Best Practice for Programming in R

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Setting expectations

Primarily aimed at academics, students or those starting out to code.

If any of you has, however, briefly been exposed to a more formal way of programming, due to work in industry or package development, it might be that many of the major points here are already known to you and redundant

Major focus on simple quick things that you can do to drastically change the way your code looks and improve use, sharing and readability

Primary aim is to improve readability of your code. This is not meant to teach how to code better ⁽ⁱ⁾

□ R, particularly R Studio perspective. Principles can transfer to other languages, but practices would need to be modified – in some cases – drastically

Invitation

Open up a piece of your own code as you go through this document.

As we go through examples of what to do and what not to do, try to see what you could have done differently in your own code

□ If you have questions, feel free to interrupt.

My Background

PhD candidate in Psycho- / Neurolinguistics



Master in Cognitive Science



Software Developer (SAP ABAP)



So What!!?

So What!!?



How I felt about coding practices in academic research when I first moved here from industry

Software Industry & Coding Practices

- Company or project standards
 - □ Code formatting (including things as specific as indentation)
 - Naming conventions
 - Modularity conventions
 - Version control
 - Thorough documentation
 - Technical specifications
 - Functional specifications
 - □ Self-reviews; Self-tests
 - Peer-reviews (not like in academia, but review of the code)
 - □ Rigourous testing at different levels; technical as well as functional testing

Academia & Coding Practices



□ Rigourous testing at different levels; technical as well as functional testing

Well, we are doing just fine without any standards!

OR ARE WE???!!!

Needs of the software industry ≠ Needs of academia

Different landscape

Larger teams

□ You might be working on a piece of code today that someone else will work on tomorrow.

During the testing phase, a completely different team might be responsible for debugging and fixing it.

During maintenance and support, another company or project team might handle it

Different aim

Software is a product or a service

□ If it is broken – the customer would leave

Product needs to be used many times in different scenarios

BUT!

Or "HOWEVER!" If we are being fancy

Academia does have some needs

We need to make sure our results are reliable (or "Crap! I hope I don't have to retract my paper")

Reproducibility

□ Efficiency of coding

□ Sharing of scripts (or "I now need to spend 2 days to fix my script so that I can send it to her")

Open Science

"What does this code from last year do!"

Academia actually has quite many needs

"I don't know what the difference between "Study1_analysis", "Study1_analysis_final", Study1_analysis_adjusted is " or " which was the script with the right results!"

"I don't understand the logic I used behind this code block" or "Why did I multiply x by 2 here?"

Error resolution & Debugging

Reusability

Uniformity & Consistency

Automatisation

Needs of the software you are using

Needs of R

- ≠ Needs of JAVA
- ≠ Needs of Neurobs Presentation
- ≠ Needs of ABAP
- ≠ Needs of MATLAB
- ≠ Needs of Python

Our focus is on R and RStudio

Similar principles might apply to Python (but not the same)

But other languages and software might differ radically

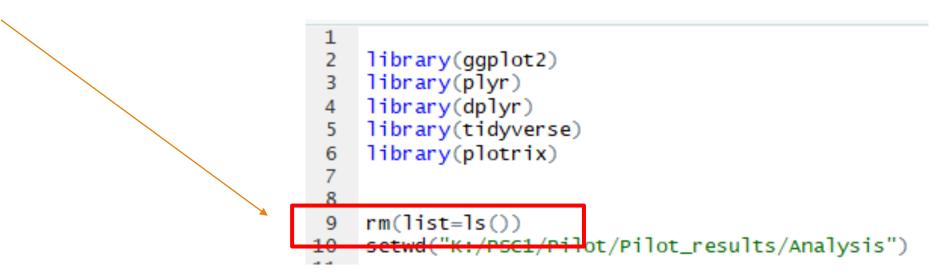
Preview of what is coming up

- Clearing workspace
- RStudio project functionality
- Code headers, code folding, section headers
- Library declarations
- Version Control
- □ Commenting practices
- Naming conventions
- □ Hard coding vs. parameter coding
- Reducing visual chaos
- Modularity
- User-defined functions
- Bonus mention: pipe functions

So, what can we do?

LET'S BEGIN WITH THE SIMPLER, FASTER CHANGES WE CAN MAKE

Stop doing this!



Stop doing this! Instead use: R Studio project functionality New Session r Metric Session New Session r Metric Session New Session r Metric Sessio



Stop doing this!

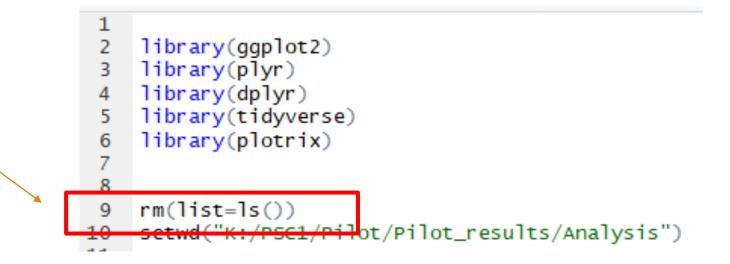
This seems like an extreme idea, I get it!

I even got back comments after my first presentation from a couple of people who highly resisted the idea and could not believe that I would propose running a script without first making sure that the workspace is not free of conflicting variables. 1
2 library(ggplot2)
3 library(plyr)
4 library(dplyr)
5 library(tidyverse)
6 library(plotrix)
7
8
9 rm(list=ls())
10 setwd("K:/PSC1/Pilot_results/Analysis")
11

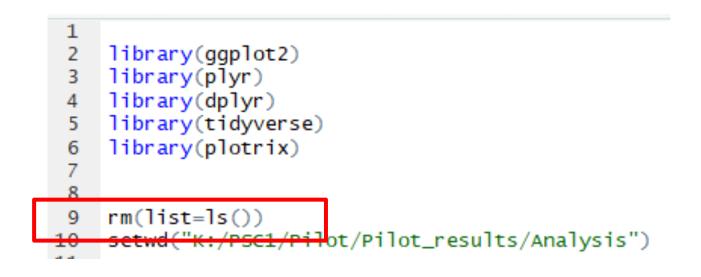
Stop doing this!

How can someone recommend running a script in workspace that's not empty?

That's not what I am recommend. You need a clean workspace. You just get to it in a different way!



Let me show you what happens when you run a script with this command at the beginning.



Let's say that I am working on a complicated project with a complicated piece of code and I have all of these variables in the workspace

I take a break or something urgent comes up and my workspace is left like this

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🜔 DominantList	159 obs. of 17 variables	
FinalFrequencies	170 obs. of 6 variables	
○LF.freq.split	List of 6	Q
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LookFurtherList	6 obs. of 17 variables	
MatchList	165 obs. of 17 variables	
🜔 NotMatchList	5 obs. of 11 variables	
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R: Functions to Manipulate Connections (Files, URLs, ...), * Eind in Tania

Original workspace

In the meanwhile, a colleague has shared a script with me that I was waiting for, which solves a problem I am facing in another project

In the spirit of charging forward and excited about finally having a solution to my problem, I run the script, which looks like

```
1
2 library(ggplot2)
```

- 3 library(plyr)
- library(dplyr)
- 5 library(tidyverse)
- 6 library(plotrix)

```
7
8
```

```
9 rm(list=ls())
10 setwd("K:/PSC1/Pilot/Pilot_results/Analysis")
```

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Original workspace

What happens next?

What happens next?

