Bellabeat Case Study in R

Sahil Chikode

2025-08-08

About Company

Urska Srsen and Sando Mur founded Bellabeat, a high-tech company that manufactures health-focused sma products. Srsen used her background as an a ist to develop beautifully designed technology that informs and inspires women around the world. Collecting data on activity, sleep, stress, and reproductive health has allowed Bellabeat to empower women with knowledge about their own health and habits. Since it was founded in 2013, Bellabeat has grown rapidly and quickly positioned itself as a tech-driven wellness company for women. By 2016, Bellabeat had opened offices around the world and launched multiple products. Bellabeat products became available through a growing number of online retailers in addition to their own e-commerce channel on their website click here.

Question for the analysis

- 1. What are some trends in sma device usage?
- 2. How could these trends apply to Bellabeat customers?
- 3. How could these trends help in influence Bellabeat marketing strategy?

Loading Packages

library(tidyr)
library(janitor)

```
library(tidyverse)
## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
## v dplyr
               1.1.4
                          v readr
                                      2.1.5
## v forcats
               1.0.0
                                      1.5.1
                          v stringr
## v ggplot2
               3.5.2
                          v tibble
                                      3.3.0
## v lubridate 1.9.4
                          v tidyr
                                      1.3.1
## v purrr
               1.1.0
## -- Conflicts -----
                                             -----ctidyverse_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
library(dplyr)
library(ggplot2)
```

```
##
## Attaching package: 'janitor'
##
## The following objects are masked from 'package:stats':
##
## chisq.test, fisher.test
library(skimr)
```

Importing dataset using readr()

daily_activity <- read.csv("C:/Users/Admin/OneDrive/Desktop/PROJECTS/Bellabeat/Fitabase Data/dailyActiv sleep <- read.csv("C:/Users/Admin/OneDrive/Desktop/PROJECTS/Bellabeat/Fitabase Data/SleepDay_merged.csv weight <- read.csv("C:/Users/Admin/OneDrive/Desktop/PROJECTS/Bellabeat/Fitabase Data/weightLogInfo_merg calories <- read.csv("C:/Users/Admin/OneDrive/Desktop/PROJECTS/Bellabeat/Fitabase Data/hourlyCalories_m intensities <- read.csv("C:/Users/Admin/OneDrive/Desktop/PROJECTS/Bellabeat/Fitabase Data/hourlyIntensi

head(daily_activity)

```
Id ActivityDate TotalSteps TotalDistance TrackerDistance
##
## 1 1503960366
                    3/25/2016
                                    11004
                                                    7.11
                                                                     7.11
## 2 1503960366
                    3/26/2016
                                                   11.55
                                                                    11.55
                                    17609
                   3/27/2016
## 3 1503960366
                                    12736
                                                    8.53
                                                                     8.53
                                    13231
                                                    8.93
## 4 1503960366
                   3/28/2016
                                                                     8.93
## 5 1503960366
                    3/29/2016
                                    12041
                                                    7.85
                                                                     7.85
## 6 1503960366
                    3/30/2016
                                    10970
                                                    7.16
                                                                     7.16
     {\tt LoggedActivitiesDistance\ VeryActiveDistance\ ModeratelyActiveDistance}
## 1
                             0
                                               2.57
                                                                         0.46
## 2
                             0
                                               6.92
                                                                         0.73
## 3
                             0
                                               4.66
                                                                         0.16
## 4
                             0
                                               3.19
                                                                         0.79
## 5
                             0
                                               2.16
                                                                         1.09
## 6
                              0
                                               2.36
                                                                         0.51
##
     LightActiveDistance SedentaryActiveDistance VeryActiveMinutes
## 1
                     4.07
                                                  0
                                                                    33
## 2
                     3.91
                                                  0
                                                                    89
## 3
                     3.71
                                                  0
                                                                    56
## 4
                     4.95
                                                  0
                                                                    39
                                                  0
## 5
                     4.61
                                                                    28
                     4.29
                                                  0
     FairlyActiveMinutes LightlyActiveMinutes SedentaryMinutes Calories
##
## 1
                                                               804
                       12
                                            205
                                                                       1819
## 2
                       17
                                            274
                                                               588
                                                                       2154
## 3
                        5
                                            268
                                                               605
                                                                       1944
## 4
                       20
                                                                       1932
                                            224
                                                              1080
## 5
                       28
                                            243
                                                               763
                                                                       1886
## 6
                       13
                                            223
                                                              1174
                                                                       1820
```

head(sleep)

```
##
                              SleepDay TotalSleepRecords TotalMinutesAsleep
## 1 1503960366 4/12/2016 12:00:00 AM
                                                                          327
## 2 1503960366 4/13/2016 12:00:00 AM
                                                        2
                                                                          384
## 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
                                                                          700
                                                        1
## 6 1503960366 4/19/2016 12:00:00 AM
                                                                          304
     TotalTimeInBed
##
## 1
## 2
                407
## 3
                442
## 4
                367
## 5
                712
## 6
                320
```

