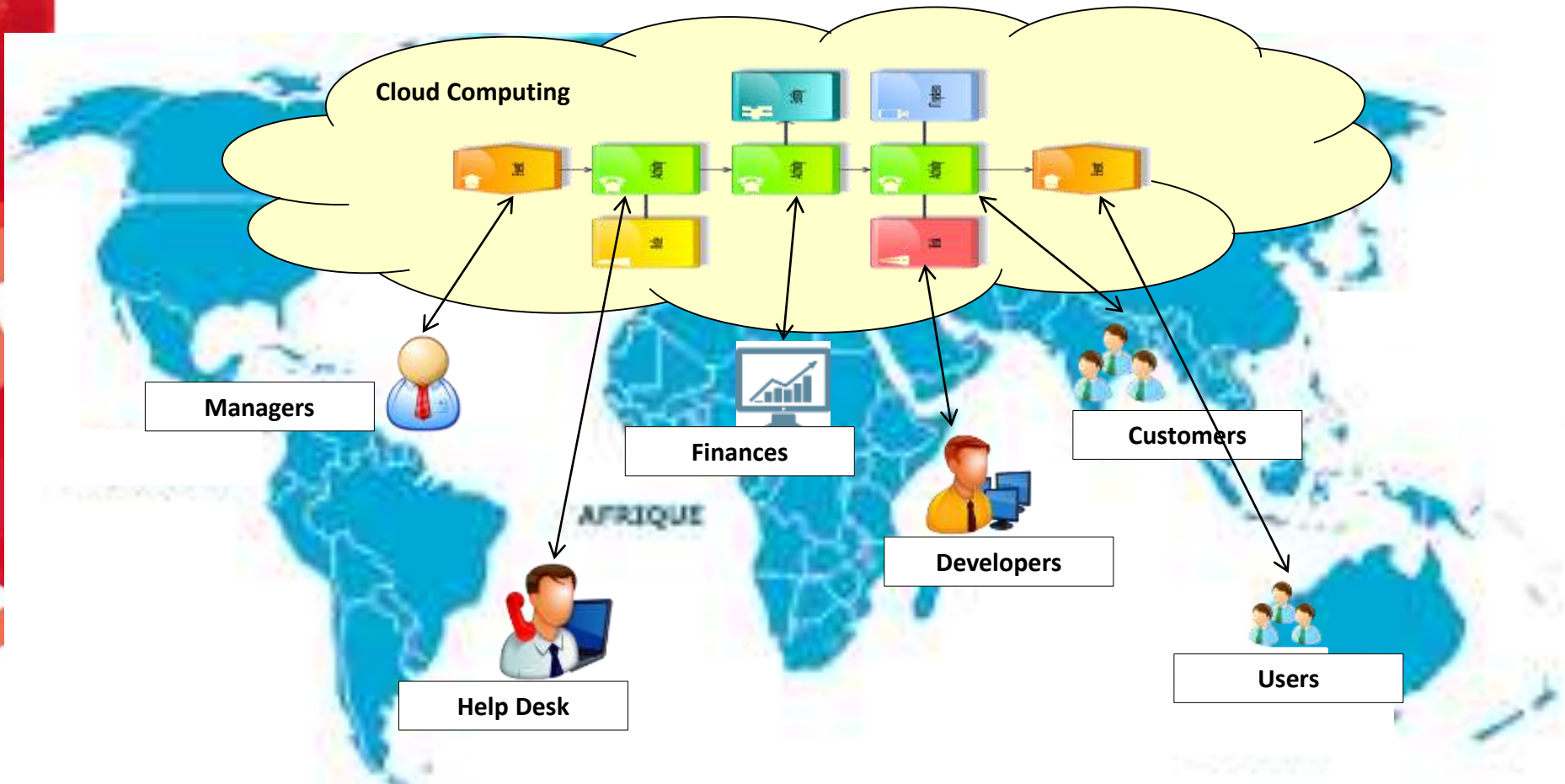
■ Volume

Storage price decreasing.



■ Volume

Virtualization.



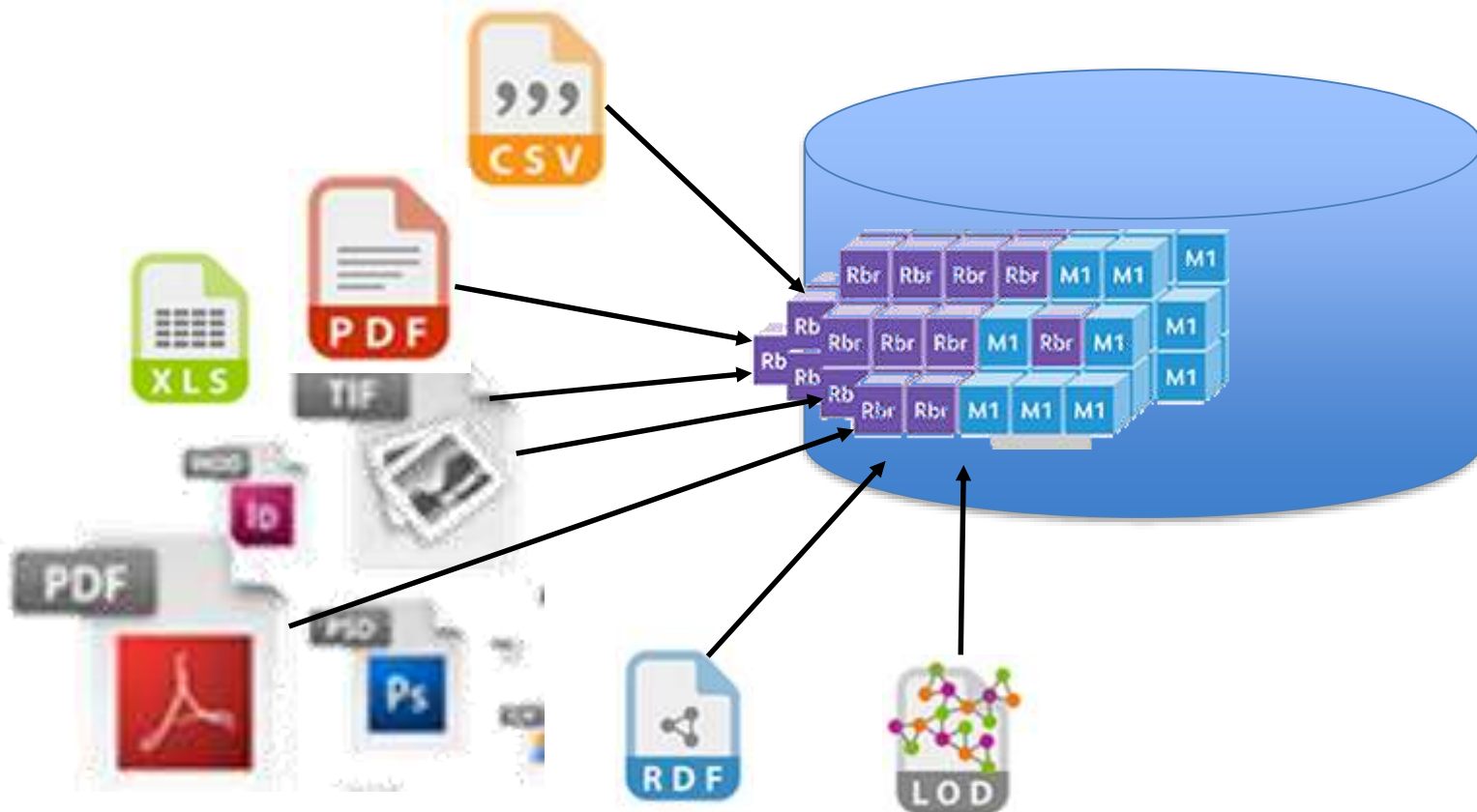
■ Volume

Internet Of Things.



■ Variety

No standard format of data in storages. Meta-Data of structures and organizations, semantic Data, images, videos, texts, XML, text formats, etc.



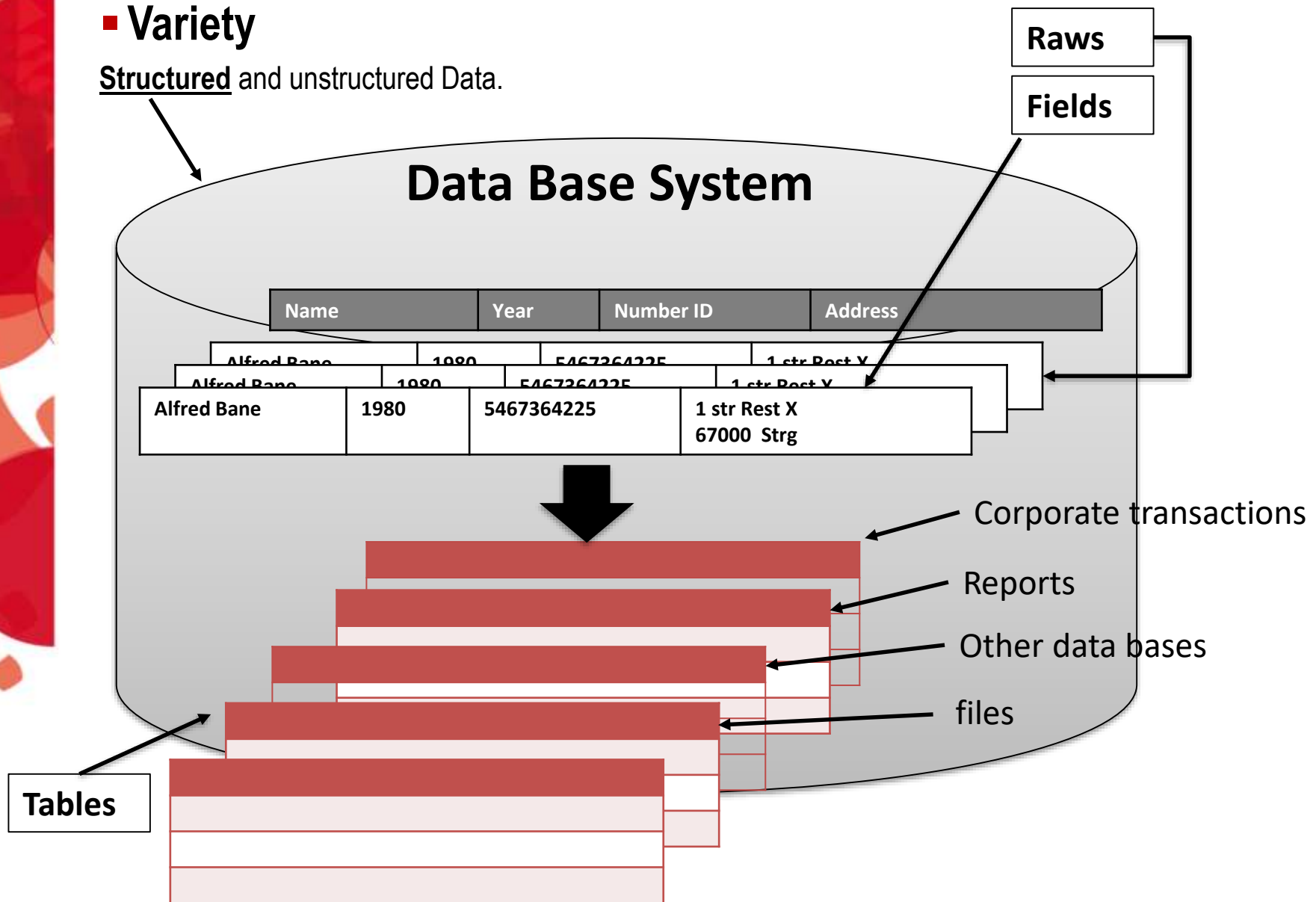
■ Variety

Different sources.



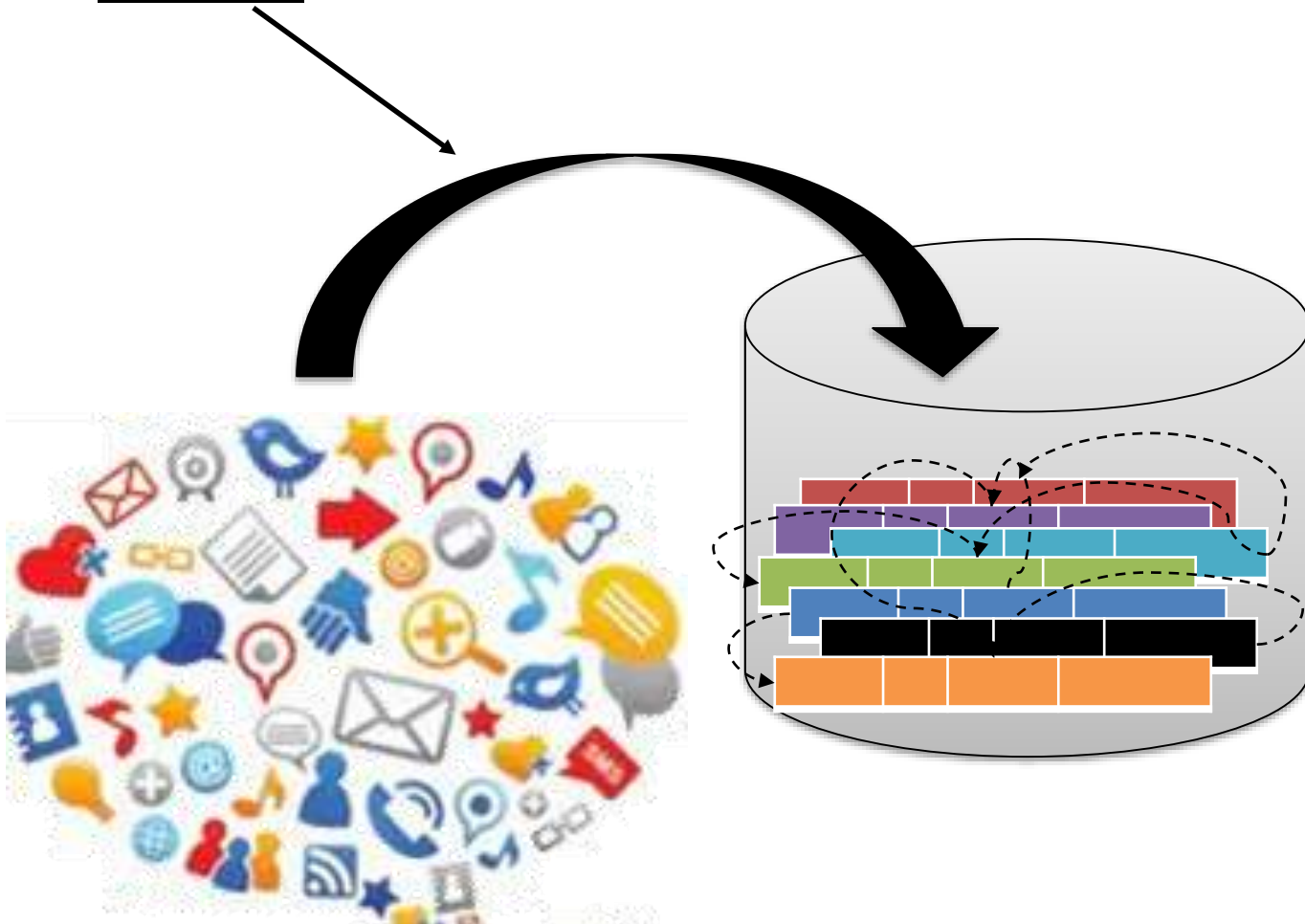
■ Variety

Structured and unstructured Data.



■ Variety


Structured and unstructured Data.



■ Applicative Exercise 1

Group work. Duration 30min. Score: 0.5

Try to list more than 10 data sources in at least 3 areas. For example RFID in Manufacturing and Logistics

Data source	Type	Area	Image/Pattern
RFID	Chip with Digital code	Manufacturing / Logistics	

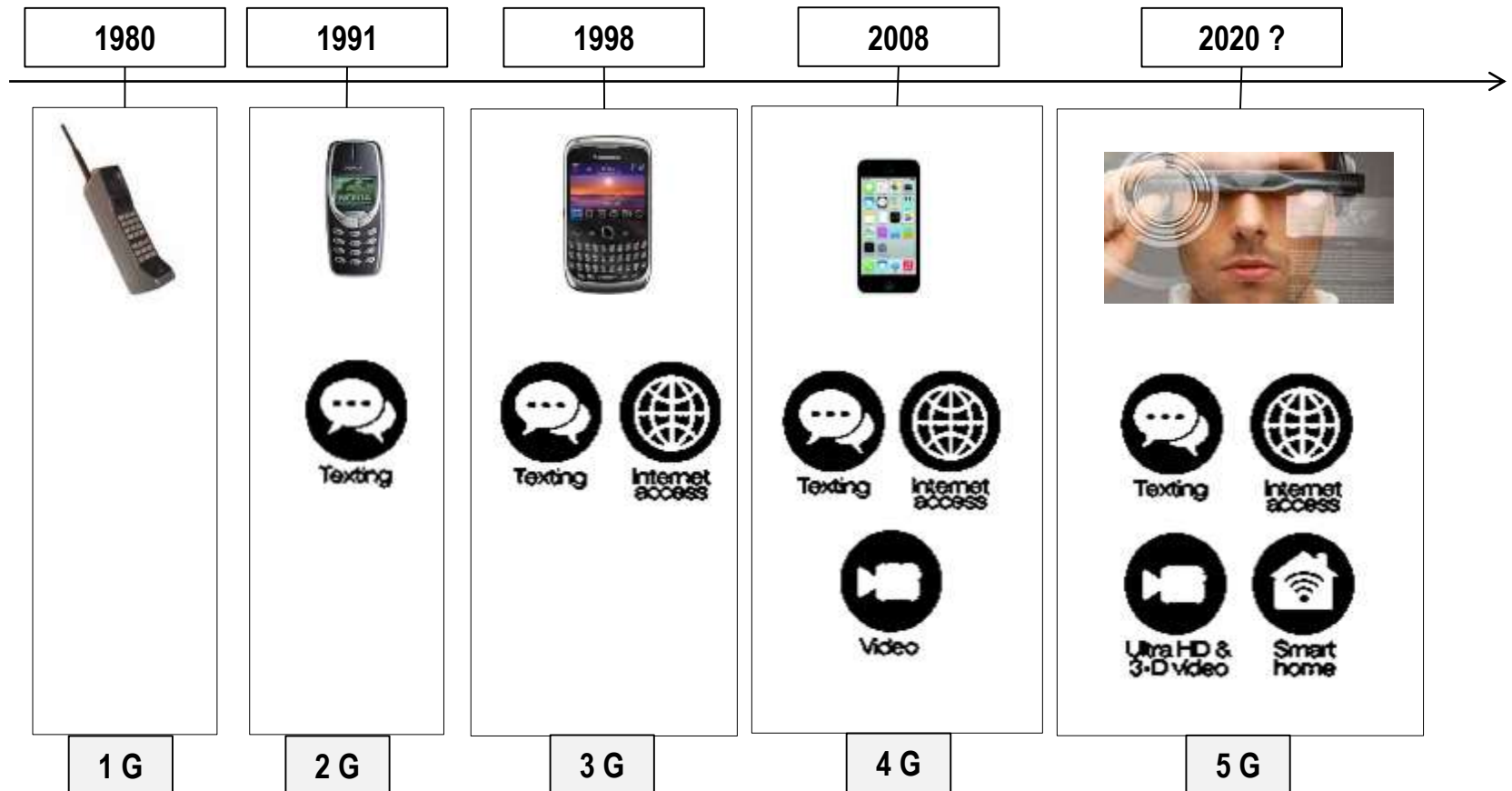
■ Velocity

Speed of data flows is going increasingly because of IT high process.



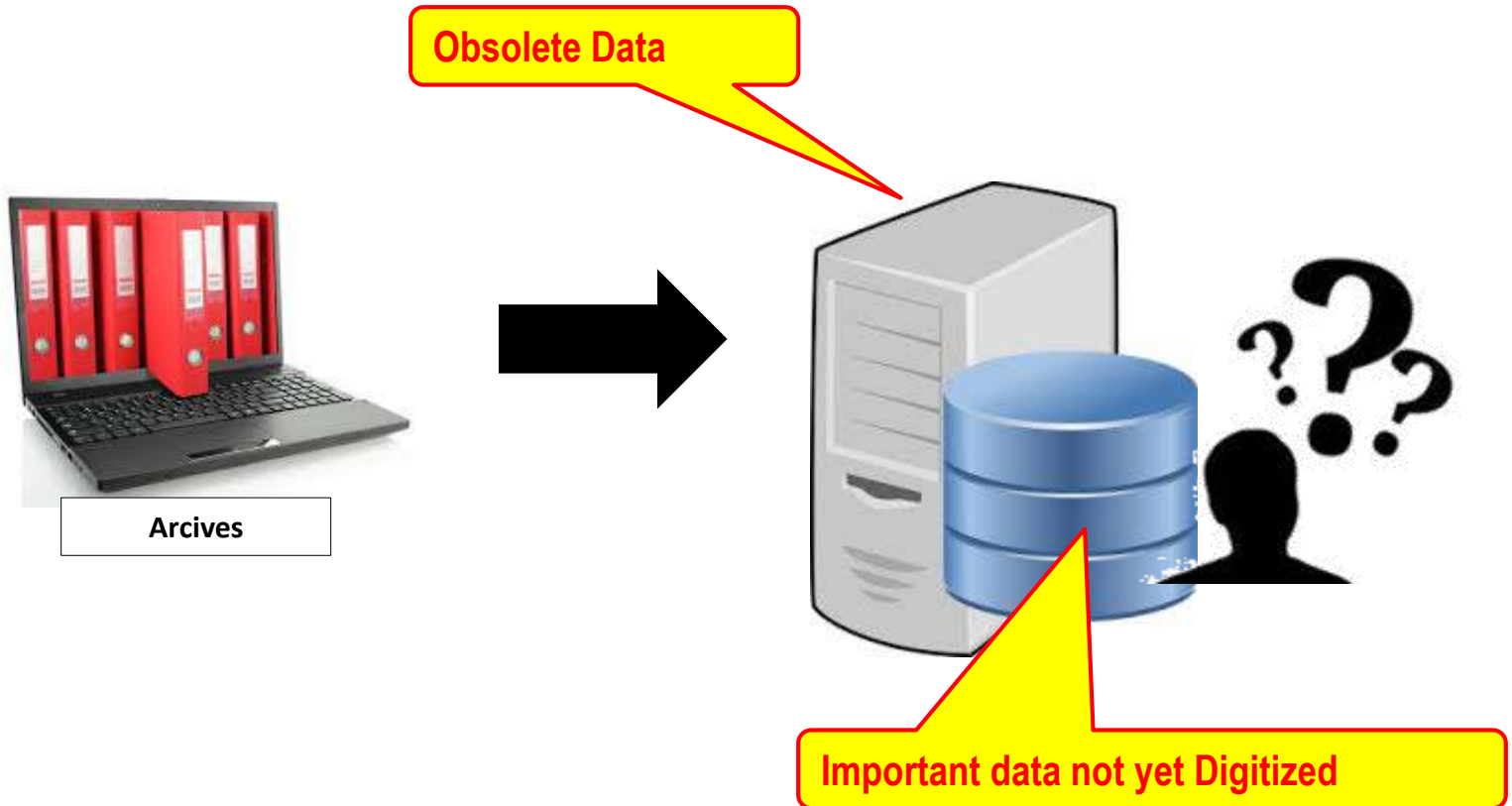
■ Velocity

Speed of data flows is going increasingly because of IT high progress.