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🔘 Dominant	List	159 obs	. of 17 varia	ables		
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Original workspace

All my precious variables, values and dataframe are gone! Because of that line

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10 secwd("κ:/PSCI/Pilot/Pilot_results/Analysis")

Instead, use R Studio's project functionality

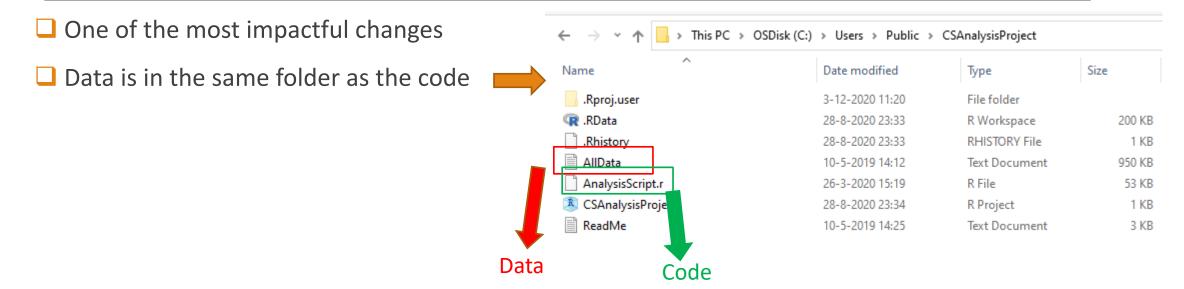
One of the most impactful changes

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New Project		
Create Proj	ject	
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R	Existing Directory Associate a project with an existing working directory	>
P	Version Control Checkout a project from a version control repository	>
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One of the most impactful changes

New	/ Project			
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- One of the most impactful changes
- Data is in the same folder as the code
- Easily shareable. Allows sharing and linking of data and code simultaneously
- here:here()
 - C:/Users/Public/CSAnalysisProject

2 42 2020 44 22		
3-12-2020 11:20	File folder	
28-8-2020 23:33	R Workspace	200 K
28-8-2020 23:33	RHISTORY File	1 K
10-5-2019 14:12	Text Document	950 K
26-3-2020 15:19	R File	53 K
28-8-2020 23:34	R Project	1 K
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- One of the most impactful changes
- Data is in the same folder as the code
- Easily shareable. Allows sharing and linking of data and code simultaneously
- here:here()
 - C:/Users/Public/CSAnalysisProject
 - points to the directory which has the .Rproj file

Name	Date modified	Туре	Size
.Rproj.user	3-12-2020 11:20	File folder	
😨 .RData	28-8-2020 23:33	R Workspace	200 K
.Rhistory	28-8-2020 23:33	RHISTORY File	1 K
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🗋 AnalysisScript.r	26-3-2020 15:19	R File	53 K
🗷 CSAnalysisProject	28-8-2020 23:34	R Project	1 K
ReadMe	10-5-2019 14:25	Text Document	3 K
library(here)			
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<pre>#Data Parameters # File paths rootFolderPath <- here::h</pre>			

- One of the most impactful changes
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AllData	10-5-2019 14:12	Text Document	950 K
🗋 AnalysisScript.r	26-3-2020 15:19	R File	53 K
🗷 CSAnalysisProject	28-8-2020 23:34	R Project	1 K
ReadMe	10-5-2019 14:25	Text Document	3 K
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			####
#Data Parameters	<u> </u>		####
			####

- One of the most impactful changes
- Data is in the same folder as the code
- Easily shareable. Allows sharing and linking of data and code simultaneously
- here:here()
 - C:/Users/Public/CSAnalysisProject
 - points to the directory which has the .Rproj file
 - Thus, the folder path specified in the code does not need to be changed when running the code in someone else's computer which has a different directory or folder organisation.

Name	Date modified	Туре	Size
.Rproj.user	3-12-2020 11:20	File folder	
ඹ .RData	28-8-2020 23:33	R Workspace	200 K
.Rhistory	28-8-2020 23:33	RHISTORY File	1 K
🖹 AllData	10-5-2019 14:12	Text Document	950 K
🗋 AnalysisScript.r	26-3-2020 15:19	R File	53 K
🗷 CSAnalysisProject	28-8-2020 23:34	R Project	1 K
ReadMe	10-5-2019 14:25	Text Document	3 K
ta Code	2		
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library(here)	e		####
library(here) #Data Parameters	e 		####
ld library(here) #Data Parameters # File paths			####
library(here) #Data Parameters	::here()		####

Let me show you what happens when you use R Studio project functionality instead of clearing the workspace

Use of RStudio project functionality

Same scenario: complicated project, important variables in the workplace;

a colleague sends code related to a different project that I was waiting on eagerly. However, this colleague is smart and uses project functionality

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R: Functions to Manipulate Connections (Files, URLs, 1), * Eind in Tanis

Original workspace

Use of RStudio project functionality

However, this colleague is smart and use project functionality. They instruct me to use projects. So, I do it

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Switch Projects	?	×
Save workspace in	nage to ~//	.RData?
Save Don't Save	Car	ncel

When I open a project, I am prompted to save the current workspace

Saving this workspace image prevents loss of data!!!

Environment History Co	nnections Presentation ×	_
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R: Functions to Manipulate Connections (Files, LIRLs, ...) * Eind in Tanis

Original workspace

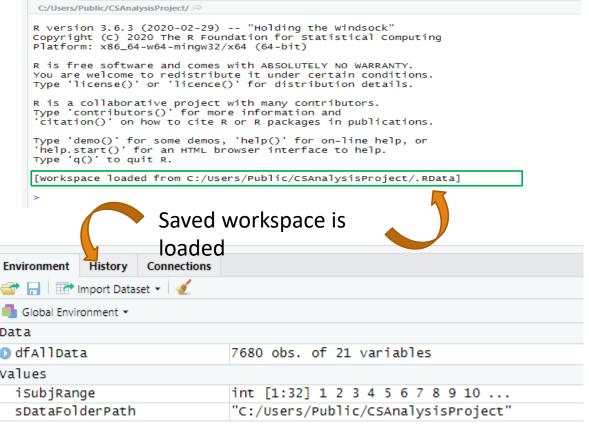
Console

Terminal

Jobs

Choose the project and open the directory. I run a couple of things and the project workspace is now loaded.

Downloads Music Pictures Videos						
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Project workspace

Use of RStudio project de la contractione de la con

Console

Terminal

C:/Users/Public/CSAnalysisProject/ 🗇

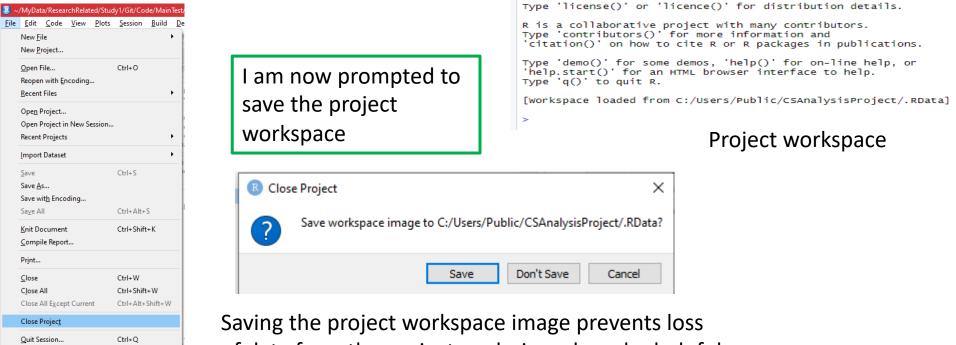
Jobs

Platform: x86_64-w64-mingw32/x64 (64-bit)

R version 3.6.3 (2020-02-29) -- "Holding the Windsock" Copyright (C) 2020 The R Foundation for Statistical Computing

R is free software and comes with ABSOLUTELY NO WARRANTY. You are welcome to redistribute it under certain conditions.

Now if I need to switch back to the original workspace, I close project



Saving the project workspace image prevents loss of data from the project analysis and can be helpful in pausing analyses midway

Use of RStudio project functionality

And I can get back to my original workspace without any loss of data!!!

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R: Functions to Manipulate Connections (Files, URLs, ...) . Eind in Tania

Original workspace

Aside: advantages of here package

- **getwd()** not optimal: It returns different results depending on file types and directory structures
 - □ path needs to be rewritten according to directory structure or different OS
- relative paths are not useful if your current file is a sub-folder in the main project folder and
 you want to reference a file in another sub folder
- □ folder path specified in the code does not need to be changed when running the code in someone else's computer which has a different directory name or even different OS
- creates file paths corresponding to requirement of current OS
- more details: <u>https://malco.io/2018/11/05/why-should-i-use-the-here-package-when-i-m-already-using-projects/</u>

Code Headers

Utilise code folding features!

1 -	#Script H	eader####
2	# Date:	10.06.2020
3	# Author:	Arushi Garg
4	<pre># Filename:</pre>	RL_Best_Practices_Sample.R
5	<pre># Description:</pre>	Code to present examples of best practices that
6		can be used while programming.This code is an
7		accompaniment to the presentation on the same
8		topic. Details of executing this script are
9	#	provided in document named "Best Practice Script
10	#	Detail.pdf" available in the project folder
11	<pre># Project:</pre>	R Ladies Best Practices Workshop on 11 June 2020
12	#	####

Useful for identifying purpose of script.

