



School of Economics and Management

Information Science III

2. Data

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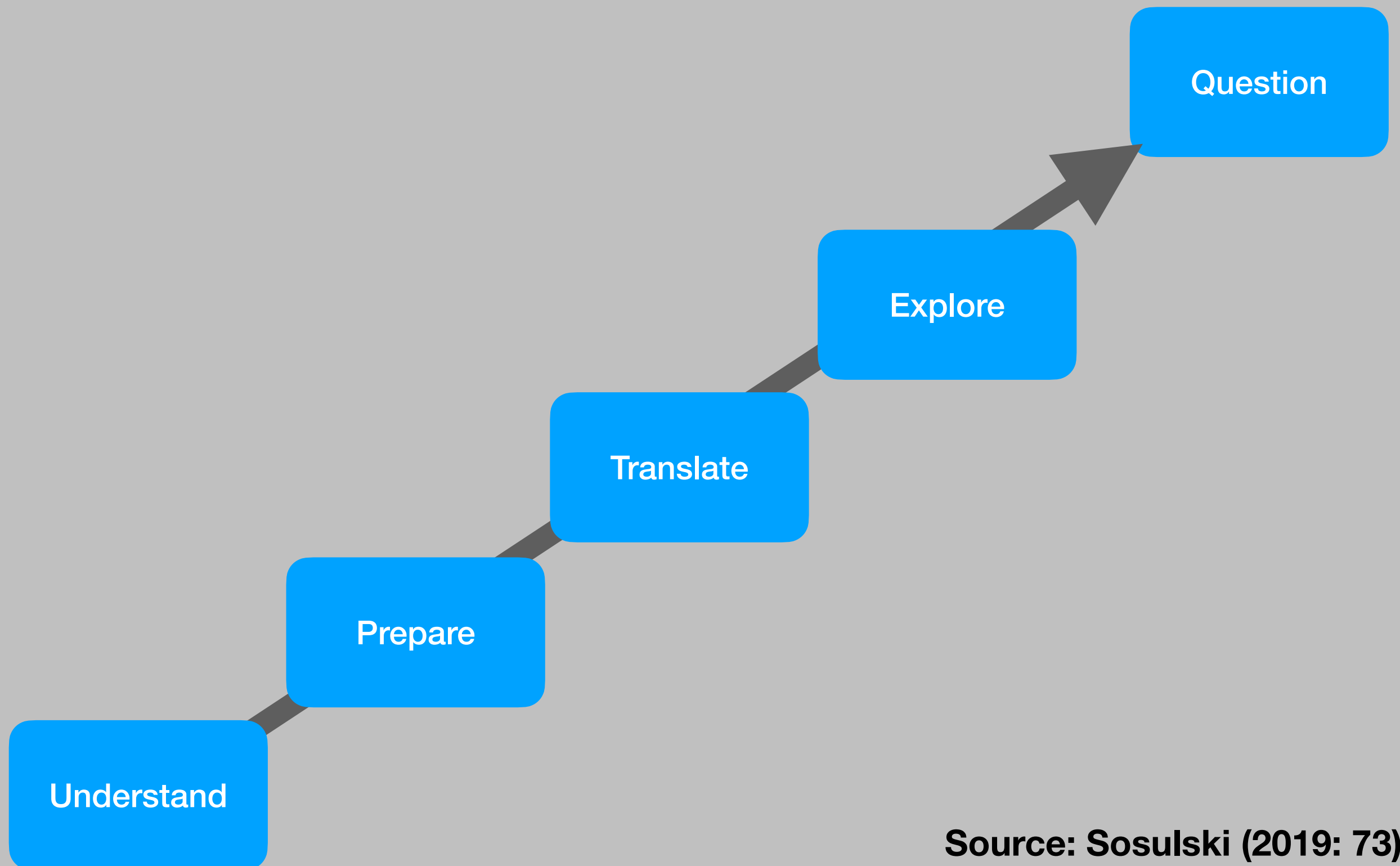
Today's Goals

- To understand:
 - What data are
 - How we extract information from data
 - How we should transform data before visualizing them

Data Handling

Preparation for Visualization

Extract Information from Data



Source: Sosulski (2019: 73)

Get Data You Are Interested In

- Governments and public organizations' data
 - ▶ [e-Stat](#)
 - ▶ [World Bank Open Data](#)
 - ▶ [IMF Data](#)
- Surveys
 - ▶ [International Social Survey Programme](#)
 - ▶ [World Values Survey](#)
- Many other data are available!

