



Workflows for Reproducible Research with R & Git

Computer Literacy

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Computer literacy live demo



The script `create-project.sh` can be found in `./content/sh/` or, to be more, precise: <https://github.com/jobreu/reproducible-research-gesis-2023/tree/main/content/sh>.

Also, it is a bash script and need to be run in a Bash shell, e.g., Git Bash.

(Icons made by [Freepik](#) from www.flaticon.com)

Overview

Computer literacy as a barrier to reproducibility

- There exists multiple barriers to reproducibility
- In "The Turing Way", some of these **Barriers to reproducibility** are introduced
- Among them:
 - Big data and complex computational infrastructure
 - Takes time
 - Requires additional skills (computer literacy)

Overall objective

- Introduce concepts on how to efficiently use your computer in a research context
- Provide necessary skills for subsequent modules
- Topics that will be covered:
 - Be lazy, but trustworthy!
 - Organization of a research project on a computer (file/folder structure, naming conventions, etc.)
 - Working with files and folders (file system, absolute and relative paths, working directory)
 - Using a command-line interface (CLI)
 - The beauty of plain text

Disclaimer

- Targets MS Windows user
- Your mileage may vary...

Two guiding principles of reproducibility

Be lazy!

Be trustworthy!

Be lazy!

Hilary Parker @hspter · May 13, 2015
Glad they were able to record my #rstatsnyc talk! I discuss how reproducibility = saving time



youtube.com
Reproducible Analysis in Production: Lessons from...
Delivered by Hilary Parker, Senior Data Analyst,
Etsy, at the inaugural New York R Conference in ...

10 35 76

Hadley Wickham @hadleywickham

Replying to @hspter

@hspter reproducibiliity is actually all about being as lazy as possible!

6:56 PM · May 13, 2015 · Echofon

(Source: <https://twitter.com/hadleywickham/status/598532170160873472>)

Some derived principles of being lazy

"Be lazy!"

1. Be consistent!

1. Create your own guidelines
2. Reduce cognitive burden
3. Reduce decision fatigue
4. ...

2. Automate as much as possible!

3. ...

Some derived principles of being a trustworthy researcher

| Be trustworthy!

1. Document everything and be transparent in your research!
2. Share all materials (if possible)!
3. Ideally, also document and share workflows (→ automation)
4.

Organization of a research project

Research projects on your computer

- What is a "project"?

"A series of tasks linked to a goal, with a deadline." -- **Tiego
Forte**

- A research project can be writing a paper, giving a conference presentation or a lecture, ...
- Ideally, all information, materials, data, ..., should be located in a distinct project folder (also, see R projects,
<https://r4ds.had.co.nz/workflow-projects.html>)
- That is, on your computer, everything you need to complete the project should be stored inside *one* folder (which, of course, can/should have multiple subfolders) -- "a project should be self-sufficient"

A project's folder structure

- Be consistent! That is, a uniform folder structure helps to find items in older projects
- Choose a structure and naming convention that fit your working style
- Generally, folder and file names should consist of the letters **a-z**, the number **0-9**, underscores, **and should never include a blank space**
- I also use hyphens "–" sometimes, e.g., `mail_weiss-bernd.pdf`, then, the underscore is used to separate semantically different parts (e.g., `ps2021-03_gesis-panel-meet-the-expert`, `ps2020-11_utrecht_bigsurv20`)
- Furthermore, it is advisable to never use capital letters, as this will increase the likelihood of being inconsistent
- Folder and file names should be as short as possible, but as long as necessary to bring across the gist of its function/content