Fixing formating of the date

```
# intensities
intensities$ActivityHour=as.POSIXct(intensities$ActivityHour, format="%m/%d/%Y %1:%M:%S %p", tz=Sys.tim
intensities$time <- format(intensities$ActivityHour, format = "%H:%M:%S")
intensities $\date <- format(intensities $\frac{1}{2}Activity Hour, format = \frac{\text{"\mathemath}}{\text{"}} \frac{1}{2} \dots \frac{1
calories$ActivityHour=as.POSIXct(calories$ActivityHour, format="%m/%d/%Y %I:%M:%S %p", tz=Sys.timezone(
calories$time <- format(calories$ActivityHour, format = "%H:%M:%S")</pre>
calories$date <- format(calories$ActivityHour, format = "%m/%d/%y")
# activity
daily_activity$ActivityDate=as.POSIXct(daily_activity$ActivityDate, format="%m/%d/%Y", tz=Sys.timezone(
daily_activity$date <- format(daily_activity$ActivityDate, format = "%m/%d/%y")
sleep$SleepDay=as.POSIXct(sleep$SleepDay, format="%m/%d/%Y %I:%M:%S %p", tz=Sys.timezone())
sleep$date <- format(sleep$SleepDay, format = "%m/%d/%y")</pre>
#weight
weight$Date=as.POSIXct(weight$Date, format="%m/%d/%Y %I:%M:%S %p", tz=Sys.timezone())
weight$time <- format(weight$Date, format = "%H:%M:%S")</pre>
weight$date <- format(weight$Date, format = "%m/%d/%y")</pre>
```

The format of data and time is not consistent across all the dataset. So, I can converted the into single format.

Summarizing the data.

```
skim_without_charts(daily_activity)
```

Table 1: Data summary

Name	daily_activity
Number of rows	457
Number of columns	16

Column type frequency:

character	1
numeric	14
POSIXct	1

Group variables None

Variable type: character

skim_variable	$n_{missing}$	$complete_rate$	min	max	empty	n_unique	whitespace
date	0	1	8	8	0	32	0

Variable type: numeric

skim_variable n	_missingom	plete_	_rat e nean	sd	p0	p25	p50	p75	p100
Id	0	1	4.628595e+	20 2 93781e -15 9	3960	3 6 6347168e-	409 57193e - €	03 91747e-	
TotalSteps	0	1	6.546560e+	50 3 98490e+03	0	1.988000e-	509 86000e-1	.0 3 19800e-	20 8 49700e+
TotalDistance	0	1	4.660000e +	40 0 80000e+00	0	1.410000e-	40 0 90000e+7	01 060000e-	207 53000e+
TrackerDistance	0	1	4.610000e+	4007 0000e+00	0	1.280000e-	4 00 90000e+7	701 010000e-	207 53000e+
LoggedActivitiesDi	stance	1	1.800000e-	8.500000e-	0	0.000000e	900 00000e+6	0 0 000000e-	160 1 030000e+
			01	01					
VeryActiveDistanc	e 0	1	1.180000e+	204 90000e+00	0	0.000000e-	90000000e+1	03 10000e-	200 92000e+
Moderately Active I	Distance	1	4.800000e-	8.30000e-	0	0.000000e	200 00000e-6	5.700000e-	6.400000e+
			01	01			02	01	
LightActiveDistance	ee 0	1	2.890000e+	202 040000e+00	0	8.700000e-	2.930000e-⊬	Q4 60000e-	H02051000e+
						01			
SedentaryActiveDi	stan@e	1	0.000000e +	10 0 00000e-	0	0.000000e	900 00000e+€	00 000000e-	£00 00000e-
				02					01
VeryActiveMinutes	0	1	1.662000e+	20 8 92000e+01	0	0.000000e-	9 00 000000e+2	05 00000e-	20020000e+
FairlyActiveMinute	es 0	1	1.307000e+	30 6 21000e+01	0	0.000000e-	10000000e+1	06 00000e-	606 00000e+
LightlyActiveMinu	tes 0	1	1.700700e+	10 2 22100e+02	0	6.400000e-	10810000e+2	0 2 70000e-	702 00000e+
SedentaryMinutes	0	1	9.952800e+	30 3 70200e+02	32	7.280000e-	10 2 57000e-1	0 2 85000e-	H03 40000e+
Calories	0	1	2.189450e+	80B54800e+02	0	1.776000e-	203 62000e+2	0 6 67000e-	40 3 62000e+

