Part 2 Code

Carlos Sathler 2/5/2019

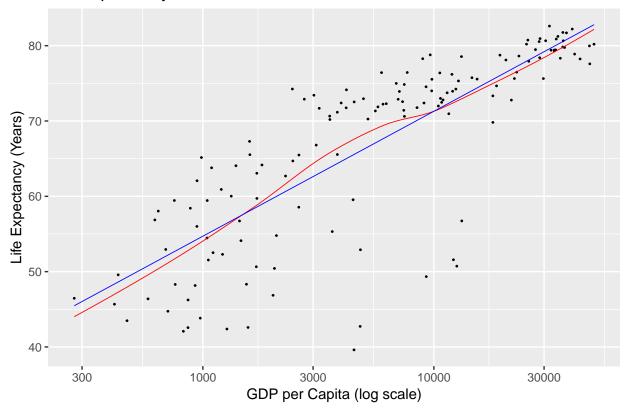
This document is created by Carlos Santhler for Project 1. Please also check for the Rmd file from Li Ai. Both Rmd files are combined to answer the questions in Project 1.

Question 1

```
library(gapminder)
library(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(broom)
library(ggpubr)
## Loading required package: magrittr
library(plyr)
## -----
## You have loaded plyr after dplyr - this is likely to cause problems.
## If you need functions from both plyr and dplyr, please load plyr first, then dplyr:
## library(plyr); library(dplyr)
## Attaching package: 'plyr'
## The following object is masked from 'package:ggpubr':
##
      mutate
## The following objects are masked from 'package:dplyr':
##
##
      arrange, count, desc, failwith, id, mutate, rename, summarise,
      summarize
gapminder$pop = as.double(gapminder$pop)
gapminder$loggdpPercap = log(gapminder$gdpPercap)
gapminder.2007 = gapminder[gapminder$year == 2007,]
```

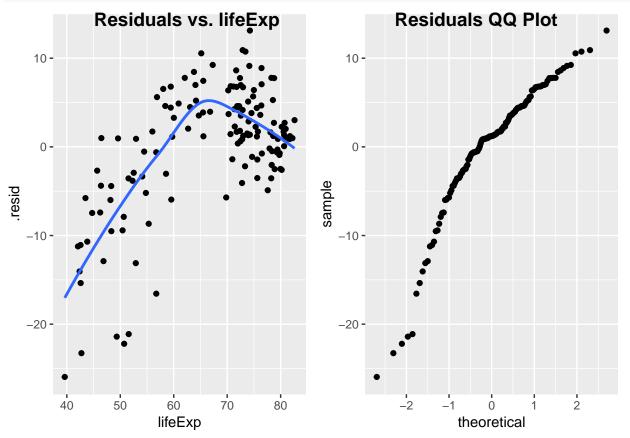
```
gg <- ggplot(gapminder.2007, aes(x=gdpPercap, y=lifeExp)) + geom_point(size=0.3) + scale_x_log10()
gg <- gg + geom_smooth(method="loess", se = F, size=0.3, color = 'red')
gg <- gg + geom_smooth(method="lm", se = F, size=0.3, color = 'blue')
gg <- gg + labs(title = "Life Expectancy in 2007", x = "GDP per Capita (log scale)", y = "Life Expectan
gg</pre>
```

Life Expectancy in 2007



```
ggsave("Q1_1.png", device='pdf')
## Saving 6.5 \times 4.5 in image
lifeExp.lm = lm(lifeExp ~ loggdpPercap, data = gapminder.2007)
summary(lifeExp.lm)
##
## Call:
## lm(formula = lifeExp ~ loggdpPercap, data = gapminder.2007)
##
## Residuals:
       Min
                                ЗQ
##
                1Q Median
                                       Max
                     1.215
## -25.947 -2.661
                             4.469
                                   13.115
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
                         3.8577
                                      1.283
                                               0.202
## (Intercept)
                  4.9496
## loggdpPercap
                             0.4423 16.283
                                              <2e-16 ***
                  7.2028
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
```

```
## Residual standard error: 7.122 on 140 degrees of freedom
## Multiple R-squared: 0.6544, Adjusted R-squared: 0.652
## F-statistic: 265.2 on 1 and 140 DF, p-value: < 2.2e-16
lifeExp.aug = augment(lifeExp.lm)
gg1 = ggplot(lifeExp.aug, aes(x = lifeExp, y = .resid)) + geom_point()
gg1 = gg1 + geom_smooth(method = "loess", se = FALSE)
gg2 = ggplot(lifeExp.lm, aes(sample = .resid)) + stat_qq()
figure <- ggarrange(gg1, gg2, labels = c("Residuals vs. lifeExp", "Residuals QQ Plot"), nrow = 1, ncol
figure</pre>
```

