L02 – Understanding Data and Variable Type

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Last Lecture – Data Type

- Quantitative Numeric data with natural ordering
 - Discrete Data
 - Continuous Data
- Qualitative Qualities or characteristic
 - Categorical Data Labelled
 - Nominal Data
 - Ordinal Data

Outline

- Data and relationship of data point
- Variables and variable types
- Data types conversion

Example Dataset: Customer Purchases

| Customer ID | Name | Age | Gender | Location | Product | Purchase Date | Purchase Amount |
|----------------|--------------|-----|--------|----------------|------------|------------------|--------------------|
| 1 | John Doe | 28 | Male | New York | Laptop | 2024-07-01 | \$1,200 |
| 2 | Jane Doe | 35 | Female | Los Angeles | Smartphone | 2024-07-02 | \$800 |
| 3 | Bob Smith | 42 | Male | Chicago | Headphones | 2024-07-03 | \$150 |
| 4 | Lisa Ray | 30 | Female | Houston | Tablet | 2024-07-04 | \$500 |
| 5 | Tom Hanks | 45 | Male | Miami | Laptop | 2024-07-05 | \$1,100 |

Data

Data refers to information that is collected, stored, and analyzed to make decisions or gain insights.

Sources of Data

Internal Sources:

• Data generated within the organization, such as sales reports, customer databases, and financial statements.

External Sources:

• Data obtained from outside the organization, such as market research reports, industry statistics, and social media analytics.

Data Point

Refers to one row of the give data

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Example of a Data Point

Consider the first row in the dataset:

| Customer ID | Name | Age | Gender | Location | Product | Purchase Date | Purchase Amount |
|-------------|----------|-----|--------|----------|---------|---------------|-----------------|
| 1 | John Doe | 28 | Male | New York | Laptop | 2024-07-01 | \$1,200 |

Variable

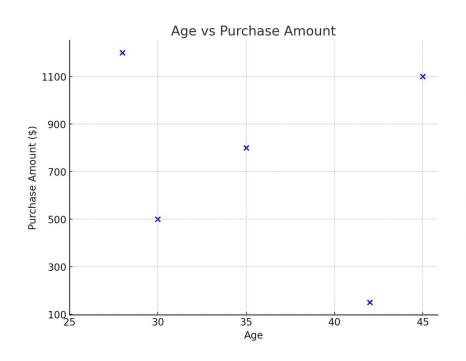
 The columns that represent different attributes or characteristics of the data

Example of a Data Point

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- 5 variables in the above example:
 - Customer ID, Name, Age, Gender, Location, Product, Purchase Date, Purchase Amount



Example Dataset: Customer Purchases

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A scatter plot of Age and Purchase Amount

Example Dataset: Customer Purchases

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Relationship of Data Point

Example of a Data Point

Consider the first row in the dataset:

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| 1 | John Doe | 28 | Male | New York | Laptop | 2024-07-01 | \$1,200 |

Nondependency-Oriented Data

 Non-dependency-oriented data refers to data where the variables or data points do not have a direct relationship among data points or dependency on one another.

| Respondent | Favorite Color | Product Rating (Stars) | Age | Gender | Daily Temperature (°C) | Item Inventory Count |
|------------|-------------------|---------------------------|-----|----------------|---------------------------|-------------------------|
| 1 | Blue | 4 | 30 | Male | 25 | 50 |
| 2 | Green | 5 | 25 | Female | 30 | 30 |
| 3 | Red | 3 | 40 | Non- binary | 22 | 100 |

Dependency-Oriented Data

 The data record may be implicitly or explicitly related to other data item

Implicit dependencies:

 The dependencies between data items are not explicitly defined or mandated but are inferred through analysis and observation.

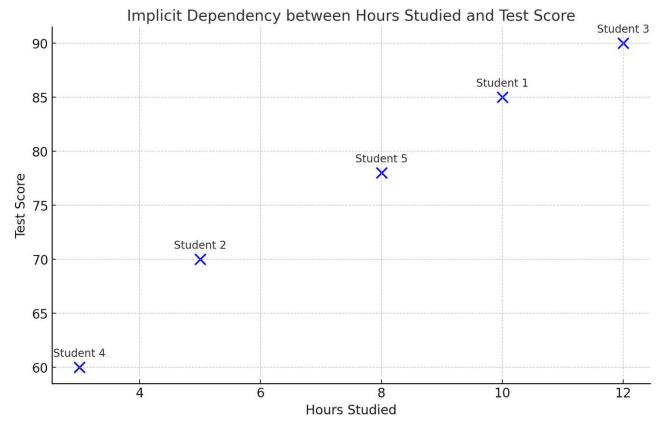
Explicit dependencies:

- Clear, predefined relationships between variables
 - Financial model: Interest payment might be explicitly calculated as a percentage of the loan amount

Implicit Dependencies

Observed Relationships:

Based on observed patterns or trends



Implicit Dependencies

Statistical Inference:

• Use statistical methods or analysis are required to identify correlations or causal relationships between variables.

