# R Workshop Session 4 Exercise

## Exercise 1:

Check out the following resources

- a) R graph gallery (https://www.r-graph-gallery.com/). Which graph sparks the most joy for you?
- b) Bioconductor course materials (https://bioconductor.org/help/course-materials/). Can you find anything of interest to you?
- c) R-bloggers site (https://www.r-bloggers.com/). This site aggregates some of the best blogs about R. You can start by checking out the "most visited articles of the week" section on right hand side. You can also sign up and you will get a daily email with some of the best blogs. This covers a very wide range of topics so don't worry if 99% of them are irrelevant. We are looking for the needle in the haystack.

There is nothing i	for you to return	back to us.	

# Exercise 2:

The data is a simulation of a longitudinal birth cohort. The two attached files contain the child length (i.e. height when the baby is laid down) and weight at two timepoints: delivery and month 3.

1) Download both files and eyeball scan for anything suspicious. Report anything that is odd.

## **SOLUTION:**

Eyeballing the data in Excel shows:

- Length for Subject 0110-08107 in the delivery file has unusual number of decimals.
- Missing values are coded as NA in delivery file and as -999 in month 3 files.
- Weight is recorded in kg in delivery file and in g in month 3 file.
- Two subjects (0110-08010, 0110-08035) in month 3 are missing for both weight and length. Length is missing for subject 0110-18020.

and the subtler differences that are hard to spot:

- The values for length column in month 3 file is mostly recorded to nearest 0.5cm. Data with other decimals are potential recording errors that could be checked further.
- Subject "0110-18020" is mistyped as "0110- 18020" (extra white space) in the month 3 file. This is difficult to spot by eye but you will see it in the setdiff() command in step 4.

- 2) Set the working directory, load the packages and read in both files.
- 3) Make the necessary changes (e.g. changing column names and units) to merge the two files.

**SOLUTION:** Solving steps 2 - 3 in one.

```
# setwd("C:/Users/aramasamy/Desktop/R_workshop/")
pacman::p_load(tidyverse, readxl, gridExtra, reshape2, janitor)

m0 <- read_csv("anthropometry_delivery.csv") %>%
    rename(wt_m0 = weight_g, len_m0=length)

m3 <- read_excel("anthropometry_month3.xlsx", na="-999") %>%
    rename(wt_m3 = Weight_kg, len_m3=length) %>%
    mutate(wt_m3 = 1000*wt_m3)
```

4) Check for overlap in Subject IDs. Fix any errors in R (hint: gsub() might be useful) or Excel (in which case you need to re-read the data).

**SOLUTION:** There is an extra space in one of the IDs in month 3.

```
setdiff( m0$SubjectID, m3$SubjectID )

[1] "0110-10016" "0110-10029" "0110-18020"

setdiff( m3$SubjectID, m0$SubjectID ) # New subject? Unlikely in a birth cohort.

[1] "0110- 18020"

## One of the ID in month 3 has extra space. Fix it in Excel or using the following R code:
m3 <- m3 %>% mutate(SubjectID = gsub(" ", "", SubjectID))

## Let's check again after this correction
setdiff( m3$SubjectID, m0$SubjectID ) # All found

character(0)
```

- [1] "0110-10016" "0110-10029"
  - 5) Merge the two files. Calculate the gain in weight and length.

setdiff( m0\$SubjectID, m3\$SubjectID ) # Two possible dropouts

**SOLUTION:** I am using left join as all subjects should exist in the delivery file. You can also use outer join here.

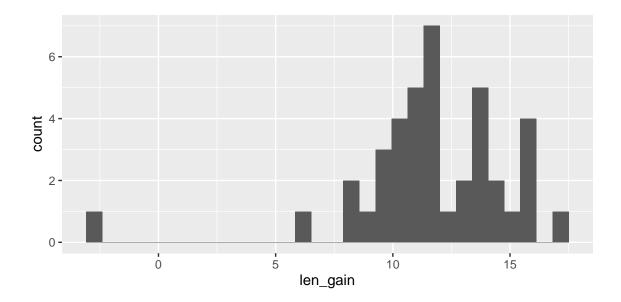
```
comb <- left_join(m0, m3) %>%
mutate(len_gain = len_m3 - len_m0,
    wt_gain = wt_m3 - wt_m0)
```

6) Investigate the gain in length. Identify anything suspicious. You don't need to fix the suspicious data point here.

**SOLUTION:** Baby 0110-18007 appears to have shrunk which is impossible, so we need to check if the error is in the delivery or month 3 dataset. For this, we look at the length distribution cross-sectionally using density plots. So a length of 45cm is unlikely for a 3 month child. You can delete this data point in the Excel file and repeat if you like or check with the data provider to fix this problem if possible. For the purposes of this exercise, we will ignore it.

```
tmp <- comb %>%
  select(SubjectID, contains("len")) %>%
  arrange(len_gain)

ggplot(tmp, aes(x=len_gain)) + geom_histogram()
```



```
head(tmp)
## # A tibble: 6 x 4
##
     SubjectID len_m0 len_m3 len_gain
     <chr>
                  <dbl>
##
                         <db1>
                                   <db1>
                          45
## 1 0110-18007
                     48
                                    -3
## 2 0110-08012
                          57.5
                                     6.5
                     51
                     48
## 3 0110-08087
                          56
                                     8
## 4 0110-08102
                     51
                          59.5
                                     8.5
## 5 0110-10013
                     50
                          59
                                     9
## 6 0110-08002
                     50
                          59.5
                                     9.5
tail(tmp)
## # A tibble: 6 x 4
##
     SubjectID len_m0 len_m3 len_gain
##
     <chr>
                  <db1>
                         <db1>
                                   <db1>
                     47
## 1 0110-08125
                          63.9
                                    16.9
## 2 0110-08010
                     47
                          NA
                                    NA
## 3 0110-08035
                     45
                                    NA
                          NA
## 4 0110-10016
                     52
                          NA
                                    NA
## 5 0110-10029
                     55
                          NA
                                    NA
```

```
## 6 0110-18020 NA 59 NA

## Check the ranges at each timepoint
mdf <- comb %>% select(SubjectID, len_m0, len_m3) %>% melt()

ggplot(mdf, aes(x=value, fill=variable)) +
  geom_density(alpha=0.5) +
  labs(x=NULL, y=NULL, title="Length")
```