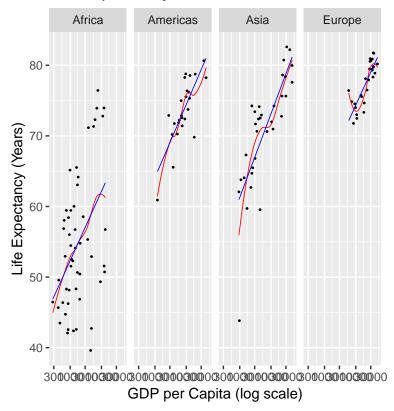


```
ggsave("Q1_2.png", device='pdf')
```

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

```
gapminder.2007.further = gapminder.2007[gapminder.2007$continent!='Oceania',]
gg <- ggplot(gapminder.2007.further, aes(x=gdpPercap, y=lifeExp)) + geom_point(size=0.3) + scale_x_log1
gg <- gg + geom_smooth(method="loess", se = F, size=0.3, color = 'red')
gg <- gg + geom_smooth(method="lm", se = F, size=0.3, color = 'blue')
gg <- gg + labs(title = "Life Expectancy in 2007", x = "GDP per Capita (log scale)", y = "Life Expectancy gg <- gg + facet_wrap(~continent, 1)
gg</pre>
```

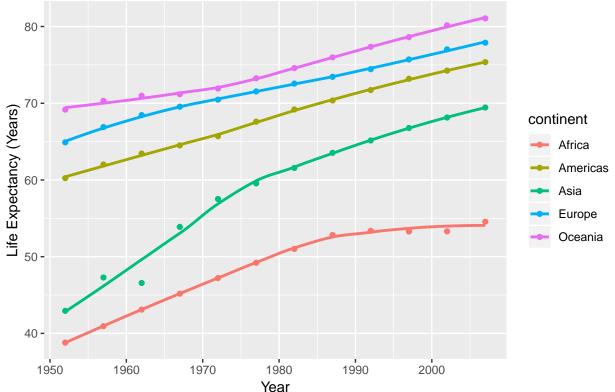
Life Expectancy in 2007



ggsave("Q1_3.png", device='pdf')

Saving 4 x 4.5 in image

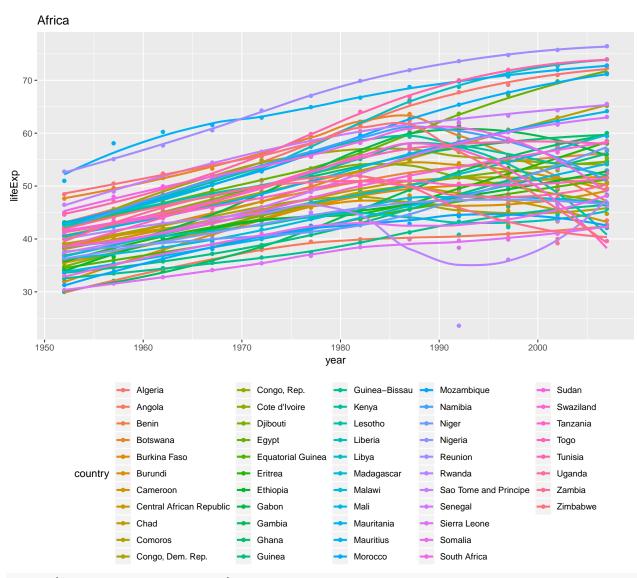
```
Question 2
# calculate lifeExp weighted average by continent
gapminder$lifeExp_w = gapminder$lifeExp * gapminder$pop
gapminder.continent.pop = aggregate(pop ~ continent+year, sum, data=gapminder)
names(gapminder.continent.pop) = c('continent', 'year', 'total_pop')
gapminder.continent.lifeExp = join(gapminder, gapminder.continent.pop)
## Joining by: continent, year
gapminder.continent.lifeExp$weighted_lifeExp = gapminder.continent.lifeExp$lifeExp_w /
                                               gapminder.continent.lifeExp$total_pop
gapminder.lifeExp.continent.year = aggregate(weighted_lifeExp ~ continent+year, sum,
                                             data=gapminder.continent.lifeExp)
gg = ggplot(gapminder.lifeExp.continent.year, aes(x = year, y = weighted_lifeExp, color=continent))
gg = gg + geom_point() + geom_smooth(method = "loess", se = F)
gg = gg + labs(title = "Life Expectancy over Time", x = "Year", y = "Life Expectancy (Years)")
gg
      Life Expectancy over Time
   80 -
                                                                            continent
```



```
ggsave("Q1_4.png", device='pdf')
```

