

R Notebook

The following is your first chunk to start with. Remember, you can add chunks using the menu above (Insert -> R) or using the keyboard shortcut Ctrl+Alt+I. A good practice is to use different code chunks to answer different questions. You can delete this comment if you like.

Other useful keyboard shortcuts include Alt- for the assignment operator, and Ctrl+Shift+M for the pipe operator. You can delete these reminders if you don't want them in your report.

```
#setwd("") #Don't forget to set your working directory before you start!

library("tidyverse")

## -- Attaching packages ----- tidyverse 1.
3.0 --

## v ggplot2 3.2.1      v purrr  0.3.3
## v tibble  2.1.3      v dplyr  0.8.3
## v tidyr   1.0.0      v stringr 1.4.0
## v readr   1.3.1      v forcats 0.4.0

## -- Conflicts ----- tidyverse_conflict
s() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()    masks stats::lag()

library("tidymodels")

## Registered S3 method overwritten by 'xts':
##   method      from
##   as.zoo.xts zoo

## -- Attaching packages ----- tidymodels 0.
0.3 --

## v broom      0.5.3      v recipes  0.1.9
## v dials      0.0.4      v rsample   0.0.5
## v infer      0.5.1      v yardstick 0.0.4
## v parsnip    0.0.5

## -- Conflicts ----- tidymodels_conflict
s() --
## x scales::discard() masks purrr::discard()
## x dplyr::filter()   masks stats::filter()
## x recipes::fixed()  masks stringr::fixed()
## x dplyr::lag()       masks stats::lag()
## x dials::margin()   masks ggplot2::margin()
```

```
## x yardstick::spec() masks readr::spec()
## x recipes::step() masks stats::step()
## x recipes::yj_trans() masks scales::yj_trans()

library("plotly")

##
## Attaching package: 'plotly'

## The following object is masked from 'package:ggplot2':
##
## last_plot

## The following object is masked from 'package:stats':
##
## filter

## The following object is masked from 'package:graphics':
##
## layout

library("skimr")

library(gapminder)
dfGap <- gapminder
```

Explore the data Use the skim function on the dfGap dataframe to get summary statistics in a nice format. I suggest you use the widest screen possible for the best reading.

```
#3a
#dfGap
skim(dfGap)
```

Data summary

Name	dfGap
Number of rows	1704
Number of columns	6

Column type frequency:

factor	2
numeric	4

Group variables	None
-----------------	------

Variable type: factor

skim_variable	n_missing	complete_rate	ordered	n_unique	top_counts
---------------	-----------	---------------	---------	----------	------------

country	0	1	FALSE	142	Afg: 12, Alb: 12, Alg: 12, Ang: 12
continent	0	1	FALSE	5	Afr: 624, Asi: 396, Eur: 360, Ame: 300

Variable type: numeric

skim_ variab le	n_mi ssin g	compl ete_rat e	mean	sd	p0	p25	p50	p75	p100	hist
year	0	1	1979. 50	17.27	195 2.00	1965. 75	1979. 50	1993. 25	2007.0	
lifeExp	0	1	59.47	12.92	23.6 0	48.20	60.71	70.85	82.6	
pop	0	1	29601 212.3 2	10615 7896.7 4	600 11.0 0	2793 664.0 0	7023 595.5 0	19585 221.7 5	13186 83096. 0	
gdpPer cap	0	1	7215. 33	9857.4 5	241. 17	1202. 06	3531. 85	9325. 46	11352 3.1	

3)b)Fi
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#3b

##Filter dfGap for the year 2007 and sort it in descending order of life expectancy. Don't forget to use pipes!

##What are the names of the countries with a life expectancy over 81?

```
dfGap3b <- dfGap %>%
  filter(year==2007)%>%
  arrange(desc(lifeExp)) %>%
  filter(lifeExp>81)
dfGap3b
```

```
## # A tibble: 5 x 6
##   country      continent  year lifeExp      pop gdpPerCap
##   <fct>        <fct>    <int>   <dbl>   <int>   <dbl>
```

```
## 1 Japan Asia 2007 82.6 127467972 31656.
## 2 Hong Kong, China Asia 2007 82.2 6980412 39725.
## 3 Iceland Europe 2007 81.8 301931 36181.
## 4 Switzerland Europe 2007 81.7 7554661 37506.
## 5 Australia Oceania 2007 81.2 20434176 34435.
```

#3b)i)

#What are the names of the countries with a life expectancy over 81?

```
dfGap10 <- dfGap3b %>%
  distinct(country)
dfGap10
```

```
## # A tibble: 5 x 1
##   country
##   <fct>
## 1 Japan
## 2 Hong Kong, China
## 3 Iceland
## 4 Switzerland
## 5 Australia
```

c) Add a calculated column totalGDP to dfGap showing the total GDP per country, filter the dataframe for 2007, and sort in descending order for totalGDP. If you like, save the new dataframe as a new one for repeated use. i) What are some names of the countries with the top levels of total GDP?

ii) Which ones of these countries overlap with the countries from 3-b? iii) What if you selected only the two columns country and gdpPerCap and sorted the dataframe in descending order for gdpPerCap? Do you observe more of an overlap now? What do you infer from this difference?