Folder structure of a paper

Name	Änderungsdatum	Typ	Größe
📁 .git	08.01.2021 06:25	Dateiordner	
📁 .Rproj.user	08.01.2021 06:25	Dateiordner	
📁 data	08.01.2021 06:26	Dateiordner	
📁 fig	08.01.2021 06:26	Dateiordner	
📁 lit	08.01.2021 06:26	Dateiordner	
📁 material	08.01.2021 06:26	Dateiordner	
📁 org	08.01.2021 06:26	Dateiordner	
📁 pub	08.01.2021 06:26	Dateiordner	
📁 published	08.01.2021 06:26	Dateiordner	
📁 review	08.01.2021 06:26	Dateiordner	
📁 revision	02.06.2020 08:52	Dateiordner	
📁 src	08.01.2021 06:26	Dateiordner	
📁 submission	08.01.2021 06:26	Dateiordner	
📁 submit	02.06.2020 08:52	Dateiordner	
📁 tables	08.01.2021 06:26	Dateiordner	
📝 .gitignore	02.06.2020 08:51	GITIGNORE-Datei	1 KB
Ր pu2020gp-corona-bias.Rproj	02.06.2020 08:52	R Project	1 KB

This is related to a paper by Schaurer/Weiβ on **Investigating selection bias of online surveys on coronavirus-related behavioral outcomes.**

Folder structure of a conference presentation

Name	Änderungsdatum	Typ	Größe
.git	11.09.2021 06:33	Dateiordner	
.Rproj.user	02.10.2021 05:07	Dateiordner	
data	29.08.2021 18:14	Dateiordner	
lit	30.08.2021 06:48	Dateiordner	
material	29.08.2021 19:46	Dateiordner	
org	30.09.2021 07:34	Dateiordner	
slide	11.09.2021 06:33	Dateiordner	
src	19.08.2021 17:49	Dateiordner	
.gitignore	25.11.2020 09:45	GITIGNORE-Datei	1 KB
.Rhistory	11.09.2021 06:33	RHISTORY-Datei	19 KB
ps2021-09_virtuell_gor21.Rproj	09.09.2021 07:01	R Project	1 KB

This is related to a GOR presentation on "Investigating self-selection bias of online surveys on COVID-19 pandemic-related outcomes and health characteristics"

Data Carpentry's project layout

The following guidelines are copied from the Data Carpentry website on "[Introduction to automation](#)" and aim at specific workflow utilizing R, Rmarkdown, and knitr:

- data:

the original raw data, you shouldn't edit or otherwise alter any of the files in this folder. DATA ARE READ ONLY. If they are encoded in a supported file format, they'll automatically be loaded when you call `load.project()`.

- cache:

Here is where you will store any data sets that (a) are generated during a preprocessing step and (b) don't need to be regenerated every single time you analyze your data. You can use the `cache()` function to store data to this directory automatically. Any data set found in both the cache and data directories will be drawn from cache instead of data based on ProjectTemplate's priority rules. We write them to .csv files (comma seperated values) so they are machine readable and can be easily shared.

Data Carpentry's project layout

- graphs:

the folder where we can store the figures used in the project In our example, the figures are generated directly during the rendering of the RMarkdown file for the manuscript, but having the figures as standalone files may facilitate getting feedback from your collaborators, or save time if you just work on tweaking its appearance without having to recompile the full manuscript.

- src:

our R code (the functions that will generate the intermediate datasets, the analyses, and the figures), it's often easier to keep the prose separated from the code. If you have a lot of code (and/or if the manuscript is long), it's easier to navigate.

- tests:

the code to test that our functions are behaving properly and that all our data is included in the analysis. There are other directories that you may not need as a newcomer, but these will come on handy as you increase your knowledge and prowess with R.

(Source: <https://datacarpentry.org/rr-automation/01-automation/index.html>)

More suggestions to structure a data analysis project

- Structure Your Data Science Projects
- Managing a statistical analysis project – guidelines and best practices
- Creating a research compendium w/ rrtools
- Management of R project
- The Basic Reproducible Workflow Template
- ...