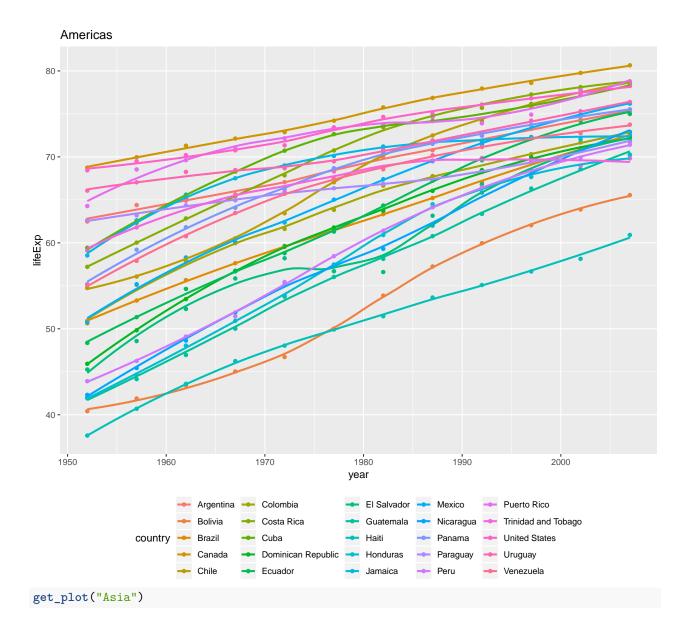
```
## Saving 6.5 x 4.5 in image
get_plot = function(continent) {
   cont.countries = as.character(unique(gapminder[gapminder$continent==continent,][,1])$country)
   gg = ggplot(subset(gapminder, country %in% cont.countries), aes(x = year, y = lifeExp, color=count
   gg = gg + geom_point() + geom_smooth(method = "loess", se = F)
   gg = gg + theme(legend.position="bottom",
```

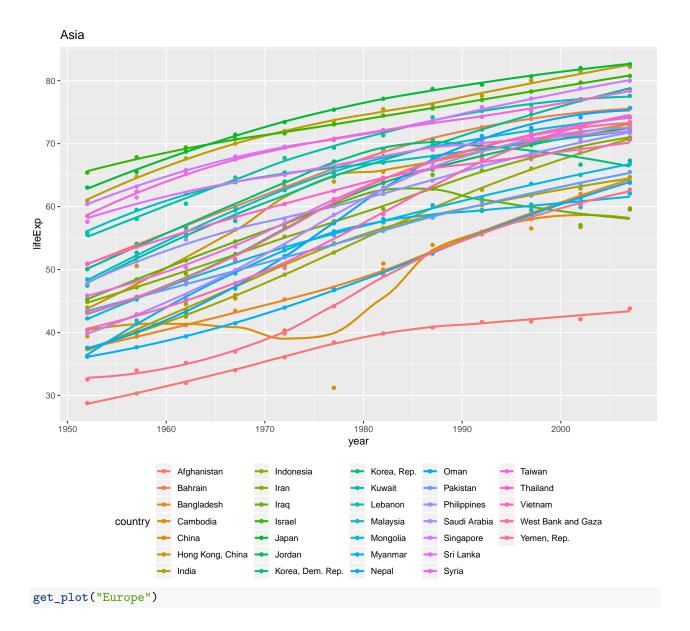
```
plot.margin = margin(0,0,0,0, "cm"))
return(gg)
}
get_plot("Africa")
```