#3)c)

```
dfGap3c <- dfGap %>%
  #group_by(country)%>%
  filter(year==2007)%>%
  mutate(totalGdp=pop*gdpPerCap)%>%
  arrange(desc(totalGdp))
```

```
dfGap3c
```

```
## # A tibble: 142 x 7
##   country continent year lifeExp pop gdpPerCap totalGdp
##   <fct>      <fct>   <int>  <dbl>   <int>   <dbl>   <dbl>
## 1 United States Americas 2007  78.2 301139947 42952. 1.29e13
## 2 China Asia 2007  73.0 1318683096 4959. 6.54e12
## 3 Japan Asia 2007  82.6 127467972 31656. 4.04e12
## 4 India Asia 2007  64.7 1110396331 2452. 2.72e12
## 5 Germany Europe 2007  79.4 82400996 32170. 2.65e12
```

```
## 6 United Kingdom Europe 2007 79.4 60776238 33203. 2.02e12
## 7 France Europe 2007 80.7 61083916 30470. 1.86e12
## 8 Brazil Americas 2007 72.4 190010647 9066. 1.72e12
## 9 Italy Europe 2007 80.5 58147733 28570. 1.66e12
## 10 Mexico Americas 2007 76.2 108700891 11978. 1.30e12
## # ... with 132 more rows
```

i) What are some names of the countries with the top levels of total GDP?

```
#3c)i)
dfGap100 <- dfGap3c %>%
distinct(country)
dfGap100

## # A tibble: 142 x 1
##   country
##   <fct>
## 1 United States
## 2 China
## 3 Japan
## 4 India
## 5 Germany
## 6 United Kingdom
## 7 France
## 8 Brazil
## 9 Italy
## 10 Mexico
## # ... with 132 more rows
```

iii) What if you selected only the two columns country and gdpPercap and sorted the dataframe in descending order for gdpPercap? Do you observe more of an overlap now? What do you infer from this difference?

```
#3)c)iii)

#Countries from descending order of gdpPercap

dfGap4 <- dfGap %>%
  #group_by(country)%>%
  filter(year==2007)%>%
  select(country,gdpPercap)%>%
  arrange(desc(gdpPercap))
dfGap4

## # A tibble: 142 x 2
##   country      gdpPercap
##   <fct>         <dbl>
## 1 Norway      49357.
## 2 Kuwait      47307.
```

```
## 3 Singapore          47143.
## 4 United States      42952.
## 5 Ireland            40676.
## 6 Hong Kong, China   39725.
## 7 Switzerland        37506.
## 8 Netherlands        36798.
## 9 Canada             36319.
## 10 Iceland           36181.
## # ... with 132 more rows
```

3)d) Filter dfGap for 2007, group it by continent, and then calculate the median life expectancy and median total GDP (so you need to have totalGDP already). Remember, you will pipe the filtered and grouped dataframe into summarize() to get the medians. Then, sort it in descending order for the median life expectancy. Before you sort it, don't forget to use ungroup() to ungroup. i) What continent has the highest median of life expectancy? ii) Does it seem to be correlated with the median total GDP?

#3)d)

```
dfGap3d <- dfGap %>%
  group_by(continent)%>%
  filter(year==2007)%>%
  mutate(totalGdp=pop*gdpPercap)%>%
  summarize(medianlife=median(lifeExp, na.rm=TRUE), mediantotalGdp=median(totalGdp, na.rm=TRUE))%>%
  ungroup()# %>%
```

#dfGap3d

```
dfGap3d%>%
  arrange(desc(medianlife))

## # A tibble: 5 x 3
##   continent medianlife mediantotalGdp
##   <fct>         <dbl>         <dbl>
## 1 Oceania       80.7    403657044512.
## 2 Europe        78.6    230988745548.
## 3 Americas      72.9     65203833292.
## 4 Asia          72.4    164029908950.
## 5 Africa        52.9    13755919229.
```

4) Visualize the data a) Now that you have explored the relationship between life expectancy and totalGDP in a table format, let's also visualize it to see a bigger picture. i) Create a scatter plot to understand the relationship between life expectancy (y-axis) and totalGDP (x-axis) in 2007. Does this plot help?

