## Bellabeat Case Study

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#### **Data Preparation**

sum(is.na(hourly\_steps))

```
1. Load the packages
## Installing package into '/cloud/lib/x86_64-pc-linux-gnu-library/4.3'
## (as 'lib' is unspecified)
## -- Attaching core tidyverse packages ------ tidyverse 2.0.0 --
           1.1.4 v readr
                                    2.1.5
## v dplyr
## v forcats 1.0.0
                     v stringr
                                   1.5.1
## v ggplot2 3.4.4
                                  3.2.1
                       v tibble
## v lubridate 1.9.3
                        v tidyr
                                    1.3.1
## v purrr
              1.0.2
## -- Conflicts ------ tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                    masks stats::lag()
## i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all conflicts to become error
  2. Load the data
setwd("/cloud/project/input_bellabeat")
# Daily data
daily_activity <- read.csv("/cloud/project/input_bellabeat/dailyActivity_merged.csv")</pre>
daily_sleep <- read.csv("sleepDay_merged.csv")</pre>
# Hourly data
hourly_intensities <- read.csv("/cloud/project/input_bellabeat/hourlyIntensities_merged.csv")
hourly_steps <- read.csv("/cloud/project/input_bellabeat/hourlySteps_merged.csv")
hourly_calories <- read.csv("/cloud/project/input_bellabeat/hourlyCalories_merged.csv")
# Check for NA
sum(is.na(daily_activity))
## [1] 0
sum(is.na(daily_sleep))
## [1] 0
sum(is.na(hourly_intensities))
## [1] 0
```

```
## [1] 0
sum(is.na(hourly_calories))
## [1] 0
# Check for duplicates
sum(duplicated(daily_activity))
## [1] O
sum(duplicated(daily_sleep))
## [1] 3
sum(duplicated(hourly_intensities))
## [1] 0
sum(duplicated(hourly_steps))
## [1] 0
sum(duplicated(hourly_calories))
## [1] O
# Manage the duplicates in daily_sleep dataframe
daily sleep <- daily sleep[!duplicated(daily sleep), ]</pre>
sum(duplicated(daily_sleep)) #check result
## [1] 0
  3. Explore and clean the data
# View the daily data frames
# Check how many unique participants are there in each dataframe
n_distinct(daily_activity$Id)
## [1] 33
n_distinct(daily_sleep$Id)
## [1] 24
# There are more participants in daily activity than in daily sleep records.
# Overview of the data sets - daily_activity
head(daily_activity)
             Id ActivityDate TotalSteps TotalDistance TrackerDistance
## 1 1503960366
                   4/12/2016
                                   13162
                                                  8.50
                                                                   8.50
## 2 1503960366
                   4/13/2016
                                   10735
                                                  6.97
                                                                   6.97
## 3 1503960366
                  4/14/2016
                                  10460
                                                  6.74
                                                                   6.74
## 4 1503960366
                   4/15/2016
                                   9762
                                                  6.28
                                                                   6.28
## 5 1503960366
                   4/16/2016
                                   12669
                                                  8.16
                                                                   8.16
## 6 1503960366
                   4/17/2016
                                    9705
                                                  6.48
                                                                   6.48
    LoggedActivitiesDistance VeryActiveDistance ModeratelyActiveDistance
```

```
## 1
                                          1.88
                                                                  0.55
## 2
                           0
                                          1.57
                                                                  0.69
## 3
                           0
                                          2.44
                                                                  0.40
## 4
                           0
                                          2.14
                                                                  1.26
## 5
                           0
                                          2.71
                                                                  0.41
## 6
                           0
                                                                  0.78
                                          3.19
    LightActiveDistance SedentaryActiveDistance VeryActiveMinutes
## 1
                   6.06
                                             0
## 2
                   4.71
                                             0
                                                             21
## 3
                   3.91
                                             0
                                                             30
## 4
                   2.83
                                             0
                                                             29
                                             0
                                                             36
## 5
                   5.04
## 6
                   2.51
                                             0
                                                             38
    FairlyActiveMinutes LightlyActiveMinutes SedentaryMinutes Calories
## 1
                                        328
                                                        728
                     13
## 2
                     19
                                        217
                                                        776
                                                                1797
## 3
                     11
                                                                1776
                                        181
                                                       1218
## 4
                     34
                                        209
                                                        726
                                                                1745
## 5
                     10
                                        221
                                                        773
                                                                1863
## 6
                     20
                                        164
                                                        539
                                                                1728
glimpse(daily_activity)
## Rows: 940
## Columns: 15
## $ Id
                            <dbl> 1503960366, 1503960366, 1503960366, 150396036~
## $ ActivityDate
                            <chr> "4/12/2016", "4/13/2016", "4/14/2016", "4/15/~
## $ TotalSteps
                            <int> 13162, 10735, 10460, 9762, 12669, 9705, 13019~
## $ TotalDistance
                            <dbl> 8.50, 6.97, 6.74, 6.28, 8.16, 6.48, 8.59, 9.8~
## $ TrackerDistance
                            <dbl> 8.50, 6.97, 6.74, 6.28, 8.16, 6.48, 8.59, 9.8~
## $ VeryActiveDistance
                            <dbl> 1.88, 1.57, 2.44, 2.14, 2.71, 3.19, 3.25, 3.5~
## $ ModeratelyActiveDistance <dbl> 0.55, 0.69, 0.40, 1.26, 0.41, 0.78, 0.64, 1.3~
## $ LightActiveDistance
                            <dbl> 6.06, 4.71, 3.91, 2.83, 5.04, 2.51, 4.71, 5.0~
## $ SedentaryActiveDistance
                            <int> 25, 21, 30, 29, 36, 38, 42, 50, 28, 19, 66, 4~
## $ VeryActiveMinutes
                            <int> 13, 19, 11, 34, 10, 20, 16, 31, 12, 8, 27, 21~
## $ FairlyActiveMinutes
                            <int> 328, 217, 181, 209, 221, 164, 233, 264, 205, ~
## $ LightlyActiveMinutes
## $ SedentaryMinutes
                            <int> 728, 776, 1218, 726, 773, 539, 1149, 775, 818~
## $ Calories
                            <int> 1985, 1797, 1776, 1745, 1863, 1728, 1921, 203~
summary(daily_activity)
##
         Ιd
                       ActivityDate
                                           TotalSteps
                                                        TotalDistance
## Min.
          :1.504e+09
                       Length:940
                                         Min.
                                              :
                                                        Min.
                                                               : 0.000
                                                    0
  1st Qu.:2.320e+09
                       Class : character
                                         1st Qu.: 3790
                                                        1st Qu.: 2.620
## Median :4.445e+09
                       Mode :character
                                         Median: 7406
                                                        Median : 5.245
```

```
## Mean
          :4.855e+09
                                                : 7638
                                          Mean
                                                          Mean
                                                                 : 5.490
## 3rd Qu.:6.962e+09
                                          3rd Qu.:10727
                                                          3rd Qu.: 7.713
## Max.
          :8.878e+09
                                          Max.
                                                 :36019
                                                          Max.
                                                                 :28.030
## TrackerDistance LoggedActivitiesDistance VeryActiveDistance
## Min.
          : 0.000
                    Min.
                           :0.0000
                                             Min.
                                                    : 0.000
## 1st Qu.: 2.620
                    1st Qu.:0.0000
                                             1st Qu.: 0.000
## Median : 5.245
                    Median :0.0000
                                             Median : 0.210
## Mean
         : 5.475
                    Mean
                           :0.1082
                                             Mean
                                                   : 1.503
```

```
## 3rd Qu.: 7.710
                     3rd Qu.:0.0000
                                              3rd Qu.: 2.053
## Max.
          :28.030
                    Max.
                            :4.9421
                                                     :21.920
                                              Max.
## ModeratelyActiveDistance LightActiveDistance SedentaryActiveDistance
          :0.0000
                            Min.
                                   : 0.000
                                                Min.
                                                        :0.000000
   1st Qu.:0.0000
                            1st Qu.: 1.945
                                                 1st Qu.:0.000000
## Median :0.2400
                            Median : 3.365
                                                Median :0.000000
## Mean :0.5675
                            Mean : 3.341
                                                 Mean :0.001606
                            3rd Qu.: 4.782
## 3rd Qu.:0.8000
                                                 3rd Qu.:0.000000
## Max.
          :6.4800
                            Max.
