

Week 2 - Codebook

October 14, 2024

1 Week 2: Importing Data

1.1 Clear the entire workspace

```
[52]: rm(list=ls())
```

1.2 Load required libraries

```
[53]: ReqdLibs = c("here", "purrr", "readxl", "Hmisc", "chron", "ggplot2", "ggthemes", "dplyr")
invisible(lapply(ReqdLibs, library, character.only = TRUE))
```

1.3 Theme defaults

This is only for the Jupyter Notebook so you the figures axes are larger

```
[54]: thm = theme(
  strip.text.x=element_text(size=20,face="bold"),
  strip.text.y=element_text(size=20,face="bold"),
  legend.text=element_text(size=16,face="bold"),
  legend.position = "top",
  legend.title=element_text(size=16,face="bold"),
  title =element_text(size=14, face='bold'),
  text = element_text(colour = "black",size=18),
  plot.title = element_text(colour = "black",size = 22, face = "bold"),
  axis.ticks.length = unit(0.3,"cm"),
  axis.line = element_line(colour = "black",size=0.85),
  axis.ticks = element_line(colour = "black",size=0.85),
  axis.text = element_text(colour = "black",size=24),
  axis.title=element_text(size=25))
```

1.4 Retrieve the folder path to the data files, a.k.a, the *Root Folder*

Note that this section is slightly different from the R project folder because the Jupyter notebook is outside the R project folder and is read within the root folder `ReproRehab_Bootcamp` so we are going to need to direct it to the `Materials/Week 2/R` project folder.

```
[55]: folder_path = here("Materials/Week 2/R project", "Raw Data")
# output the folder name
print(folder_path)
# make sure it exists
dir.exists(folder_path)
```

```
[1] "/Users/rinivarghese/Documents/My Documents/JHU/Lab/Professional
Development/ReproRehab 2024/ReproRehab_Bootcamp/Materials/Week 2/R project/Raw
Data"
```

```
TRUE
```

1.5 What subfolders and files are within the root folder? Let's check.

OK, once we have the *'folder path'* to the root folder, i.e., Raw Data, it is important to know exactly what the structure within is. In our case, the structure looks something like this: Raw

```
Data/    sub1/      sub1_rest.xlsx    sub1_trial1.xlsx    sub1_trial2.xlsx
...      sub2/      sub2_rest.xlsx    sub2_trial1.xlsx    sub2_trial2.xlsx
...      sub3/      sub3_rest.xlsx    sub3_trial1.xlsx    sub3_trial2.xlsx
...      ...
```

```
[56]: options(warn=0)
subfolder_path = here(folder_path, 'Sub1')

files.test=list.files(subfolder_path)
files.test

#Let's read in one file to see how ugly the data are
temp0=suppressMessages(read_excel(here(subfolder_path,files.test[1]),))
head(temp0)
```

```
1. 'Sub1_rest.xlsx' 2. 'Sub1_trial1.xlsx' 3. 'Sub1_trial2.xlsx' 4. 'Sub1_trial3.xlsx'
5. 'Sub1_trial4.xlsx' 6. 'Sub1_trial5.xlsx' 7. 'Sub1_trial6.xlsx'
```

	ID code:	11	...3	Test number:	88	...
	<chr>	<chr>	<lgl>	<chr>	<chr>	<lgl>
A tibble: 6 × 129	Last name:	SUBJECT	NA	Test date:	6/21/2017	NA
	First name:	NO1	NA	Test time:	10:16	NA
	Sex:	M	NA	N. of steps:	53	NA
	Age:	26	NA	Duration (hh:mm:ss):	00:02:59	NA
	Height (in):	72.834645669291334	NA	BSA (m ²):	2.1000404912839743	NA
	Weight (lb):	189.59770013580487	NA	BMI (Kg/m ²):	25.127830533235937	NA