Data Format

- General purpose data format
 - .csv (comma separated values)
 - .tsv (tab separated values)
 - .txt (text data; table format data)
- Data for specific applications
 - .xlsx or .xls (Excel)
 - .Rds, .RData (R)
 - .dta (Stata) or .sav (SPSS) or .sas (SAS)
- Web-format data
 - .html, .xml, .json

Understand Your Data

- View the dataset
 - Open the dataset with a spreadsheet application
 - E.g., LibreOffice Calc, Microsoft Excel
 - Read the dataset with R
- Read the codebook (dictionary) of the data
 - What does each variable measures?
 - What do values of each variable represent?
 - How were the data collected?

Example: Bike Sharing Data

- Some questions about bike sharing
 - What time of year is most popular for bike rentals?
 - What's the most popular day of the week for bike rentals?
 - What's the frequency of use for the average user?
 - What are the most and least congested bike stations?
- Get the data: <https://archive.ics.uci.edu/ml/datasets/bike+sharing+dataset> (or google “bike sharing data”)

Understand Bike Sharing Data

- What are in rows?
 - How many rows? (Or what is the sample size?)
- What are in columns?
 - What variables does the file contain?
- What does each variable measure?
 - Read the codebook, dictionary, or Readme

Transform Data

- Most of the times, you cannot analyze data you got as they are
- You need to transform the data set somehow
 - Rename variables
 - Change the type of variables (e.g., character to factor)
 - Decide how to deal with missing values
 - Scale values (e.g., standardize, take natural log)
 - Transform wide data into long data
 - Aggregate values by group

Tidy Data

(Review)

How Should We Prepare a Dataset?

- To analyze data with R, we need a dataset in a nice format
 - Something that we can easily handle
 - One answer: tidy data

Tidy Data

- Proposed by Hadley Wickham
- Tidy data: structure and meaning matches
- Non tidy data: messy data
- We want to prepare tidy data for our data visualization and analysis

Four Conditions of Tidy Data

1. Each variable is a column
2. Each observation is a row
3. Each type of observational unit is a table
4. Each value is a cell

Weather in 3 Cities: Messy Data

| City | 6 | 12 | 18 |
|-------|--------|-------|--------|
| Kochi | Sunny | Sunny | Cloudy |
| Tokyo | Cloudy | Rainy | Rainy |
| Osaka | Rainy | Sunny | Sunny |

Weather in 3 Cities: Tidy Data

| City | Time | Weather |
|-------|------|---------|
| Kochi | 6 | Sunny |
| Kochi | 12 | Sunny |
| Kochi | 18 | Cloudy |
| Tokyo | 6 | Cloudy |
| Tokyo | 12 | Rainy |
| Tokyo | 18 | Rainy |
| Osaka | 6 | Rainy |
| Osaka | 12 | Sunny |
| Osaka | 18 | Sunny |

Tidy vs. Messy Data

- Tidy data are not always better than messy data
 - To human eyes, messy data might look nicer: our example of weather
- However, for data analysis, tidy data is better, because it is easier to handle them than messy data

Variables and Columns in Messy Data

Time

City

City

Weather

| City | 6 | 12 | 18 |
|-------|--------|-------|--------|
| Kochi | Sunny | Sunny | Cloudy |
| Tokyo | Cloudy | Rainy | Rainy |
| Osaka | Rainy | Sunny | Sunny |

18

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Variables and Columns in Tidy Data

| City | Time | Weather |
|-------|------|---------|
| Kochi | 6 | Sunny |
| Kochi | 12 | Sunny |
| Kochi | 18 | Cloudy |
| Tokyo | 6 | Cloudy |
| Tokyo | 12 | Rainy |
| Tokyo | 18 | Rainy |
| Osaka | 6 | Rainy |
| Osaka | 12 | Sunny |
| Osaka | 18 | Sunny |