■ Veracity

Uncertainty of the data - Uncertain multichannel sources : Archive



■ Veracity

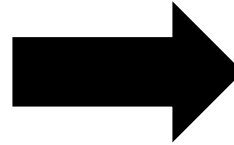
Uncertainty of the data - Uncertain multichannel sources : Multiple profiles



fake profiles on social networks



Multiple profiles



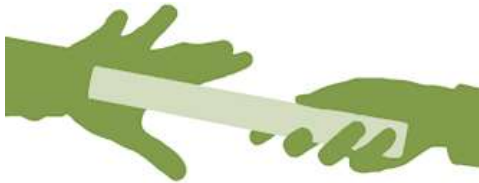
Fausses données (date naissance, pays, etc.)



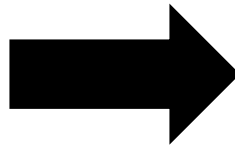
False data (date of birth, country, etc.)

■ Veracity

Uncertainty of the data - Uncertain multichannel sources : Delegation



Delegation in transactions



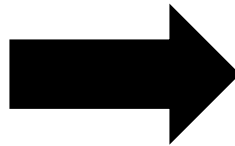
False location of the interested party

■ Veracity

Uncertainty of the data - Uncertain multichannel sources : forecasted by nature

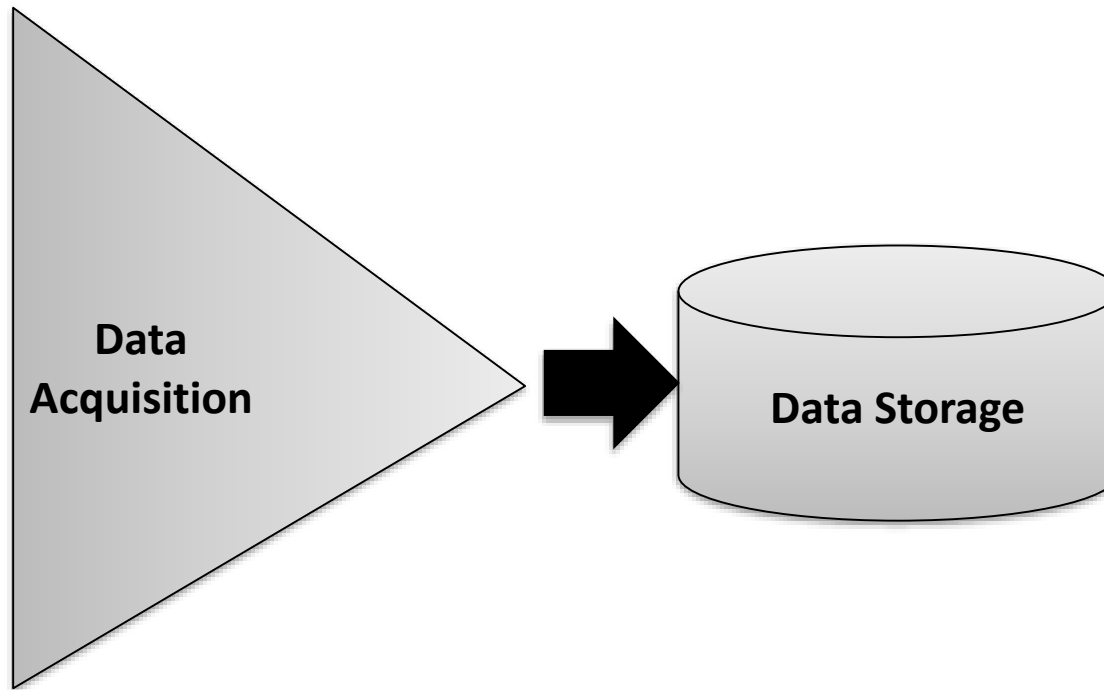


Uncertain by nature

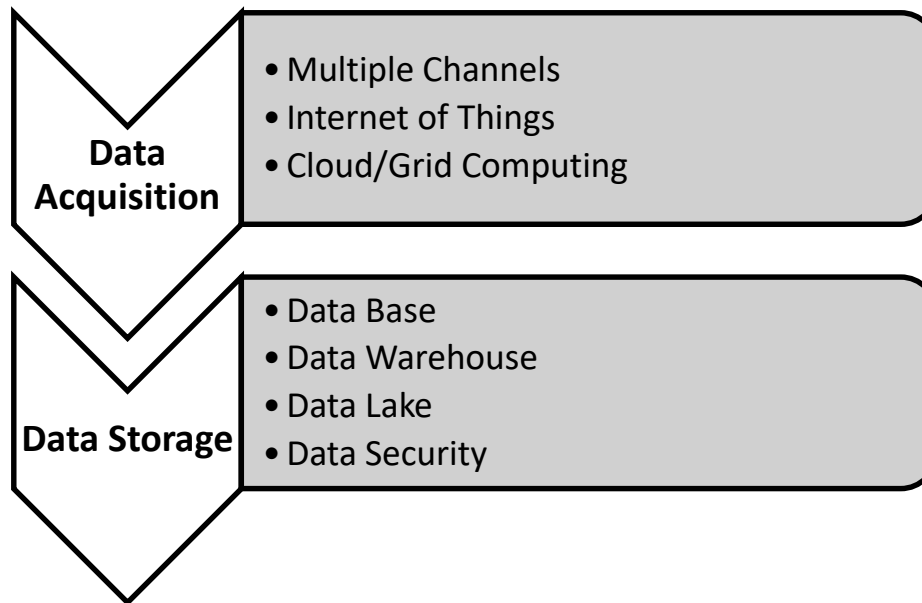


Ex. Meteorology for road management

- **Big Data Life Cycle**

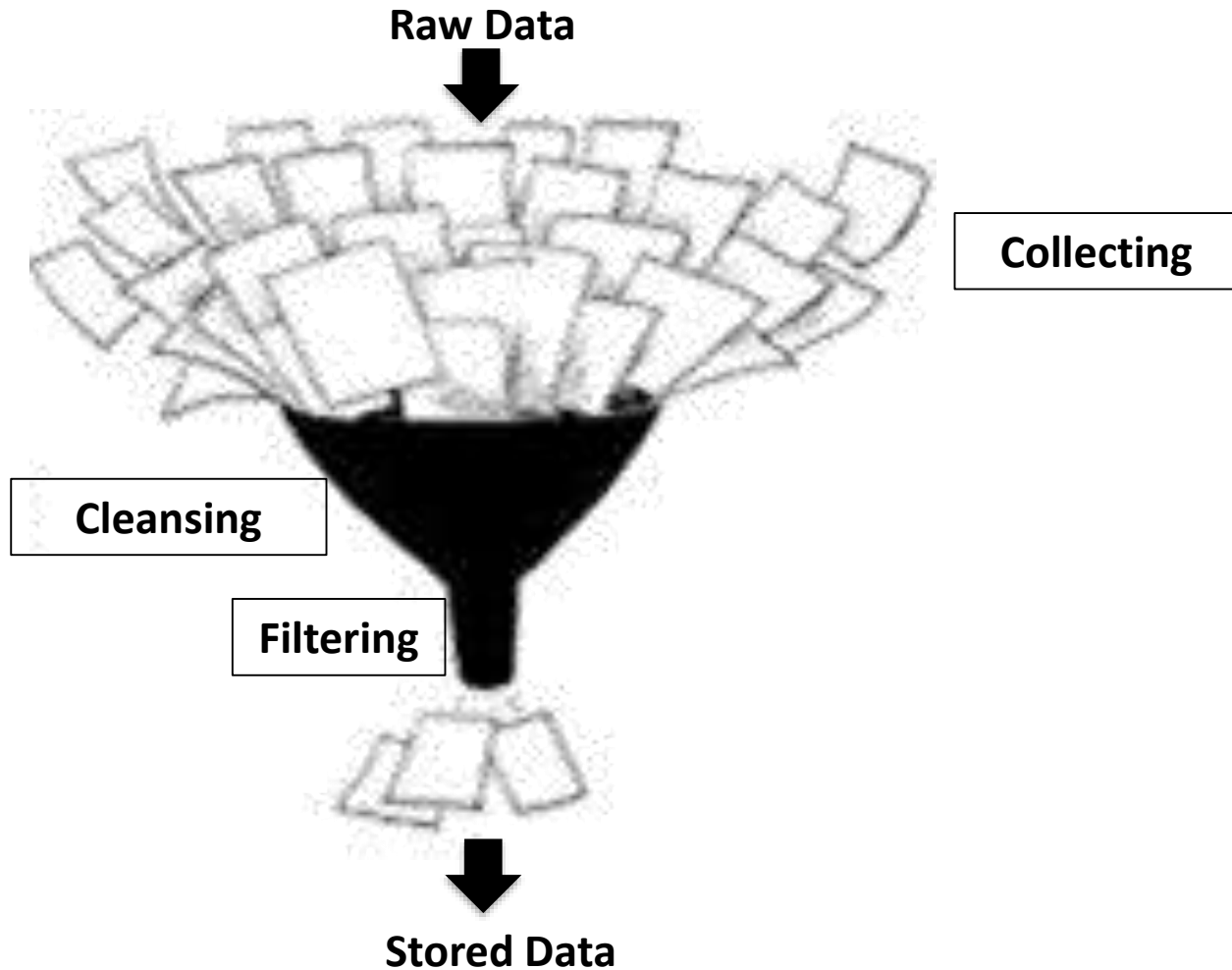


■ Big Data Life Cycle



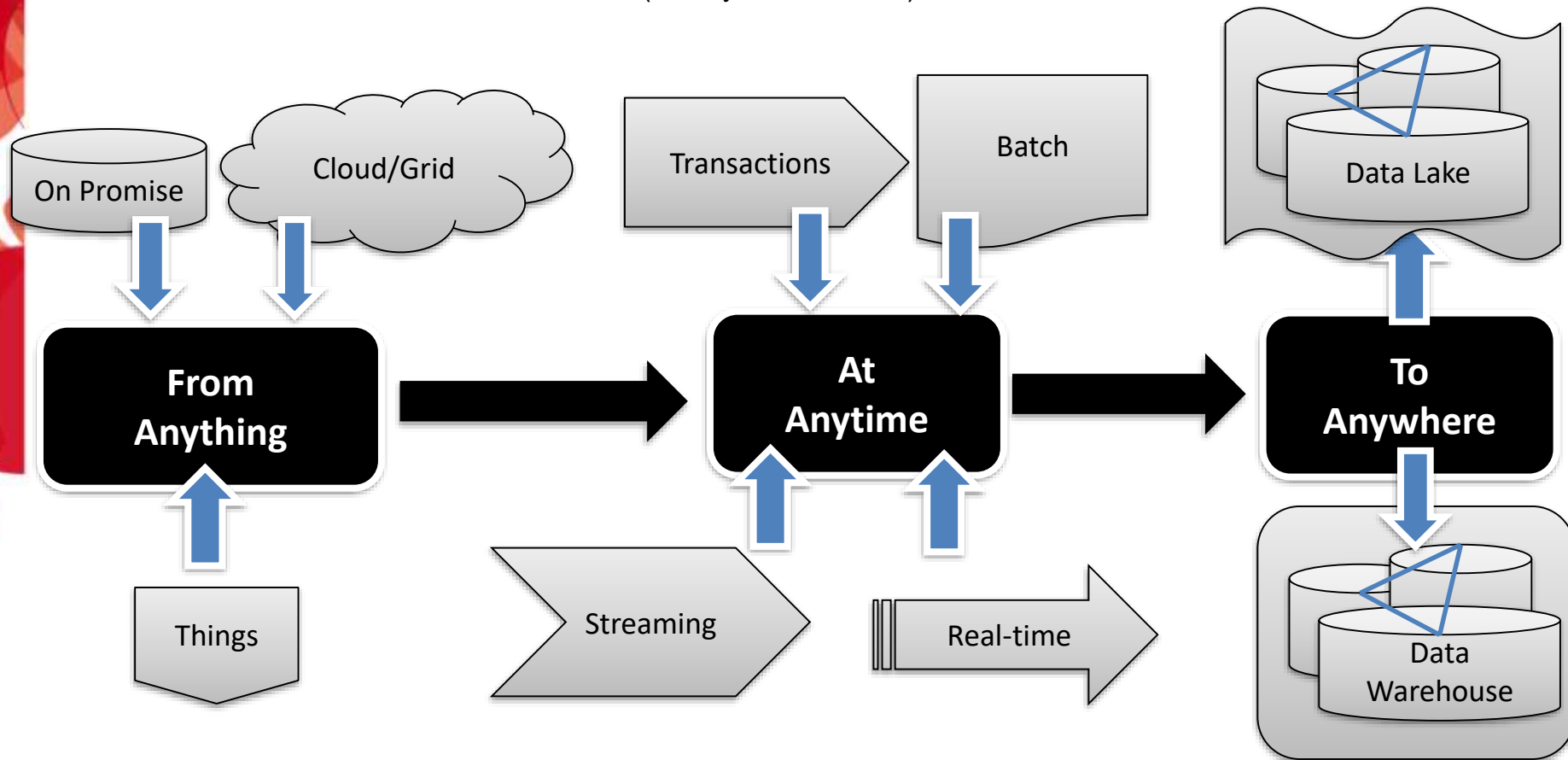
■ Data Acquisition

Is the process of collecting, cleaning, and filtering data before the data is put in a the storage.



■ Multiple-Channels

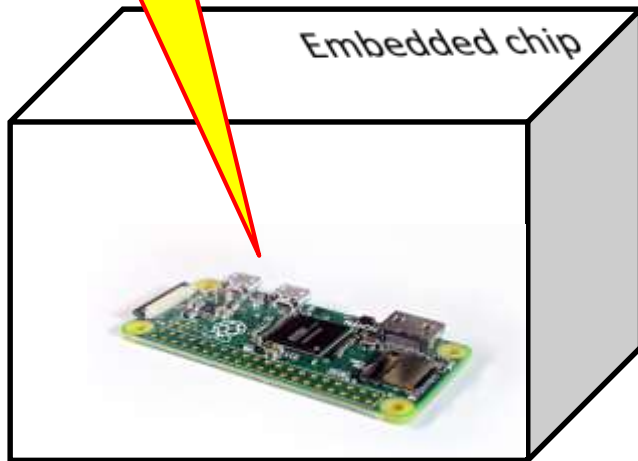
- **Data streaming** → structured and unstructured Data (mainly from Internet of Things)
- **Batch and Events sourcing** → Data from infrastructures (mainly from cloud and on Pro)
- **Real-time Data flows** → Real-time/near real-time flows (mainly from Internet of Things and cloud)
- **Data transactions** → structured Data (mainly from On Pro)



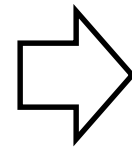
■ Internet of Things (IoT)

A set of devices that are able to connect and exchange data through Internet.

----- Smaller
&
+++++ Faster



Embedded Computing > 233 billions USD/ 2021



Gartner®

■ Internet of Things (IoT)



Smart washing machine



Smart fridge



Smart watch



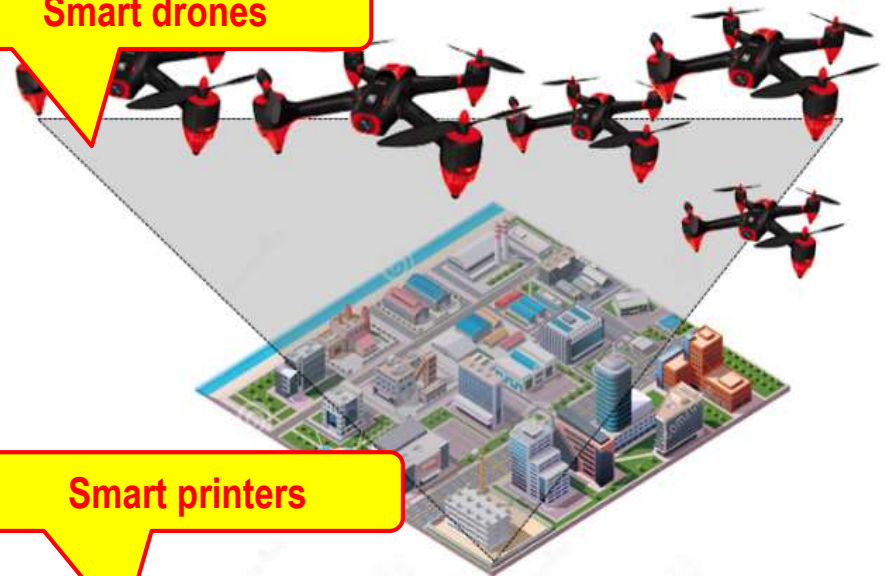
Smart phone (smart assistant)

■ Internet of Things (IoT)

Smart cars



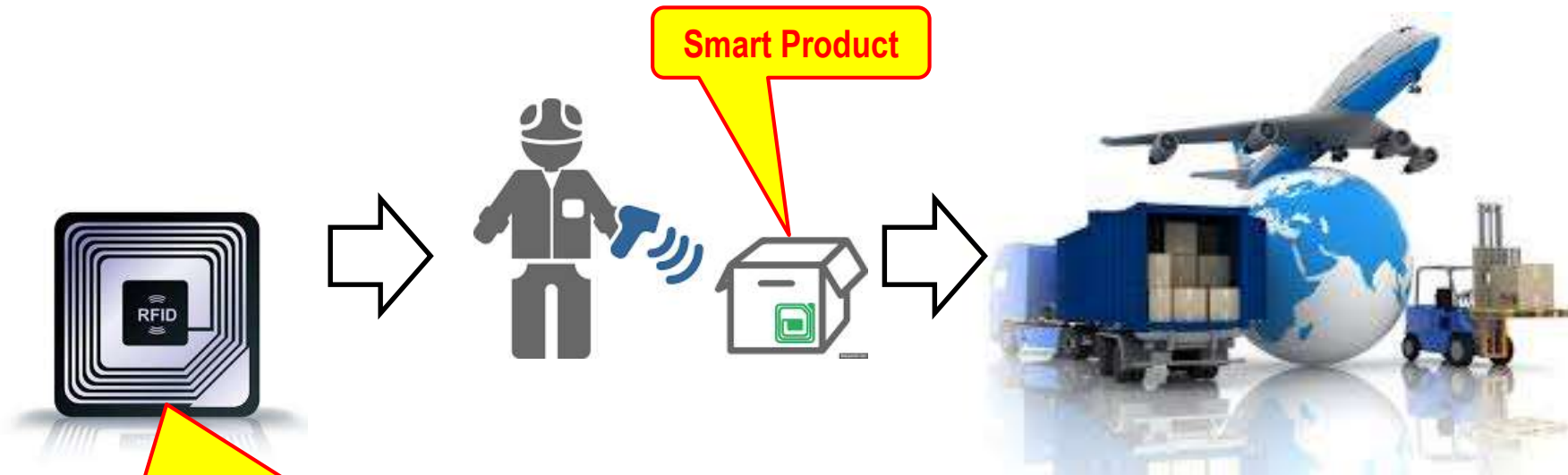
Smart drones



Smart printers

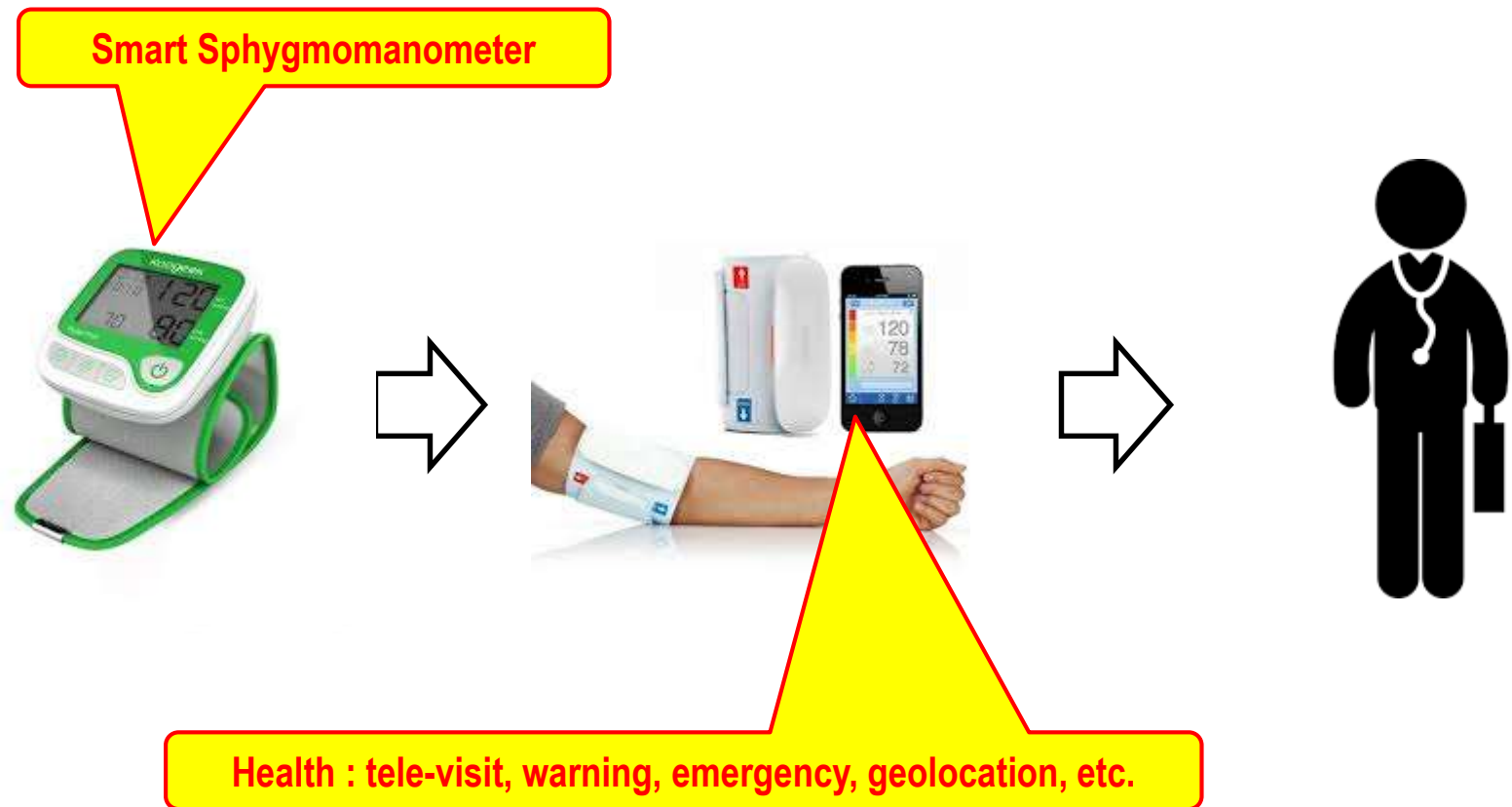


- Internet of Things (IoT)



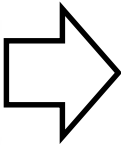
Logistics : Tracking, smart manufacturing, optimization

- Internet of Things (IoT)



■ Internet of Things (IoT)

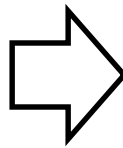
Smart car



Road safety: study of roads, traffic, tracking, verbalization, etc.

