



Master en
Big Data e Inteligencia Artificial

Module 5



Data Analytics

Lesson 3: Building a data warehouse solution

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Introduction

- Users require information to make complex decisions
- Traditionally, reports and analysis are created on demand by IT experts (that is you!) to satisfy decision making needs
 - Reports, Descriptive, Predictive, Prescriptive analytics...
 - Many questions and information needs to be answered!





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Introduction

- Concrete answers are not always adequate
- Operational decisions: Require quick, specific information. Low level of abstraction.
 - When should we restock our products?
- Strategic decisions: Require information from various sources, validate multiple hypotheses. High level of abstraction.
 - Should we start an expansion in a new county or consolidate our position?
 - How much profit will we be able to achieve in the new country?
 - What is the cost of opening new stores in the main selling points?
 - How much room to grow do we have if we do not expand?





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OLAP

- In order to satisfy all the information needs we need several tools
- The first one is OLAP: On-line Analytical Processing
- OLAP...
 - Allows decision makers to validate their own hypotheses
 - Facilitates multiple crossing data without looking at multiple data pipelines and sources
 - Improves the understandability of the results









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OLAP

- **Self-Service:** IT does no longer provide direct answers for questions
- Instead, the user should satisfy his own decision making needs *himself*
 - Find answers for his initial questions
 - Formulate new hypotheses based on his findings
 - Validate these new hypotheses on its own
 - Make a decision









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Traditional Results vs OLAP Results


• **Traditional**

- Results are presented as-is
- Bi-dimensional (Tables)
- Static
- Focused on presenting the results of the analysis
- Contains a limited number of records
- Aims to provide an answer for a single or small set of questions




• **OLAP**

- Results are hierarchically structured
- N-Dimensional
- Dynamic
- Focused on facilitating information browsing
- May contain hundreds of thousands of records
- Aims to provide answers for as many questions as possible



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Advantages of OLAP Analysis

- More intuitive for the user (levels of abstraction)
- Context-aware analysis
- Analyze large volumes of data with ease
- Easy comparison of values
- Sandbox-like question answering



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OLAP: Concepts and Operations

- Building an OLAP solution requires careful design around a specific concept:
 - The Analysis Cube
- An analysis cube is an abstraction of the data that determines (i) what information is included and (ii) how we can operate with it
- Every possible cube is defined by two aspects:
 - Its static structure
 - A dynamic set of operations performed




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OLAP: Static Structure

- How to structure the information to meet these needs?
- Multidimensional modeling!
 - Facts
 - Dimensions
 - Levels




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OLAP: Static Structure

- Facts and measures
 - A fact is an activity or process of the company
 - A fact should have at least a measure that determines its performance
 - Fact measures should always be numeric
 - Facts are not constrained to financial activities only
- Sales, Tickets, Support center calls, Football matches, Classroom lessons....




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OLAP: Static Structure

- Dimensions
 - Dimensions are concepts or entities that participate in one or more activities (Facts)
 - Dimensions may include multiple concepts organized hierarchically (Levels)
 - Dimensions should have 1:N relationships with the Fact
 - Dimensions can have multiple relationships with the Fact (Roles)
 - Each dimension should be related with the fact through one of its levels only
- Location (City, Province, Country), Product (Product, Family, Type), Customer (Customer, City, Province, Country)...



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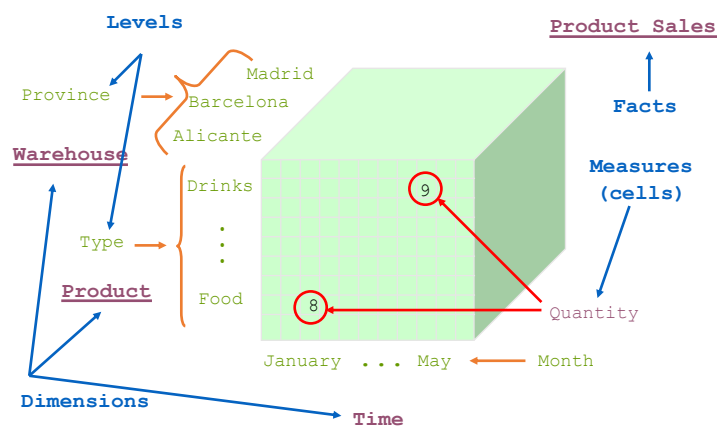
OLAP: Static Structure

- Levels
 - Levels represent different abstraction levels of a dimension
 - Each level should correspond with an identifiable concept
 - Levels may have attributes or properties, which provide additional information about each instance of the level
 - If there are two or more levels in a dimension, each level should be related to at least one other level
- Model, Type of Vehicle, Brand; Football Player, Team; Day, Month, Year....