# Length 0.20 0.15 0.10 0.00 45 50 55 60 65

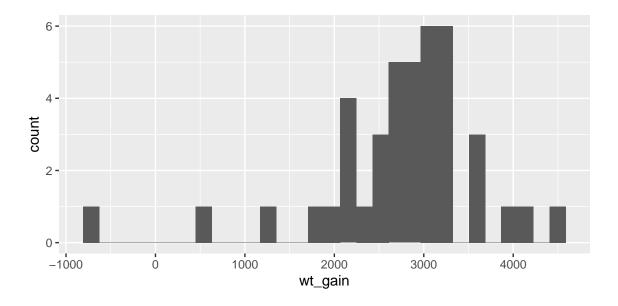
7) Investigate the gain in weight. Identify anything suspicious. You don't need to fix the suspicious data point here.

rm(tmp, mdf)

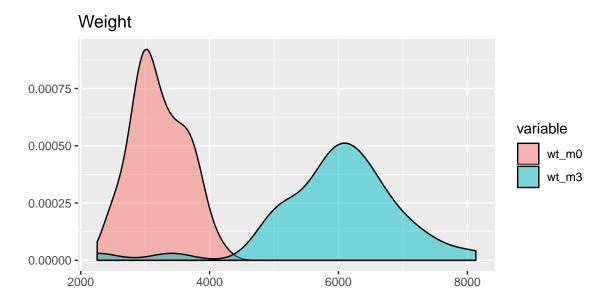
**SOLUTION:** Baby 0110-08088 appears to have lost weight which may possible due to illness. But checking the cross sectional data, it appears the month 3 value is very small. Checking with the data provider and hospital records might be useful. Again, for the purposes of this exercise, I will ignore it.

```
tmp <- comb %>%
  select(SubjectID, contains("wt")) %>%
  arrange(wt_gain)

ggplot(tmp, aes(x=wt_gain)) + geom_histogram()
```



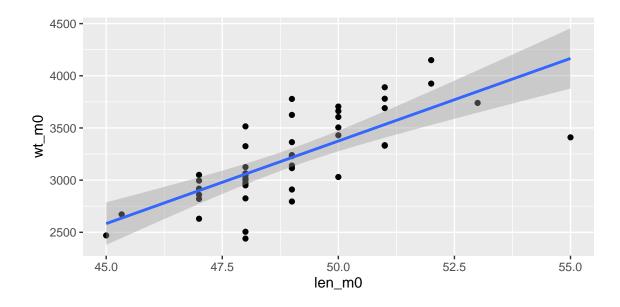
```
head(tmp)
## # A tibble: 6 x 4
## SubjectID wt_m0 wt_m3 wt_gain
## <chr>
              <dbl> <dbl>
                            <dbl>
## 1 0110-08088 3000 2255
                              -745
## 2 0110-08125 2918 3412
                              494
## 3 0110-08012 3690 4875
                              1185
## 4 0110-08076 3364 5250
                              1886
## 5 0110-18007 3065 5112
                              2047
## 6 0110-08102 3890 6060
                              2170
tail(tmp)
## # A tibble: 6 x 4
## SubjectID wt_m0 wt_m3 wt_gain
## <chr>
               <dbl> <dbl>
                             <db1>
## 1 0110-08123 2970 7045
                             4075
## 2 0110-08026 3662 8132
                              4470
## 3 0110-08010 2630
                        NA
                               NA
                        NA
                                NA
## 4 0110-08035 2470
## 5 0110-10016 4150
                                NA
                        NA
## 6 0110-10029 3410
                        NA
                                NA
## Check the ranges at each timepoint
mdf <- comb %>% select(SubjectID, wt_m0, wt_m3) %>% melt()
ggplot(mdf, aes(x=value, fill=variable)) +
 geom_density(alpha=0.5) +
 labs(x=NULL, y=NULL, title="Weight")
```



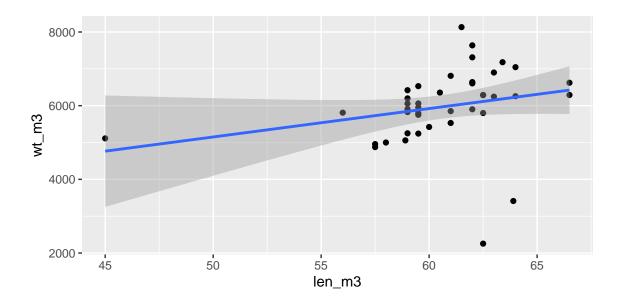
rm(tmp, mdf)

**EXPANSION:** You can also check the relationship between the length and weight at each time point to help clarify and identify further issues.

ggplot(comb, aes(x=len\_m0, y=wt\_m0)) + geom\_point() + geom\_smooth(method="lm")



ggplot(comb, aes(x=len\_m3, y=wt\_m3)) + geom\_point() + geom\_smooth(method="lm")



8) It is known in literature that babies who are born small for their gestational age tend to have a faster growth in the first few months. Can you able to test this with the available information?

**SOLUTION:** This is a trick question. You need to have the gestational age and cutoff definition to answer this. Be aware of the limitations in your dataset and avoid overinterpretations.