Quality assurance/quality control (QA/QC) of the health data

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Outline

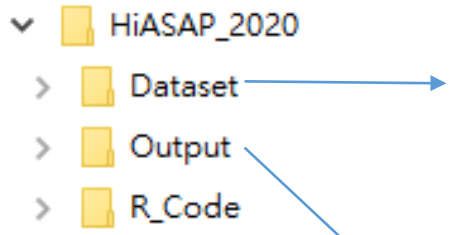
Part 1: Introduction of datasets

Part 2: Introduction of RStudio

Part 3: QA/QC of heart rate variability (HRV) data

Part 1:
Introduction of dataset

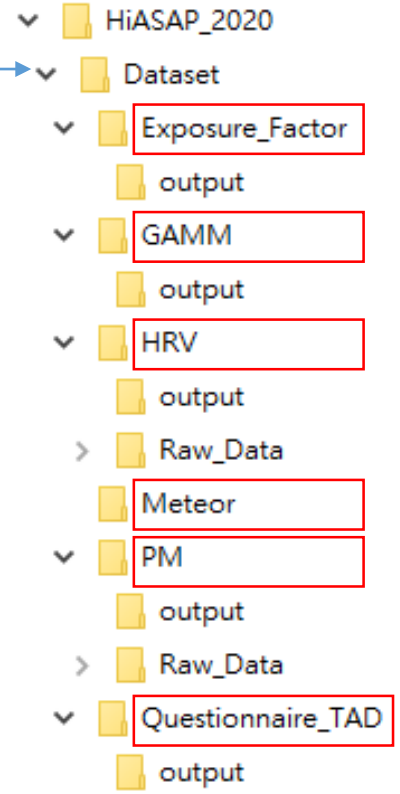
Datasets



1. The “Dataset” folder including PM, health (heart rate variability), questionnaire, time activity diaries and meteorological data

2. The “Output” folder including the all outputs which will generate in this training course

3. The “R_Code” folder



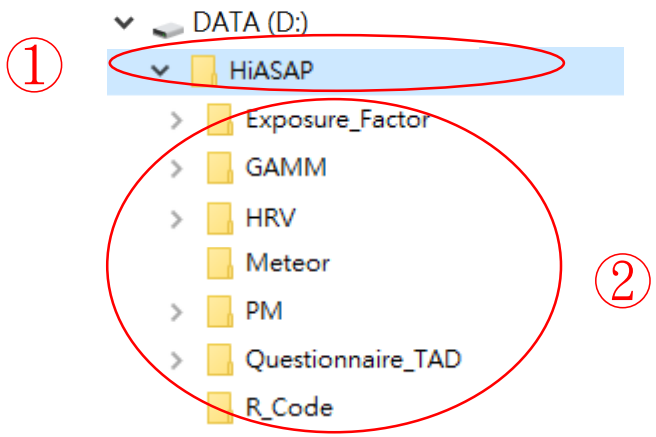
The datasets including 6 main sub-folders:

1. Exposure factors
2. GAMM (Generalized Additive Mixed Model)
3. HRV (heart rate variability) data
4. Meteorological data
5. PM data
6. Questionnaire and time-activity diary data

Default path of data files in this course

- In order to make sure you can use the R codes provided to analyze the data directly, please follow the steps below:

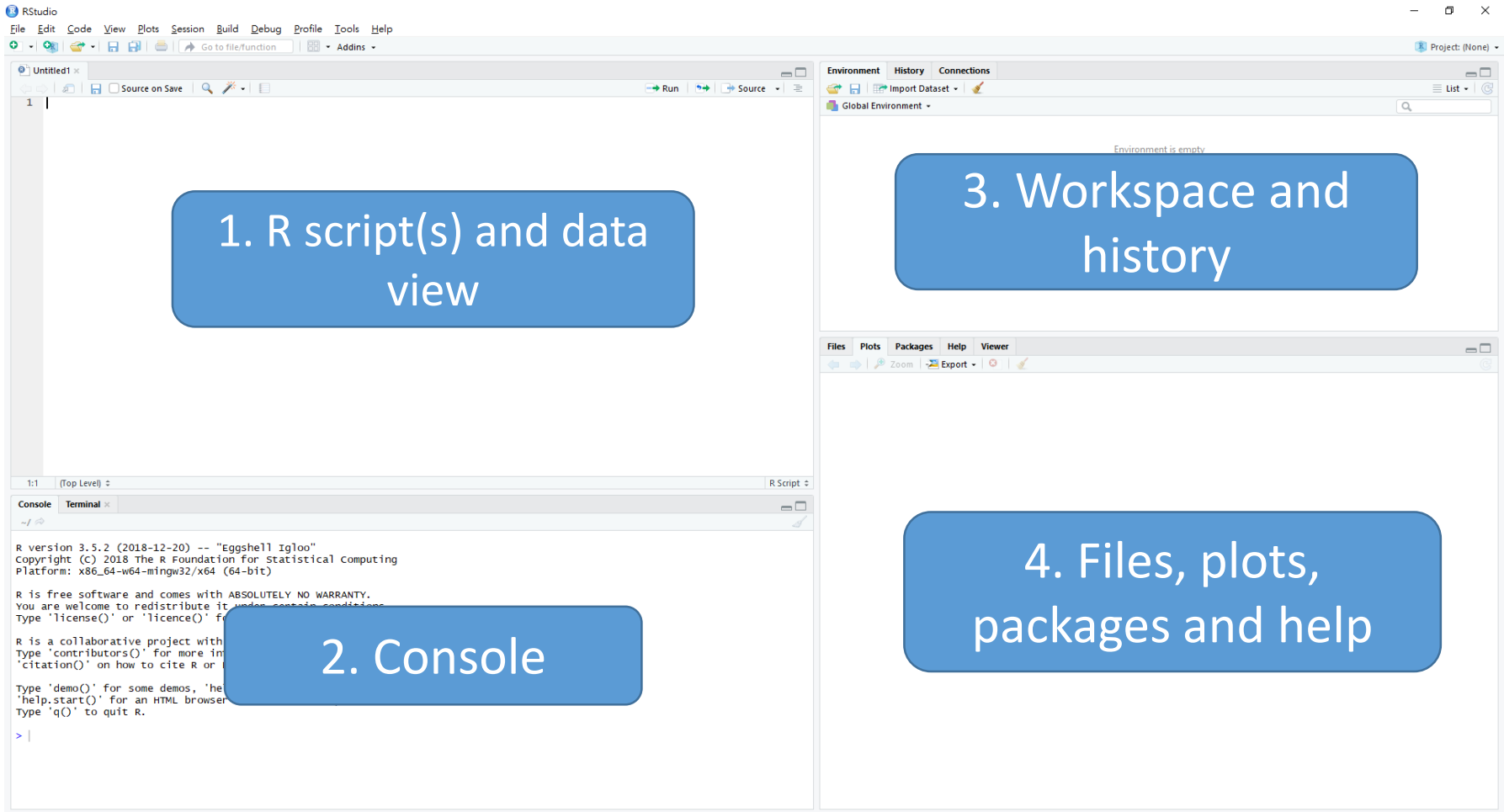
1. To create a “HiASAP” folder in D drive
2. To move all datasets provided to the “HiASAP” folder



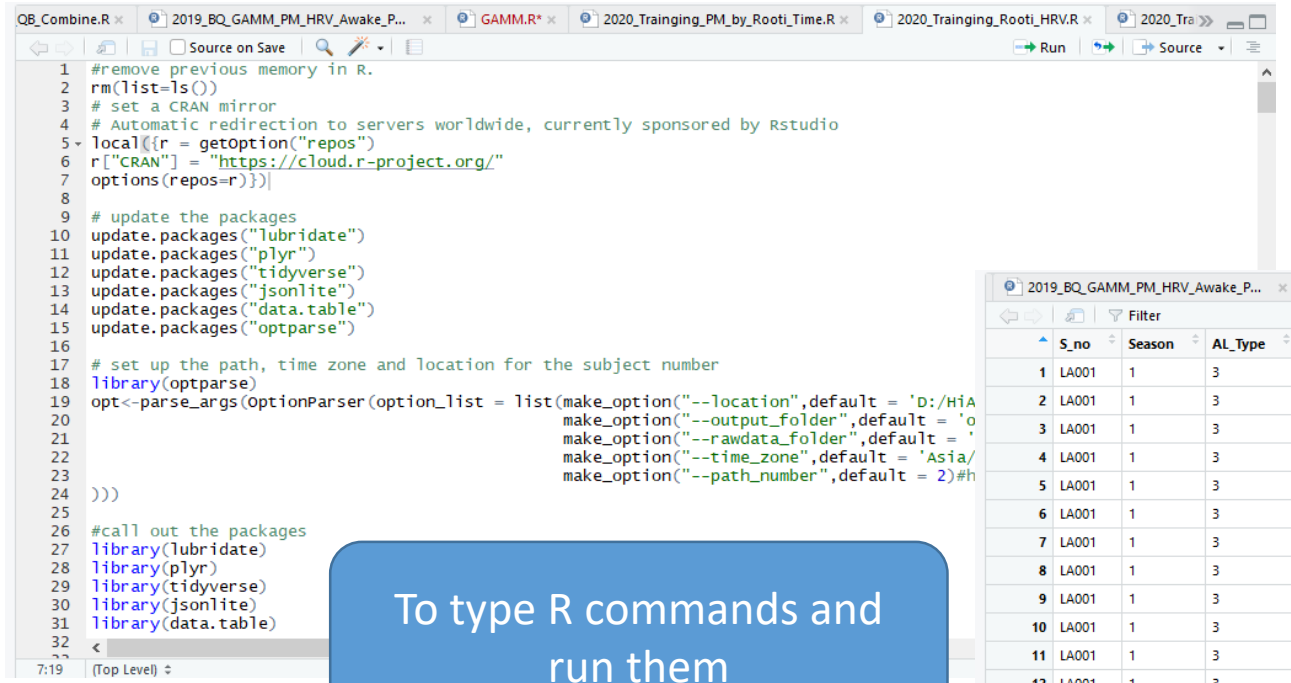
Part 2:
Introduction of RStudio

RStudio environments

- RStudio allows the user to run R in a more user-friendly environment.



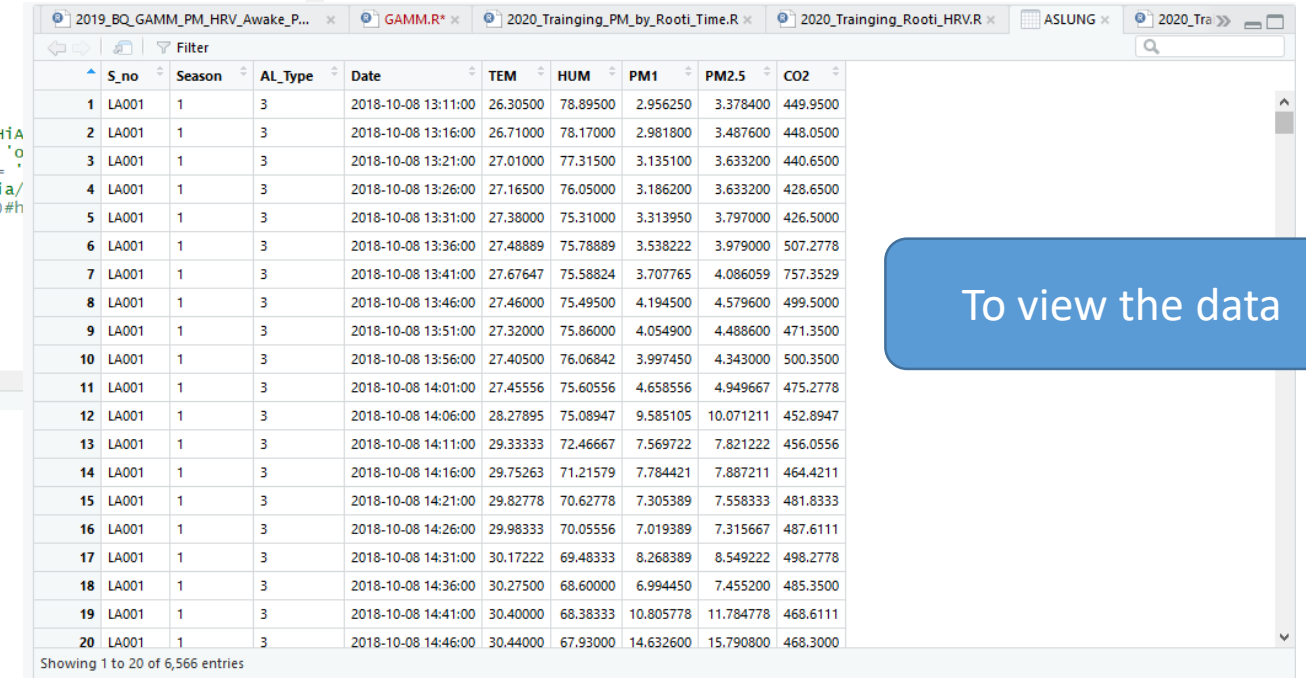
1. R script(s) and data view (upper left window)