                                   :10.710
                                                Max.
                                                        :0.110000
## VeryActiveMinutes FairlyActiveMinutes LightlyActiveMinutes SedentaryMinutes
## Min. : 0.00
                     Min. : 0.00
                                         Min. : 0.0
                                                               Min. :
## 1st Qu.: 0.00
                     1st Qu.: 0.00
                                          1st Qu.:127.0
                                                               1st Qu.: 729.8
## Median : 4.00
                                          Median :199.0
                                                               Median :1057.5
                     Median: 6.00
## Mean
         : 21.16
                     Mean : 13.56
                                          Mean :192.8
                                                               Mean : 991.2
## 3rd Qu.: 32.00
                     3rd Qu.: 19.00
                                          3rd Qu.:264.0
                                                               3rd Qu.:1229.5
## Max.
          :210.00
                     Max.
                           :143.00
                                          Max.
                                                 :518.0
                                                               Max.
                                                                      :1440.0
##
      Calories
## Min.
         :
## 1st Qu.:1828
## Median :2134
## Mean
          :2304
## 3rd Qu.:2793
## Max.
          :4900
# Column ActivityDate is recognized as a character (chr) type, so it needs to be changed to a date. And
daily_activity$ActivityDate <- as.Date(daily_activity$ActivityDate, format = "%m/%d/%Y")
daily_activity$Id <- as.character(daily_activity$Id)</pre>
# In this case columns about Distance is not revelant and won't be used in analysis.
daily_activity <- daily_activity[,-c(4:10)]</pre>
# Add a column with weekdays in daily_activity dataframe
daily_activity$Weekday <- weekdays(daily_activity$ActivityDate)</pre>
head(daily_activity) #checking
            Id ActivityDate TotalSteps VeryActiveMinutes FairlyActiveMinutes
## 1 1503960366
                  2016-04-12
                                 13162
                                                       25
                                                                           13
## 2 1503960366
                  2016-04-13
                                  10735
                                                       21
                                                                           19
## 3 1503960366
                 2016-04-14
                                  10460
                                                       30
                                                                           11
## 4 1503960366
                                  9762
                                                       29
                 2016-04-15
                                                                           34
## 5 1503960366
                 2016-04-16
                                  12669
                                                       36
                                                                           10
## 6 1503960366
                 2016-04-17
                                  9705
                                                                           20
    LightlyActiveMinutes SedentaryMinutes Calories
                                                      Weekday
## 1
                      328
                                       728
                                               1985
                                                      Tuesday
## 2
                      217
                                       776
                                               1797 Wednesday
## 3
                      181
                                      1218
                                               1776
                                                    Thursday
## 4
                      209
                                       726
                                               1745
                                                       Friday
## 5
                      221
                                       773
                                               1863 Saturday
## 6
                      164
                                       539
                                               1728
                                                       Sunday
# Overview of the data sets - daily_sleep
head(daily_sleep)
```

```
SleepDay TotalSleepRecords TotalMinutesAsleep
## 1 1503960366 4/12/2016 12:00:00 AM
                                                    1
                                                                     327
                                                    2
                                                                     384
## 2 1503960366 4/13/2016 12:00:00 AM
## 3 1503960366 4/15/2016 12:00:00 AM
                                                                     412
                                                    1
## 4 1503960366 4/16/2016 12:00:00 AM
                                                    2
                                                                     340
## 5 1503960366 4/17/2016 12:00:00 AM
                                                    1
                                                                     700
## 6 1503960366 4/19/2016 12:00:00 AM
                                                                     304
    TotalTimeInBed
## 1
## 2
               407
## 3
               442
## 4
               367
## 5
               712
## 6
               320
glimpse(daily_sleep)
## Rows: 410
## Columns: 5
## $ Id
                       <dbl> 1503960366, 1503960366, 1503960366, 1503960366, 150~
                       <chr> "4/12/2016 12:00:00 AM", "4/13/2016 12:00:00 AM", "~
## $ SleepDay
## $ TotalMinutesAsleep <int> 327, 384, 412, 340, 700, 304, 360, 325, 361, 430, 2~
## $ TotalTimeInBed
                       <int> 346, 407, 442, 367, 712, 320, 377, 364, 384, 449, 3~
summary(daily_sleep)
##
         Ιd
                         SleepDay
                                         TotalSleepRecords TotalMinutesAsleep
## Min.
          :1.504e+09
                       Length:410
                                         Min.
                                                :1.00
                                                           Min. : 58.0
## 1st Qu.:3.977e+09
                       Class :character
                                         1st Qu.:1.00
                                                           1st Qu.:361.0
## Median :4.703e+09
                       Mode :character
                                         Median:1.00
                                                           Median :432.5
## Mean
         :4.995e+09
                                                                  :419.2
                                         Mean
                                               :1.12
                                                           Mean
## 3rd Qu.:6.962e+09
                                          3rd Qu.:1.00
                                                           3rd Qu.:490.0
## Max.
          :8.792e+09
                                         Max.
                                               :3.00
                                                           Max.
                                                                 :796.0
## TotalTimeInBed
          : 61.0
## Min.
## 1st Qu.:403.8
## Median:463.0
## Mean
          :458.5
## 3rd Qu.:526.0
## Max.
          :961.0
# Column SleepDay is recognized as a character (chr) type so it needs to be changed to date. And Id col
daily_sleep$SleepDay <- as.Date(daily_sleep$SleepDay, format = "%m/%d/%Y")
daily_sleep$Id <- as.character(daily_sleep$Id)</pre>
head(daily_sleep) #checking
                 {\tt SleepDay\ TotalSleepRecords\ TotalMinutesAsleep\ TotalTimeInBed}
            Td
## 1 1503960366 2016-04-12
                                          1
                                                          327
                                                                         346
## 2 1503960366 2016-04-13
                                         2
                                                          384
                                                                         407
## 3 1503960366 2016-04-15
                                         1
                                                          412
                                                                         442
## 4 1503960366 2016-04-16
                                         2
                                                          340
                                                                         367
## 5 1503960366 2016-04-17
                                         1
                                                          700
                                                                         712
## 6 1503960366 2016-04-19
                                                          304
                                         1
                                                                         320
```

```
# Merge daily activities data with sleep data for analysis together.
# In daily activity data there are 940 rows, but in sleep data only 410 rows.
# I will use left join to keep all data and explore it later.
comb_daily_data <- left_join(daily_activity, daily_sleep, by= c("Id","ActivityDate" = "SleepDay"))</pre>
# Rename ActivityDate column as Date
colnames(comb_daily_data)[colnames(comb_daily_data) == "ActivityDate"] <- "Date"</pre>
head(comb_daily_data)
             Ιd
                      Date TotalSteps VeryActiveMinutes FairlyActiveMinutes
## 1 1503960366 2016-04-12
                                 13162
                                                      25
## 2 1503960366 2016-04-13
                                 10735
                                                      21
                                                                           19
## 3 1503960366 2016-04-14
                                 10460
                                                      30
                                                                           11
## 4 1503960366 2016-04-15
                                  9762
                                                      29
                                                                           34
## 5 1503960366 2016-04-16
                                 12669
                                                      36
                                                                           10
## 6 1503960366 2016-04-17
                                  9705
     LightlyActiveMinutes SedentaryMinutes Calories
                                                       Weekday TotalSleepRecords
## 1
                                        728
                                                       Tuesday
                      328
                                                1985
## 2
                      217
                                        776
                                                1797 Wednesday
                                                                                2