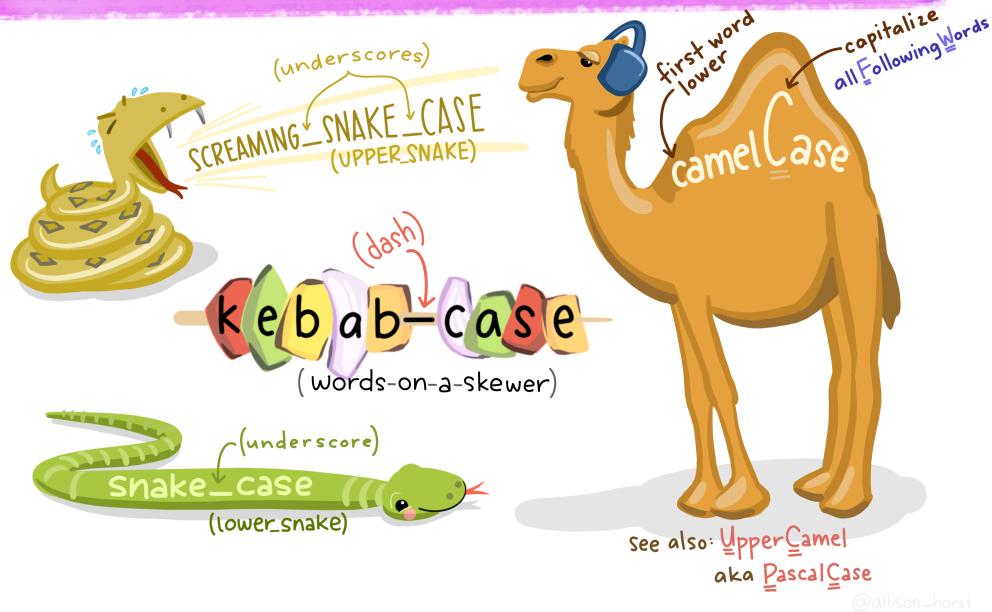
Existing naming conventions (for files/folders, variable names etc.)

- Choose one naming convention and stick with it!
- Avoid any whitespace characters
- Some of the following examples are syntactically invalid in some programming languages, e.g., "kebab-case" does not work in R

- Some of the most popular ways to combine words into a single string:
 - CamelCase
 - camelCase
 - **pothole_case/snake_case**
 - kebab-case
 - this.case
 - likethis
 - ...

(Source: Case Styles: Camel, Pascal, Snake, and Kebab Case)

in that case...



(Source: Artwork by @allison_horst)

Where to store your data?

(the following applies to MS Windows only, the underlying principle, though, is universal)

- Quite often, only the C: drive is initialized
- Most Windows software suggests to save your files in your "home directory", e.g. C:\Users\Weiss
- If, for some reasons, you cannot start your computer and need to reinstall everything, all your data is gone!
- My suggestion: setup at least a second drive (D:), which is for your data only

- Below is my setup, which I have been applying for the last 20 years (the Google Drive is new, though):

▼ Geräte und Laufwerke (4)

 System_W10 (C:)	Lokaler Datenträger	149 GB	23,4 GB
 Daten (D:)	Lokaler Datenträger	126 GB	6,79 GB
 Volume (E:)	Lokaler Datenträger	200 GB	3,20 GB
 Google Drive (L:)	Lokaler Datenträger	149 GB	22,2 GB

Backup your data

Just do it!

(Two years ago, I bought a NAS server and it has served me well since then.)

Working with files and folders

Why bother?

- When you write code, you often need to read or save data
- For your RMarkdown document, you will store data, figures, tables etc. in different folders, and you need to access this information/material
- So, you need to tell the software where your data can be found
- How do you ensure that your code or your RMarkdown document can be processed on your colleague's computer, your next computer, a remote server?

Examples of a folder/file path

- MS Windows: Folder path to my former workshop materials
`E:\syncwork\projects\confer\ps2021-10-ws-repro-research`
- Linux (MSYS2): Folder path to my workshop materials
`/E/syncwork/projects/confer/ps2021-10-ws-repro-research`
- Full file path specified in Stata to load a dataset (MS Windows): use
`"J:\Work\PARI\PARI-F\data\pari-f_data_v0-1.dta"`
- Full file path specified in R to load a dataset (MS Windows):
`read.dta ("J:/Work/PARI/PARI-F/data/pari-f_data_v0-1.dta")` (confusing? see below...)