The script can be saved as a R file

To type R commands and run them

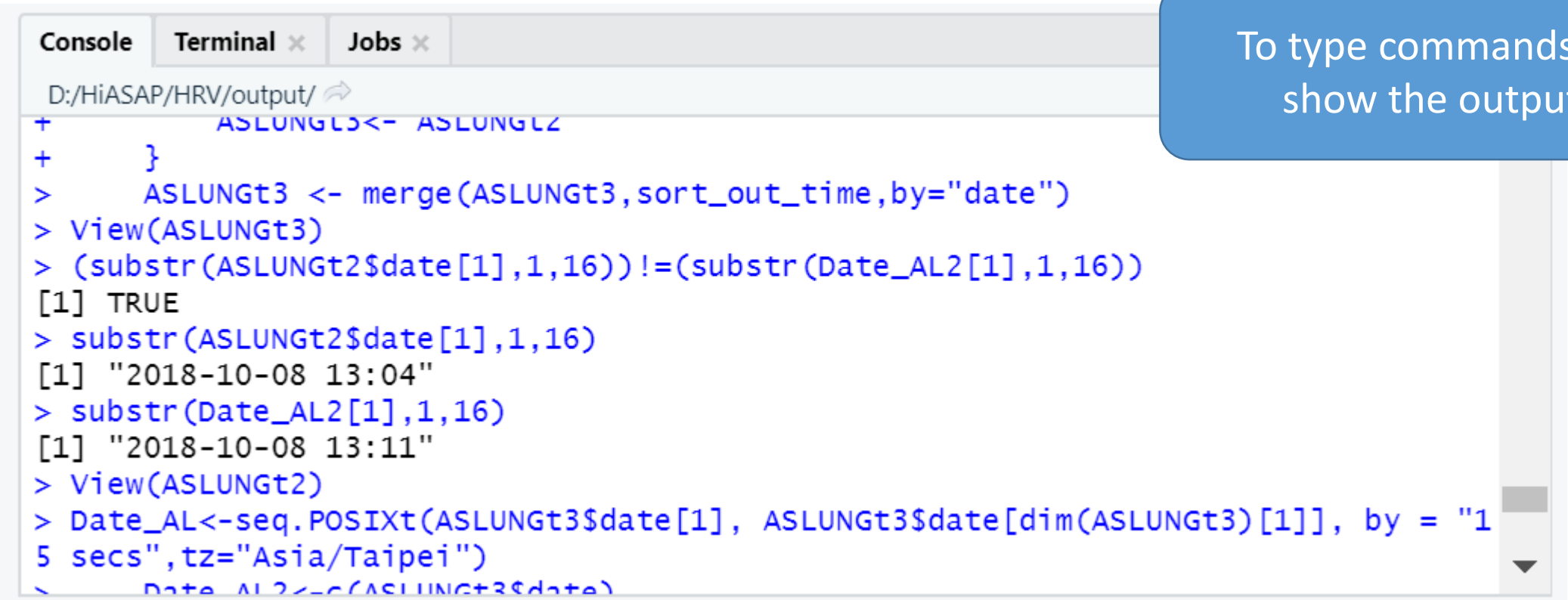
Output will appear in the Console window below.



	S_no	Season	AL_Type	Date	TEM	HUM	PM1	PM2.5	CO2
1	LA001	1	3	2018-10-08 13:11:00	26.30500	78.89500	2.956250	3.378400	449.9500
2	LA001	1	3	2018-10-08 13:16:00	26.71000	78.17000	2.981800	3.487600	448.0500
3	LA001	1	3	2018-10-08 13:21:00	27.01000	77.31500	3.135100	3.633200	440.6500
4	LA001	1	3	2018-10-08 13:26:00	27.16500	76.05000	3.186200	3.633200	428.6500
5	LA001	1	3	2018-10-08 13:31:00	27.38000	75.31000	3.313950	3.797000	426.5000
6	LA001	1	3	2018-10-08 13:36:00	27.48889	75.78889	3.538222	3.979000	507.2778
7	LA001	1	3	2018-10-08 13:41:00	27.67647	75.58824	3.707765	4.086059	757.3529
8	LA001	1	3	2018-10-08 13:46:00	27.46000	75.49500	4.194500	4.579600	499.5000
9	LA001	1	3	2018-10-08 13:51:00	27.32000	75.86000	4.054900	4.488600	471.3500
10	LA001	1	3	2018-10-08 13:56:00	27.40500	76.06842	3.997450	4.343000	500.3500
11	LA001	1	3	2018-10-08 14:01:00	27.45556	75.60556	4.658556	4.949667	475.2778
12	LA001	1	3	2018-10-08 14:06:00	28.27895	75.08947	9.585105	10.071211	452.8947
13	LA001	1	3	2018-10-08 14:11:00	29.33333	72.46667	7.569722	7.821222	456.0556
14	LA001	1	3	2018-10-08 14:16:00	29.75263	71.21579	7.784421	7.887211	464.4211
15	LA001	1	3	2018-10-08 14:21:00	29.82778	70.62778	7.305389	7.558333	481.8333
16	LA001	1	3	2018-10-08 14:26:00	29.98333	70.05556	7.019389	7.315667	487.6111
17	LA001	1	3	2018-10-08 14:31:00	30.17222	69.48333	8.268389	8.549222	498.2778
18	LA001	1	3	2018-10-08 14:36:00	30.27500	68.60000	6.994450	7.455200	485.3500
19	LA001	1	3	2018-10-08 14:41:00	30.40000	68.38333	10.805778	11.784778	468.6111
20	LA001	1	3	2018-10-08 14:46:00	30.44000	67.93000	14.632600	15.790800	468.3000

To view the data

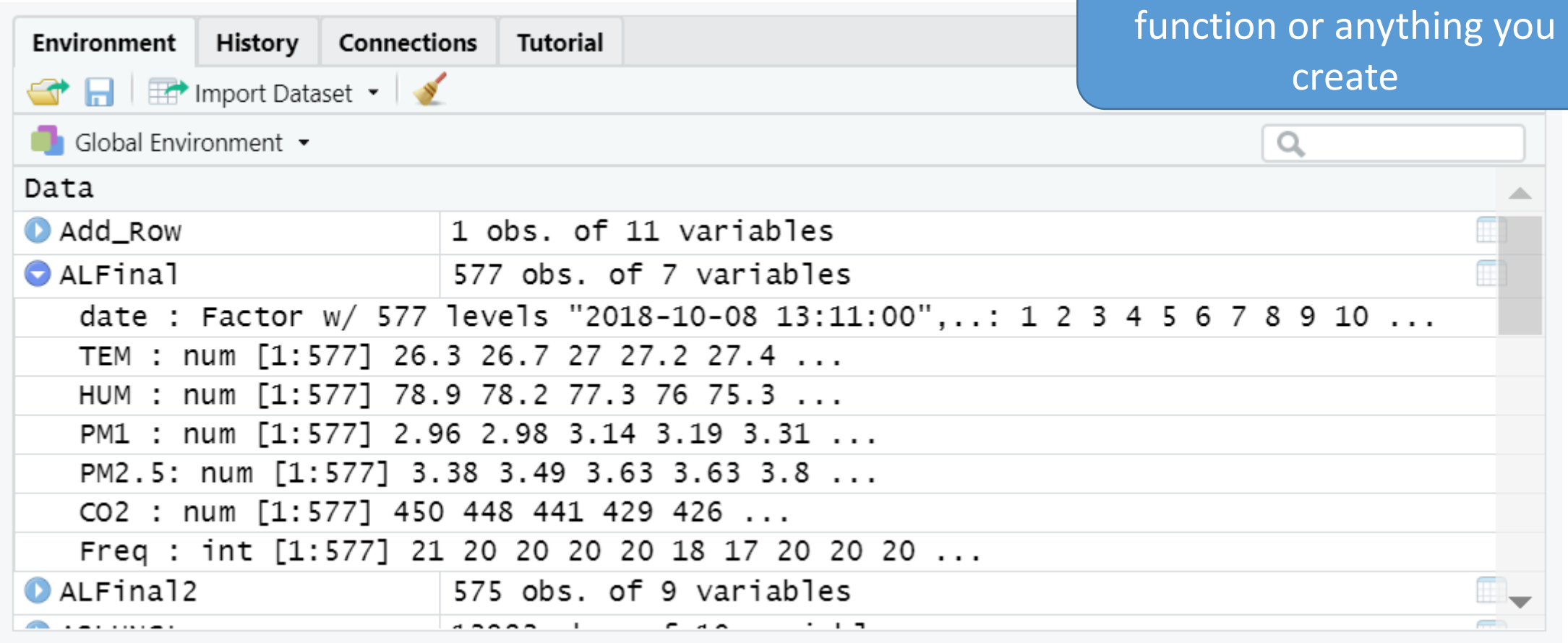
2. Console (lower left window)



