

Appendix

```
# Read in dataset
lifeExpec = read.csv("Life Expectancy Data.csv",header = TRUE)

# Observe dataset in general
dim(lifeExpec)

## [1] 2938    22

str(lifeExpec)

## 'data.frame':    2938 obs. of  22 variables:
##  $ Country      : chr  "Afghanistan" "Afghanistan" "Afghanistan" "Afghanistan" ...
##  $ Year          : int   2015 2014 2013 2012 2011 2010 2009 2008 2007 2006 ...
##  $ Status        : chr  "Developing" "Developing" "Developing" "Developing" ...
##  $ Life.expectancy : num   65 59.9 59.9 59.5 59.2 58.8 58.6 58.1 57.5 57.3 ...
##  $ Adult.Mortality : int  263 271 268 272 275 279 281 287 295 295 ...
##  $ infant.deaths   : int   62 64 66 69 71 74 77 80 82 84 ...
##  $ Alcohol         : num   0.01 0.01 0.01 0.01 0.01 0.01 0.01 0.03 0.02 0.03 ...
##  $ percentage.expenditure : num  71.3 73.5 73.2 78.2 7.1 ...
##  $ Hepatitis.B     : int   65 62 64 67 68 66 63 64 63 64 ...
##  $ Measles         : int  1154 492 430 2787 3013 1989 2861 1599 1141 1990 ...
##  $ BMI             : num   19.1 18.6 18.1 17.6 17.2 16.7 16.2 15.7 15.2 14.7 ...
##  $ under.five.deaths : int   83 86 89 93 97 102 106 110 113 116 ...
##  $ Polio           : int    6 58 62 67 68 66 63 64 63 58 ...
##  $ Total.expenditure : num   8.16 8.18 8.13 8.52 7.87 9.2 9.42 8.33 6.73 7.43 ...
##  $ Diphtheria      : int   65 62 64 67 68 66 63 64 63 58 ...
##  $ HIV.AIDS        : num   0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 ...
##  $ GDP             : num  584.3 612.7 631.7 670 63.5 ...
##  $ Population      : num  33736494 327582 31731688 3696958 2978599 ...
##  $ thinness..1.19.years : num  17.2 17.5 17.7 17.9 18.2 18.4 18.6 18.8 19 19.2 ...
##  $ thinness.5.9.years : num  17.3 17.5 17.7 18 18.2 18.4 18.7 18.9 19.1 19.3 ...
##  $ Income.composition.of.resources : num  0.479 0.476 0.47 0.463 0.454 0.448 0.434 0.433 0.415 0.405 ...
##  $ Schooling       : num  10.1 10 9.9 9.8 9.5 9.2 8.9 8.7 8.4 8.1 ...

head(lifeExpec)

##      Country Year      Status Life.expectancy Adult.Mortality infant.deaths
## 1 Afghanistan 2015 Developing          65.0             263             62
## 2 Afghanistan 2014 Developing          59.9             271             64
## 3 Afghanistan 2013 Developing          59.9             268             66
## 4 Afghanistan 2012 Developing          59.5             272             69
## 5 Afghanistan 2011 Developing          59.2             275             71
## 6 Afghanistan 2010 Developing          58.8             279             74
##      Alcohol percentage.expenditure Hepatitis.B Measles BMI under.five.deaths
## 1      0.01             71.279624             65      1154 19.1             83
## 2      0.01             73.523582             62       492 18.6             86
## 3      0.01             73.219243             64       430 18.1             89
## 4      0.01             78.184215             67      2787 17.6             93
## 5      0.01             7.097109             68      3013 17.2             97
## 6      0.01             79.679367             66      1989 16.7            102
##      Polio Total.expenditure Diphtheria HIV.AIDS GDP Population
## 1      6             8.16             65      0.1 584.25921      33736494
## 2     58             8.18             62      0.1 612.69651       327582
## 3     62             8.13             64      0.1 631.74498      31731688
## 4     67             8.52             67      0.1 669.95900      3696958
## 5     68             7.87             68      0.1 63.53723       2978599
## 6     66             9.20             66      0.1 553.32894      2883167
##      thinness..1.19.years thinness.5.9.years Income.composition.of.resources
## 1             17.2             17.3             0.479
## 2             17.5             17.5             0.476
## 3             17.7             17.7             0.470
## 4             17.9             18.0             0.463
```

```
## 5          18.2          18.2          0.454
## 6          18.4          18.4          0.448
##   Schooling
## 1         10.1
## 2         10.0
## 3          9.9
## 4          9.8
## 5          9.5
## 6          9.2

# Add continent column to the dataset
lifeExpec$continent <- countrycode(sourcevar = lifeExpec$Country,
                                   origin = "country.name",
                                   destination = "continent")

# Edit 3 country names
lifeExpec$CountrytoMatch <- as.character(lifeExpec$Country)
lifeExpec$CountrytoMatch[lifeExpec$CountrytoMatch == "Côte d'Ivoire"] <- "Cote d'Ivoire"
lifeExpec$CountrytoMatch[lifeExpec$CountrytoMatch == "Cabo Verde"] <- "Cape Verde"
lifeExpec$CountrytoMatch[lifeExpec$CountrytoMatch == "Czechia"] <- "Czech Republic"

# Statistics summary table for all variables
summary(lifeExpec)
```

## Country	Year	Status	Life.expectancy
## Length:2938	Min. :2000	Length:2938	Min. :36.30
## Class :character	1st Qu.:2004	Class :character	1st Qu.:63.10
## Mode :character	Median :2008	Mode :character	Median :72.10
##	Mean :2008		Mean :69.22
##	3rd Qu.:2012		3rd Qu.:75.70
##	Max. :2015		Max. :89.00
##			NA's :10
## Adult.Mortality	infant.deaths	Alcohol	percentage.expenditure
## Min. : 1.0	Min. : 0.0	Min. : 0.0100	Min. : 0.000
## 1st Qu.: 74.0	1st Qu.: 0.0	1st Qu.: 0.8775	1st Qu.: 4.685
## Median :144.0	Median : 3.0	Median : 3.7550	Median : 64.913
## Mean :164.8	Mean : 30.3	Mean : 4.6029	Mean : 738.251
## 3rd Qu.:228.0	3rd Qu.: 22.0	3rd Qu.: 7.7025	3rd Qu.: 441.534
## Max. :723.0	Max. :1800.0	Max. :17.8700	Max. :19479.912
## NA's :10		NA's :194	
## Hepatitis.B	Measles	BMI	under.five.deaths
## Min. : 1.00	Min. : 0.0	Min. : 1.00	Min. : 0.00
## 1st Qu.:77.00	1st Qu.: 0.0	1st Qu.:19.30	1st Qu.: 0.00
## Median :92.00	Median : 17.0	Median :43.50	Median : 4.00
## Mean :80.94	Mean : 2419.6	Mean :38.32	Mean : 42.04
## 3rd Qu.:97.00	3rd Qu.: 360.2	3rd Qu.:56.20	3rd Qu.: 28.00
## Max. :99.00	Max. :212183.0	Max. :87.30	Max. :2500.00
## NA's :553		NA's :34	
## Polio	Total.expenditure	Diphtheria	HIV.AIDS
## Min. : 3.00	Min. : 0.370	Min. : 2.00	Min. : 0.100
## 1st Qu.:78.00	1st Qu.: 4.260	1st Qu.:78.00	1st Qu.: 0.100
## Median :93.00	Median : 5.755	Median :93.00	Median : 0.100
## Mean :82.55	Mean : 5.938	Mean :82.32	Mean : 1.742
## 3rd Qu.:97.00	3rd Qu.: 7.492	3rd Qu.:97.00	3rd Qu.: 0.800
## Max. :99.00	Max. :17.600	Max. :99.00	Max. :50.600
## NA's :19	NA's :226	NA's :19	
## GDP	Population	thinness..1.19.years	
## Min. : 1.68	Min. :3.400e+01	Min. : 0.10	
## 1st Qu.: 463.94	1st Qu.:1.958e+05	1st Qu.: 1.60	
## Median : 1766.95	Median :1.387e+06	Median : 3.30	
## Mean : 7483.16	Mean :1.275e+07	Mean : 4.84	
## 3rd Qu.: 5910.81	3rd Qu.:7.420e+06	3rd Qu.: 7.20	
## Max. :119172.74	Max. :1.294e+09	Max. :27.70	
## NA's :448	NA's :652	NA's :34	
## thinness.5.9.years	Income.composition.of.resources	Schooling	
## Min. : 0.10	Min. :0.0000	Min. : 0.00	

```
## 1st Qu.: 1.50      1st Qu.:0.4930      1st Qu.:10.10
## Median : 3.30      Median :0.6770      Median :12.30
## Mean : 4.87        Mean :0.6276        Mean :11.99
## 3rd Qu.: 7.20      3rd Qu.:0.7790      3rd Qu.:14.30
## Max. :28.60        Max. :0.9480        Max. :20.70
## NA's :34           NA's :167           NA's :163
## continent        CountrytoMatch
## Length:2938       Length:2938
## Class :character   Class :character
## Mode :character    Mode :character
##
##
##
##
```

Check and clean up data record for each country

`unique(lifeExpect$Country)` # *There are 193 countries in total*

```
## [1] "Afghanistan"
## [2] "Albania"
## [3] "Algeria"
## [4] "Angola"
## [5] "Antigua and Barbuda"
## [6] "Argentina"
## [7] "Armenia"
## [8] "Australia"
## [9] "Austria"
## [10] "Azerbaijan"
## [11] "Bahamas"
## [12] "Bahrain"
## [13] "Bangladesh"
## [14] "Barbados"
## [15] "Belarus"
## [16] "Belgium"
## [17] "Belize"
## [18] "Benin"
## [19] "Bhutan"
## [20] "Bolivia (Plurinational State of)"
## [21] "Bosnia and Herzegovina"
## [22] "Botswana"
## [23] "Brazil"
## [24] "Brunei Darussalam"
## [25] "Bulgaria"
## [26] "Burkina Faso"
## [27] "Burundi"
## [28] "Côte d'Ivoire"
## [29] "Cabo Verde"
## [30] "Cambodia"
## [31] "Cameroon"
## [32] "Canada"
## [33] "Central African Republic"
## [34] "Chad"
## [35] "Chile"
## [36] "China"
## [37] "Colombia"
## [38] "Comoros"
## [39] "Congo"
## [40] "Cook Islands"
## [41] "Costa Rica"
## [42] "Croatia"
## [43] "Cuba"
## [44] "Cyprus"
## [45] "Czechia"
## [46] "Democratic People's Republic of Korea"
## [47] "Democratic Republic of the Congo"
```