## 3
                      181
                                       1218
                                                1776
                                                     Thursday
                                                                               NΑ
## 4
                      209
                                        726
                                                1745
                                                        Friday
                                                                                1
## 5
                      221
                                                                                2
                                        773
                                                1863
                                                     Saturday
## 6
                      164
                                        539
                                                1728
                                                        Sunday
                                                                                1
##
     TotalMinutesAsleep TotalTimeInBed
## 1
                    327
## 2
                    384
                                    407
## 3
                     NA
                                     NA
## 4
                                    442
                    412
## 5
                    340
                                    367
                    700
                                    712
glimpse(comb_daily_data) #checking
## Rows: 940
## Columns: 12
## $ Td
                           <chr> "1503960366", "1503960366", "1503960366", "150396~
## $ Date
                           <date> 2016-04-12, 2016-04-13, 2016-04-14, 2016-04-15, ~
## $ TotalSteps
                           <int> 13162, 10735, 10460, 9762, 12669, 9705, 13019, 15~
## $ VeryActiveMinutes
                           <int> 25, 21, 30, 29, 36, 38, 42, 50, 28, 19, 66, 41, 3~
## $ FairlyActiveMinutes <int> 13, 19, 11, 34, 10, 20, 16, 31, 12, 8, 27, 21, 5,~
## $ LightlyActiveMinutes <int> 328, 217, 181, 209, 221, 164, 233, 264, 205, 211,~
## $ SedentaryMinutes
                          <int> 728, 776, 1218, 726, 773, 539, 1149, 775, 818, 83~
## $ Calories
                           <int> 1985, 1797, 1776, 1745, 1863, 1728, 1921, 2035, 1~
                           <chr> "Tuesday", "Wednesday", "Thursday", "Friday", "Sa~
## $ Weekday
                          <int> 1, 2, NA, 1, 2, 1, NA, 1, 1, 1, NA, 1, 1, 1, 1, N~
## $ TotalSleepRecords
## $ TotalMinutesAsleep
                           <int> 327, 384, NA, 412, 340, 700, NA, 304, 360, 325, N~
## $ TotalTimeInBed
                           <int> 346, 407, NA, 442, 367, 712, NA, 320, 377, 364, N~
# Check for NA, duplicates and count unique participiants
sum(is.na(comb_daily_data))
```

```
## [1] 1590
sum(duplicated(comb_daily_data))
## [1] 0
n_distinct(comb_daily_data$Id)
## [1] 33
# There is 2650 NA values.
# NA is only in merged data in sleep column. Replace it with zero for calculations.
comb_daily_data[is.na(comb_daily_data)] <- 0</pre>
head(comb_daily_data)
                      Date TotalSteps VeryActiveMinutes FairlyActiveMinutes
##
             Ιd
## 1 1503960366 2016-04-12
                                 13162
                                                       25
                                 10735
## 2 1503960366 2016-04-13
                                                       21
                                                                           19
## 3 1503960366 2016-04-14
                                 10460
                                                       30
                                                                           11
## 4 1503960366 2016-04-15
                                                       29
                                                                           34
                                  9762
## 5 1503960366 2016-04-16
                                 12669
                                                       36
                                                                           10
## 6 1503960366 2016-04-17
                                  9705
                                                       38
                                                                           20
    LightlyActiveMinutes SedentaryMinutes Calories
                                                       Weekday TotalSleepRecords
## 1
                      328
                                        728
                                                1985
                                                       Tuesday
## 2
                      217
                                        776
                                                1797 Wednesday
                                                                                 2
## 3
                      181
                                       1218
                                                1776
                                                      Thursday
                                                                                 0
## 4
                      209
                                        726
                                                1745
                                                         Friday
                                                                                 1
                                                                                2
## 5
                      221
                                        773
                                                1863
                                                      Saturday
## 6
                                                1728
                                                                                 1
                      164
                                        539
                                                         Sunday
##
     TotalMinutesAsleep TotalTimeInBed
## 1
                    327
                                    346
## 2
                    384
                                    407
## 3
                      0
                                      0
## 4
                    412
                                    442
## 5
                    340
                                    367
## 6
                    700
                                    712
glimpse(comb_daily_data) #checking
## Rows: 940
## Columns: 12
                           <chr> "1503960366", "1503960366", "1503960366", "150396~
## $ Id
                           <date> 2016-04-12, 2016-04-13, 2016-04-14, 2016-04-15, ~
## $ Date
## $ TotalSteps
                           <int> 13162, 10735, 10460, 9762, 12669, 9705, 13019, 15~
                           <int> 25, 21, 30, 29, 36, 38, 42, 50, 28, 19, 66, 41, 3~
## $ VeryActiveMinutes
## $ FairlyActiveMinutes <int> 13, 19, 11, 34, 10, 20, 16, 31, 12, 8, 27, 21, 5,~
## $ LightlyActiveMinutes <int> 328, 217, 181, 209, 221, 164, 233, 264, 205, 211,~
## $ SedentaryMinutes
                           <int> 728, 776, 1218, 726, 773, 539, 1149, 775, 818, 83~
## $ Calories
                           <int> 1985, 1797, 1776, 1745, 1863, 1728, 1921, 2035, 1~
                           <chr> "Tuesday", "Wednesday", "Thursday", "Friday", "Sa~
## $ Weekday
                           <dbl> 1, 2, 0, 1, 2, 1, 0, 1, 1, 1, 0, 1, 1, 1, 1, 0, 1~
## $ TotalSleepRecords
                           <dbl> 327, 384, 0, 412, 340, 700, 0, 304, 360, 325, 0, ~
## $ TotalMinutesAsleep
## $ TotalTimeInBed
                           <dbl> 346, 407, 0, 442, 367, 712, 0, 320, 377, 364, 0, ~
```

```
# daily_sleep columns changed data type to dbl, I will change it back to int.
comb daily data$TotalSleepRecords <- as.integer(comb daily data$TotalSleepRecords)
comb_daily_data$TotalMinutesAsleep <- as.integer(comb_daily_data$TotalMinutesAsleep)</pre>
comb_daily_data$TotalTimeInBed <- as.integer(comb_daily_data$TotalTimeInBed)</pre>
head(comb_daily_data) #checking
                      Date TotalSteps VeryActiveMinutes FairlyActiveMinutes
##
## 1 1503960366 2016-04-12
                                13162
                                                      25
                                                                           13
## 2 1503960366 2016-04-13
                                 10735
                                                      21
                                                                           19
                                10460
## 3 1503960366 2016-04-14
                                                      30
                                                                           11
## 4 1503960366 2016-04-15
                                  9762
                                                      29
                                                                           34
## 5 1503960366 2016-04-16
                                12669
                                                      36
                                                                           10
## 6 1503960366 2016-04-17
                                  9705
                                                                           20
                                                       Weekday TotalSleepRecords
     LightlyActiveMinutes SedentaryMinutes Calories
## 1
                      328
                                        728
                                                1985 Tuesday
## 2
                      217
                                        776
                                                1797 Wednesday
                                                                                2
## 3
                      181
                                       1218
                                                1776 Thursday
                                                                                0
## 4
                      209
                                        726
                                                1745
                                                                                1
                                                        Friday
## 5
                      221
                                        773
                                                1863 Saturday
                                                                                2
## 6
                      164
                                        539
                                                1728
                                                        Sunday
##
    TotalMinutesAsleep TotalTimeInBed
## 1
                    327
                                    346
## 2
                    384
                                    407
## 3
                      0
                                     0
## 4
                    412
                                    442
## 5
                    340
                                    367
## 6
                    700
                                    712
# Check for NA, duplicates and count unique participiants
sum(is.na(comb_daily_data))
## [1] 0
sum(duplicated(comb_daily_data))
## [1] 0
n_distinct(comb_daily_data$Id)
## [1] 33
# View the hourly data frames
# Check how many unique participants are there in each dataframe
n distinct(hourly calories$Id)
## [1] 33
n_distinct(hourly_intensities$Id)
## [1] 33
n_distinct(hourly_steps$Id)
```