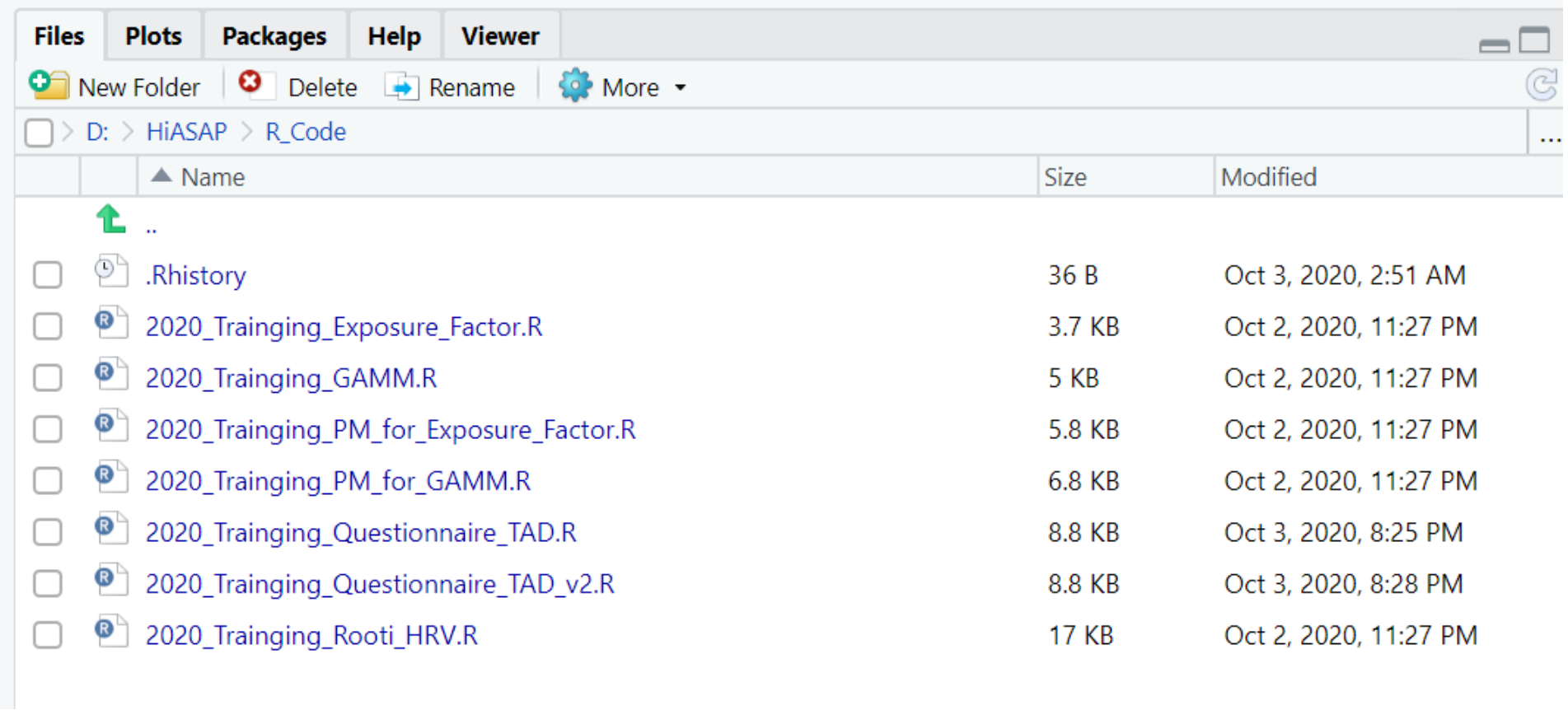
To type commands and show the outputs

3. Workspace (upper right window)

To store any object, value, function or anything you create



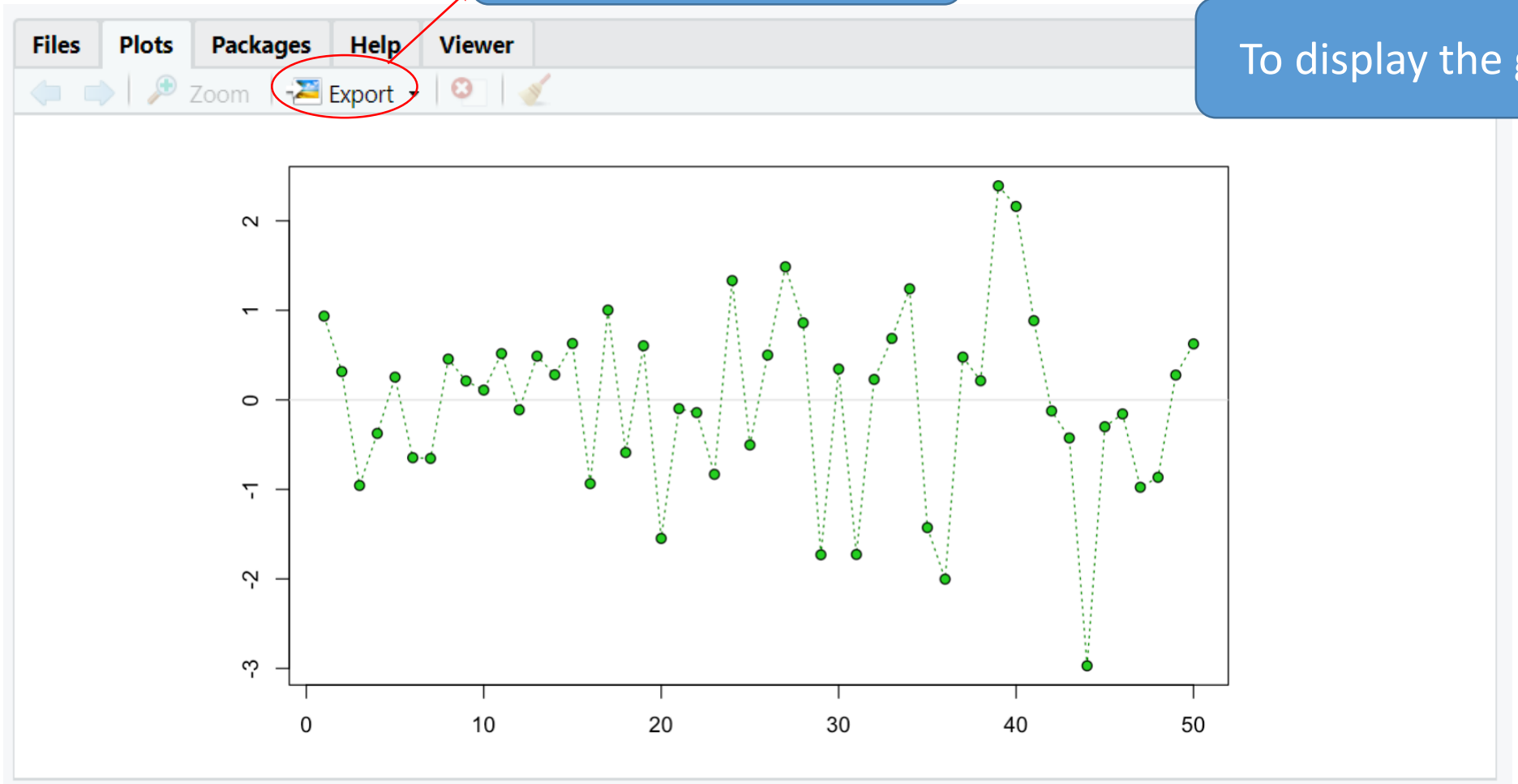
4. Files, plots, packages and help (lower right window) - Files tab



4. Files, plots, packages and help (lower right window) - Plot

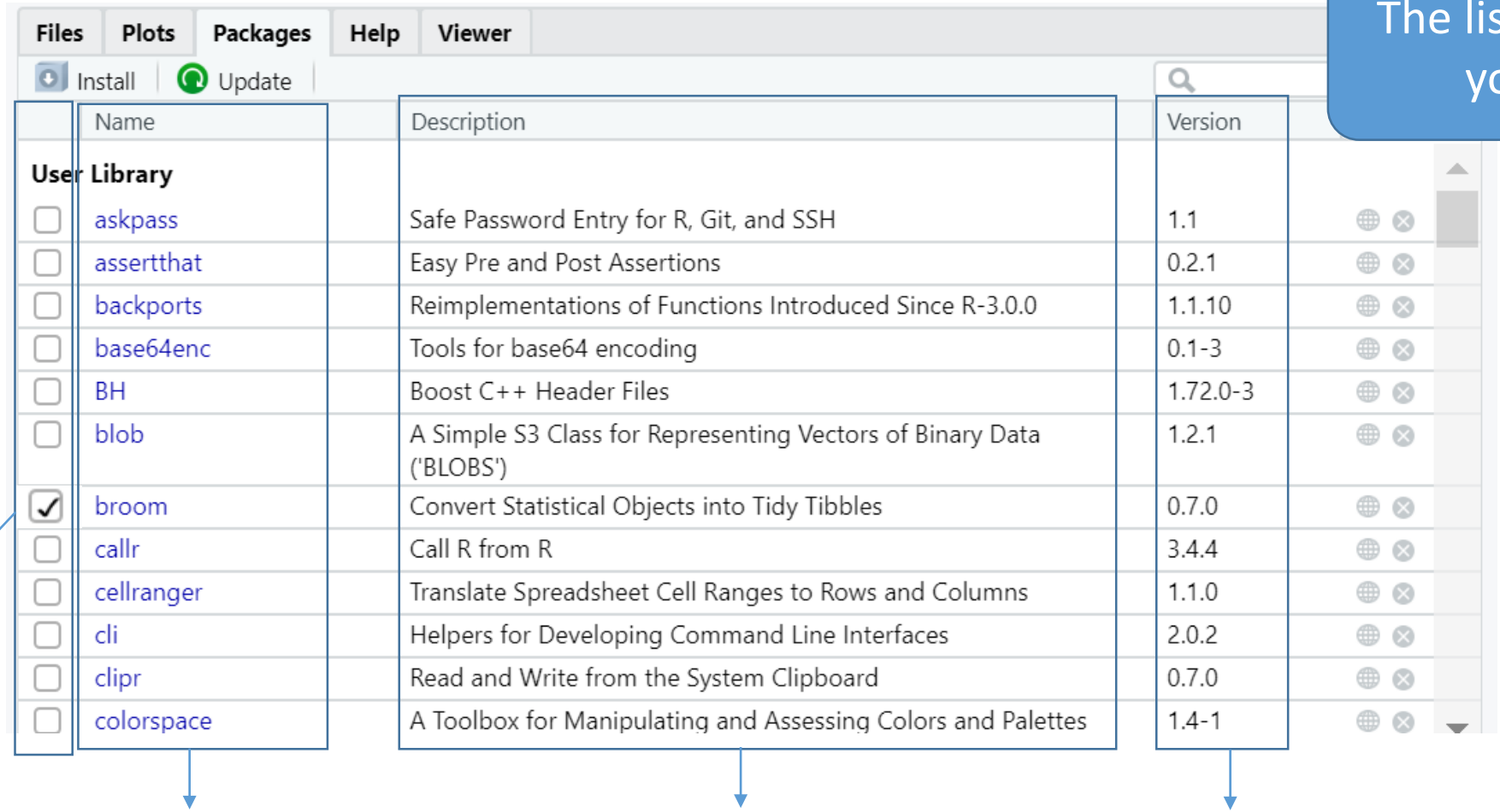
To export the graphs

To display the graphs



4. Files, plots, packages and help (lower right window) - Packages tab

The list of R packages you installed



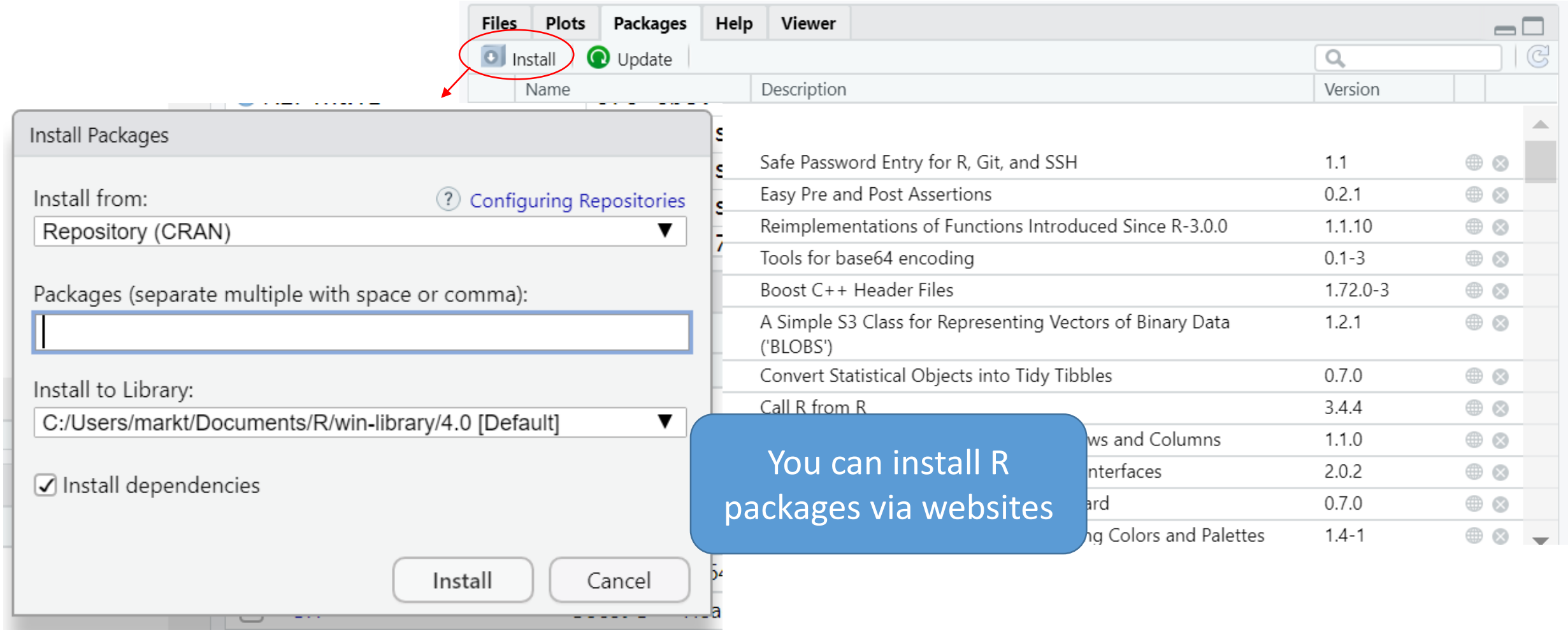
The tick means the R package has been loaded

