'Descriptive Analysis of Demographic Data'

Bushra Tariq Kiyani (230204)

2022-11-09

```
library('GGally')
## Loading required package: ggplot2
## Registered S3 method overwritten by 'GGally':
     method from
##
     +.gg
            ggplot2
library('dplyr')
##
## Attaching package: 'dplyr'
  The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library('ggplot2')
library('gridExtra')
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
##
       combine
#Loading the data
census_data <- read.csv('census2001_2021.csv')</pre>
#View the Data
head(census_data)
                            Subregion Region Year Life. Expectancy.. Both. Sexes
     Country.Name
## 1 Afghanistan South-Central Asia
                                        Asia 2001
                                                                         45.81
## 2
     Afghanistan South-Central Asia
                                                                         53.25
## 3
          Albania
                     Southern Europe Europe 2001
                                                                         75.14
## 4
          Albania
                     Southern Europe Europe 2021
                                                                         79.23
## 5
                     Northern Africa Africa 2001
                                                                         72.19
          Algeria
          Algeria
                     Northern Africa Africa 2021
                                                                         77.79
##
    Life.Expectancy..Males Life.Expectancy..Females
## 1
                      44.85
                                                46.83
                      51.73
                                                54.85
## 2
```

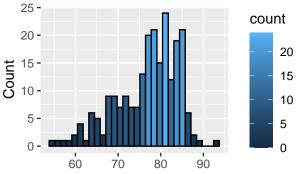
```
## 3
                       72.39
                                                 78.20
## 4
                       76.55
                                                 82.12
## 5
                      71.36
                                                 73.07
## 6
                       76.32
                                                 79.33
##
     Infant.Mortality.Rate..Both.Sexes
## 1
                                 144.77
## 2
                                 106.75
## 3
                                  23.88
## 4
                                  11.10
## 5
                                  39.97
## 6
                                  20.23
citation(package = "gridExtra")
##
## To cite package 'gridExtra' in publications use:
##
##
     Auguie B (2017). _gridExtra: Miscellaneous Functions for "Grid"
     Graphics_. R package version 2.3.
##
##
## A BibTeX entry for LaTeX users is
##
##
     @Manual{,
##
       title = {gridExtra: Miscellaneous Functions for "Grid" Graphics},
##
       author = {Baptiste Auguie},
       year = \{2017\},\
##
##
       note = {R package version 2.3},
##
#Changing Column Names for better readability
colnames(census data) <- c("Country", "Subregion", "Region", "Year",</pre>
                            "Life_exp_both", "Life_exp_male", "Life_exp_female", "Mortality_rate")
#Ordering the Data according Region and Subregion
census_data <- census_data[order(census_data$Region,census_data$Subregion),]</pre>
#Factoring with the Sub regions
census_data$Subregion <- factor(census_data$Subregion,</pre>
                                 levels = unique(census_data$Subregion[order(census_data$Region)]))
head(census_data)
##
                      Subregion Region Year Life_exp_both Life_exp_male
## 65
        Burundi Eastern Africa Africa 2001
                                                     55.06
                                                                    53.02
## 66
        Burundi Eastern Africa Africa 2021
                                                     67.07
                                                                    64.98
## 87
        Comoros Eastern Africa Africa 2001
                                                     60.17
                                                                   58.58
        Comoros Eastern Africa Africa 2021
                                                     66.90
                                                                   64.65
## 111 Djibouti Eastern Africa Africa 2001
                                                     58.21
                                                                   55.97
## 112 Djibouti Eastern Africa Africa 2021
                                                     65.00
                                                                    62.40
##
       Life_exp_female Mortality_rate
## 65
                 57.16
                                 83.17
                                 38.96
## 66
                 69.22
## 87
                 61.81
                                 85.45
## 88
                                 58.21
                 69.21
## 111
                 60.50
                                 69.88
## 112
                 67.67
                                 47.78
```

```
#Check is there any missing values in Data
colSums(is.na(census_data))
##
           Country
                         Subregion
                                             Region
                                                                Year
                                                                       Life_exp_both
##
                                                                   0
                                  0
                                                  0
##
                                    Mortality_rate
     Life_exp_male Life_exp_female
##
#Check the missing value records #Mortality rate