OLAP: Static Structure

- Result:

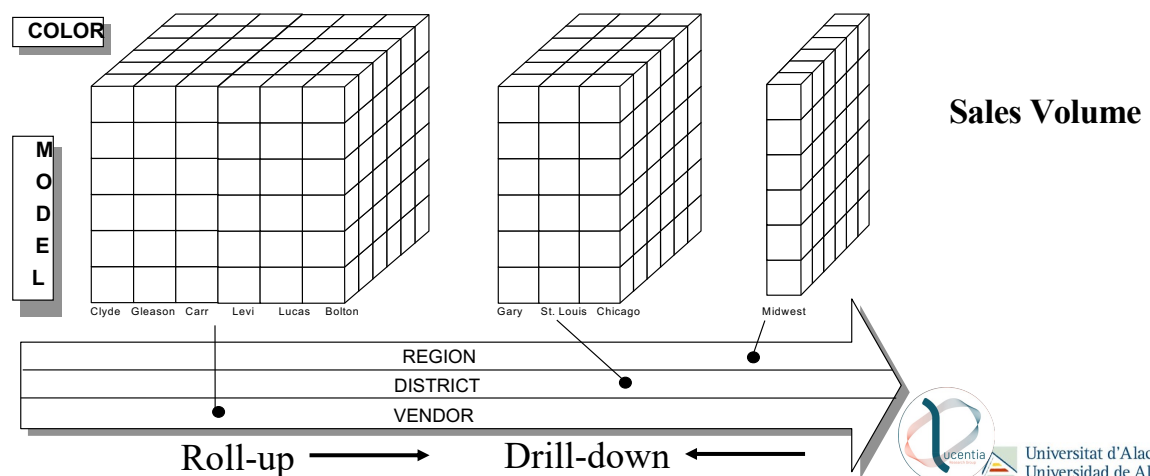


OLAP: Concepts and Operations

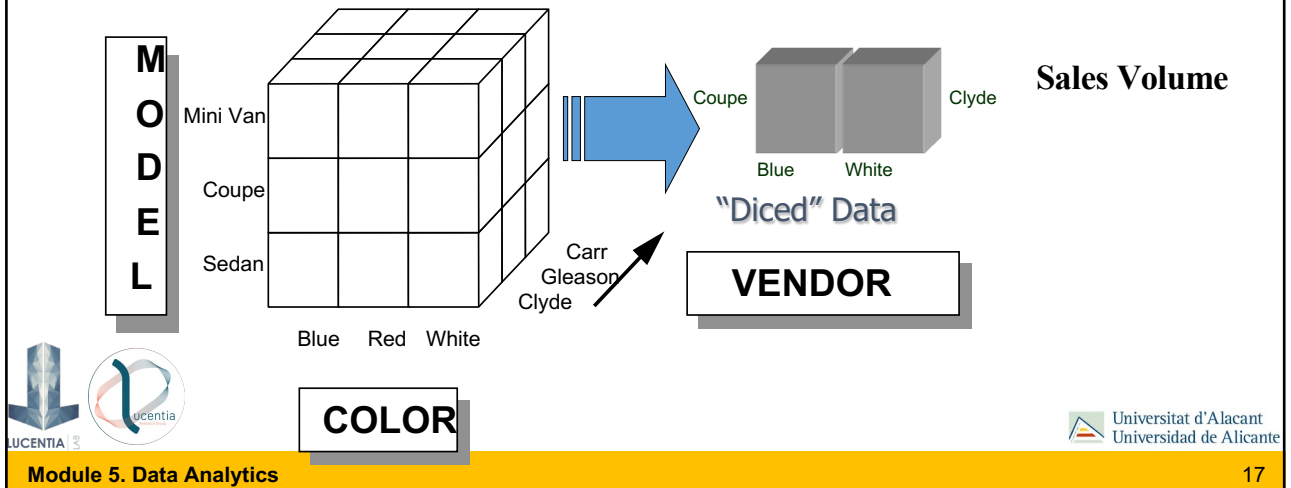
Once we have covered the static aspect of an OLAP Cube we can proceed to the dynamic aspect:

