Data in Spreadsheets

Stat 133 with Gaston Sanchez

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Leia Organa Female 1.50m tall



Luke Skywalker Male 1.72m tall



Han Solo Male 1.80m tall

Working with spreadheets?

| name | gender | height |
|----------------|--------|--------|
| Leia Organa | female | 1.50 |
| Luke Skywalker | male | 1.72 |
| Han Solo | male | 1.80 |



Analyst /Scientist

Tables in Spreadsheets



| | Α | В | С |
|---|----------------|--------|--------|
| 1 | name | gender | height |
| 2 | Leia Organa | female | 1.50 |
| 3 | Luke Skywalker | male | 1.72 |
| 4 | Han Solo | male | 1.80 |

Storing a data table

Many people enter and store their data in spreadsheets

e.g. MS Excel, Google Sheets, Apple Numbers

Using spreadsheet provides a nice graphical display of a table's content

Using spreadsheet software brings (a deceptive) comfort

In my humble opinion

Spreadsheets do have a role and a place in the toolkit of a data scientist.

In fact, they could be used in any stage of the Data Analysis Cycle.

But keep in mind that they enormously **reduce reproducibility**. And they should not be used as your default data-storage option.

Data in spreadsheets ...

Are so ubiquitous

Can be easy to work with

But can be a sloppy mess

Let's discuss Karl Broman's proposed recommendations when organizing data in spreadsheets.

https://kbroman.org/dataorg/

Data organization in spreadsheets.

By Karl Broman, and Kara Woo (2018)

The American Statistician 78:2–10

(doi:10.1080/00031305.2017.1375989)

Be Consistent

Avoid inconsistent codes for variables (don't)



| | А | В | С |
|---|----------------|--------|----------|
| 1 | name | gender | height |
| 2 | Leia Organa | female | 1.50 |
| 3 | Luke Skywalker | MALE | 1m 72 cm |
| 4 | Han Solo | male | 1.80 |
| 5 | Padme Amidala | F | 145 cm |

Use consistent codes for variables (do)



| | A | В | С |
|---|----------------|--------|--------|
| 1 | name | gender | height |
| 2 | Leia Organa | female | 1.50 |
| 3 | Luke Skywalker | male | 1.72 |
| 4 | Han Solo | male | 1.80 |
| 5 | Padme Amidala | female | 1.45 |

Avoid several codes for missing values (don't)



| | A | В | С |
|---|----------------|--------|--------|
| 1 | name | gender | height |
| 2 | Leia Organa | female | 1.50 |
| 3 | Luke Skywalker | male | ? |
| 4 | Han Solo | male | 1.80 |
| 5 | Padme Amidala | female | 9999 |

Use a single fixed code for missing values (do)



| | A | В | С |
|---|----------------|--------|--------|
| 1 | name | gender | height |
| 2 | Leia Organa | female | 1.50 |
| 3 | Luke Skywalker | male | NA |
| 4 | Han Solo | male | 1.80 |
| 5 | Padme Amidala | female | NA |

Consistency in general

Naming style:

- Variables
- IDs
- NAs
- Files
- Dates
- Layouts
- Annotations

Dates

PUBLIC SERVICE ANNOUNCEMENT:

OUR DIFFERENT WAYS OF WRITING DATES AS NUMBERS CAN LEAD TO ONLINE CONFUSION. THAT'S WHY IN 1988 ISO SET A GLOBAL STANDARD NUMERIC DATE FORMAT.

THIS IS THE CORRECT WAY TO WRITE NUMERIC DATES:

2013-02-27

THE FOLLOWING FORMATS ARE THEREFORE DISCOURAGED:

02/27/2013 02/27/13 27/02/2013 27/02/13 20130227 2013.02.27 27.02.13 27-02-13 27.2.13 2013. Π . 27. $\frac{27}{2}$ -13 2013.158904109 MMXIII-II-XXVII MMXIII $\frac{LV\Pi}{CCCLXV}$ 1330300800 ((3+3)×(111+1)-1)×3/3-1/3³ 2023 $\frac{2}{5}$ 10/11011/1101 02/27/20/13 $\frac{2}{5}$ 1 $\frac{1}{2}$ $\frac{1}{3}$ 7

No empty cells

Avoid blank/empty cells (don't)



| | A | В | С |
|---|----------------|--------|----------|
| 1 | name | gender | titles |
| 2 | Leia Organa | female | princess |
| 3 | | | senator |
| 4 | | | general |
| 5 | Luke Skywalker | male | knight |
| 6 | | | master |
| 7 | Han Solo | male | captain |

Fill in all cells (do)



19

| | Α | В | С |
|---|----------------|--------|----------|
| 1 | name | gender | titles |
| 2 | Leia Organa | female | princess |
| 3 | Leia Organa | female | senator |
| 4 | Leia Organa | female | general |
| 5 | Luke Skywalker | male | knight |
| 6 | Luke Skywalker | male | master |
| 7 | Han Solo | male | captain |

Gaston Sanchez

Various things in a cell (don't)



| | A | В | С |
|---|----------------|-------------|--------|
| 1 | name | gender-jedi | height |
| 2 | Leia Organa | female (no) | 1.50 m |
| 3 | Luke Skywalker | male (yes) | 1.72 m |
| 4 | Han Solo | male (no) | 1.80 m |
| 5 | Padme Amidala | female (no) | 1.45 m |