Correlation Between Revenue and Strategies

| Strategy Type | ategy Type Correlation Coefficient | |
|---------------|------------------------------------|--------|
| Social Media | 0.997 | 0.0028 |
| TV Ads | 0.997 | 0.0025 |
| Print Ads | 1.000 | 1.000 |

Example of a Data Point

Consider the first row in the dataset:

| Customer ID | Name | Age | Gender | Location | Product | Purchase Date | Purchase Amount |
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| 1 | John Doe | 28 | Male | New York | Laptop | 2024-07-01 | \$1,200 |

Types of Variable

Variable: Customer ID, Name, Age, Gender, Location, Product, Purchase Date, Purchase Amount

Type of Data - Last Lecture

Qualitative Data

- Numerical data have a natural ordering.
 - **Discrete Data:** Data refers to specific and distinct values or observations that can be counted.
 - Continuous Data: Data that can take any value in the range. It can be divided into smaller increments and measured with great precision.

Quantitative Data

- Non-numeric information that describes qualities or characteristics.
- Categorical data:
 - Nominal Data: Categories with no inherent order.
 - Example: Car brands (Toyota, Ford, BMW, Honda).
 - Ordinal Data: Categories with a meaningful order or ranking.
 - Example: Education level (High School, Bachelor's, Master's, Ph.D.).

Example Dataset: Customer Purchases

| Customer ID | Name | Age | Gender | Location | Product | Purchase Date | Purchase Amount |
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Identify type of each variable (Quantitative vs. Qualitative)

Types of Variable

Example of a Data Point

Consider the first row in the dataset:

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|-------------|----------|-----|--------|----------|---------|---------------|-----------------|
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- What is type of each variable in the given data point?
 - Numeric Variable
 - Categorical Variable
 - Binary Variable
 - Date/Time Variable

Numeric Variable

- Variables that represent quantities and are measured on a numeric scale.
 - Types of Numeric Variable:
 - Continuous Variables: Variable that can take any value within a range.
 - Examples: height, weight, and age.
 - Discrete Variables: Variable that can take only specific, separate values.
 - Examples: the number of customers, units sold, and days of the week.

Categorical Variables

- Variables that represent categories or groups and do not have a numeric value.
 - Types of Categorical Variables:
 - Nominal Variables: Categories with no intrinsic order.
 - Examples: gender (male/female), product type, and country.
 - Ordinal Variables: Categories with a meaningful order but the intervals between the categories are not necessarily equal or quantifiable.
 - Examples: customer satisfaction ratings (e.g., low, medium, high) and education level (e.g., high school, bachelor's, master's).

Binary Variable

- A specific type of **categorical variable** with *only two* possible values.
 - Example of variables with value equals to yes/no, true/false, and male/female.

Date/Time Variable

- Variables that represent dates and times.
- It can be used to track temporal patterns, such as trends over time, seasonality, or event timing.
- Examples:
 - Transaction date and delivery time.

Text Variable (String)

- Variable that stores sequences of characters.
 - Letters, numbers, symbols, spaces, and punctuation marks
- Example:
 - Simple Text: "Hello, world!"
 - Single Character: "A"
 - Numbers as Text: "12345" (Note: These are treated as text, not as numerical values.)
 - Special Characters: "@#\$%^&*"

Example Dataset: Customer Purchases

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Identify type of each variable

| Customer ID | Name | Age | Gender | Location | Product | Purchase Date | Purchase Amount | Is Returning Customer |
|----------------|---------------|-----|----------------|----------------|------------|------------------|--------------------|-----------------------------|
| 1 | John Doe | 28 | Male | New York | Laptop | 2024-07-01 | \$1,200 | Yes |
| 2 | Jane Smith | 35 | Female | Los Angeles | Smartphone | 2024-07-02 | \$800 | No |
| 3 | Bob Brown | 42 | Not Specify | Chicago | Headphones | 2024-07-03 | \$150 | Yes |
| 4 | Lisa Ray | 30 | Female | Houston | Tablet | 2024-07-04 | \$500 | No |
| 5 | Tom Hanks | 45 | Male | Miami | Laptop | 2024-07-05 | \$1,100 | Yes |

