

Some Essentials for Data Science with R

Derek Beaton

2020 FEB 23

Outline

- ▶ Part 0: Project set up

Outline

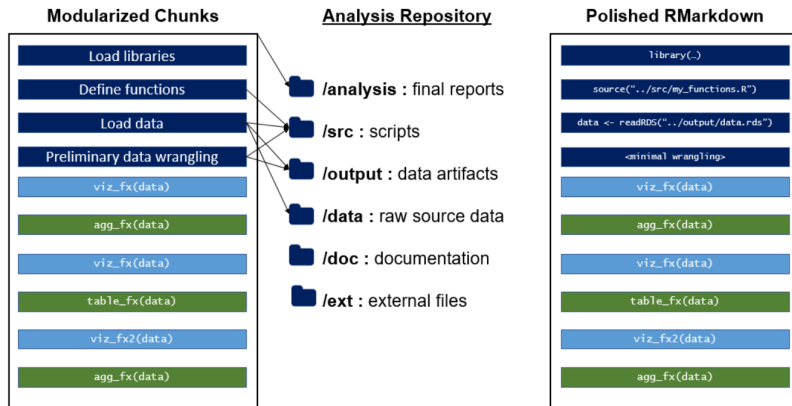
- ▶ Part 0: Project set up
- ▶ Part 1: RStudio, R, RMarkdown, Git

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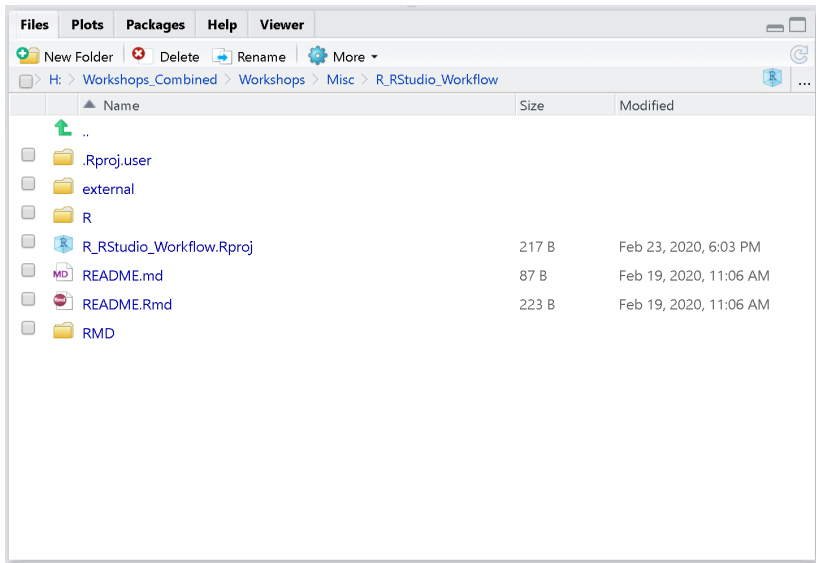
- ▶ Part 0: Project set up
- ▶ Part 1: RStudio, R, RMarkdown, Git
- ▶ Part 2: Working with data

Project set up

Project set up



<https://emilyriederer.netlify.com/post/rmarkdown-driven-development/>



Organize your project folders and markdown

- ▶ What works for you?

Organize your project folders and markdown

- ▶ What works for you?
- ▶ What works for your organization or team?

Organize your project folders and markdown

- ▶ What works for you?
- ▶ What works for your organization or team?
- ▶ Maximize utility, minimize complexity

Part 1

Part 2: RStudio & Project setup

- ▶ IDE: Integrated development environment

RStudio

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 - ▶ Can relink to faster libraries
- ▶ Download RStudio (<https://www.rstudio.com/>)