Observations and Rows in Messy Data

| City | 6 | 12 | 18 |
|-------|--------|-------|--------|
| Kochi | Sunny | Sunny | Cloudy |
| Tokyo | Cloudy | Rainy | Rainy |
| Osaka | Rainy | Sunny | Sunny |

one observation

Observations and Rows in Tidy Data

| City | Time | Weather |
|-------|------|---------|
| Kochi | 6 | Sunny |
| Kochi | 12 | Sunny |
| Kochi | 18 | Cloudy |
| Tokyo | 6 | Cloudy |
| Tokyo | 12 | Rainy |
| Tokyo | 18 | Rainy |
| Osaka | 6 | Rainy |
| Osaka | 12 | Sunny |
| Osaka | 18 | Sunny |

one observation

Each Type of Observational Unit is a Table

- In a single table (or dataset), you have only one type of observational unit
 - E.g. Each observation is an individual person, or each observation is a country

Messy Data with Multiple Types of Observational Unit

| Country | Presidential? | City | Population (million) |
|---------|---------------|-------------|-------------------------|
| Japan | No | Tokyo | 9.4 |
| Japan | No | Osaka | 2.7 |
| Japan | No | Nagoya | 2.3 |
| USA | Yes | New York | 8.5 |
| USA | Yes | Chicago | 2.7 |
| USA | Yes | Los Angeles | 3.9 |

Observational Unit:
Country

Observational Unit:
City

Tidy Data with One Types of Observational Unit

| City | Population (million) | Country |
|------------|----------------------|---------|
| Tokyo | 9.4 | Japan |
| Osaka | 2.7 | Japan |
| Nagoya | 2.3 | Japan |
| New York | 8.5 | USA |
| Chicago | 2.7 | USA |
| Los Angles | 3.9 | USA |

Observational Unit:
City

Key to connects two tables

| Country | Presidential |
|---------|--------------|
| Japan | No |
| USA | Yes |

Observational Unit:
Country

Each Value Is a Cell

Tidy Data

| City | Time | Weather |
|-------|------|---------|
| Kochi | 6 | Sunny |
| Kochi | 12 | Sunny |
| Kochi | 18 | Cloudy |
| Tokyo | 6 | Cloudy |
| Tokyo | 12 | Rainy |
| Tokyo | 18 | Rainy |
| Osaka | 6 | Rainy |
| Osaka | 12 | Sunny |
| Osaka | 18 | Sunny |

Messy Data

| City | Time | Weather |
|-------|---------|---------|
| Kochi | 6 & 12 | Sunny |
| Kochi | 18 | Cloudy |
| Tokyo | 6 | Cloudy |
| Tokyo | 12 & 18 | Rainy |
| Osaka | 6 | Rainy |
| Osaka | 12 & 18 | Sunny |

Structures and Meanings Should Match

- In tidy data
 - Column: a variable
 - Row: an observation
 - Cell: a value
 - Table: information of one type of observational unit
- We want to know meanings of relationship between variables
- When we analyze data, we write commands that unitize the structure of data

Exploring Data by Making Graphs

Statistics

- First step of exploring data: calculate statistics
 - Central tendency: mean, median, mode
 - Variability of the variable: variance, standard deviation, ranges, IQR
 - More details: kurtosis, skewness, etc.
- Might need to transform data to calculate statistics by group
 - E.g., Bike rentals by month

A Variety of Plots

- There exist a lot of different types of plots: E.g.,
 - Bar charts
 - Histograms / density plots
 - Box[-and-whisker] plots / violin plots
 - Scatter plots
 - Line plots
- Need to choose the best one for your purpose

Exercises

- Show the following by both statistics and graphs
 - Frequency of bike rentals in 2012
 - Bike rentals by month in 2012
 - Relationship between temperature and bike rentals
 - Differences in bike rentals by month between 2011 and 2012
- First assignment
 - Make a single pdf file containing the answers to the above questions
 - Filename: info3_YourName_hw01.pdf (YourName should be your name: e.g., info3_YukiYanai_hw01.pdf)
 - **Deadline: 6 pm on Thursday, Oct 13, 2022**
 - **Submit the file at KULMS**

Next class

3. Good Visualization