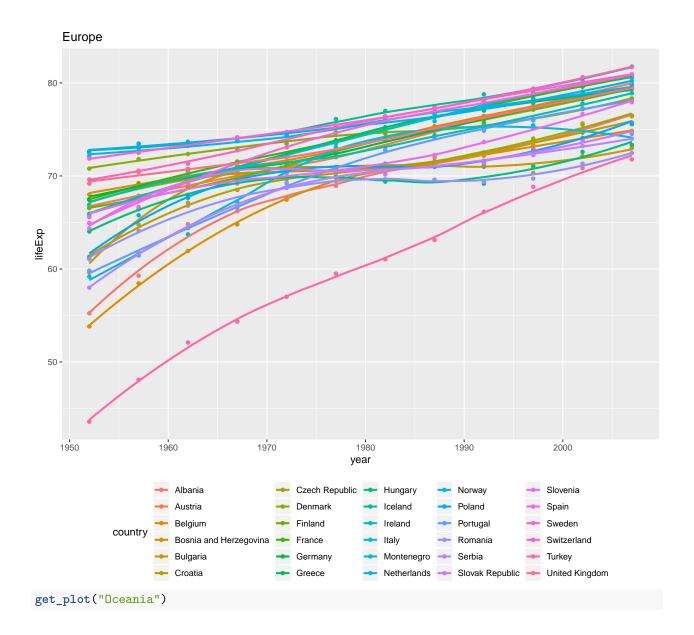


ggsave("Q1_5.png", device='pdf')

Saving 9 x 8 in image
get_plot("Americas")







78 -IifeExp 42 - 42 72 -69 -1950 1960 1970 1980 1990 2000 year country - Australia - New Zealand cont.countries = c('Zimbabwe', 'Rwanda', 'Somalia', 'Egypt') gg = ggplot(subset(gapminder, country %in% cont.countries), aes(x = year, y = lifeExp, color=country

Oceania

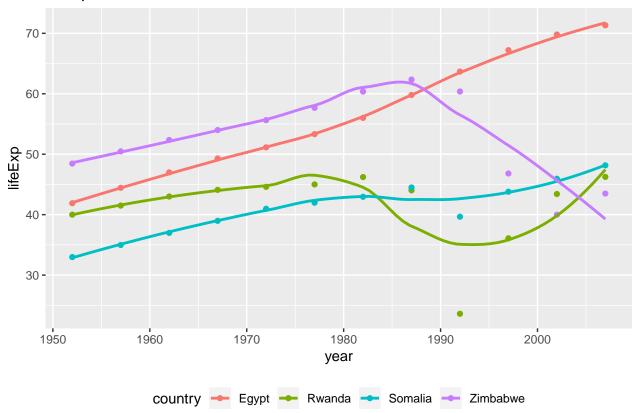
81 -

gg

gg = gg + geom_point() + geom_smooth(method = "loess", se = F)

gg = gg + theme(legend.position="bottom", plot.margin = margin(0,0,0,0, "cm"))