■ Internet of Things (IoT)

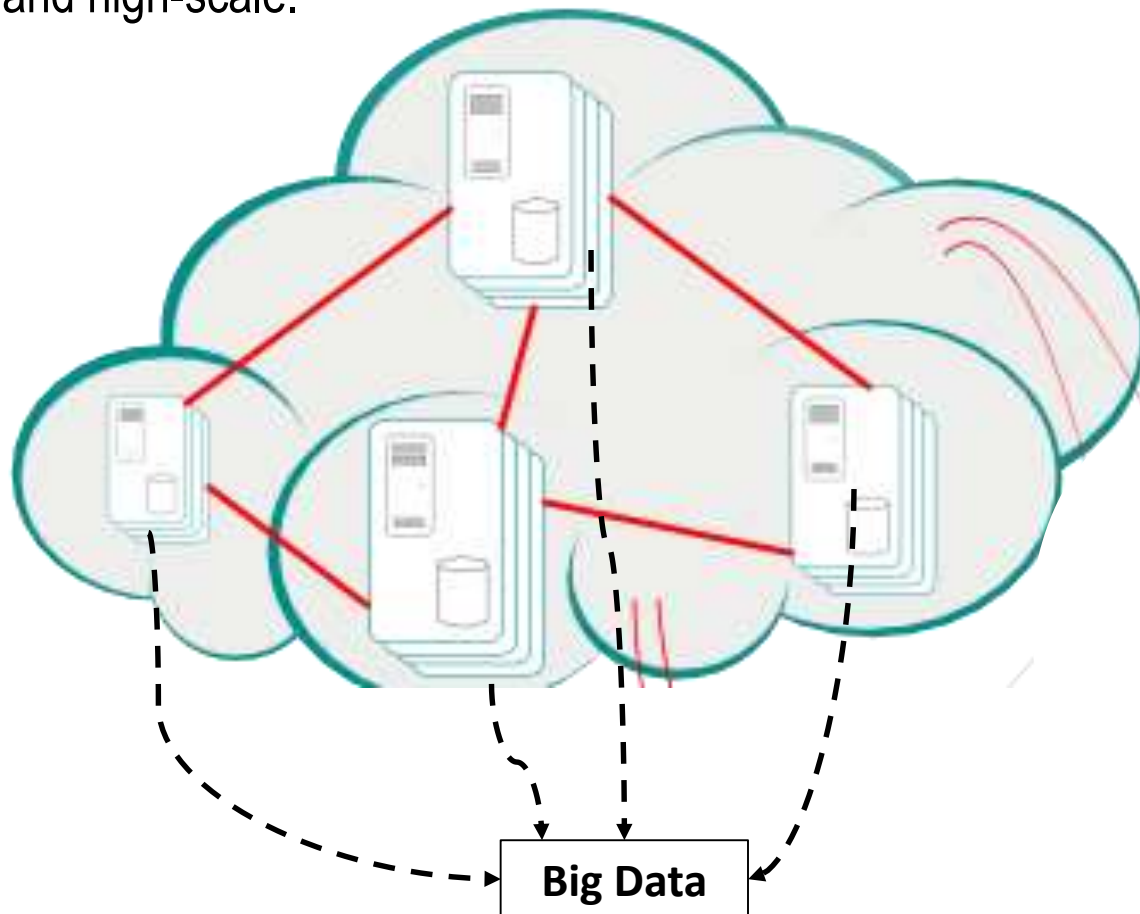
Smart thermometer



Meteorology: localized forecasting, weather risk prevention, weather warnings, etc.

■ Cloud/Grid Computing

Computer resources that are located anywhere with access over Internet and processing Data and information in a distributed mode. They provide sharing, archiving, and high-scale.



■ Data Storage

Storage infrastructure dedicated to save, protect, manage, recover, archives, alter, delete, and retrieve records of Data.



Storage Disks

■ Data Base

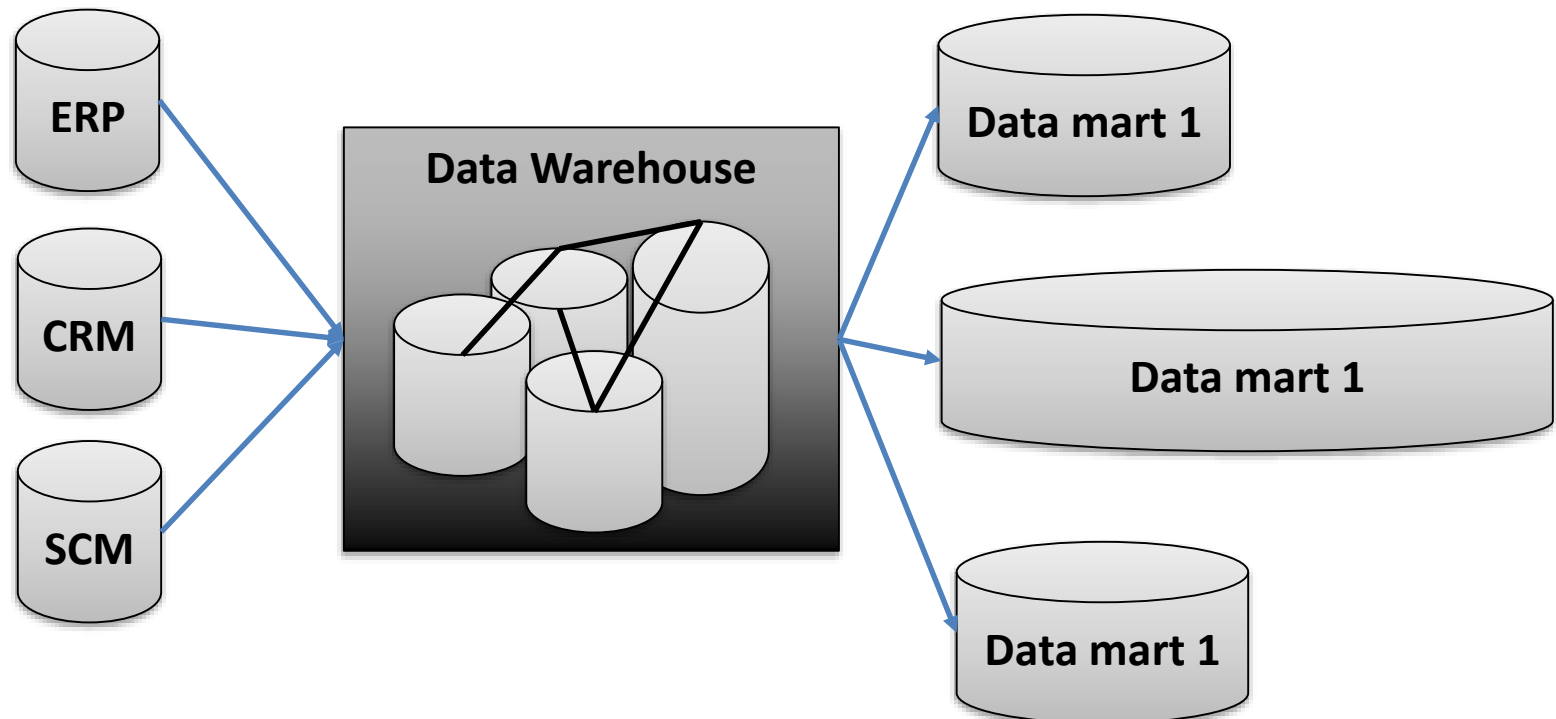
SQL and especially NoSQL Data Bases like **MongoDB**, **Cassandra** ou **Redis**.



■ Data Warehouse

Repository of Data (set of connected storages) regarding an organization in order to feed Data Marts usually used for Business Intelligence applications for reporting, dashboards, and decision making.

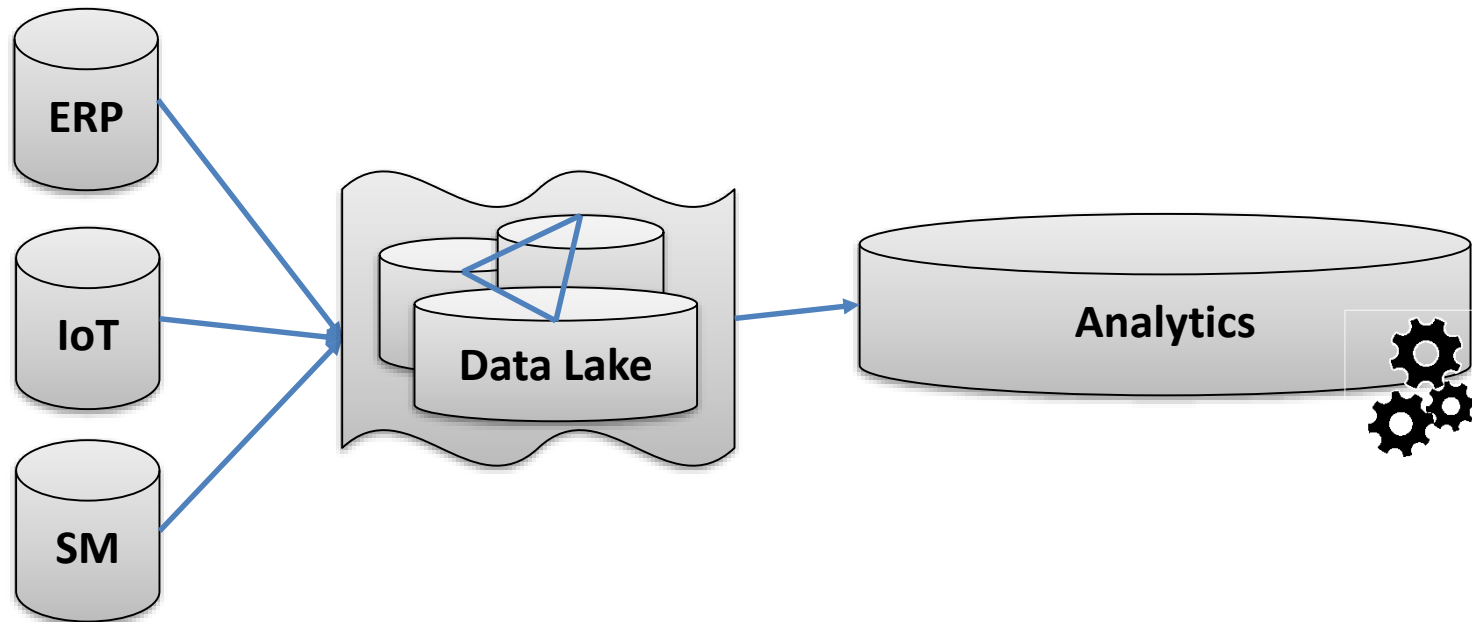
- Data sources are usually transactional like ERP, CRM, SCM, etc.
- Data are structured.
- Data are stored in formatted models (records and rows).



■ Data Lake

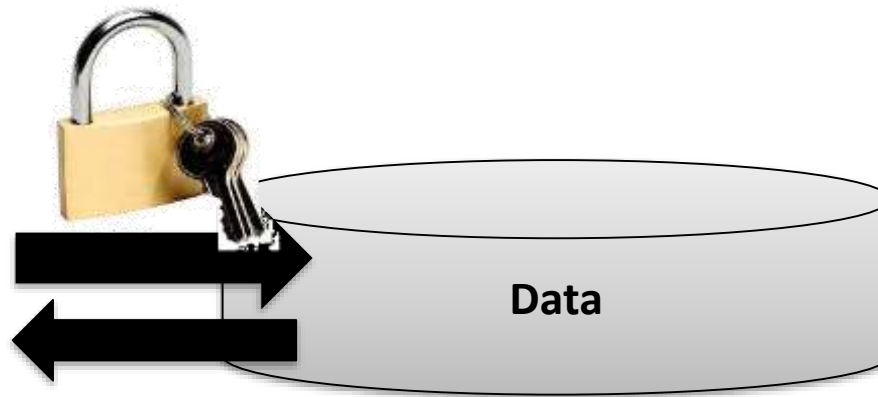
A centralized architecture of one or more repositories of Data that are not related to one organization in order to feed Data Analytics (for processing).

- Data sources are multiple
- Data are structured and unstructured
- Data are stored in unformatted models.



■ Data Security

It is the set of methods and tools that aim to protect electronic privacy of people and enterprises against illegal access to Data from malicious uses.



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■ Concept

Analytics denotes the set of methods, techniques, heuristics, and processes of analyzing data in order to find valuable information by:

- Revealing **hidden pattern**,
- Finding **connections** between concepts,

With this, businesses may take better/more accurate decisions.



■ Types

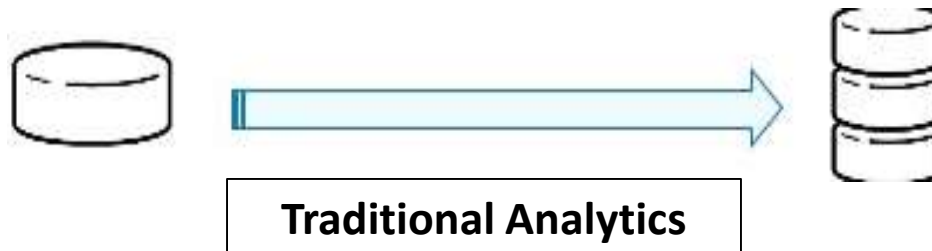
In Business, there are 2 generations of Analytics :

- **Traditional Analytics:** The set of common tools of analytics that use the data in a surface as to try understanding what is going on, what is the best result, what was the set best strategy, and so forth. This kind of Analytics does not need complex methods but common practices.

Examples: Excel, Oracle, ERP, etc.

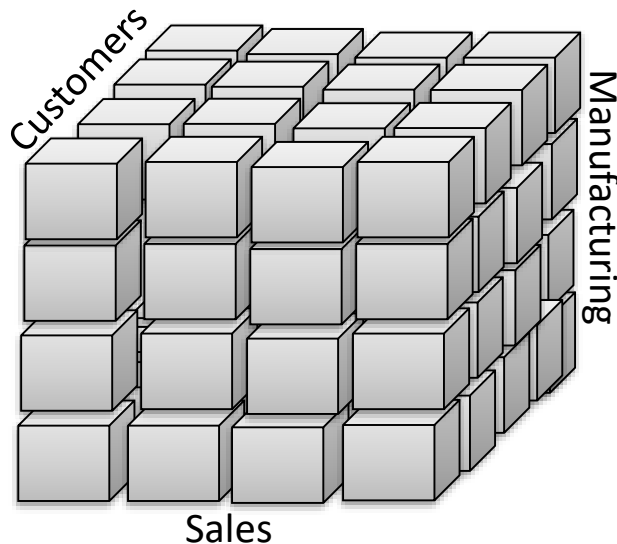
- **Advanced Analytics:** Some traditional tools cannot process the huge volumes of Data, so more complex methods are available in statistics, mathematics, artificial intelligence, etc.

Example of volumes where Excel can't exceed thousands of rows



■ Traditional Analytics

- **Business Intelligence (BI)** : tools that allow business to accumulate data from internal and external sources in order to provide dashboards, and reporting for management
- **OnLine Analytical Processing (OLAP)**: tool that allows users to selectively query data from different views dynamically.



OnLine Analytical Processing (OLAP)



Business Intelligence (BI)

■ Business Intelligence (BI)

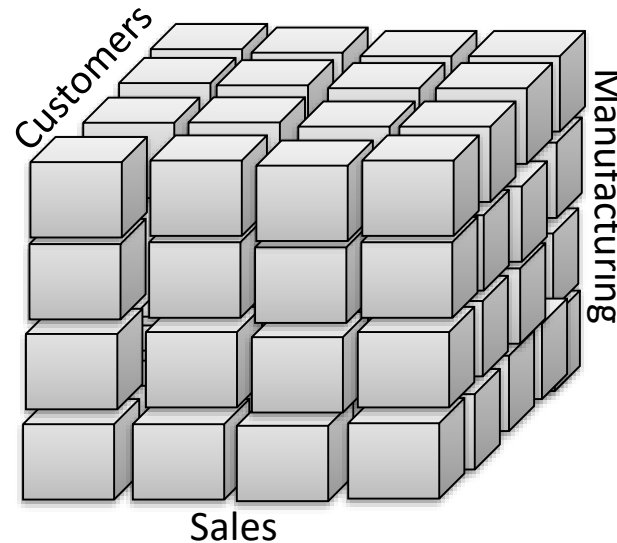
Tools that allow business to accumulate data from internal and external sources in order to provide dashboards, and reporting for management



Business Intelligence (BI)

■ OnLine Analytical Pricessing (OLAP)

Tool that allows users to selectively query data from different views dynamlically.



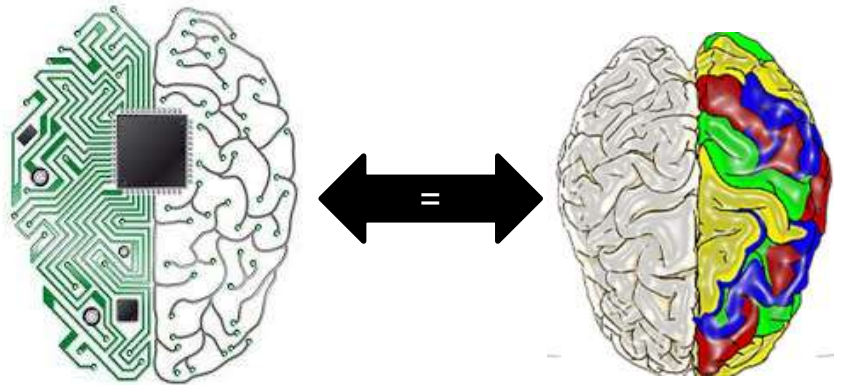
OnLine Analytical Processing (OLAP)

■ Advanced Analytics

- **Artificial Intelligence** : Any machine that observes the environment and decides automatically (through algorithms) to productively accomplishing goals.
- **Data Mining**: The set of approaches that allow identifying patterns in a set of Data. Meaningful information are extracted.



Data Mining



Artificial Intelligence

■ **Applicative Exercise 2**

Duration : 60min. Group Work. Score: 1.0

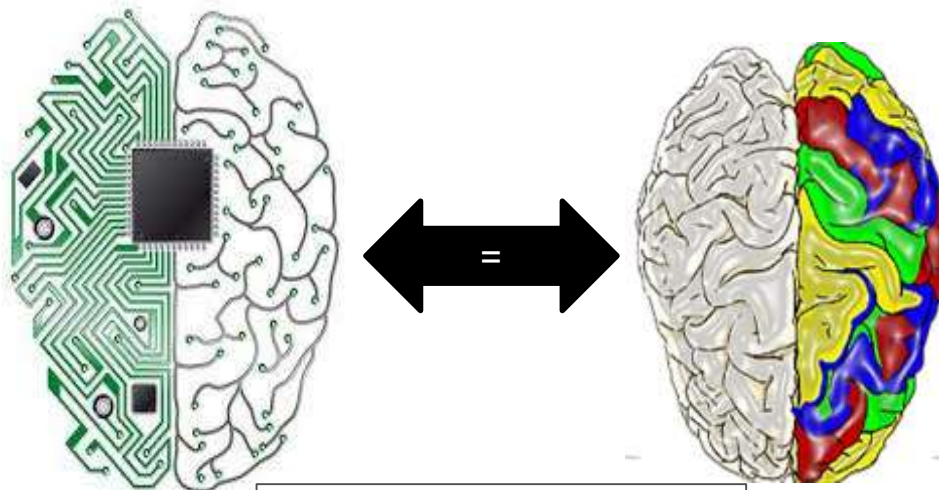
Context

Try to list more than 10 Companies that are specialized in Big Data Solutions for enterprises, with a brief description of each one, the names of the proposed products (software) and/or services (IT providing), and creation data of the activity.

Try to illustrate the evolution (history) of creation by dates and the number of companies by year in one chart.
What do you have as result ?

■ Artificial Intelligence

- **Reasoning:** By rules, logic, deductions, generalization, etc.
- **Knowledge representation:** by gathering commonsense objects.
- **Multi Agent Intelligence:** by planning in a shared and parallel way for the same goals
- **Machine Learning:** algorithms that try to learn from experience to improve the present and future.
- **Natural Language Processing:** methods that allow the machine understanding the human language
- **Social Intelligence:** methods that allow the machine (usually set of machines) to bypass the numeric intelligence and introduce the emotional and behavioral intelligence.
- And many other types and sub-types.



Artificial Intelligence

■ Data Mining

- Is the set of tools that aim to find hidden patterns and relationships between Data and information to answer one or more issues for an enterprise. These issues can be prediction of actions or decision making.



Data Mining

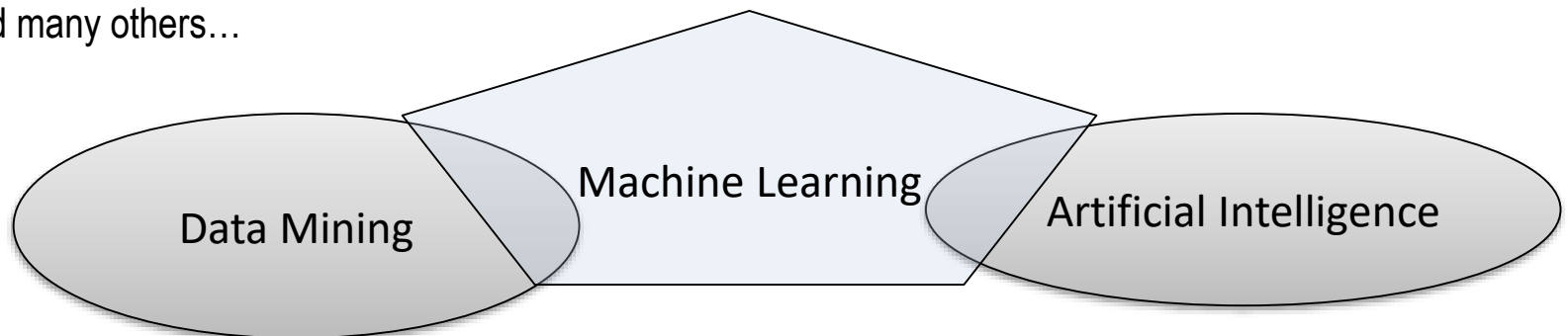
■ Machine Learning

The set of computational methods that automate the acquisition of knowledge from experience.

In Enterprises application, Machine Learning uses Statistics, Mathematics, Computer Science, and Graphs Theory in engineering tasks related to business. This provides unseen patterns and diminish irregularities in human errors

Applications in management can be:

- Stock prediction,
- Accounting accuracy,
- Insurance Fraud detection,
- Bankruptcy prediction,
- Risk Prediction,
- Business Process Improvement,
- And many others...