RStudio Environment

~/workshops/2019_Rstudio_Magic-master - RStudio

File Edit Code View Plots Session Build Debug Profile Tools Help

Go to file/function

Source

```
1 library(ADNImerge)
2
3 #####
4 ## Load and clean data
5 #####
6
7 ## 0.1 Specify the column names and participants you want (ie, baseline visit for all participants with MOCA=1
8 adni.cols <- c("RID", "VISCODE", "DX", "AGE", "PTGENDER", "PTEDUCAT", "PTETHCAT", "PTRACCAT", "APOE4", "FDG",
9 adni.rows <- c(adnimerge$VISCODE=="b1" & adnimerge$MOCA==16)
10 amerge_subset <- adnimerge[adni.rows, adni.cols]
11
12 #### remove participants with missing data
13 amerge_subset <- amerge_subset[complete.cases(amerge_subset),]
14
15 ## 0.2 Bring in modified hachinks1
16 amerge_subset$HMScore <- modhach$HMScore[match(amerge_subset$RID, modhach$RID)]
17
18 ## 0.3 Manually change variable classes (remove class 'labelled')
19 <
20 <
48:19 [Assessed] >
```

Console

```
~/workshops/2019_Rstudio_Magic/ >
> view(amerge_subset)
>
```

Environment

Global Environment

Data

amerge_subset 665 obs. of 17 variables

variable_type_map

num [1:17, 1:3] 0 1 0 0 0 0 1 1 0 ...

Values

ids chr [1:665] "2002" "2003" "2007" "2010" "2011" "201..."

MOCA num [1:665] 28 24 23 27 25 26 25 24 24 30 ...

Functions

scatterplot function (x, y, x.lim = NA, y.lim = NA, x.lab = "...")

Files

New Folder Delete Rename More

Home workshops 2019_Rstudio_Magic

Name Size Modified

- envirom 52 B May 12, 2019, 11:33 AM
- 2019_Rstudio_Magic.Rproj 218 B May 12, 2019, 6:30 PM
- external
- mic
- output
- R
- README.md 42 B May 12, 2019, 11:29 AM
- Rmd



~/workshops/2019_Rstudio_Magic - master - RStudio

File Edit Code View Plots Session Build Debug Profile Tools Help

Source | Run | Environment | History | Connections | Git

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48/19 | 1 line(s) | 1

```

Console | Terminal | Jobs