Sample Countries from Africa



```
ggsave("Q1_6.png", device='pdf')
## Saving 6.5 x 4.5 in image
```

```
cont.countries = c('Cambodia','Iraq','Korea, Dem. Rep.', 'Montenegro','El Salvador')

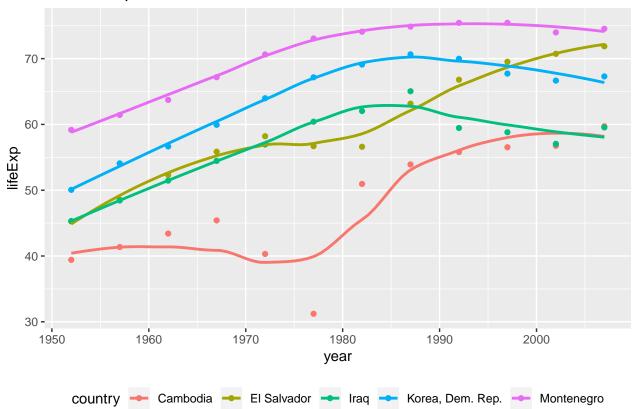
gg = ggplot(subset(gapminder, country %in% cont.countries), aes(x = year, y = lifeExp, color=country

gg = gg + geom_point() + geom_smooth(method = "loess", se = F)

gg = gg + theme(legend.position="bottom", plot.margin = margin(0,0,0,0, "cm"))

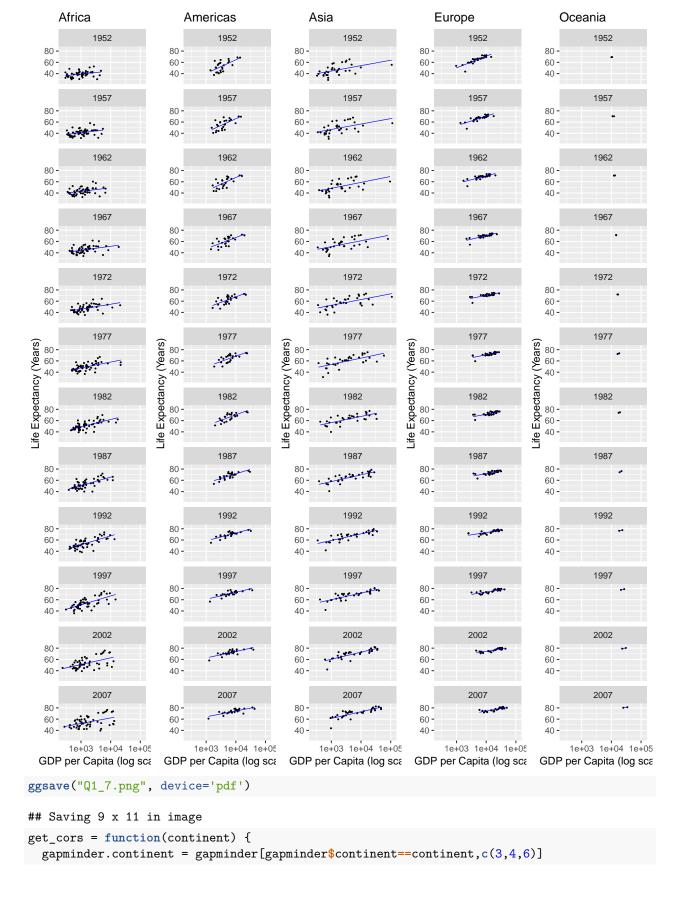
gg
```

Other Unique Countries



Question 3

```
get_plot = function(continent, nrows=3) {
  \#gg = ggplot(subset(gapminder.lifeExp.country.year, country %in% cont.countries), aes(x = year, y = l)
  #gg = gg + geom_point() + geom_smooth(method = "loess", se = F)
  \#gg = gg + theme(legend.position = "bottom", plot.margin = margin(0,0,0,0, "cm"))
  cont.countries = as.character(unique(gapminder[gapminder$continent==continent,][,1])$country)
  gg <- ggplot(subset(gapminder, country %in% cont.countries), aes(x=gdpPercap, y=lifeExp))
  gg <- gg + geom_point(size=0.3) + scale_x_log10(limits=c(240, 114000)) + ylim(25, 85)
  gg <- gg + geom_smooth(method="lm", se = F, size=0.3, color = 'blue')
  gg <- gg + labs(title = continent, x = "GDP per Capita (log scale)", y = "Life Expectancy (Years)")
 gg <- gg + facet_wrap(~year, nrows)</pre>
 return(gg)
gg1 = get_plot("Africa",12)
gg2 = get plot("Americas",12)
gg3 = get_plot("Asia",12)
gg4 = get_plot("Europe",12)
gg5 = get_plot("Oceania",12)
figure <- ggarrange(gg1, gg2, gg3, gg4, gg5, nrow = 1, ncol = 5)
## Warning: Removed 1 rows containing non-finite values (stat_smooth).
## Warning: Removed 1 rows containing missing values (geom_point).
figure
```