The name of R packages

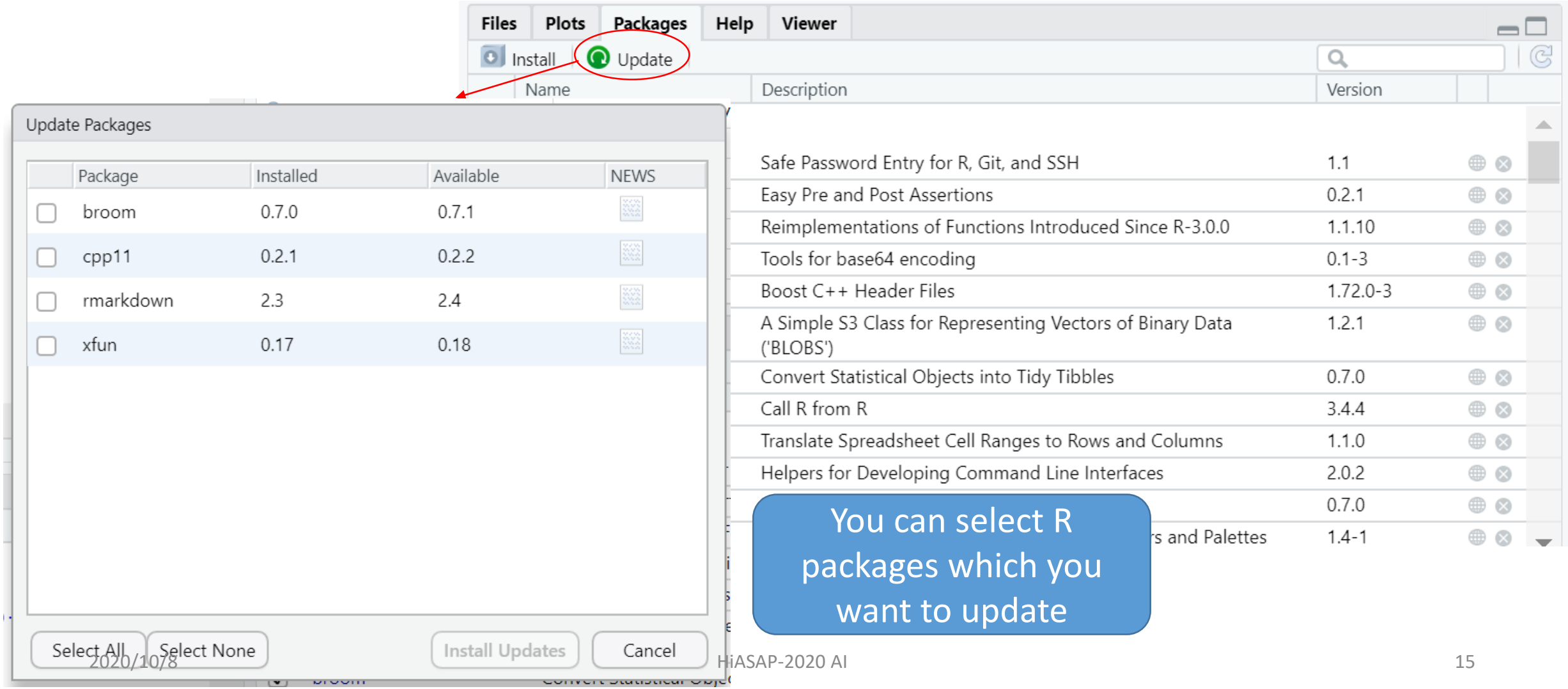
The description of R packages

The version of R packages

4. Files, plots, packages and help (lower right window) - Packages tab

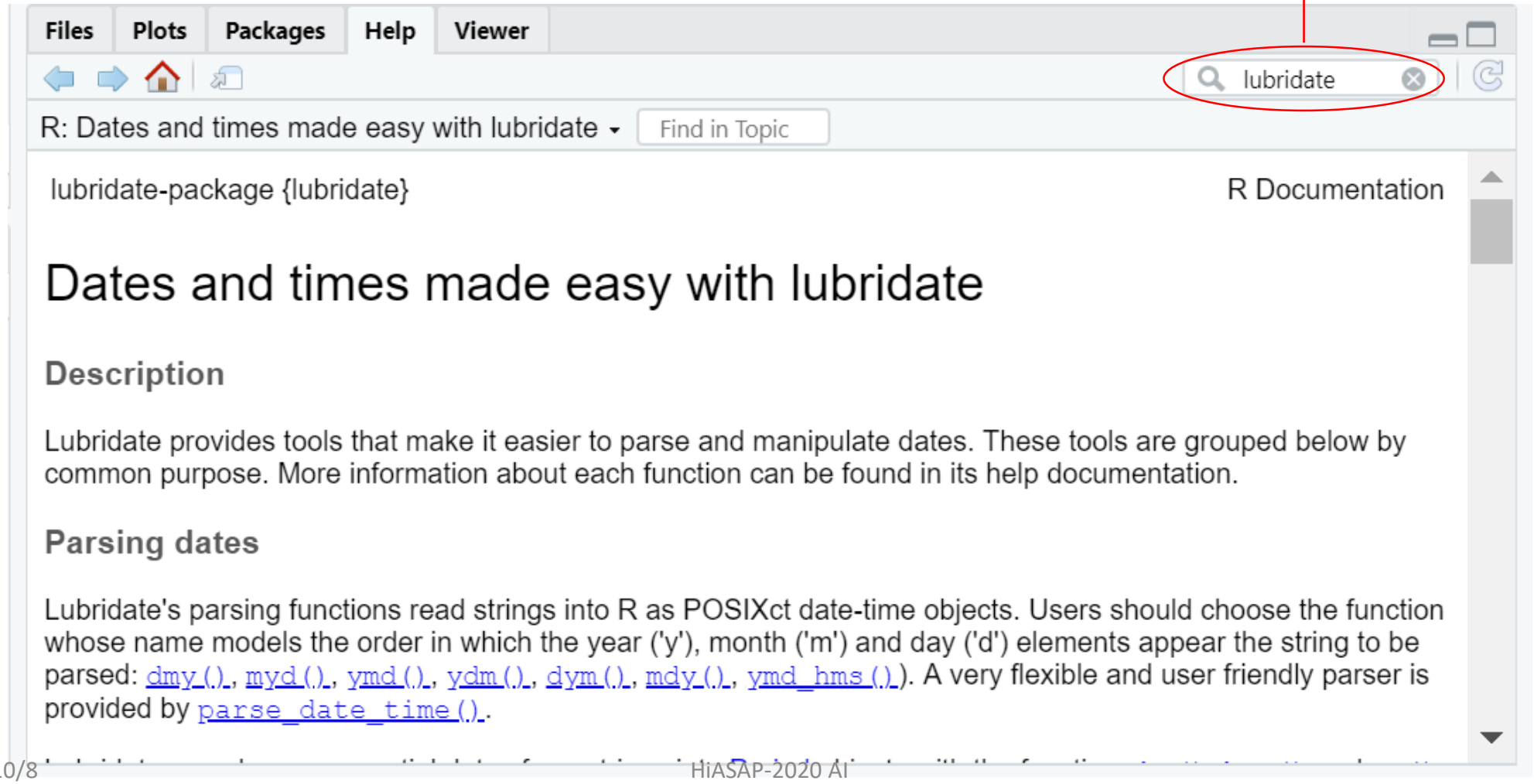


4. Files, plots, packages and help (lower right window) - Packages tab

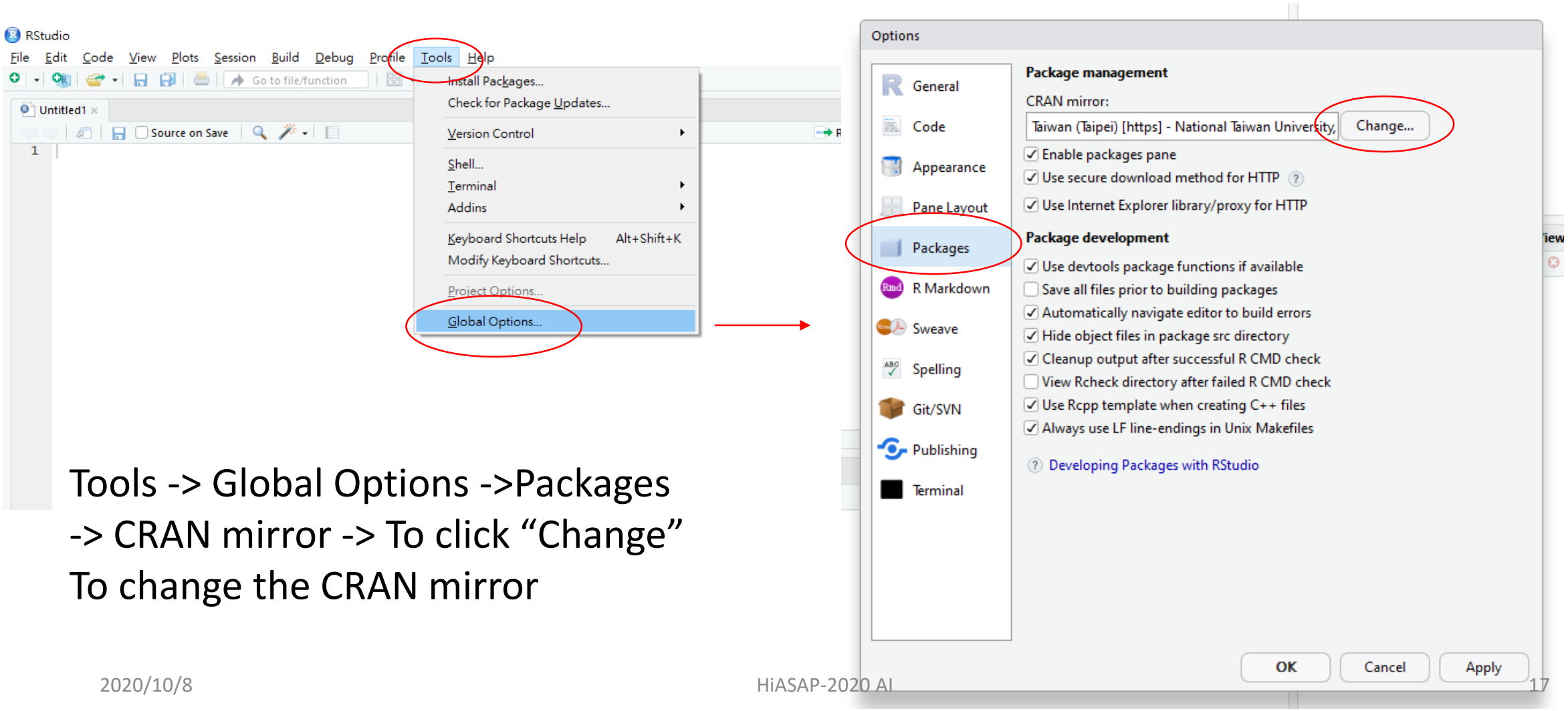


4. Files, plots, packages and help (lower right window) - Help tab

You can search the documents of R packages



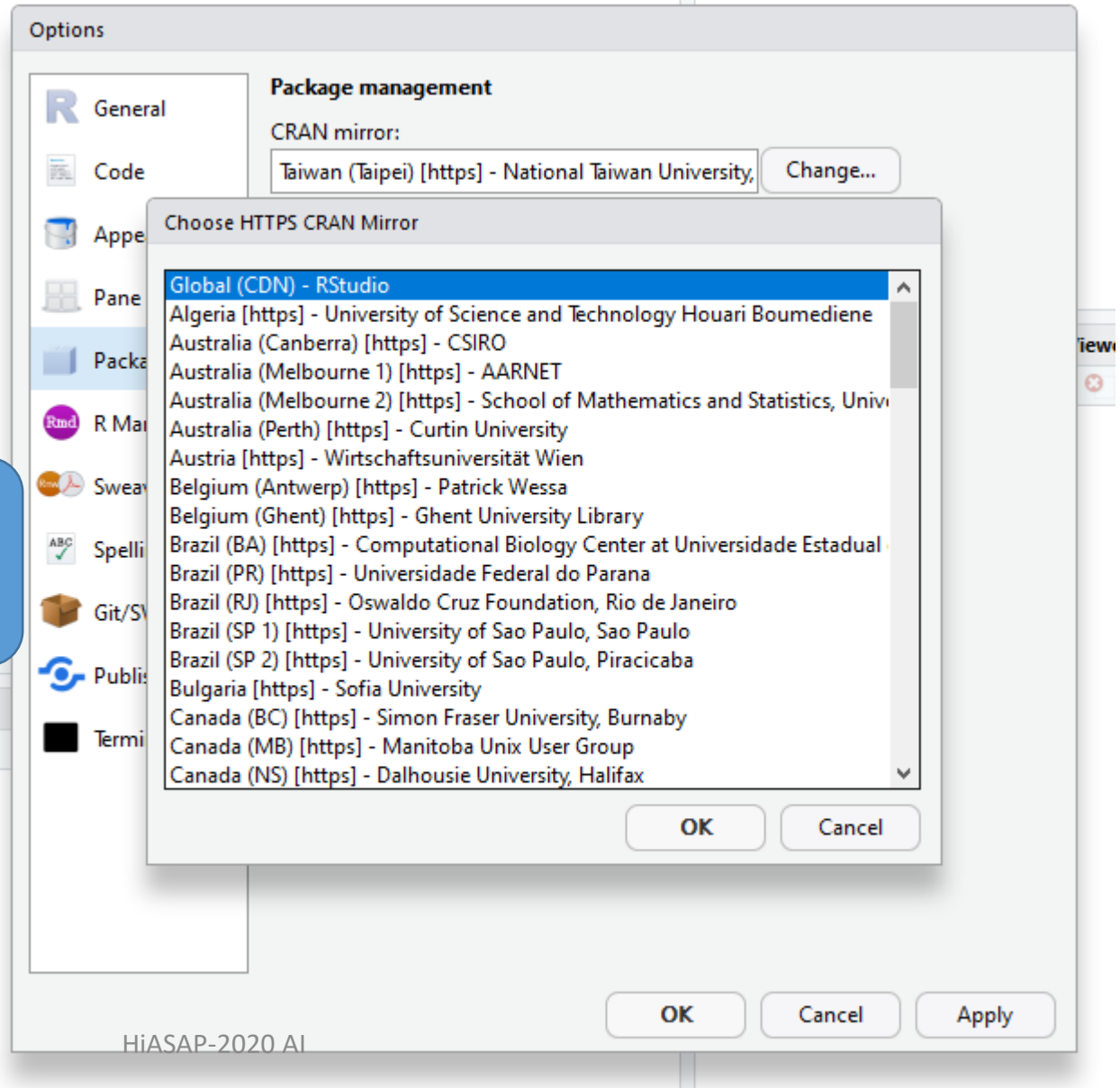
To set the CRAN mirror to download/update the R packages