## [1] 33

```
# Overview of the data sets - hourly_calories
head(hourly calories)
##
            Ιd
                        ActivityHour Calories
## 1 1503960366 4/12/2016 12:00:00 AM
## 2 1503960366 4/12/2016 1:00:00 AM
                                          61
## 3 1503960366 4/12/2016 2:00:00 AM
                                          59
                                          47
## 4 1503960366 4/12/2016 3:00:00 AM
## 5 1503960366 4/12/2016 4:00:00 AM
                                          48
## 6 1503960366 4/12/2016 5:00:00 AM
                                          48
glimpse(hourly calories)
## Rows: 22,099
## Columns: 3
                 <dbl> 1503960366, 1503960366, 1503960366, 1503960366, 150396036~
## $ Id
## $ ActivityHour <chr> "4/12/2016 12:00:00 AM", "4/12/2016 1:00:00 AM", "4/12/20~
                 <int> 81, 61, 59, 47, 48, 48, 48, 47, 68, 141, 99, 76, 73, 66, ~
summary(hourly_calories)
                       ActivityHour
                                            Calories
##
         Ιd
## Min.
          :1.504e+09
                      Length: 22099
                                         Min. : 42.00
## 1st Qu.:2.320e+09
                      Class : character
                                         1st Qu.: 63.00
## Median :4.445e+09
                      Mode :character
                                         Median: 83.00
## Mean
         :4.848e+09
                                         Mean : 97.39
## 3rd Qu.:6.962e+09
                                         3rd Qu.:108.00
## Max.
          :8.878e+09
                                         Max.
                                                :948.00
# Overview of the data sets - hourly_intensities
head(hourly_intensities)
            Ιd
                        ActivityHour TotalIntensity AverageIntensity
## 1 1503960366 4/12/2016 12:00:00 AM
                                                20
                                                          0.333333
## 2 1503960366 4/12/2016 1:00:00 AM
                                                8
                                                          0.133333
                                                7
## 3 1503960366 4/12/2016 2:00:00 AM
                                                          0.116667
## 4 1503960366 4/12/2016 3:00:00 AM
                                                 0
                                                          0.000000
## 5 1503960366 4/12/2016 4:00:00 AM
                                                          0.000000
## 6 1503960366 4/12/2016 5:00:00 AM
                                                0
                                                          0.000000
glimpse(hourly_intensities)
## Rows: 22,099
## Columns: 4
## $ Id
                     <dbl> 1503960366, 1503960366, 1503960366, 1503960366, 15039~
                     ## $ ActivityHour
## $ TotalIntensity <int> 20, 8, 7, 0, 0, 0, 0, 0, 13, 30, 29, 12, 11, 6, 36, 5~
## $ AverageIntensity <dbl> 0.333333, 0.133333, 0.116667, 0.000000, 0.000000, 0.0~
summary(hourly_intensities)
##
                                         TotalIntensity
         Τd
                       ActivityHour
                                                         AverageIntensity
## Min.
          :1.504e+09
                      Length: 22099
                                         Min. : 0.00 Min. :0.0000
## 1st Qu.:2.320e+09
                                         1st Qu.: 0.00 1st Qu.:0.0000
                      Class : character
```

