

What is Business Intelligence? Business Intelligence enables the business to make intelligent, factbased decisions Aggregate **Present Enrich** Inform a **Data Data Data Decision** STATISTICS r Hann Database, Decisions are Reporting Add Context Data Mart, Fact-based Tools, to Create Data Dashboards, and Data-Information, Warehouse, driven Static Descriptive ETL Tools, Reports, Statistics, Integration Mobile Benchmarks, **Tools** Reporting, Variance to **OLAP Cubes** Plan

CPU - Content, Performance, Usability

- Content
 - The business determines the "what", BI enables the "how"
- Performance
 - Minimize report creation and collection times (near zero)
- Usability
 - Delivery Method → Push vs Pull
 - Medium → Excel, PDF, Dashboard, Cube, Mobile Device
 - Enhance Digestion → "A-ha" is readily apparent, fewer clicks
 - Tell a Story → Trend, Context, Related Metrics, Multiple
 Views

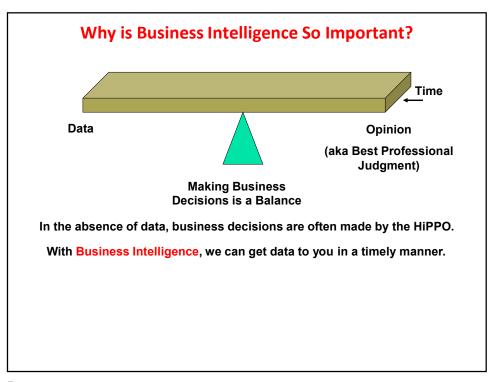
3

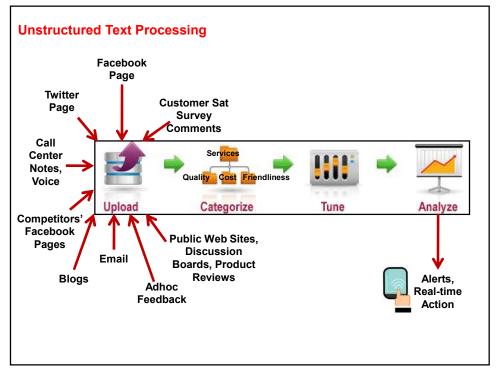
How Important is BI?

Top 10 Business and Technology Priorities for 2011:

- 1. Cloud computing
- 2. Virtualization
- 3. Mobile technologies
- 4. IT Management
- 5. Business Intelligence
- 6. Networking, voice and data communications
- 7. Enterprise applications
- 8. Collaboration technologies
- 9. Infrastructure
- 10. Web 2.0

Source: Gartner's 2011 CIO Agenda (aka "Reimagining IT: The 2011 CIO Agenda").

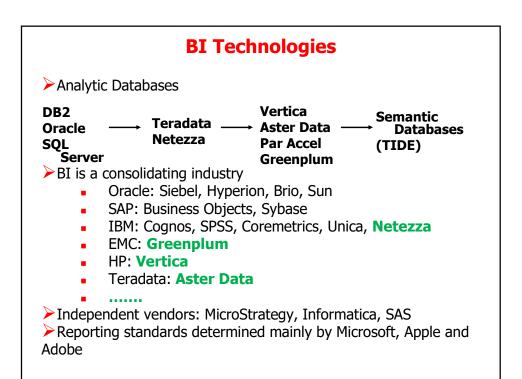


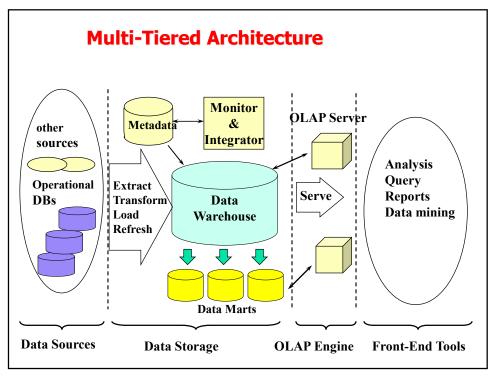


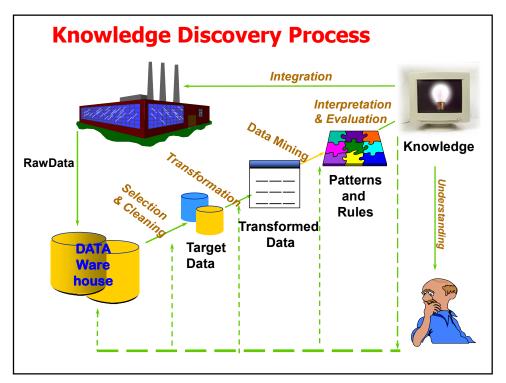












DATA PREPROCESSING

13

Why Data Preprocessing?

- > Data in the real world is dirty
 - incomplete: lacking attribute values, lacking certain attributes of interest, or containing only aggregate data
 - noisy: containing errors or outliers
 - inconsistent: containing discrepancies in codes or names
- No quality data, no quality mining results!
 - Quality decisions must be based on quality data
 - Data warehouse needs consistent integration of quality data
 - Required for both OLAP and Data Mining!