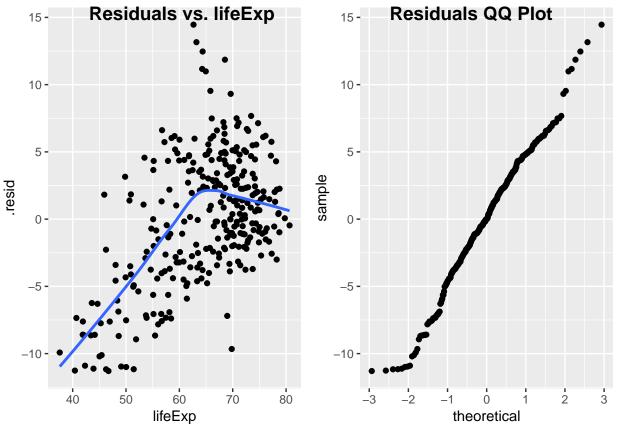
```
print(paste(continent, 'Correlation Matrix:', sep=' '))
  x = cor(gapminder.continent)
  print(x)
}
cor_Africa = get_cors('Africa')
## [1] "Africa Correlation Matrix:"
##
                 year
                        lifeExp gdpPercap
## year
            1.0000000 0.5465842 0.1600793
## lifeExp 0.5465842 1.0000000 0.4256076
## gdpPercap 0.1600793 0.4256076 1.0000000
cor_Americas = get_cors('Americas')
## [1] "Americas Correlation Matrix:"
##
                  year
                        lifeExp gdpPercap
             1.0000000 0.6801813 0.3063167
## year
## lifeExp 0.6801813 1.0000000 0.5583655
## gdpPercap 0.3063167 0.5583655 1.0000000
cor_Asia = get_cors('Asia')
## [1] "Asia Correlation Matrix:"
##
                  year
                        lifeExp gdpPercap
             1.0000000 0.6600265 0.1372517
## year
## lifeExp 0.6600265 1.0000000 0.3820476
## gdpPercap 0.1372517 0.3820476 1.0000000
cor_Europe = get_cors('Europe')
## [1] "Europe Correlation Matrix:"
##
                  year lifeExp gdpPercap
## year
             1.0000000 0.7060212 0.6087531
## lifeExp
           0.7060212 1.0000000 0.7807831
## gdpPercap 0.6087531 0.7807831 1.0000000
cor_Oceania = get_cors('Oceania')
## [1] "Oceania Correlation Matrix:"
##
                  year lifeExp gdpPercap
             1.0000000 0.9767640 0.9255503
## year
## lifeExp 0.9767640 1.0000000 0.9564738
## gdpPercap 0.9255503 0.9564738 1.0000000
# get correlation for all continents
print('All Continents')
## [1] "All Continents"
cor_All = cor(gapminder[,c(3,4,6)])
print(cor_All)
##
                  year lifeExp gdpPercap
             1.0000000 0.4356112 0.2273181
## year
## lifeExp 0.4356112 1.0000000 0.5837062
## gdpPercap 0.2273181 0.5837062 1.0000000
```

```
# qather correlation between lifeExp and year, and lifeExp and qdpPercap, for each continent
correlations = rbind(cor_Africa[2,c(1,3)], cor_Americas[2,c(1,3)], cor_Asia[2,c(1,3)],
                     cor Europe [2,c(1,3)], cor Oceania [2,c(1,3)], cor All [2,c(1,3)])
# gather corrleation between year and gdpPercap, for each continent
correlations2 = rbind(cor_Africa[1,3], cor_Americas[1,3], cor_Asia[1,3], cor_Europe[1,3],
                      cor_Oceania[1,3], cor_All[1,3])
correlations = cbind(correlations, correlations2)
correlations = data.frame(correlations)
correlations = cbind(correlations, c('Africa', 'Americas', 'Asia', 'Europe', 'Oceania', 'All Continents'))
names(correlations) = c('lifeExp_year','lifeExp_gdpPercap','year_gdpPercap','continent')
correlations = correlations[,c(4,1,2,3)]
correlations
##
          continent lifeExp_year lifeExp_gdpPercap year_gdpPercap
## 1
                       0.5465842
                                         0.4256076
                                                        0.1600793
             Africa
## 2
           Americas
                       0.6801813
                                         0.5583655
                                                        0.3063167
## 3
                       0.6600265
                                                        0.1372517
               Asia
                                         0.3820476
## 4
             Europe
                       0.7060212
                                         0.7807831
                                                        0.6087531
## 5
            Oceania
                       0.9767640
                                         0.9564738
                                                        0.9255503
## 6 All Continents
                       0.4356112
                                         0.5837062