Variable type: POSIXct

skim_variable	$n_{missing}$	$complete_rate$	min	max	median	n_unique
ActivityDate	0	1	2016-03-12	2016-04-12	2016-04-05	32

skim_without_charts(sleep)

Table 5: Data summary

Name	sleep
Number of rows	413
Number of columns	6
Number of columns	O

Variable type: character

skim_variable	n_missing	complete_rate	min	max	empty	n_unique	whitespace
date	0	1	8	8	0	31	0

Variable type: numeric

skim_variable n_r	nissingom	plete_r	ate mean	sd	p0	p25	p50	p75	p100
Id	0	1	5.000979e + 6	2906036e+0195	0396036	B 977333714	1 702921680	496218106	8 79200966
${\bf Total Sleep Records}$	0	1	1.120000e+6	3 050000e-	1	1	1	1	3
				01					
TotalMinutesAsleep	0	1	4.194700e + 0	D 218340e+02	58	361	433	490	796
${\bf Total Time In Bed}$	0	1	4.586400e + 0	227 100e+02	61	403	463	526	961

Variable type: POSIXct

skim_variable	n_missing	complete_rate	min	max	median	n_unique
SleepDay	0	1	2016-04-12	2016-05-12	2016-04-27	31

skim_without_charts(weight)

Table 9: Data summary

Name	weight
Number of rows	33
Number of columns	10
Column type frequency:	
character	3
numeric	6
POSIXct	1
Group variables	None

Variable type: character

$skim_variable$	$n_{missing}$	$complete_rate$	\min	max	empty	n _unique	whitespace
IsManualReport	0	1	4	5	0	2	0

skim_variable	n_missing	complete_rate	min	max	empty	n_unique	whitespace
time	0	1	8	8	0	11	0
date	0	1	8	8	0	14	0

Variable type: numeric

skim_variabde	missi	n g omplete_	ratemean	sd	p0	p25	p50	p75	p100
Id	0	1.00	6.477156e+	-20.3 08888e+10.9	5 03960e+4	0.9 02922e+ 6	.9 62181e+ &).\$ 77689e+	8.9 77689e+09
WeightKg	0	1.00	7.344000e +	-D653000e+50	B 30000e+ 6	5.1 70000e+ 6	0.250000e+&	£80000e+	0.296000e+0
WeightPounds	0	1.00	1.619100e +	3.2 644000e+ 1 0.	1 75100e+1	0 2 60300e+1	.2 77900e+1	28 91600e+	20.28 57200e+02
Fat	31	0.06	1.600000e +	30.11 90000e+ D 0	0 00000e+1	0.B00000e+1	0.1600000e+1).1900000e+	20.2 00000e+0
BMI	0	1.00	2.573000e+	40.B 30000e+ 20.	0.45000e + 1	2.1 10000e+ 2	0.1439000e+2	£76000е+	4.6 17000e+0
LogId	0	1.00	1.459959e +	-3.2 88072e+ 0 .8	\$459382e+1	1.2 459753e+ 1 1	. 2 159987e+11	L 2 60160e+	1.2 60506e+12

Variable type: POSIXct

skim_variabl	e n_missing com	plete_rat	temin	max	median	n_unique
Date	0	1	2016-03-30 23:59:59	2016-04-12 23:59:59	2016-04-06 23:59:59	24

skim_without_charts(calories)

Table 13: Data summary

Name	calories
Number of rows	24084
Number of columns	5
Column type frequency:	
character	2
numeric	2
POSIXct	1
Group variables	None

Variable type: character

skim_variable	n_missing	complete_rate	min	max	empty	n_unique	whitespace
time	0	1	8	8	0	24	0
date	0	1	8	8	0	32	0