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■ Concept



Big Data

Data Acquisition
Data Storage

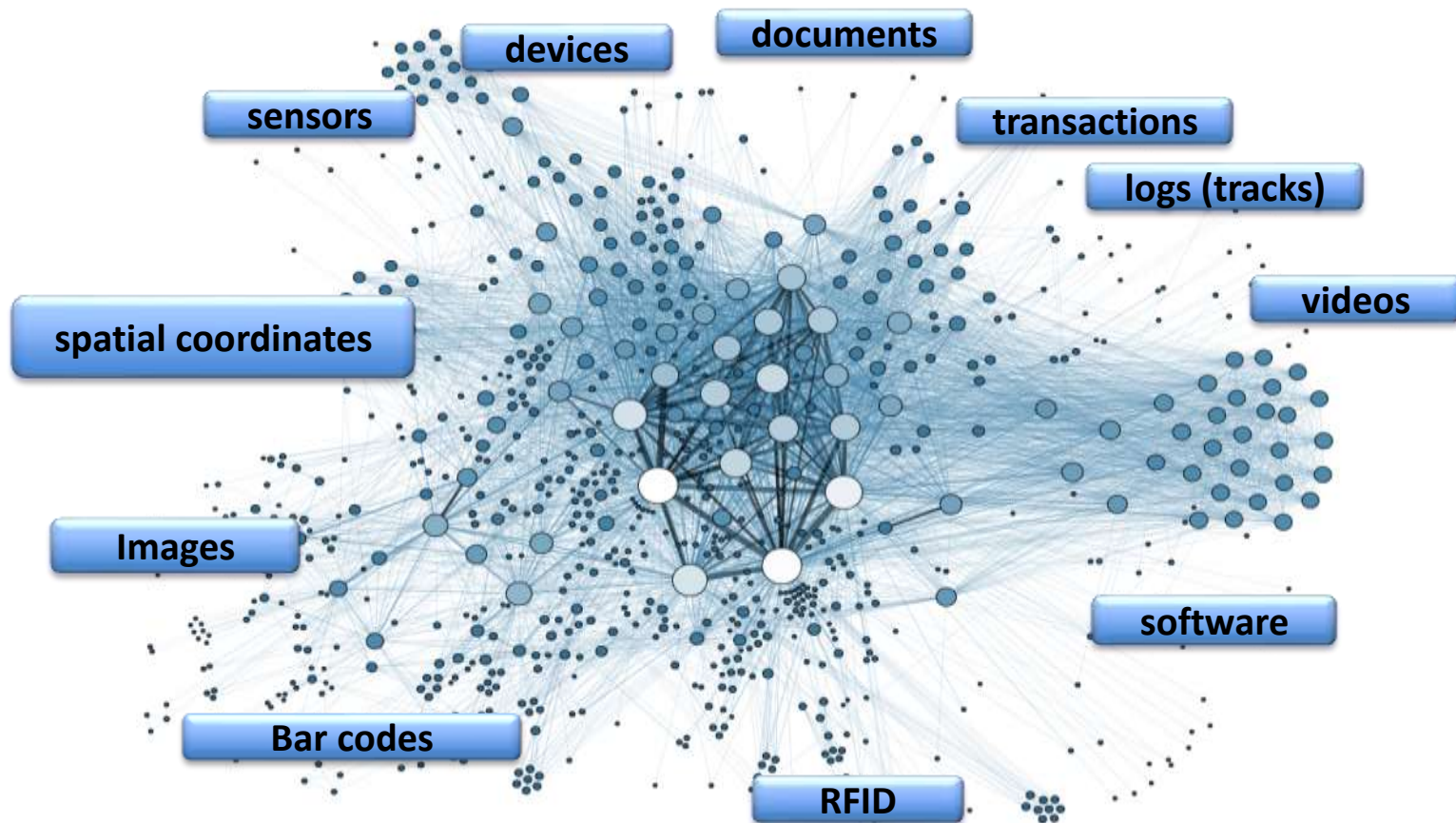
Analytics

Data Analysis
Data Quality
Data Visualization
Business Intelligence (BI)
OLAP (Online Analytical Processing)
Machine Learning (ML)
AI (Artificial Intelligence)

Big Data Analytics

■ Concept

A wide cloud of data in dynamic flows.



■ Concept

A wide cloud of data in dynamic flows.



In order to take advantage of these huge Data and understand them

↓

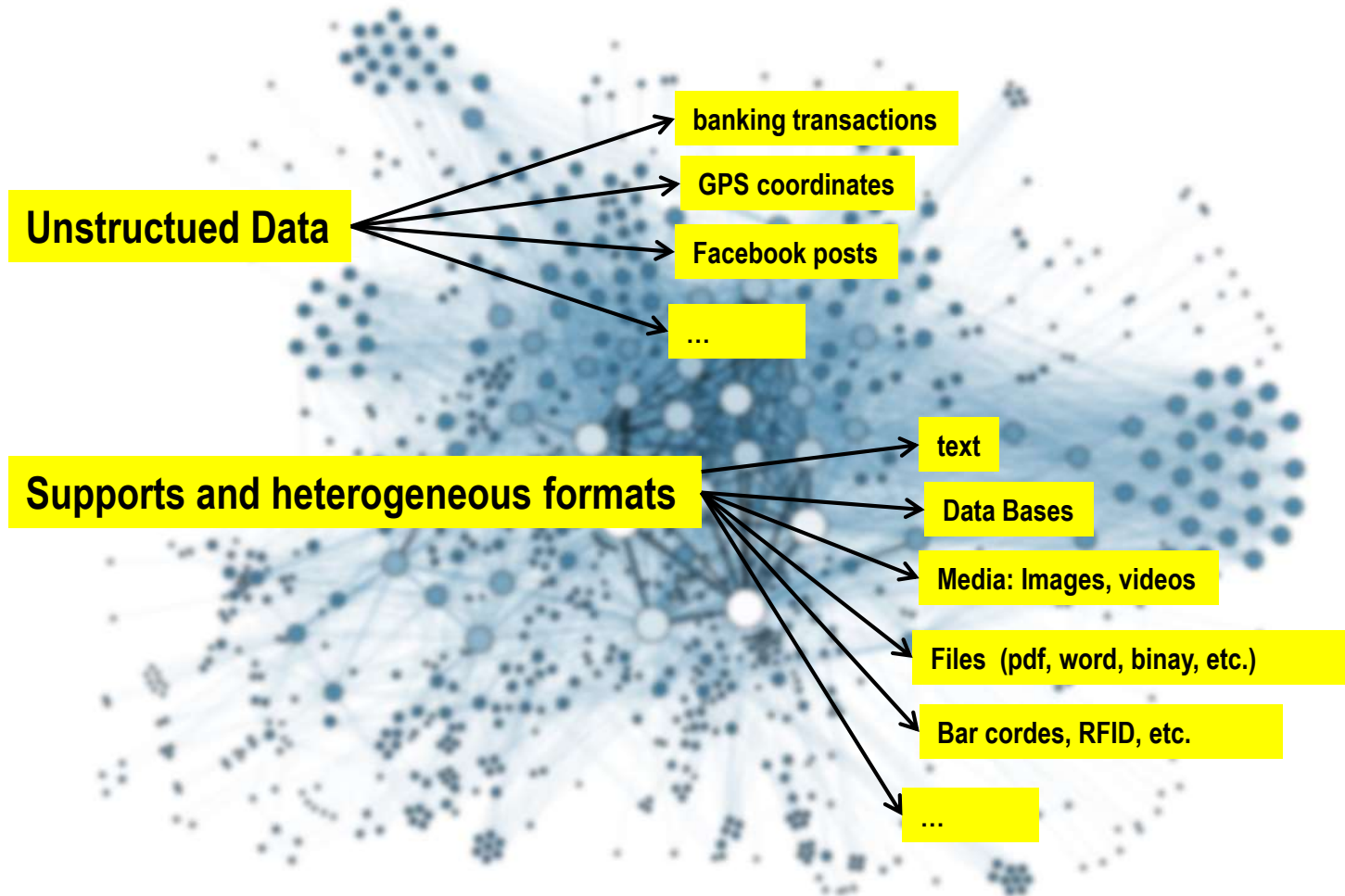
We have to read them, to classify them, to explore them

↓

BUT...!

■ Concept

A wide cloud of data in dynamic flows.



■ Concept

A wide cloud of data in dynamic flows.



Diversity in Data sets makes the mining complex by humans and even by machines !

Hence the use of advanced methods to mine

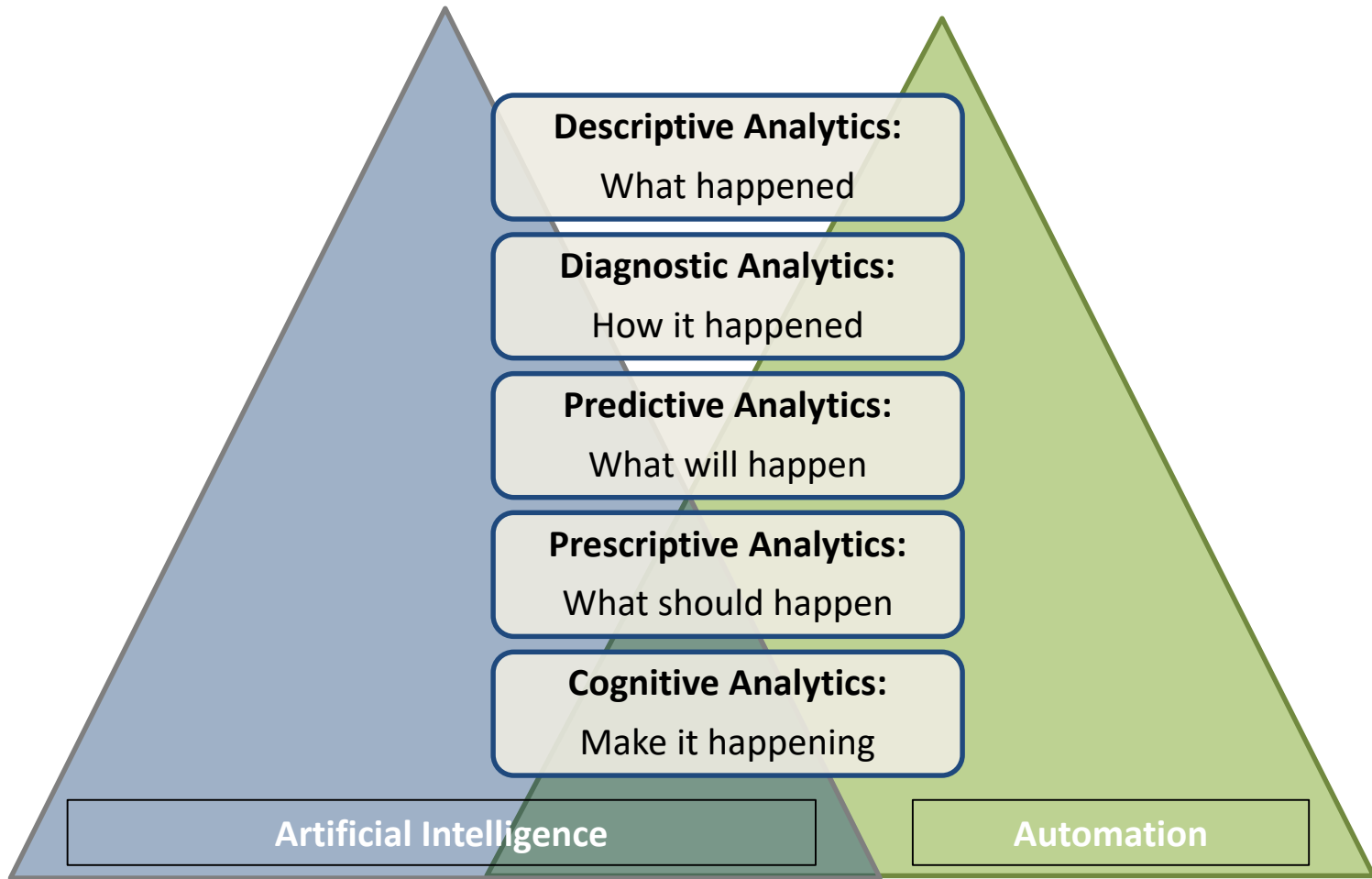
All of these methods constitute the BIG DATA ANALYTICS

■ Concept

Big Data Analytics are the set of tools that aim to process the stored Big Data in order to :

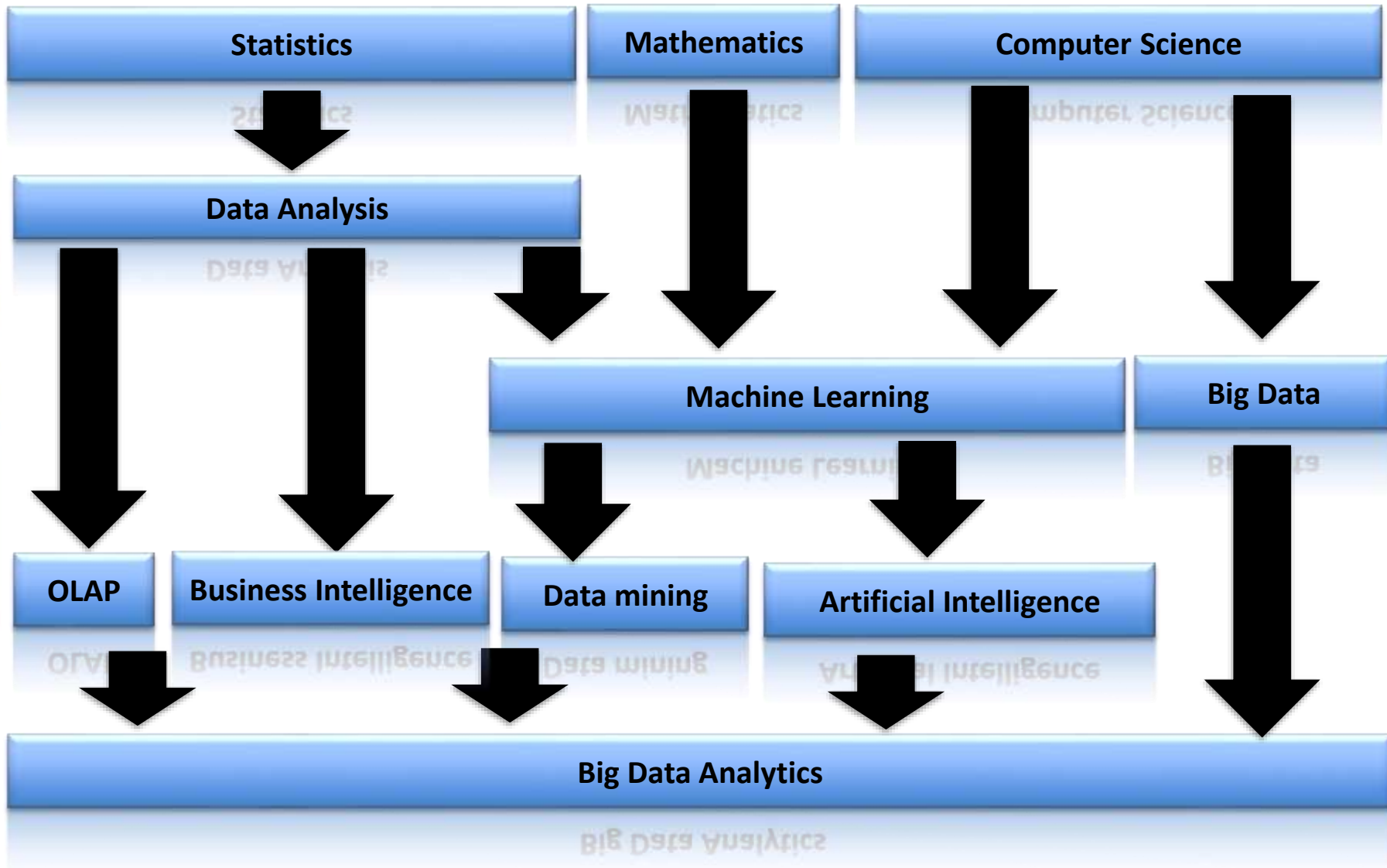
- **Reveal hidden** patterns,
- **Discover unknown** correlations,
- **Forecasting** market trends,
- **Finding** customer preferences,
- **Accurating** forecastings,
- **Unconvering** unexpected information and knowledge.
- ...

■ Role



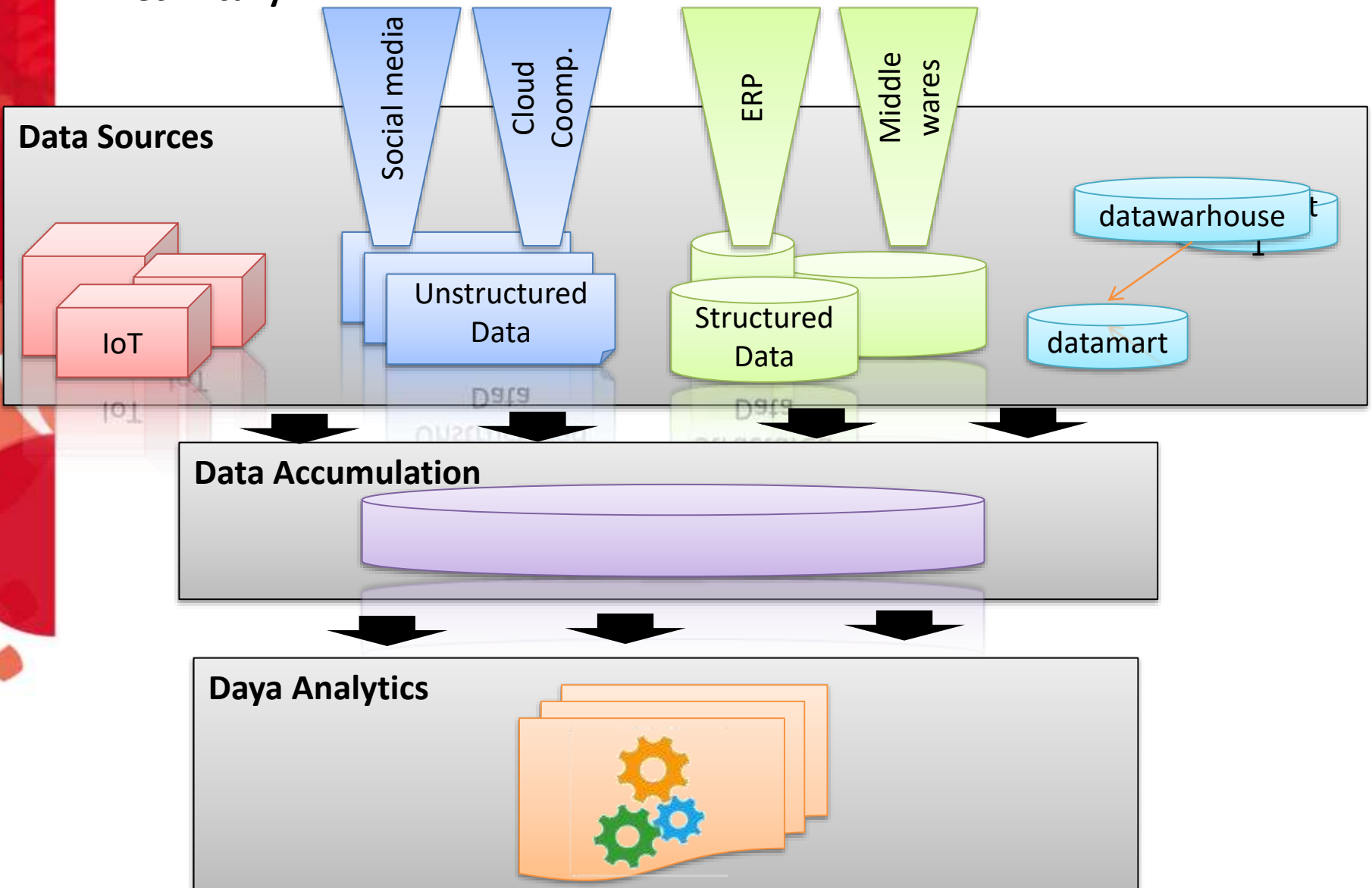
Big Data Analytics → As a field

■ As a field



Big Data Analytics → Technically

Technically



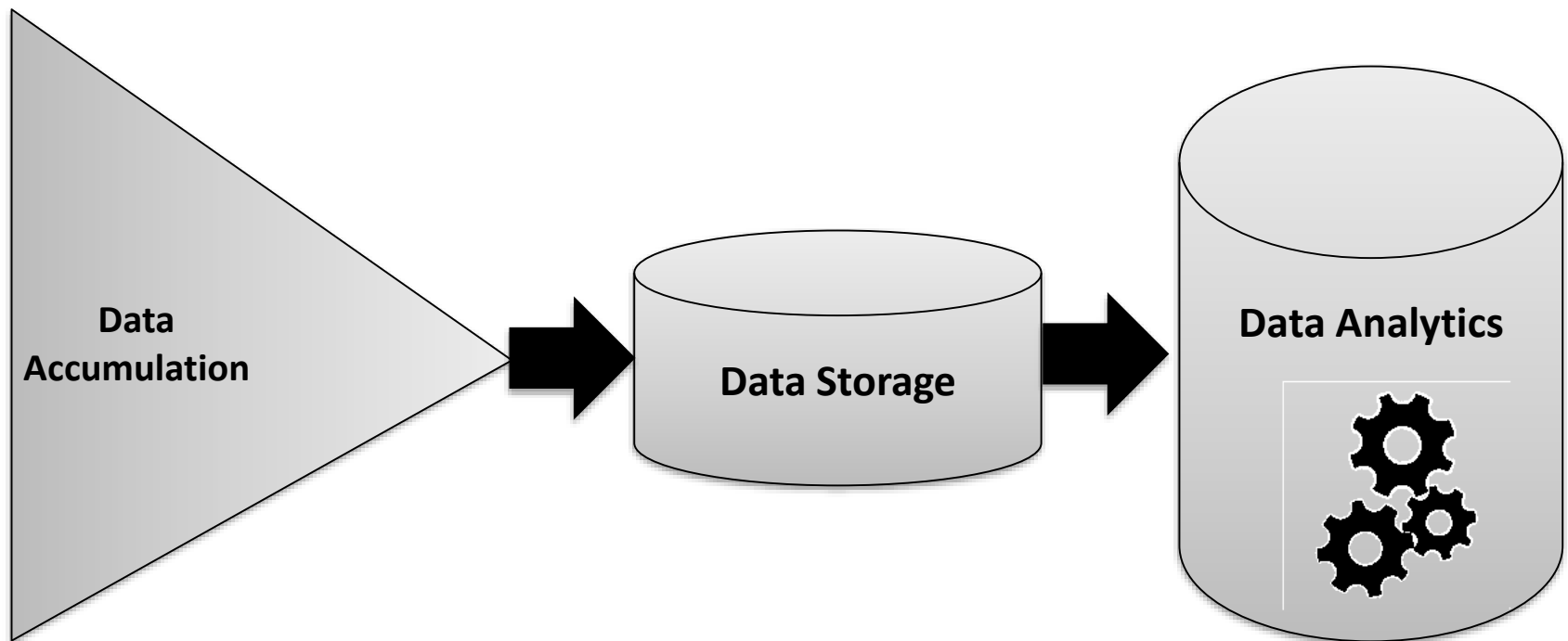
■ Applicative Exercise 3

Group work. Duration 1 week. Score 1.0

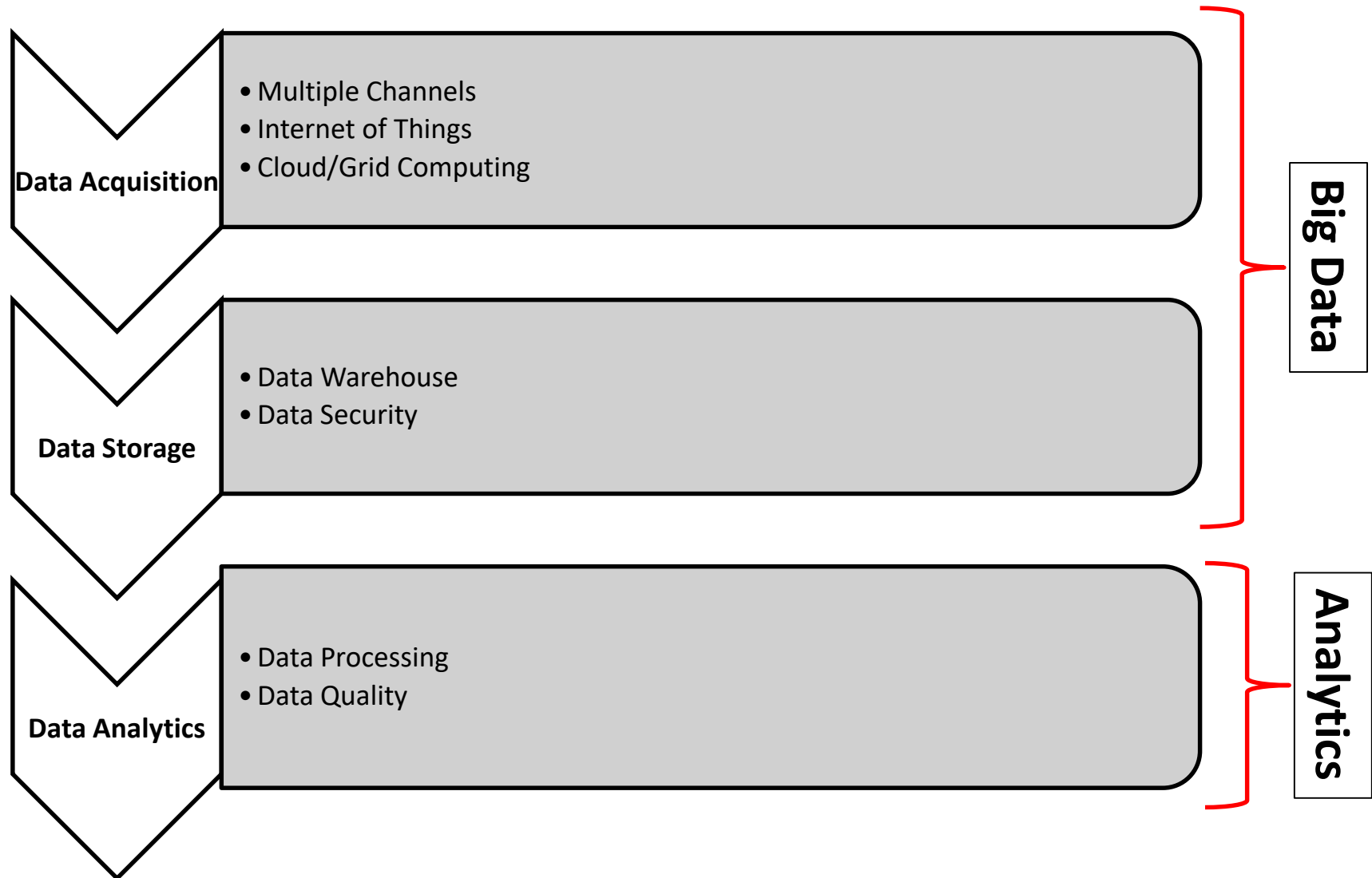
Try to list more than 10 applications of Bid Data Analytics in Management/Business with information about area, concerns, and possible Data sources. For example Segmentation of Customers (finding hidden segments of new customers) in Customer Relationship Management (CRM) as following.