1.6 So, as you see above, the data are quite messy

we will modify the code so we only import a certain range Let's just do the first 5 rows where the data is in long format

```
[57]: temp=suppressMessages(read_excel(here(subfolder_path,files.test[1]),range =  
    ↪cell_cols("J:0")))
head(temp)
# the first two rows are header-like information so remove it
temp=temp[-c(1,2),-2]
head(temp)
```

	t	...2	Rf	VT	VE	VO2
	<chr>	<dbl>	<chr>	<chr>	<chr>	<chr>
	hh:mm:ss	NA	b/min	l	l/min	ml/min
A tibble: 6 × 6	0	NA	NA	NA	NA	NA
	00:00:02	2	18.518518518518519	0.75485305361151733	13.978760252065134	408.698704538219
	00:00:05	3	20.979020979020977	0.55389892987980249	11.620257270205645	304.786751427508
	00:00:08	3	18.237082066869302	0.70588961229617564	12.873366789595908	347.704321728538
	00:00:10	2	25.531914893617021	0.78239498935139695	19.97604228131226	614.813454296942

	t	Rf	VT	VE	VO2
	<chr>	<chr>	<chr>	<chr>	<chr>
A tibble: 6 × 5	00:00:02	18.518518518518519	0.75485305361151733	13.978760252065134	408.698704538219
	00:00:05	20.979020979020977	0.55389892987980249	11.620257270205645	304.786751427508
	00:00:08	18.237082066869302	0.70588961229617564	12.873366789595908	347.704321728538
	00:00:10	25.531914893617021	0.78239498935139695	19.97604228131226	614.813454296942
	00:00:13	21.978021978021978	0.49575484331783432	10.895710842150205	253.643090772051
	00:00:16	18.927444794952681	0.78749534782174502	14.90527472217814	437.096660485628

1.7 Now we do this iteratively.

We go to our root folder Raw Data then we loop through all the subjects' folders within it to repeat the steps described above.

1.7.1 create a list of all the folder names within the root folder

```
[58]: dir.list = dir(folder_path)
dir.list
```

1. 'Sub1' 2. 'Sub10' 3. 'Sub11' 4. 'Sub12' 5. 'Sub13' 6. 'Sub2' 7. 'Sub3' 8. 'Sub4' 9. 'Sub5' 10. 'Sub6'
11. 'Sub7' 12. 'Sub8' 13. 'Sub9'

1.7.2 create an empty data.frame that can accommodate any variable type

`data.frame(list())`: Converts the empty list into a data frame. Lists can accommodate any data type, i.e., numeric, string, characters, booleans etc. Since the list is empty, the resulting data frame will have no columns and no rows. In other words, this command initializes an empty data frame, which can later be filled with data, but starts with no content (i.e., no columns and no rows).

```
[59]: data.all = data.frame(list())
```

1.8 Method 1: using a for loop to compile the master dataset

We use a for loop in R to iteratively “stack” individual participant data tables. For each participant, the steps are the same as we did above.

```
[60]: for(i in 1:length(dir.list)){
  files.import=list.files(here(folder_path,dir.list[i]))
  for(j in 1:length(files.import)){
    #Give me only the rows I need
    temp=suppressMessages(read_excel(here(folder_path,dir.list[i],files.
    ↪import[j]),
                                     range = cell_cols("J:0")))

    #Remove the random stuff
    temp=temp[-c(1,2),-2]
    #Convert to numeric
    temp[,c(2:5)]=apply(temp[,c(2:5)],2,as.numeric)
    #Covert to seconds
    temp$t=seconds(times(temp$t))+(minutes(times(temp$t))*60)
    #Assign Sub id
    temp$Sub=dir.list[i]
    #Assign trial id
    if(nchar(files.import[j])<16){
      temp$trial="rest"
    }else{
      temp$trial=paste("trial",as.numeric(substr(files.import[j],nchar(files.
    ↪import[j])-5,nchar(files.import[j])-5)))
    }
    # this final step is where the 'stacking' happens
    data.all=rbind(data.all,temp)
  }
}
```

1.8.1 Last step! Check the compiled dataset dimensions

```
[61]: head(data.all)
dim(data.all)
```

	t	Rf	VT	VE	VO2	Sub	trial
	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<chr>	<chr>
A tibble: 6 × 7	2	18.51852	0.7548531	13.97876	408.6987	Sub1	rest
	5	20.97902	0.5538989	11.62026	304.7868	Sub1	rest
	8	18.23708	0.7058896	12.87337	347.7043	Sub1	rest
	10	25.53191	0.7823950	19.97604	614.8135	Sub1	rest
	13	21.97802	0.4957548	10.89571	253.6431	Sub1	rest
	16	18.92744	0.7874953	14.90527	437.0967	Sub1	rest