(Note, these are all examples of *absolute path* specifications)

What is a path?

"A path to an entity (in this case, a file, folder, or web page) describes the entity's unique location within a hierarchical directory or website structure"
(<https://www.educative.io/edpresso/absolute-vs-relative-path>).

What is a path?

"A path is a string of characters used to uniquely identify a location in a directory structure. It is composed by following the directory tree hierarchy in which components, separated by a delimiting character, represent each directory. The **delimiting character** is most commonly the **slash** ("/"), the **backslash character** ("\\"), or colon (":"), though some operating systems may use a different delimiter. Paths are used extensively in computer science to represent the directory/file relationships common in modern operating systems, [...]. Resources can be represented by either **absolute or relative paths**" (emphasis mine; [https://en.wikipedia.org/wiki/Path_\(computing\)](https://en.wikipedia.org/wiki/Path_(computing)))

Delimiting characters

THIS IS IMPORTANT !!\$!!!"§!111111

- Delimiting characters / or \ vary by operating system
- MS Windows:
 - Use a colon : to specify the drive name (e.g., c :, d :, e :)
 - Folders and files are separated by a backslash character (\)
 - Example: J:\Work\PARI\PARI-F\data\pari-f_data_v0-1.dta

- Linux/macOS:
 - No colon (:)
 - Use only the slash (/) character
 - Example: /E/syncwork/projects/confer/ps2021-10-ws-repro-research
 - Another (dynamically created) example showing the (full) path to my current working directory (using Python):

```
import pathlib
pathlib.Path().resolve()
```

```
## WindowsPath('//cryptomator-vault/xgSuePjj9Ih0/syncwork/projects/confer/reproducible-researc
```

Delimiting characters in R, *LATEX*, Python, ... under MS Windows

- Software, such as R, *LATEX*, and Python, with a Linux/UNIX background behaves differently under MS Windows when it comes to specifying file/folder paths
- That is, when specifying a path (e.g., in R or *LATEX*) in MS Windows, these programs do not like the backslash character (\) (the backslash is used for "escaping" other characters)

- Two solutions:
 - Use the slash character /, e.g.:

```
library(haven)
read.dta("J:/Work/PARI/PARI-F/data/pari-f_data_v0-1.dta")
```

- Escape the backslash character via \\, e.g.:

```
library(haven)
read.dta("J:\\Work\\\\PARI\\\\PARI-F\\\\data\\\\pari-f_data_v0-1.dta")
```

- For more information see, e.g.,
<https://www.dummies.com/programming/r/how-to-work-with-files-and-folders-in-r/>

- Note: Many programming languages/statistical packages (R, Python, ...) can dynamically create a full path that follows the rules of the respective operating system:

- R:

```
file.path("J:", "Work", "PARI", "PARI-F", "data", "pari-f_data_v0-1.dta"
[1] "J:/Work/PARI/PARI-F/data/pari-f_data_v0-1.dta"
```

- Python:

```
import os
os.path.join("e:", "folder1", "folder2", "file")
```

returns: 'e:folder1\\folder2\\file' (in Windows)

- Stata, actually, does not care...
 - `use "J:\Work\PARI\PARI-F\data\pari-f_data_v0-1.dta"`
 - `use "/Work/PARI/PARI-F/data/pari-f_data_v0-1.dta"`
- Johannes suggests a handy tool when working on both operating system: **Path Copy Copy -- Copy file paths from Windows explorer's contextual menu**