- Provides interactivity to the cube
- Is comprised by a set of operations that can be performed:
 - An OLAP operation over a cube always returns a cube
 - The set of operations is implemented in almost every OLAP server
 - The set of operations is almost always written in MDX

OLAP Operations: Roll-up/Drill-down

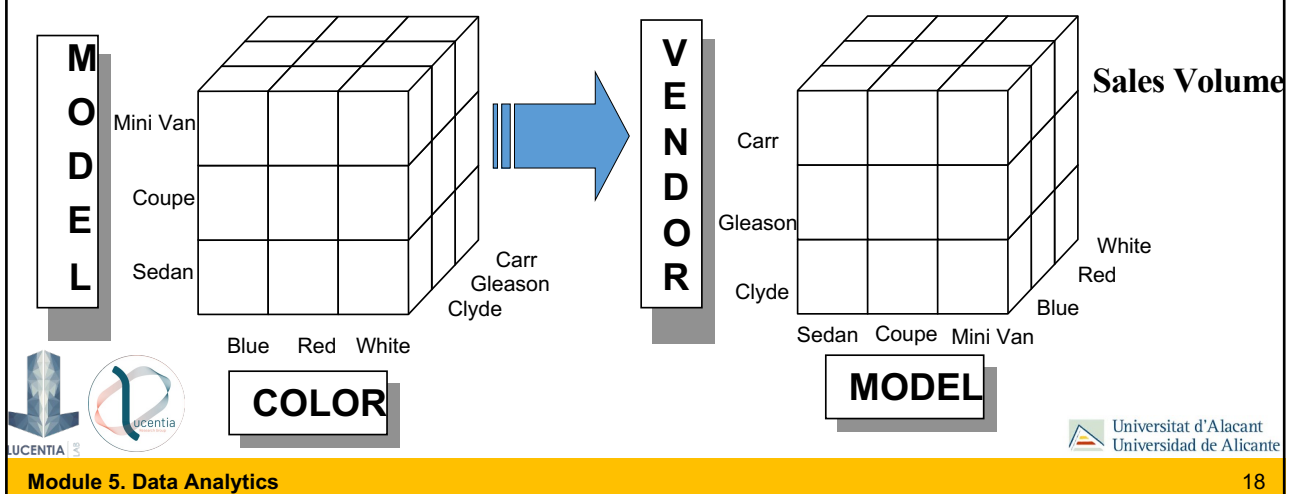


OLAP Operations: Slice & Dice



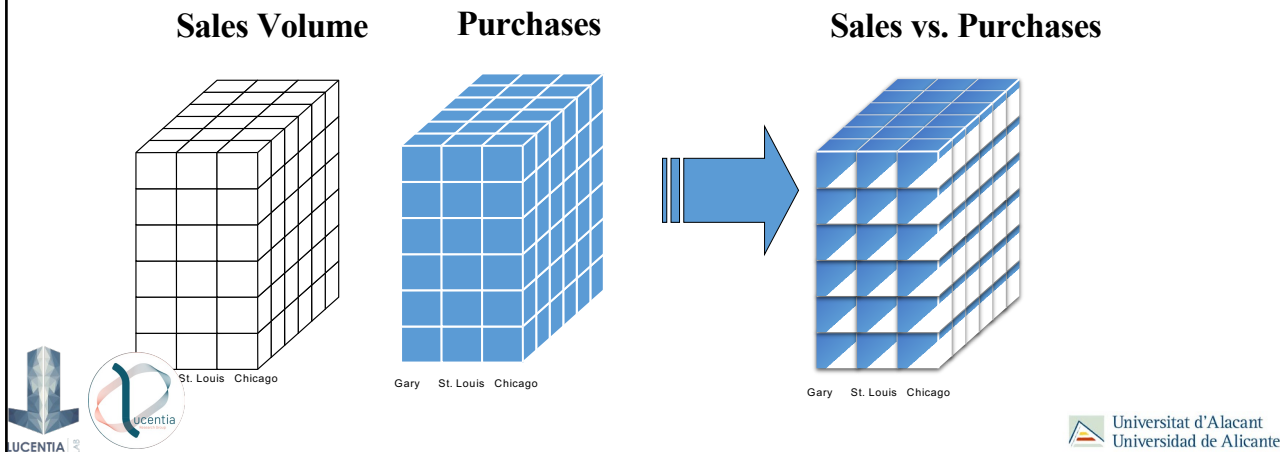
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OLAP Operations: Pivoting