[48] "Denmark"
[49] "Djibouti"
[50] "Dominica"
[51] "Dominican Republic"
[52] "Ecuador"
[53] "Egypt"
[54] "El Salvador"
[55] "Equatorial Guinea"
[56] "Eritrea"
[57] "Estonia"
[58] "Ethiopia"
[59] "Fiji"
[60] "Finland"
[61] "France"
[62] "Gabon"
[63] "Gambia"
[64] "Georgia"
[65] "Germany"
[66] "Ghana"
[67] "Greece"
[68] "Grenada"
[69] "Guatemala"
[70] "Guinea"
[71] "Guinea-Bissau"
[72] "Guyana"
[73] "Haiti"
[74] "Honduras"
[75] "Hungary"
[76] "Iceland"
[77] "India"
[78] "Indonesia"
[79] "Iran (Islamic Republic of)"
[80] "Iraq"
[81] "Ireland"
[82] "Israel"
[83] "Italy"
[84] "Jamaica"
[85] "Japan"
[86] "Jordan"
[87] "Kazakhstan"
[88] "Kenya"
[89] "Kiribati"
[90] "Kuwait"
[91] "Kyrgyzstan"
[92] "Lao People's Democratic Republic"
[93] "Latvia"
[94] "Lebanon"
[95] "Lesotho"
[96] "Liberia"
[97] "Libya"
[98] "Lithuania"
[99] "Luxembourg"
[100] "Madagascar"
[101] "Malawi"
[102] "Malaysia"
[103] "Maldives"
[104] "Mali"
[105] "Malta"
[106] "Marshall Islands"
[107] "Mauritania"
[108] "Mauritius"
[109] "Mexico"
[110] "Micronesia (Federated States of)"
[111] "Monaco"
[112] "Mongolia"
[113] "Montenegro"

[114] "Morocco"
[115] "Mozambique"
[116] "Myanmar"
[117] "Namibia"
[118] "Nauru"
[119] "Nepal"
[120] "Netherlands"
[121] "New Zealand"
[122] "Nicaragua"
[123] "Niger"
[124] "Nigeria"
[125] "Niue"
[126] "Norway"
[127] "Oman"
[128] "Pakistan"
[129] "Palau"
[130] "Panama"
[131] "Papua New Guinea"
[132] "Paraguay"
[133] "Peru"
[134] "Philippines"
[135] "Poland"
[136] "Portugal"
[137] "Qatar"
[138] "Republic of Korea"
[139] "Republic of Moldova"
[140] "Romania"
[141] "Russian Federation"
[142] "Rwanda"
[143] "Saint Kitts and Nevis"
[144] "Saint Lucia"
[145] "Saint Vincent and the Grenadines"
[146] "Samoa"
[147] "San Marino"
[148] "Sao Tome and Principe"
[149] "Saudi Arabia"
[150] "Senegal"
[151] "Serbia"
[152] "Seychelles"
[153] "Sierra Leone"
[154] "Singapore"
[155] "Slovakia"
[156] "Slovenia"
[157] "Solomon Islands"
[158] "Somalia"
[159] "South Africa"
[160] "South Sudan"
[161] "Spain"
[162] "Sri Lanka"
[163] "Sudan"
[164] "Suriname"
[165] "Swaziland"
[166] "Sweden"
[167] "Switzerland"
[168] "Syrian Arab Republic"
[169] "Tajikistan"
[170] "Thailand"
[171] "The former Yugoslav republic of Macedonia"
[172] "Timor-Leste"
[173] "Togo"
[174] "Tonga"
[175] "Trinidad and Tobago"
[176] "Tunisia"
[177] "Turkey"
[178] "Turkmenistan"
[179] "Tuvalu"

```

## [180] "Uganda"
## [181] "Ukraine"
## [182] "United Arab Emirates"
## [183] "United Kingdom of Great Britain and Northern Ireland"
## [184] "United Republic of Tanzania"
## [185] "United States of America"
## [186] "Uruguay"
## [187] "Uzbekistan"
## [188] "Vanuatu"
## [189] "Venezuela (Bolivarian Republic of)"
## [190] "Viet Nam"
## [191] "Yemen"
## [192] "Zambia"
## [193] "Zimbabwe"

unique(lifeExpec$Year) # 16 years of data collection from 2000 to 2015

## [1] 2015 2014 2013 2012 2011 2010 2009 2008 2007 2006 2005 2004 2003 2002 2001
## [16] 2000

# There are 10 countries that do not have 16 years of data. They all have only 2013 data record
lifeExpec %>% group_by(Country) %>%
  filter(n() != 16)

## # A tibble: 10 x 24
## # Groups:   Country [10]
##   Country      Year Status Life expectancy Adult Mortality infant.deaths Alcohol
##   <chr>      <int> <chr>      <dbl>          <int>          <int>      <dbl>
## 1 Cook Isla...  2013 Devel...      NA              NA              0      0.01
## 2 Dominica     2013 Devel...      NA              NA              0      0.01
## 3 Marshall ...  2013 Devel...      NA              NA              0      0.01
## 4 Monaco       2013 Devel...      NA              NA              0      0.01
## 5 Nauru        2013 Devel...      NA              NA              0      0.01
## 6 Niue         2013 Devel...      NA              NA              0      0.01
## 7 Palau        2013 Devel...      NA              NA              0      NA
## 8 Saint Kit...  2013 Devel...      NA              NA              0      8.54
## 9 San Marino   2013 Devel...      NA              NA              0      0.01
## 10 Tuvalu      2013 Devel...      NA              NA              0      0.01
## # ... with 17 more variables: percentage.expenditure <dbl>, Hepatitis.B <int>,
## #   Measles <int>, BMI <dbl>, under.five.deaths <int>, Polio <int>,
## #   Total.expenditure <dbl>, Diphtheria <int>, HIV.AIDS <dbl>, GDP <dbl>,
## #   Population <dbl>, thinness..1.19.years <dbl>, thinness.5.9.years <dbl>,
## #   Income.composition.of.resources <dbl>, Schooling <dbl>, continent <chr>,
## #   CountrytoMatch <chr>

# Excluded countries with < 16 years of data collection from the dataset
lifeExpec <- lifeExpec %>%
  group_by(Country) %>%
  filter(n() == 16)

# Check if there is any country with duplicated year records
lifeExpec %>% group_by(Country, Year) %>%
  filter(n() > 1) %>%
  summarize(n=n()) # There is none

## `summarise()` has grouped output by 'Country'. You can override using the `.groups` argument.

## # A tibble: 0 x 3
## # Groups:   Country [0]
## # ... with 3 variables: Country <chr>, Year <int>, n <int>

# Quick boxplot to see if any country have years of data collection differ from 2000 to 2015. --There is none
#
# lifeExpec %>% ggplot(aes(x=Country, y=Year)) +
#   geom_boxplot() +
#   coord_flip()

```

At this point, all 193 - 10 = 183 countries have all 16 years of data record from 2000 to 2015. Total in 2,928 (183*16) rows.

Create summary table

```
summary(lifeExpec)
```

```
##      Country      Year      Status      Life.expectancy
## Length:2928      Min.   :2000      Length:2928      Min.   :36.30
## Class :character  1st Qu.:2004      Class :character  1st Qu.:63.10
## Mode  :character  Median :2008      Mode  :character  Median :72.10
##                                     Mean  :2008      Mean  :69.22
##                                     3rd Qu.:2011      3rd Qu.:75.70
##                                     Max.   :2015      Max.   :89.00
##
## Adult.Mortality infant.deaths      Alcohol      percentage.expenditure
## Min.   : 1.0      Min.   : 0.00      Min.   : 0.010      Min.   : 0.000
## 1st Qu.: 74.0      1st Qu.: 0.00      1st Qu.: 0.905      1st Qu.: 4.854
## Median :144.0      Median : 3.00      Median : 3.770      Median : 65.611
## Mean   :164.8      Mean   : 30.41      Mean   : 4.615      Mean   : 740.321
## 3rd Qu.:228.0      3rd Qu.: 22.00      3rd Qu.: 7.715      3rd Qu.: 442.614
## Max.   :723.0      Max.   :1800.00      Max.   :17.870      Max.   :19479.912
##                                     NA's   :193
## Hepatitis.B      Measles      BMI      under.five.deaths
## Min.   : 1.00      Min.   : 0.0      Min.   : 1.00      Min.   : 0.00
## 1st Qu.:77.00      1st Qu.: 0.0      1st Qu.:19.30      1st Qu.: 0.00
## Median :92.00      Median : 17.0      Median :43.35      Median : 4.00
## Mean   :80.96      Mean   : 2427.9      Mean   :38.24      Mean   : 42.18
## 3rd Qu.:97.00      3rd Qu.: 362.2      3rd Qu.:56.10      3rd Qu.: 28.00
## Max.   :99.00      Max.   :212183.0      Max.   :77.60      Max.   :2500.00
## NA's   :553      NA's   :32
## Polio      Total.expenditure      Diphtheria      HIV.AIDS
## Min.   : 3.00      Min.   : 0.37      Min.   : 2.00      Min.   : 0.100
## 1st Qu.:78.00      1st Qu.: 4.26      1st Qu.:78.00      1st Qu.: 0.100
## Median :93.00      Median : 5.75      Median :93.00      Median : 0.100
## Mean   :82.55      Mean   : 5.93      Mean   :82.32      Mean   : 1.748
## 3rd Qu.:97.00      3rd Qu.: 7.49      3rd Qu.:97.00      3rd Qu.: 0.800
## Max.   :99.00      Max.   :17.60      Max.   :99.00      Max.   :50.600
## NA's   :19      NA's   :226      NA's   :19
## GDP      Population      thinness..1.19.years
## Min.   : 1.68      Min.   :3.400e+01      Min.   : 0.100
## 1st Qu.: 463.85      1st Qu.:1.967e+05      1st Qu.: 1.600
## Median : 1764.97      Median :1.392e+06      Median : 3.300
## Mean   : 7494.21      Mean   :1.276e+07      Mean   : 4.851
## 3rd Qu.: 5932.90      3rd Qu.:7.427e+06      3rd Qu.: 7.200
## Max.   :119172.74      Max.   :1.294e+09      Max.   :27.700
## NA's   :443      NA's   :644      NA's   :32
## thinness.5.9.years Income.composition.of.resources      Schooling
## Min.   : 0.100      Min.   :0.0000      Min.   : 0.0
## 1st Qu.: 1.575      1st Qu.:0.4930      1st Qu.:10.1
## Median : 3.400      Median :0.6770      Median :12.3
## Mean   : 4.881      Mean   :0.6274      Mean   :12.0
## 3rd Qu.: 7.200      3rd Qu.:0.7792      3rd Qu.:14.3
## Max.   :28.600      Max.   :0.9480      Max.   :20.7
## NA's   :32      NA's   :160      NA's   :160
## continent      CountrytoMatch
## Length:2928      Length:2928
## Class :character  Class :character
## Mode  :character  Mode  :character
##
##
##
##
```