census data[which(is.na(census data$Mortality rate)),]
##
             Country
                            Subregion
                                         Region Year Life_exp_both Life_exp_male
## 235
               Libya Northern Africa
                                         Africa 2001
                                                                NΑ
                                                                               NΑ
## 379
                                         Africa 2001
         South Sudan Northern Africa
                                                                NA
                                                                               NA
                                         Africa 2001
## 385
               Sudan Northern Africa
                                                                NA
                                                                               NA
## 325
         Puerto Rico
                            Caribbean Americas 2001
                                                                NA
                                                                               NA
## 429 United States Northern America Americas 2001
                                                                NA
                                                                               NΑ
## 393
               Syria
                         Western Asia
                                           Asia 2001
                                                                NA
                                                                               NA
##
       Life_exp_female Mortality_rate
## 235
                    NA
## 379
                    NA
                                    NA
## 385
                    NA
                                   NA
## 325
                    NΑ
                                   NΑ
## 429
                    NA
                                    NA
## 393
                    NA
                                    NA
#Split the Data Based on the year
census_data_2021 <- census_data %>% filter(Year == 2021)
census_data_2001 <- census_data %>% filter(Year == 2001)
#Summary of data
census_data_2021
                   %>% summary()
##
      Country
                                     Subregion
                                                                          Year
                                                    Region
##
   Length: 227
                       Caribbean
                                          : 25
                                                 Length: 227
                                                                     Min.
                                                                            :2021
   Class : character
                       Western Asia
                                          : 19
                                                 Class : character
                                                                     1st Qu.:2021
##
   Mode :character
                       Eastern Africa
                                          : 17
                                                 Mode :character
                                                                     Median:2021
##
                       Western Africa
                                          : 17
                                                                     Mean
                                                                            :2021
##
                       Southern Europe
                                          : 16
                                                                     3rd Qu.:2021
                       South-Central Asia: 14
##
                                                                     Max.
                                                                            :2021
                                          :119
##
                       (Other)
##
   Life_exp_both
                    Life_exp_male
                                     Life_exp_female Mortality_rate
##
  Min. :53.25
                    Min. :51.73
                                     Min.
                                          :54.85
                                                     Min. : 1.53
##
   1st Qu.:69.73
                    1st Qu.:67.58
                                     1st Qu.:72.29
                                                     1st Qu.: 6.27
## Median :75.56
                    Median :72.99
                                                     Median: 12.58
                                     Median :78.36
                    Mean
## Mean
         :74.28
                           :71.78
                                     Mean
                                           :76.89
                                                     Mean
                                                           : 20.25
##
   3rd Qu.:79.42
                    3rd Qu.:76.94
                                     3rd Qu.:82.34
                                                     3rd Qu.: 29.48
## Max.
           :89.40
                    Max.
                           :85.55
                                            :93.40
                                                            :106.75
                                     Max.
                                                     Max.
##
#Get the difference between the Life expectancy of female and male
census_data_2001$Life_exp_diff_btw_sexes <- census_data_2001$</pre>
  Life_exp_female - census_data_2001$Life_exp_male
census_data_2021$Life_exp_diff_btw_sexes <- census_data_2021$
 Life_exp_female - census_data_2021$Life_exp_male
```