Application	Area	Concern	Data sources
Customers Segmentation	Customer Relationship Management	Helping in opening new markets and/or new market/products opportunities	Data sources: Demographic Data from territories, social media (new population), weater/tourism (seasonable products), etc.

- **Big Data Analytics Life Cycle**



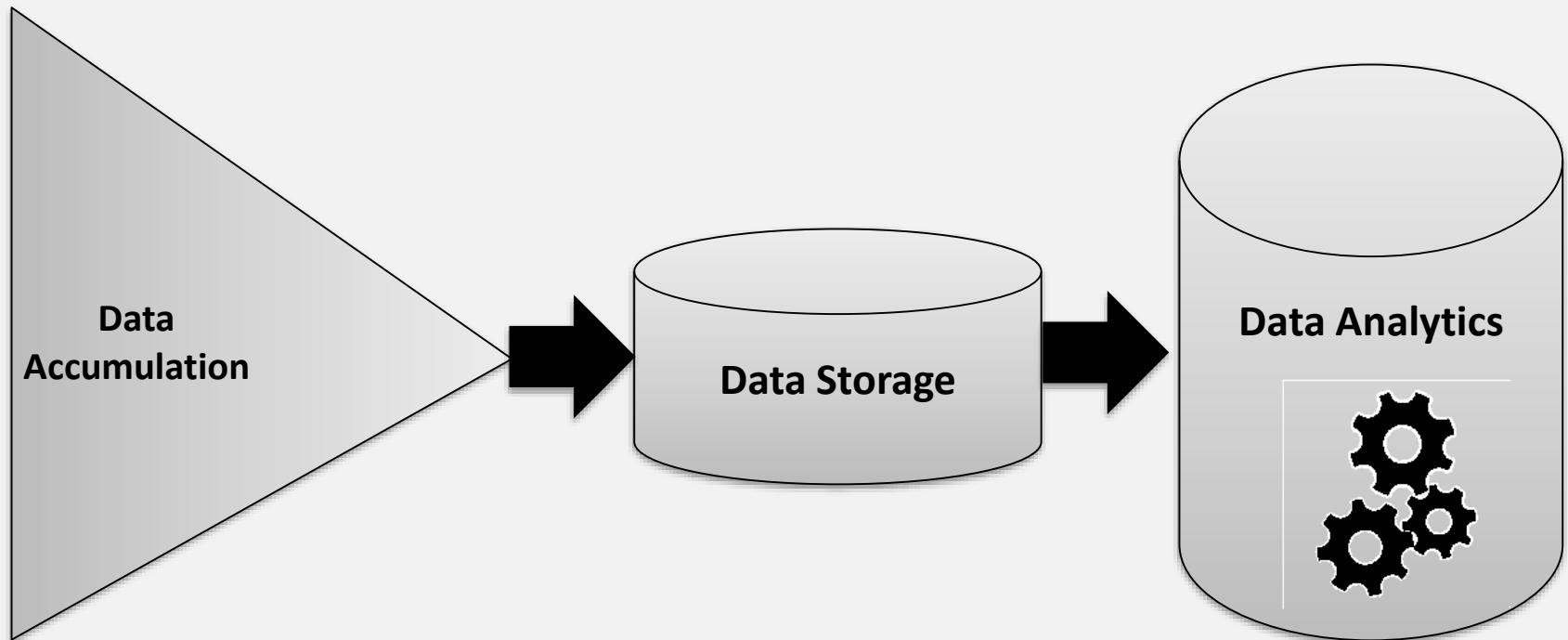
■ Big Data Analytics Life Cycle



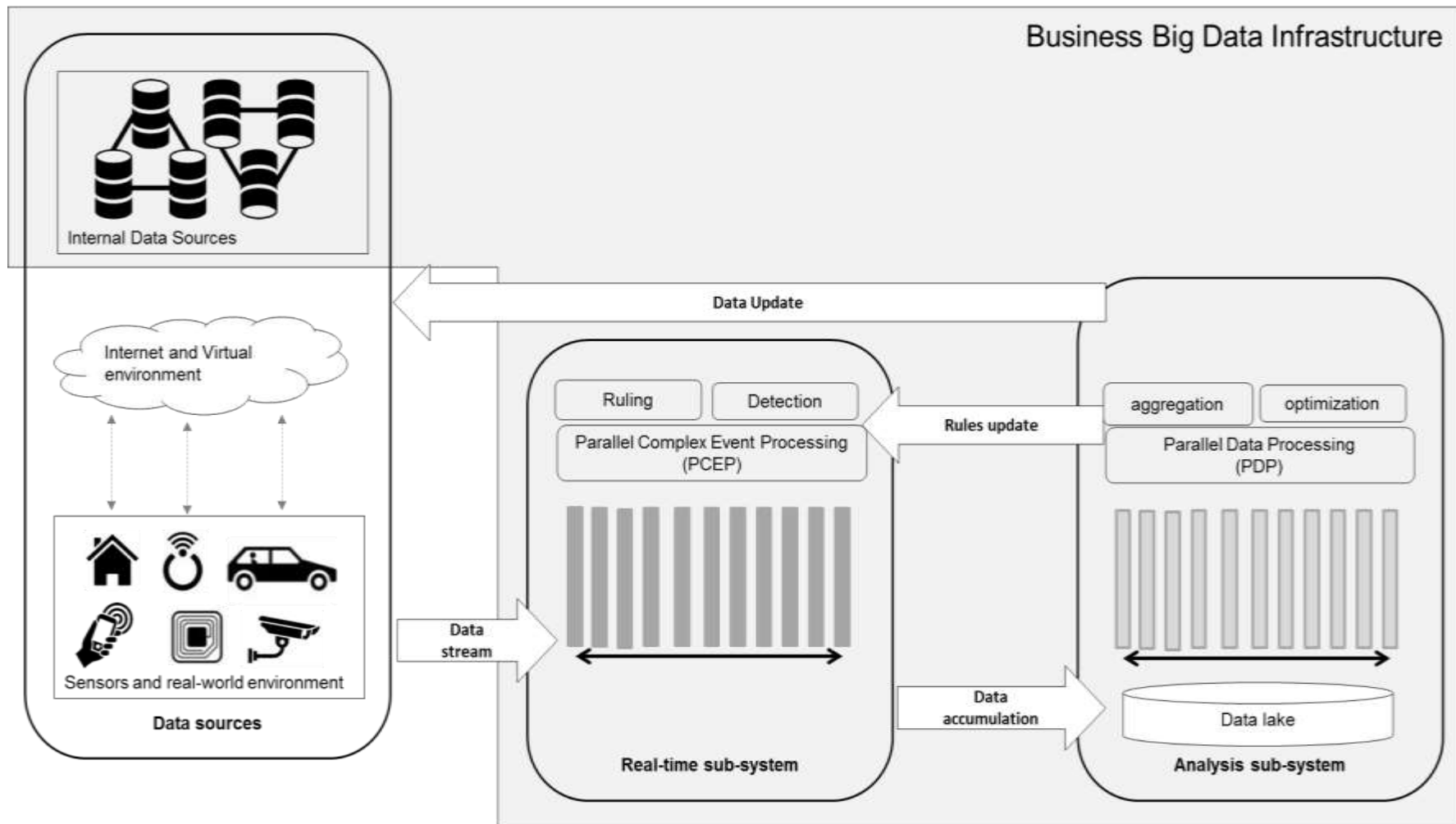
■ Applicative Exercise 4

Individual work. Duration 20min. Score 0.5

Try to find and distinguish between the paradigms '**Data**', '**Information**', and '**knowledge**' in the figure below (Figure Big Data Analytics Life Cycle).



■ Data Processing



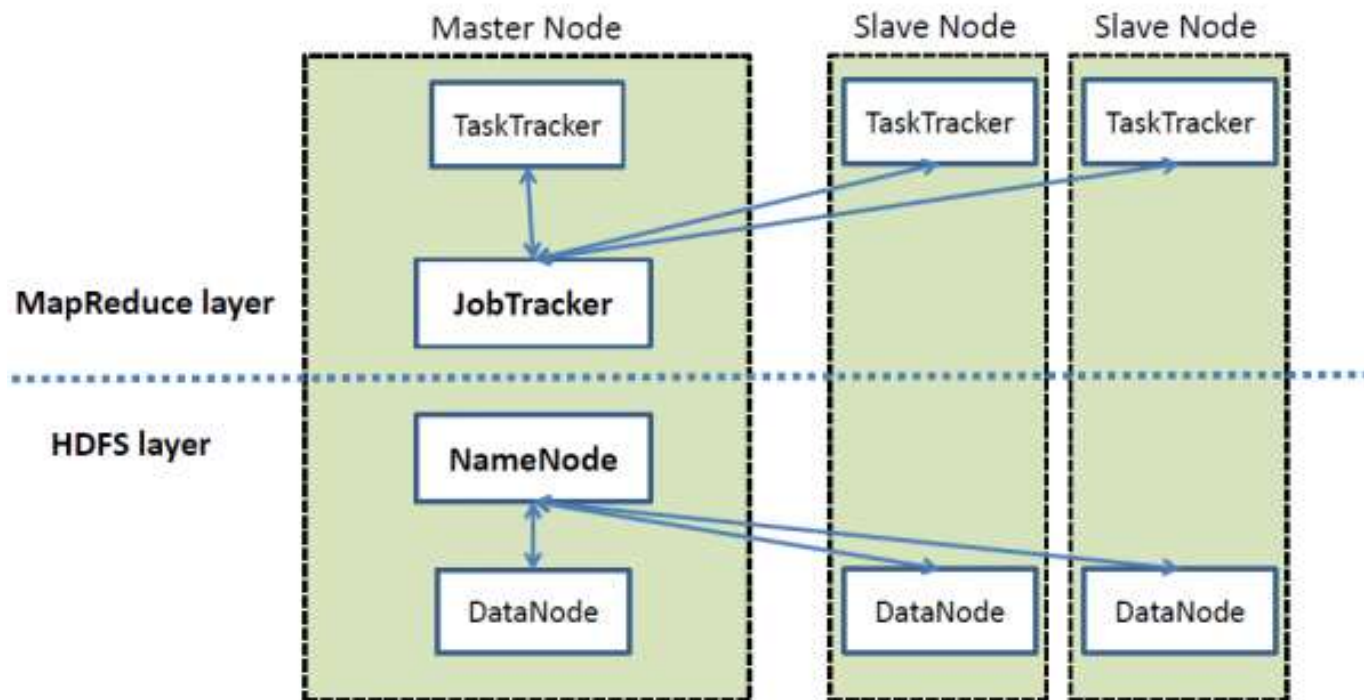
■ Data Processing

A number of frameworks exist for data parallel processing:

- **Spark:** Open-source more adapted for wide assortment of workloads and more powerful in streaming mode.
- **Hadoop MapReduce:** Open-source framework processes Data stored in HDFS format (Hadoop Distributed File System), with an algorithm MapReduce and a combined with the Data Base Hbase. It is more adapted for wide volumes of data and more powerful in batch mode..

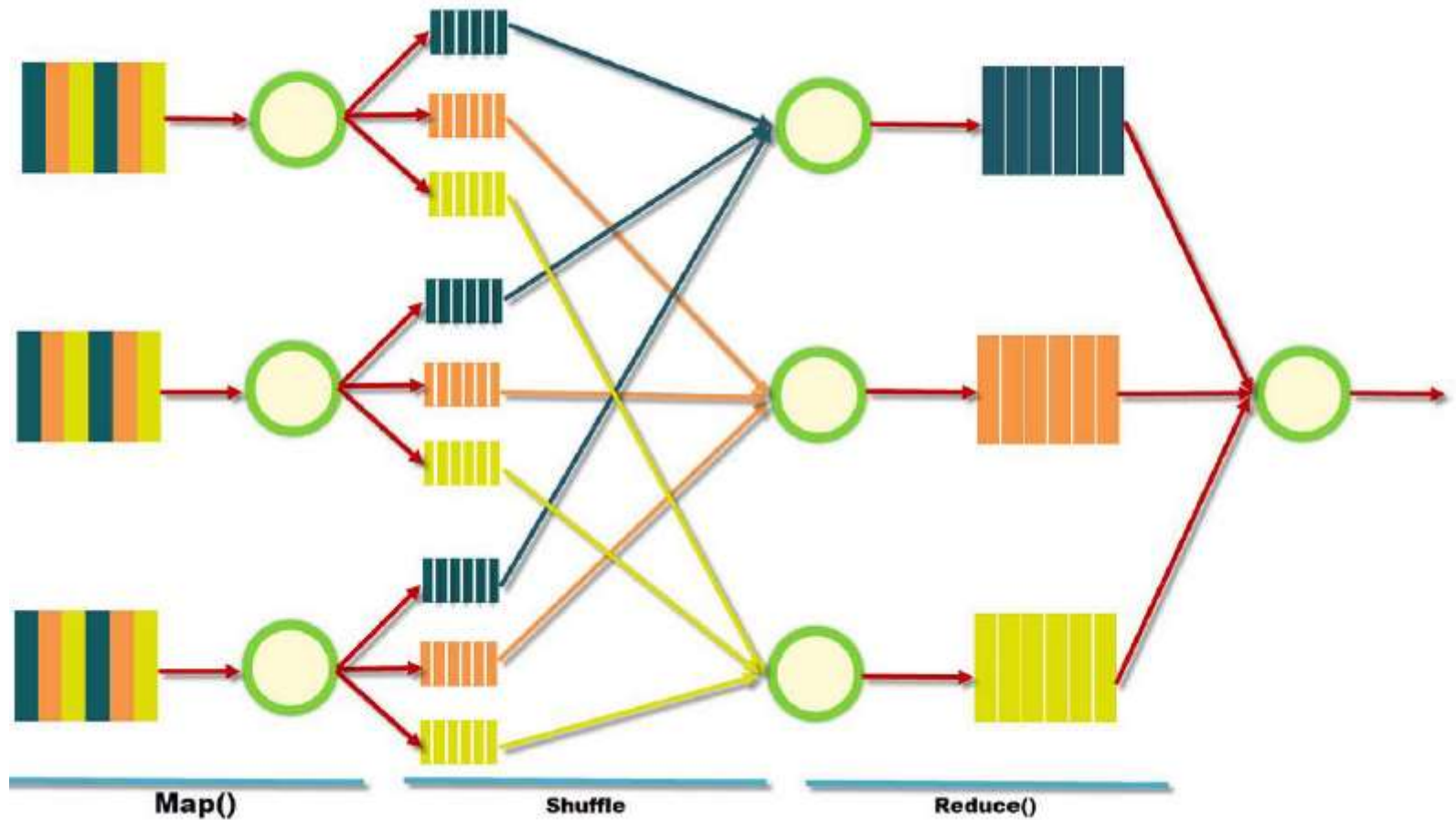


■ Hadoop



Hadoop

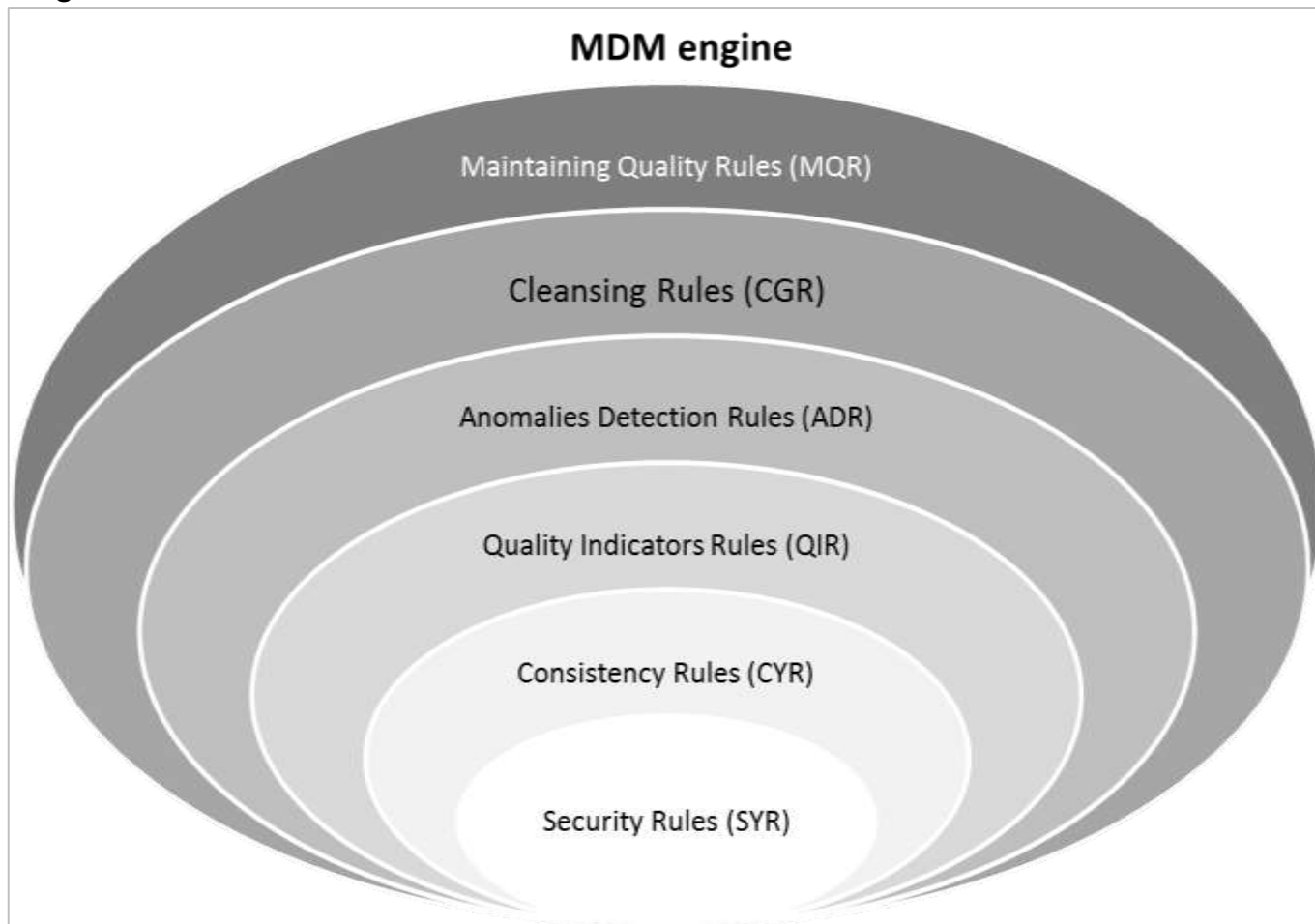
■ MapReduce



MapReduce

■ Data Quality

Is the set of operations for cleansing of Data by improving truthfulness, consistency, compliance, and significance. The management of these operations in the field of Big Data Analytics is called '**Master Data Management**'



Big Data Analytics → Big Data Analytics Project

■ Big Data Analytics Project

Step 1

Identify the context and the objective(ex. Target Marketing)

Etape 2

Aggregate the Data (ex. Buy and open Data flows from FB, and/or Open-Data)

Etape 3

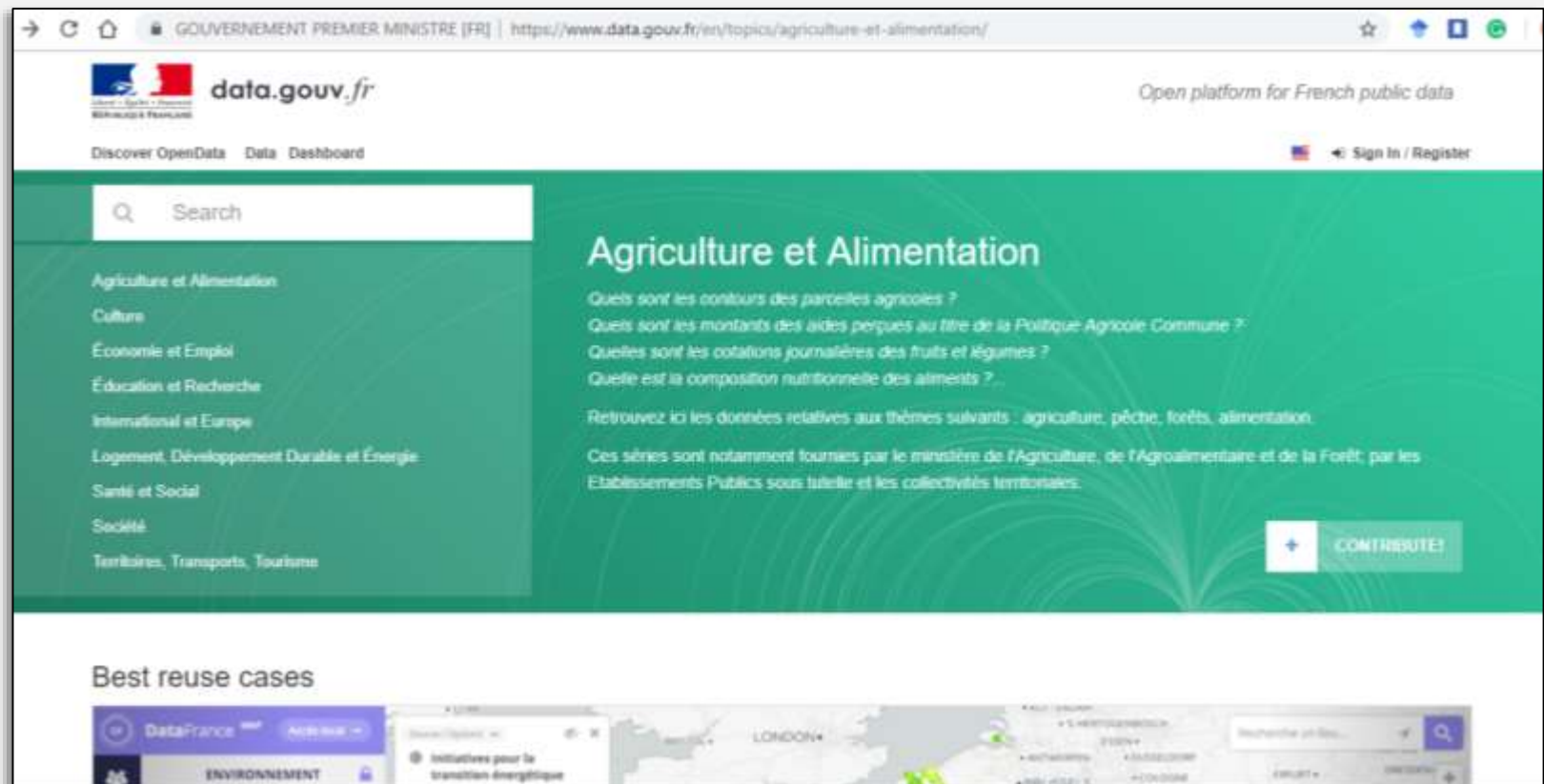
Exploration of the accumulated Data (ex. Hadoop, MapReduce , Cassandra, ..)