Variable type: numeric

skim_variable_missingomplete_rate mean	sd	p0	p25	p50	p75	p100
0 1 _		1	1	1	1	1

skim_variabh	e_missingon	nplete_1	rate mean	sd	p0	p25	p50	p75	p100
Calories	0	1	9.427000e+01	59.4	42	61	77	104	933

Variable type: POSIXct

skim_variable	n_missing	complete_r	ate	min	max	median	n_unique
ActivityHour	0		1	2016-03- 12	2016-04-12 10:00:00	2016-03-27 04:00:00	755

skim_without_charts(intensities)

Table 17: Data summary

Name	intensities
Number of rows	24084
Number of columns	6
Column type frequency:	
character	2
numeric	3
POSIXct	1
Group variables	None

Variable type: character

skim_variable	n_missing	$complete_rate$	min	max	empty	n_unique	whitespace
time	0	1	8	8	0	24	0
date	0	1	8	8	0	32	0

Variable type: numeric

skim_variablen_n	missingo	mplete_	rate mean	sd	p0	p25	p50	p75	p100
Id	0	1	4.889424e+	2 9421566e+ 0	9 0396036	8 3471677	9 6 .55861e+	@9962181e+ 8 8	9776893
TotalIntensity	0	1	1.083000e +	21 031000e+0	1 0	0	1.00000e +	00400000e+01	180
AverageIntensity	0	1	1.800000e-	3.400000e-	0	0	2.00000e-	2.300000e-	3
			01	01			02	01	

Variable type: POSIXct

$skim_variable$	$n_missing$	$complete_$	rate	min	max	median	n_unique
ActivityHour	0		1	2016-03- 12	2016-04-12 10:00:00	2016-03-27 04:00:00	755

Using library skimr, summarize each dataset without chart.

```
n_distinct(daily_activity$Id)
## [1] 35
n distinct(sleep$Id)
## [1] 24
n_distinct(weight$Id)
## [1] 11
n_distinct(intensities$Id)
## [1] 34
n_distinct(calories$Id)
## [1] 34
This is about number participants in each data sets. There are 35 participants in daily activity data set, 34
participants in intensities and calories data set, 24 in sleep data set and 11 at weight data set.
Now summary statistics of all the data sets.
daily_activity %>% select(Id, TotalSteps, TotalDistance, SedentaryMinutes) %>%
  summary()
##
          Ιd
                          TotalSteps
                                        TotalDistance
                                                         SedentaryMinutes
## Min.
           :1.504e+09
                        Min. : 0
                                        Min. : 0.000
                                                         Min. : 32.0
                       1st Qu.: 1988
## 1st Qu.:2.347e+09
                                       1st Qu.: 1.410 1st Qu.: 728.0
## Median :4.057e+09
                        Median: 5986
                                        Median: 4.090 Median: 1057.0
## Mean
           :4.629e+09
                        Mean : 6547
                                              : 4.664
                                                                 : 995.3
                                        Mean
                                                         Mean
## 3rd Qu.:6.392e+09
                        3rd Qu.:10198
                                        3rd Qu.: 7.160
                                                         3rd Qu.:1285.0
          :8.878e+09
                                              :27.530
## Max.
                        Max.
                               :28497
                                        Max.
                                                         Max.
                                                                 :1440.0
avg_individal <- daily_activity %>% group_by(Id) %>% summarise(avg_steps = mean(TotalSteps),
               avg_distance = mean(TotalDistance),
               avg_SedentaryActiveDistance = mean(SedentaryActiveDistance))
print(avg_individal, n = 35)
                                     #Prints each row of the output
## # A tibble: 35 \times 4
              Id avg_steps avg_distance avg_SedentaryActiveDistance
##
##
                     <dbl>
                                  <dbl>
                                                               <dbl>
           <dbl>
  1 1503960366
                                                             0
##
                    11641.
                                  7.61
   2 1624580081
                     4226.
                                  2.75
                                                             0.00526
##
                                                             0.00800
## 3 1644430081
                     9275.
                                  6.75
## 4 1844505072
                     3641.
                                  2.41
                                                             0
```

0

1.51

2181.