Why can Data be Incomplete?

- Attributes of interest are not available (e.g., customer information for sales transaction data)
- ➤ Data were not considered important at the time of transactions, so they were not recorded!
- > Data not recorder because of misunderstanding or malfunctions
- Data may have been recorded and later deleted!
- Missing/unknown values for some data

15

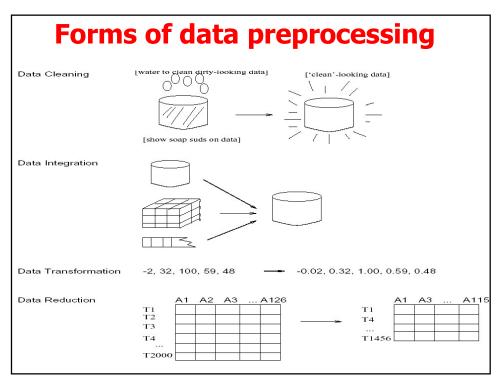
Why can Data be Noisy/Inconsistent?

- Faulty instruments for data collection
- Human or computer errors
- Errors in data transmission
- Technology limitations (e.g., sensor data come at a faster rate than they can be processed)
- Inconsistencies in naming conventions or data codes (e.g., 2/5/2002 could be 2 May 2002 or 5 Feb 2002)
- Duplicate tuples, which were received twice should also be removed

Major Tasks in Data Preprocessing

- Data cleaning
 - Fill in missing values, smooth noisy data, identify or remove outliers, and resolve inconsistencies
- Data integration
 - Integration of multiple databases or files
- Data transformation
 - Normalization and aggregation
- Data reduction
 - Obtains reduced representation in volume but produces the same or similar analytical results
- Data discretization
 - Part of data reduction but with particular importance, especially for numerical data

17



Data Cleaning

- > Data cleaning tasks
 - Fill in missing values
 - Identify outliers and smooth out noisy data
 - Correct inconsistent data

19

How to Handle Missing Data?

- ➤ Ignore the tuple: usually done when class label is missing (assuming the tasks in classification)—not effective when the percentage of missing values per attribute varies considerably.
- Fill in the missing value manually: tedious + infeasible?
- Use a global constant to fill in the missing value: e.g., "unknown", a new class?!
- > Use the attribute mean to fill in the missing value
- Use the attribute mean for all samples belonging to the same class to fill in the missing value: smarter
- ➤ Use the most probable value to fill in the missing value: inference-based such as Bayesian formula or decision tree

How to Handle Missing Data?

Age	Income	Team	Gender
23	24,200	Red Sox	М
39	?	Yankees	F
45	45,390	?	F

Fill missing values using aggregate functions (e.g., average) or probabilistic estimates on global value distribution

E.g., put the average income here, or put the most probable income based on the fact that the person is 39 years old

E.g., put the most frequent team here

21

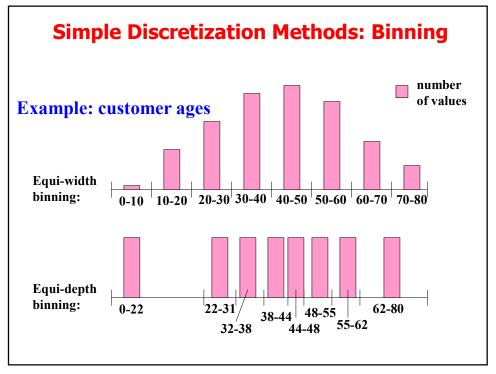
How to Handle Noisy Data? Smoothing techniques

- Binning method:
 - first sort data and partition into (equi-depth) bins
 - then one can smooth by bin means, smooth by bin median, smooth by bin boundaries, etc.
- Clustering
 - detect and remove outliers
- Combined computer and human inspection
 - computer detects suspicious values, which are then checked by humans
- Regression
 - smooth by fitting the data into regression functions

Simple Discretization Methods: Binning

- > Equal-width (distance) partitioning:
 - It divides the range into N intervals of equal size: uniform grid
 - if A and B are the lowest and highest values of the attribute, the width of intervals will be: W = (B-A)/N.
 - The most straightforward
 - But outliers may dominate presentation
 - Skewed data is not handled well.
- Equal-depth (frequency) partitioning:
 - It divides the range into N intervals, each containing approximately same number of samples
 - Good data scaling good handing of skewed data

23



Smoothing using Binning Methods

- * Sorted data for price (in dollars): 4, 8, 9, 15, 21, 21, 24, 25, 26, 28, 29, 34
- * Partition into (equi-depth) bins:
 - Bin 1: 4, 8, 9, 15
 - Bin 2: 21, 21, 24, 25
 - Bin 3: 26, 28, 29, 34
- * Smoothing by bin means:
 - Bin 1: 9, 9, 9, 9
 - Bin 2: 23, 23, 23, 23
 - Bin 3: 29, 29, 29, 29
- * Smoothing by bin boundaries: [4,15],[21,25],[26,34]
 - Bin 1: 4, 4, 4, 15
 - Bin 2: 21, 21, 25, 25
 - Bin 3: 26, 26, 26, 34