Median: 3.00 Median: 0.0500

Mode :character

## Median :4.445e+09

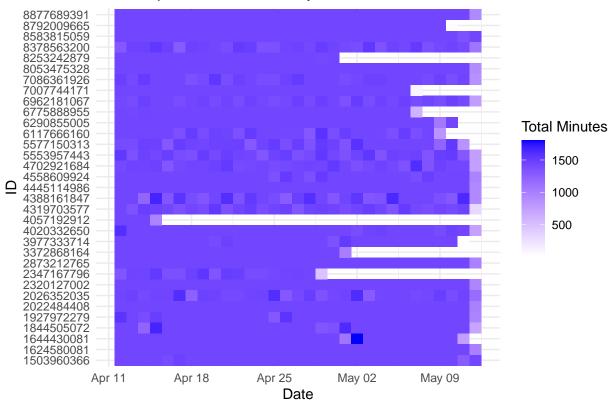
```
## Mean
           :4.848e+09
                                                : 12.04
                                                            Mean
                                                                   :0.2006
## 3rd Qu.:6.962e+09
                                           3rd Qu.: 16.00 3rd Qu.:0.2667
          :8.878e+09
                                                 :180.00
                                                            Max.
                                                                   :3.0000
# Overview of the data sets - hourly_steps
head(hourly_steps)
                         ActivityHour StepTotal
## 1 1503960366 4/12/2016 12:00:00 AM
## 2 1503960366 4/12/2016 1:00:00 AM
                                            160
## 3 1503960366 4/12/2016 2:00:00 AM
                                            151
## 4 1503960366 4/12/2016 3:00:00 AM
                                              0
## 5 1503960366 4/12/2016 4:00:00 AM
                                              0
## 6 1503960366 4/12/2016 5:00:00 AM
                                              0
glimpse(hourly_steps)
## Rows: 22,099
## Columns: 3
## $ Id
                  <dbl> 1503960366, 1503960366, 1503960366, 1503960366, 150396036~
## $ ActivityHour <chr> "4/12/2016 12:00:00 AM", "4/12/2016 1:00:00 AM", "4/12/20~
## $ StepTotal
                  <int> 373, 160, 151, 0, 0, 0, 0, 250, 1864, 676, 360, 253, 2~
summary(hourly_steps)
##
          ЬT
                        ActivityHour
                                             StepTotal
## Min.
          :1.504e+09
                       Length: 22099
                                           Min. :
                                                       0.0
## 1st Qu.:2.320e+09
                       Class : character
                                                       0.0
                                           1st Qu.:
## Median :4.445e+09
                       Mode :character
                                           Median :
                                                      40.0
         :4.848e+09
## Mean
                                           Mean
                                                : 320.2
## 3rd Qu.:6.962e+09
                                           3rd Qu.:
                                                    357.0
## Max.
          :8.878e+09
                                           Max.
                                                 :10554.0
# Column ActivityHour is recognized as a character (chr) type, so it needs to be changed to a date in e
hourly_calories$ActivityHour <- as.POSIXct(hourly_calories$ActivityHour, format = "%m/%d/%Y %I:%M:%S %p
hourly_calories$Id <- as.character(hourly_calories$Id)
hourly_intensities$ActivityHour <- as.POSIXct(hourly_intensities$ActivityHour, format = "%m/%d/%Y %I:%M
hourly_intensities$Id <- as.character(hourly_intensities$Id)
hourly_steps$ActivityHour <- as.POSIXct(hourly_steps$ActivityHour, format = "%m/%d/%Y %I:%M:%S %p")
hourly_steps$Id <- as.character(hourly_steps$Id)</pre>
head(hourly_calories) #checking
             Ιd
                       ActivityHour Calories
## 1 1503960366 2016-04-12 00:00:00
## 2 1503960366 2016-04-12 01:00:00
                                          61
## 3 1503960366 2016-04-12 02:00:00
                                          59
## 4 1503960366 2016-04-12 03:00:00
                                          47
## 5 1503960366 2016-04-12 04:00:00
                                          48
## 6 1503960366 2016-04-12 05:00:00
                                          48
head(hourly_intensities)
                       ActivityHour TotalIntensity AverageIntensity
##
## 1 1503960366 2016-04-12 00:00:00
                                                20
                                                           0.333333
## 2 1503960366 2016-04-12 01:00:00
                                                 8
                                                           0.133333
## 3 1503960366 2016-04-12 02:00:00
                                                 7
                                                           0.116667
```

```
## 4 1503960366 2016-04-12 03:00:00
                                                  0
                                                            0.000000
## 5 1503960366 2016-04-12 04:00:00
                                                  0
                                                            0.000000
## 6 1503960366 2016-04-12 05:00:00
                                                  0
                                                            0.000000
head(hourly_steps)
                       ActivityHour StepTotal
## 1 1503960366 2016-04-12 00:00:00
## 2 1503960366 2016-04-12 01:00:00
                                           160
## 3 1503960366 2016-04-12 02:00:00
                                           151
## 4 1503960366 2016-04-12 03:00:00
                                             0
## 5 1503960366 2016-04-12 04:00:00
                                             0
## 6 1503960366 2016-04-12 05:00:00
                                             0
summary(hourly calories)
                                                            Calories
##
         Ιd
                        ActivityHour
## Length:22099
                       Min.
                              :2016-04-12 00:00:00.00
                                                        Min.
                                                                : 42.00
## Class :character
                       1st Qu.:2016-04-19 01:00:00.00
                                                        1st Qu.: 63.00
## Mode :character
                       Median :2016-04-26 06:00:00.00
                                                         Median: 83.00
##
                              :2016-04-26 11:46:42.58
                                                               : 97.39
                       Mean
                                                         Mean
##
                       3rd Qu.:2016-05-03 19:00:00.00
                                                         3rd Qu.:108.00
                              :2016-05-12 15:00:00.00
##
                       Max.
                                                         Max.
                                                                :948.00
# Merge hourly data together. In all 3 data sets ar 22099 rows, and columns: Id and ActivityHour
merge_1 <- merge(hourly_calories, hourly_intensities, by = c("Id", "ActivityHour"))</pre>
comb hourly data <- merge(merge 1, hourly steps, by = c("Id", "ActivityHour"))
# Rename ActivityDate column as Date
colnames(comb_hourly_data)[colnames(comb_hourly_data) == "ActivityDate"] <- "Date"</pre>
head(comb_hourly_data)
##
                       ActivityHour Calories TotalIntensity AverageIntensity
## 1 1503960366 2016-04-12 00:00:00
                                           81
                                                          20
                                                                     0.333333
## 2 1503960366 2016-04-12 01:00:00
                                           61
                                                           8
                                                                     0.133333
                                                           7
## 3 1503960366 2016-04-12 02:00:00
                                           59
                                                                     0.116667
## 4 1503960366 2016-04-12 03:00:00
                                           47
                                                           0
                                                                      0.00000
## 5 1503960366 2016-04-12 04:00:00
                                           48
                                                           0
                                                                      0.00000
## 6 1503960366 2016-04-12 05:00:00
                                           48
                                                           0
                                                                      0.000000
##
     StepTotal
## 1
           373
## 2
           160
## 3
           151
## 4
             0
## 5
             0
## 6
             0
glimpse(comb_hourly_data)
## Rows: 22,099
## Columns: 6
## $ Id
                      <chr> "1503960366", "1503960366", "1503960366", "1503960366~
## $ ActivityHour
                      <dttm> 2016-04-12 00:00:00, 2016-04-12 01:00:00, 2016-04-12~
## $ Calories
                      <int> 81, 61, 59, 47, 48, 48, 48, 47, 68, 141, 99, 76, 73, ~
```

```
<int> 20, 8, 7, 0, 0, 0, 0, 13, 30, 29, 12, 11, 6, 36, 5~
## $ TotalIntensity
## $ AverageIntensity <dbl> 0.333333, 0.133333, 0.116667, 0.000000, 0.000000, 0.0~
## $ StepTotal
                      <int> 373, 160, 151, 0, 0, 0, 0, 0, 250, 1864, 676, 360, 25~
summary(comb_hourly_data) #checking
##
         Ιd
                        ActivityHour
                                                            Calories
##
   Length: 22099
                       Min.
                               :2016-04-12 00:00:00.00
                                                         Min.
                                                                : 42.00
##
   Class :character
                       1st Qu.:2016-04-19 01:00:00.00
                                                         1st Qu.: 63.00
   Mode :character
                       Median :2016-04-26 06:00:00.00
                                                         Median: 83.00
##
                       Mean
                              :2016-04-26 11:46:42.58
                                                         Mean
                                                                : 97.39
##
                       3rd Qu.:2016-05-03 19:00:00.00
                                                         3rd Qu.:108.00
##
                              :2016-05-12 15:00:00.00
                                                         Max.
                                                                :948.00
##
                     AverageIntensity
   TotalIntensity
                                        StepTotal
   Min.
          : 0.00
                     Min.
                            :0.0000
                                      Min.
                                                   0.0
##
##
  1st Qu.: 0.00
                     1st Qu.:0.0000
                                                   0.0
                                       1st Qu.:
## Median : 3.00
                     Median :0.0500
                                      Median:
                                                  40.0
## Mean
          : 12.04
                     Mean
                             :0.2006
                                      Mean
                                                 320.2
   3rd Qu.: 16.00
                     3rd Qu.:0.2667
                                       3rd Qu.:
                                                 357.0
## Max.
           :180.00
                            :3.0000
                                              :10554.0
                     {\tt Max.}
                                      Max.
# Check for NA, duplicates and count unique participiants
sum(is.na(comb_hourly_data))
## [1] 0
sum(duplicated(comb hourly data))
## [1] 0
n_distinct(comb_hourly_data$Id)
## [1] 33
# Add a column with weekdays in comb hourly data dataframe
comb hourly data$Weekday <- weekdays(comb hourly data$ActivityHour)</pre>
head(comb_hourly_data) #checking
##
             Ιd
                       ActivityHour Calories TotalIntensity AverageIntensity
## 1 1503960366 2016-04-12 00:00:00
                                           81
                                                          20
                                                                      0.333333
                                                           8
## 2 1503960366 2016-04-12 01:00:00
                                           61
                                                                      0.133333
## 3 1503960366 2016-04-12 02:00:00
                                           59
                                                           7
                                                                      0.116667
## 4 1503960366 2016-04-12 03:00:00
                                           47
                                                           0
                                                                      0.00000
## 5 1503960366 2016-04-12 04:00:00
                                           48
                                                           0
                                                                      0.00000
## 6 1503960366 2016-04-12 05:00:00
                                           48
                                                           0
                                                                      0.00000
##
     StepTotal Weekday
## 1
           373 Tuesday
## 2
           160 Tuesday
## 3
           151 Tuesday
## 4
             0 Tuesday
## 5
             0 Tuesday
## 6
             0 Tuesday
4. Explore daily merge data.
# I would like to understand how Fitbit users used the tracker.
# Did them used it all day long or only when excersising.
```

```
# There is 1440 min in a day so I will check thas data in time columns sum up or not.
comb daily data <- mutate(comb daily data, TotalMinutes = VeryActiveMinutes + FairlyActiveMinutes + Lig
head(comb_daily_data)
##
                      Date TotalSteps VeryActiveMinutes FairlyActiveMinutes
## 1 1503960366 2016-04-12
                                 13162
                                                       25
                                                                           13
                                 10735
## 2 1503960366 2016-04-13
                                                       21
                                                                           19
## 3 1503960366 2016-04-14
                                 10460
                                                       30
                                                                           11
## 4 1503960366 2016-04-15
                                  9762
                                                       29
                                                                           34
## 5 1503960366 2016-04-16
                                                                           10
                                 12669
                                                       36
## 6 1503960366 2016-04-17
                                  9705
                                                                           20
     LightlyActiveMinutes SedentaryMinutes Calories
                                                       Weekday TotalSleepRecords
## 1
                      328
                                        728
                                                1985
                                                       Tuesday
## 2
                                                                                 2
                      217
                                        776
                                                1797 Wednesday
## 3
                                                                                 0
                      181
                                       1218
                                                1776 Thursday
## 4
                      209
                                        726
                                                1745
                                                         Friday
                                                                                 1
## 5
                      221
                                        773
                                                1863 Saturday
                                                                                 2
## 6
                                                1728
                                                                                 1
                      164
                                        539
                                                         Sunday
##
     TotalMinutesAsleep TotalTimeInBed TotalMinutes
## 1
                    327
                                    346
                                                1440
## 2
                    384
                                    407
                                                1440
## 3
                      0
                                      0
                                                1440
## 4
                    412
                                    442
                                                1440
## 5
                    340
                                    367
                                                1407
## 6
                    700
                                    712
                                                1473
summary(comb_daily_data$TotalMinutes)
      Min. 1st Qu. Median
##
                               Mean 3rd Qu.
                                               Max.
##
        26
                      1440
                               1419
                                       1440
                                               1799
              1440
# Check precise how much of records ar 1440 min a day
count_1440_minutes <- sum(comb_daily_data$TotalMinutes == 1440)
print(count_1440_minutes)
## [1] 604
# 604 of 940 records include all day.
ggplot(comb_daily_data, aes(x = Date, y = Id, fill = TotalMinutes)) +
 geom_tile() +
  scale fill gradient(low = "white", high = "blue") +
  labs(title = "Heatmap of Total Minutes by ID and Date",
       x = "Date", y = "ID", fill = "Total Minutes") +
  theme_minimal()
```