Identify type of "Gender" variable

Importance of Variable Types in Data Analysis

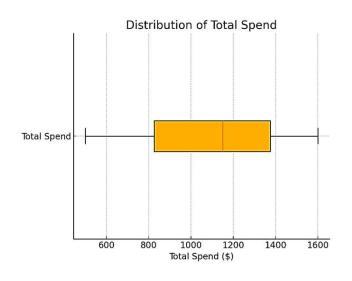
Descriptive Statistics

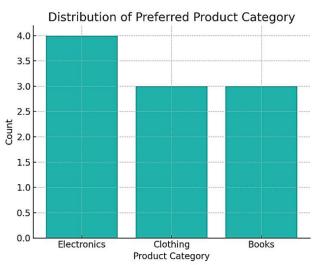
Numerical Variables:

 Calculate means, medians, and standard deviations for Age and Total Spend to understand average customer profiles and spending patterns.

Categorical Variables:

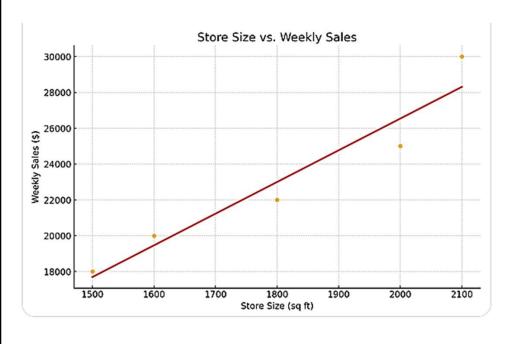
• Determine mode and frequency distribution for variables like Gender and Preferred Product Category to identify common traits.





Statistical Analysis

- The statistical tests and models depends on the variable types
 - Example: regression for numerical variables, chi-square tests for categorical variables).



Contingency Table

| Promotion Applied | High | Low | Medium | Total |
|-------------------|------|-----|--------|-------|
| No | 1 | 0 | 1 | 2 |
| Yes | 2 | 1 | 0 | 3 |
| Total | 3 | 1 | 1 | 5 |

Chi-Square Test Results

• Chi-Square Statistic: 2.22

Chi-Square Test of Customer

• Degrees of Freedom: 2

Satisfaction and Promotion Applied.

p-value: 0.329

Data Cleaning and Preparation

Categorical Variables:

• Encode categorical variables for modeling (e.g., using one-hot encoding for Gender or Preferred Product Category).

Ordinal Variables:

• Ensure that the order is preserved during encoding (e.g., Membership Status: Bronze, Silver, Gold).

| Location | Manager | Weekly Sales | Employee Count | Store Size (sq ft) | Promotion Applied | Customer Satisfaction | Gender | Membership |
|----------------|---------|--------------|-------------------|-----------------------|----------------------|--------------------------|--------|------------|
| New York | Alice | 25,000 | 10 | 2000 | Yes | High | Female | Bronze |
| Los Angeles | Bob | 18,000 | 8 | 1500 | No | Medium | Male | Silver |
| Chicago | Carol | 22,000 | 12 | 1800 | Yes | Low | Female | Gold |
| Houston | David | 20,000 | 9 | 1600 | No | High | Male | Silver |
| Miami | Eva | 30,000 | 11 | 2100 | Yes | High | Female | Gold |

Encoded categorical value

| Location | Manager | Weekly Sales | Employee Count | Store Size (sq ft) | Promotion Applied | Customer Satisfaction | Gender_Male | Membership |
|----------------|---------|--------------|-------------------|-----------------------|----------------------|--------------------------|-------------|------------|
| New York | Alice | 25,000 | 10 | 2000 | Yes | High | 0.0 | 0.0 |
| Los Angeles | Bob | 18,000 | 8 | 1500 | No | Medium | 1.0 | 1.0 |
| Chicago | Carol | 22,000 | 12 | 1800 | Yes | Low | 0.0 | 2.0 |
| Houston | David | 20,000 | 9 | 1600 | No | High | 1.0 | 1.0 |
| Miami | Eva | 30,000 | 11 | 2100 | Yes | High | 0.0 | 2.0 |

Importance of Variable Types in Data Analysis

 The type of variable determines which summary statistics are appropriate (e.g., mean for numerical variables, mode for categorical variables).

 The choice of statistical tests and models depends on the variable types (e.g., regression for numerical variables, chi-square tests for categorical variables).

 Variable types influence feature engineering and model selection, impacting the effectiveness of predictive models.

| Location | Manager | Weekly Sales | Employee Count | Store Size (sq ft) | Promotion Applied | Customer Satisfaction | Gender | Membership |
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- Give example of data point in the given data.
- List variables of each data point.
- List type of variables of each data point.

Lab

- o Familiarization with data analytics tools and software
- o Basic data exploration exercises
- o Hands-on practice with data types conversion