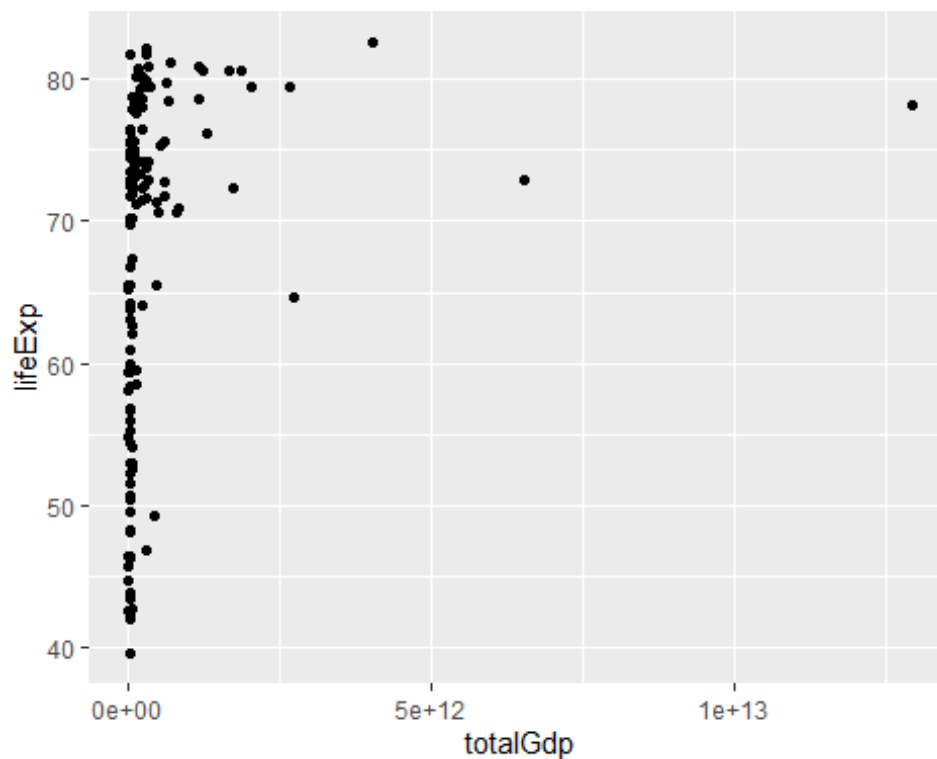
```
#dfGap
#ggplot(data=dfGap3d)+
```

```
# geom_point(mapping=aes(x=lifeExp,y=totalGDP))

#4)a)i)

dfGap4<-dfGap%>%
  filter(year==2007)%>%
  mutate(totalGdp=pop*gdpPercap)

dfGap4 %>%
  ggplot(aes(y = lifeExp, x = totalGdp)) + geom_point()
```



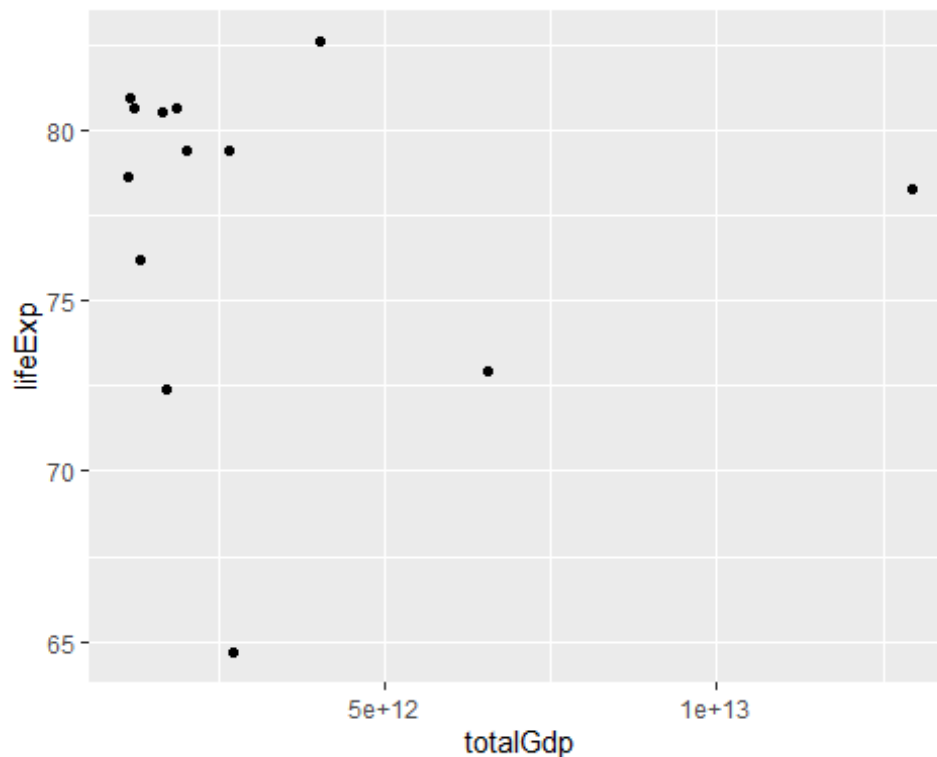
ii) Copy the same code, but this time also filter for countries with a totalGDP of over a billion (use the scientific notation 1e+12). What about now?

```
#4a)ii)
dfGap5<-dfGap%>%
  filter(year==2007)%>%
  mutate(totalGdp=pop*gdpPercap)%>%
  filter(totalGdp>1e+12)
dfGap5

## # A tibble: 13 x 7
##   country      continent  year lifeExp      pop gdpPercap totalGdp
##   <fct>        <fct>    <int>  <dbl>    <int>    <dbl>    <dbl>
## 1 Brazil      Americas  2007   72.4  190010647    9066.  1.72e12
## 2 Canada      Americas  2007   80.7   33390141   36319.  1.21e12
## 3 China       Asia     2007   73.0  1318683096   4959.  6.54e12
```

```
## 4 France Europe 2007 80.7 61083916 30470. 1.86e12
## 5 Germany Europe 2007 79.4 82400996 32170. 2.65e12
## 6 India Asia 2007 64.7 1110396331 2452. 2.72e12
## 7 Italy Europe 2007 80.5 58147733 28570. 1.66e12
## 8 Japan Asia 2007 82.6 127467972 31656. 4.04e12
## 9 Korea, Rep. Asia 2007 78.6 49044790 23348. 1.15e12
## 10 Mexico Americas 2007 76.2 108700891 11978. 1.30e12
## 11 Spain Europe 2007 80.9 40448191 28821. 1.17e12
## 12 United Kingdom Europe 2007 79.4 60776238 33203. 2.02e12
## 13 United States Americas 2007 78.2 301139947 42952. 1.29e13
```

```
dfGap6 <- dfGap5 %>%
  ggplot(aes(y = lifeExp, x = totalGdp))+ geom_point()
#Plot for countries with over 1 billion Total GDP
dfGap6
```