1. 15062 2. 7

1.9 Method 2: using `map_df` in the *purrr* package

`map_df` is used in two layers: * **Outer Layer**: Iterates over each directory in *dir.list*, listing files within each directory. * **Inner Layer**: Processes each file in the current directory by: 1) reading the Excel file, 2) cleaning the data, 3) converting time to seconds, and 4) assigning identifiers.

This nesting efficiently combines results from all files into a single data frame, allowing for streamlined data aggregation from multiple directories.

```
[62]: data.all <- map_df(dir.list, function(dir_name) {
  # List all files in the current directory
  files.import <- list.files(here(folder_path, dir_name))

  map_df(files.import, function(file_name) {
    # Read the Excel file
    temp <- suppressMessages(read_excel(here(folder_path, dir_name, file_name),
    ↪range = cell_cols("J:O")))

    # Clean the data
    temp <- temp[-c(1, 2), -2]
    temp[, 2:5] <- apply(temp[, 2:5], 2, as.numeric)

    # Convert time to seconds
    temp$t <- seconds(times(temp$t)) + (minutes(times(temp$t)) * 60)

    # Assign Sub id
    temp$Sub <- dir_name

    # Assign trial id
    temp$trial <- ifelse(nchar(file_name) < 16, "rest", paste("trial", as.
    ↪numeric(substr(file_name, nchar(file_name) - 5, nchar(file_name) - 5)))

    return(temp)
  })
})

# Now data.all contains all the processed data
head(data.all)
dim(data.all)
```

	t	Rf	VT	VE	VO2	Sub	trial
	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<chr>	<chr>
A tibble: 6 × 7	2	18.51852	0.7548531	13.97876	408.6987	Sub1	rest
	5	20.97902	0.5538989	11.62026	304.7868	Sub1	rest
	8	18.23708	0.7058896	12.87337	347.7043	Sub1	rest
	10	25.53191	0.7823950	19.97604	614.8135	Sub1	rest
	13	21.97802	0.4957548	10.89571	253.6431	Sub1	rest
	16	18.92744	0.7874953	14.90527	437.0967	Sub1	rest

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1.10 Method 3: combined power of map_df and dplyr

all the same things as above, but note how we transform the data in the inner layer with dplyr.

```
[63]: data.all <- map_df(dir.list, function(dir_name) {  
  # List all files in the current directory  
  files.import <- list.files(here(folder_path, dir_name))  
  
  map_df(files.import, function(file_name) {  
    # Read the Excel file  
    temp <- suppressMessages(read_excel(here(folder_path, dir_name, file_name),  
    ↪range = cell_cols("J:O"))) %>%  
    # Clean and transform the data  
    slice(-c(1, 2)) %>% # Remove the first two rows  
    select(-2) %>% # Remove the second column  
    mutate(across(2:5, as.numeric), # Convert columns 2 to 5 to numeric  
    ↪t = seconds(times(t)) + (minutes(times(t)) * 60), # Convert time  
    ↪to seconds  
    Sub = dir_name, # Assign Sub id  
    trial = ifelse(nchar(file_name) < 16, "rest",  
    ↪# Assign trial id below by concatenating diff pieces  
    ↪of info  
    ↪paste("trial", as.numeric(substr(file_name,  
    ↪nchar(file_name) - 5, nchar(file_name) - 5))))  
  
    return(temp)  
  })  
})  
  
# Now data.all contains all the processed data  
head(data.all)  
dim(data.all)
```

A tibble: 6 × 7

t	Rf	VT	VE	VO2	Sub	trial
<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<chr>	<chr>
2	18.51852	0.7548531	13.97876	408.6987	Sub1	rest
5	20.97902	0.5538989	11.62026	304.7868	Sub1	rest
8	18.23708	0.7058896	12.87337	347.7043	Sub1	rest
10	25.53191	0.7823950	19.97604	614.8135	Sub1	rest
13	21.97802	0.4957548	10.89571	253.6431	Sub1	rest
16	18.92744	0.7874953	14.90527	437.0967	Sub1	rest