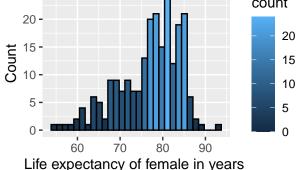
Task 1: Frequency Distributions of Different Variables

```
# Histograms
plot1 <- ggplot(census_data_2021, aes(x = Life_exp_female)) +</pre>
          geom_histogram(aes(fill = ..count..), col = "black")+
          scale x continuous(name = "Life expectancy of female in years ") +
          scale_y_continuous(name = "Count") +
          ggtitle("a) Frequency of life expectancy of female") +
          theme(plot.title = element_text(hjust = 0.5, size = 10, face="bold"),
            axis.text=element text(size=9),
             axis.title=element text(size=11))
plot2 <- ggplot(census_data_2021, aes(x = Life_exp_male)) +</pre>
           geom_histogram(aes(fill = ..count..), col = "black")+
           scale_x_continuous(name = "Life expectancy of male in years ") +
           scale_y_continuous(name = "Count") +
           ggtitle("b) Frequency of life expectancy of male") +
           theme(plot.title = element_text(hjust = 0.5, size = 10, face="bold"),
             axis.text=element_text(size=9),
             axis.title=element_text(size=11))
plot3 <- ggplot(census_data_2021, aes(x = Life_exp_both)) +</pre>
           geom histogram(aes(fill = ..count..), col = "black")+
           scale_x_continuous(name = "Life expectancy of both sexes") +
           scale_y_continuous(name = "Count") +
           ggtitle("c) Frequency of Life expectancy of both sexes") +
           theme(plot.title = element_text(hjust = 0.5, size = 10, face="bold"),
             axis.text=element text(size=9),
             axis.title=element text(size=11))
plot4 <- ggplot(census_data_2021, aes(x = Mortality_rate)) +</pre>
           geom_histogram(aes(fill = ..count..), col = "black")+
           scale_x_continuous(name = "Infant mortality rate") +
           scale_y_continuous(name = "Count") +
           ggtitle("d) Frequency of infant mortality rate") +
           theme(plot.title = element_text(hjust = 0.5, size = 10, face="bold"),
             axis.text=element_text(size=9),
             axis.title=element_text(size=11))
final_plot1 <- grid.arrange(plot1, plot2, plot3, plot4, ncol=2, nrow = 2)</pre>
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```

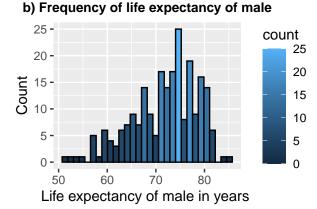
a) Frequency of life expectancy of female

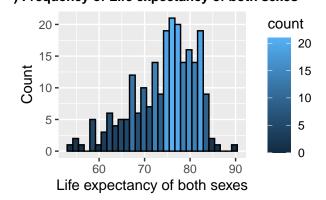


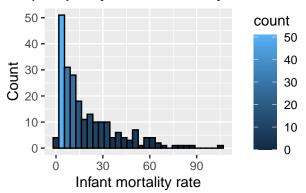
) Frequency of Life expectancy of both sexes



d) Frequency of infant mortality rate







ggsave("histograms.pdf",plot = final_plot1)

TableGrob (2 x 2) "arrange": 4 grobs

name

```
## Saving 6.5 \times 4.5 in image
```

cells

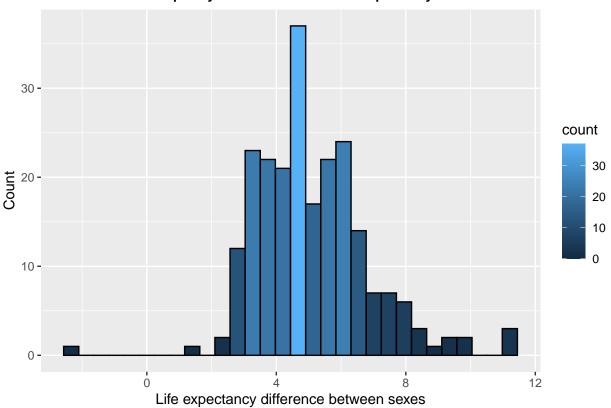
final_plot1

```
## 1 1 (1-1,1-1) arrange gtable[layout]
## 2 2 (1-1,2-2) arrange gtable[layout]
## 3 3 (2-2,1-1) arrange gtable[layout]
## 4 4 (2-2,2-2) arrange gtable[layout]
plot5 <- ggplot(census_data_2021, aes(x = Life_exp_diff_btw_sexes)) +
           geom_histogram(aes(fill = ..count..), col = "black")+
           scale_x_continuous(name = "Life expectancy difference between sexes") +
           scale_y_continuous(name = "Count") +
           ggtitle("Frequency of the diference of life expectancy") +
           theme(plot.title = element_text(hjust = 0.5, size = 10, face="bold"),
             axis.text=element_text(size=9),
             axis.title=element_text(size=11))
final_plot2 <- grid.arrange(plot5, ncol=1, nrow = 1)</pre>
```

`stat bin()` using `bins = 30`. Pick better value with `binwidth`.

grob