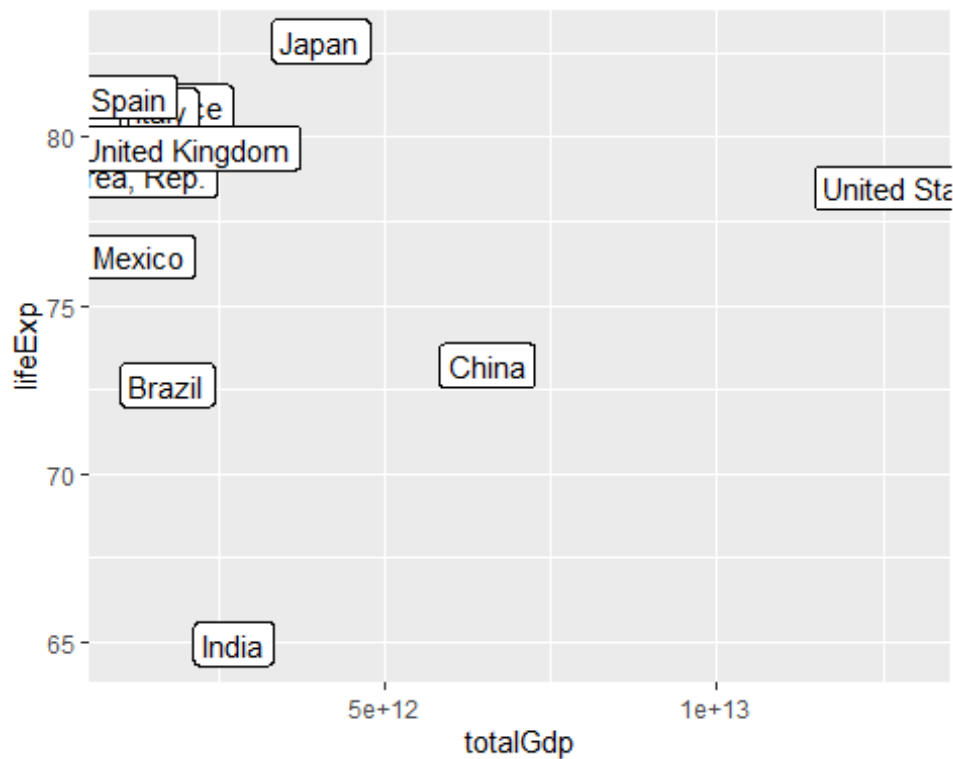
iii) Copy the same code, and add labels this time. Do you see a cluster now? What are the names of the countries that are outside of the cluster?

```
#4a)iii)
```

```
library(ggplot2)
```



```
# 1/ add text with geom_text, use nudge to nudge the text
ggplot(dfGap5, aes(x=totalGdp, y=lifeExp, label=country)) +
  geom_point() + # Show dots
  geom_label(
    aes(label=country),
    #label=rownames(data),
    nudge_x = 0.25, nudge_y = 0.25,
  )
```



```
#check_overlap = T)
```