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OLAP Operations: Drill-Across

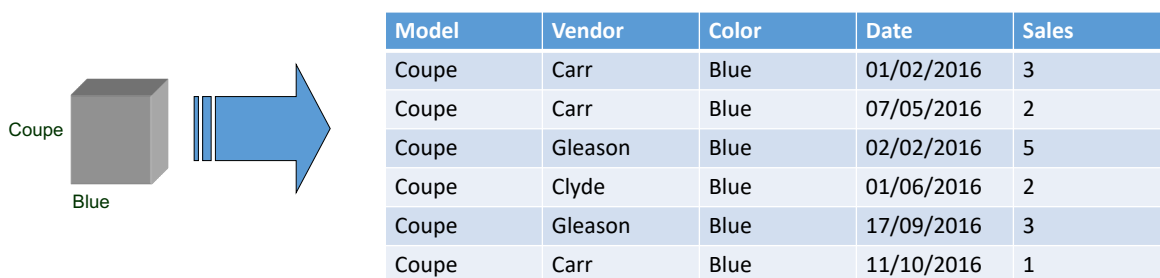


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OLAP Operations: Drill Through



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Frequently Asked Questions

- Think for a moment and try to answer the following:
 - Must the data be physically/logically structured according to the multidimensional principles?
 - Must we specify at some point a multidimensional structure if we are going to make use of OLAP?
 - Are dimensions always related to the fact through the most detailed level?




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Frequently Asked Questions

- Should the data be physically/logically structured according to the multidimensional principles?
 - NO, data can be formatted on the fly to accommodate a multidimensional structure
 - It is recommended though
- Should we specify at some point a multidimensional structure if we are going to make use of OLAP?
 - YES, otherwise you will not be able to perform OLAP operations
- Are dimensions always related to the fact through the most detailed level?
 - NO, there can be multiple cubes each relating to its own level in the dimension



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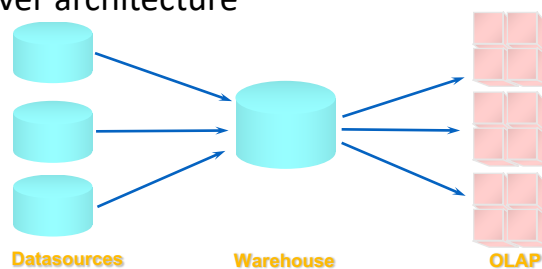
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OLAP Server Implementation


- An OLAP server acts as a mediator between the data and the user
- The OLAP server reads the data and builds a cube in memory according to the multidimensional schema specified
- Then, it allows the user to apply OLAP operations over the data

OLAP Server Implementation

- Traditional OLAP server architecture




- Easy and efficient data access
- Multidimensional view
- Client/Server configuration
- Complex data navigation



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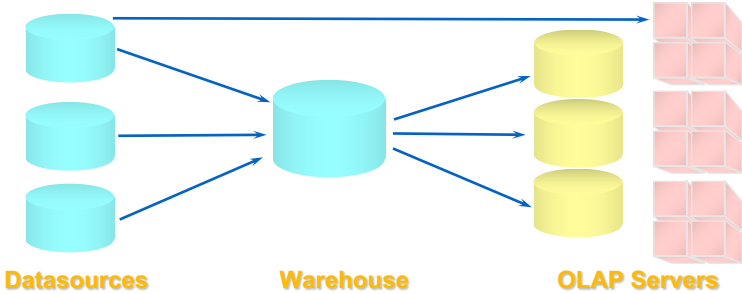
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OLAP Server Implementation