                                                        0.2273181
cont = 'Africa'
print(cont)
## [1] "Africa"
summary(lm(lifeExp ~ loggdpPercap+year+I(year^2), data=subset(gapminder, continent==cont)))
## Call:
## lm(formula = lifeExp ~ loggdpPercap + year + I(year^2), data = subset(gapminder,
       continent == cont))
##
## Residuals:
       Min
                  1Q
                      Median
                                    3Q
                                            Max
## -25.8905 -3.7923 -0.0136
                                3.6544 14.9709
##
## Coefficients:
                  Estimate Std. Error t value Pr(>|t|)
## (Intercept) -1.639e+04 3.816e+03 -4.295 2.03e-05 ***
## loggdpPercap 4.753e+00 3.033e-01 15.670 < 2e-16 ***
## year
                 1.633e+01 3.856e+00
                                        4.234 2.64e-05 ***
## I(year^2)
                -4.061e-03 9.738e-04 -4.170 3.48e-05 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 6.397 on 620 degrees of freedom
## Multiple R-squared: 0.5136, Adjusted R-squared: 0.5113
## F-statistic: 218.3 on 3 and 620 DF, p-value: < 2.2e-16
cont = 'Americas'
print(cont)
## [1] "Americas"
summary(lm(lifeExp ~ loggdpPercap+I(loggdpPercap^2)+year, data=subset(gapminder, continent==cont)))
```

```
##
## Call:
## lm(formula = lifeExp ~ loggdpPercap + I(loggdpPercap^2) + year,
       data = subset(gapminder, continent == cont))
## Residuals:
                     Median
                  10
                                    30
## -11.2954 -3.1572 -0.0011
                               3.5209 14.4587
##
## Coefficients:
##
                       Estimate Std. Error t value Pr(>|t|)
                                  45.88192 -14.247 < 2e-16 ***
## (Intercept)
                     -653.66771
                       38.90398
                                            5.300 2.27e-07 ***
## loggdpPercap
                                   7.34017
## I(loggdpPercap^2)
                       -1.80122
                                   0.41763 -4.313 2.20e-05 ***
                        0.26152
                                   0.01761 14.854 < 2e-16 ***
## year
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 4.905 on 296 degrees of freedom
## Multiple R-squared: 0.7273, Adjusted R-squared: 0.7245
## F-statistic: 263.1 on 3 and 296 DF, p-value: < 2.2e-16
cont = 'Asia'
print(cont)
## [1] "Asia"
summary(lm(lifeExp ~ loggdpPercap+year, data=subset(gapminder, continent==cont)))
##
## Call:
## lm(formula = lifeExp ~ loggdpPercap + year, data = subset(gapminder,
##
       continent == cont))
##
## Residuals:
##
       Min
                  1Q
                      Median
                                    3Q
                                            Max
## -19.7152 -3.9880
                       0.0174
                               4.3554 14.2066
##
## Coefficients:
                  Estimate Std. Error t value Pr(>|t|)
               -642.21972
                            39.76532 -16.15
## (Intercept)
                                                <2e-16 ***
                                        17.88
## loggdpPercap
                   4.82259
                              0.26975
                                                <2e-16 ***
                   0.33511
                              0.02042
                                       16.41
                                                <2e-16 ***
## year
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 6.636 on 393 degrees of freedom
## Multiple R-squared: 0.6888, Adjusted R-squared: 0.6872
## F-statistic: 434.8 on 2 and 393 DF, p-value: < 2.2e-16
cont = 'Europe'
print(cont)
## [1] "Europe"
summary(lm(lifeExp ~ loggdpPercap+year, data=subset(gapminder, continent==cont)))