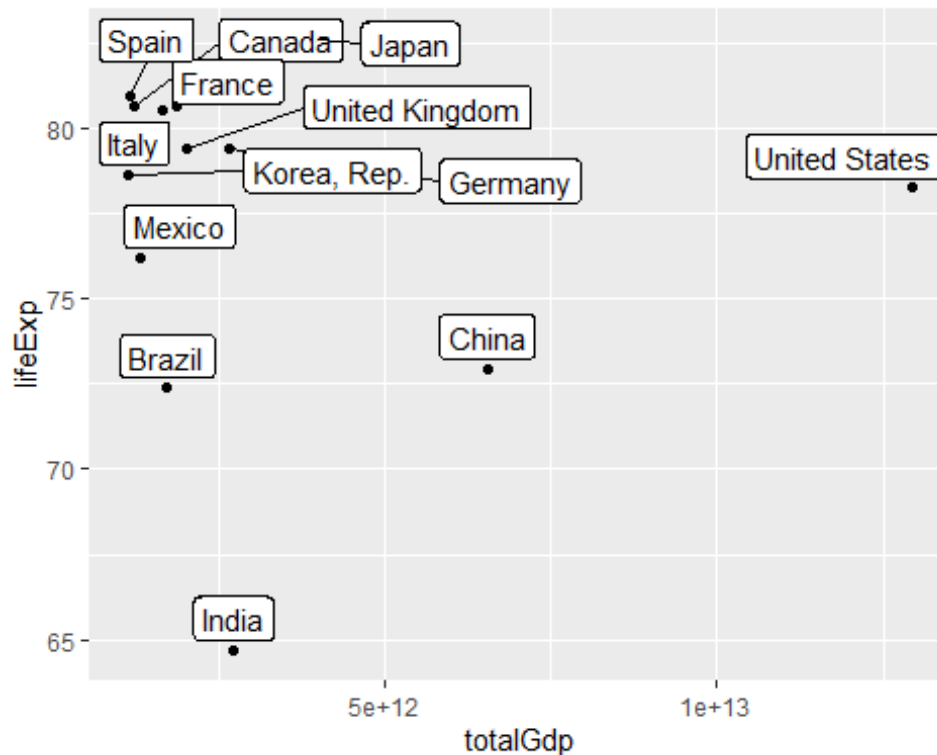
iv) Here is a pro tip. The labels you used in (iii) overlap and hide the points. This causes poor visibility. Install and load the `ggrepel` library. After that, copy the same code and use `geom_label_repel()` function instead of `geom_label()`. Does it look better now? Describe what has changed.

```
#4a)iv)

library(ggrepel)

ggplot(dfGap5, aes(x=totalGdp, y=lifeExp)) +
  geom_point() +
  geom_label_repel(
```

```
nudge_x = 0.25, nudge_y = 0.25,
aes(label=country)
)
```



v) Copy the same code. This time, add a color for the continent. What are the continents that are missing from your visual? Why do you think so?

```
#4a)v)
set.seed(42)

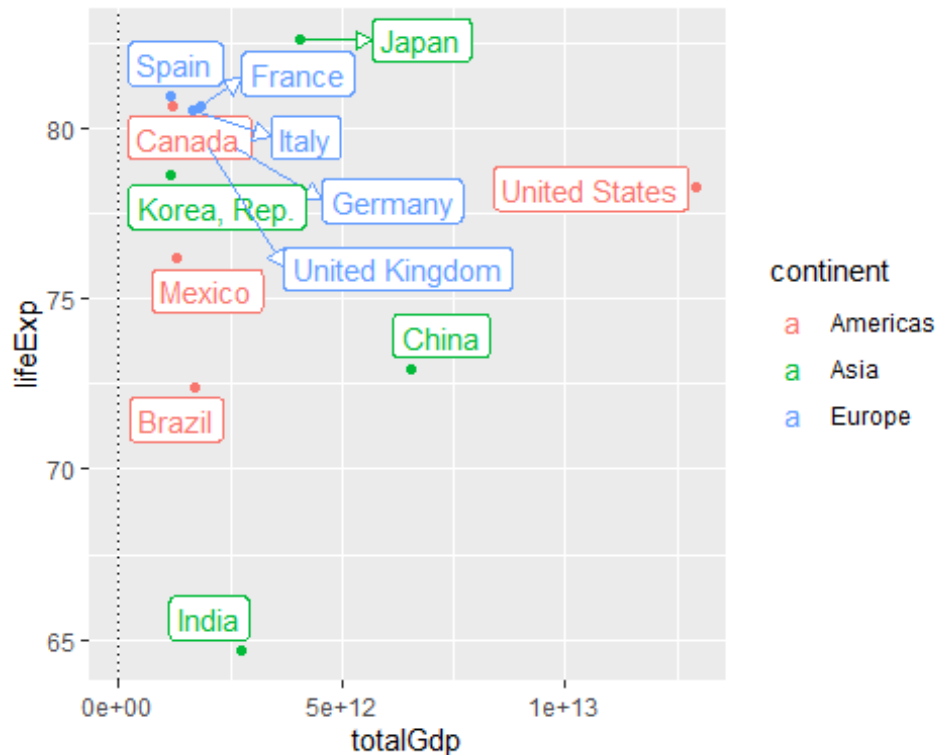
# ALL labels should be to the right of 3.
x_limits <- c(3, NA)

#ggplot(dat, aes(wt, mpg, label = car, color = factor(cyl)))

ggplot(dfGap5, aes(x=totalGdp, y=lifeExp, label=country, color=factor(continent))) +
  geom_vline(xintercept = x_limits, linetype = 3) +
  geom_point() +
  geom_label_repel(
    arrow = arrow(length = unit(0.03, "npc"), type = "closed", ends = "first"
  ),
  force = 10,
  xlim = x_limits
```

```
) +  
scale_color_discrete(name = "continent")
```