```

~/workshops/2019_Rstudio_Magic/ >

```

| APOE4 | | | FDG | | | AV45 | | | CDRSB | | | ADAS13 | | | MOCA | | |
|---------|---------|--|---------|---------|--|---------|---------|--|---------|---------|--|---------|-------|--|---------|--------|--|
| Min. | :0.0000 | | Min. | :0.6983 | | Min. | :0.8385 | | Min. | :0.0000 | | Min. | :0.0 | | Min. | :16.00 | |
| 1st Qu. | :0.0000 | | 1st Qu. | :1.1837 | | 1st Qu. | :1.0199 | | 1st Qu. | :0.0000 | | 1st Qu. | :8.0 | | 1st Qu. | :22.00 | |
| Median | :0.0000 | | Median | :1.2802 | | Median | :1.1105 | | Median | :1.0000 | | Median | :12.0 | | Median | :24.00 | |
| Mean | :0.5248 | | Mean | :1.2682 | | Mean | :1.1989 | | Mean | :1.202 | | Mean | :13.8 | | Mean | :23.89 | |
| 3rd Qu. | :1.0000 | | 3rd Qu. | :1.3620 | | 3rd Qu. | :1.3714 | | 3rd Qu. | :2.0000 | | 3rd Qu. | :18.0 | | 3rd Qu. | :26.00 | |
| Max. | :2.0000 | | Max. | :1.7011 | | Max. | :2.0256 | | Max. | :5.500 | | Max. | :46.0 | | Max. | :30.00 | |

| Hippocampus | | | Hippocampus | | | Hippocampus | | | Hippocampus | | | Hippocampus | | |
|-------------|-----------|--|-------------|--------|--|-------------|--------|--|-------------|----------|--|-------------|---------|--|
| Min. | :817421 | | Min. | :3731 | | Min. | :12213 | | Min. | :18.6883 | | Min. | :0.0000 | |
| 1st Qu. | :984410 | | 1st Qu. | :6510 | | 1st Qu. | :18535 | | 1st Qu. | :6.4051 | | 1st Qu. | :0.0000 | |
| Median | :1051621 | | Median | :7223 | | Median | :20186 | | Median | :2.5250 | | Median | :1.0000 | |
| Mean | :11057026 | | Mean | :7150 | | Mean | :20302 | | Mean | :3.6882 | | Mean | :0.588 | |
| 3rd Qu. | :11220570 | | 3rd Qu. | :7834 | | 3rd Qu. | :22088 | | 3rd Qu. | :0.3482 | | 3rd Qu. | :1.0000 | |
| Max. | :1486036 | | Max. | :10602 | | Max. | :32189 | | Max. | :5.3540 | | Max. | :3.000 | |

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FILES, PLOTS, HELP

File | Plots | Packages | Help | Viewer

New Folder | Delete | Rename | More

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| Amvion | 52 B | May 12, 2019, 11:33 AM |
| 2019_Rstudio_Magic.Rproj | 218 B | May 12, 2019, 6:30 PM |
| external | | |
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CODE

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Console Terminal Jobs
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3rd Qu.:76.60 3rd Qu.:18.00
Max.:89.60 Max.:20.00
APOE4 FDG AV45 CDRSB ADAS13 MOCA
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The screenshot displays the RStudio interface with three main panels:

- Data Viewer:** A table showing patient data with columns: DX, AGE, PFGENDER, PTEDUCAT, PTETHCAT, PTRACCAT, APOE4, FDR, AV45, CDRSB, ADAS13, MOCA, and WholeBrain. The data is filtered to show 15 of 665 entries.
- Console:** Displays summary statistics for the 'Camerage_subset' variable, including mean, 3rd quartile, and maximum values for various clinical measures like APOE4, FDR, AV45, CDRSB, ADAS13, MOCA, WholeBrain, Hippocampus, MidTemp, nPACtra15B, and HWScore.
- Files:** A file explorer showing the project structure, including folders like 'external' and 'misc', and files like 'README.md' and 'Rmd'.

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 - ▶ See https://github.com/derekbeaton/Workshops/tree/master/Misc/R_RStudio_Workflow
- ▶ Python, D3 (JavaScript), SQL, Shiny, LaTeX, Git/SVN, HTML/CSS, and so much more.

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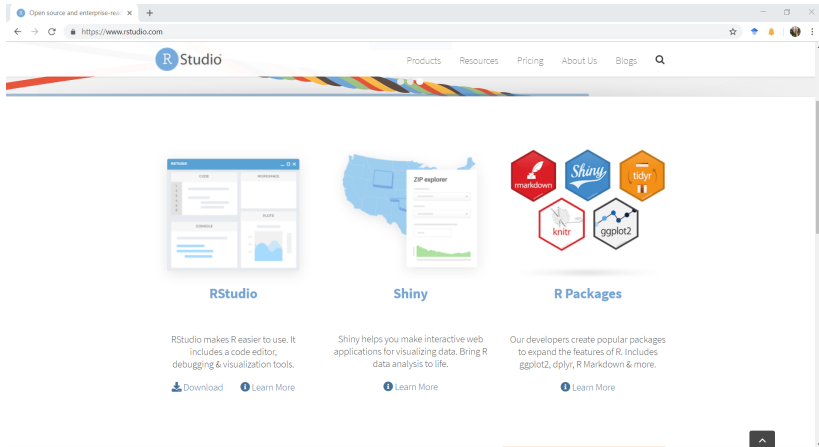