Address the missing values

Check for missing value in each column

```
missing.values_summary <- lifeExpec %>%
```

```

gather(key = "key", value = "val") %>%
mutate(is.missing = is.na(val)) %>%
group_by(key, is.missing) %>%
summarise(num.missing = n()) %>%
filter(is.missing==T) %>%
select(-is.missing) %>%
arrange(desc(num.missing))

## `summarise()` has grouped output by 'key'. You can override using the `.groups` argument.

missing.values_summary

## # A tibble: 12 x 2
## # Groups:   key [12]
##   key                                num.missing
##   <chr>                                <int>
## 1 Population                           644
## 2 Hepatitis.B                         553
## 3 GDP                                  443
## 4 Total.expenditure                   226
## 5 Alcohol                             193
## 6 Income.composition.of.resources    160
## 7 Schooling                           160
## 8 BMI                                  32
## 9 thinness..1.19.years                 32
## 10 thinness.5.9.years                  32
## 11 Diphtheria                           19
## 12 Polio                               19

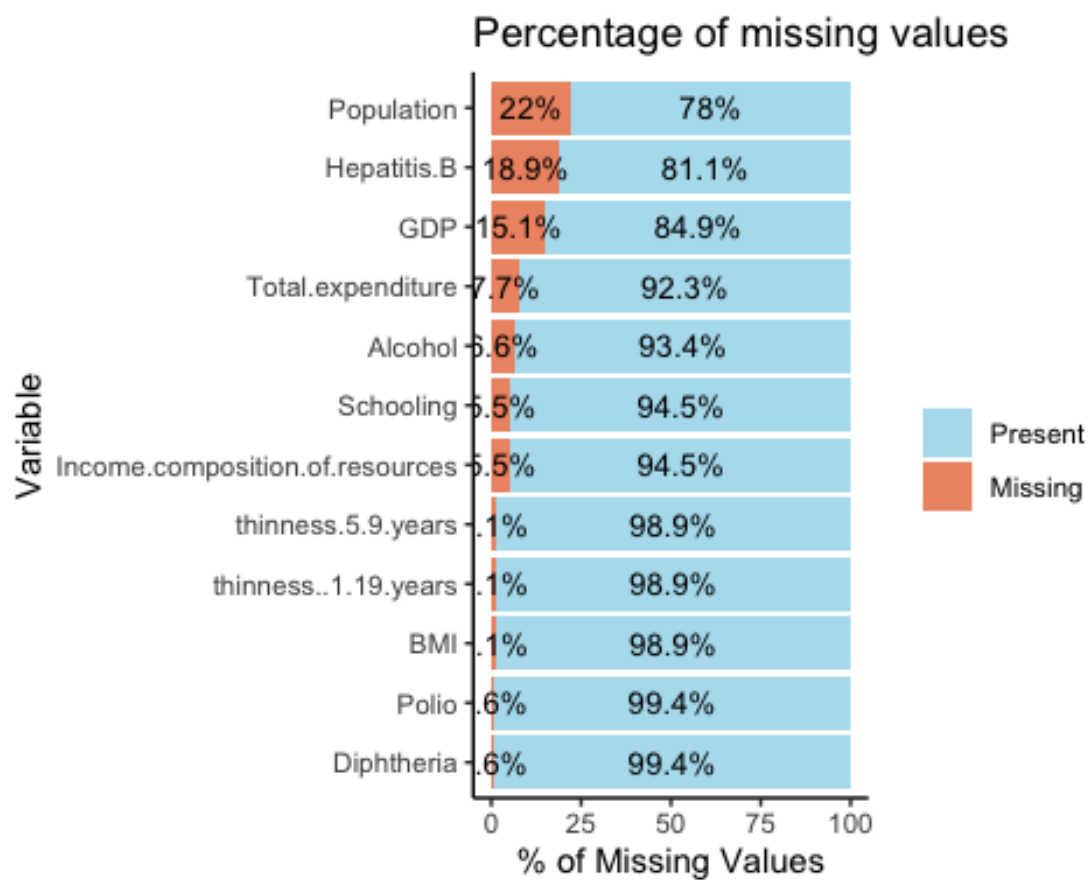
# Missing values % in each column
missing.values <- lifeExpec %>%
gather(key = "key", value = "val") %>%
mutate(isna = is.na(val)) %>%
group_by(key) %>%
mutate(total = n()) %>%
group_by(key, total, isna) %>%
summarise(num.isna = n()) %>%
mutate(pct = num.isna / total * 100)

## `summarise()` has grouped output by 'key', 'total'. You can override using the `.groups` argument.

mm <- missing.values %>% filter(pct != 100)
mm <- mm %>% group_by(key) %>% mutate(max.per.group = max(as.numeric(pct)))

mm %>% ggplot(aes(x= reorder(key, desc(max.per.group)), y=pct, fill=isna)) + geom_bar(stat="identity") +
geom_text(aes(label=paste0(round(pct,1),"%"),
position = position_stack(vjust = .5), size = 3.5) +
labs(title = 'Percentage of missing values', x = 'Variable', y = '% of Missing Values') +
theme_classic() + scale_fill_manual(name = "",
values = c('lightblue2', 'lightsalmon2'),
labels = c("Present", "Missing")) + coord_flip()

```

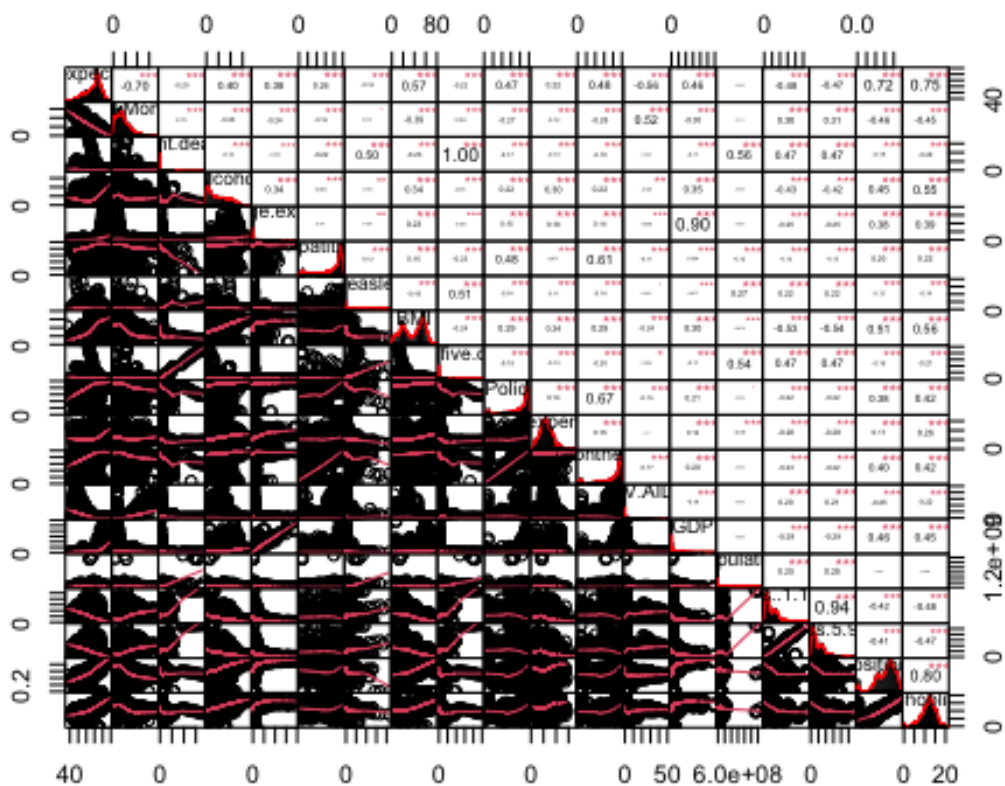
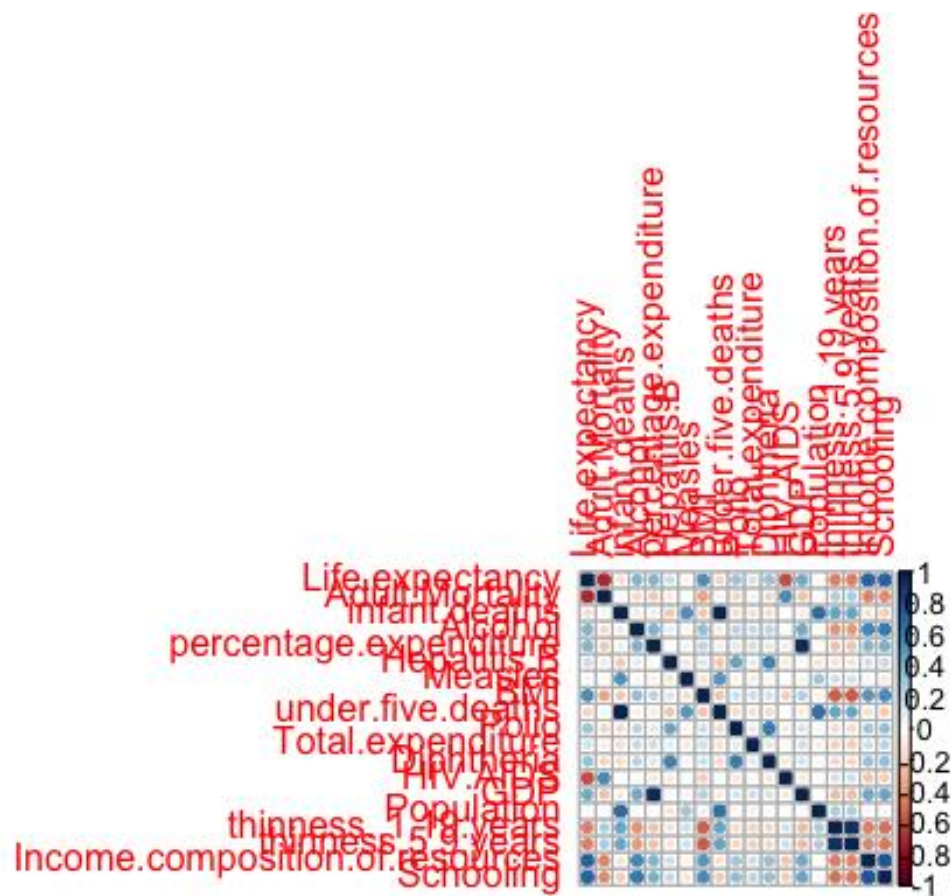
Life expectancy correlation coefficient for numerical variables