□ If script is shared with someone, it can be informative with regards to the original author and project

Code Folding

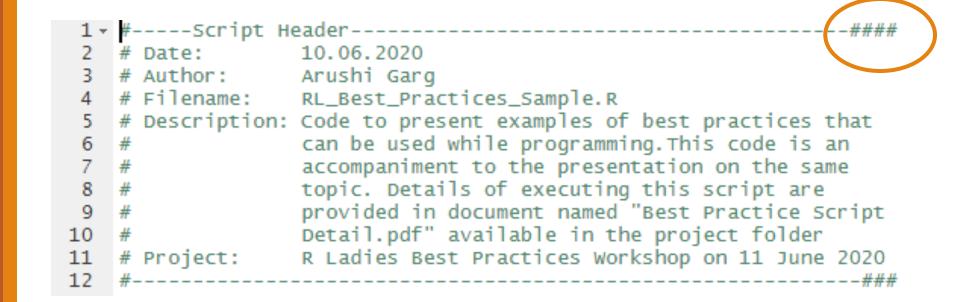
For the uninitiated

R Studio feature

□ A comment line that ends in 4 "-", "=" or "#"

Find more info on Rstudio help or website!

Also works in Rmarkdown code chunks



Section Headers

Utilise code folding features!



84

85 - #-----Main Analysis 86 → #-----Plot Results

Section Headers

Utilise code folding features!

🗇 🗅 🔚 🗌 Source on Save 🔍 🎢 🖌 📗	🕂 Run 👌 🕂 Source 🔹 🚍
11 # Project: R Ladies Best Practices Workshop on 11 June 2020	Script Header
12 #####	Change log
13 14 - #Change logChange log	Library & Sources
$14 \lor m =Change log =$	Data Parameters
16 # Change by: Arushi Garg	Exclusion Parameters
17 # Change: Change signs for subsetting the data as per exclusion	Data Adjustment
18 # criteria	Alternative Data Adjustment
19 # Purpose: Fix as the previous subset was not correct	Main Analysis
20 #### 21	Plot Results
22	Examples
23	Subject Wise Data Retrieval
24 Seriet Header	Onset and Offset Time Data Retrieval
25 Sciperieader	Another Example Paramaters
26 Change log	Structure creation
27 28 Library & Sources	Data Processing
29 Data Parameters	calc.condition.descriptives
30	subscramble
31 Exclusion Parameters	
32 × # Data Adjustment	
33 34 J Alternative Data Adjustment	
35 1 Main Analysis	
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37 1 Plot Results	
38] Examples	
39 1 40 7 Subject Wise Data Retrieval	
41 Onset and Offset Time Data Retrieval	
14:1 ∰ Change log ≎	R Script 🗢

Can be helpful to navigate using the menu on the right side or at the bottom

Library declarations: What NOT to do

Why?

```
TrialN$PpPic = rbind(Dat[i,]$Pic2, Dat[i,]$Pic4, Dat[i,]$Pic6)
TrialN$PrevExp = rbind(Dat[i,]$Pic1, Dat[i,]$Pic3, Dat[i,]$Pic5) #idenity previous exp and pp pics
TrialN$PrevPp = rbind(Dat[i-1,]$Pic6, Dat[i,]$Pic2, Dat[i,]$Pic4) #this was does refer i-1 of the reserved.
```

AllTrials = rbind(AllTrials, TrialN) #bring together

```
#join with Dat df and sort python lists
#not must use 'join' instead of 'merge' function as other Item_N is reordered (which we don't want for
library(plyr)
PythonList = join(AllTrials, List, by="Item_N")
```

#sort

```
#get rid of excess snap rows
PythonList$TrialPair = c(rep(1:3, nrow(PythonList)/3))
PythonList$tmp = paste(PythonList$Condition, PythonList$TrialPair, sep="_")
PythonList = subset(PythonList, tmp!="Snap_2")
PythonList = subset(PythonList, tmp!="Snap_3")
PythonList$tmp = NULL
```

□ library or requirement statements should be avoided within the code

Library declarations: What NOT to do

Why?

```
    Packages are basic
requirements; should be
visible at the top
```

```
You might not have
something available, and
only realise after 2 hours (or
2 days!) of execution of the
code that came before it.
```

```
TrialN$PpPic = rbind(Dat[i,]$Pic2, Dat[i,]$Pic4, Dat[i,]$Pic6)
TrialN$PrevExp = rbind(Dat[i,]$Pic1, Dat[i,]$Pic3, Dat[i,]$Pic5) #idenity previous exp and pp pics
TrialN$PrevPp = rbind(Dat[i-1,]$Pic6, Dat[i,]$Pic2, Dat[i,]$Pic4) #this was does refer i-1 of the reserved.
```

```
AllTrials = rbind(AllTrials, TrialN) #bring together
```

```
#join with Dat df and sort python lists
#not must use 'join' instead of 'merge' function as other Item_N is reordered (which we don't want for
library(plyr)
PythonList = join(AllTrials, List, by="Item_N")
```

```
#sort
```

```
#get rid of excess snap rows
PythonList$TrialPair = c(rep(1:3, nrow(PythonList)/3))
PythonList$tmp = paste(PythonList$Condition, PythonList$TrialPair, sep="_")
PythonList = subset(PythonList, tmp!="Snap_2")
PythonList = subset(PythonList, tmp!="Snap_3")
PythonList$tmp = NULL
```

Library declarations: Better

library(tidyverse)
library(lme4)
library(lmerTest)
library(ggplot2)
library(magrittr)

```
d<-read_csv("verb_gene_per_sub_per_item.csv")
m<-read_csv("FAT_microstructure.csv") %>% mutate(sub=as_factor(sub))
z<-read_csv("FAT_micro_conditions.csv")
n<-read_csv("nonwords_per_sub_per_item_correct.csv")</pre>
```

Library declarations: Better

```
18 + # 1 Preliminaries
19
20 - ## Required packages
21
22
    Loading all libraries that will be required for the following analyses and graphs:
23
24 - ```{r load_libraries, include=FALSE}
25
    library(Hmisc)
    library(devtools)
26
27
    library(yarrr)
    library(broom)
28
    library(reshape2)
29
    library(plyr)
30
    library(tidyverse)
31
    library(stringr)
32
    library(readr)
33
    library(data.table)
34
    library(cowplot)
35
    library(mice) #needed for 'fifer' package to work
36
    library(plotrix)#needed for 'fifer' package to work
37
    #NOTE: The package 'fifer', which is used in this markdown for chisquare tests, is no
38
    Trying to install it gives an error message that "flexplot" is not available. I found
    on the developer's github page: <a href="https://github.com/dustinfife/fifer/issues/7">https://github.com/dustinfife/fifer/issues/7</a>
    remotes::install_github("dustinfife/fifer")
39
    remotes::install_github("dustinfife/flexplot")
40
    library(flexplot)
41
42 library(fifer)
                                                                                       50
```

Library declarations : good

Make sure to remove any package calls that you are not using in the code

```
17
   library(lme4);
18
19 library(lmerTest)
   library(lattice)
20
21 library(ggplot2)
22 library(plyr)
23 library(boot)
24 library(flextable)
25 library(here)
   library(tidyverse)
26
27
    # Another way to load libraries, if you don't know whether a
28
    # package is installed or not
29
30 - if (!require(package, character.only=T, quietly=T)) {
      install.packages(package)
31
      library(package, character.only=T)
32
33 - }
34
35
36 → #----Data Parameters
```

16 - #----Library Declarations-----####

Library declarations are best at the top of the code within a separate section fold of their own

Version Control

Critical in industry

Almost nobody practices it in academia

unless they develop software that is deployed for someone outside their group

Can be VERY useful for the development of your analysis

Image - since you will tend to change things here and there in your scripts and then forget about it and then wonder what your last working version was.

Several ways of practicing version control

□ Version Control Software

Separate File Names

□ Within Code Change Logs (+ Documentation)

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	S Arushi Garg / Study5 C	CS Speak Listen Bilingual 🔒 Maintainer		★0 撃0 110 ₽0
	S Arushi Garg / study4TI	MS A Maintainer		★0 ¥0 110 D0
	P Arushi Garg / PhD A Lemma Wave Experime			★0 ¥0 比0 D0
	S Arushi Garg / Study3 C	CS Naming Repetition Gender A Maintainer		★0 ¥0 110 D°0
	S Arushi Garg / Study2 L	emma fMRI New 🔒 Maintainer		★0 ¥0 比0 D0
	S Arushi Garg / Study1 C	S effects in Prod Comp New A Maintainer		★0 ¥0 比0 D°0
	P Arushi Garg / PhD Stud	dy2 Processing A Maintainer		★0 ¥0 110 D0

Welcome to



Manage your projects and enhance collaboration with issue trackers and wiki pages. Real-time chat at https://mattermost.socsci.ru.nl.

For support, please check the TSG wiki page **about GitLab** or **about Mattermost**.