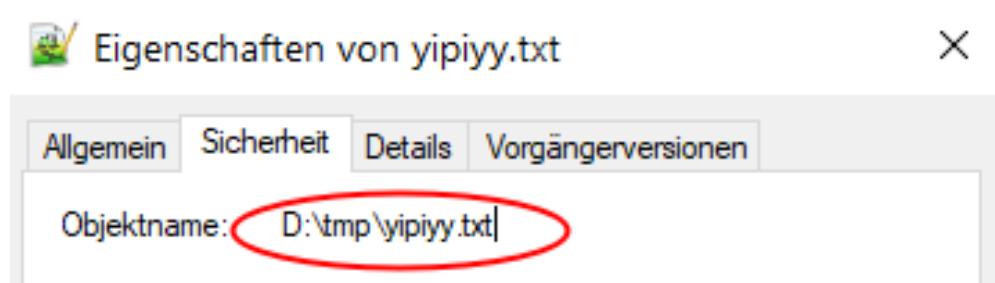
Absolute and relative paths

- There exist two types of paths: absolute or relative paths
- Example of an absolute path (in MS Windows):
J:\Work\PARI\PARI-F\data\pari-f_data_v0-1.dta
- Example of a relative path (in MS Windows): ..\data\pari-f_data_v0-1.dta

(Source: <https://www.earthdatascience.org/courses/intro-to-earth-data-science/python-code-fundamentals/work-with-files-directories-paths-in-python/>)

Absolute paths (or full path)

- Contains the entire path to the file or directory that you need to access
- It will begin at your computer's root directory (or respective Windows' drive) and will end with the file or directory that you wish to access
- E.g., in MS Windows: J:\Work\PARI\PARI-F\data\pari-f_data_v0-1.dta or D:\tmp\yipiyy.txt



- In Linux or macOS: /home/weiss/important/yipiyy.txt
- **Avoid using absolute paths as much as possible since it reduces the portability of your project (your colleague's computer, someone who wants to reproduce your analyses)**

Working directory and relative paths

- A relative path is relative to a "fixed location" on your computer
- Often, this "fixed location" is the so-called "working directory"
- So, when starting your data analysis, you first define your "working directory" as absolute path -- **this is done just once!**

- All other file- or folder-related operations are defined relative to this working directory
- **The huge benefit: when you share your project with a colleague or move it to a new computer, you only have to define the working directory once, everything else should work flawlessly**
- How to define a working directory?
 - R: `setwd("full-path-to-working-directory")`
 - Stata: `cd "full-path-to-working-directory"` (`cd`= change directory)
 - Python: `import os; os.chdir("full-path-to-working-directory")`
- (Note: in R you can also use the `here` package; RStudio users are referred to RStudio projects, for more information see [Why should I use the here package when I'm already using projects?](#))

- How to get information about the current working directory?
 - R: `getwd()`

```
> getwd()
[1] "D:/Eigene Dateien/Dokumente"
```

- Stata: `cd`

```
.cd
C:\Program Files\Stata15
```

- Python: `import os; os.getcwd()` (`cwd` = current working directory); see below for an example

```
import os
os.getcwd()
```

- So, let's assume the project "PARI-F" is located on drive J:, the full absolute path is J:\Work\PARI\PARI-F
- The content of the project's folder PARI-F is:

```
.  
|-- analysis  
|-- data  
|-- doc  
|-- pari-f.stpr  
`-- report
```

- Loading a dataset located in folder data, can be accomplished as follows:
 - In R: `r library(haven); library(ggplot2)

Define working directory
just once.

- In Stata:

```
cd "J:/Work/PARI/PARI-F" // Define working directory just once.  
use "data/pari-f_data_v0-5.dta", clear  
...  
scatter x y  
graph export "doc/my-fancy-plot.pdf"
```

Shortcuts (. and .. and ~)

See also [https://en.wikipedia.org/wiki/Path_\(computing\)](https://en.wikipedia.org/wiki/Path_(computing))

- The dot . denotes the current working directory
- The dot dot .. denotes the parent directory, i.e., it points upwards in the folder hierarchy
- Example in R

```
library(haven); library(ggplot2)
setwd("J:/Work/PARI/PARI-F/data") # Define working directory just once, now we are in /data
read.dta("pari-f_data_v0-5.dta") # Absolute path: J:/Work/PARI/PARI-F/data/pari-f_data_v0-5.dta
## more code...
## plot something
ggsave("../doc/my-fancy-plot.pdf") # Read:
# - We are in J:/Work/PARI/PARI-F/data
# - The plot should be saved to J:/Work/PARI/PARI-F/doc
# - ".." = go to parent folder of data, i.e., J:/Work/
# - Then, go to folder /doc and store the plot in this
```