5 1927972279

```
## 7 2026352035
                     3393.
                                  2.10
                                                            0
## 8 2320127002
                     3138.
                                  2.12
                                                            0
## 9 2347167796
                     9800.
                                  6.51
                                                            Ω
## 10 2873212765
                     6637.
                                  4.47
                                                            0.00167
## 11 2891001357
                                  0.604
                     774.
                                                            0
## 12 3372868164
                                  4.22
                                                            0.0140
                     6128.
## 13 3977333714
                     8664.
                                  5.81
## 14 4020332650
                     5777.
                                  4.14
                                                            0.00625
## 15 4057192912
                                  1.39
                                                            0.00187
                     1887.
## 16 4319703577
                     7821.
                                  5.26
## 17 4388161847
                       0
                                  0
                                                            0
## 18 4445114986
                     4293.
                                  2.91
                                                            0
                                                            0
## 19 4558609924
                     5785.
                                  3.82
## 20 4702921684
                     7943.
                                  6.45
                                                            0
## 21 5553957443
                     8355.
                                  5.46
                                                            0
## 22 5577150313
                                  6.45
                                                            0
                     8608.
## 23 6117666160
                     8249.
                                  6.23
                                                            0
## 24 6290855005
                                  1.22
                                                            0
                     1618.
## 25 6391747486
                     1337.
                                  1.07
                                                            0
## 26 6775888955
                     5559
                                  3.99
                                                            Ω
## 27 6962181067
                   12640.
                                  8.65
                                                            0.00714
## 28 7007744171
                   12260.
                                  8.86
                                                            0.00417
## 29 7086361926
                     6104.
                                 4.09
                                                            0.00500
## 30 8053475328
                   14844.
                                 11.6
                                                            0
## 31 8253242879
                     2390.
                                 1.68
                                                            0.00250
## 32 8378563200
                     8135.
                                  6.45
## 33 8583815059
                     3046.
                                  2.38
                                                            0
## 34 8792009665
                     3095.
                                  1.98
## 35 8877689391
                                                            0.00250
                    17417.
                                 14.1
daily_activity %>%
  select(VeryActiveMinutes, FairlyActiveMinutes, LightlyActiveMinutes) %>%
  summary()
## VeryActiveMinutes FairlyActiveMinutes LightlyActiveMinutes
## Min. : 0.00
                     Min. : 0.00
                                         Min. : 0.0
## 1st Qu.: 0.00
                     1st Qu.: 0.00
                                          1st Qu.: 64.0
## Median : 0.00
                     Median: 1.00
                                          Median :181.0
## Mean : 16.62
                     Mean : 13.07
                                          Mean :170.1
   3rd Qu.: 25.00
                     3rd Qu.: 16.00
                                          3rd Qu.:257.0
## Max.
          :202.00
                     Max. :660.00
                                          Max.
                                                :720.0
sleep %>% select(TotalSleepRecords, TotalMinutesAsleep, TotalTimeInBed) %>%
  summary()
## TotalSleepRecords TotalMinutesAsleep TotalTimeInBed
## Min.
          :1.000
                     Min. : 58.0
                                        Min.
                                                : 61.0
## 1st Qu.:1.000
                     1st Qu.:361.0
                                         1st Qu.:403.0
## Median :1.000
                     Median :433.0
                                        Median :463.0
## Mean :1.119
                     Mean :419.5
                                        Mean
                                               :458.6
## 3rd Qu.:1.000
                     3rd Qu.:490.0
                                         3rd Qu.:526.0
## Max. :3.000
                     Max. :796.0
                                        Max.
                                                :961.0
```

6 2022484408

12175.

8.77

0

```
weight %>% select(WeightKg, WeightPounds, BMI) %>%
 summary()
##
      WeightKg
                   WeightPounds
                                       BMI
## Min. : 53.30 Min. :117.5
                                         :21.45
                                 Min.
## 1st Qu.: 61.70 1st Qu.:136.0 1st Qu.:24.10
                   Median :137.8 Median :24.39
## Median : 62.50
## Mean : 73.44
                   Mean :161.9
                                  Mean :25.73
## 3rd Qu.: 85.80 3rd Qu.:189.2
                                 3rd Qu.:25.76
## Max. :129.60 Max. :285.7 Max.
                                        :46.17
weight %>% select(Id, WeightKg) %>% filter(WeightKg > 95)
            Id WeightKg
                 129.6
## 1 1927972279
## 2 4702921684
                  99.7
weight %>% select(Id, WeightKg, BMI) %>% filter(BMI > 30)
            Id WeightKg BMI
## 1 1927972279 129.6 46.17
## 2 4445114986
                 92.4 35.01
weight %>% select(Id, WeightKg, BMI) %>% filter(BMI >= 25 & BMI < 29.9)
##
             Id WeightKg BMI
## 1 2891001357 88.4 25.03
## 2 4558609924
                   69.4 27.14
## 3 4702921684
                   99.7 26.11
## 4 8253242879
                   75.6 29.55
## 5 8877689391
                85.5 25.61
## 6 8877689391
                  86.6 25.94
                86.0 25.76
## 7 8877689391
## 8 8877689391
                86.3 25.83
## 9 8877689391
                   85.1 25.49
## 10 8877689391
                   85.0 25.44
## 11 8877689391
                   85.4 25.56
## 12 8877689391
                   86.1 25.79
## 13 8877689391
                   85.8 25.68
calories %>% select(Calories) %>% summary()
##
      Calories
## Min. : 42.00
## 1st Qu.: 61.00
## Median : 77.00
## Mean : 94.27
## 3rd Qu.:104.00
## Max. :933.00
```