Put just one thing in a cell (do)



| | А | В | С | D |
|---|----------------|--------|-------|----------|
| 1 | name | gender | jedi | height_m |
| 2 | Leia Organa | female | FALSE | 1.50 |
| 3 | Luke Skywalker | male | TRUE | 1.72 |
| 4 | Han Solo | male | FALSE | 1.80 |
| 5 | Padme Amidala | female | FALSE | 1.45 |

Tidy Data

Data tidying

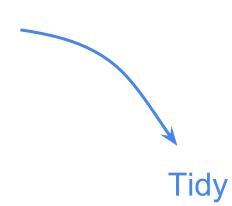
Tidiness: "The state or quality of being arranged neatly and in order"

Tidy Data:

- Each variable forms a column
- Each observation forms a row
- Each type of observational unit forms a table

Messy

| | А | В | С |
|---|----------------|-------------|--------|
| 1 | name | gender-jedi | height |
| 2 | Leia Organa | female (no) | 1.50 m |
| 3 | Luke Skywalker | male (yes) | 1.72 m |
| 4 | Han Solo | male (no) | 1.80 m |
| 5 | Padme Amidala | female (no) | 1.45 m |



| | А | В | С | D |
|---|----------------|--------|-------|----------|
| 1 | name | gender | jedi | height_m |
| 2 | Leia Organa | female | FALSE | 1.50 |
| 3 | Luke Skywalker | male | TRUE | 1.72 |
| 4 | Han Solo | male | FALSE | 1.80 |
| 5 | Padme Amidala | female | FALSE | 1.45 |

Messy

| | А | В | С | D | E |
|---|----------------|--------|---------|--------|---------|
| 1 | name | month1 | budget1 | month2 | budget2 |
| 2 | Leia Organa | Jan | 1000 | Feb | 1200 |
| 3 | Luke Skywalker | Jan | 500 | Feb | 400 |
| 4 | Han Solo | Jan | 2000 | Feb | 1800 |



| | Α | В | С |
|---|----------------|-------|--------|
| 1 | name | month | budget |
| 2 | Leia Organa | Jan | 1000 |
| 3 | Leia Organa | Feb | 1200 |
| 4 | Luke Skywalker | Jan | 500 |
| 5 | Luke Skywalker | Feb | 400 |
| 6 | Han Solo | Jan | 2000 |
| 7 | Han Solo | Feb | 1800 |

More on Tidy Data ...

Tidy Data paper

https://vita.had.co.nz/papers/tidy-data.pdf

Tidy data vignette

https://cran.r-project.org/web/packages/tidyr/vignettes/tidy-data.html

Chapter 12: Tidy Data (R4DS)

https://r4ds.had.co.nz/tidy-data.html

Create a Data Dictionary

Data Dictionary File

Use a separate file that explains what all the variables are.

This file is what some authors call **metadata** (information about your data).

I recommend using a plain text file (.txt or .md) to create a data dictionary.

Data Dictionary contents

The exact variable name as in the data file

A longer explanation about what the variable means

Suggested data type (e.g. int, real, boolean)

The measurement units

How missing values are codified (if any)

Expected minimum and maximum, perhaps

Say you have some data like this

| | А | В | С | D |
|---|----------------|--------|-------|----------|
| 1 | name | gender | jedi | height_m |
| 2 | Leia Organa | female | FALSE | 1.50 |
| 3 | Luke Skywalker | male | TRUE | 1.72 |
| 4 | Han Solo | male | FALSE | 1.80 |
| 5 | Padme Amidala | female | FALSE | NA |

Data Dictionary: example

name: first and last name of an individual
(character)

gender: reported gender "female", "male" (character)

jedi: is the individual a jedi knight? TRUE, FALSE (logical)

height: height in meters; missing values as NA (real or double)

No calculations

No calculations in the raw data files

Many users include calculations and graphs in spreadsheet files.

Doing calculations imply opening a file and typing things (running the risk of typing junk).

Your primary data file should contain just the data and nothing else (no calculations, no graphs).

Enriched Formatting

Avoid color/highlighting as data



| | A | В | С |
|---|----------------|--------|---|
| 1 | name | height | |
| 2 | Leia Organa | 1.50 | |
| 3 | Luke Skywalker | 1.72 | |
| 4 | Han Solo | 1.80 | |

female

male

Avoid color/highlighting as data



| | А | В | С |
|---|----------------|--------|--------|
| 1 | name | gender | height |
| 2 | Leia Organa | female | 1.50 |
| 3 | Luke Skywalker | male | 1.72 |
| 4 | Han Solo | male | 1.80 |

Save data in plain text files

Spreadsheet inconveniences

Excel files (.xls) are NOT text files

They are **enriched** files with added format elements

Cannot be opened with a text editor

You typically depend on *proprietary* software, and commercial fees perhaps

What happens when you try to open a spreadsheet file in a text editor?

Still want to save tables as .xlsx (or .xls)?

Every time you save a data file in .xlsx format ...



God kills a kitten

Good Practice

Whenever you work with some source of data stored in a native spreadsheet format (e.g. .xls, .xlsx, .numbers), always generate a text version (e.g. .csv, .txt, .dat)