Correlation coefficient for numerical columns

```
num_col <- subset(lifeExpec, select = -c(Year, Country, CountrytoMatch, Status, continent))
```

```
M <- cor(num_col, use = "complete.obs")
```

```
corrplot(M, use="complete.obs")
```

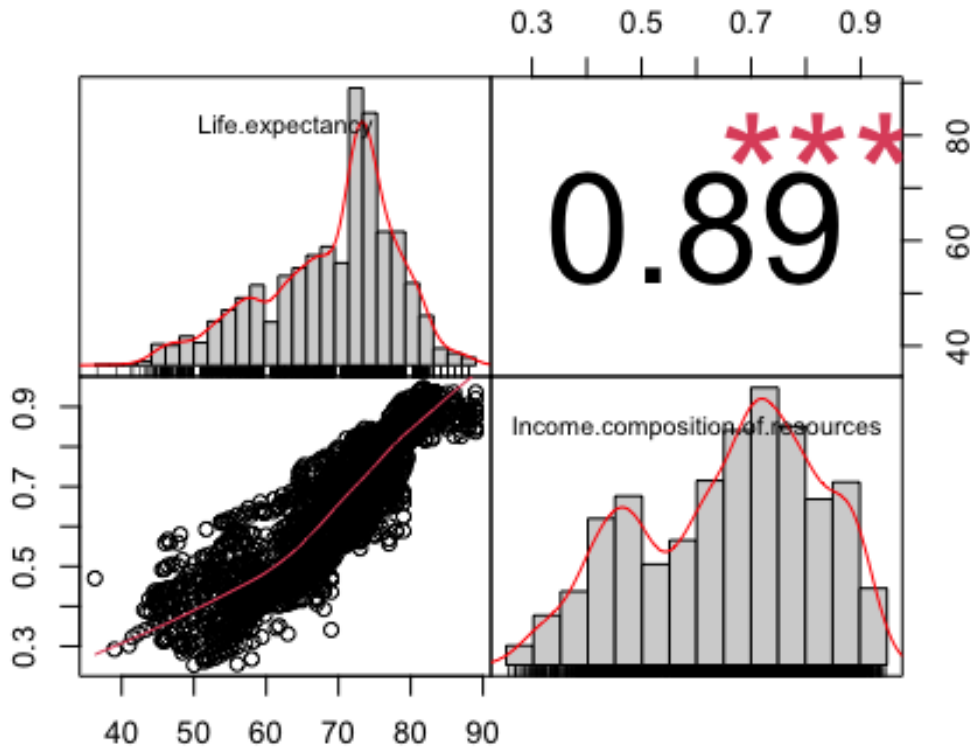


Test on transformation on good candidate variables

Remove 'zero' from observations for both Income.composition.of.resources and Schooling

```
income_comp <- subset(lifeExpec, select = c(Life.expectancy, Income.composition.of.resources))
income_comp <- income_comp[income_comp$Income.composition.of.resources != 0, ]

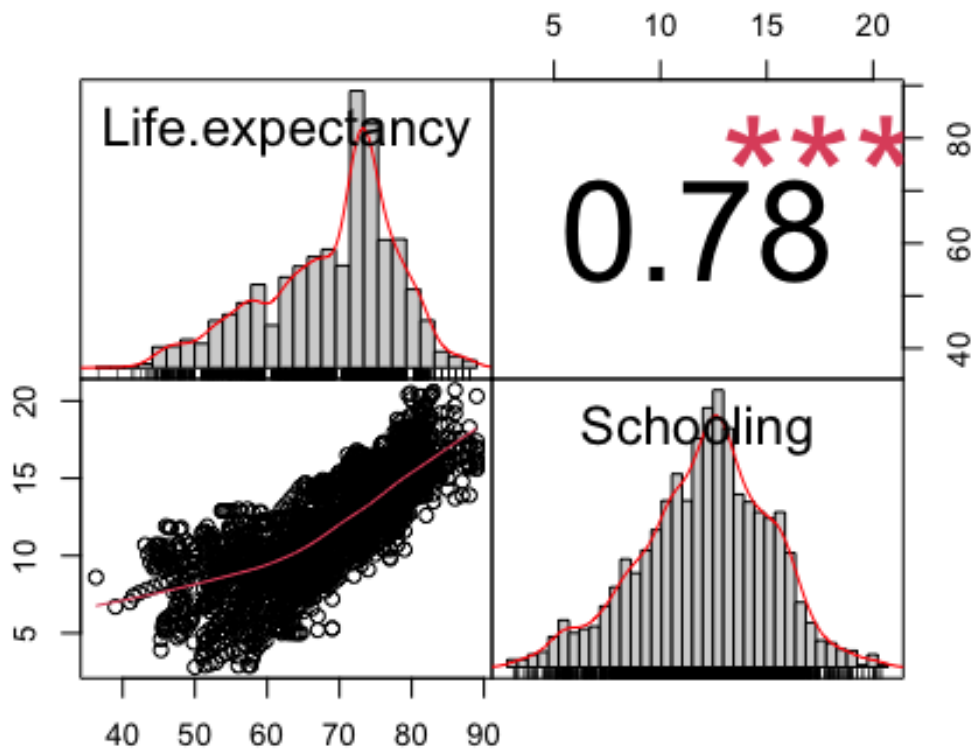
chart.Correlation(income_comp, histogram=TRUE, pch=19)
```