```
ggsave("histogram-d.pdf",plot = final_plot2)
## Saving 6.5 x 4.5 in image
final_plot2
## TableGrob (1 x 1) "arrange": 1 grobs
           cells
                    name
                                   grob
## 1 1 (1-1,1-1) arrange gtable[layout]
# Females Life expectancy above 90 (Highest)
females_above90 = census_data_2021[census_data_2021$
                                     Life_exp_female > 90,][c("Country", "Region", "Life_exp_female")]
females_above90
       Country Region Life_exp_female
## 204 Monaco Europe
# Females Life expectancy below 55 (lowest)
females_below55 = census_data_2021[census_data_2021$
                                      Life_exp_female < 55,][c("Country","Life_exp_female")]</pre>
females_below55
##
           Country Life_exp_female
## 114 Afghanistan
# Males Life expectancy above 85 (Highest)
males_above85 = census_data_2021[census_data_2021$
                                   Life_exp_male > 82,][c("Country", "Region", "Life_exp_male")]
```

males_above85

```
Country Region Life_exp_male
## 135 Singapore
                   Asia
                                 83.48
## 204
                                 85.55
          Monaco Europe
# Males Life expectancy below 55 (Lowest)
males_below55 = census_data_2021[census_data_2021$
                                    Life_exp_male < 55,][c("Country","Life_exp_male")]</pre>
males_below55
##
                         Country Life_exp_male
                         Somalia
## 13
                                         53.02
## 20 Central African Republic
                                         53.74
## 114
                    Afghanistan
                                         51.73
# Countries with higher life expectancy of males than females
males h Ex = census data 2021[census data 2021$
                                 Life_exp_diff_btw_sexes < 0,][c("Country","Life_exp_diff_btw_sexes")]</pre>
males h Ex
         Country Life_exp_diff_btw_sexes
## 69 Montserrat
                                    -2.11
# Highest Mortality rate
mortality_h = census_data_2021[census_data_2021$
                                  Mortality_rate > 85,][c("Country", "Mortality_rate")]
mortality_h
##
           Country Mortality_rate
## 13
           Somalia
                            88.03
## 114 Afghanistan
                            106.75
# Lowest Mortality rate
mortality_1 = census_data_2021[census_data_2021$
                                  Mortality_rate < 2,][c("Country", "Region", "Mortality_rate")]</pre>
mortality 1
         Country Region Mortality_rate
## 108
                   Asia
           Japan
                                   1.92
## 135 Singapore
                    Asia
                                   1.56
## 173
        Iceland Europe
                                   1.66
## 196 Slovenia Europe
                                   1.53
## 204
          Monaco Europe
                                   1.78
```

Task 2: Bivariate correlations between the variables

```
## Saving 6.5 x 4.5 in image
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
scat_plot
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
          Life_exp_both
                                      Life_exp_male
                                                                  Life_exp_female
                                                                                                Mortality_rate
20 -
                                                                Corr: 0.993
Africa: 0.996
Americas: 0.97
Asia: 0.987
                                                                                               Corr: -0.905
Africa: -0.85
                                       Corr: 0.993
                                                                                                                      Ę
e
15 -
                                     Americas: 0.978
_ Asia: 0.987
                                                                                            Americas: -0.74
_ Asia: -0.900
                                                                                                                      _exp_both
10 -
                                                                                             Europe: -0.594
Oceania: -0.742
                                      Europe: 0.985
Oceania: 0.991
                                                                 Europe: 0.971
Oceania: 0.990
 5 -
 0
                                                                                            Corr: -0.883
Africa: -0.85
Americas: -0.7
                                                                Corr: 0.971
Africa: 0.985
Americas: 0.908
                                                                                                                      _
_
_
_
_
80 -
                                                                                                                      _exp_male
70 -
                                                                                             Asia: -0.881
Europe: -0.522
Oceania: -0.68
                                                                     Asia: 0.949
                                                                   Europe: 0.916
Oceania: 0.961
60
                                                                                                                      Life
90 -
                                                                                               Corr: -0.913
Africa: -0.84
                                                                                                                      _exp_female
                                                                                            Americas: -0.740
Asia: -0.896
80 -
70 -
                                                                                               Europe: -0.660
60
                                                                                                                      Mortality_rate
90 -
60
30 -
 0 -
                                                     80
        60
               70
                             90
                                                                       70
                                                                                   90
                                                                                                 30
                                                                                                        60
                                                                                                              90
```

Task 3: Analysis of variability within and between subregions.

q3

q1 median

<dbl> <dbl> <dbl> <dbl> <dbl> <

##

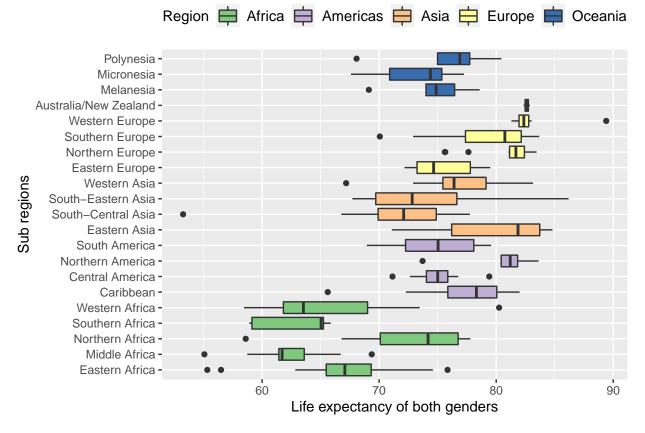
##

Region

<chr>