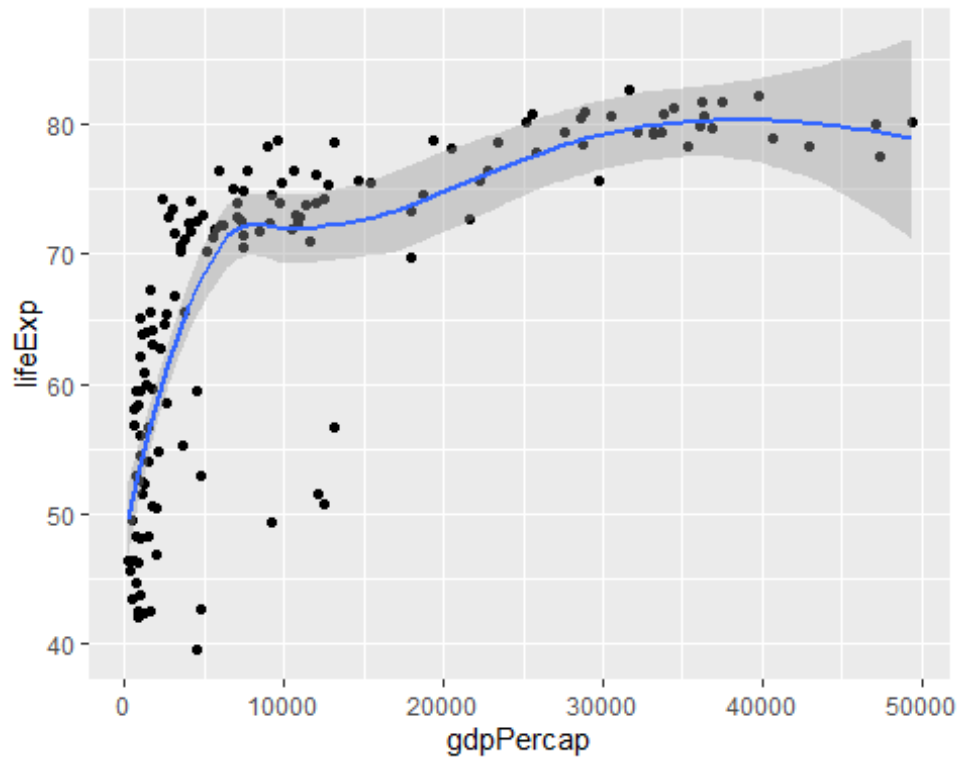
```
## Warning: Removed 1 rows containing missing values (geom_vline).
```



Q4)b) You have an idea about the relationship between life expectancy and totalGDP even though you have not tested it statistically. Now, let's examine a more realistic relationship between life expectancy and gdpPercap (GDP per capita). Plot life expectancy (y-axis) against gdpPercap (x-axis) for 2007, add a smoothed line (no need to define any parameters, use the defaults). What do you observe about the overall relationship? Don't use any labels, just focus on the aggregate.

#4)b)

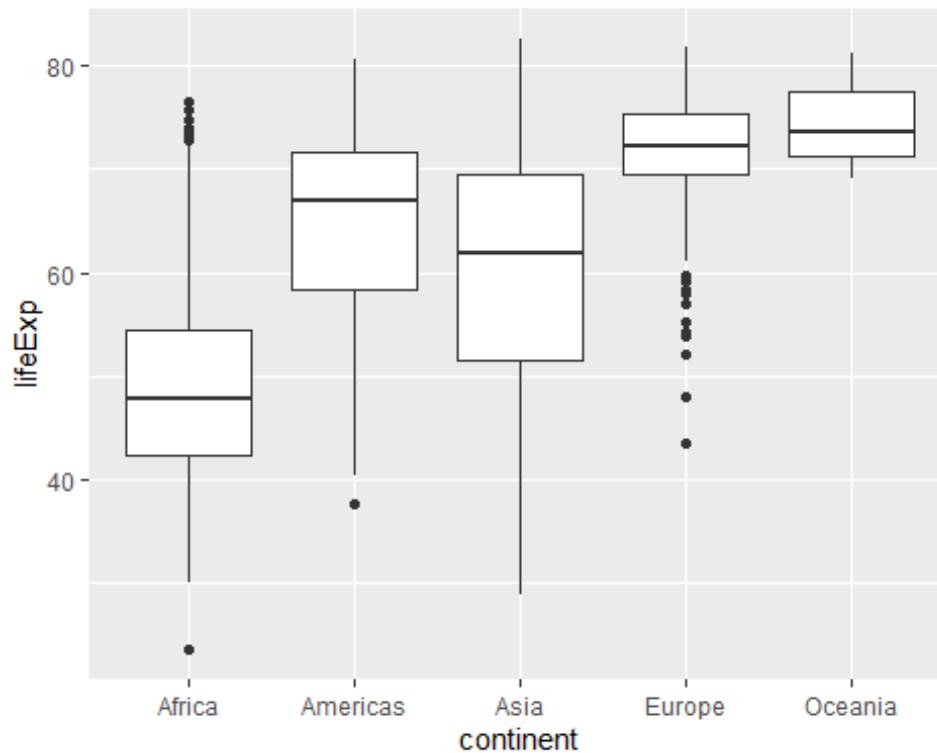
```
dfGap101 <- dfGap %>%  
  filter(year == 2007)  
  
dfGap102 <- dfGap101 %>%  
  ggplot(aes(y = lifeExp, x = gdpPercap)) + geom_point()  
  
dfGap102 + geom_smooth(method = "loess")
```