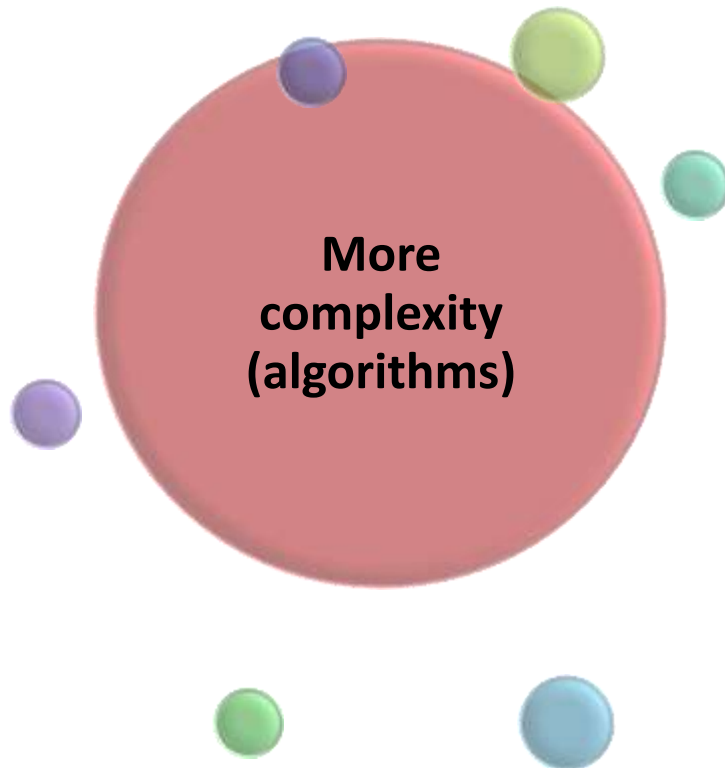
Exploration of the accumulated Data (ex. Hadoop, MapReduce , Cassandra, ..)

Etape 3

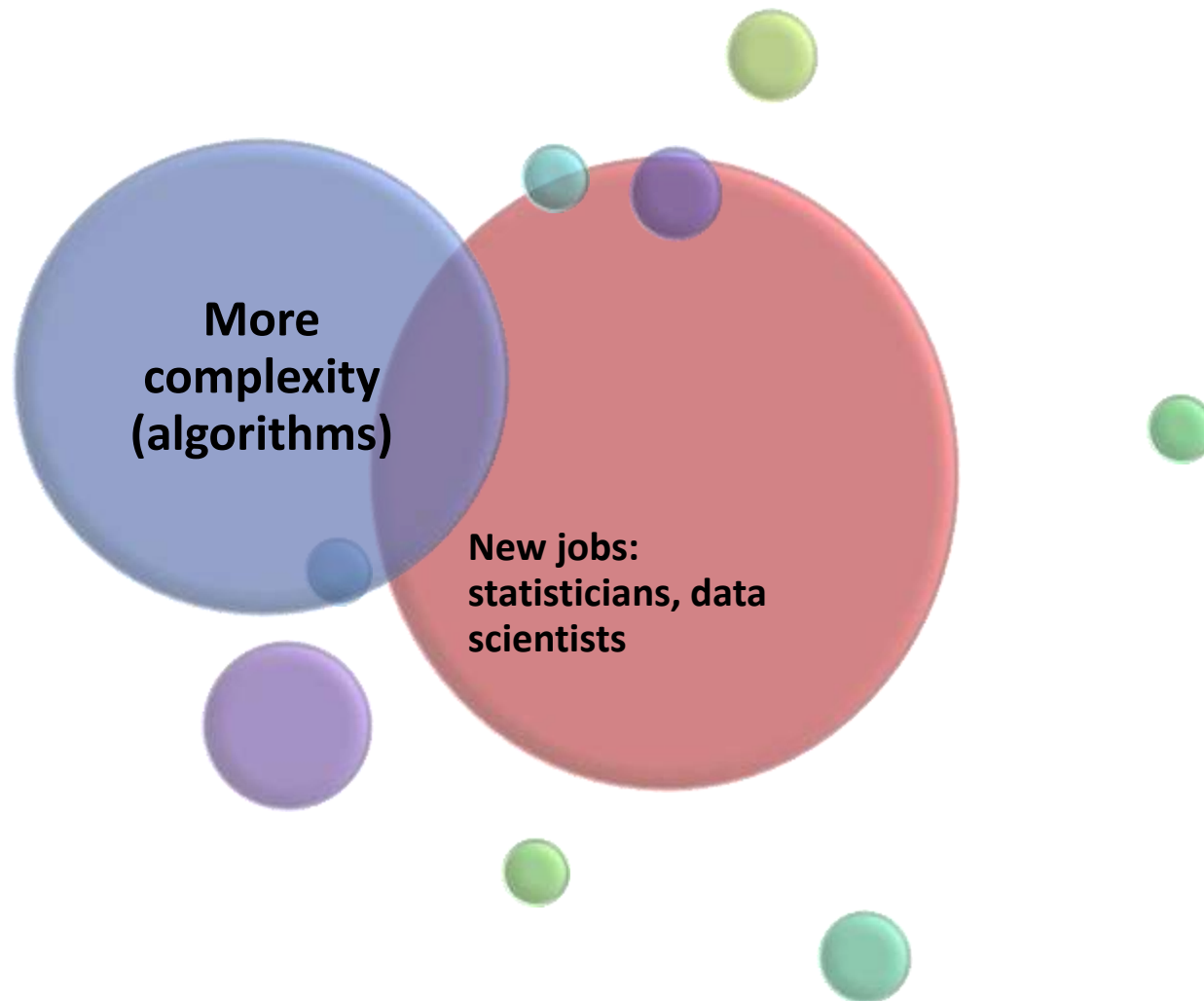
■ Applicative Exercise 5

Try to export an Excel file of Data from the Open Data of French government (ex. agriculture data of Strasbourg) (<https://www.data.gouv.fr/>)

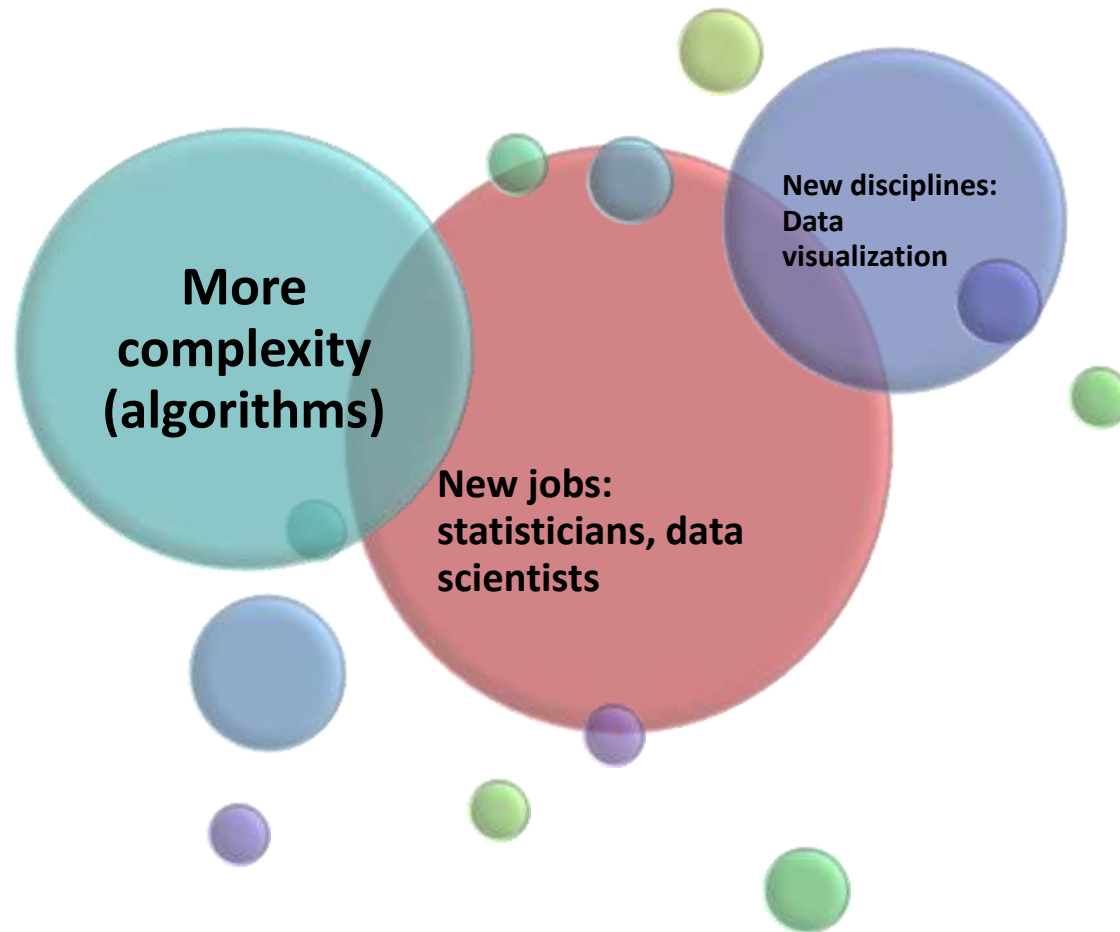




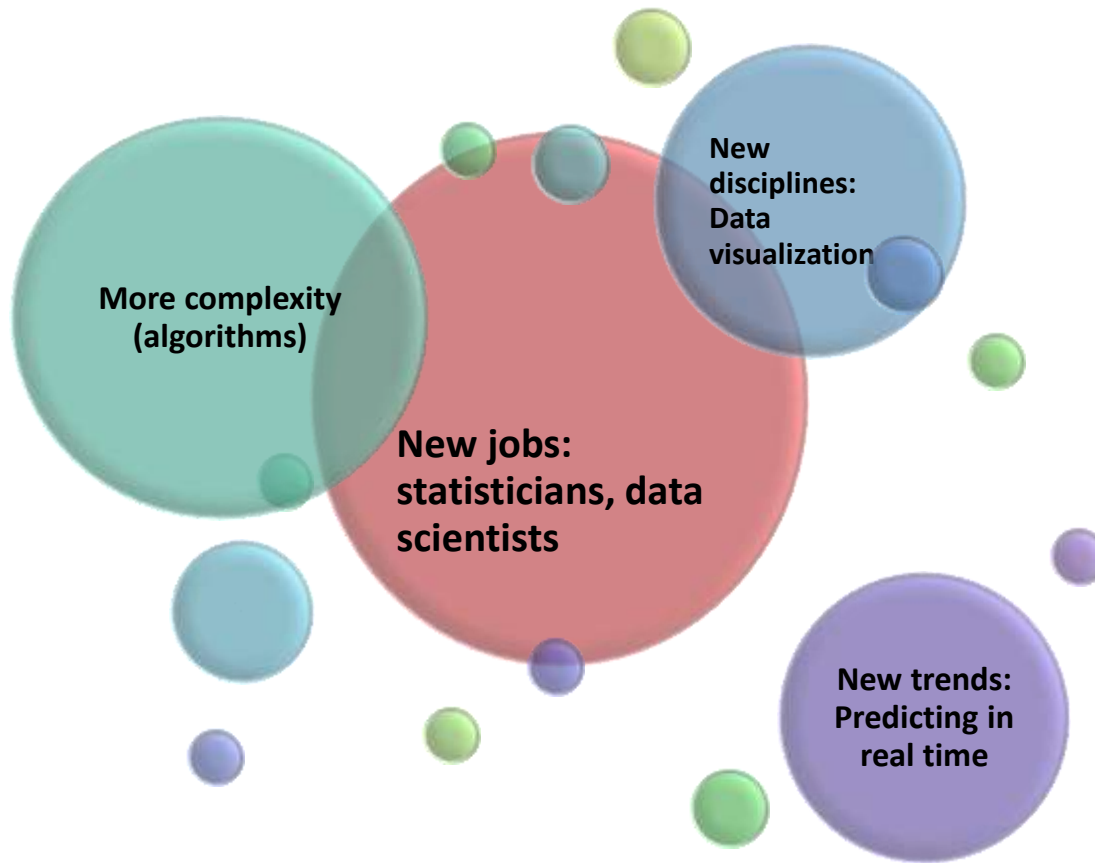
Big Data Analytics → Technological and Social Mutations



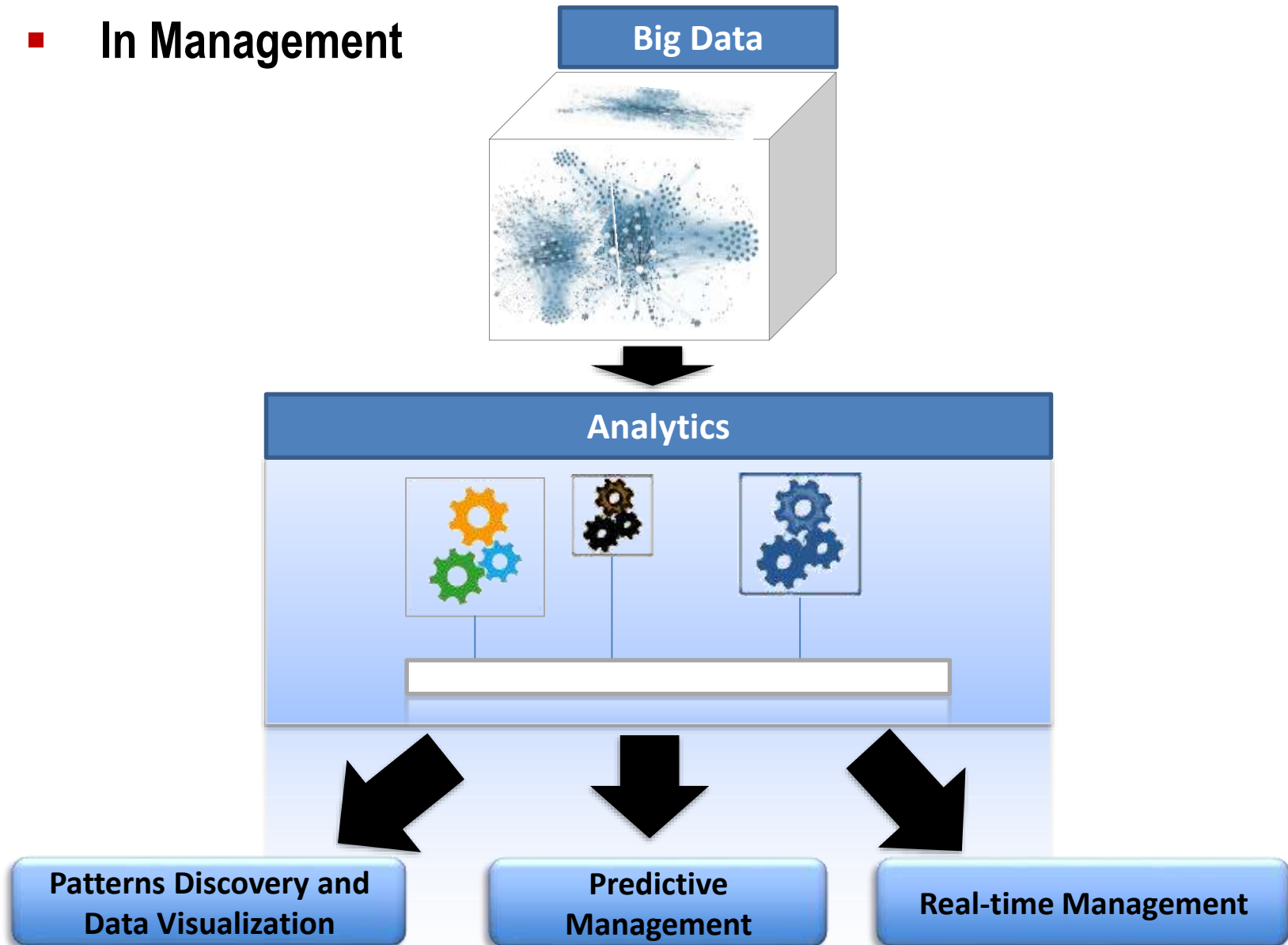
Big Data Analytics → Technological and Social Mutations



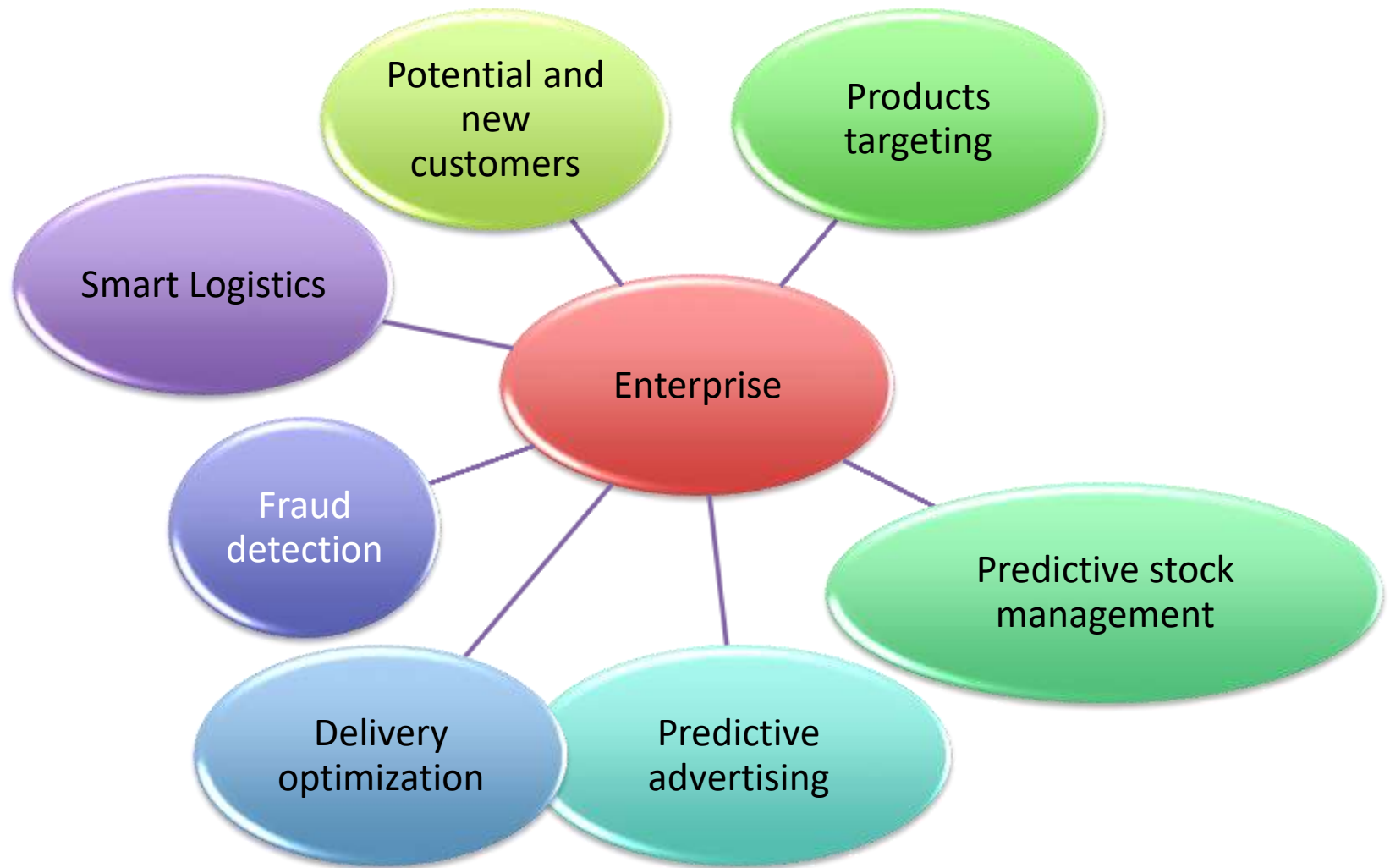
Big Data Analytics → Technological and Social Mutations