- Alternative OLAP architecture with direct data feed



Datasources
Warehouse
OLAP Servers




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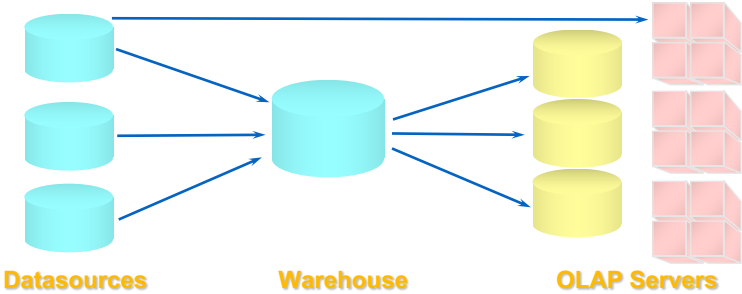
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OLAP Server Implementation


- Depending on how the server manages and stores the data we can differentiate three groups of OLAP Servers:
 - ROLAP
 - MOLAP
 - HOLAP



Datasources
Warehouse
OLAP Servers




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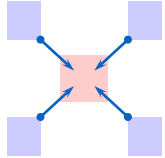
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OLAP Server Implementation

- ROLAP: Relational OLAP Servers
 - Works on top of RDBMS
 - Base data and dimension tables stored as relational tables
- Advantages:
 - Good management of space for sparse data warehouses
 - Data can be accessed by non-OLAP tools
 - Data loading times are usually shorter
 - Does not require pre-computation







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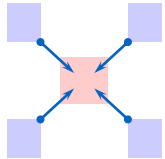
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OLAP Server Implementation

- Disadvantages of ROLAP Servers:
 - Slower performance than MOLAP servers
 - Aggregated tables must be created and managed by the user
 - Depends on the database for querying and caching
- Examples:
 - Oracle
 - Microsoft Analysis Services
 - Microstrategy






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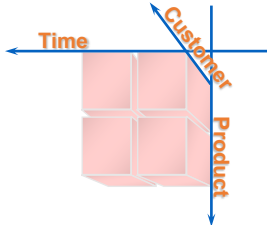
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OLAP Server Implementation

- **MOLAP: Multidimensional OLAP**
 - Precomputes a cube from the Base data
 - Represents in-memory the multidimensional structure of the cube
 - Includes higher level aggregations
- **Advantages:**
 - Very fast querying speed
 - Data can be compressed in order to reduce space required
 - Easily implemented through array models








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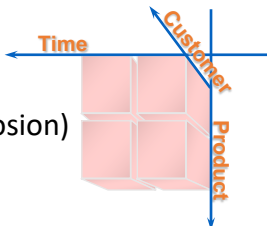
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OLAP Server Implementation

- **Disadvantages of MOLAP Servers**
 - Poor management of high dimensionality and sparse cubes (data explosion)
 - Long pre-computation times make it unusable for real-time data
 - Information cannot be queried outside the server
 - Cannot drill everywhere on the data
- **Examples:**
 - Kylin
 - Microsoft Analysis Services









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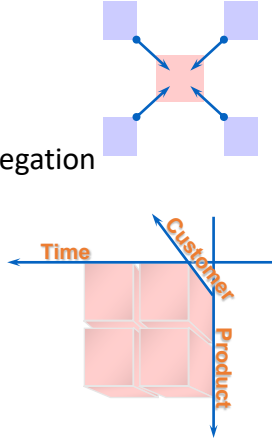
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OLAP Server Implementation

- **HOLAP: Hybrid OLAP**
 - Base data is stored within a database, like in ROLAP solutions
 - However, the OLAP Engine itself includes in-memory caching and aggregation
 - Base data is only re-accessed when needed
 - Tries to bring the best of both worlds
- **Advantages**
 - Utilizes both pre-calculated cubes as well as relational data
 - Scales better than ROLAP
 - Computes faster than MOLAP






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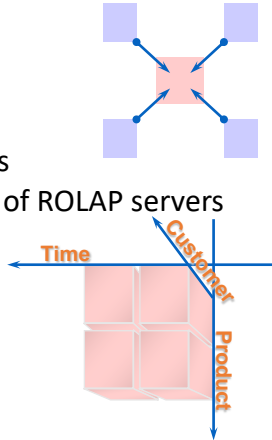
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OLAP Server Implementation