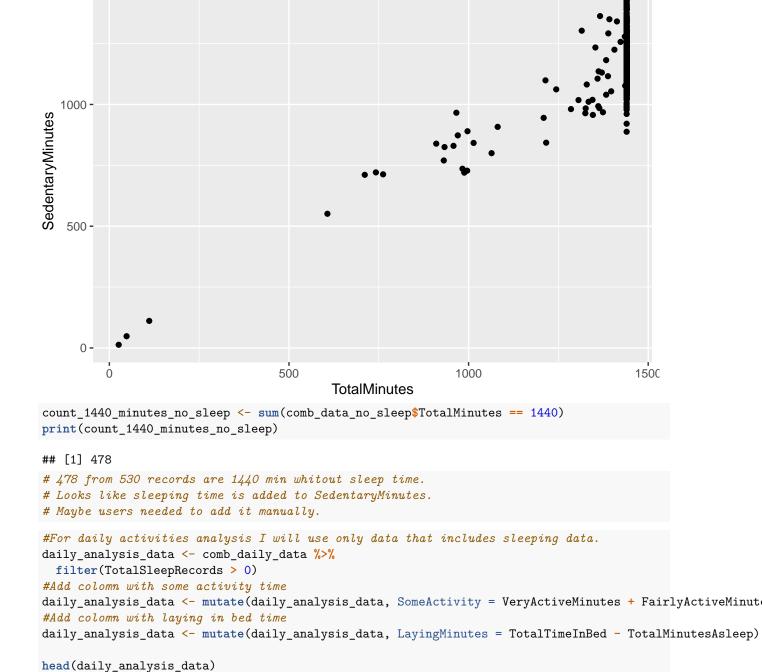
### Heatmap of Total Minutes by ID and Date



```
# There are users that have not used Fitbit tracker for all the period.
# It looks like that some minuts don't go to right date.
# That could be because the sleep data is daily and could refer to 2 dates.
# From heat map looks like last date could be incompleat.
# Lets look at average minutes per day
Id_activity <- comb_daily_data %>%
group_by(Id) %>%
summarise(
    total_dates = n_distinct(Date),
    total_minutes = sum(TotalMinutes)
) %>%
mutate(average_total_minutes = total_minutes / total_dates)%>%
arrange(desc(average_total_minutes))
```

```
## # A tibble: 33 x 4
##
                  total_dates total_minutes average_total_minutes
##
      <chr>
                         <int>
                                        <int>
                                                                 <dbl>
##
    1 8253242879
                            19
                                        27343
                                                                 1439.
    2 8583815059
                            31
                                        44559
                                                                 1437.
##
                            31
##
    3 1503960366
                                        44485
                                                                 1435
##
    4 2026352035
                            31
                                        44393
                                                                 1432.
    5 1927972279
                            31
                                        44290
                                                                 1429.
##
##
    6 8378563200
                            31
                                        44240
                                                                 1427.
    7 6290855005
                            29
                                        41384
##
                                                                 1427.
    8 1624580081
                            31
                                        44197
                                                                1426.
##
```

```
## 9 2022484408
                                                            1426.
                          31
                                     44196
## 10 2873212765
                          31
                                     44188
                                                            1425.
## # i 23 more rows
summary(Id_activity)
##
         Ιd
                        total_dates
                                       total_minutes
                                                        average_total_minutes
##
  Length:33
                       Min. : 4.00
                                       Min. : 5290
                                                       Min.
                                                             :1322
                       1st Qu.:29.00
                                       1st Qu.:41384
                                                        1st Qu.:1416
##
  Class : character
  Mode :character
                       Median :31.00
                                       Median :43922
                                                        Median:1423
                              :28.48
##
                       Mean
                                       Mean
                                             :40412
                                                        Mean
                                                              :1416
##
                       3rd Qu.:31.00
                                       3rd Qu.:44183
                                                        3rd Qu.:1426
##
                       Max.
                              :31.00
                                       Max.
                                              :44559
                                                        Max.
                                                              :1439
# Average minutes for day is from 1322 to 1439 so sleeping time accuracy could be the cases.
# How many days partipics were involved
id_count <- Id_activity %>%
 group_by(total_dates) %>%
  summarise(id_count = n_distinct(Id))
print(id_count)
## # A tibble: 9 x 2
    total_dates id_count
##
           <int>
                    <int>
## 1
## 2
              18
                        1
## 3
              19
                        1
              20
## 4
                        1
## 5
              26
                        2
## 6
              28
                        1
## 7
              29
                        2
                        3
## 8
              30
## 9
              31
                       21
# And I want to see how looks those records, that don't have daily sleep records.
comb_data_no_sleep <- comb_daily_data[comb_daily_data$TotalSleepRecords == 0,]</pre>
ggplot(data=comb_data_no_sleep, aes(x=TotalMinutes, y=SedentaryMinutes)) + geom_point()
```



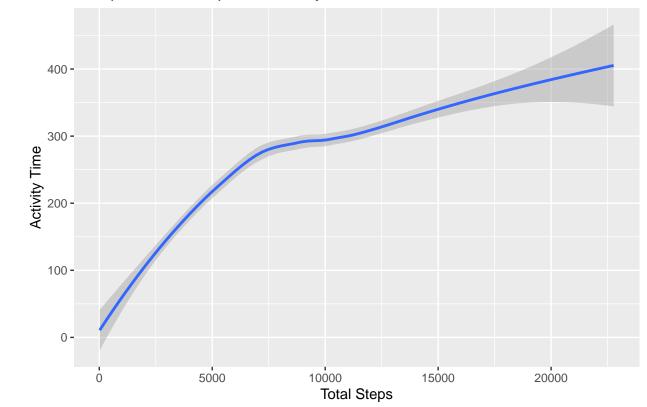
1500 -

```
##
             Ιd
                      Date TotalSteps VeryActiveMinutes FairlyActiveMinutes
## 1 1503960366 2016-04-12
                                 13162
## 2 1503960366 2016-04-13
                                 10735
                                                      21
                                                                           19
## 3 1503960366 2016-04-15
                                 9762
                                                      29
                                                                           34
## 4 1503960366 2016-04-16
                                 12669
                                                      36
                                                                           10
## 5 1503960366 2016-04-17
                                 9705
                                                      38
                                                                           20
## 6 1503960366 2016-04-19
                                 15506
                                                                           31
    LightlyActiveMinutes SedentaryMinutes Calories
                                                       Weekday TotalSleepRecords
## 1
                      328
                                        728
                                                1985
                                                       Tuesday
```

```
## 2
                      217
                                       776
                                               1797 Wednesday
## 3
                      209
                                       726
                                               1745
                                                       Friday
                                                                              1
## 4
                      221
                                       773
                                               1863
                                                     Saturday
                                                                              2
## 5
                                       539
                      164
                                               1728
                                                       Sunday
                                                                              1
## 6
                      264
                                       775
                                               2035
                                                      Tuesday
     TotalMinutesAsleep TotalTimeInBed TotalMinutes SomeActivity LayingMinutes
##
                                   346
                                               1440
## 1
                    327
                                                             366
## 2
                                   407
                    384
                                               1440
                                                             257
                                                                            23
## 3
                    412
                                   442
                                               1440
                                                             272
                                                                            30
## 4
                                   367
                                                                            27
                    340
                                               1407
                                                             267
## 5
                    700
                                   712
                                               1473
                                                             222
                                                                            12
                    304
                                   320
## 6
                                               1440
                                                             345
                                                                            16
summary(daily_analysis_data)
##
         Ιd
                            Date
                                              TotalSteps
                                                            VeryActiveMinutes
##
   Length:410
                       Min.
                              :2016-04-12
                                            Min.
                                                   :
                                                       17
                                                            Min.
                                                                   : 0.00
##
   Class : character
                       1st Qu.:2016-04-19
                                            1st Qu.: 5189
                                                            1st Qu.: 0.00
   Mode :character
                       Median :2016-04-27
                                            Median : 8913
                                                            Median: 9.00
##
                       Mean
                              :2016-04-26
                                            Mean
                                                 : 8515
                                                            Mean
                                                                  : 25.05
                                            3rd Qu.:11370
                                                            3rd Qu.: 38.00
##
                       3rd Qu.:2016-05-04
##
                       Max.
                              :2016-05-12
                                            Max.
                                                   :22770
                                                            Max.
                                                                   :210.00
## FairlyActiveMinutes LightlyActiveMinutes SedentaryMinutes
                                                                 Calories
## Min. : 0.00
                        Min. : 2.0
                                             Min. :
                                                        0.0
                                                              Min.
                                                                    : 257
   1st Qu.: 0.00
                        1st Qu.:158.0
                                             1st Qu.: 631.2
                                                              1st Qu.:1841
## Median : 11.00
                        Median :208.0
                                             Median : 717.0
                                                              Median:2207
## Mean
         : 17.92
                        Mean
                              :216.5
                                             Mean : 712.1
                                                              Mean
                                                                     :2389
                                                              3rd Qu.:2920
##
   3rd Qu.: 26.75
                        3rd Qu.:263.0
                                             3rd Qu.: 782.8
   Max.
           :143.00
                                                    :1265.0
                                                              Max.
##
                       Max.
                              :518.0
                                             Max.
                                                                     :4900
##
     Weekday
                       TotalSleepRecords TotalMinutesAsleep TotalTimeInBed
                                                : 58.0
                                                                   : 61.0
##
  Length:410
                       Min.
                              :1.00
                                         Min.
                                                            Min.
  Class : character
                       1st Qu.:1.00
                                         1st Qu.:361.0
                                                            1st Qu.:403.8
  Mode :character
                                         Median :432.5
##
                       Median:1.00
                                                            Median :463.0
##
                       Mean
                            :1.12
                                         Mean :419.2
                                                            Mean
                                                                   :458.5
##
                       3rd Qu.:1.00
                                         3rd Qu.:490.0
                                                            3rd Qu.:526.0
##
                              :3.00
                                                :796.0
                                                                   :961.0
                       Max.
                                         Max.
                                                            Max.
##
    TotalMinutes
                   SomeActivity
                                  LayingMinutes
         : 323
                                  Min.
## Min.
                  Min. : 2.0
                                         : 0.00
##
  1st Qu.:1426
                  1st Qu.:206.5
                                   1st Qu.: 17.00
## Median :1440
                  Median :263.5
                                  Median : 25.50
## Mean
         :1430
                  Mean :259.5
                                  Mean
                                         : 39.31
## 3rd Qu.:1466
                  3rd Qu.:315.5
                                   3rd Qu.: 40.00
## Max. :1799
                  Max.
                        :540.0
                                  Max.
                                         :371.00
daily_analysis_data <- mutate(daily_analysis_data, SedetaryBedMinutes = LayingMinutes + SedentaryMinute
#There is still days whit SedentaryMinutes 1265.0, that means sleeping time is less than 3 hours. And T
ggplot(data=daily_analysis_data, aes(x=TotalSteps, y=SomeActivity)) + geom_smooth(method = "loess") +
  labs(title = "Comparison of Steps VS Activity Time", x = "Total Steps", y = "Activity Time")
```