- Finally, the tilde symbol ~ will bring you back to your home directory, e.g. cd ~

Using a command-line interface (CLI)

MS Window's default command-line interpreter (cmd .exe)

```
Administrator: C:\Windows\System32\cmd.exe

E:\>cd syncwork

E:\syncwork>dir
Datenträger in Laufwerk E: ist Volume
Volumeseriennummer: 5D41-130C

Verzeichnis von E:\syncwork

11.09.2021  05:37    <DIR>      .
11.09.2021  05:37    <DIR>      ..
04.11.2021  05:55    <DIR>      areas
04.11.2021  05:55    <DIR>      projects
04.11.2021  05:55    <DIR>      resources
                           0 Datei(en),          0 Bytes
                           5 Verzeichnis(se), 3.715.821.568 Bytes frei

E:\syncwork>
```

Windows PowerShell

```
Administrator: Windows PowerShell
Windows PowerShell
Copyright (C) Microsoft Corporation. Alle Rechte vorbehalten.

Lernen Sie das neue plattformübergreifende PowerShell kennen.

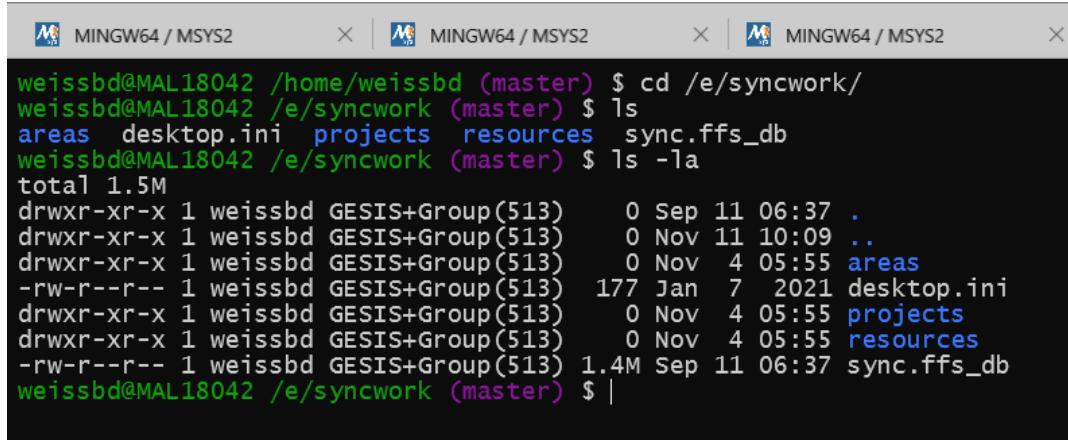
Das Laden von persönlichen und Systemprofilen dauerte 1537 ms.
(base) PS C:\Users\weissbd> e:
(base) PS E:\> cd .\syncwork\
(base) PS E:\syncwork> dir

Verzeichnis: E:\syncwork

Mode                LastWriteTime      Length Name
----                -----          ---- 
d-----        04.11.2021      05:55    areas
da----        04.11.2021      05:55  projects
d-----        04.11.2021      05:55 resources

(base) PS E:\syncwork> -
```

The Bash shell (Linux, macOS, MS Windows, ...)