Tools -> Global Options ->Packages -> CRAN mirror -> To click “Change” To change the CRAN mirror

To set the CRAN mirror to download/update the R packages

TO choose the CRAN mirror nearest to you to minimize network load



Part 3:
QA/QC of HRV data

Notices

- All text after the pound sign "#" within the same line in R code
  - To be considered a comment
  - To be not run by R

- In this presentation, the R codes in the red box can be modify according your requirements (mostly the path of data file)
  - For example, you can modify the path of output file by yourself

```
# To set the output file
cmd1 <- paste0("setwd('",location,"HiASAP/PM/output')")
eval(parse(text=cmd1))
```

Notices

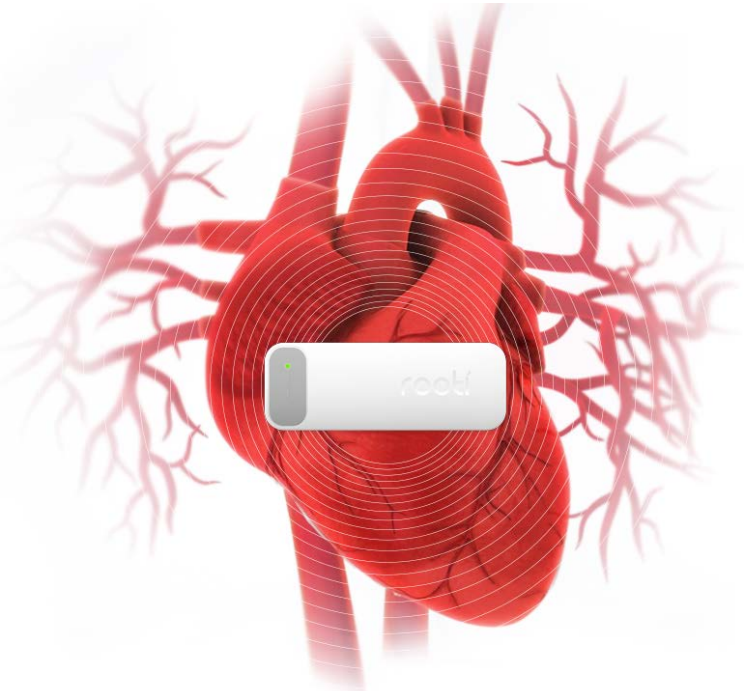
- To use quotes (“) to tell R to interpret something as a string rather than an object.
  - For example,

```
> "Apple"
[1] "Apple"
> Apple
Error: object 'Apple' not found
```

- The uppercase letters (strings) are different from the lowercase letters (strings)
  - For example,
  - A ≠ a
  - Apple ≠ apple

What kind of data we can get from Rooti

- Standard deviation of all normal to normal intervals (SDNN)
- Square root of the mean of the sum of the squares of differences between adjacent NN intervals (RMSSD)
- LF (low frequency power)
- HF (high frequency power)
- VLF (very low frequency power)
- TP (total power)
- HF/LF ratio
- HR (heart rate)
- Activity data
- Sleep index

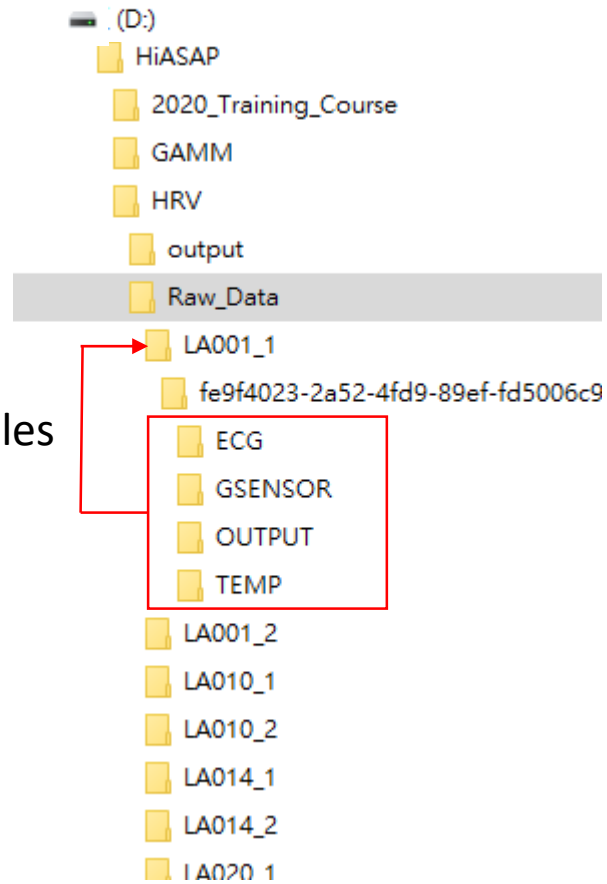


RootiRx sensor

Source: https://www.rootilabs.com/

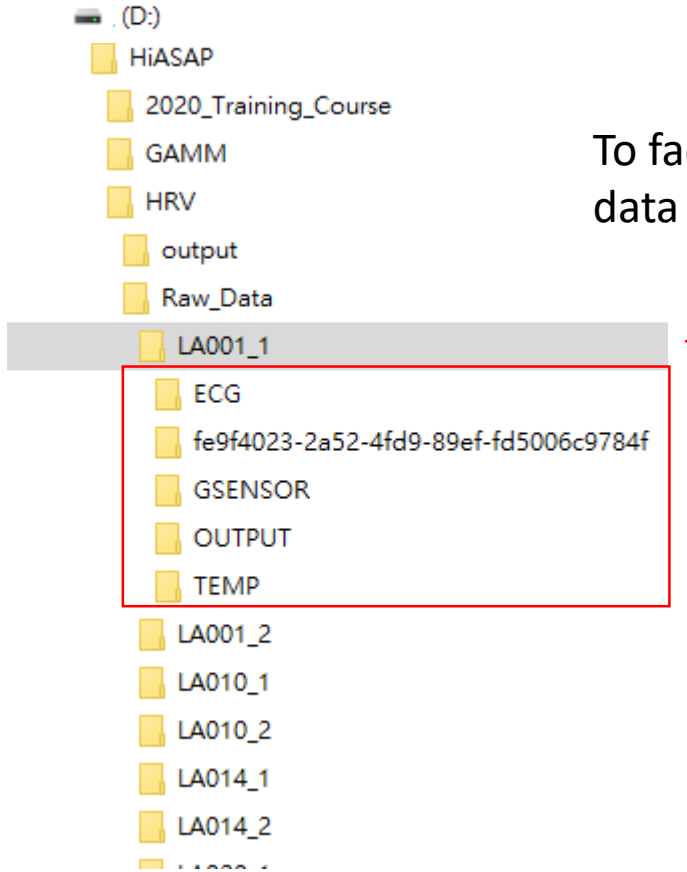
Moving all data files to its own file for every subject

Before



Moving files

After



To facilitate to read data during analysis

```r
# To remove previous memory in R.
rm(list=ls())

# To update the R packages
update.packages("lubridate")
update.packages("plyr")
update.packages("tidyverse")
update.packages("jsonlite")
update.packages("data.table")

# To load the R packages
library(lubridate)
library(plyr)
library(tidyverse)
library(jsonlite)
library(data.table)
```

1. To remove all objects from current workspace

2. To update the R packages

3. To load the R packages

You can modify by yourself

```
18  location <- "D:/"
19
20  # To set the output file
21  cmd1 <- paste0("setwd('",location,'HiASAP/HRV/output')")
22  eval(parse(text=cmd1))
```

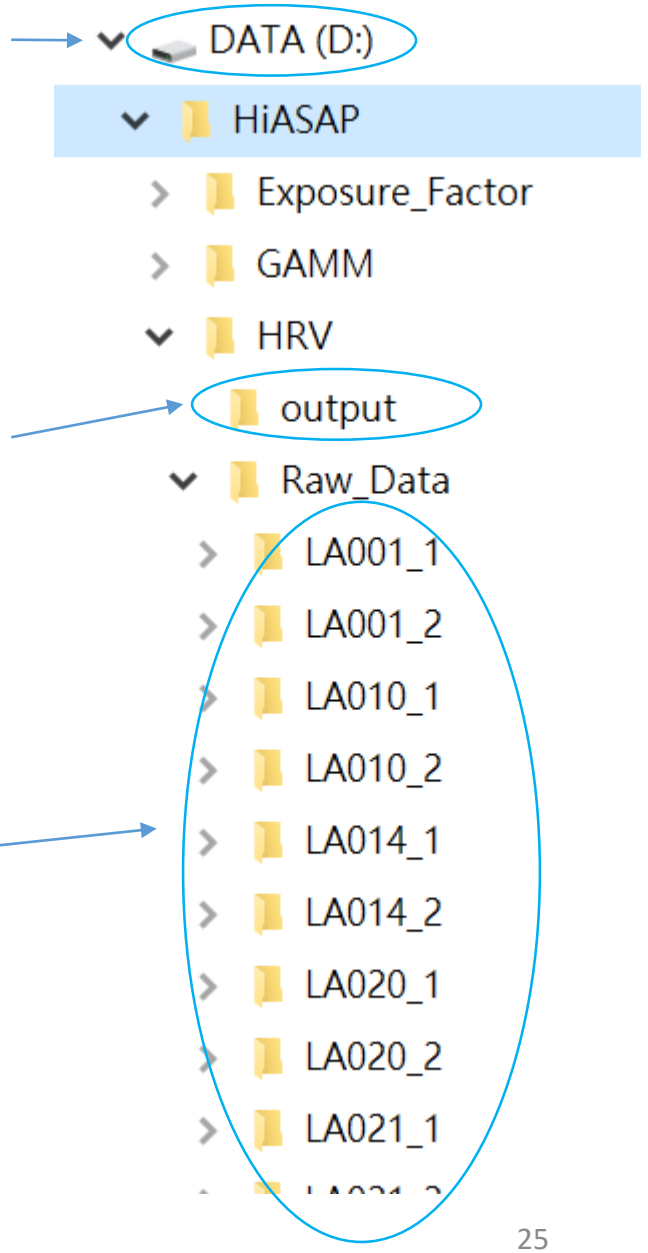
4. To set the default drive of your data

5. To set the path of output file

6. To set the path of HRV data

```
24  # To set the raw data file
25  way <- paste0(location,'HiASAP/HRV/Raw_Data/')
26  # To set the ID list
27  subject<-dir(path=way, pattern="LA")
```