```
## 1 Africa
              55.1 61.8
                            65.5 69.3 80.2
## 2 Americas 65.6 75.0
                            77.7
                                 79.4 83.6
## 3 Asia
              53.2 71.6
                            75.5 78.2 86.2
              70.1 77.0
                            81.3 82.4 89.4
## 4 Europe
## 5 Oceania
              67.6 74.2
                            75.1 77.3 82.9
census data 2021 %>%
                                                   # Summary by group using dplyr
  group_by(Region) %>%
  dplyr::summarize(min = min(Mortality rate),
            q1 = quantile(Mortality_rate, 0.25),
            median = median(Mortality_rate),
            q3 = quantile(Mortality_rate, 0.75),
           max = max(Mortality_rate))
## # A tibble: 5 x 6
##
     Region
                      q1 median
                                    q3
##
     <chr>>
              <dbl> <dbl>
                          <dbl> <dbl> <dbl>
## 1 Africa
              10.8 29.4
                          42.4 57.3
                                        88.0
## 2 Americas 2.21 8.21
                          11.5
                                15.2
                                        41.3
                          15.6 26.3 107.
## 3 Asia
               1.56
                   7.5
## 4 Europe
              1.53 3.24
                           3.64 5.32
                                       29.5
              3.05 7.96 12.7 20.5
## 5 Oceania
                                        34.4
census_data_2021 %>%
                                                   # Summary by group using dplyr
  group_by(Subregion) %>%
  dplyr::summarize(min = min(Life_exp_both),
            q1 = quantile(Life_exp_both, 0.25),
            median = median(Life_exp_both),
            q3 = quantile(Life_exp_both, 0.75),
            \max = \max(\text{Life exp both}))
## # A tibble: 21 x 6
##
      Subregion
                        min
                               q1 median
                                            q3
                                                 max
##
      <fct>
                       <dbl> <dbl>
                                   <dbl> <dbl> <dbl>
  1 Eastern Africa
                       55.3 65.5
                                     67.1 69.3 75.8
##
   2 Middle Africa
                       55.1
                                     61.7
                                          63.6
                                                69.4
                             61.4
##
   3 Northern Africa
                       58.6
                             70.1
                                     74.2 76.8
                                                77.8
## 4 Southern Africa
                       58.9 59.1
                                     65.0 65.2 65.9
## 5 Western Africa
                       58.4
                             61.8
                                     63.5 69.0
                                                80.2
## 6 Caribbean
                        65.6
                             75.9
                                     78.3 80.0
                                                82
## 7 Central America
                       71.1
                             74.0
                                    75.0 75.9
                                                79.4
## 8 Northern America 73.7 80.4
                                     81.2 81.8 83.6
                        68.9 72.3
## 9 South America
                                     75.0 78.1
                                                79.6
## 10 Eastern Asia
                       71.1 76.2
                                     81.9 83.7 84.8
## # ... with 11 more rows
census_data_2021 %>%
                                                   # Summary by group using dplyr
  group_by(Subregion) %>%
  dplyr::summarize(min = min(Mortality_rate),
            q1 = quantile(Mortality_rate, 0.25),
            median = median(Mortality rate),
            q3 = quantile(Mortality_rate, 0.75),
            max = max(Mortality_rate))
## # A tibble: 21 x 6
      Subregion
                        min
                               q1 median
                                            q3
                                                 max
```