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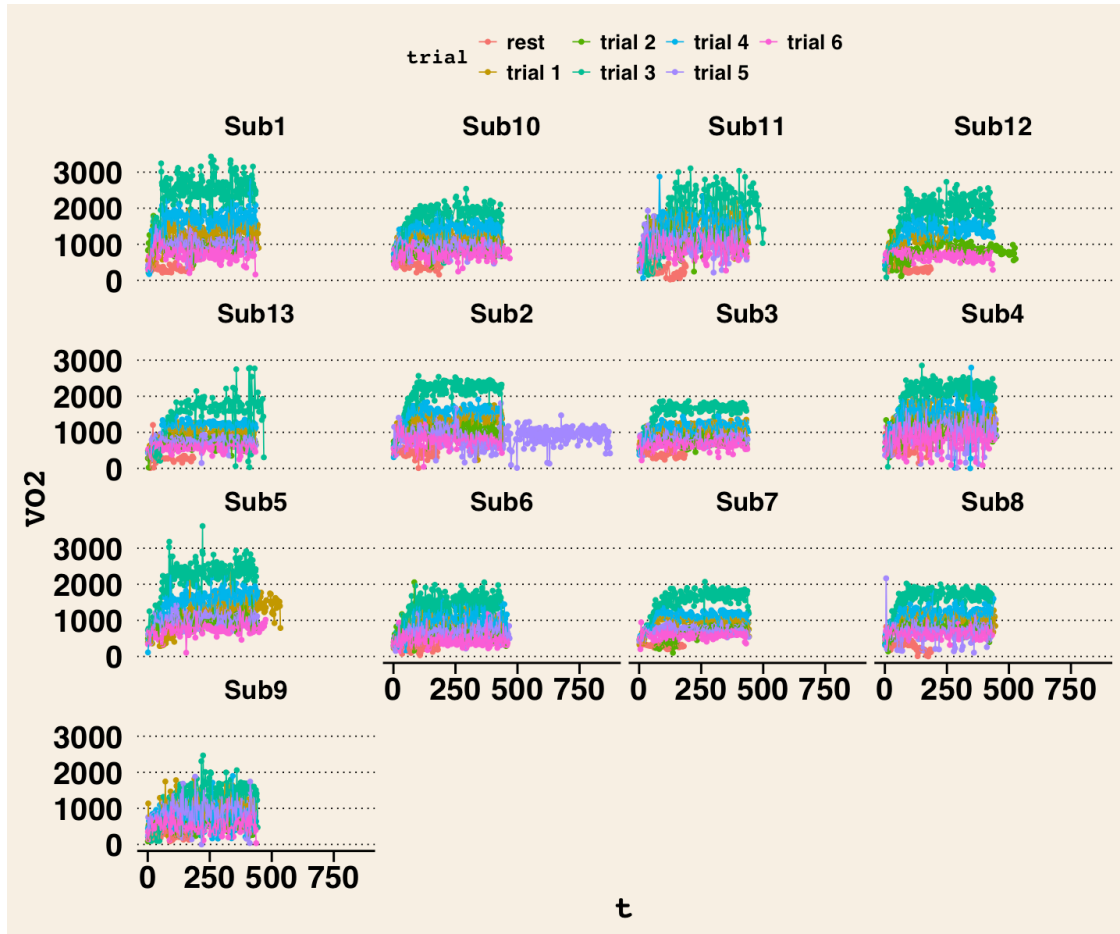
1.11 Visualization

Now that we have our compiled dataset, let's visualize it at different levels

1.11.1 Each timepoint for each trial for per participant

```
[64]: options(repr.plot.width = 12, repr.plot.height = 10)
```