Q4)c) Now let's find out the variations in life expectancy across different continents. Create box plots for each continent (in the same plot) and add a title this time.

#4)c)

```
boxPlotsForAll <- ggplot(dfGap, aes(x=continent, y=lifeExp)) + geom_boxplot()
boxPlotsForAll
```



```
boxPlotsForAll <- ggplotly(boxPlotsForAll)
```

```
boxPlotsForAll
```

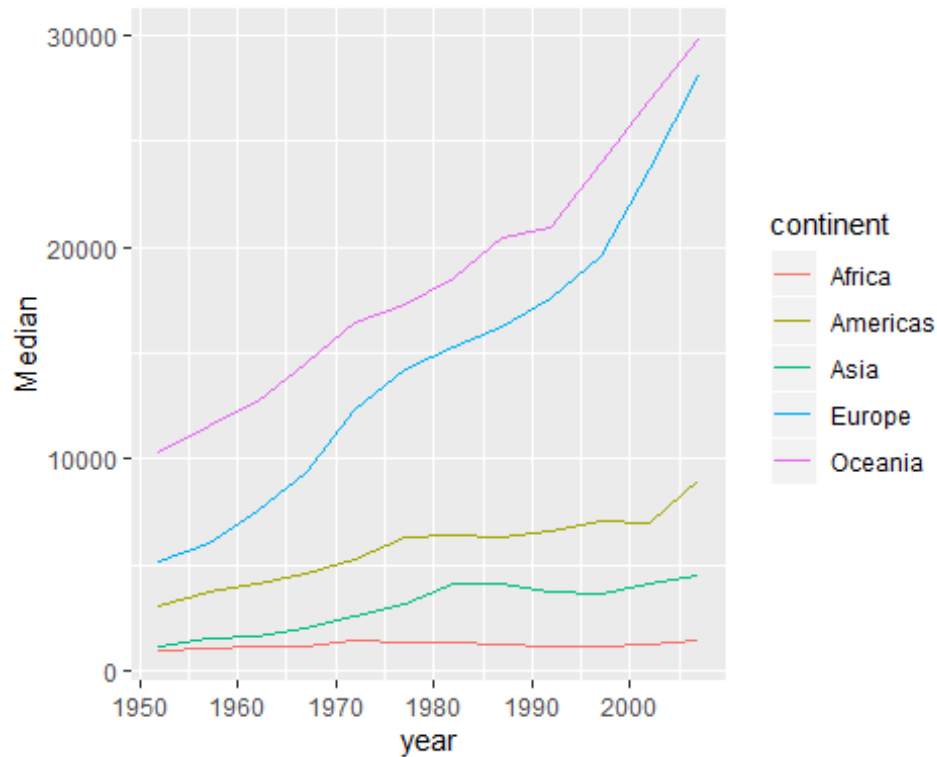
Q4)d) Finally, it is time to create a more advanced (and likely more helpful) plot. Create a line plot to show how median GDP per capita by continent changes over time. [Hint: For the continents, use the color parameter]. Describe what you observe. What continents have a clearer trend than others? Why do you think so?

```
#4)d)i)
df1 <- dfGap%>%
  group_by(continent,year)%>%
  mutate(Median=median(gdpPercap))%>%
  distinct(continent,.keep_all=TRUE)
df1

## # A tibble: 60 x 7
## # Groups:   continent, year [60]
##   country    continent  year lifeExp      pop gdpPercap Median
##   <fct>      <fct>    <int> <dbl>    <int>    <dbl> <dbl>
## 1 Afghanistan Asia      1952  28.8  8425333    779.  1207.
## 2 Afghanistan Asia      1957  30.3  9240934    821.  1548.
## 3 Afghanistan Asia      1962  32.0 10267083    853.  1650.
## 4 Afghanistan Asia      1967  34.0 11537966    836.  2029.
## 5 Afghanistan Asia      1972  36.1 13079460    740.  2571.
## 6 Afghanistan Asia      1977  38.4 14880372    786.  3195.
## 7 Afghanistan Asia      1982  39.9 12881816    978.  4107.
```

```
## 8 Afghanistan Asia      1987      40.8 13867957      852.  4106.
## 9 Afghanistan Asia      1992      41.7 16317921      649.  3726.
## 10 Afghanistan Asia     1997      41.8 22227415      635.  3645.
## # ... with 50 more rows
```

```
df2<-ggplot(df1, aes(x=year,y=Median, color=continent)) + geom_line()
df2
```