```
##
      <fct>
                       <dbl> <dbl>
                                     <dbl> <dbl> <dbl>
##
    1 Eastern Africa
                       10.8
                             29.4
                                           42.4
                                                  88.0
                                     34.6
                       29.4
##
    2 Middle Africa
                             49.3
                                     60.6
                                           67.0
                                                  84.2
                                                  64.8
    3 Northern Africa 11.5
                             15.2
                                     19.7
                                           31.7
##
##
    4 Southern Africa
                       26.0
                             26.8
                                     30.4
                                           41.2
                                                  50.2
    5 Western Africa
                       19.8
                             38.0
                                     50.7
                                           57.4
##
                                                  74.6
    6 Caribbean
                        3.11 7.84
                                     10.7
                                                  41.3
##
                                           13.0
                                                  26.8
##
    7 Central America
                        8.59 11.6
                                     13.9
                                           18.2
##
    8 Northern America 2.21 4.44
                                      5.22
                                           8.35
                                                   8.9
##
    9 South America
                        6.68 10.5
                                     16.3 22.4
                                                  30.6
## 10 Eastern Asia
                        1.92 2.83
                                      4.36 10.2
                                                  22.4
## # ... with 11 more rows
#Comparing the Life Expectancies of Male in Sub Regions
box_plot1 <- census_data_2021 %>%
  ggplot(aes(x=Subregion, y=Life_exp_both, fill=Region)) +
  geom_boxplot() +
  coord_flip()+ scale_fill_brewer(palette="Accent") +
  theme(legend.position="top",
        axis.text = element_text(vjust = 0.5, size = 9),
        legend.text = element_text(size = 11),
        axis.title=element_text(size=11)
  xlab("Sub regions") + ylab("Life expectancy of both genders")
box_plot1
```



```
ggsave('Boxplot1.pdf', plot = box_plot1)
## Saving 6.5 x 4.5 in image
#Comparing the infant mortality rate in sub regions
box_plot2 <- census_data_2021 %>%
  ggplot(aes(x=Subregion, y=Mortality_rate, fill=Region)) +
  geom_boxplot() + scale_fill_brewer(palette="Accent") +
  coord_flip()+
  theme(legend.position="top",
        axis.text = element_text(vjust = 0.5, size = 9),
        legend.text = element_text(size = 11),
        axis.title=element_text(size=11)
  xlab("Sub regions") + ylab("Infant mortality rate")
box_plot2
                       Region Africa Americas Asia Europe Oceania
              Polynesia -
             Micronesia -
             Melanesia -
   Australia/New Zealand -
        Western Europe -
        Southern Europe -
        Northern Europe -
         Eastern Europe -
           Western Asia -
     South-Eastern Asia -
      South-Central Asia -
           Eastern Asia -
          South America -
       Northern America -
        Central America -
             Caribbean -
          Western Africa -
         Southern Africa -
         Northern Africa -
           Middle Africa -
          Eastern Africa -
                                           30
                                                              60
                                                                                90
                                                 Infant mortality rate
```

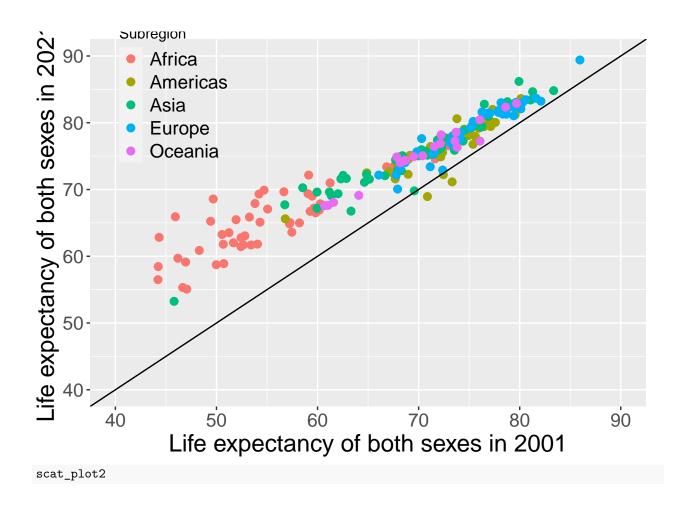
```
## Saving 6.5 x 4.5 in image
```

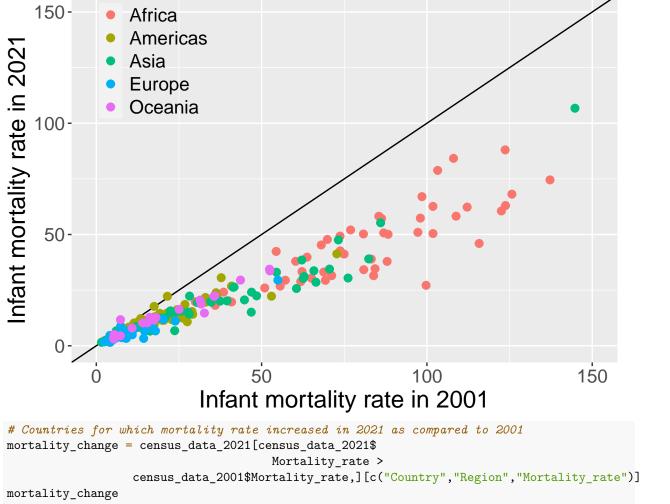
ggsave('Boxplot2.pdf', plot = box_plot2)

Task 4: comparison of 2001 with 2021