- **Disadvantages of HOLAP Servers**
 - A HOLAP implementation varies from server to server
 - May require manual configuration and tuning of the aggregated values
 - Cannot achieve the performance of MOLAP servers nor the scalability of ROLAP servers
- **Examples:**
 - Mondrian (Pentaho)
 - SAP





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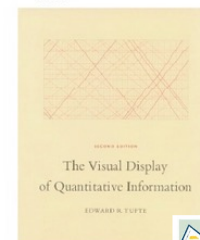
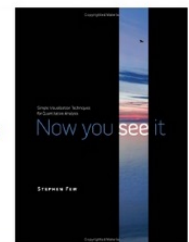
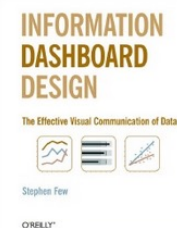
Dashboards

- While OLAP is useful for testing hypotheses, sometimes users wish to **monitor** a certain **process** or the **status of the company**
 - The trend of our sales
 - The rate of manufacture at the car plant
 - The results of the last election poll per state
 - ...
- To understand these results, users need more than just data, they need **visualizations** designed to **answer their questions** at a glance



Dashboards

- “A dashboard is a **visual display** of the most **important information** needed to achieve one or more **objectives**; consolidated and arranged on a single screen so the information can be **monitored at a glance.**”



...



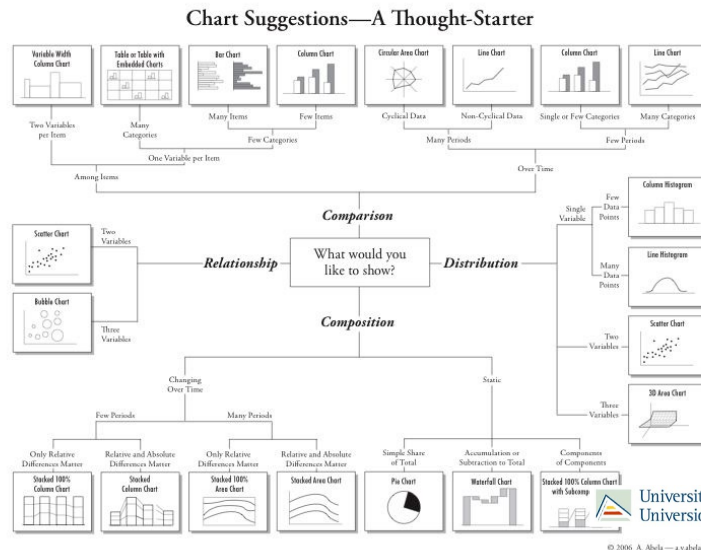
Dashboards

- Choosing the **right visualizations**:
 - Depend on the **user preferences**
 - And the **data at hand**

Source:
http://extremepresentation.typepad.com/blog/2006/09/choosing_a_good.html



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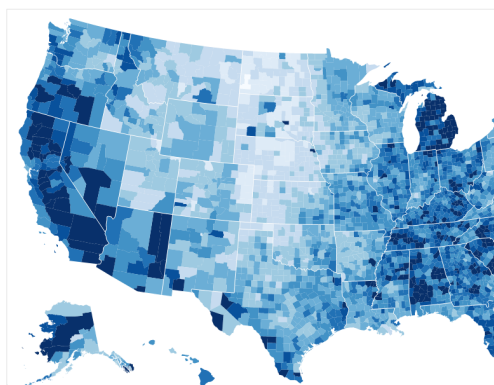


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Dashboards



■ Choropleth



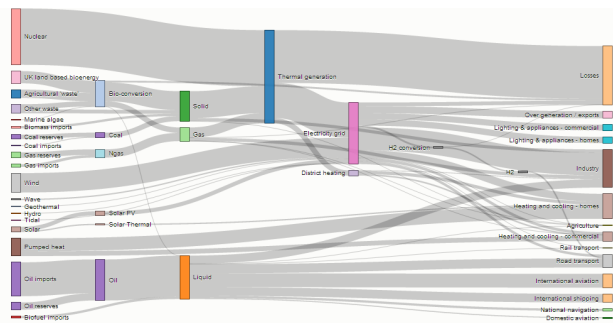
■ Bubble chart

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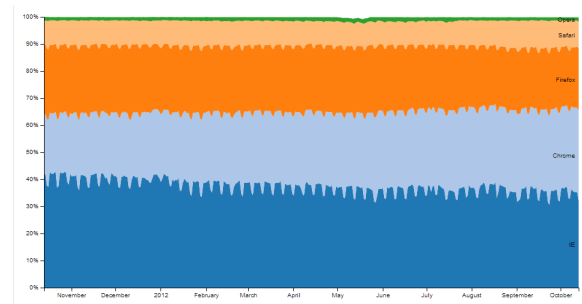
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Dashboards