## `geom\_smooth()` using formula = 'y ~ x'

## Comparison of Steps VS Activity Time

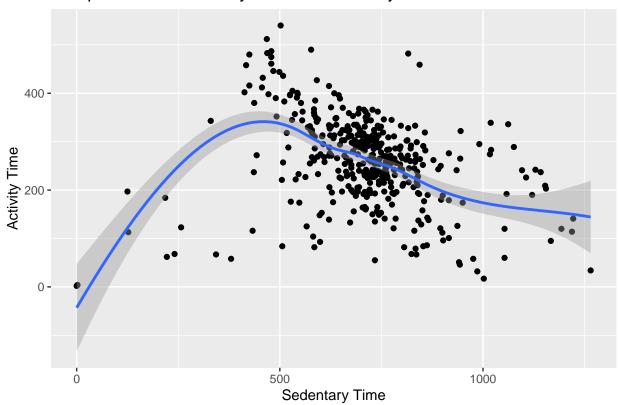


```
# More active minutes more steps.

ggplot(data=daily_analysis_data, aes(x=SedentaryMinutes, y=SomeActivity)) +
    geom_point()+
    geom_smooth(method = "loess") +
    labs(title = "Comparison of SedentaryMinutes VS Activity Time", x = "Sedentary Time", y = "Activity T
```

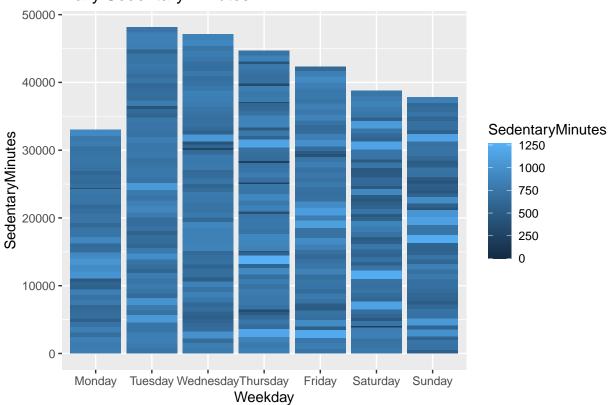
##  $geom_smooth()$  using formula = 'y ~ x'

# Comparison of SedentaryMinutes VS Activity Time



```
daily_analysis_data$Weekday <- factor(daily_analysis_data$Weekday, levels = c("Monday", "Tuesday", "Wed
ggplot(data=daily_analysis_data, aes(x=Weekday, y=SedentaryMinutes, fill=SedentaryMinutes))+
    geom_bar(stat="identity")+
    labs(title="Daily Sedentary Minutes")</pre>
```

### **Daily Sedentary Minutes**



```
#Lets look at daily time distribution
sums_act <- colSums(daily_analysis_data[, c("VeryActiveMinutes", "FairlyActiveMinutes", "LightlyActiveM
total_sum_act <- sum(sums_act)

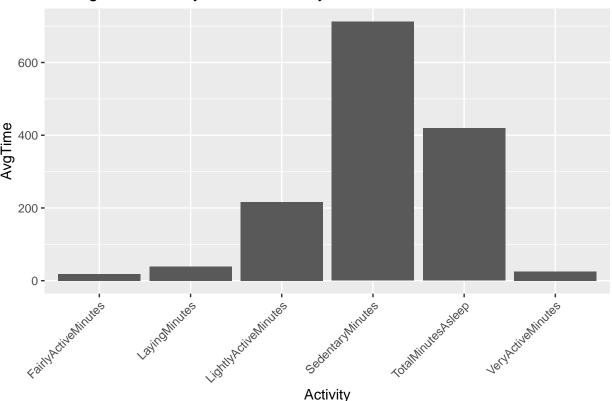
percentages_sum_act <- (sums_act / total_sum_act) * 100

avg_act <- colMeans(daily_analysis_data[, c("VeryActiveMinutes", "FairlyActiveMinutes", "LightlyActiveM
sum_daily_activites <- data.frame(
    Activity = names(sums_act),
    TotalTime = as.numeric(sums_act),
    PercentageOfTotal = percentages_sum_act,
    AvgTime = as.numeric(avg_act)
)
head(sum_daily_activites) #checking</pre>
```

```
Activity TotalTime PercentageOfTotal
##
                                                                           AvgTime
## VeryActiveMinutes
                           VeryActiveMinutes
                                                 10269
                                                                1.751376 25.04634
## FairlyActiveMinutes
                         FairlyActiveMinutes
                                                  7349
                                                                1.253370 17.92439
## LightlyActiveMinutes LightlyActiveMinutes
                                                 88782
                                                               15.141752 216.54146
## SedentaryMinutes
                            SedentaryMinutes
                                                291961
                                                               49.793891 712.10000
## TotalMinutesAsleep
                          TotalMinutesAsleep
                                                171861
                                                               29.310859 419.17317
## LayingMinutes
                               LayingMinutes
                                                 16117
                                                                2.748751 39.30976
```

```
ggplot(data=sum_daily_activites, aes(x=Activity, y=AvgTime))+
  geom_bar(stat="identity")+
  labs(title="Average Time in day for each activity")+
  theme(axis.text.x = element_text(angle = 45, hjust = 1))
```