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() Why GitHub? ~ Team Ente	rprise Explore \vee Marketplace Pricing \vee	Search 7 Sign in Sign up
Sign	Create your own GitHub profil up for your own profile on GitHub, the best place to host code, manage project developers. Sign up	
	Overview Repositories 156 Projects 0 Stars 10 Fo	ollowers 41 Following 1
	NPP_HexEdit Notepad++ Plugin Hexedit ● C++ ☆ 430 ♀ 79	NPP_ExportPlugin Import latest version from http://npp-plugins.cvs.sourceforge.net/viewvc/npp-plugins/NppPlugins/NppExport/ C++
chcg Block or report user	PythonScript Forked from bruderstein/PythonScript Python Script plugin for Notepad++ ● Python ☆ 3 ※ 1	NotepadSharp Forked from MarcSaenz/NotepadSharp Plugin for Notepad++ with many many features. ● C++ ☆ 3
	ImgTag unoffical fork of https://sourceforge.net/projects/imgtag/	nppPluginManager Forked from bruderstein/nppPluginManager Notepad++ Plugin Manager ● C++

ADVANTAGES

- Saved code history; revert to any version
- Branch your project; try a different analysis
- Choose level of technicality; can function minimally with basic commands
- Sync across devices
- Great for collaboration
 - Easy to share code
 - Easy to share changes after sharing preliminary

DISADVANTAGES

Requires initial investment of time and effort

Bad if you forget to push and/or commit changes

- only to remember it later when you don't remember what, why or how of the changes you made

Useless, unless good, informative change messages used

Ever expanding repository

Version Control – Separate File Names

- Use date before the file name (or at the end, before the file extension) to mark the latest version of your file
 - Most helpful date format: YYYYMMDD or YYMMDD (222200611 or 220611)
- Important change script header log to document change
- Can be used in combination with the next way of version control
- Older versions can be deleted. once scripting is finalized.

```
    200611_Example_Code.R
    200610_Example_Code.R
    200609_Example_Code.R
    200531_Example_Code.R
```

Version Control – Separate File Names

Advantages

□ No learning curve; you can start doing it straightaway

- □ Maintain history of previous changes
- Easy to revert to a previous version by simply picking a previous file

No code syncing

Version Control – Separate File Names

Disadvantages

Not good for collaboration

□ Hard to see which version has what changes; you have to open each file

Let's say you are coding on a Wednesday. You don't like changes you made on Tuesday and so you went back to the Monday version. It is hard to keep track without opening individual files and checking that the Wednesday version is not a continuation of Tuesday but of Monday.

Disk storage size can keep on increasing, with every new file

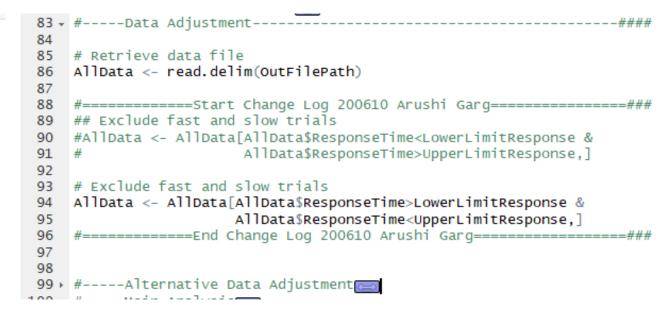
□ Important to remember to include change in header!

- Tedious to compare changes across versions
- □ Accidental saves of old file with new changes are likely

Version Control - Within Code Change Logs (+ Documentation)

1 -	#Scri	pt Header####
2	# Date:	08.06.2020
3	# Author:	Arushi Garg
4	<pre># Filename:</pre>	RL_Best_Practices_Sample.R
5	<pre># Description:</pre>	Code to present examples of best practices that
6	#	can be used while programming.This code is an
7	#	accompaniment to the presentation on the same
8	#	topic. Details of executing this script are
9	#	provided in document named "Best Practice Script
10	#	Detail.pdf" available in the project folder
11	# Project:	R Ladies Best Practices Workshop on 11 June 2020
12	#	####
13		
14 -	#Change 1	og####
	# Date:	
	# Change by:	
17		Change signs for subsetting the data as per exclusion
18	#	criteria
19	<pre># Purpose:</pre>	Fix as the previous subset was not correct
20	#	####
21		

Below the script header, there is a section called the Change Log. All of the different versions of the code are logged there



The corresponding changes are marked in the main code with comment lines

Version Control - Within Code Change Logs (+ Documentation)

ADVANTAGES

No initial investment of time and effort to set it up and understand the basic commands and concepts

No multiple files needed

This does not require anything outside of your code to maintain the versions

No conflicts with other files

□ You see all your changes and versions in the same file.

Easy to see what changes happened when.

Commented out pieces of old code can be deleted once code is finalised (or a new final version can be made without the change log or changes at the end)

Version Control - Within Code Change Logs (+ Documentation)

DISADVANTAGES

Not an elegant solution; obsolete – people with more software experience can resist change logs

Difficult to share changes to your code

□ Falls midway between the other two options for ease in collaboration

Commenting

Appropriate and thorough commenting is imperative. It helps with:

- Readability of the code
- □ Sharing; others can understand and verify steps easily
- Revisiting your code even after years
- Making changes and adjustment of code

Advice on commenting ranges from *commenting on every line* to *commenting as less as possible*, while maintaining readability

Comments should establish balance between under- and over-explaining

Generally recommended to answer "why" question, rather than "what"

- Should be helpful beyond what the code is telling; otherwise it is just clutter
- Don't leave all the heavy lifting to comments -> name variable and functions to be self-explanatory

Commenting: What NOT to do

```
12 #import coding results
    allfilenames = dir(pattern = "SynC_pilot*")
13
    accdata = data.frame()
14
    for (isubj in 1:length(allfilenames)) {
15 -
16
17
      #open file
18
      filename = allfilenames[isubj]
19
      temp = read.table(allfilenames[isubj], header = T, sep = '\t')
22
21
       # add subi numer
       subjnr = unlist(strsplit(filename, "_"))[2]
22
23
       temp$participant = as.factor(isubj)
24
25
       #combine with other files
       accdata = rbind(accdata,temp)
26
27 - }
28
29
     #import onset-offset results
30
    praatfilenames = dir(pattern = "*onsets_durationAutomatic.txt")
31
    praatdata = data.frame()
32
33 - for (isubj in 1:length(praatfilenames)) {
34
35
       #open file
       filename = praatfilenames[isubj]
36
37
       temp = read.table(praatfilenames[isubj], header = F, sep = '\t')
38
39
       # add subj numer
       subjnr = unlist(strsplit(filename, "_"))[1]
40
       temp$participant = subjnr
41
42
43
       #combine with other files
       praatdata = rbind(praatdata,temp)
44
```

Anyone who knows basic R knows what's happening in those lines!

Comments should be helpful beyond what the code is clearly saying

Define the purpose!

Commenting: What could be done instead

```
#-----Subject Wise Data Retrieval------
#import coding results
                                                                    allFileNames = dir(pattern = "SynC_pilot*")
allfilenames = dir(pattern = "SynC_pilot*")
                                                                    allAccuracyData = data.frame()
accdata = data.frame()
                                                                    for (subject in 1:length(allFileNames)) {
for (isubj in 1:length(allfilenames)) {
  #open file
                                                                     subjectAccuracyFileName = allFileNames[subject]
 filename = allfilenames[isubj]
                                                                     subjectAccuracyFile = read.table(subjectAccuracyFileName, header = T, sep = '\t')
  temp = read.table(allfilenames[isubj], header = T, sep = '\t')
                                                                     # Including subject number in dataframe before combining with other subjects' data
  # add subi numer
                                                                     subjectID = unlist(strsplit(subjectAccuracyFileName, "_"))[2]
  subjnr = unlist(strsplit(filename, "_"))[2]
                                                                     subjectAccuracyFile$participant = as.factor(subjectID)
 temp$participant = as.factor(isubj)
                                                                      allAccuracyData = rbind(allAccuracyData,subjectAccuracyFile)
  #combine with other files
  accdata = rbind(accdata,temp)
                                                                    #-----Onset and Offset Time Data Retrieval------
                                                                    onsetOffsetFileNames = dir(pattern = "*onsets_durationAutomatic.txt")
                                                                    allonsetOffsetData = data.frame()
#import onset-offset results
                                                                    for (subject in 1:length(onsetOffsetFileNames)) {
praatfilenames = dir(pattern = "*onsets_durationAutomatic.txt")
praatdata = data.frame()
for (isubj in 1:length(praatfilenames)) {
                                                                      subjectOnsetOffsetFileName = onsetOffsetFileNames[subject]
                                                                     subjectOnsetOffsetData = read.table(onsetOffsetFileNames[subject], header = F, sep = '\t'
  #open file
 filename = praatfilenames[isubj]
                                                                     # Including subject number in dataframe before combining with other subjects' data
  temp = read.table(praatfilenames[isubj], header = F, sep = '\t')
                                                                     subjectID = unlist(strsplit(subjectOnsetOffsetFileName, "_"))[1]
                                                                      subjectOnsetOffsetData$participant = subjectID
  # add subj numer
 subjnr = unlist(strsplit(filename, "_"))[1]
                                                                     allonsetOffsetData = rbind(allonsetOffsetData, subjectOnsetOffsetData)
  temp$participant = subjnr
  #combine with other files
  praatdata = rbind(praatdata,temp)
```