■ Sankey Diagram




■ Stacked Area Chart

Scorecards


- What is a scorecard? A special kind of dashboard designed to **objectively measure the success of company objectives**
- Proposed by Kaplan & Norton in 1992 following the motto:

"You cannot control what you cannot measure"



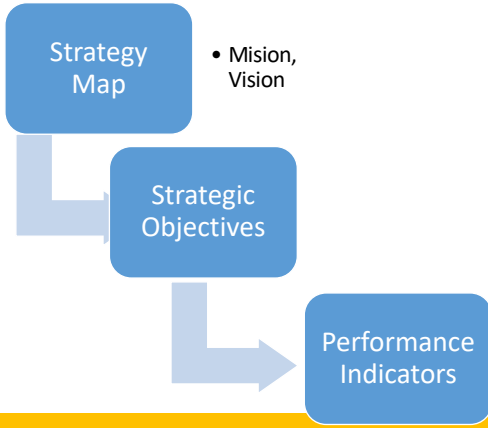
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Scorecards

- How to design a Scorecard?



- Misión, Vision
- What to measure?
- How to measure?






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



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Scorecards

- Strategy maps:
 - Organized into 4 perspectives: Finance, Customer, Process, Learning

Source:
<https://www.intrafocus.com/balanced-scorecard/>

Transforming society through the provision of ultra-high speed mobile information services				
The number one provider of ultra-high speed mobile information networks across the United Kingdom and Europe				
Content Partnerships		Customer Service		Brand Awareness
Strong supply chain for content and information services, exclusive agreements		Clarity in offering that surpasses anything in the market today, best user interface		Reinvigorated brand based on successes, attract a wider and younger audience
Strategic Objectives		Measures	Targets	Projects/Notes
<div style="display: flex; justify-content: space-around;"> <div style="text-align: center;">  </div> <div style="text-align: center;">  </div> <div style="text-align: center;">  </div> </div>		• Net profit • Operating costs • Revenue in target markets	• ↑ 5% per year • ↓ 3% per year • ↑ 12% per year	• Implement new financial accounting system • Simplify billing operations
<div style="display: flex; justify-content: space-around;"> <div style="text-align: center;">  </div> <div style="text-align: center;">  </div> <div style="text-align: center;">  </div> </div>		• % Market share index • % Customer satisfaction index • % Focus group user index	• ↑ 3% per year • 85% this year • > 90% each focus session	• Competitive end user requirements market studies for new UK regions • "Improve the Offering" two year programme
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<div style="display: flex; justify-content: space-around;"> <div style="text-align: center;">  </div> <div style="text-align: center;">  </div> <div style="text-align: center;">  </div> </div>		• Employee development plans • Technology training index • Supply chain efficiency index	• 95% in place • 90% efficient • 95%	• Product and marketing training programme • 2 year content supply agreements • Technology improvement programme
Customer Focus - Integrity - Quality - Helpfulness - Community				






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KPIs

- Key Performance Indicators (KPIs) are the **basic building blocks** of scorecards and many dashboards
- A KPI measures a **business objective** and provides a **threshold** that it must meet to be considered “**satisfied**”
 - **Objectivizes** the degree of achievement of business objectives



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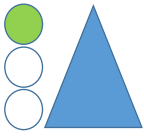
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KPIs

- Characteristics:
 - Quantitative and measurable
 - Measures a critical success factor
 - Represents both the business objective as well as its target goal
 - Limited in number
 - Are applied throughout the whole organization
- A KPI **is not** a report, a matter of discussion, nor an unclear metric