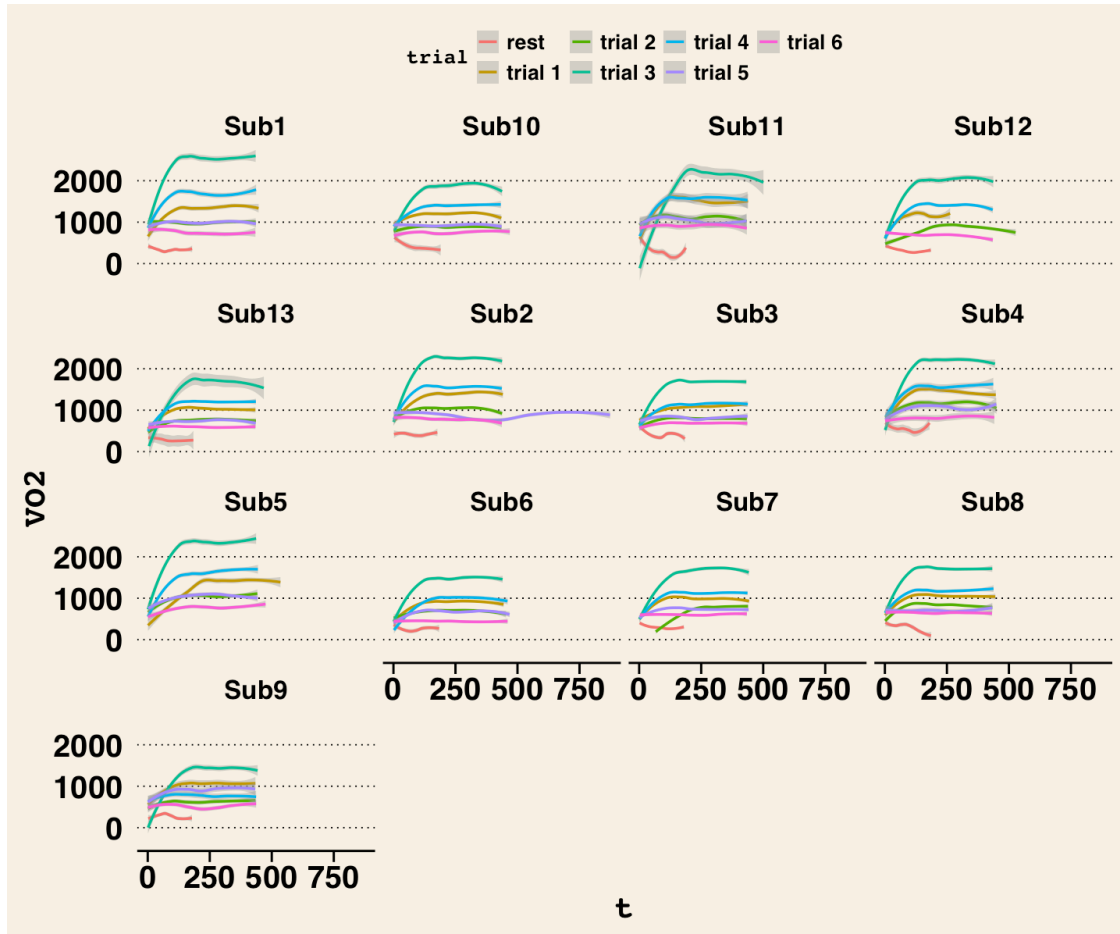
```
#Visualize raw data by subject  
ggplot(data.all, aes(x=t, y=V02, color=trial)) +  
  geom_point() +  
  geom_line() +  
  facet_wrap(~Sub) + theme_ws() + thm
```