Commenting: What NOT to do

```
# number of trees per site
summary(meta.tree$Sitecode)
# dominant species
unique(c(meta$DominantSpecies1,meta$DominantSpecies2))
# Select sites dominated by coniferous species
remove.sp = c('LADE','FREX','CASA','FASY')
select = meta$SiteCode[which(meta$DominantSpecies1 %in% remove.sp | meta$DominantSpecies2 %in% remove.sp)]
```

Commenting: What NOT to do

```
#filter on the basis of technical problems (code 9)
vg_dat<- merged %>% filter(vg_acc!=9)
nwr_dat<- nwr_merged %>% filter(nwr_acc!=99)
```

```
#Change all the code from my errors to 1
da<- dat %>% mutate(vg_acc=if_else(vg_acc!=0, 1, 0))
nwr_dat2<- nwr_merged %>% mutate(nwr_acc=if_else(nwr_acc==99, 1, nwr_acc ))
```

```
table#apply my model for checking the linear rel.between accuracy and selection
summary(glmer(acc~selection + (1|sub), family=binomial, data=da))
```

```
#apply my model for checking rel. with microstructure and selection
#VERB GENERATION
summary(glmer(vg_acc~L_I_FAT_stop_corr_FA*selection + (1|sub), family=binomial, data=da))
summary(glmer(vg_acc~R_I_FAT_stop_corr_FA*selection + (1|sub), family=binomial, data=da))
summary(glmer(vg_acc~L_M_FAT_stop_corr_FA*selection + (1|sub), family=binomial, data=da))
summary(glmer(vg_acc~R_M_FAT_stop_corr_FA*selection + (1|sub), family=binomial, data=da))
summary(glmer(vg_acc~L_FST_stop_corr_csf_FA*selection + (1|sub), family=binomial, data=da))
summary(glmer(vg_acc~R_FST_stop_corr_csf_FA*selection+ (1|sub), family=binomial, data=da))
```

Commenting: examples from the Internet

```
function addSetEntry(set, value) {
   /* Don't return `set.add` because it's not chainable in IE 11. */
   set.add(value);
   return set;
}
```

/* don't use the global isFinite() because it returns true for null values*/
Number.isFinite(value)

Note that these are not examples from R itself

Naming Conventions

Things to avoid:

```
    Inconsistency in naming
```

```
Names that do not reveal
exact purpose of
variable/function/file
```

```
Cryptic abbreviations
```

```
## Data
file=list.files(
    '201961114214112_treeringdata_BACI2016_WP3/data/treeringbiomass_network_Europe/raw_data')
site.obs=unlist(strsplit(file,'[.]'))[seq(1,48*2,by=2)]
source('R/functions_J.R')
meta = read.table(
    '201961114214112_treeringdata_BACI2016_WP3/data/treeringbiomass_network_Europe/metadata/ABI_Europe_metadata
    header=T,stringsAsFactors = F)
```

```
meta.tree = read.table(
    '201961114214112_treeringdata_BACI2016_WP3/data/treeringbiomass_network_Europe/metadata/ABI_Europe_metadata
    header=T,stringsAsFactors = F) %>% mutate(Sitecode = as.factor(Sitecode))
# number of trees per site
summary(meta.tree$Sitecode)
# dominant species
unique(c(meta$DominantSpecies1,meta$DominantSpecies2))
# select sites dominated by coniferous species
```

```
remove.sp = c('LADE', 'FREX', 'CASA', 'FASY')
```

```
select = meta$SiteCode[which(meta$DominantSpecies1 %in% remove.sp | meta$DominantSpecies2 %in% remove.sp)]
```

Naming Conventions

Things to avoid:

- Inconsistency in naming
- Names that do not reveal exact purpose of variable/function/file
- Cryptic abbreviations

```
#import coding results
allfilenames = dir(pattern = "SynC_pilot*")
accdata = data.frame()
for (isubj in 1:length(allfilenames)) {
```

```
#open file
filename = allfilenames[isubj]
temp = read.table(allfilenames[isubj], header = T, sep = '\t')
```

```
# add subj numer
subjnr = unlist(strsplit(filename, "_"))[2]
temp$participant = as.factor(isubj)
```

```
#combine with other files
accdata = rbind(accdata,temp)
```

```
#import onset-offset results
```

```
praatfilenames = dir(pattern = "*onsets_durationAutomatic.txt")
praatdata = data.frame()
for (isubj in 1:length(praatfilenames)) {
```

```
#open file
```

```
filename = praatfilenames[isubj]
temp = read.table(praatfilenames[isubj], header = F, sep = '\t')
```

Naming Conventions

Things to avoid:

- Inconsistency in naming
- Names that do not reveal exact purpose of variable/function/file
- Cryptic abbreviations

```
d<-read_csv("verb_gene_per_sub_per_item.csv")
m<-read_csv("FAT_microstructure.csv") %>% mutate(sub=as_factor(sub))
z<-read_csv("FAT_micro_conditions.csv")
n<-read_csv("nonwords_per_sub_per_item_correct.csv")</pre>
```

#disregard response we will not analyze now clean<- d %>% select(-matches(".answer"))

#make the wide to long format %>% #Rename the subject to be left only with the data<- clean %>% gather(matches(".code"), key = sub, value = vg_acc) %>% mutate(sub=as_factor(str_sub(sub, 2, -6))) vg_merged<- data %>% inner_join(m)

```
a<- n %>% gather(matches("_ans"), key = sub, value = nwr_acc) %>%
mutate(sub=as_factor(str_sub(sub, 2, -5)))
nwr_merged<- a %>% inner_join(m)
```

```
#filter on the basis of technical problems (code 9)
vg_dat<- merged %>% filter(vg_acc!=9)
nwr_dat<- nwr_merged %>% filter(nwr_acc!=99)
```

```
## Linear models including overall accuracy scores in VG
summary(lm(m$overall_acc~m$L_I_FAT_stop_corr_FA))
summary(lm(m$overall_acc~m$R_I_FAT_stop_corr_FA))
summary(lm(m$overall_acc~m$L_M_FAT_stop_corr_FA))
summary(lm(m$overall_acc~m$R_M_FAT_stop_corr_FA))
summary(lm(m$overall_acc~m$L_FST_stop_corr_csf_FA))
summary(lm(m$overall_acc~m$R_FST_stop_corr_csf_FA))
```

Things to avoid:

- Inconsistency in naming
- Names that do not reveal exact purpose of variable/function/file

Cryptic abbreviations

```
for (i in 1:length(files)){
    pNumber <- gsub("_logfile.txt","",files[i])
    currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F, sep = "\t", header = T, skipNul
    currentfile <- currentfile[currentfile$Condition_nr==1,]
    currentsub <- currentfile[currentfile$Correct_Response==1,] ## subsetting to correct sentences only
    misses <- length(currentsub[currentsub$Response_Score==0,1])/30 # correct sentences that pp made mistake
    hit <- length(currentsub[currentsub$Response_Score==2,] # subsetting to incorrect sentences only
    falsealarm <- length(currentsub2[currentsub2$Response_Score==2,] # subsetting to incorrect sentences only
    falsealarm <- length(currentsub2[currentsub2$Response_Score==0,1])/30 # incorrect sentences that pp made
    correj <- length(currentsub2[currentsub2$Response_Score==0,1])/30 # incorrect sentences that pp did not
    Dprime[i,1] <- pNumber
    Dprime[i,2] <- as.numeric(as.character(falsealarm))
    Dprime[i,3] <- as.numeric(as.character(misses))
    Dprime[i,4] <- as.numeric(as.character(correj)))
}</pre>
```

```
# replace 0 and 1 with approximate values to not get +-inf values after transforming the scores
for (i in 1:nrow(Dprime)){
```

```
if (Dprime[i,2] == 0){
    Dprime[i,2] <- 1/(60)
} else if (Dprime[i,2] == 1){
    Dprime[i,2] <- 1 - 1/60
}
if (Dprime[i,3] == 1){
    Dprime[i,3] <- 1 - 1/60
}</pre>
```

Important for readability, reusability, modularity of the code

The domain of R is very inconsistent when it comes to naming conventions (read: Rasmus Bååth, 2012)

Varied styles across companies

□ Internal packages have different styles from each other

Google's advice radically differs from R internal packages

Case based

allowercase

- IowerCamelCase
- UpperCamelCase
- Separator based
 - period.separated
 - underscore_separated

- Variables are nouns. e.g.:
 subjectNumber
 meanRTPlot
 allDataFilePath
- Functions are verbs. e.g.:
 retrieveData (& not *dataRetriever*)
 calcFourierTransform

- Names should be self-explanatory
- Balance between explaining and being concise
 - Modularity helps with that
- Possible to choose a different style according to purpose
 - □Variables loweCamelCase
 - □ Functions period.separated
 - File Names underscore_separated

Good variable and function names reduce need for comments and improve readability and comprehension of the code

- □ Make your choice according to your purpose
 - □ Are you coding individually?
 - Or in a team?
 - □ Are you coding for an individual project
 - □ Or are you developing an R extension or package?