To set the pattern (keyword) to select files



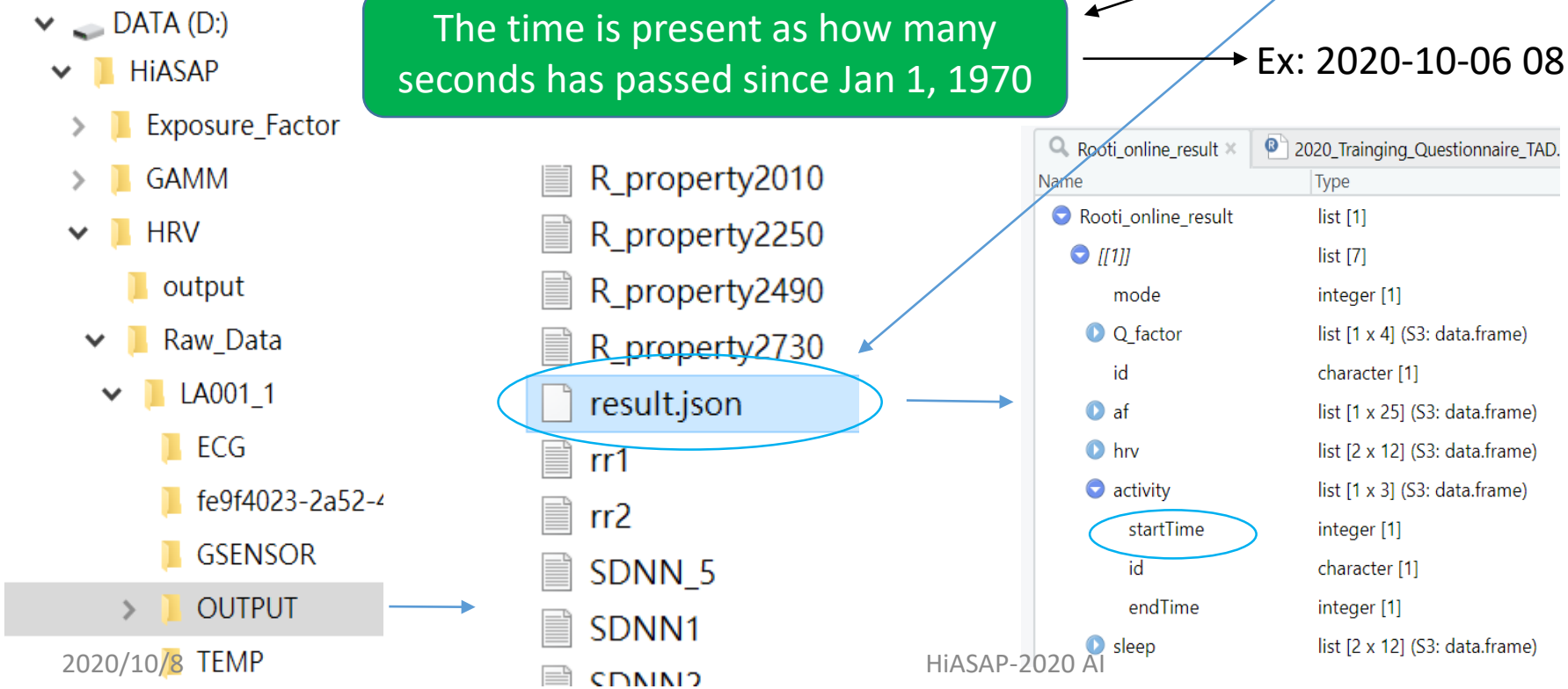
7. To read the results of HRV monitoring for getting the start time

→ You can modify by yourself

```
for (i in 1) {
      # To read the "result.json" file for getting the start time of Rooti (heart rate variability monitoring)
      Rooti_online_result<-list()
      Rooti_online_result[[i]]<- fromJSON(paste0(way, subject[i], "/OUTPUT/result.json"))
      start_time<-list()
      start_time[[i]]<-Rooti_online_result[[i]]$activity$startTime
      start_time[[i]]<-as.POSIXct(start_time[[i]], origin="1970-01-01",tz="Asia/Taipei")
```

The time is present as how many seconds has passed since Jan 1, 1970 → Ex: 2020-10-06 08:00:00

The code of time zone



More detailed information about the code of time zone can be found in the following website: https://data.iana.org/time-zones/theory.html

Extracting the HRV data

From line 37 to 211, we extract the results of each HRV indices, activity and sleeping data with almost the same procedures

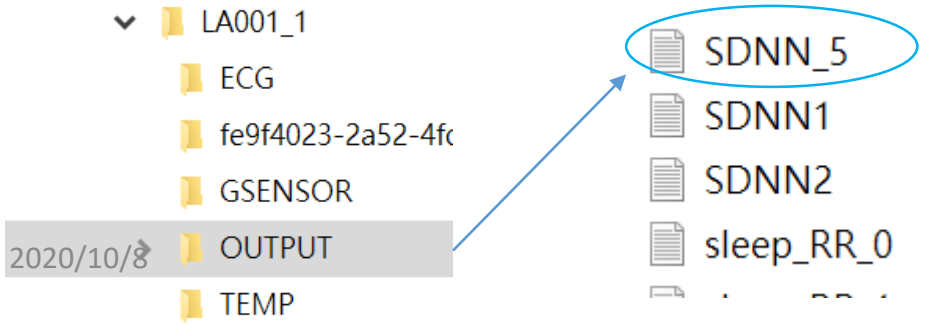
8. To read the results of 5-min SDNN

```
37      # To get the 5-min SDNN data
38      aa <- read.table(paste0(way, subject[i], "/OUTPUT/SDNN_5.txt"))
39      test<-substr(subject[i],1,5)
40      Rooti_SDNN5<-data.frame(test,aa)
41      colnames(Rooti_SDNN5)[names(Rooti_SDNN5) == "V1"]<-"SDNN5"
```

To add the variable of subjects' ID

9. To create the variable of data time

```
43      total_time<-minutes(dim(Rooti_SDNN5)[1]*5)
44      Datatime<-seq.POSIXt(start_time[[i]][1],start_time[[i]][1]+total_time , by ="5 mins")
45      Datatime<-Datatime[1:(length(Datatime)-1)]
46
47      Rooti_SDNN5<-data.frame(Datatime, subset(Rooti_SDNN5,select=c(test,SDNN5)))
```



10. To combine data time with SDNN data

Extracting the HRV data

11. To extract the 5-min RMSSD, LF/HF ratio, LF, HF, VLF and TP data

- From Line 49 to 85
- The same procedure as SDNN

```
49      # To get the 5-min RMSSD data
50      aa <- read.table(paste0(way, subject[i], "/OUTPUT/RMSSD_5.txt"))
51      test<-substr(subject[i],1,5)
52      Rooti_RMSSD5<-data.frame(test,aa)
53      colnames(Rooti_RMSSD5)[names(Rooti_RMSSD5) == "V1"]<-"RMSSD5"
54
55      Rooti_RMSSD5<-data.frame(Datatime, subset(Rooti_RMSSD5,select=c(test,RMSSD5)))
56
57      # To get the 5-min LF/HF data
58      aa
59      te
60      Ro
61      co
62
63      #
64      aa
65      te
66      Ro
67      co
```

```
69      # To get the 5-min HF data
70      aa <- read.table(paste0(way, subject[i], "/OUTPUT/hf_5.txt"))
71      test<-substr(subject[i],1,5)
72      Rooti_hf5<-data.frame(test,aa)
73      colnames(Rooti_hf5)[names(Rooti_hf5) == "V1"]<-"HF5"
74
75      # To get the 5-min VLF data
76      aa <- read.table(paste0(way, subject[i], "/OUTPUT/vlf_5.txt"))
77      test<-substr(subject[i],1,5)
78      Rooti_vlf5<-data.frame(test,aa)
79      colnames(Rooti_vlf5)[names(Rooti_vlf5) == "V1"]<-"VLF5"
80
81      # To get the 5-min TP data
82      aa <- read.table(paste0(way, subject[i], "/OUTPUT/tp_5.txt"))
83      test<-substr(subject[i],1,5)
84      Rooti_tp5<-data.frame(test,aa)
85      colnames(Rooti_tp5)[names(Rooti_tp5) == "V1"]<-"TP5"
```

→ You can modify by yourself

Extracting the heart rate (HR) data

The codes for HR data are the same as that for SDNN, except the temporal resolution of data

12. To read the 1-min HR data

13. To create the variable of data time

14. To calculate the sum and mean of HR data for 5-min intervals

```
87   # To get the 1-min HR data
88   aa <- read.table(paste0(way, subject[i], "/OUTPUT/HR_full.txt"))
89   test<-substr(subject[i],1,5)
90   Rooti_HR<-data.frame(test,aa)
91   colnames(Rooti_HR)[names(Rooti_HR) == "V1"]<-"HR"
92
93   # To calculate the 5-min HR dat
94   total_HR_time<-minutes(dim(Rooti_HR)[1]*1)
95   Datatime_HR<-seq.POSIXt(start_time[[i]][1],start_time[[i]][1]+total_HR_time , by = "1 mins")
96   Datatime_HR<-Datatime_HR[1:(length(Datatime_HR)-1)]
97
98   Rooti_HR<-data.frame(Datatime_HR, Rooti_HR)
99   Rooti_HR<-Rooti_HR %>%
100    group_by(Datatime = cut(Datatime_HR, breaks="300 secs")) %>%
101    summarize(
102     HRsum5 = sum(HR),
103     HRmean5 = floor(mean(HR)))
104  Rooti_HR$Datatime <-ymd_hms(Rooti_HR$Datatime,tz="Asia/Taipei")
```

You can modify by yourself

Extracting activity data (variations for three-axis)

- Activity data
  - Variations for X-, Y- and Z- axis
  - Accelerations for X-, Y- and Z- axis

15. To extract the 1-min activity data of variations for three-axis, and then calculate to 5-min average data

```
106     # To get the activity data form G-sensor
107     # To get the 1-min data of variations for three-axis
108     aa <- read.table(paste0(way, subject[i], "/OUTPUT/Avg_XYZsum.txt"))
109     test<-substr(subject[i],1,5)
110     Rooti_gsensor<-data.frame(test,aa)
111     colnames(Rooti_gsensor)[names(Rooti_gsensor) == "V1"]<-"Gsensor"
112
113     # To calculate the 5-min data of variations for three-axis
114     total_gsensor_time<-minutes(dim(Rooti_gsensor)[1]*1)
115     Datatime_gsensor<-seq.POSIXt(start_time[[i]][1],start_time[[i]][1]+total_gsensor_time , by = "1 mins")
116     Datatime_gsensor<-Datatime_gsensor[1:(length(Datatime_gsensor)-1)]
117
118     Rooti_gsensor<-data.frame(Datatime_gsensor, Rooti_gsensor)
119     Rooti_gsensor<-Rooti_gsensor %>%
120       group_by(Datatime = cut(Datatime_gsensor, breaks="300 secs")) %>%
121       summarize(Gsensor5 = sum(Gsensor))
122     Rooti_gsensor$Datatime <-ymd_hms(Rooti_gsensor$Datatime,tz="Asia/Taipei")
```

- From Line 106 to 122
- The same procedure as HR

→ You can modify by yourself

Extracting activity data (accelerations for three-axis)

```
124     # To get the 1-min data of accelerations for three-axis
125     aa <- list.files(paste0(way, subject[i], "/GSENSOR/"))
126     bb <- read.table(paste0(way, subject[i], "/GSENSOR/",aa[1]),sep=",")
127     cc <- bb
128     for(j in 2:length(aa)){
129         bb <- read.table(paste0(way, subject[i], "/GSENSOR/",aa[j]),sep=",")
130         cc <- rbind(cc,bb)
131     }
132     test<-substr(subject[i],1,5)
133     Rooti_gsensor_raw_data<-data.frame(test,subset(cc,select=c(V1:V5)))
134     colnames(Rooti_gsensor_raw_data)<-c("S_no","Datatime","secondpoint", "X", "Y", "Z")
135     Rooti_gsensor_raw_data$Datatime<-as.POSIXct(Rooti_gsensor_raw_data$Datatime, origin="1970-01-01",tz="Asia/Taipei")

137     # To get the 5-min data of accelerations for three-axis
138     Rooti_gsensor_raw_data<-Rooti_gsensor_raw_data %>%
139       group_by(Datatime = cut(Datatime, breaks="300 secs")) %>%
140       summarize(meanX5 = round(mean(X),4),
141                 meanY5 = round(mean(Y),4),
142                 meanZ5 = round(mean(Z),4),
143                 maxX5 = round(max(X),4),
144                 maxY5 = round(max(Y),4),
145                 maxZ5 = round(max(Z),4)
146                 ) %>%
147       mutate(Datatime = ymd_hms(Datatime,tz="Asia/Taipei"))
```

16. To extract the 1-min activity data of accelerations for three-axis

17. To calculate the mean and maximum of accelerations for three-axis for 5-min intervals

Extracting activity data (accelerations for three-axis)

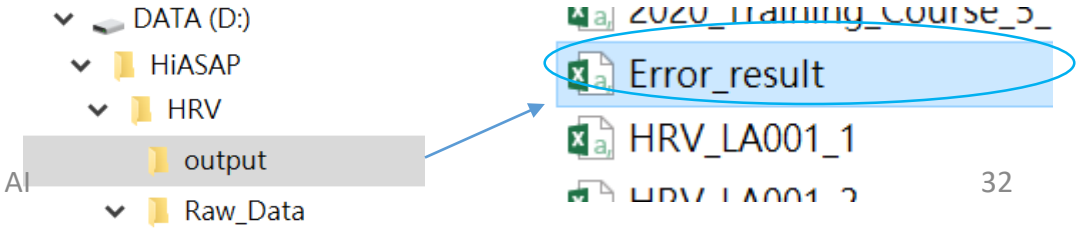
- Because the start time may be different between G-sensor and HRV monitoring (“result.json” file), the difference between two files should be less than 3 seconds.