Corr. coefficient between LifeExpectancy and Income.composition.of.resources changed from 0.72 to 0.89

```
schooling <- subset(lifeExpec, select = c(Life.expectancy, Schooling))
schooling <- schooling[schooling$Schooling != 0, ]

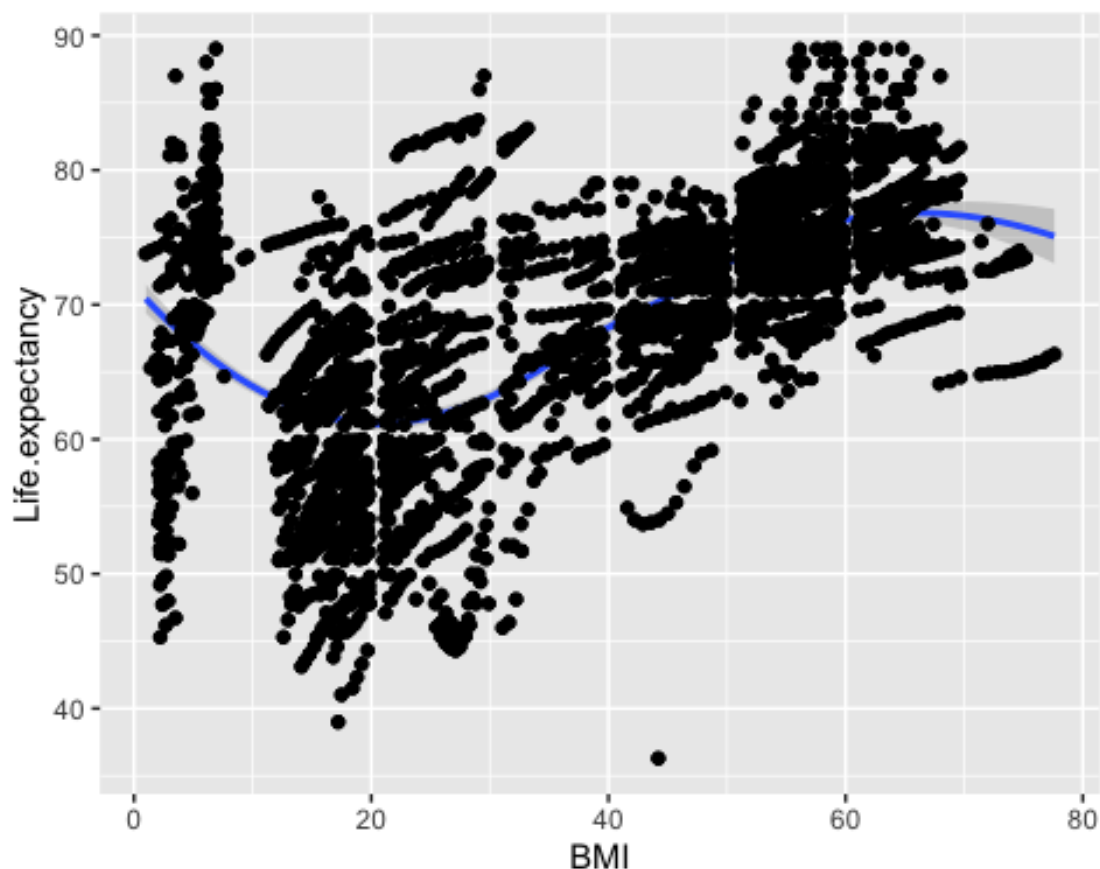
chart.Correlation(schooling, histogram=TRUE, pch=19)
```



```
# Corr. coefficient between LifeExpectancy and schooling changed from 0.75 to 0.78
```

```
# Both Income.composition.of.resources and Schooling are still good candidates
```

```
lifeExpec %>% ggplot(aes(x=BMI, y=Life.expectancy)) + geom_point() + geom_smooth(method="loess") + geom_jitter()
```



```
summary(lifeExpec$BMI)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.     NA's
##      1.00  19.30   43.35   38.24  56.10   77.60        32
```

```
# The Lowest BMI ever recorded is 7.5. Mean BMI of 12 is the lower limit for human survival.
lifeExpec %>% filter(BMI<12) %>% select(BMI) %>% arrange(BMI)
```

```
## Adding missing grouping variables: `Country`
```

```
## # A tibble: 291 x 2
## # Groups:   Country [164]
##   Country          BMI
##   <chr>          <dbl>
## 1 Viet Nam         1
## 2 Bangladesh       1.4
## 3 Viet Nam         1.4
## 4 Bangladesh       1.8
## 5 Viet Nam         1.9
## 6 Madagascar        2
## 7 Benin            2.1
## 8 Comoros           2.1
## 9 Democratic Republic of the Congo 2.1
## 10 Ghana            2.1
## # ... with 281 more rows
```

```
BMI_clean <- lifeExpec %>% filter(BMI>=12) %>% select(Life expectancy, BMI) %>% arrange(BMI)
```

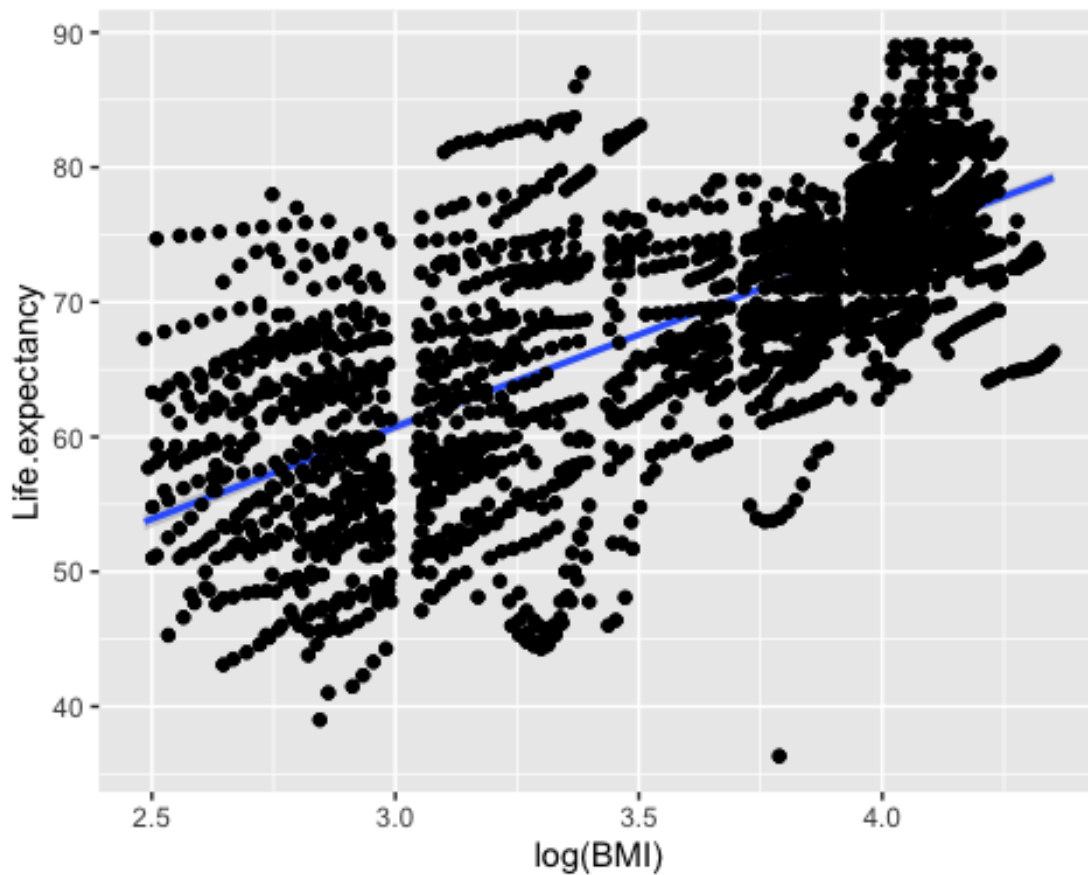
```
## Adding missing grouping variables: `Country`
```

```
dim(BMI_clean)
```

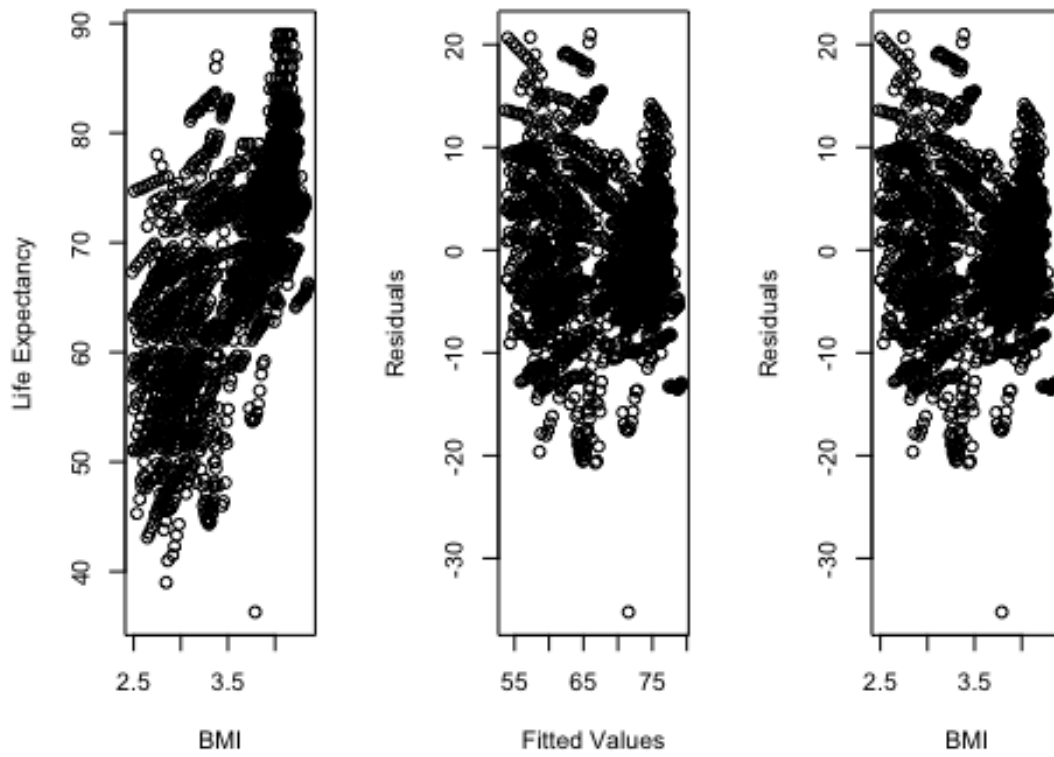
```
## [1] 2605    3
```

```
BMI_clean %>% ggplot(aes(x=log(BMI), y=Life.expectancy)) + geom_point() + geom_smooth(method="lm") + geom_jitter()
```