- Coding individually for an individual project
 - Consistency
 - Choose freely but maintain choice across projects
- Coding individually for a package or extension
 - Choice should be driven by conventions in existing packages
 - Rasmus Baath 2012 is a good source for this; You can also do your own analysis like he does

Coding in a team

Choice driven by what everyone is comfortable with and can maintain

For other languages

□ R is quite a recent language and data types of variables are transformable.

- □ For some other languages/softwares e.g. Neurobs Presentation, Java, C++
 - data types are fixed
 - Need to be declared before being called
 - Difference between variable and constants
 - □ In such cases it is a good idea to denote the datatype in the variable name. e.g.:
 - □ ivSubjectNumber -> i shows its an integer, v shows it's a variable
 - □ scTaskOne -> s shows it's a string, c shows it's a constant
 - Declarations should be made separately (like library and parameter declarations)

Naming Conventions Comparison

<pre>files <- list.files(pattern = "logfile.txt") Dprime <- matrix(NA,length(files),16)</pre>	<pre>#Structure creation#### Dprime <- matrix(nrow = length(allLogFiles),ncol = totalDprimeColumns) #####</pre>
<pre>for (i in 1:length(files)){ pNumber <- gsub("_logfile.txt","",files[i]) currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F, seg currentfile <- currentfile[currentfile\$Condition_nr==1,] currentsub <- currentfile[currentfile\$Correct_Response==1,] ## subsetting t misses <- length(currentsub[currentsub\$Response_Score==0,1])/30 # correct s hit <- length(currentsub[currentfile\$Correct_Response==2,] # subsetting t falsealarm <- length(currentsub2[currentsub2\$Response_Score==0,1])/30 # inc correj <- length(currentsub2[currentsub2\$Response_Score==0,1])/30 # incorr Dprime[i,1] <- pNumber Dprime[i,2] <- as.numeric(as.character(falsealarm))</pre>	<pre>#Data Processing##### allLogFiles <- list.files(pattern = logfileText) for (fileIndex in 1:length(allLogFiles)){ subjectNumber <- gsub(logfileText,blank,allLogFiles[fileIndex]) currentFile <- as.data.frame(read.delim(allLogFiles[fileIndex], stringsAsFactors = F, sep = tab, header = T, redemale = T)</pre>
<pre>Dprime[i,2] <= as.numeric(as.character(harseararm)) Dprime[i,3] <- as.numeric(as.character(hit)) Dprime[i,4] <- as.numeric(as.character(misses)) Dprime[i,5] <- as.numeric(as.character(corrrej)) }</pre>	skipNul = T)) correctConditionOne <- subset(currentFile, Condition_nr = conditionOne & Correct_Response = correctResponse)
<pre># replace 0 and 1 with approximate values to not get +-inf values after trans for (i in 1:nrow(Dprime)){ if (Dprime[i,2] == 0){ Dprime[i,2] <- 1/(60) } else if (Dprime[i,2] == 1){ Dprime[i,2] <- 1 - 1/60 }</pre>	<pre>incorrectConditionOne <- subset(currentFile,</pre>

What not to do

How it can be improved

Naming Conventions Comparison

```
files <- list.files(pattern = "logfile.txt")
Dprime <- matrix(NA,length(files),16)</pre>
for (i in 1:length(files)){
                                                                                 ratioMisses <- nrow(subset(correctConditionOne,</pre>
  pNumber <- gsub("_logfile.txt","",files[i])</pre>
                                                                                                               Response_Score = wrongScore))/totalTrials
  currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F,
                                                                                 ratioHits <- nrow(subset(correctConditionOne,</pre>
  currentfile <- currentfile[currentfile$Condition_nr==1,]</pre>
                                                                                                             Response_Score = rightScore))/totalTrials
  currentsub <- currentfile[currentfile$Correct_Response==1,] ## subsettin</pre>
  misses <- length(currentsub[currentsub$Response_score==0,1])/30 # correc</pre>
                                                                                 ratioFalseAlarm <- nrow(subset(incorrectConditionOne,</pre>
  hit <- length(currentsub[currentsub$Response_Score==1,1])/30 # correct s
                                                                                                                    Response_Score = wrongScore))/totalTrials
  currentsub2 <- currentfile[currentfile$Correct_Response==2,] # subsettin</pre>
                                                                                 ratioCorrectReject <- nrow(subset(incorrectConditionOne,</pre>
  falsealarm <- length(currentsub2[currentsub2$Response_Score==0,1])/30 #</pre>
                                                                                                                       Response_Score = rightScore))/totalTrials
  corrrej <- length(currentsub2[currentsub2[Response_Score==1,1])/30 # inc</pre>
  Dprime[i,1] <- pNumber</pre>
                                                                                 Dprime[fileIndex,1] <- subjectNumber</pre>
  Dprime[i,2] <- as.numeric(as.character(falsealarm))</pre>
                                                                                 Dprime[fileIndex,2] <- as.numeric(as.character(ratioFalseAlarm))</pre>
  Dprime[i,3] <- as.numeric(as.character(hit))</pre>
                                                                                 Dprime[fileIndex.3] <- as.numeric(as.character(ratioHits))</pre>
  Dprime[i,4] <- as.numeric(as.character(misses))</pre>
                                                                                 Dprime[fileIndex,4] <- as.numeric(as.character(ratioMisses))</pre>
  Dprime[i,5] <- as.numeric(as.character(corrrej))</pre>
                                                                                 Dprime[fileIndex,5] <- as.numeric(as.character(ratioCorrectReject))</pre>
# replace 0 and 1 with approximate values to not get +-inf values after trans
for (i in 1:nrow(Dprime)){
  if (Dprime[i,2] == 0){
    Dprime[i,2] <- 1/(60)
```

} else if (Dprime[i,2] == 1){
 Dprime[i,2] <- 1 - 1/60</pre>

What not to do

```
How it can be improved
```

Special Note: File Naming Conventions

Avoid special characters or spaces in file names

□ Stick to letters, numbers and underscore

Good
fit_models.R
utility_functions.R
Bad
fit models.R
foo.r
stuff.r

What NOT to do

- In RStudio, blue usually reflects hard-coded values

#make the wide to long format %>% #Rename the subject to be left only with the number (e.g. data<- clean %>% gather(matches(".code"), key = sub, value = vg_acc) %>% mutate(sub=as_factor(str_sub(sub, 2, -6))) vg_merged<- data %>% inner_join(m)

a<- n %>% gather(matches("_ans"), key = sub, value = nwr_acc) %>%
mutate(sub=as_factor(str_sub(sub, 2, -5)))
nwr_merged<- a %>% inner_join(m)

#filter on the basis of technical problems (code 9)
vg_dat<- merged %>% filter(vg_acc!=9)
nwr_dat<- nwr_merged %>% filter(nwr_acc!=99)

#Change all the code from my errors to 1
da<- dat %>% mutate(vg_acc=if_else(vg_acc!=0, 1, 0))
nwr_dat2<- nwr_merged %>% mutate(nwr_acc=if_else(nwr_acc==99, 1, nwr_acc))

table#apply my model for checking the linear rel.between accuracy and selection summary(glmer(acc~selection + (1|sub), family=binomial, data=da))

What NOT to do

- In RStudio, blue usually reflects hard-coded values

```
files <- list.files(pattern = "logfile.txt")</pre>
```