```
countries <- census_data[which(is.na(census_data$Mortality_rate)),]$Country
census_data_2001 <- census_data_2001 %>% filter(!Country %in% countries)
census_data_2021 <- census_data_2021 %>% filter(!Country %in% countries)
```

```
scat_plot1 <- ggplot(data = NULL, aes(x = census_data_2001$Life_exp_both,</pre>
                        y = census_data_2021$Life_exp_both,
                        color = census_data_2001$Region)) +
      geom_point(size = 2.5) + guides(colour = guide_legend(title = "Subregion", size = 16)) +
      geom_abline(intercept =0 , slope = 1)+ xlim(40,90)+ylim(40,90) +
      xlab("Life expectancy of both sexes in 2001") + ylab("Life expectancy of both sexes in 2021") +
      theme(plot.title = element_text(hjust = 0.5, size = 12, face="bold"),
          legend.position = c(0.15, 0.85),legend.background = element_rect(fill = "transparent"),
          legend.text = element_text(size = 14),
          axis.text=element text(size=14),
          axis.title=element_text(size=18))
scat_plot2 <- ggplot(data = NULL, aes(x = census_data_2001$Mortality_rate,</pre>
                        y = census_data_2021$Mortality_rate,
                        color = census_data_2001$Region)) + geom_abline(intercept =0 , slope = 1) +
      xlim(0,150)+ylim(0,150) +
      geom_point(size = 2.5) + guides(colour = guide_legend(title = "Subregion", size = 16)) +
      xlab("Infant mortality rate in 2001") + ylab("Infant mortality rate in 2021") +
      theme(plot.title = element_text(hjust = 0.5, size = 24, face="bold"),
          legend.position = c(0.15, 0.85),legend.background = element_rect(fill = "transparent"),
          legend.text = element_text(size = 14),
          axis.text=element_text(size=14),
          axis.title=element_text(size=18))
ggsave("final_plot1.pdf",plot = scat_plot1)
## Saving 6.5 x 4.5 in image
ggsave("final plot2.pdf",plot = scat plot2)
## Saving 6.5 x 4.5 in image
scat plot1
```





```
##
         Country
                   Region Mortality_rate
## 84
          Panama Americas
                                    17.69
## 100 Venezuela Americas
                                    22.23
## 128
        Malaysia
                      Asia
                                     6.70
## 179
         Croatia
                    Europe
                                     8.91
## 184
           Malta
                    Europe
                                     4.62
## 208
            Guam Oceania
                                    11.73
```

Supregion

```
# Countries for which Life expectancy decreased in 2021 as compared to 2001
lifeEx_change = census_data_2021[census_data_2021$
                                   Life_exp_both <
                                   census_data_2001$Life_exp_both,][c("Country", "Region", "Life_exp_both
lifeEx_change
```

Country Region Life_exp_both 71.14 ## 82 Mexico Americas ## 97 68.94 Peru Americas ## 100 Venezuela Americas 72.22