intensities %>% select(TotalIntensity) %>% summary()

```
## TotalIntensity
## Min. : 0.00
## 1st Qu.: 0.00
## Median : 1.00
## Mean : 10.83
## 3rd Qu.: 14.00
## Max. :180.00
```

Insights from summary:

1. Average Steps: 6547, Average Distance: 4.664, Average Sedentary Minutes: 995.3 min.

- Suggestions: Steps of users should increase, Average steps should be more than 8000. Sedentary min. is 995.3 min. means 16 hours, it should be reduced.
- 2. The majority of the participants are lightly active.
- 3.On average, participants sleep 1 time for 7 hours.
 - Suggestions : Participants takes good amount of sleep, we should consider using notification to go to sleep.
- 4.20 users are normal weight, 13 are overweight and 2 are obese.
 - Suggestions: I recommend is that according to their BMI we should display there weight category in app. And if category is overweight and obese we should notify to control diet and do exercise.

Merging columns

```
combined_data <- merge(sleep, daily_activity, by = 'Id', all = TRUE) %>%
    select(-date.x, -date.y, -SedentaryActiveDistance)
head(combined_data)
```

```
##
                   SleepDay TotalSleepRecords TotalMinutesAsleep TotalTimeInBed
## 1 1503960366 2016-04-12
                                              1
                                                                327
                                                                                346
## 2 1503960366 2016-04-12
                                                                327
                                              1
                                                                                346
## 3 1503960366 2016-04-12
                                              1
                                                                327
                                                                                346
## 4 1503960366 2016-04-12
                                              1
                                                                327
                                                                                346
## 5 1503960366 2016-04-12
                                              1
                                                                327
                                                                                346
## 6 1503960366 2016-04-12
                                              1
                                                                327
                                                                                346
     ActivityDate TotalSteps TotalDistance TrackerDistance
##
## 1
       2016-04-09
                        12432
                                        8.10
                                                         8.10
                                        0.14
                                                         0.14
## 2
       2016-04-12
                          224
## 3
       2016-04-10
                        10057
                                        6.98
                                                         6.98
## 4
       2016-03-26
                        17609
                                       11.55
                                                        11.55
## 5
       2016-04-08
                        12521
                                        7.94
                                                         7.94
## 6
                                        8.53
                                                         8.53
       2016-03-27
                        12736
```

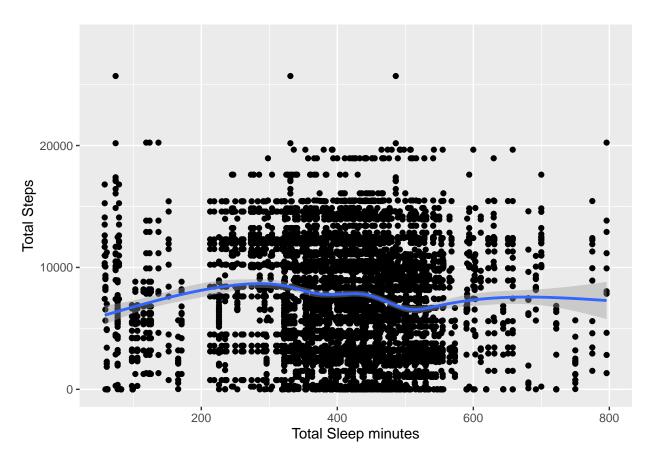
```
{\tt LoggedActivitiesDistance\ VeryActiveDistance\ ModeratelyActiveDistance}
##
## 1
                                                                           0.59
                                                2.59
                                                0.00
                                                                           0.00
## 2
                              0
## 3
                              0
                                                4.00
                                                                           0.49
                              0
                                                6.92
## 4
                                                                           0.73
## 5
                              0
                                                3.31
                                                                           0.90
## 6
                              0
                                                4.66
                                                                           0.16
     LightActiveDistance VeryActiveMinutes FairlyActiveMinutes
##
## 1
                      4.92
                                                                  15
## 2
                      0.13
                                             0
                                                                   0
## 3
                      2.48
                                            44
                                                                  13
## 4
                      3.91
                                            89
                                                                  17
## 5
                      3.74
                                            46
                                                                  22
## 6
                      3.71
                                            56
                                                                   5
##
     LightlyActiveMinutes SedentaryMinutes Calories
## 1
                        248
                                           738
                                                   1883
## 2
                          9
                                           32
                                                      50
## 3
                        168
                                          737
                                                   1755
## 4
                                                   2154
                        274
                                          588
## 5
                        212
                                          1160
                                                   1895
## 6
                        268
                                          605
                                                   1944
```