Dprime <- matrix(NA,length(files),16)</pre>

```
for (i in 1:length(files)){
    pNumber <- gsub("_logfile.txt","",files[i])
    currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F, sep = "\t", header = T, skipNul = T))
    currentfile <- currentfile[currentfile$Cordition_nr==1,]
    currentsub <- currentfile[currentfile$Correct_Response=1,] ## subsetting to correct sentences only
    misses <- length(currentsub[currentsub$Response_Score==0,1])/30 # correct sentences that pp made mistakes on
    hit <- length(currentsub[currentsub$Response_Score==1,1])/30 # correct sentences that pp did not make mistakes on
    currentsub2 <- currentfile[currentfile$Correct_Response=2,] # subsetting to incorrect sentences only
    falsealarm <- length(currentsub2[currentsub2$Response_Score==0,1])/30 # incorrect sentences that pp made mistakes on
    corrrej <- length(currentsub2[currentsub2$Response_Score==1,1])/30 # incorrect sentences that pp did not make mistake
    pprime[i,1] <- pNumber
    Dprime[i,2] <- as.numeric(as.character(falsealarm))
    Dprime[i,3] <- as.numeric(as.character(misses))
    Dprime[i,4] <- as.numeric(as.character(corrrej))
}</pre>
```

replace 0 and 1 with approximate values to not get +-inf values after transforming the scores
for (i in 1:nrow(Dprime)){
 if (Dprime[i,2] == 0){
 Dprime[i,2] <- 1/(60)
 } else if (Dprime[i,2] == 1){
 Dprime[i,2] <- 1 - 1/60
 }
</pre>

How it can be better:

Define parameters on top (Note that these can use constant identifier to remind yourself to not change them)

Aside: Note use of both period.separated and loweCamelCase convention -> this is a special scenario where I merged them for clarity.

(Only good if followed consistently!)

```
###-----Paramaters-----####
```

```
logfileText = "_logfile.txt"
totalDprimeColumns = 16
blank = ""
tab = "\t"
conditionOne = 1 #or a condition name would read even better
correctResponse = 1
incorrectResponse = 2
totalTrials = 30
wrongScore = 0
rightScore = 1
###------###
###------####
c.logfileText = "_logfile.txt"
```

```
c.totalDprimeColumns = 16
c.blank = ""
c.tab = "\t"
c.conditionOne = 1 #or a condition name would read even better
c.correctResponse = 1
c.incorrectResponse = 2
c.totalTrials = 30
c.wrongScore = 0
c.rightScore = 1
###------###
```

"c." prefix is meant to reflect to the coder that they are parameters or constants that shouldn't be changed within the rest of the code⁸⁴

How it can be better:

Use defined parameters in code

```
#-----Structure creation-----#####
 Dprime <- matrix(nrow = length(allLogFiles),ncol = totalDprimeColumns)</pre>
  #------###
------Data Processing-----####
 allLogFiles <- list.files(pattern = logfileText)
• for (fileIndex in 1:length(allLogFiles)){
   subjectNumber <- qsub(logfileText,blank,allLogFiles[fileIndex])</pre>
   currentFile <- as.data.frame(read.delim(allLogFiles[fileIndex],</pre>
                                      stringsAsFactors = F,
                                      sep = tab,
                                      header = T.
                                      skipNul = T)
   correctConditionOne <- subset(currentFile,</pre>
                             Condition nr = conditionOne &
                             Correct_Response = correctResponse)
   incorrectConditionOne <- subset(currentFile,</pre>
                               Condition nr = conditionOne &
                               Correct_Response = incorrectResponse)
   ratioMisses <- nrow(subset(correctConditionOne,</pre>
                           Response_Score = wrongScore))/totalTrials
   ratioHits <- nrow(subset(correctConditionOne,</pre>
```

<pre>files <- list.files(pattern = "logfile.txt") Dprime <- matrix(NA,length(files),16)</pre>	<pre>#Structure creation#### Dprime <- matrix(nrow = length(allLogFiles),ncol = totalDprimeColumns) #####</pre>
<pre>for (i in 1:length(files)){ pNumber <- gsub("_logfile.txt","",files[i]) currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F, sep currentfile <- currentfile[currentfile\$Condition_nr==1,] currentsub <- currentfile[currentfile\$Correct_Response==1,] ## subsetting t misses <- length(currentsub[currentsub\$Response_Score==0,1])/30 # correct sen turrentsub2 <- currentfile[currentfile\$Correct_Response=2,] # subsetting t falsealarm <- length(currentsub2[currentsub2\$Response_Score==0,1])/30 # inc correj <- length(currentsub2[currentsub2\$Response_Score==0,1])/30 # inc correj <- length(currentsub2[currentsub2\$Response_Score==0,1])/30 # inc correj <- length(currentsub2[currentsub2\$Response_Score==1,1])/30 # incorr Dprime[i,1] <- pNumber Dprime[i,2] <- as.numeric(as.character(falsealarm)) Dprime[i,3] <- as.numeric(as.character(misses)) Dprime[i,4] <- as.numeric(as.character(misses)) Dprime[i,5] <- as.numeric(as.character(corrrej)) } # replace 0 and 1 with approximate values to not get +-inf values after trans for (i in 1:nrow(Dprime)){</pre>	<pre>#Data Processing</pre>
<pre>if (Dprime[i,2] == 0){ Dprime[i,2] <- 1/(60) } else if (Dprime[i,2] == 1){ Dprime[i,2] <- 1 - 1/60 }</pre>	<pre>ratioMisses <- nrow(subset(correctConditionOne,</pre>

```
files <- list.files(pattern = "logfile.txt")
Dprime <- matrix(NA,length(files),16)</pre>
for (i in 1:length(files)){
                                                                                 ratioMisses <- nrow(subset(correctConditionOne,</pre>
  pNumber <- gsub("_logfile.txt","",files[i])</pre>
                                                                                                               Response_Score = wrongScore))/totalTrials
  currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F,
                                                                                 ratioHits <- nrow(subset(correctConditionOne,</pre>
  currentfile <- currentfile[currentfile$Condition_nr==1,]</pre>
                                                                                                             Response_Score = rightScore))/totalTrials
  currentsub <- currentfile[currentfile$Correct_Response==1,] ## subsettin</pre>
  misses <- length(currentsub[currentsub$Response_score==0,1])/30 # correc</pre>
                                                                                 ratioFalseAlarm <- nrow(subset(incorrectConditionOne,</pre>
  hit <- length(currentsub[currentsub$Response_Score==1,1])/30 # correct s
                                                                                                                    Response_Score = wrongScore))/totalTrials
  currentsub2 <- currentfile[currentfile$Correct_Response==2,] # subsettin</pre>
                                                                                 ratioCorrectReject <- nrow(subset(incorrectConditionOne,</pre>
  falsealarm <- length(currentsub2[currentsub2$Response_Score==0,1])/30 #</pre>
                                                                                                                       Response_Score = rightScore))/totalTrials
  corrrej <- length(currentsub2[currentsub2[Response_Score==1,1])/30 # inc</pre>
  Dprime[i,1] <- pNumber</pre>
                                                                                 Dprime[fileIndex,1] <- subjectNumber</pre>
  Dprime[i,2] <- as.numeric(as.character(falsealarm))</pre>
                                                                                 Dprime[fileIndex,2] <- as.numeric(as.character(ratioFalseAlarm))</pre>
  Dprime[i,3] <- as.numeric(as.character(hit))</pre>
                                                                                 Dprime[fileIndex.3] <- as.numeric(as.character(ratioHits))</pre>
  Dprime[i,4] <- as.numeric(as.character(misses))</pre>
                                                                                 Dprime[fileIndex,4] <- as.numeric(as.character(ratioMisses))</pre>
  Dprime[i,5] <- as.numeric(as.character(corrrej))</pre>
                                                                                 Dprime[fileIndex,5] <- as.numeric(as.character(ratioCorrectReject))</pre>
# replace 0 and 1 with approximate values to not get +-inf values after trans
for (i in 1:nrow(Dprime)){
```

```
if (Dprime[i,2] == 0){
    Dprime[i,2] <- 1/(60)
} else if (Dprime[i,2] == 1){
    Dprime[i,2] <- 1 - 1/60
}
What not to do</pre>
```