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KPIs

- While KPIs are **extremely widespread**...
 - Satisfaction of students on courses
 - Number of visitors to our webstore
 - Number of patient deaths in a hospital
- ... there can be serious consequences for their **misuse and misinterpretation**
 - A course where no one can fail to avoid dissatisfaction
 - A web where everyone enters but no one buys
 - A hospital that does not treat any high risk patient
- And whoever is responsible for the KPI **will reject changing it**




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Tips for designing dashboards and scorecards

- How to design **effective** dashboards and scorecards:
 - Establish **clear objectives** to be translated into measures and visualizations
 - **Prototype the dashboards** and show them to the users → They **MUST understand** them
 - Try to imagine **alternative scenarios** where you get the right results but **the situation is completely wrong**
 - Provide **additional information** to identify these scenarios



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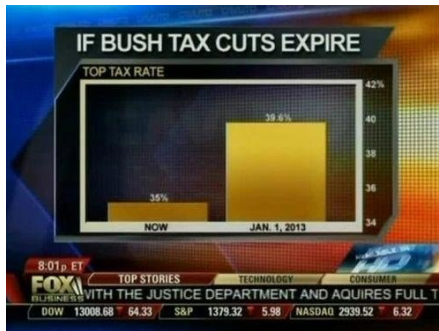


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Errors to Avoid

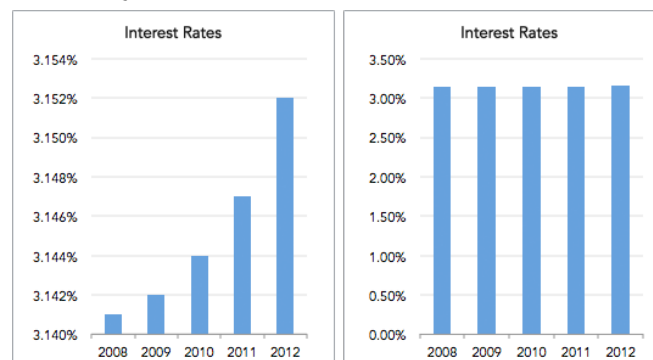


Source:
http://www.huffingtonpost.com/raviparikh/lie-with-data-visualization_b_5169715.html




Errors to Avoid

Same Data, Different Y-Axis




Source:
http://www.huffingtonpost.com/raviparikh/lie-with-data-visualization_b_5169715.html





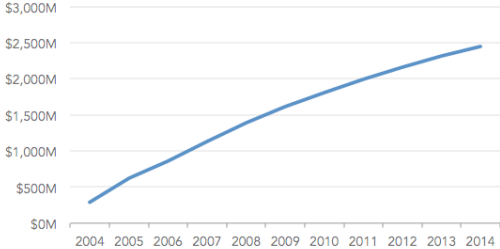
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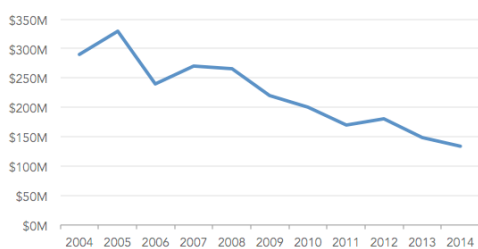
Errors to Avoid

Cumulative Annual Revenue




Year	Revenue (\$M)
2004	0
2005	500
2006	1000
2007	1500
2008	2000
2009	2500
2010	2800
2011	3100
2012	3400
2013	3700
2014	4000

Annual Revenue




Year	Revenue (\$M)
2004	300
2005	350
2006	250
2007	280
2008	280
2009	220
2010	200
2011	180
2012	190
2013	160
2014	150

Source: <http://www.huffingtonpost.com/raviparikh/ie-wireframe-visualization-0-5169715.html>




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Analytic solutions

- In order to facilitate the analytic results to users we need a **complete** analytic solution
- Ideally, our analytic solution should provide tools for:
 - Data Manipulation (Extraction, Transformation, Load)
 - Data Storage
 - Data Analysis
 - Data Presentation




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



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Analytic solutions

- There are several solutions in the market


- We use Pentaho as it includes:
 - One of the most powerful **data manipulation tools** available
 - It is **open source** and free
 - Includes modules for most of the data analytics tasks

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Module 5

Data Analytics

Lesson 3: Building a data warehouse solution

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