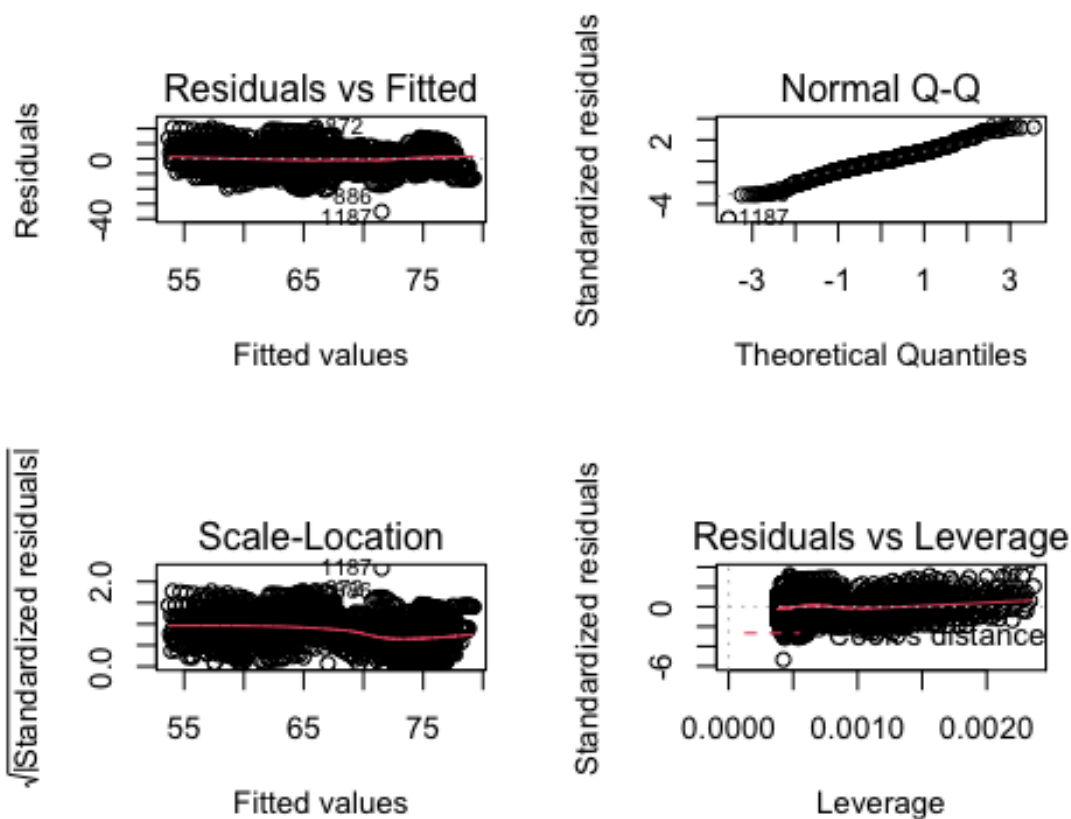
```
## `geom_smooth()` using formula 'y ~ x'
```



```
attach(BMI_clean)
par(mfrow=c(1,3))
plot(log(BMI), Life.expectancy, xlab="BMI", ylab="Life Expectancy")
BMI.model <- lm(Life.expectancy~log(BMI))
plot(BMI.model$fitted.values, BMI.model$residuals, xlab="Fitted Values", ylab="Residuals")
plot(log(BMI), BMI.model$residuals, xlab="BMI", ylab="Residuals")
```



```
par(mfrow=c(2,2))  
plot(BMI.model)
```



```
cor(log(BMI),Life.expectancy)

## [1] 0.7218619

#BMI Change from .57 to .72

summary(lifeExpec$Alcohol)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.   NA's 
##  0.010  0.905   3.770   4.615   7.715  17.870   193 

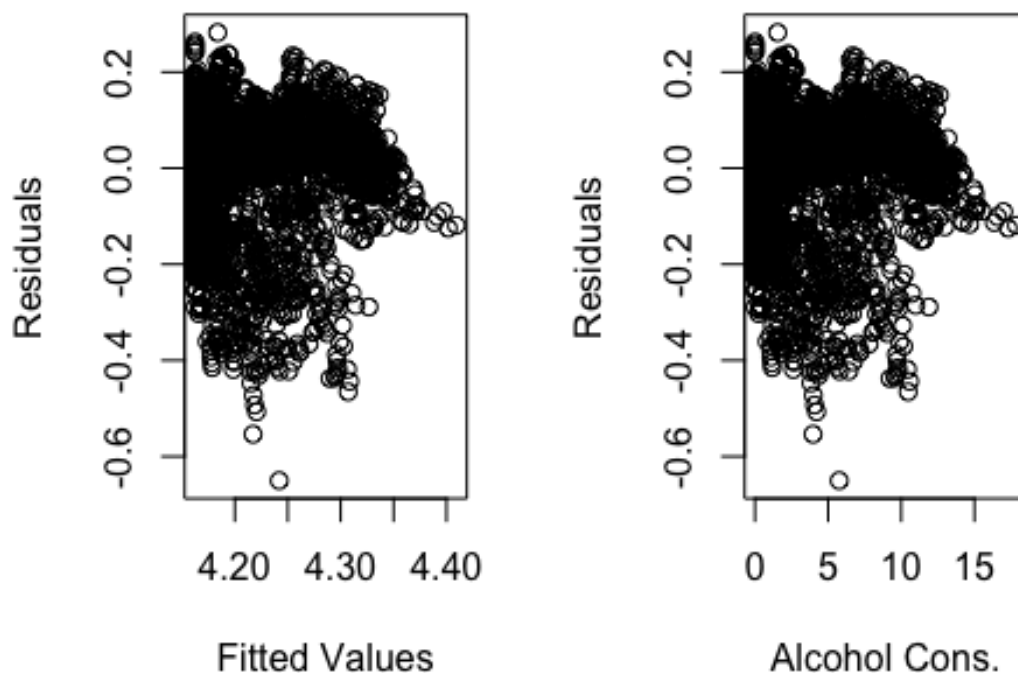
#193 NAs
Alcohol_clean <- lifeExpec %>% filter(!is.na(Alcohol)) %>% arrange(Alcohol)
summary(Alcohol_clean$Alcohol)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max. 
##  0.010  0.905   3.770   4.615   7.715  17.870 

attach(Alcohol_clean)

## The following objects are masked from BMI_clean:
## 
##      BMI, Country, Life.expectancy

Alcohol.model <- lm(log(Life.expectancy)~Alcohol)
par(mfrow=c(1,2))
plot(Alcohol.model$fitted.values,Alcohol.model$residuals, xlab="Fitted Values", ylab="Residuals")
plot(Alcohol, Alcohol.model$residuals, xlab="Alcohol Cons.", ylab="Residuals")
```

*# Alcohol has a nonconstant variance, when both before and after log transformed
 # Transforming Life expectancy does not help the variance either.
 # Remove Alcohol as a good candidate.*

```
summary(lifeExpec$GDP)
```

```
##      Min.    1st Qu.    Median      Mean   3rd Qu.      Max.      NA's
##      1.68    463.85   1764.97   7494.21  5932.90 119172.74     443
```

443 NAs

```
GDP_clean <- lifeExpec %>% filter(!is.na(GDP)) %>% arrange(GDP)
```

```
summary(GDP_clean$GDP)
```

```
##      Min.    1st Qu.    Median      Mean   3rd Qu.      Max.
##      1.68    463.85   1764.97   7494.21  5932.90 119172.74
```

```
attach(GDP_clean)
```

```
## The following objects are masked from Alcohol_clean:
```

```
##
```

```
##      Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
##      Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
##      Income.composition.of.resources, infant.deaths, Life.expectancy,
##      Measles, percentage.expenditure, Polio, Population, Schooling,
##      Status, thinness..1.19.years, thinness.5.9.years,
##      Total.expenditure, under.five.deaths, Year
```

```
## The following objects are masked from BMI_clean:
```

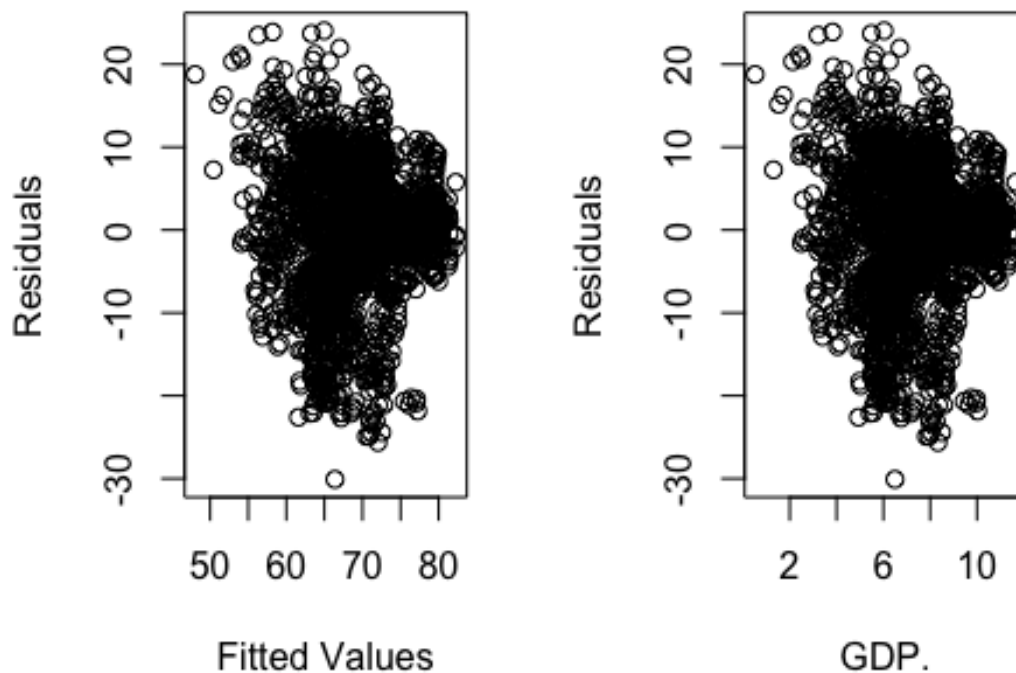
```
##
```

```
##      BMI, Country, Life.expectancy
```

```
GDP.model <- lm(Life.expectancy~log(GDP))
```

```
par(mfrow=c(1,2))
```

```
plot(GDP.model$fitted.values,GDP.model$residuals, xlab="Fitted Values", ylab="Residuals")
plot(log(GDP), GDP.model$residuals, xlab="GDP.", ylab="Residuals")
```