How it can be improved

Reduce visual chaos:Break up code using separators and code folding

<pre>files <- list.files(pattern = "logfile.txt") Dprime <- matrix(NA,length(files),16)</pre>	<pre>#Structure creation##### Dprime <- matrix(nrow = length(allLogFiles),ncol = totalDprimeColumns) #####</pre>
<pre>for (i in 1:length(files)){ pNumber <- gsub("_logfile.txt","",files[i]) currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F, sep currentfile <- currentfile[currentfile\$Condition_nr==1,] currentsub <- currentfile[currentfile\$Correct_Response==1,] ## subsetting t misses <- length(currentsub[currentsub\$Response_Score==0,1])/30 # correct sent hit <- length(currentsub[currentsub\$Response_Score==1,1])/30 # correct sent</pre>	<pre>#Data Processing#### allLogFiles <- list.files(pattern = logfileText) for (fileIndex in 1:length(allLogFiles)){ subjectNumber <- gsub(logfileText,blank,allLogFiles[fileIndex])</pre>
<pre>currentsub2 <- currentfile[currentfile\$Correct_Response==2,] # subsetting t falsealarm <- length(currentsub2[currentsub2\$Response_Score==0,1])/30 # inc corrrej <- length(currentsub2[currentsub2\$Response_Score==1,1])/30 # incorr Dprime[i,1] <- pNumber Dprime[i,2] <- as.numeric(as.character(falsealarm)) Dprime[i,3] <- as.numeric(as.character(hit)) Dprime[i,4] <- as.numeric(as.character(misses)) Dprime[i,5] <- as.numeric(as.character(corrrej))</pre>	<pre>currentFile <- as.data.frame(read.delim(allLogFiles[fileIndex],</pre>
<pre>} # replace 0 and 1 with approximate values to not get +-inf values after trans for (i in 1:nrow(Dprime)){ if (Dprime[i,2] == 0){ Dprime[i,2] <- 1/(60) } else if (Dprime[i,2] == 1){ Dprime[i,2] <- 1 - 1/60 } </pre>	Correct_Response = correctResponse) incorrectConditionOne <- subset(currentFile, Condition_nr = conditionOne & Correct_Response = incorrectResponse) ratioMisses <- nrow(subset(correctConditionOne, Response_Score = wrongScore))/totalTrials ratioHits <- nrow(subset(correctConditionOne,

Reduce visual chaos: Break up code using whitespaces and indenting

files <- list.files(pattern = "logfile.txt")

```
Dprime <- matrix(NA,length(files),16)</pre>
```

```
for (i in 1:length(files)){
```

Dprime[i.1] <- pNumber

```
pNumber <- gsub("_logfile.txt","",files[i])
currentfile <- as.data.frame(read.delim(files[i], stringsAsFactors = F, seg
currentfile <- currentfile[currentfile$Condition_nr==1,]
currentsub <- currentfile[currentfile$Correct_Response==1,] ## subsetting 1
misses <- length(currentsub[currentsub$Response_Score==0,1])/30 # correct sent
currentsub2 <- currentfile[currentfile$Correct_Response==2,] # subsetting 1
falsealarm <- length(currentsub2[currentsub2$Response_Score==0,1])/30 # inc</pre>
```

Dprime[i,2] <- as.numeric(as.character(falsealarm))</pre>

Dprime[i,3] <- as.numeric(as.character(hit))</pre>

Dprime[i,4] <- as.numeric(as.character(misses))</pre>

Dprime[i,5] <- as.numeric(as.character(corrrej))</pre>

corrrej <- length(currentsub2[currentsub2\$Response_Score==1,1])/30 # incorr</pre>

```
Dprime[fileIndex,1] <- subjectNumber
Dprime[fileIndex,2] <- as.numeric(as.character(ratioFalseAlarm))
Dprime[fileIndex,3] <- as.numeric(as.character(ratioHits))
Dprime[fileIndex,4] <- as.numeric(as.character(ratioMisses))
Dprime[fileIndex,5] <- as.numeric(as.character(ratioCorrectReject))</pre>
```

```
# replace 0 and 1 with approximate values to not get +-inf values after trans
for (i in 1:nrow(Dprime)){
    if (Dprime[i,2] == 0){
        Dprime[i,2] <- 1/(60)
    } else if (Dprime[i,2] == 1){
        Dprime[i,2] <- 1 - 1/60
    }
```

Reduce visual chaos: Reduce commenting & group lines aligned to same purpose

```
#-----Subiect Wise Data Retrieval------
#import coding results
                                                                    allFileNames = dir(pattern = "SynC_pilot*")
allfilenames = dir(pattern = "SynC_pilot*")
                                                                    allAccuracyData = data.frame()
accdata = data.frame()
                                                                    for (subject in 1:length(allFileNames)) {
for (isubj in 1:length(allfilenames)) {
  #open file
                                                                     subjectAccuracyFileName = allFileNames[subject]
 filename = allfilenames[isubj]
                                                                     subjectAccuracyFile = read.table(subjectAccuracyFileName, header = T, sep = '\t')
  temp = read.table(allfilenames[isubj], header = T, sep = '\t')
                                                                     # Including subject number in dataframe before combining with other subjects' data
  # add subi numer
                                                                     subjectID = unlist(strsplit(subjectAccuracyFileName, "_"))[2]
  subjnr = unlist(strsplit(filename, "_"))[2]
                                                                     subjectAccuracyFile$participant = as.factor(subjectID)
 temp$participant = as.factor(isubj)
                                                                      allAccuracyData = rbind(allAccuracyData,subjectAccuracyFile)
  #combine with other files
  accdata = rbind(accdata,temp)
                                                                    #-----Onset and Offset Time Data Retrieval------
                                                                    onsetOffsetFileNames = dir(pattern = "*onsets_durationAutomatic.txt")
                                                                    allonsetOffsetData = data.frame()
#import onset-offset results
                                                                    for (subject in 1:length(onsetOffsetFileNames)) {
praatfilenames = dir(pattern = "*onsets_durationAutomatic.txt")
praatdata = data.frame()
for (isubj in 1:length(praatfilenames)) {
                                                                      subjectOnsetOffsetFileName = onsetOffsetFileNames[subject]
                                                                     subjectOnsetOffsetData = read.table(onsetOffsetFileNames[subject], header = F, sep = '\t
  #open file
 filename = praatfilenames[isubj]
                                                                     # Including subject number in dataframe before combining with other subjects' data
  temp = read.table(praatfilenames[isubj], header = F, sep = '\t')
                                                                     subjectID = unlist(strsplit(subjectOnsetOffsetFileName, "_"))[1]
                                                                      subjectOnsetOffsetData$participant = subjectID
  # add subj numer
 subjnr = unlist(strsplit(filename, "_"))[1]
                                                                     allonsetOffsetData = rbind(allonsetOffsetData, subjectOnsetOffsetData)
  temp$participant = subjnr
  #combine with other files
  praatdata = rbind(praatdata,temp)
```

□ Function creation helps with:

- Readability
 - □ Break code chunks that do different things
 - Turn into function instead of sections
 - Informative names make it easy to understand

```
00_download.R
01_explore.R
...
09_model.R
10_visualize.R
```

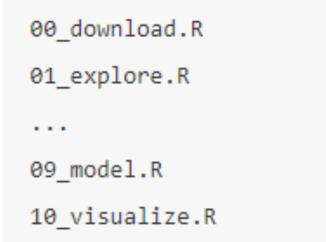
□ Function creation helps with:

- Readability
 - □ Break code chunks that do different things
 - Turn into function instead of sections
 - Informative names make it easy to understand
- □ Simplification

00_download.R 01_explore.R ... 09_model.R 10_visualize.R

□ Function creation helps with:

- Readability
 - □ Break code chunks that do different things
 - Turn into function instead of sections
 - Informative names make it easy to understand
- Simplification
- Reusability



Function creation helps with:

- Readability
 - □ Break code chunks that do different things
 - Turn into function instead of sections
 - Informative names make it easy to understand
- Simplification
- Reusability
- Debugging



Another way is to have a file with all user-defined functions and then source that file

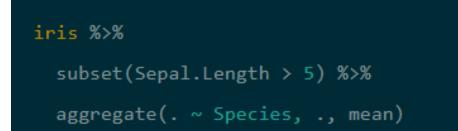
```
multiply <- function(varOne,varTwo) {
    product = varOne * varTwo
    return (product)}
addThirty <- function(varOne,varTwo){
    total = varOne + varTwo + 30
    return(total)}
calcweight <- function(listofVariables){
    weight = listofVariables/sum(listofVariables)
    return(weight)
}</pre>
```

source("file_all_functions.R")

Bonus mention: Pipe Functions & goodpractice

magrittr package

Lidyverse or dplyr frequently used



goodpractice

Example Source: <u>https://www.datacamp.com/commu</u> <u>nity/tutorials/pipe-r-tutorial</u>

Thank you!

DO PEER REVIEWS!