18. To determine the difference of start time between G-sensor and “result.json” file

```
149  # To check whether the time of G-sensor is correct
150  gap_of_time<-seconds(Rooti_SDNN5$Datatime[1]-Rooti_gsensor_raw_data$Datatime[1])
151
152  if(abs(gap_of_time)<=3){
153  Rooti_gsensor_raw_data<-Rooti_gsensor_raw_data %>%
154    mutate(Datatime = Datatime +gap_of_time)
155  }else{
156    start_time_error_gsensor<-"Please check the start time of gsensor in GSENSOR folder and start time of activity in result.json."
157    write.csv(start_time_error_gsensor,paste0("Start_time_error_in ",subject[i],"_gsensor.csv"),row.names = F)
158  }
```

If the difference is less than 3 seconds, the time will be corrected

If the difference is more than 3 seconds, the process will be terminated



You can modify by yourself

Extracting sleeping index

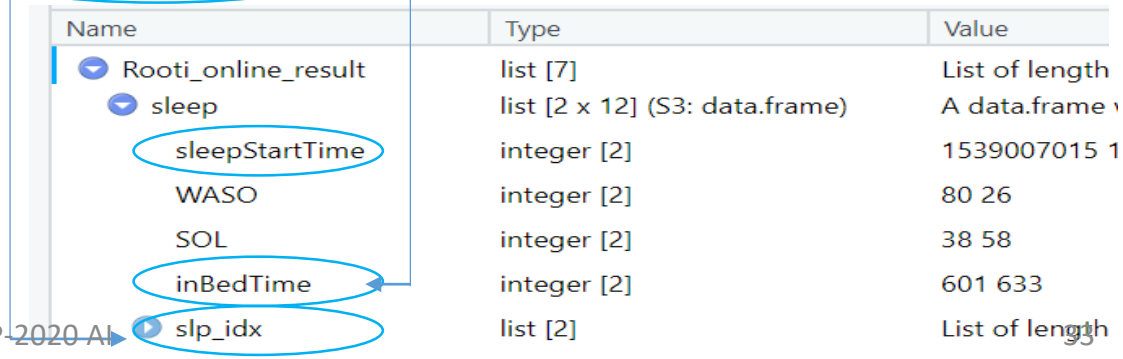
```
160  # To get the sleeping index
161  sleep_start_time<-list()
162  in_bed_time<-list()
163  sleep_idx<-list()
164  Datatime_sleep<-data.frame()
165  sleep_start_time[[i]]<-Rooti_online_result[[i]]$sleep$sleepStartTime
```

19. To get the start time of sleeping time from “result.json” file

If subjects do not have sleeping data, it will not run the following code of sleeping index

```
166  if(!is.null(Rooti_online_result[[i]]$sleep$sleepStartTime)){
167  sleep_start_time[[i]]<-as.POSIXct(sleep_start_time[[i]], origin="1970-01-01",tz="Asia/Taipei")
168  in_bed_time[[i]]<-Rooti_online_result[[i]]$sleep$inBedTime
169  sleep_idx[[i]]<-Rooti_online_result[[i]]$sleep$slp_idx
```

20. To get the time and sleeping index during the sleeping period



→ You can modify by yourself

Extracting sleeping index

21. To calculated the data time of the sleeping time

```
170     for (s in 1:length(sleep_start_time[[i]])) {
171     Datatime_sleep_m<-data.frame(Datatime =seq.POSIXt(sleep_start_time[[i]][s],
                        sleep_start_time[[i]][s]+minutes(in_bed_time[[i]][s]) , by = "1 mins"))
```

22. To combine the sleeping index with data time

```
172     Datatime_sleep_m<-Datatime_sleep_m[(2:nrow(Datatime_sleep_m)),]
173     sleep_idx[[i]][[s]]<-sleep_idx[[i]][[s]][(1:length(Datatime_sleep_m))]
174     Datatime_sleep_m<-data.frame(Datatime =Datatime_sleep_m,sleep_idx=sleep_idx[[i]][[s]])
175     Datatime_sleep<-rbind(Datatime_sleep_m,Datatime_sleep)
176     Datatime_sleep$Datatime<-as.POSIXct(Datatime_sleep$Datatime, origin="1970-01-01",tz="Asia/Taipei")
177     }
```

You can modify by yourself

Extracting sleeping index

- Because the start time may be also different between sleeping data and HRV monitoring data, the difference between two files should be less than 3 seconds.

22. To determine the difference of start time between sleeping data and G-sensor data

```
# To check whether the time of sleeping is correct
Datatime_gsensor<-data.frame(Datatime = Datatime_gsensor)
Datatime_gsensor$Datatime<-as.POSIXct(Datatime_gsensor$Datatime, origin="1970-01-01",tz="Asia/Taipei")
if(second(Datatime_gsensor$Datatime[1])==0&second(Datatime_sleep$Datatime[1])>55){
  gap_of_time_sleep<-60-second(Datatime_sleep$Datatime[1])
}else if(second(Datatime_gsensor$Datatime[1])==1&second(Datatime_sleep$Datatime[1])>55){
  gap_of_time_sleep<-61-second(Datatime_sleep$Datatime[1])
}else if(second(Datatime_gsensor$Datatime[1])==2&second(Datatime_sleep$Datatime[1])>55){
  gap_of_time_sleep<-62-second(Datatime_sleep$Datatime[1])
}else if(second(Datatime_gsensor$Datatime[1])>55&second(Datatime_sleep$Datatime[1])==0){
  gap_of_time_sleep<-second(Datatime_gsensor$Datatime[1])-60
}else if(second(Datatime_gsensor$Datatime[1])>55&second(Datatime_sleep$Datatime[1])==1){
  gap_of_time_sleep<-second(Datatime_gsensor$Datatime[1])-61
}else if(second(Datatime_gsensor$Datatime[1])>55&second(Datatime_sleep$Datatime[1])==2){
  gap_of_time_sleep<-second(Datatime_gsensor$Datatime[1])-62
}else{
gap_of_time_sleep<-second(Datatime_gsensor$Datatime[1])-second(Datatime_sleep$Datatime[1])
}
```

You can modify by yourself

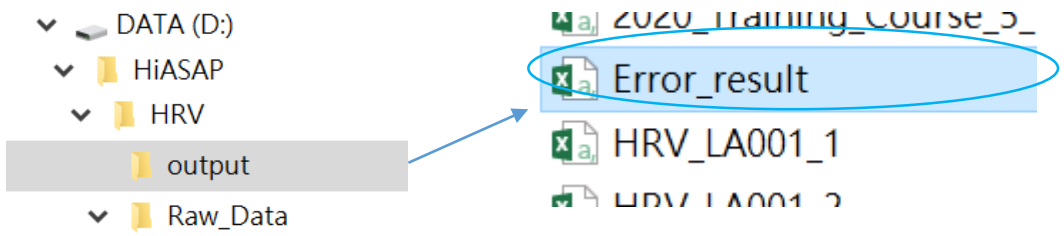
Extracting sleeping index

```
198  if(abs(gap_of_time_sleep)<=3){
199  Datatime_sleep<-Datatime_sleep %>%
200    mutate(Datatime = Datatime +gap_of_time_sleep) %>%
201    full_join(Datatime_gsensor,by = "Datatime")
202  Datatime_sleep<-Datatime_sleep %>%
203    group_by(Datatime = cut(Datatime, breaks="300 secs")) %>%
204    summarize(sleep_idx5 = max(sleep_idx,na.rm=F)
205    ) %>%
206    mutate(Datatime = ymd_hms(Datatime,tz="Asia/Taipei"))
207  }else{
208    start_time_error_sleep<-"Please check the start time of Sleep and start time of activity in result.json."
209    write.csv(start_time_error_sleep,paste0("Start_time_error_in ",subject[i],"_sleep.csv"),row.names = F)
210  }
211  }
```

If the difference is less than 3 seconds, the time will be corrected

23. To determine the sleeping index in the 5-min interval

If the difference is more than 3 seconds, the process will be terminated



Data combination for each subject

24. To merge all HRV data

```
# To combine all Rooti data for each subject
Rooti_SDNN5<-Rooti_SDNN5 %>%
  select(test, Datatime, SDNN5)
Rooti_total<-data.frame(Rooti_SDNN5,Rooti_RMSSD5$RMSSD5,Rooti_lfhf5$LFHF5,Rooti_lf5$LF5,Rooti_hf5$HF5,Rooti_vlf5$VLF5,Rooti_tp5$TP5)
colnames(Rooti_total)[names(Rooti_total) == "Rooti_RMSSD5.RMSSD5"]<-"RMSSD5"
colnames(Rooti_total)[names(Rooti_total) == "Rooti_lfhf5.LFHF5"]<-"LFHF5"
colnames(Rooti_total)[names(Rooti_total) == "Rooti_lf5.LF5"]<-"LF5"
colnames(Rooti_total)[names(Rooti_total) == "Rooti_hf5.HF5"]<-"HF5"
colnames(Rooti_total)[names(Rooti_total) == "Rooti_vlf5.VLF5"]<-"VLF5"
colnames(Rooti_total)[names(Rooti_total) == "Rooti_tp5.TP5"]<-"TP5"
Rooti_total<-Rooti_total %>%
  full_join(Rooti_gsensor,by = "Datatime")
Rooti_total<-Rooti_total %>%
  full_join(Rooti_gsensor_raw_data,by = "Datatime")
if(!is.null(Rooti_online_result[[i]]$sleep$sleepStartTime)){
Rooti_total<-Rooti_total %>%
  full_join(Datatime_sleep,by = "Datatime")
}else{
  Rooti_total$sleep_idx5<-NA
}
Rooti_total<-Rooti_total %>%
  full_join(Rooti_HR,by = "Datatime")
```

25. To combine activity data with HRV data

26. To combine sleeping index with HRV data

No sleeping data
-> Awake

27. To combine activity data with HRV data

Data combination for each subject

28. To re-code the “NA” as “4” for sleeping index

```
236 Rooti_total$sleep_idx5[is.na(Rooti_total$sleep_idx5)] <- 4
```

Sleeping index	Sleeping status
1	Deep sleep
2	Light sleep
3	Rapid Eye Movement (REM)
4	Awake

29. To exclude the time without HRV data

```
238 Rooti_total<-Rooti_total %>%
239   filter(!(is.na(test)))
240
241 S_no<-substr(subject[i],1,5)
242 Rooti_total<-data.frame(S_no,Rooti_total)
```

30. To add the variable of subjects’ ID to the HRV data

```
244 Rooti_total<-Rooti_total %>%
245   select(S_no,Datatime,HRsum5,HRmean5,SDNN5,RMSSD5,LFHF5,LF5,HF5,VLF5,TP5,Gsensor5,meanX5,meanY5,meanZ5,maxX5,maxY5,maxZ5,sleep_idx5)
```

31. To select variables which will use in the following analysis

Excluding the ineffective time (bad time)

32. To read the bad time of HRV monitoring

```
247       # To exclude data of ineffective time (bad time) and extreme data
248       badtime_path <- list.files(paste0(way, subject[i], "/OUTPUT/bad_time.txt"))
249
250       bad_time<-list()
251       if(length(badtime_path)==0){
252           bad_time[[i]]<-Rooti_online_result[[i]]$Q_factor$bad_min
253       }else{
254           bad_time <- read.table(paste0(way, subject[i], "/OUTPUT/bad_time.txt"))
255           for (j in 1:nrow(bad_time[[i]])) {
256               bad_time[[i]][j]<-start_time[[i]][1]+minutes(bad_time[[i]][j])
257           }
258       }
```

To automatically select the bad time from "bad_time.txt" file or "result.json" file

Name	Type
Rooti_online_result	list [7]
mode	integer [1]
Q_factor	list [1 x 4] (S3: data.frame)
total_length	integer [1]
bad_min	list [1]
good_percentage	double [1]
bad_length	integer [1]

Excluding the ineffective time (bad time)

```
260 bad_time[[i]]<-data.frame(V1 = bad_time[[i]][[1]])
261 bad_time[[i]]$V1<-as.POSIXct(bad_time[[i]]$V1, origin="1970-01-01",tz="Asia/Taipei")
```

33. To combine bad time to HRV data

```
263 Rooti_total$bad_time<-0
264 for (q in 1:(nrow(bad_time[[i]]))) {
265 for (k in 1:(nrow(Rooti_total)-1)) {
266   if(!(Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&!(bad_time[[i]]$V1[q]<Rooti_total$Datatime[k+1])&(Rooti_total$bad_time[k]==0)){
267     Rooti_total$bad_time[k]<-0
268   }else if(!(Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&!(bad_time[[i]]$V1[q]<Rooti_total$Datatime[k+1])&(Rooti_total$bad_time[k]==1)){
269     Rooti_total$bad_time[k]<-1
270   }else if((Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&(bad_time[[i]]$V1[q]<Rooti_total$Datatime[k+1])&(Rooti_total$bad_time[k]==1)){
271     Rooti_total$bad_time[k]<-1
272   }else if((Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&(bad_time[[i]]$V1[q]<Rooti_total$Datatime[k+1])&(Rooti_total$bad_time[k]==0)){
273     Rooti_total$bad_time[k]<-1
```