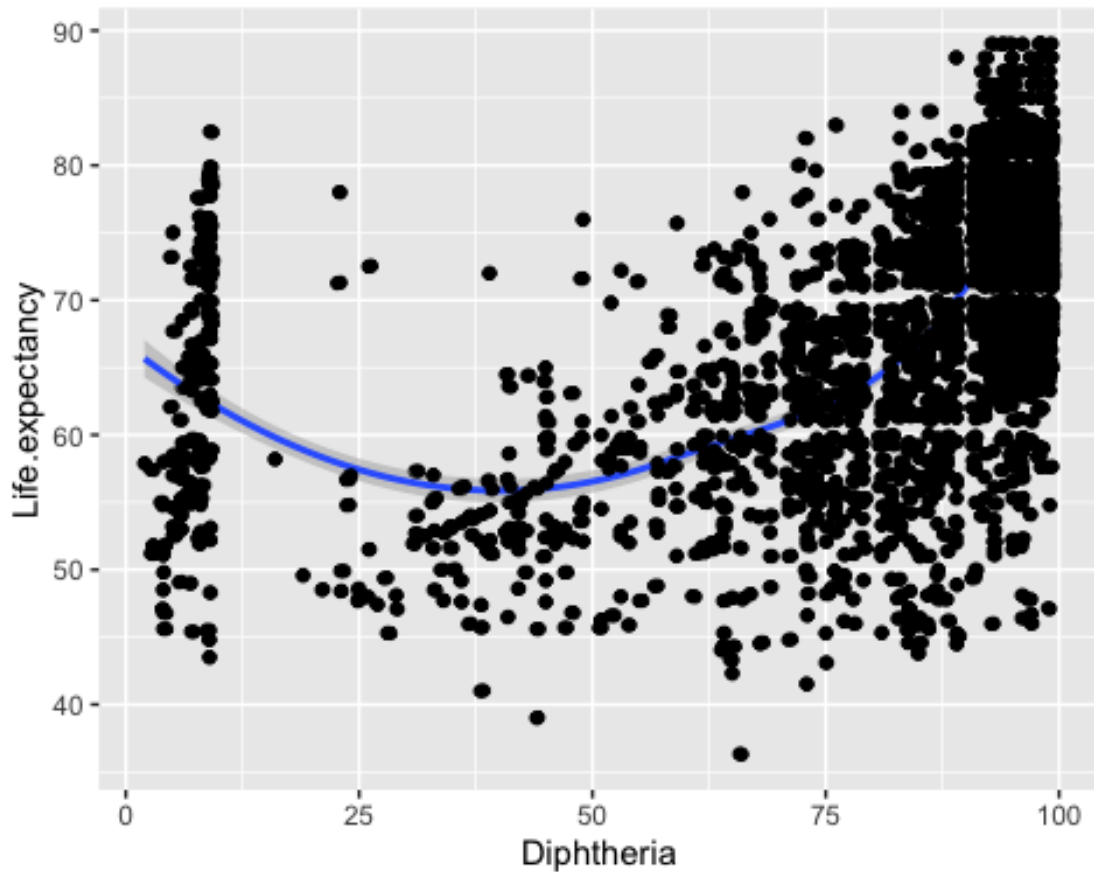
```
cor(log(GDP), Life.expectancy)
## [1] 0.5983547
# GDP chang from .46 to .598
attach(lifeExpec)

## The following objects are masked from GDP_clean:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from Alcohol_clean:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from BMI_clean:
##
## BMI, Country, Life.expectancy
```

```
lifeExpec %>% ggplot(aes(x=Diphtheria, y=Life.expectancy)) + geom_point() + geom_smooth(method="loess") + geom_jitter()
```



```
oglm <- lm(Life.expectancy~Diphtheria, data = lifeExpec)
summary(oglm)

##
## Call:
## lm(formula = Life.expectancy ~ Diphtheria, data = lifeExpec)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -29.851  -4.888   1.204   5.088  27.294
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  53.477505   0.558390   95.77  <2e-16 ***
## Diphtheria    0.192029   0.006518   29.46  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 8.333 on 2907 degrees of freedom
## (19 observations deleted due to missingness)
## Multiple R-squared:  0.2299, Adjusted R-squared:  0.2297
## F-statistic: 867.9 on 1 and 2907 DF,  p-value: < 2.2e-16

str(lifeExpec$Diphtheria)

## int [1:2928] 65 62 64 67 68 66 63 64 63 58 ...

summary(lifeExpec$Diphtheria)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.   NA's
##      2.00   78.00   93.00   82.32   97.00   99.00    19
```

With diphtheria we are looking at vaccination rates. Anything below 25% would not be enough to impact a significant portion of the population. Thus these were removed.

```
DIP_clean <- lifeExpec %>% filter(Diphtheria>=25) %>% select(Life.expectancy, Diphtheria)
```

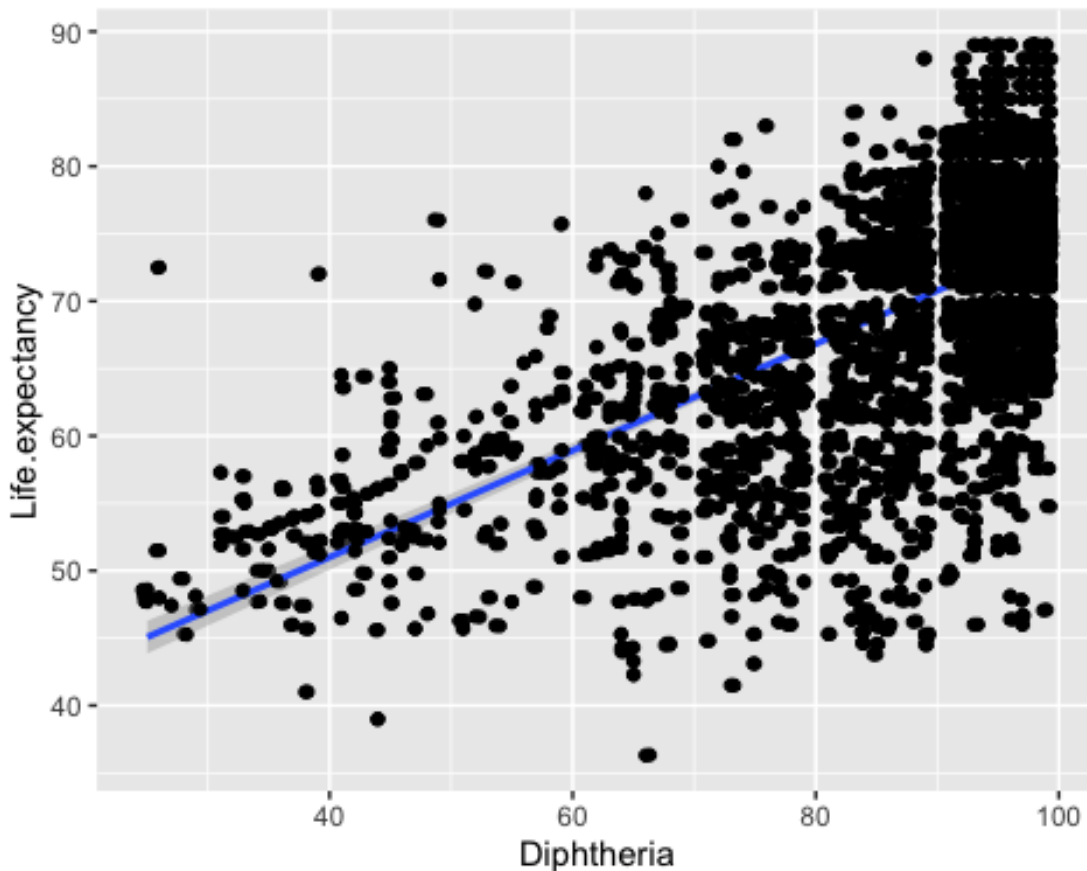
```
## Adding missing grouping variables: `Country`
```

```
dim(DIP_clean)
```

```
## [1] 2730    3
```

```
DIP_clean %>% ggplot(aes(x=Diphtheria, y=Life.expectancy)) + geom_point() + geom_smooth(method="lm") + geom_jitter()
```

```
## `geom_smooth()` using formula 'y ~ x'
```



```
attach(DIP_clean)
```

```
## The following objects are masked from lifeExpec:
```

```
##
```

```
##    Country, Diphtheria, Life.expectancy
```

```
## The following objects are masked from GDP_clean:
```

```
##
```

```
##    Country, Diphtheria, Life.expectancy
```

```
## The following objects are masked from Alcohol_clean:
```

```
##
```