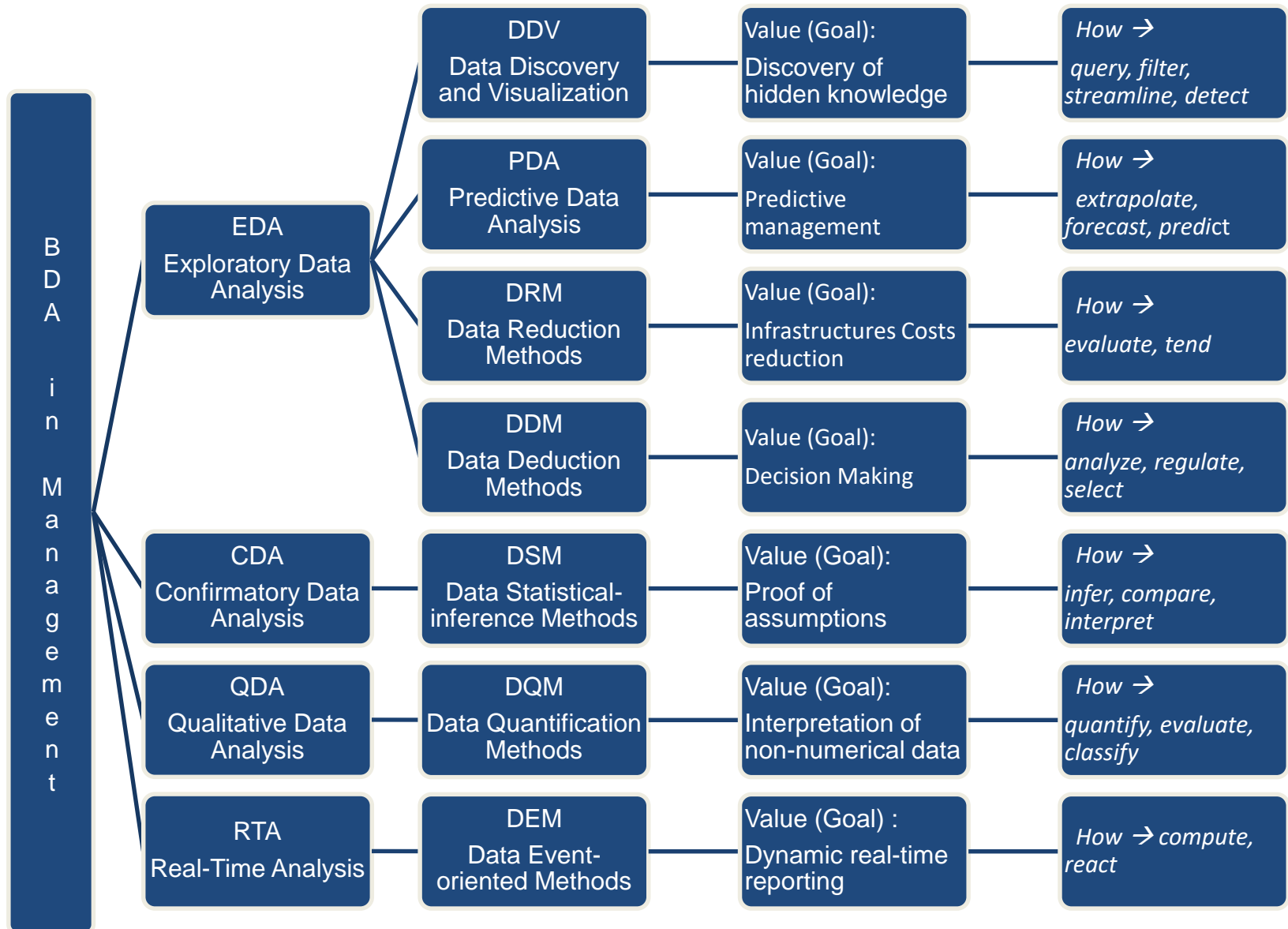
■ In Management



Big Data Analytics → In Management → Applications



Big Data Analytics → In Management → Applications



Before Big Data Analytics

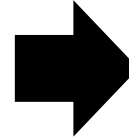
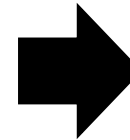
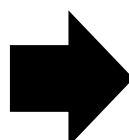
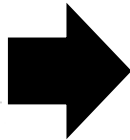
Data from
internal services
and
other
organizations, ...

Data integration

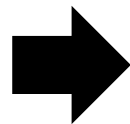
IS (ERP, etc.)

Managers

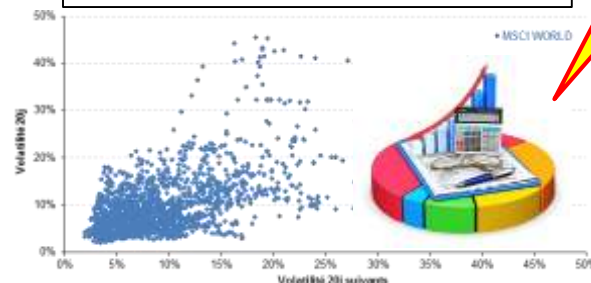
Tools



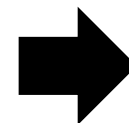
Data from IoT, ERP,
social networks,
smartphones, ..



Proactive/Predictive Tools



Analytics

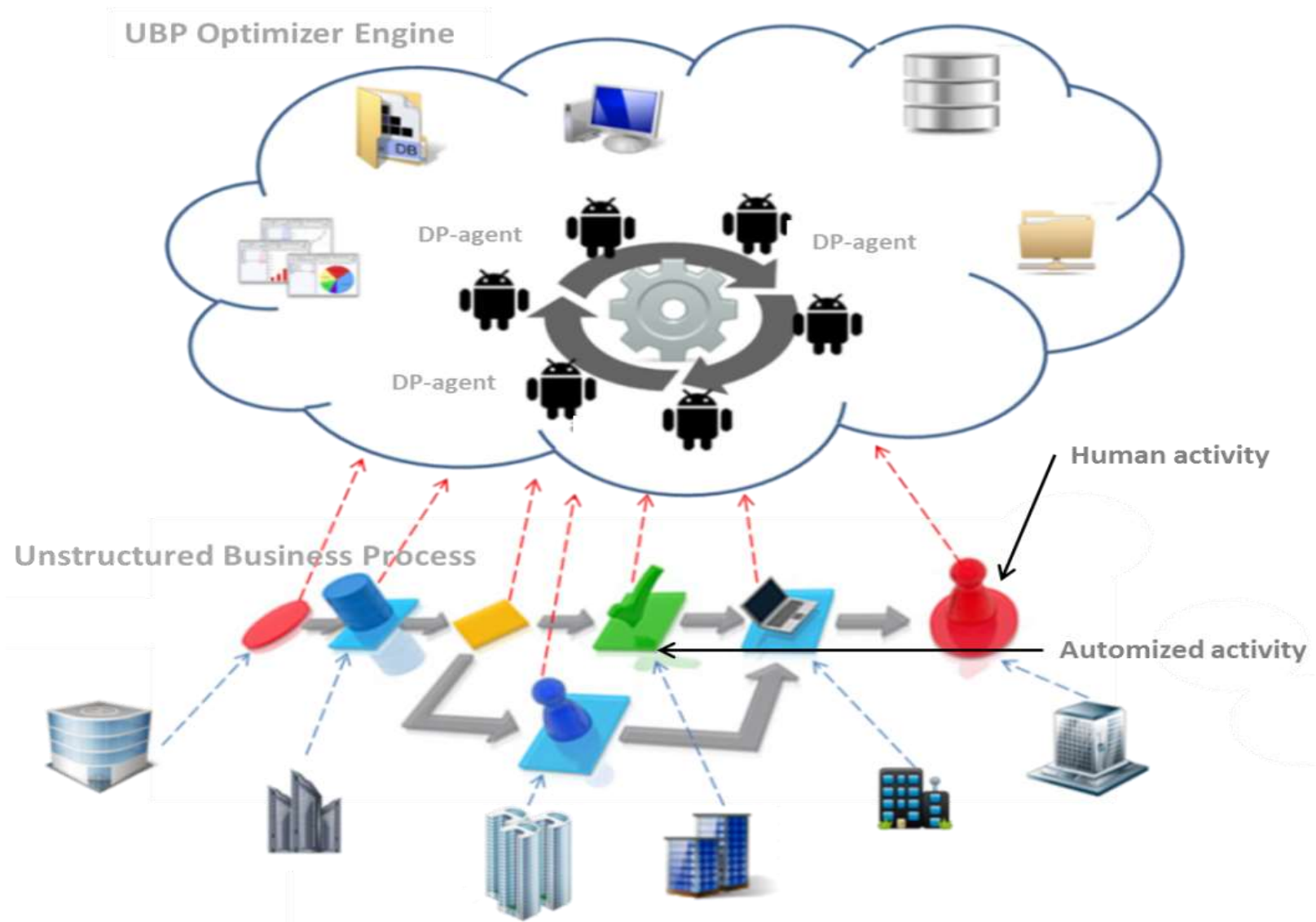


Managers



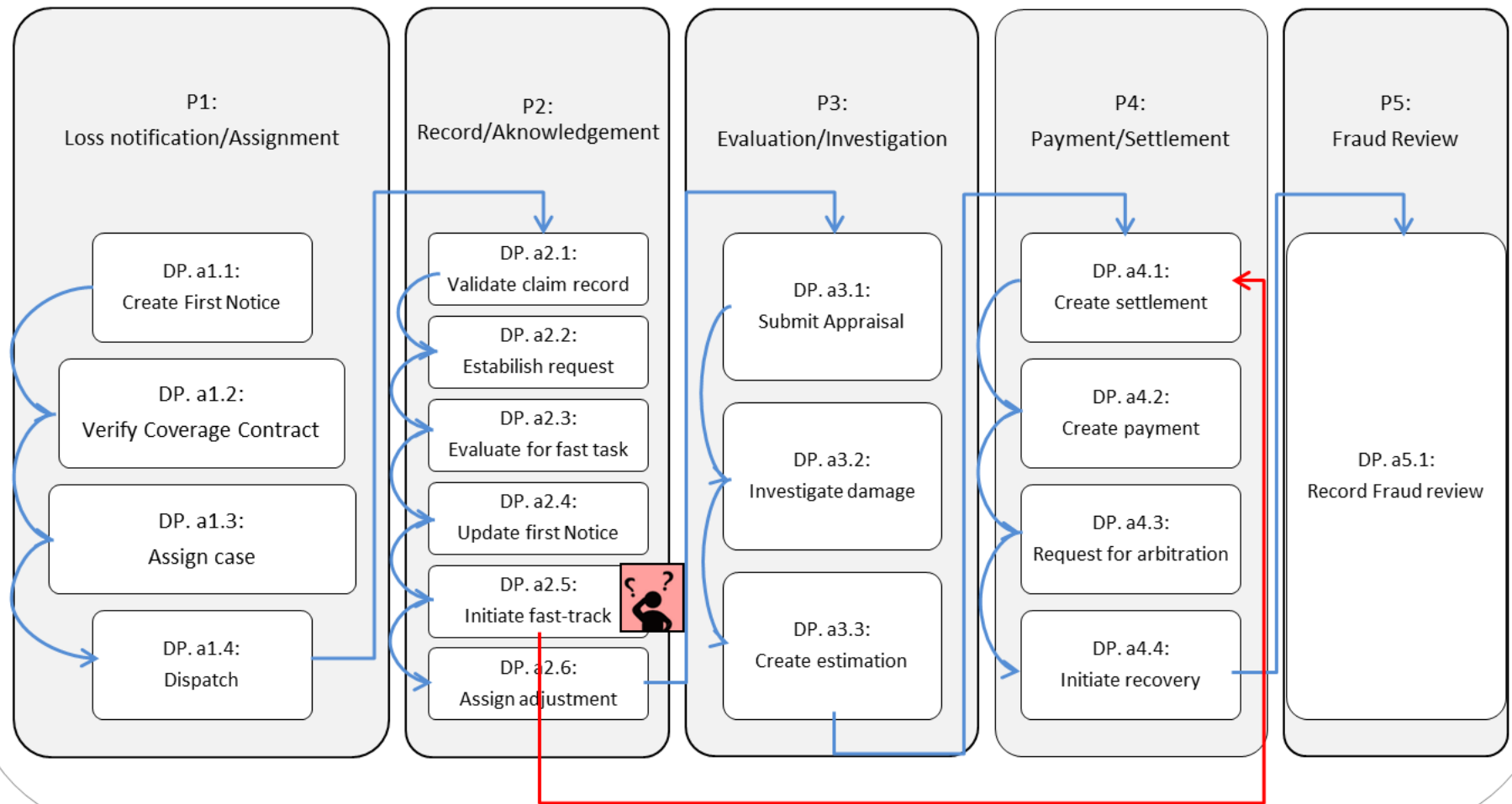
With Big Data Analytics

Big Data Analytics → In Management → Applications → Prediction in Unstructured BPM



Big Data Analytics → In Management → Applications → Prediction in Unstructured BPM

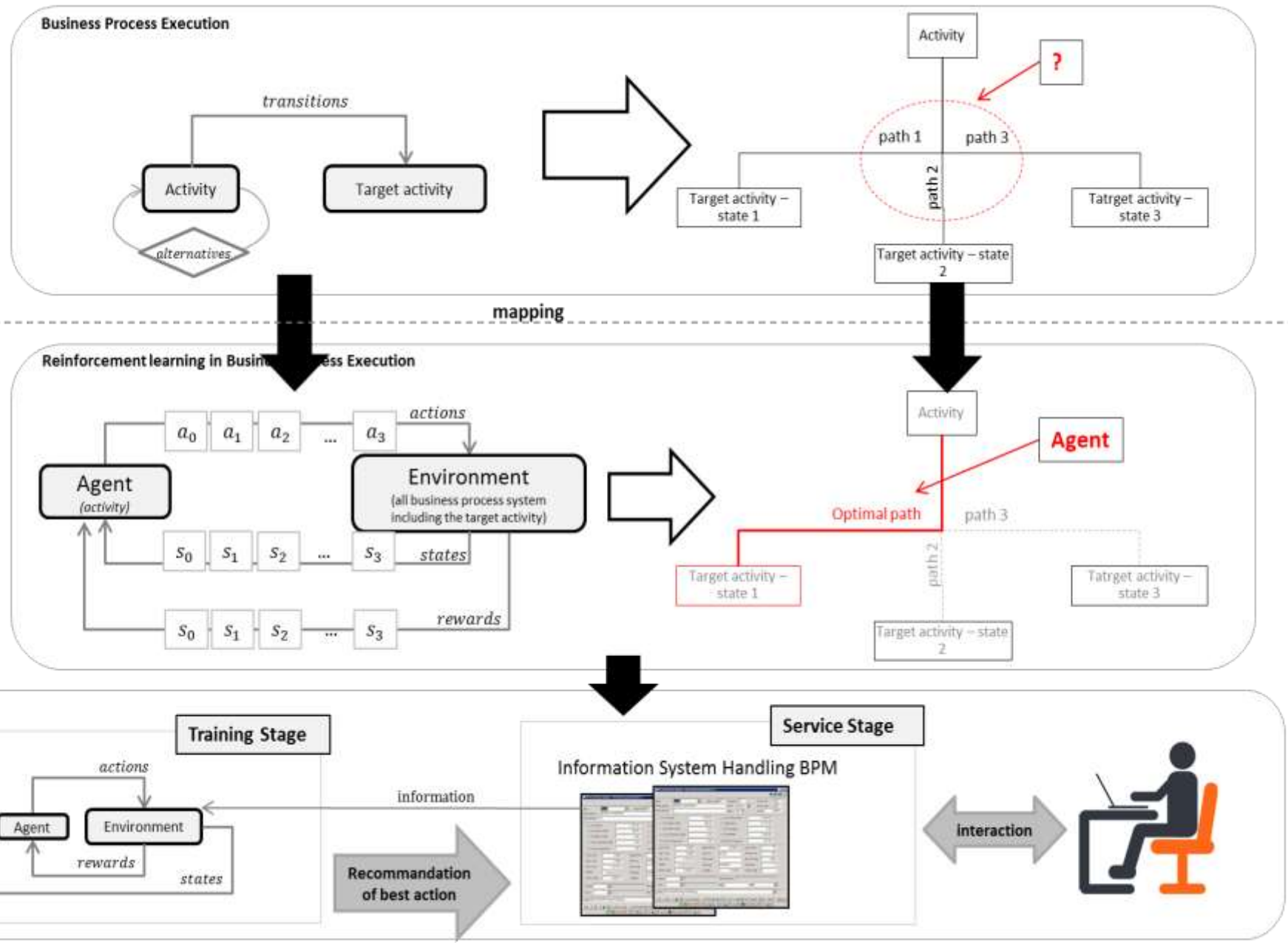
Business Process Execution



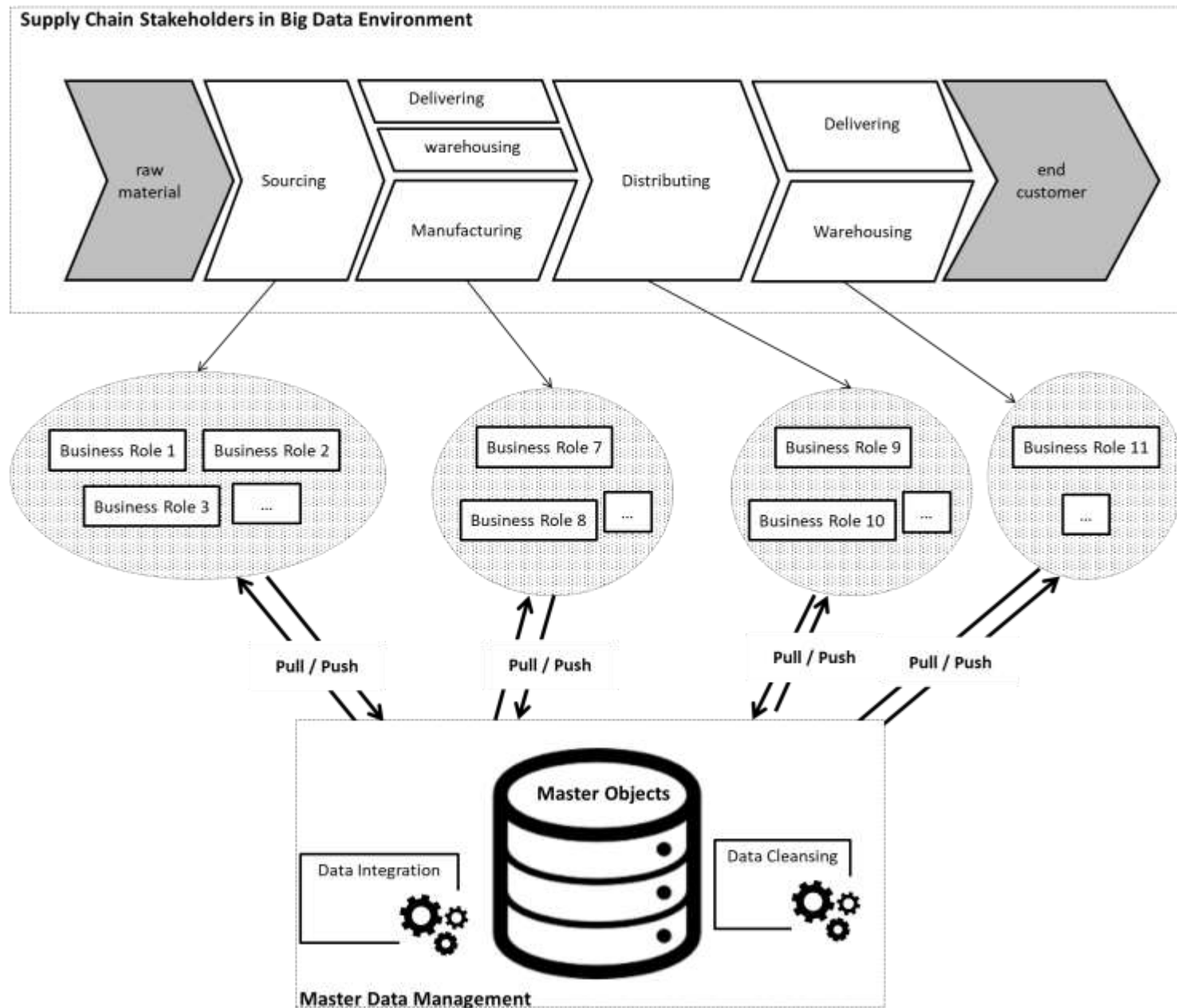
automatized transition
(regular path) →

man-made transition - - - - ->
(alternate path)

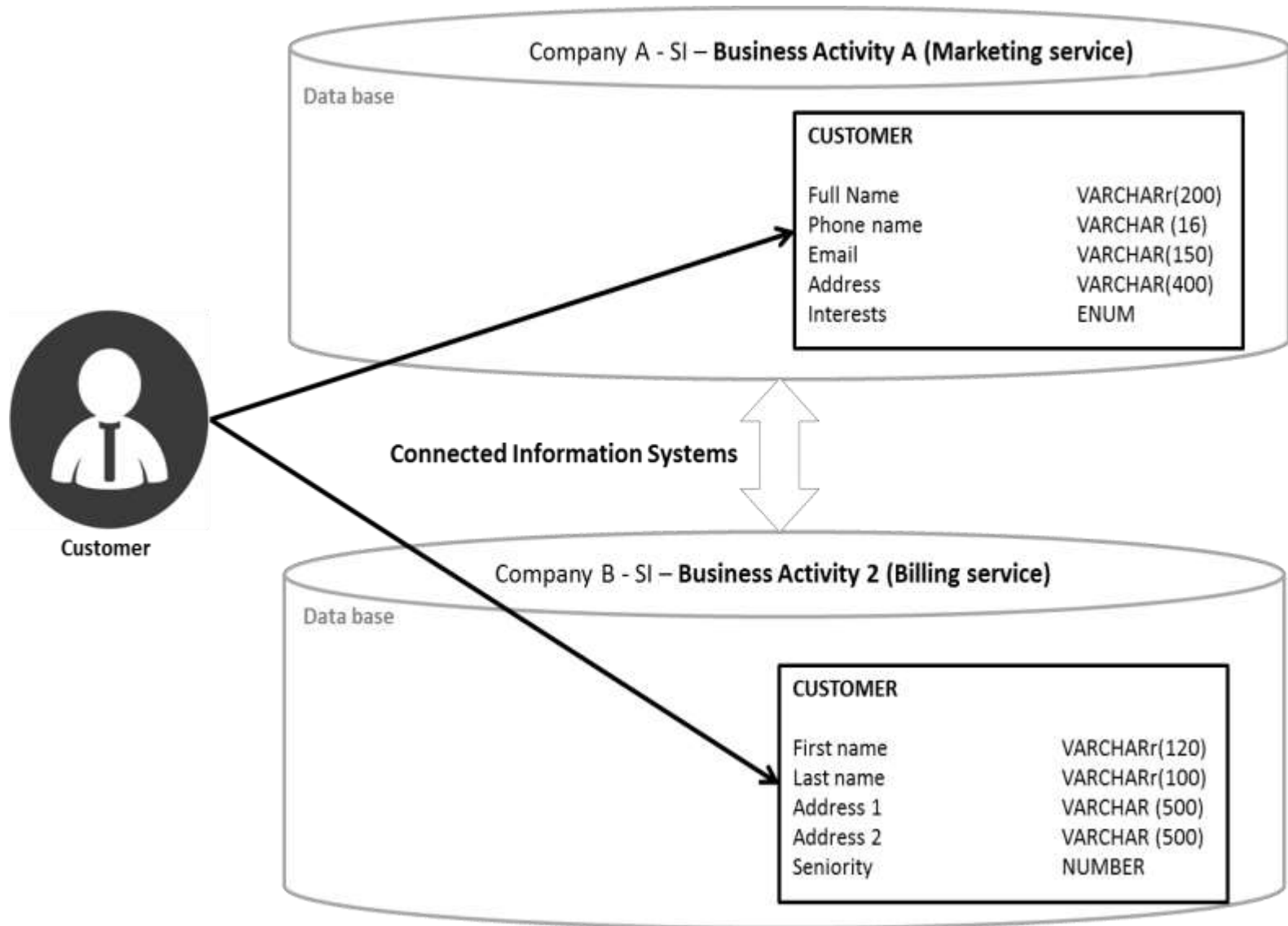
Big Data Analytics → In Management → Applications → Prediction in Unstructured BPM