34. To determine whether the data time is bad time in minute

Excluding the ineffective time (bad time) and

35. To determine whether the data time is bad time in 5-min interval

```
for (q in 1:nrow(bad_time[[i]])) {
  for (k in nrow(Rooti_total)) {
    if(!(Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&!(bad_time[[i]]$V1[q]<=(Rooti_total$Datatime[k]+minutes(4)))&(Rooti_total$bad_time[k
      Rooti_total$bad_time[k]<-0
    }else if(!(Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&!(bad_time[[i]]$V1[q]<=(Rooti_total$Datatime[k]+minutes(4)))&(Rooti_total$bad_
      Rooti_total$bad_time[k]<-1
    }else if((Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&(bad_time[[i]]$V1[q]<=(Rooti_total$Datatime[k]+minutes(4)))&(Rooti_total$bad_ti
      Rooti_total$bad_time[k]<-1
    }else if((Rooti_total$Datatime[k]<=bad_time[[i]]$V1[q])&(bad_time[[i]]$V1[q]<=(Rooti_total$Datatime[k]+minutes(4)))&(Rooti_total$bad_ti
      Rooti_total$bad_time[k]<-1
    }
```

36. To exclude the 5-min intervals contained bad time and the data with abnormal signals

```
  Rooti_total<-Rooti_total %>%
    filter(!(bad_time==1)) %>%
    filter(SDNN5>0 & SDNN5<400 & LFHF5>0.01 & HRmean5>40 & HRmean5<200) %>%
    select(-c(bad_time))

write.csv(Rooti_total, paste0("HRV_",subject[i],".csv"),row.names = F)
```

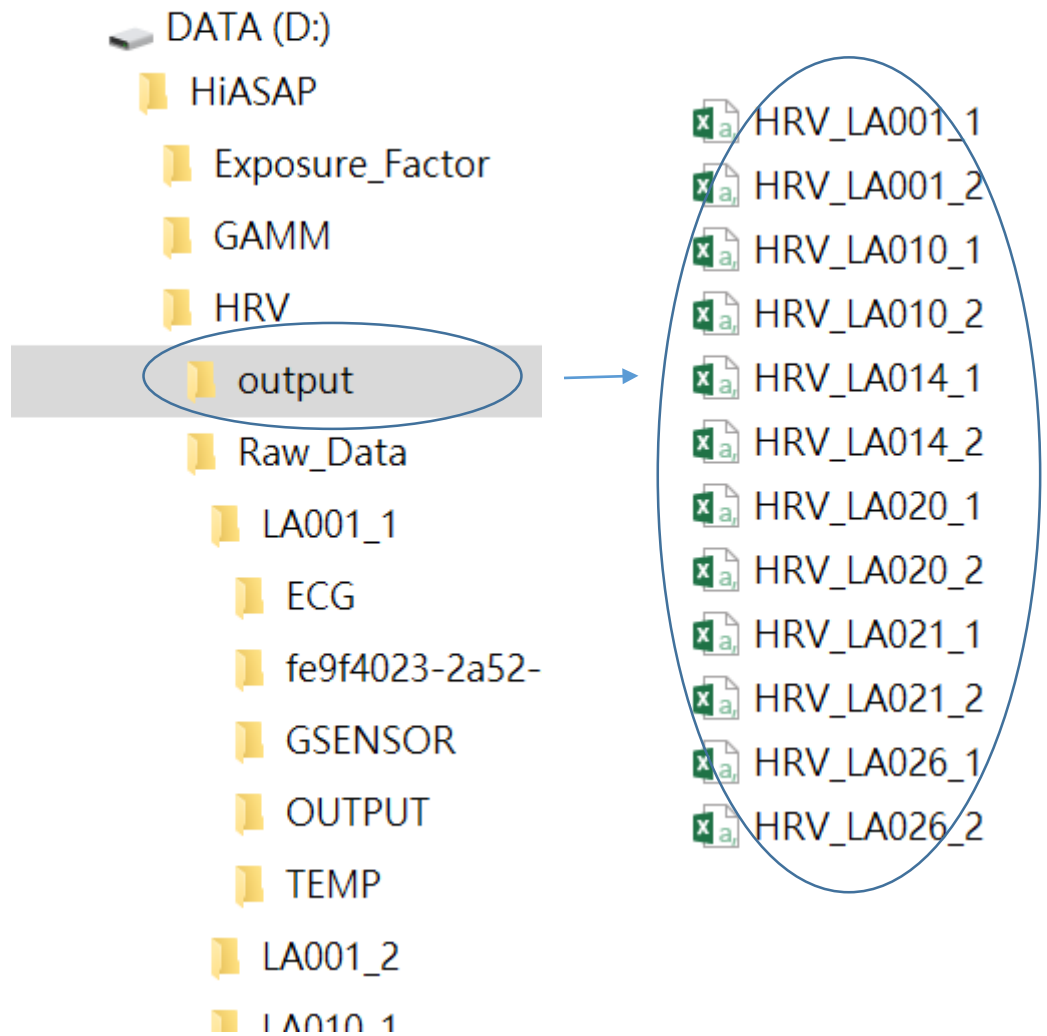
To exclude bad time

To exclude abnormal signals

Data combination for all subjects

37. To combine HRV data for all subjects

```
299  # To combine HRV data for all subjects
300  way2 <- paste0(location,"HiASAP/HRV/output")
301  aa1 <- list.files(way2,pattern="HRV")
302
303  HRV <- data.frame()
304  filename <- paste0(way2,"/",aa1[1])
305  cc <- read.csv(filename)
306  HRV <- cc
307  for(k in 2:length(aa1)){
308      filename <- paste0(way2,"/",aa1[k])
309      cc <- read.csv(filename)
310      HRV <- rbind(HRV,cc)
311  }
```



38. To create the time-related variables for data combination

```
# To create the time variables (year, month, day, hour and minute) for the following data matching
library(lubridate)
yy<-c()
mm<-c()
dd<-c()
hh<-c()
mn<-c()
for(l in 1:dim(HRV)[1]){
    if(nchar(as.character(HRV$Datatime[l]))==14){
        yy[l] <- as.numeric(substr(HRV$Datatime[l],1,4))
        mm[l] <- as.numeric(substr(HRV$Datatime[l],6,6))
        dd[l] <- as.numeric(substr(HRV$Datatime[l],8,8))
        hh[l] <- as.numeric(substr(HRV$Datatime[l],10,11))
        mn[l] <- as.numeric(substr(HRV$Datatime[l],13,14))
    }else{
        if(nchar(as.character(HRV$Datatime[l]))==15){
            yy[l] <- as.numeric(substr(HRV$Datatime[l],1,4))
            mm[l] <- as.numeric(substr(HRV$Datatime[l],6,6))
            dd[l] <- as.numeric(substr(HRV$Datatime[l],8,9))
            hh[l] <- as.numeric(substr(HRV$Datatime[l],11,12))
            mn[l] <- as.numeric(substr(HRV$Datatime[l],14,15))
    }else{
            yy[l] <- as.numeric(substr(HRV$Datatime[l],1,4))
            mm[l] <- as.numeric(substr(HRV$Datatime[l],6,7))
            dd[l] <- as.numeric(substr(HRV$Datatime[l],9,10))
            hh[l] <- as.numeric(substr(HRV$Datatime[l],12,13))
            mn[l] <- as.numeric(substr(HRV$Datatime[l],15,16))
        }
```

To avoid the formats of date may be different

Ex: 2020-03-03 / 2020-3-10 / 2020-3-1 ….

Year

Month

Day

Hour

Minute

39. To create a variable of 30-minute interval of each hour for merging data with TAD

```
343 mn_30 <- c()
344 for (l in 1:length(mn)) {
345     if(mn[l] < 30){
346         mn_30[l] <- 1
347     }else{
348         mn_30[l] <- 2
349     }
350 }
```

Year	Month	Day	Hour	Minute	Minute_30
2018	10	8	13	46	2
2018	10	8	13	51	2
2018	10	8	13	56	2
2018	10	8	14	1	1
2018	10	8	14	6	1
2018	10	8	14	11	1

Time between 30 to 59 minutes -> 2

Time between 0 to 29 minutes -> 1

```
351 date_1 <- c(ymd_hm(paste0(yy,"-",mm,"-",dd," ",hh,":",mn)))
```

40. To format the date variable

Ex: 2020-01-01 14:11

```
HRVfinal <- data.frame()
for(j in 1:dim(HRV)[1]){
    HRVfinal[j,1]<-date_1[j]
    HRVfinal[j,2]<-yy[j]
    HRVfinal[j,3]<-mm[j]
    HRVfinal[j,4]<-dd[j]
    HRVfinal[j,5]<-hh[j]
    HRVfinal[j,6]<-mn[j]
    HRVfinal[j,7]<-mn_30[j]
    HRVfinal[j,8]<-HRV[j,1]
    HRVfinal[j,9]<-HRV[j,3]
    HRVfinal[j,10]<-HRV[j,4]
    HRVfinal[j,11]<-HRV[j,5]
    HRVfinal[j,12]<-HRV[j,6]
    HRVfinal[j,13]<-HRV[j,7]
    HRVfinal[j,14]<-HRV[j,8]
    HRVfinal[j,15]<-HRV[j,9]
    HRVfinal[j,16]<-HRV[j,10]
    HRVfinal[j,17]<-HRV[j,11]
    HRVfinal[j,18]<-HRV[j,12]
    HRVfinal[j,19]<-HRV[j,13]
    HRVfinal[j,20]<-HRV[j,14]
    HRVfinal[j,21]<-HRV[j,15]
    HRVfinal[j,22]<-HRV[j,16]
    HRVfinal[j,23]<-HRV[j,17]
    HRVfinal[j,24]<-HRV[j,18]
    HRVfinal[j,25]<-HRV[j,19]
}
```

41. To combine time-related variables with HRV data

Data export

42. To export the final dataset of HRV data for all subject

```
380 colnames(HRVfinal)<-c("Date","Year","Month","Day","Hour","Minute","Minute_30","S_no","HRsum5","HRmean5","RMSSD5","SDNN5","LFHF5","LF5","HF5","VLF5
381 outputname<-"HRV_5 minute_All.csv"
382 write.csv(HRVfinal,outputname,row.names=FALSE,na="")
```

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
1	Date	Year	Month	Day	Hour	Minute	Minute_3(	S_no	HRsum5	HRmean5	RMSSD5	SDNN5	LFHF5	LF5	HF5	VLF5	TP5	Gsensor5	Mear
2	2019/3/8 20:44	2019	3	8	20	44	2	LA001	395	79	55	32	2.11388	2724.052	1288.647	1042.454	5280.367	225213	-91.
3	2019/3/8 20:49	2019	3	8	20	49	2	LA001	381	76	21	11	5.30485	148.0447	27.90743	369.4822	559.5795	236084	-83.
4	2019/3/8 20:54	2019	3	8	20	54	2	LA001	378	75	22	13	2.02665	165.0012	81.41592	308.2564	572.0915	237179	-112
5	2019/3/8 20:59	2019	3	8	20	59	2	LA001	385	77	25	11	7.63461	249.6129	32.69492	493.2865	785.7868	253149	-99.
6	2019/3/8 21:04	2019	3	8	21	4	1	LA001	401	80	50	10	8.13229	324.7405	39.93225	2188.406	2562.708	275926	-58.
7	2019/3/8 21:09	2019	3	8	21	9	1	LA001	393	78	46	12	5.59928	343.4503	61.33825	1564.531	1983.003	342981	-76.
8	2019/3/8 21:19	2019	3	8	21	19	1	LA001	405	81	24	13	3.47165	226.2616	65.17399	432.4855	740.236	242236	-104
9	2019/3/8 21:24	2019	3	8	21	24	1	LA001	375	75	21	11	2.13299	98.88472	46.35963	307.0851	460.9489	176192	-4.
10	2019/3/8 21:29	2019	3	8	21	29	1	LA001	373	74	22	11	2.37502	104.9368	44.18362	366.4598	521.509	136830	-74.
11	2019/3/8 21:34	2019	3	8	21	34	2	LA001	375	75	25	10	2.12332	96.44783	45.42303	615.4884	761.8169	133101	-74.

Thank you for your attention