### Average Time in day for each activity



```
#Most of the time is spent as sedentary minutes.

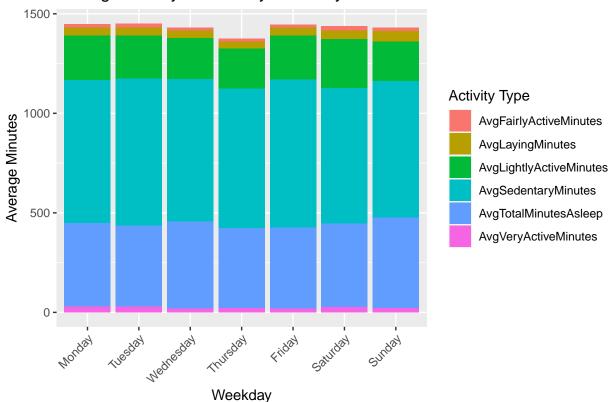
#Explore activities by weekdays

avg_by_weekday <- daily_analysis_data %>%
    group_by(Weekday) %>%
    summarise(
        AvgVeryActiveMinutes = mean(VeryActiveMinutes, na.rm = TRUE),
        AvgFairlyActiveMinutes = mean(FairlyActiveMinutes, na.rm = TRUE),
        AvgLightlyActiveMinutes = mean(LightlyActiveMinutes, na.rm = TRUE),
        AvgSedentaryMinutes = mean(SedentaryMinutes, na.rm = TRUE),
        AvgTotalMinutesAsleep = mean(TotalMinutesAsleep, na.rm = TRUE),
        AvgLayingMinutes = mean(LayingMinutes, na.rm = TRUE)
)
```

```
## # A tibble: 6 x 7
     Weekday
##
               AvgVeryActiveMinutes AvgFairlyActiveMinutes AvgLightlyActiveMinutes
##
     <fct>
                               <dbl>
                                                       <dbl>
## 1 Monday
                                30.7
                                                        19.1
                                                                                 222.
## 2 Tuesday
                                30.6
                                                        20.0
                                                                                 217.
```

```
21.3
                                                    16.7
                                                                           208.
## 3 Wednesday
                             22.9
## 4 Thursday
                                                    15.9
                                                                           203.
## 5 Friday
                             21.2
                                                    14.6
                                                                           223.
## 6 Saturday
                             27.6
                                                    22.7
                                                                           247.
## # i 3 more variables: AvgSedentaryMinutes <dbl>, AvgTotalMinutesAsleep <dbl>,
## # AvgLayingMinutes <dbl>
summary(avg_by_weekday)
        Weekday AvgVeryActiveMinutes AvgFairlyActiveMinutes
                       :21.16
                                     Min. :14.58
## Monday
          :1
                 Min.
                                     1st Qu.:16.30
## Tuesday :1
                 1st Qu.:21.74
## Wednesday:1
                Median :22.86
                                     Median :16.76
## Thursday :1
                      :25.20
                                     Mean :17.97
                 Mean
                                     3rd Qu.:19.57
## Friday
                 3rd Qu.:29.09
          :1
## Saturday:1
                 Max. :30.72
                                     Max. :22.72
## Sunday :1
## AvgLightlyActiveMinutes AvgSedentaryMinutes AvgTotalMinutesAsleep
## Min. :200.0
                          Min.
                                :680.4
                                              Min.
                                                   :401.3
                          1st Qu.:693.0
                                              1st Qu.:405.0
## 1st Qu.:205.5
## Median :216.6
                          Median :714.5
                                              Median :419.1
## Mean :217.1
                          Mean :711.8
                                              Mean :419.6
## 3rd Qu.:222.5
                          3rd Qu.:729.2
                                              3rd Qu.:427.1
## Max. :246.8
                          Max. :743.1
                                              Max. :452.7
## AvgLayingMinutes
         :33.58
## Min.
## 1st Qu.:36.60
## Median:38.75
## Mean :39.53
## 3rd Qu.:40.20
## Max. :50.76
##
avg_by_weekday_long <- avg_by_weekday %>%
 pivot_longer(cols = starts_with("Avg"),
              names_to = "ActivityType",
              values_to = "Minutes")
ggplot(avg_by_weekday_long, aes(x = Weekday, y = Minutes, fill = ActivityType)) +
 geom_bar(stat = "identity") +
 labs(title = "Average Activity Minutes by Weekday",
      x = "Weekday",
      y = "Average Minutes",
      fill = "Activity Type") +
 theme(axis.text.x = element_text(angle = 45, hjust = 1))
```

### Average Activity Minutes by Weekday



Export files

```
# Preparing and exporting files for analysis and presentation in Tableau
# Only data I will need and in long format
exp_daily_act <- daily_analysis_data %>%
  select(Id, Date, Weekday, VeryActiveMinutes, FairlyActiveMinutes, LightlyActiveMinutes, SedentaryMinu
  pivot_longer(
   cols = c(VeryActiveMinutes, FairlyActiveMinutes, LightlyActiveMinutes, SedentaryMinutes, TotalMinut
   names_to = "ActivityType",
    values_to = "Minutes"
  )
head(exp_daily_act)
## # A tibble: 6 x 5
```

5.

```
##
     Ιd
                Date
                           Weekday ActivityType
                                                          Minutes
                <date>
                            <fct>
                                    <chr>>
                                                            <int>
##
     <chr>>
## 1 1503960366 2016-04-12 Tuesday VeryActiveMinutes
                                                               25
## 2 1503960366 2016-04-12 Tuesday FairlyActiveMinutes
                                                               13
## 3 1503960366 2016-04-12 Tuesday LightlyActiveMinutes
                                                              328
## 4 1503960366 2016-04-12 Tuesday SedentaryMinutes
                                                              728
## 5 1503960366 2016-04-12 Tuesday TotalMinutesAsleep
                                                              327
## 6 1503960366 2016-04-12 Tuesday LayingMinutes
                                                               19
```

summary(exp\_daily\_act) #checking

## Ιd Weekday Date ActivityType

```
## Length:2460
                       Min.
                              :2016-04-12
                                            Monday
                                                      :276
                                                             Length: 2460
##
                                                             Class : character
  Class : character
                       1st Qu.:2016-04-19
                                            Tuesday
                                                     :390
##
   Mode :character
                       Median :2016-04-27
                                            Wednesday:396
                                                             Mode :character
##
                       Mean
                              :2016-04-26
                                            Thursday:384
##
                       3rd Qu.:2016-05-04
                                            Friday
                                                      :342
##
                              :2016-05-12
                                            Saturday:342
                       Max.
##
                                            Sunday
                                                      :330
##
       Minutes
##
   Min.
         : 0.0
##
   1st Qu.: 18.0
## Median: 112.5
          : 238.3
## Mean
   3rd Qu.: 428.2
          :1265.0
## Max.
##
write.csv(exp_daily_act, file = "/cloud/project/output_bellabeat/daily_data.csv", row.names = FALSE)
# Export the Hourly data
write.csv(comb_hourly_data, file= "/cloud/project/output_bellabeat/comb_hourly_data.csv", row.names = F.
#For summary
exp_summary_act <- daily_analysis_data %>%
  select(Id, Date, Weekday, SomeActivity, TotalMinutesAsleep, SedetaryBedMinutes) %>%
  pivot_longer(
   cols = c(SomeActivity, TotalMinutesAsleep, SedetaryBedMinutes),
   names_to = "ActivityType",
   values to = "Minutes"
  )
head(exp_summary_act)
## # A tibble: 6 x 5
##
                Date
                           Weekday
                                     ActivityType
                                                         Minutes
##
     <chr>>
                <date>
                           <fct>
                                     <chr>>
                                                           <int>
## 1 1503960366 2016-04-12 Tuesday
                                     SomeActivity
                                                             366
                                                             327
## 2 1503960366 2016-04-12 Tuesday
                                     TotalMinutesAsleep
## 3 1503960366 2016-04-12 Tuesday
                                     SedetaryBedMinutes
                                                             747
## 4 1503960366 2016-04-13 Wednesday SomeActivity
                                                             257
## 5 1503960366 2016-04-13 Wednesday TotalMinutesAsleep
                                                             384
## 6 1503960366 2016-04-13 Wednesday SedetaryBedMinutes
                                                             799
summary(exp_summary_act) #checking
                                                 Weekday
##
         Ιd
                            Date
                                                             ActivityType
  Length: 1230
                       Min.
                              :2016-04-12
                                            Monday
                                                      :138
                                                             Length: 1230
                       1st Qu.:2016-04-19
## Class :character
                                            Tuesday:195
                                                             Class : character
                       Median :2016-04-27
                                                             Mode :character
##
  Mode :character
                                            Wednesday: 198
##
                       Mean
                              :2016-04-26
                                            Thursday:192
##
                       3rd Qu.:2016-05-04
                                            Friday
                                                      :171
##
                       Max.
                              :2016-05-12
                                            Saturday:171
##
                                            Sunday
                                                     :165
##
       Minutes
## Min. :
               2.0
  1st Qu.: 291.0
```

```
## Median : 433.0
## Mean : 476.7
## 3rd Qu.: 675.8
## Max. :1271.0
##

# Export the Hourly data
write.csv(exp_summary_act, file= "/cloud/project/output_bellabeat/summary_act_data.csv", row.names = FA
```