A screenshot of three terminal windows from the MSYS2 environment, each showing a different command prompt and output. The first window shows the user navigating to a directory and listing files. The second window shows a detailed listing of files. The third window shows the user exiting the command line.

```
weissbd@MAL18042 /home/weissbd (master) $ cd /e/syncwork/
weissbd@MAL18042 /e/syncwork (master) $ ls
areas desktop.ini projects resources sync.ffa_db
weissbd@MAL18042 /e/syncwork (master) $ ls -la
total 1.5M
drwxr-xr-x 1 weissbd GESIS+Group(513) 0 Sep 11 06:37 .
drwxr-xr-x 1 weissbd GESIS+Group(513) 0 Nov 11 10:09 ..
drwxr-xr-x 1 weissbd GESIS+Group(513) 0 Nov 4 05:55 areas
-rw-r--r-- 1 weissbd GESIS+Group(513) 177 Jan 7 2021 desktop.ini
drwxr-xr-x 1 weissbd GESIS+Group(513) 0 Nov 4 05:55 projects
drwxr-xr-x 1 weissbd GESIS+Group(513) 0 Nov 4 05:55 resources
-rw-r--r-- 1 weissbd GESIS+Group(513) 1.4M Sep 11 06:37 sync.ffa_db
weissbd@MAL18042 /e/syncwork (master) $ |
```

What is a command-line interface (CLI)?

"A command-line interface (CLI) **processes commands** to a computer program in the form of **lines of text**. The program which handles the interface is called a command-line interpreter or command-line processor. Operating systems implement a command-line interface in a shell for interactive access to operating system functions or services. Such access was primarily provided to users by computer terminals starting in the mid-1960s, and continued to be used throughout the 1970s and 1980s on VAX/VMS, Unix systems and personal computer systems including DOS, CP/M and Apple DOS."

(emphasis mine; https://en.wikipedia.org/wiki/Command-line_interface)

And what is a shell?

"In computing, a shell is a computer program which exposes an operating system's services to a human user or other program. In general, operating system shells use either a command-line interface (CLI) or graphical user interface (GUI), depending on a computer's role and particular operation. It is named a shell because it is the outermost layer around the operating system."

([https://en.wikipedia.org/wiki/Shell_\(computing\)](https://en.wikipedia.org/wiki/Shell_(computing)))

Okay, but why?!

- Fast and efficient way to interact with your computer
- Important part of your automation toolbox to create a reproducible data analysis pipeline
- "1-Click Reproducibility" or better (but less catchy): "1-Command-on-a-CLI Reproducibility"
- Many functions that RStudio provides are actually based on command-line tools (Git, pandoc, *LAT_EX*, ...) -- it might be helpful to understand what is happening under the hood

- Accessing a remote server almost always requires some sort of command line skills
- ...

(Source: [Piccolo, 2016](#))

I also recommend "Top ten reasons to learn to use the command line: Expanding your reproducibility tools", see https://riffomonas.org/code_club/2020-08-17-command-line-life

The Git Bash

- My CLI of choice is **the Bash**
- Linux/macOS user already have access to the Bash
- MS Windows user can use the "Git Bash"



Important commands

- Note, some of these commands depend on the respective operating system
- Almost all of these command can have several arguments, e.g., `ls -la`
- Linux cheatsheet: <https://files.fosswire.com/2007/08/fwunixref.pdf>
- MS Windows cheatsheet:
<http://www.cs.columbia.edu/~sedwards/classes/2015/1102-fall/Command%20Prompt%20Cheatsheet.pdf>

Description	Win	Linux, macOS (Bash)
Copy files, folders	copy	cp
Move files, folders	move	mv
List folder content	dir	ls
Create new folder	mkdir	mkdir
Change current folder	cd	cd
Show current path	echo %cd%	pwd
Danger zone No undo!		
Delete file(s)	del	rm
Delete folder(s)	rmdir	rm

A small script to create a project folder

The following small bash/shell script was introduced in the very beginning of this module. It initializes a new project folder. It even detects when you forget to submit a folder name for your project (can be found here: \content\sh\):

```
#!/bin/sh

# Yes, I had to google that...
# https://stackoverflow.com/questions/6482377/check-existence-of-input-argument-in-a-bash-shell-script
if [ $# -eq 0 ]
then
    echo "No arguments supplied! You stupid!!!!!!"
    exit 1
fi

mkdir $1
cd $1
mkdir data
mkdir src
mkdir output
touch .gitignore
touch README
```

Exercise

- Start the Git Bash
- List the content of the current folder via `ls -la`
- Determine where you are via `pwd`
- Go to the parent folder via `cd <your input>`
- Copy the content from my small script (see above, section , use the little copy-icon in the top-right corner) and past it into a text file, save the text file as `create-project.sh`
- Execute the script `./create-project.sh` (the `./` is important, for an explanation see [here](#)) without a folder name
- Execute the script `./create-project.sh <your-new-project>` with a folder name as argument

The power of plain text

It is 2023, why plain text?