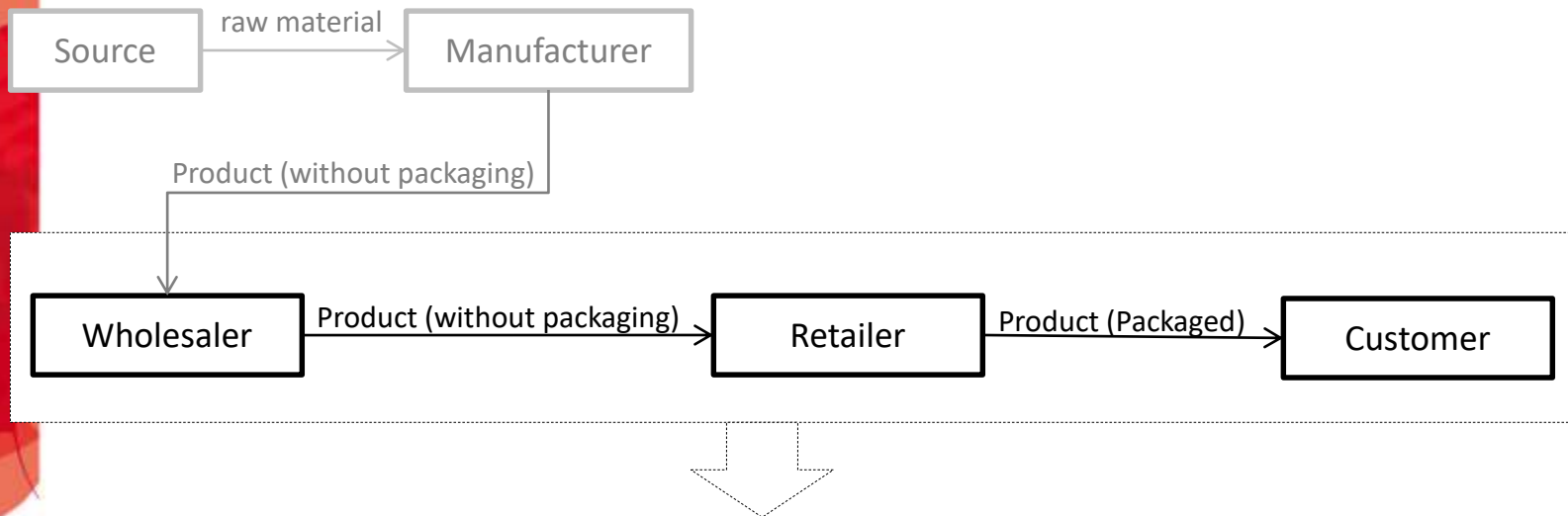
Big Data Analytics → In Management → Applications → Marketing/Sales Compliance



Big Data Analytics → In Management → Applications → Marketing/Sales Compliance



Big Data Analytics → In Management → Applications → Marketing/Sales Compliance



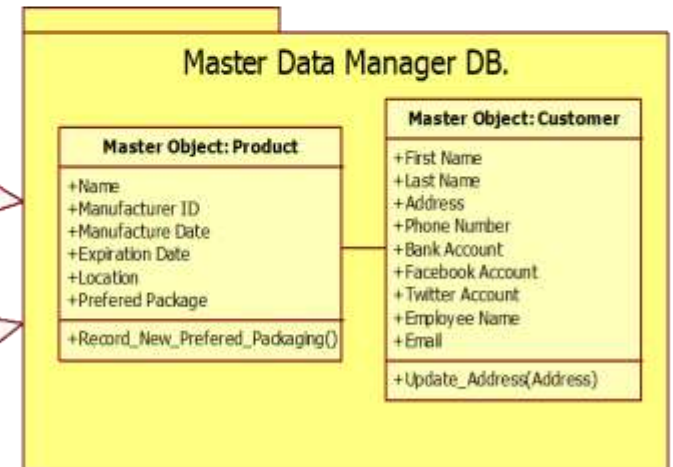
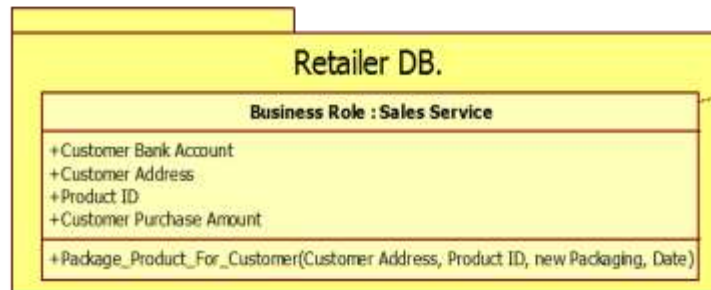
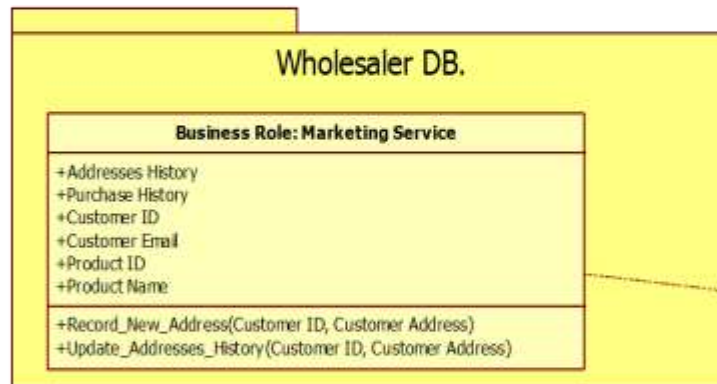
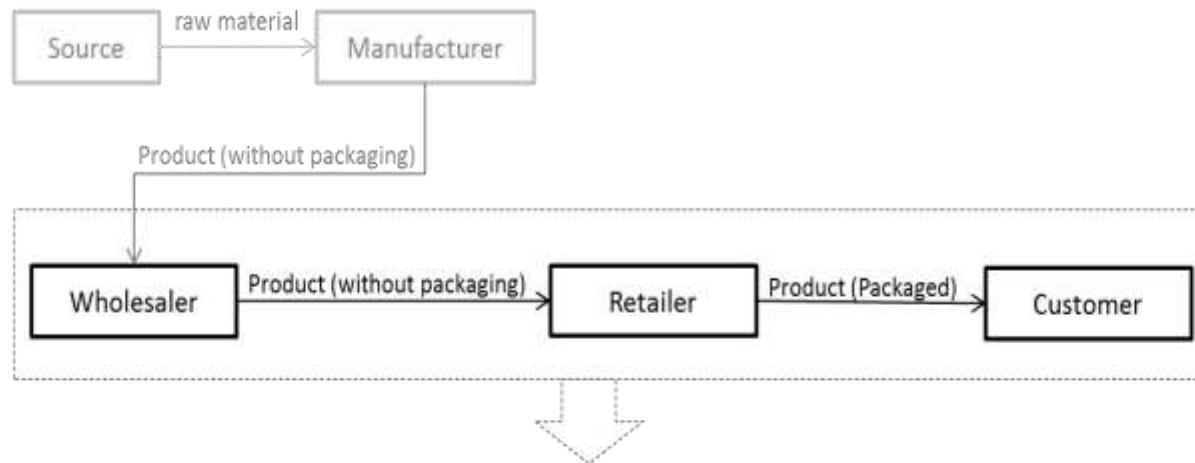
Master Object: Product
+Name
+Manufacturer ID
+Manufacture Date
+Expiration Date
+Location
+Record_New_Prefered_Packaging()

Master Object: Customer
+First Name
+Last Name
+Address
+Phone Number
+Bank Account
+Facebook Account
+Twitter Account
+Employee Name
+Email
+Update_Address(Address)

Business Role: Marketing Service
+Addresses History
+Purchase History
+Customer ID
+Customer Email
+Product ID
+Product Name
+Record_New_Address(Customer ID, Customer Address)
+Update_Addresses_History(Customer ID, Customer Address)

Business Role : Sales Service
+Customer Bank Account
+Customer Address
+Product ID
+Customer Purchase Amount
+Package_Product_For_Customer(Customer Address, Product ID, new Packaging, Date)

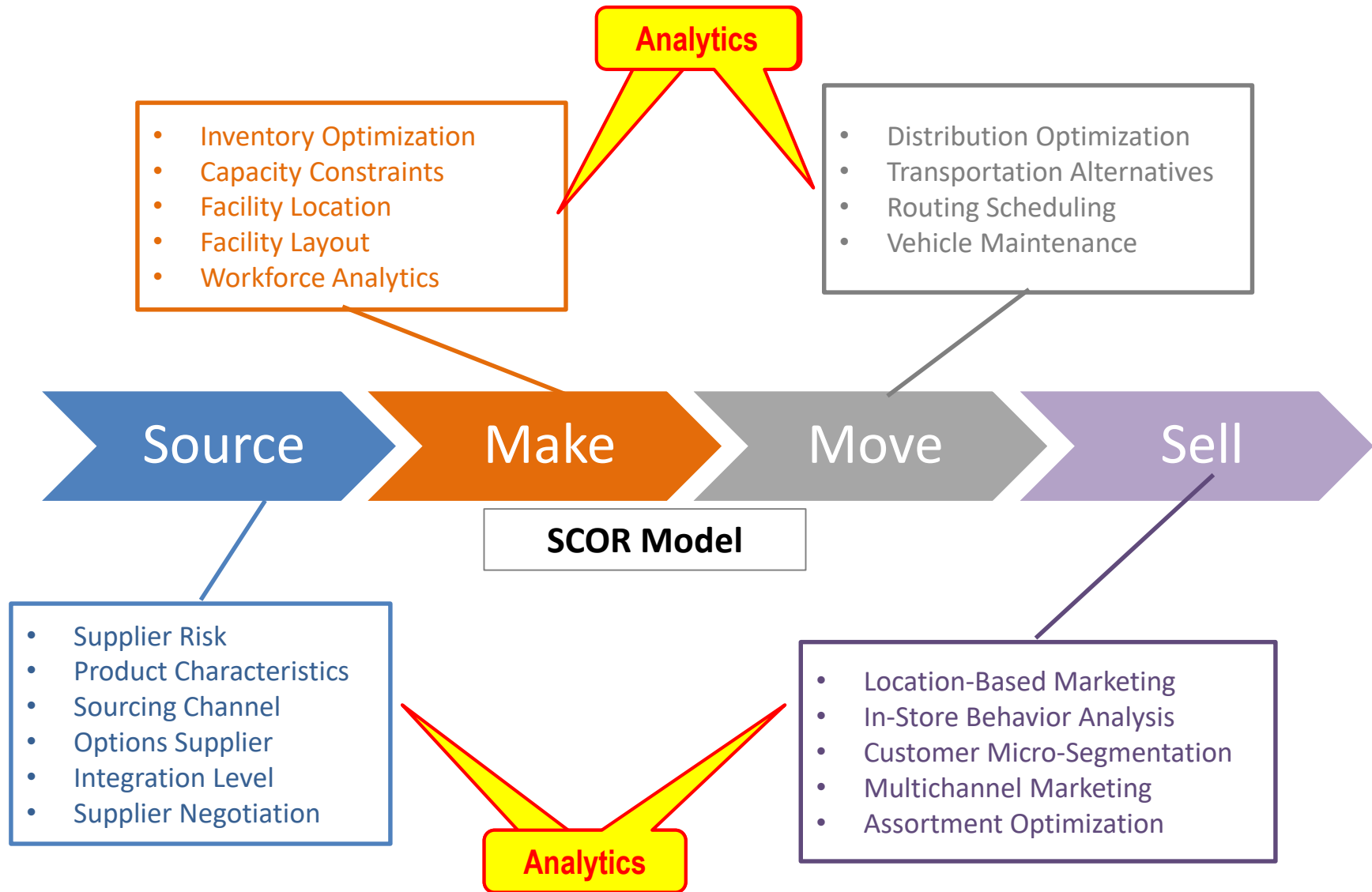
Big Data Analytics → In Management → Applications → Marketing/Sales Compliance



push

push

Big Data Analytics → In Management → Applications → Supply Chain Advanced Management



■ Applicative Exercise 6

Group Work. Duration 60min. Score 1.0

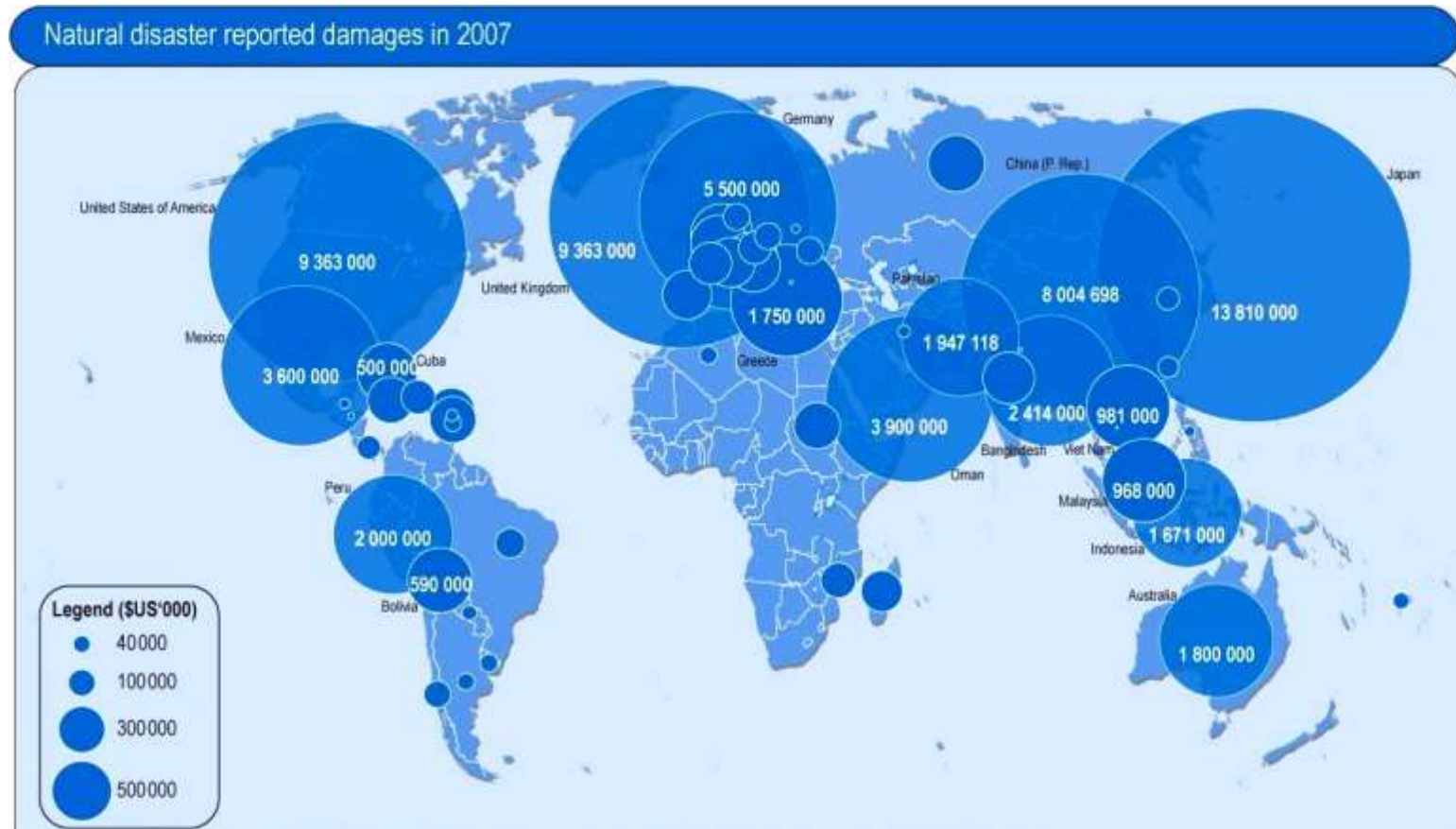
In the given SCOR model, select an operation then propose a solution based on Big Data Analytics following the following information:

- Operation in SCOR
- Objective
- Data Sources

For example:

- **Function in SCOR:** Distribution optimization
- **Objective :** Predictive Optimization
- **Data Sources:**
 - GPS,
 - History of vehicles/Distribution (indents, duration, delays, etc.)
 - Weather forecasting
 - RFID
 - ...

Big Data Analytics → In Management → Applications → Supply Chain Predictive Risk Management



Big Data Analytics → In Management → Applications → Supply Chain Predictive Risk Management



Detroit - USA



Katrina hurricane 2005



**Ford Factory devastation
Detroit - USA**

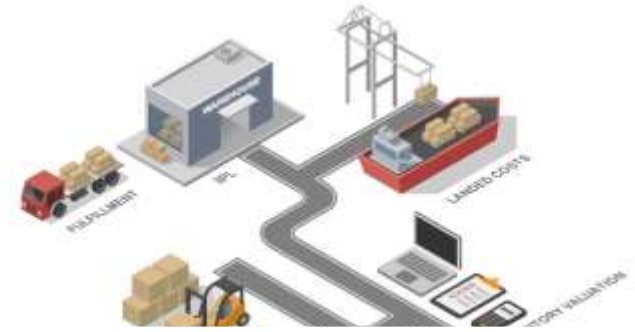
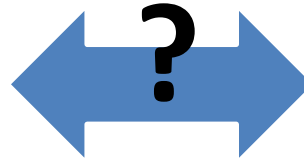


Sales points of Ford in France (Rhone-Alpes-Auvergne)

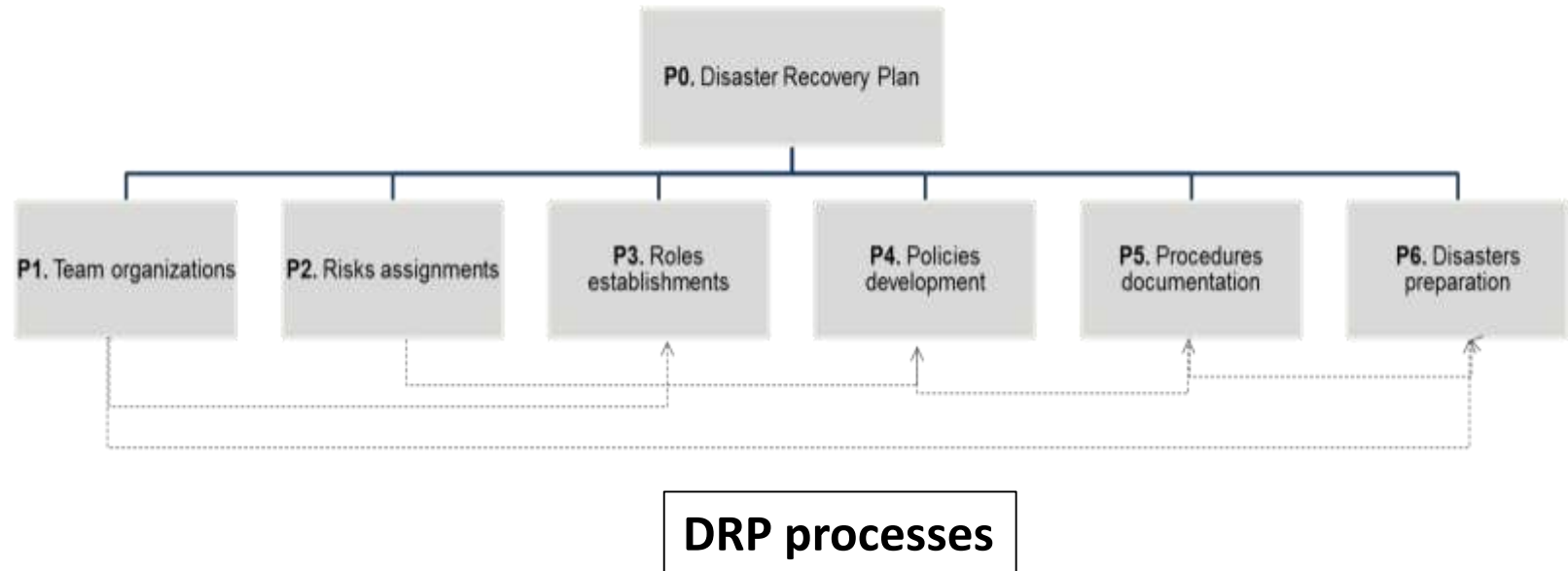




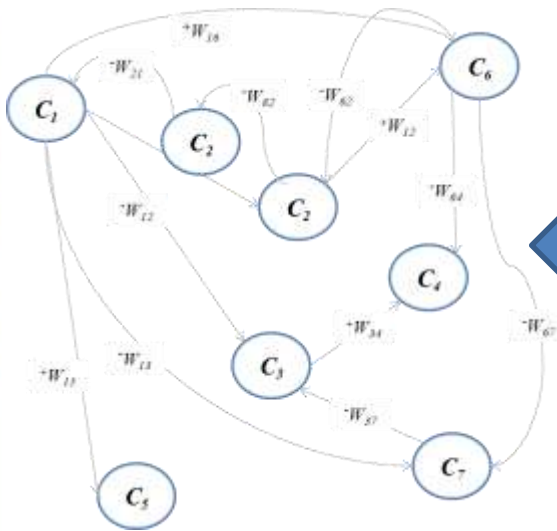
Big Data Analytics



Supply Chain Risk Management

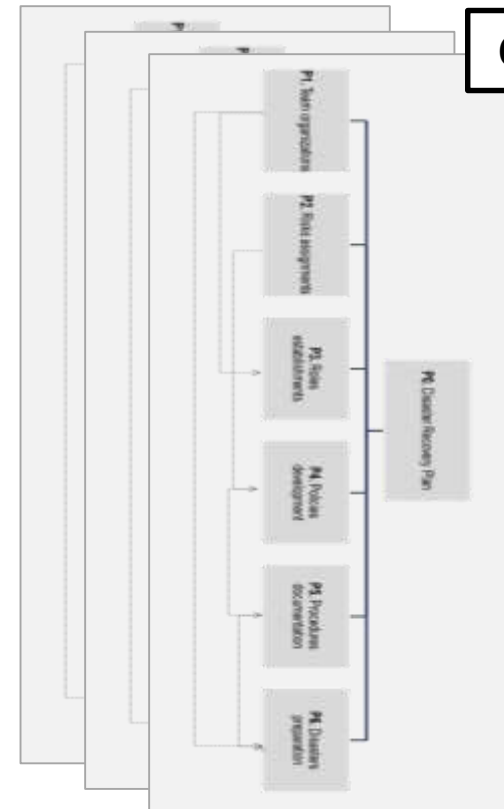


Big Data Solution



Sub-Process
=
Node

Cross-DRP



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Thanks ... any questions ?