n_distinct(combined_data\$Id)

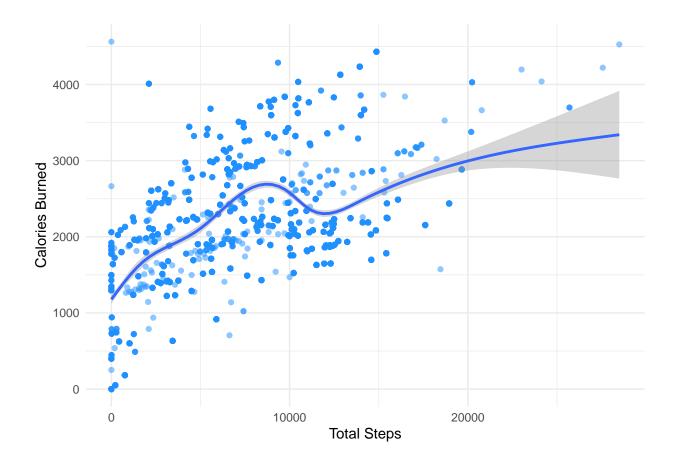
[1] 35

Daily activity and sleep data sets are merged for more detailed analysis. I have used outer join to merge data sets, which will include all participants.

Visualizing Data



- This chart indicates that people who sleep in the 6-7.5 hrs tend to take most steps, on average.
- Most of users sleep between 5-10 hrs and steps between 5000-15000 steps.



• As steps increase, more calories gets burnt.

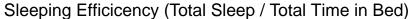
```
sleep_analysis <- combined_data %>% filter(!is.na(TotalTimeInBed)) %>%
  mutate(SleepEfficiency = TotalMinutesAsleep / TotalTimeInBed * 100) %>%
  arrange(Id, ActivityDate) %>% group_by(Id)
sleep_analysis
```

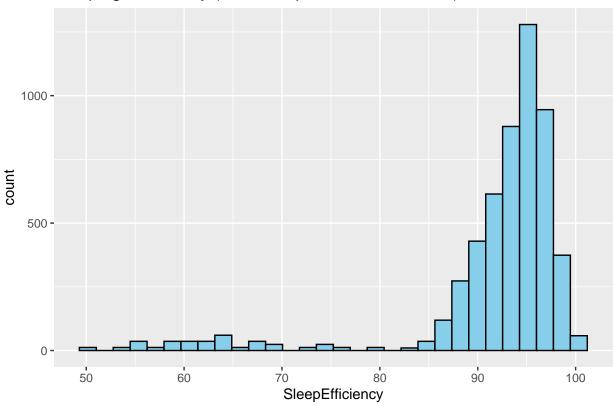
```
## # A tibble: 5,388 x 19
  # Groups:
               Id [24]
##
              Id SleepDay
                                      TotalSleepRecords TotalMinutesAsleep
           <dbl> <dttm>
                                                   <int>
##
                                                                      <int>
##
   1 1503960366 2016-04-12 00:00:00
                                                                        327
    2 1503960366 2016-04-13 00:00:00
                                                       2
                                                                        384
    3 1503960366 2016-04-15 00:00:00
                                                       1
                                                                        412
##
    4 1503960366 2016-04-16 00:00:00
##
                                                                        340
    5 1503960366 2016-04-17 00:00:00
                                                                        700
    6 1503960366 2016-04-19 00:00:00
                                                                        304
##
                                                       1
    7 1503960366 2016-04-20 00:00:00
                                                                        360
    8 1503960366 2016-04-21 00:00:00
                                                                        325
##
                                                       1
    9 1503960366 2016-04-23 00:00:00
                                                                        361
## 10 1503960366 2016-04-24 00:00:00
                                                                        430
## # i 5,378 more rows
## # i 15 more variables: TotalTimeInBed <int>, ActivityDate <dttm>,
       TotalSteps <int>, TotalDistance <dbl>, TrackerDistance <dbl>,
       LoggedActivitiesDistance <dbl>, VeryActiveDistance <dbl>,
## #
```

```
## # ModeratelyActiveDistance <dbl>, LightActiveDistance <dbl>,
## # VeryActiveMinutes <int>, FairlyActiveMinutes <int>,
## # LightlyActiveMinutes <int>, SedentaryMinutes <int>, Calories <int>, ...
```