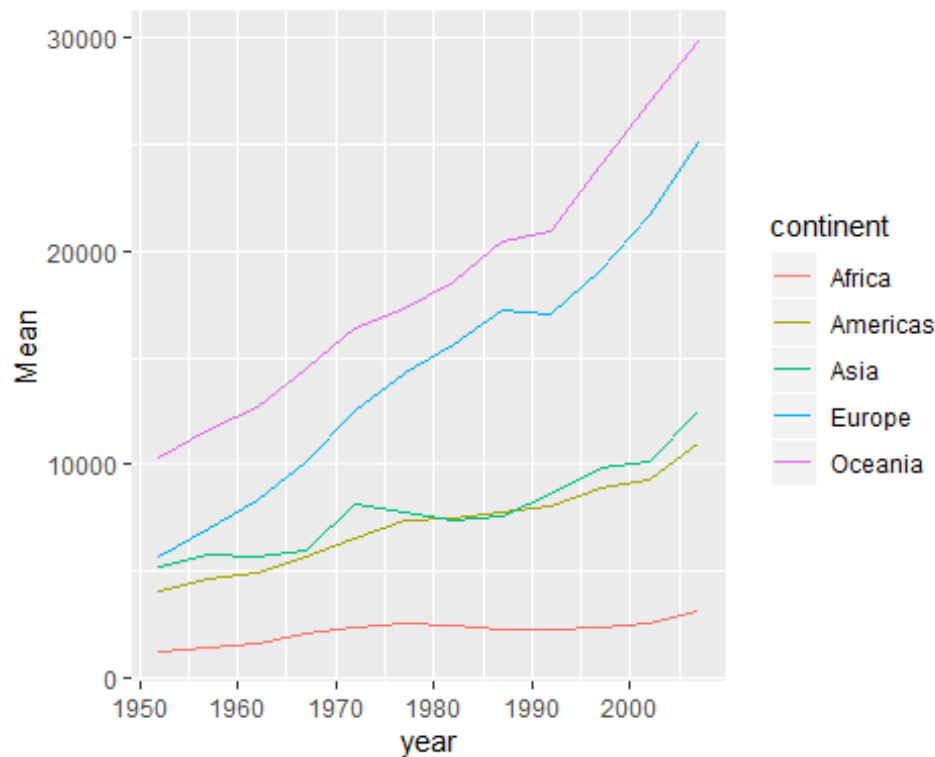
```
ggplotly(df2)
```

Q4)d)ii)Change the summary metric from median to mean. What has changed? Why do you think so?

```
#4)d)ii)
df3 <- dfGap%>%
  group_by(continent,year)%>%
  mutate(Mean=mean(gdpPercap))%>%
  distinct(continent,.keep_all=TRUE)

df4<-ggplot(df3, aes(x=year,y=Mean, color=continent)) + geom_line()

df4
```



```
ggplotly(df4)
```

Q4)iii) Finally, don't you think these plots would be much more useful in plotly? Pick one and save it as `gdpOverTime` and call `ggplotly()` on it. You can now read the actual GDP values per year. What are some of the breakthrough years (steep changes) for GDP in different continents?

```
#4)d)iii)
```

```
df1 <- dfGap%>%
  group_by(continent, year)%>%
  mutate(Median=median(gdpPercap))%>%
  distinct(continent, .keep_all=TRUE)
```

```
df1
```

```
## # A tibble: 60 x 7
## # Groups:   continent, year [60]
##   country    continent  year lifeExp      pop gdpPercap Median
##   <fct>      <fct>    <int> <dbl>    <int>    <dbl> <dbl>
## 1 Afghanistan Asia      1952  28.8  8425333    779.  1207.
## 2 Afghanistan Asia      1957  30.3  9240934    821.  1548.
## 3 Afghanistan Asia      1962  32.0 10267083    853.  1650.
## 4 Afghanistan Asia      1967  34.0 11537966    836.  2029.
## 5 Afghanistan Asia      1972  36.1 13079460    740.  2571.
## 6 Afghanistan Asia      1977  38.4 14880372    786.  3195.
## 7 Afghanistan Asia      1982  39.9 12881816    978.  4107.
```

```
## 8 Afghanistan Asia      1987    40.8 13867957    852.  4106.  
## 9 Afghanistan Asia      1992    41.7 16317921    649.  3726.  
## 10 Afghanistan Asia     1997    41.8 22227415    635.  3645.  
## # ... with 50 more rows  
  
gdpOverTime<-ggplot(df1, aes(x=year,y=Median, color=continent)) + geom_line()  
  
ggplotly(gdpOverTime)
```