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- ▶ A conference

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- ▶ A company
- ▶ A community
- ▶ A conference
- ▶ A centralized resource

RStudio Resources



Open source and enterprise-ready | <https://www.rstudio.com>

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RStudio

RStudio makes R easier to use. It includes a code editor, debugging & visualization tools.

[Download](#) [Learn More](#)

Shiny

Shiny helps you make interactive web applications for visualizing data. Bring R data analysis to life.

[Learn More](#)

R Packages


Our developers create popular packages to expand the features of R. Includes ggplot2, dplyr, R Markdown & more.

[Learn More](#)

Online Learning - RStudio


https://www.rstudio.com/online-learning/

☆ 🔍 🔔 👤

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Online learning

A wealth of tutorials, articles, and examples exist to help you learn R and its extensions. Scroll down or click a link below for a curated guide to learning R and its extensions.




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[Read More >](#)




Shiny

[Read More >](#)



R Markdown

[Read More >](#)



Data Science

[Read More >](#)

- [R Programming](#)
- [Shiny](#)
- [R Markdown](#)
- [Data Science](#)
- [Books](#)

RStudio Cheat Sheets

The cheat sheets below make it easy to learn about and use some of our favorite packages. From time to time, we will add new cheat sheets to the gallery. If you'd like us to drop you an email when we do, let us know by clicking the button to the right.

SUBSCRIBE TO CHEAT SHEET UPDATES HERE

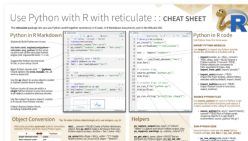
- RStudio IDE
- R Markdown
- Shiny
- Package Development

- Data Import
- Data Transformation with dplyr
- Data Visualization with ggplot2
- Apply functions with purrr

- Deep Learning with Keras
- Data Science in Spark with Sparklyr
- String manipulation with stringr
- Dates and times with lubridate

Python with R and Retiulate Cheat Sheet

The reticulate package provides a comprehensive set of tools for interoperability between Python and R. With reticulate, you can call Python from R in a variety of ways including importing Python modules into R scripts, writing R Markdown Python chunks, sourcing Python scripts, and using Python interactively within the RStudio IDE. This cheatsheet will remind you how. Updated 4/19.



Project and Environment Setup

RStudio Setup

- ▶ See <https://jennybc.github.io/2014-05-12-ubc/r-setup.html> for a detailed guide

For safety & collaboration

- ▶ RStudio projects

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 - ▶ “RStudio projects make it straightforward to divide your work into multiple contexts, each with their own working directory, workspace, history, and source documents.”

For safety & collaboration

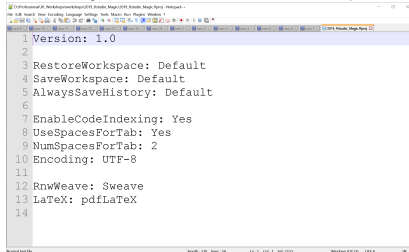
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- ▶ .Rproj files

For safety & collaboration

- ▶ RStudio projects
 - ▶ “RStudio projects make it straightforward to divide your work into multiple contexts, each with their own working directory, workspace, history, and source documents.”
 - ▶ Allows for return to key states
- ▶ .Rproj files
 - ▶ Basically a text file with some parameters for start up

A screenshot of a text editor window showing the contents of an .Rproj file. The file is titled "D:\Professional\AT_Working\overlapping\001_RStudio_Magic\001_RStudio_Magic.Rproj - RStudio". The text inside the editor is as follows:

```
1 Version: 1.0
2
3 RestoreWorkspace: Default
4 SaveWorkspace: Default
5 AlwaysSaveHistory: Default
6
7 EnableCodeIndexing: Yes
8 UseSpacesForTab: Yes
9 NumSpacesForTab: 2
10 Encoding: UTF-8
11
12 RnwWeave: Sweave
13 LaTeX: pdfLaTeX
14
```

The editor window has a standard toolbar at the top and a status bar at the bottom showing "Normal text file", "Length: 278", "Lines: 14", "Ln 1, Col 1", "Sel: 0/0", and "Windows: 0/1/0 - 0/1/0".

Projects

Create a new one for:

- ▶ a folder

Projects

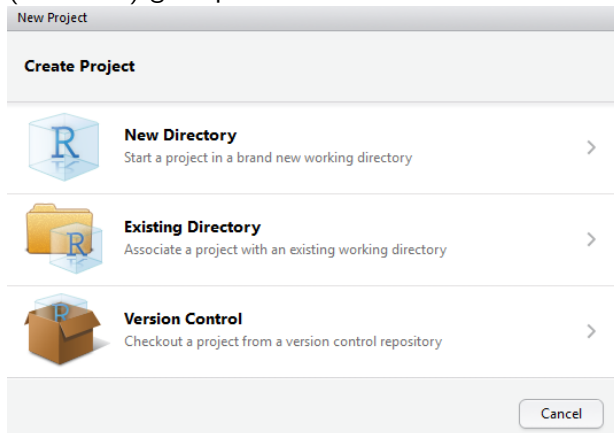
Create a new one for:

- ▶ a folder
- ▶ packages

Projects

Create a new one for:

- ▶ a folder
- ▶ packages
- ▶ (and from) git repos:



What is Git?

SOMETHING

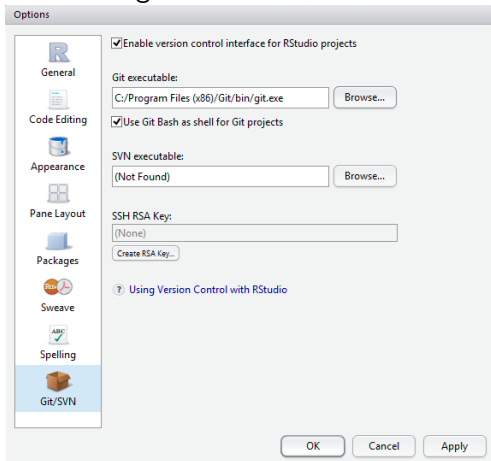
Git & Projects



Git

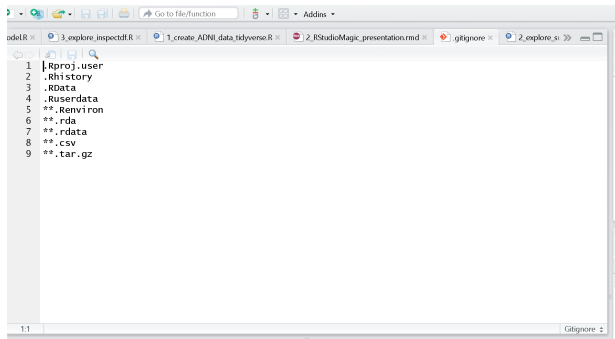
Git & Projects

- ▶ Git
- ▶ Download git and link executable within RStudio



Format .gitignore

- File types to ignore via version control



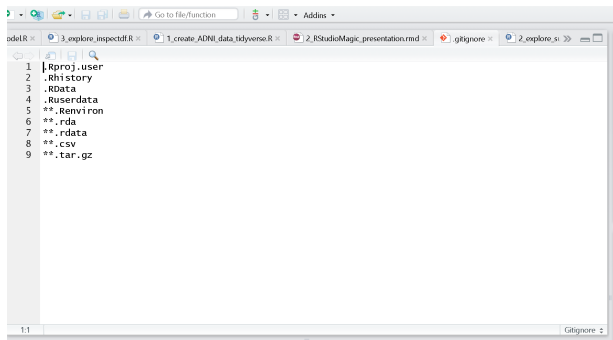
The screenshot shows the RStudio interface with a .gitignore file open in the editor. The file contains the following content:

```
1 .Rproj.user
2 .Rhistory
3 .RData
4 .Ruserdata
5 **/.Renviro
6 **/.rda
7 **/.rdata
8 **/.csv
9 **/.tar.gz
```

The RStudio window has several tabs open: 'odeLR', '3_explore_inspectdfr', '1_create_ADNI_data_tidyverse.R', '2_RStudioMagic_presentation.rmd', '.gitignore', and '2_explore_si'. The status bar at the bottom indicates '1:1' and 'Gitignore'.

Format .gitignore

- ▶ File types to ignore via version control
- ▶ ** before each extention will match directories anywhere in the repo



The screenshot shows the RStudio IDE interface. The top toolbar includes icons for file operations and a search bar. The menu bar shows 'Addins'. The tab bar at the top displays several open files: 'odeLR', '3_explore_inspectdfr', '1_create_ADNI_data_tidyverse.R', '2_RStudioMagic_presentation.rmd', '.gitignore', and '2_explore_si'. The main editor pane shows the content of the '.gitignore' file, which lists various file types and directories to be ignored. The status bar at the bottom indicates the file is at line 1, column 1.

```
1 |.Rproj.user
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