1.11.2 Smoothed traces across time for each trial per participant

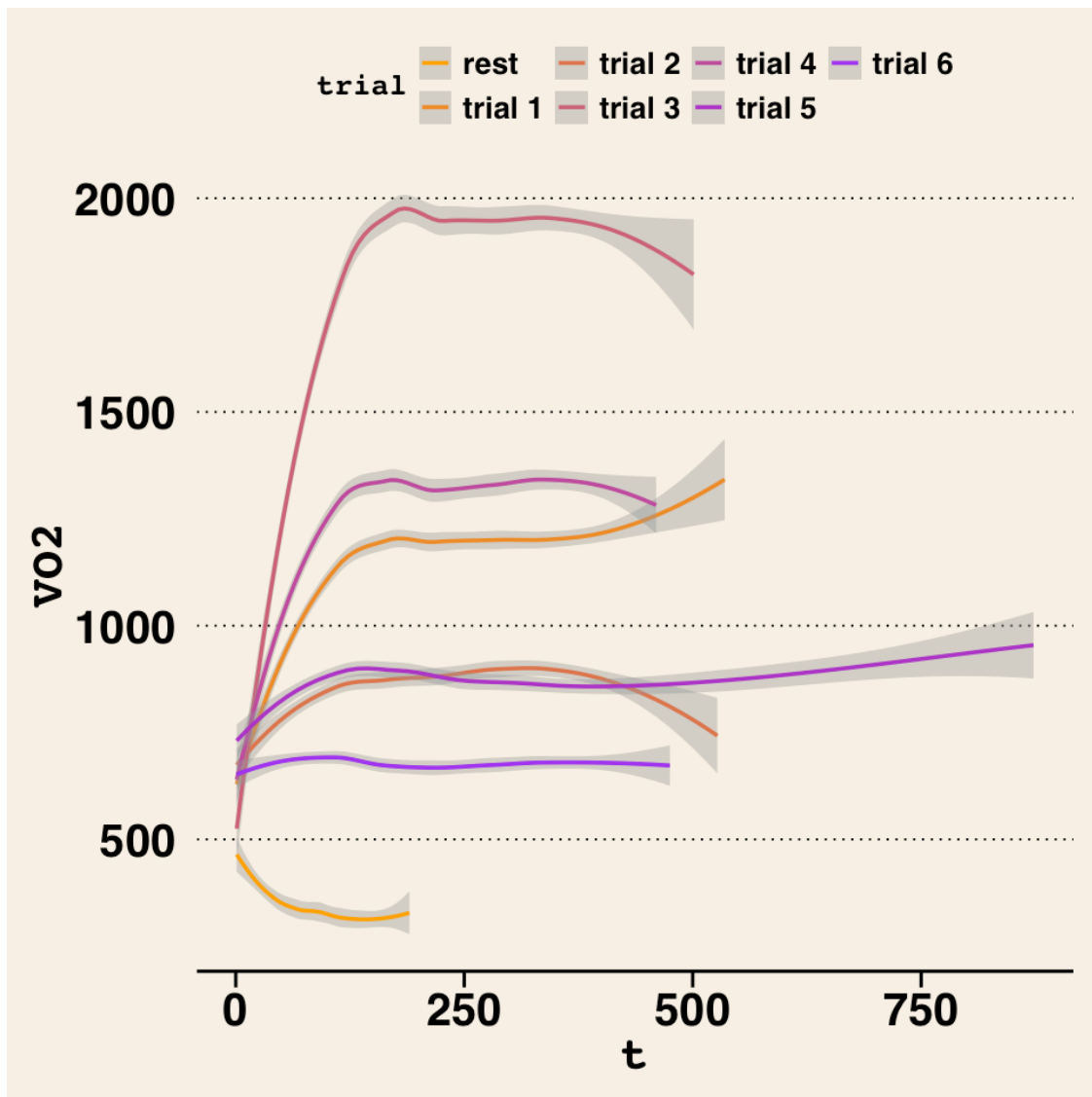
In smoothing, we use a 'loess' procedure. This function is in-built within the `geom_smooth` function of `ggplot`. The 'loess' or 'lowess' procedure follows a kind of windowed smoothing procedure. It assigns weights to each point within the window, with closer points given higher weights, to calculate the smoothed value for each data point.

```
[65]: #Visualize data using loess by subject
ggplot(data.all,aes(x=t,y=VO2,color=trial))+
  geom_smooth(method = 'loess', formula = 'y~x')+
  facet_wrap(~Sub) + theme_ws() + thm
```



1.11.3 Each trial averaged across participants

```
[66]: options(repr.plot.width = 8, repr.plot.height = 8)
#create a color gradient
colfunc <- colorRampPalette(c("orange", "purple"))
#Visualize each trial across all participants
ggplot(data.all,aes(x=t,y=VO2,color=trial))+
  geom_smooth(method = 'loess', formula = 'y~x')+
  scale_colour_manual(values = c(colfunc(7))) + theme_ws() + thm
```

1.12 The End