- Version control (e.g., Git) works well (efficient, differences between versions are easy to understand) with plain text documents, .docx et al. not so much
- Future proof
- Can easily manipulated with external tools
- ...

Canonical reference: [The Plain Person's Guide to Plain Text Social Science](#) by Kieran Healy

Encoding

- Puh, what is (character) encoding?
- See also <https://www.w3.org/International/questions/qa-what-is-encoding.en>
- My only rule: Use utf-8
- If you run into trouble, use a search engine your trust... which will most likely lead to a Stackoverflow page
- Example: How to keep umlaut in R?

- Notepad++ is my tool of choice...
- On the command line (Linux/Bash), you can use the command file, see below for the encoding of my references file:

file references.bib

references.bib: Unicode text, UTF-8 text, with very long lines (1869)

The power of regular expressions

- "Regular expressions are specially encoded text strings used as patterns for matching sets of strings" -- **Fitzgerald, 2012**
- Regex = Regular expressions
- Regex can be really handy when it comes to:
 - Searching for highly standardized strings, e.g., Emails, URLs etc.
 - Search and replace in an automated fashion
 - Extract text
 - ...

- Regex are implemented in almost all programming languages, including Python, R, Stata

The following example utilizes Python for a brief demonstration of Regex. It uses the following sample text:

```
lalaal@gesis.org ysdfvysdfc sdcfasefasdf hhatz@gesis.org,  
aselkjcf nöasjfasö djfcapsodfak http://www.gesis.org/welt  
acsd1132 33.45 sklfdgssfd ef caois 12.1 willlst@gesis.org  
http://www.gesis.org/helloworld
```

```
import re

sample = """lalaal@gesis.org ysdfvysdfc sdcfasefasdf hhatz@gesis.org,  
aselkjcf nöasjfasö djfcapsodfak http://www.gesis.org/welt  
acsd1132 33.45 sklfdgssfd ef caois 12.1 willlst@gesis.org  
http://www.gesis.org/helloworld"""
```

```
print(sample)
```

```
## lalaal@gesis.org ysdfvysdfc sdcfasefasdf hhatz@gesis.org,  
## aselkjcf nöasjfasö djfcapsodfak http://www.gesis.org/welt  
## acsd1132 33.45 sklfdgssfd ef caois 12.1 willlst@gesis.org  
## http://www.gesis.org/helloworld
```

Extract all emails:

```
m = re.findall(r'[\w.+-]+@[ \w-]+\.\[\w.-\]+', sample)  
m
```

```
## ['lalaal@gesis.org', 'hhatz@gesis.org', 'willlst@gesis.org']
```

Extract all numbers:

```
m = re.findall(r'\d+', sample)  
m
```

```
## ['1132', '33', '45', '12', '1']
```

Automation and productivity

- There is a trade-off between automation and productivity
- Automation, learning the required skills, setting up your tool chain will take a lot of time -- but can also save a lot of time
- Find the sweet spot where you invest some time now to save -- in the long run -- more time and increase your productivity
- "Find the sweet spot" -- well, easier said than done



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@zhuwei · [Follow](#)



Never spend 6 minutes doing something by hand when
you can spend 6 hours failing to automate it

6:28 AM · Apr 26, 2020



4.5K



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Operating systems

- Most IT departments love MS Windows (unless you work in, e.g., a Physics department)
- However, especially for programming, heavy number crunching, machine learning etc., Linux or MacOS are better choices
- Under MS Windows, you can enable the *Windows Subsystem for Linux* (WSL), for more informatione, see
<https://learn.microsoft.com/en-us/windows/wsl/about>