• Calculating sleep efficiency, arranging through id, date and grouping by Id. filter!is.na() is used keep only rows where TotalTimeinBed column has a number.

Understanding sleep quality of the users.

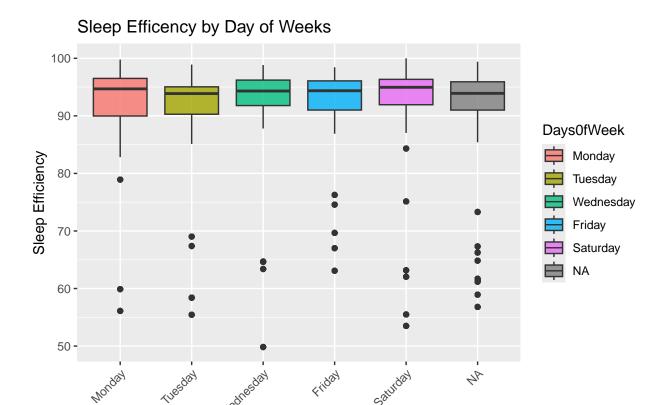




• Overall many users sleep quality is good and had efficient sleep.

new_sleep_analysis <- sleep_analysis %>% mutate(DaysOfWeek = factor(weekdays(SleepDay), levels = c('Mon

A new column, Day of week was added to analyse the participants sleep efficiency across different daysof the week.

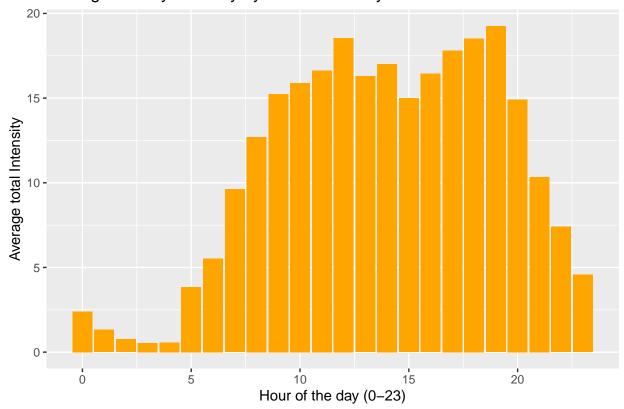


new_intensities <- intensities %>% mutate(HourofDay = as.numeric(format(ActivityHour, "%H")))

A new column, Hour of Day was added to analyse the participants energy intensities across different hours of the day.

Day of the Week





 $\bullet\,$ The visual shows that people are active between 5 a.m. to 11 p.m.

Summary of the Business Case Study.

Analyzing FitBit Fitness Tracker Data, can help BellaBeat to understand the audience and implement market strategy.

Target audience

Women who work full-time jobs and spend a lot of time at the computer, in a meeting, focused on work.

These women do some light activity to stay healthy. Even though they need to improve their everyday activity to have health benefits. They might need some knowledge about developing healthy habits or motivation to keep going.

• As there is no gender information about the participants, I assumed that all genders were presented and balanced in this data set.

Recommendation for the Bellabeat.

- 1. Steps of users should increase, Average steps should be more than 8000, taking 8000 steps per day was associated with a 51% lower risk for all-cause mortality.
- 2. Participants takes good amount of sleep, Bellabeat should consider using notification to go to sleep.
- 3. I recommend is that according to user's BMI Bellabeat should display there weight category in app. And if category is overweight and obese Bellabeat should suggest to control diet and do exercise.

4. Sedentary min. is 995.3 min. means 16 hours, it should be reduced. Bellabeat should set some time for sedentary minutes, so after crossing it app will notify users to reduce their sedentary time.