```

```
##
## Call:
## lm(formula = lifeExp ~ loggdpPercap + year, data = subset(gapminder,
      continent == cont))
## Residuals:
                     Median
       Min
                 10
                                   30
                                           Max
## -16.8827 -1.2324 -0.0545
                                        6.4445
                               1.3309
##
## Coefficients:
                 Estimate Std. Error t value Pr(>|t|)
## (Intercept) -1.720e+02 1.730e+01 -9.941
                                               <2e-16 ***
## loggdpPercap 4.940e+00 2.189e-01 22.566
                                               <2e-16 ***
                9.988e-02 9.299e-03 10.741
                                               <2e-16 ***
## year
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 2.477 on 357 degrees of freedom
## Multiple R-squared: 0.7933, Adjusted R-squared: 0.7921
## F-statistic: 685.1 on 2 and 357 DF, p-value: < 2.2e-16
cont = 'Oceania'
print(cont)
## [1] "Oceania"
summary(lm(lifeExp ~ year, data=subset(gapminder, continent==cont)))
##
## Call:
## lm(formula = lifeExp ~ year, data = subset(gapminder, continent ==
      cont))
##
## Residuals:
       Min
                 1Q
                      Median
                                           Max
## -1.58325 -0.60451 0.07398 0.62027 1.31266
##
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -3.419e+02 1.947e+01 -17.56 1.99e-14 ***
               2.103e-01 9.836e-03
                                     21.38 3.30e-16 ***
## year
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.8317 on 22 degrees of freedom
## Multiple R-squared: 0.9541, Adjusted R-squared: 0.952
## F-statistic: 457 on 1 and 22 DF, p-value: 3.299e-16
cont = 'All Continents'
summary(lm(lifeExp ~ loggdpPercap+I(loggdpPercap^2)+year+I(year^2), data=gapminder))
##
## Call:
## lm(formula = lifeExp ~ loggdpPercap + I(loggdpPercap^2) + year +
##
      I(year^2), data = gapminder)
##
```

```
## Residuals:
##
      Min
               1Q Median
                               30
                                      Max
  -27.688 -3.604
                    1.007
                            4.306
                                  18.379
##
## Coefficients:
##
                      Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                    -6.359e+03 2.453e+03 -2.593
                                                    0.0096 **
## loggdpPercap
                     1.829e+01 1.746e+00 10.476 < 2e-16 ***
## I(loggdpPercap^2) -6.413e-01 1.059e-01
                                           -6.054 1.73e-09 ***
## year
                     6.177e+00
                                2.478e+00
                                            2.492
                                                    0.0128 *
## I(year^2)
                    -1.509e-03 6.260e-04 -2.410
                                                    0.0160 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 6.793 on 1699 degrees of freedom
## Multiple R-squared: 0.7241, Adjusted R-squared: 0.7234
## F-statistic: 1115 on 4 and 1699 DF, p-value: < 2.2e-16
lifeExp.lm = lm(lifeExp ~ loggdpPercap+I(loggdpPercap^2)+year, data=subset(gapminder, continent=='Ameri
lifeExp.aug = augment(lifeExp.lm)
gg1 = ggplot(lifeExp.aug, aes(x = lifeExp, y = .resid)) + geom_point()
gg1 = gg1 + geom_smooth(method = "loess", se = FALSE)
gg2 = ggplot(lifeExp.lm, aes(sample = .resid)) + stat_qq()
figure <- ggarrange(gg1, gg2, labels = c("Residuals vs. lifeExp", "Residuals QQ Plot"), nrow = 1, ncol
figure
```



```
ggsave("Q1_8.png", device='pdf')
```

Saving 6.5 x 4.5 in image