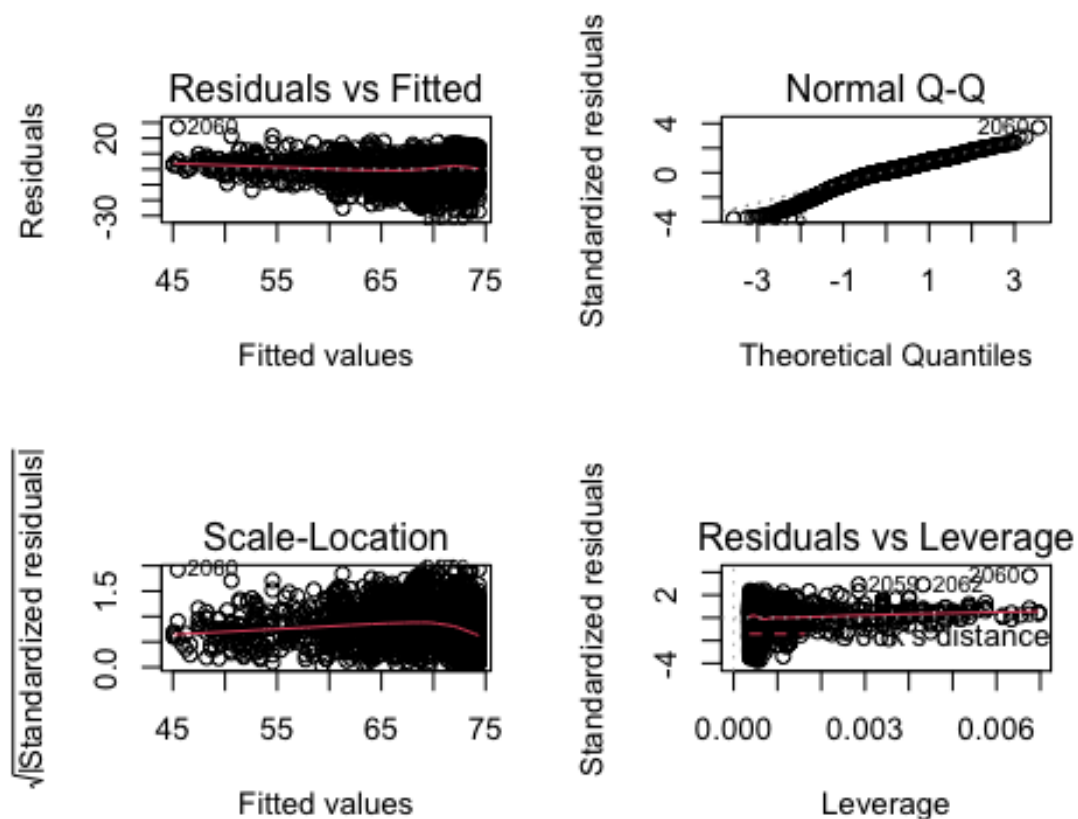
```
##    Country, Diphtheria, Life.expectancy
```

```
## The following objects are masked from BMI_clean:
```

```
##
```

```
##    Country, Life.expectancy
```

```
DIPlm <- lm(Life.expectancy~Diphtheria, data = DIP_clean)
par(mfrow=c(2,2))
plot(DIPlm)
```



```
summary(DIPlm)
```

```
##
## Call:
## lm(formula = Life.expectancy ~ Diphtheria, data = DIP_clean)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -27.5490  -3.6487   0.8532   4.7187  27.0321
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  35.18464    0.849772   41.41  <2e-16 ***
## Diphtheria    0.395509    0.009613   41.14  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.358 on 2728 degrees of freedom
## Multiple R-squared:  0.3829, Adjusted R-squared:  0.3827
## F-statistic: 1693 on 1 and 2728 DF, p-value: < 2.2e-16
```

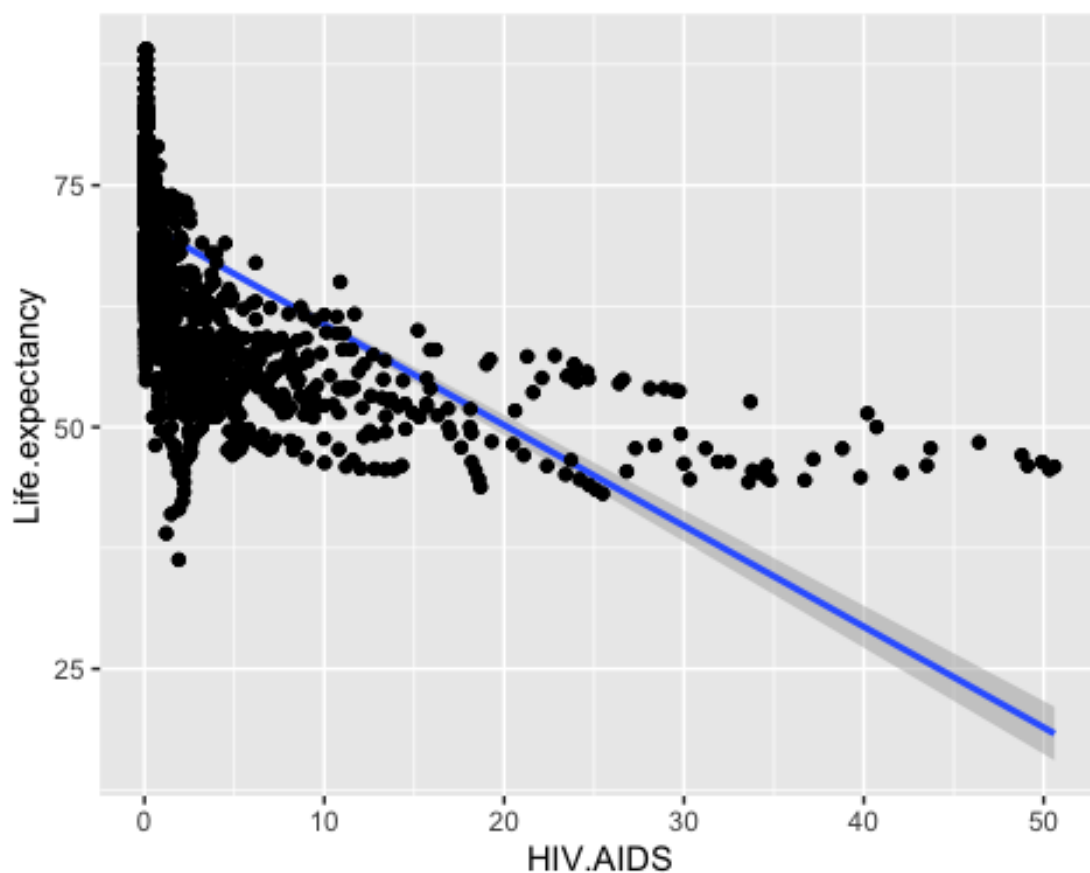
```
# Tried additional transformations but none seemed to improve statistics beyond what we see in final model,
# adj R-squared changed from .22 to .38
```

```
# HIV deaths per 1000 in under 5 range starting correlation
```

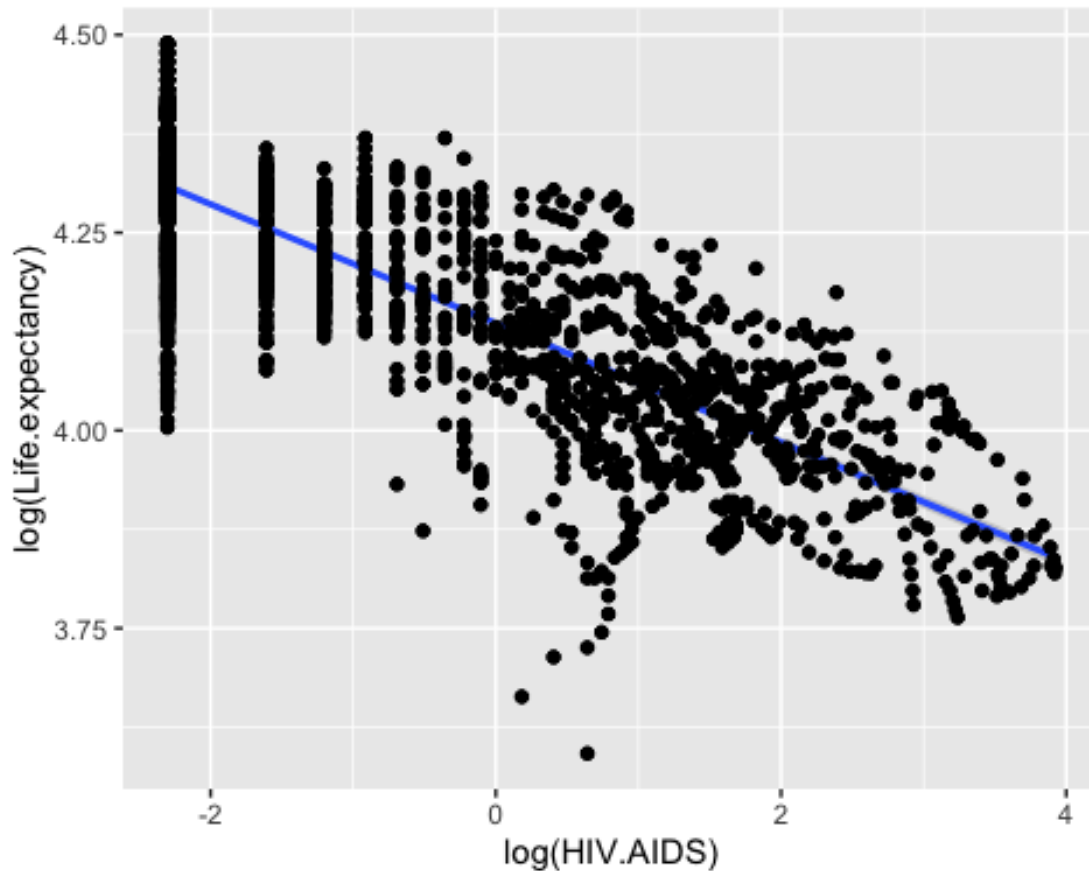
```
HIV <- lifeExpec %>% filter(!is.na(HIV.AIDS))
summary(HIV$HIV.AIDS)
```

```
##      Min. 1st Qu.  Median      Mean 3rd Qu.      Max.
##    0.100   0.100   0.100   1.748   0.800   50.600
```

```
HIV %>% ggplot(aes(x=HIV.AIDS, y = Life.expectancy)) +geom_point() + geom_smooth(method = "lm") + geom_jitter()  
## `geom_smooth()` using formula 'y ~ x'
```



```
HIV %>% ggplot(aes(x=log(HIV.AIDS), y = log(Life.expectancy))) +geom_point() + geom_smooth(method = "lm") + geom_jitter()  
## `geom_smooth()` using formula 'y ~ x'
```



```
HIVoglm <- lm(Life.expectancy~HIV.AIDS, data = lifeExpec)
summary(HIVoglm)

##
## Call:
## lm(formula = Life.expectancy ~ HIV.AIDS, data = lifeExpec)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -32.766  -5.442   1.658   5.058  27.593
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  71.04654    0.15465  459.40  <2e-16 ***
## HIV.AIDS     -1.04228    0.02876  -36.24  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.914 on 2926 degrees of freedom
## Multiple R-squared:  0.3098, Adjusted R-squared:  0.3095
## F-statistic: 1313 on 1 and 2926 DF, p-value: < 2.2e-16

attach(HIV)

## The following objects are masked from DIP_clean:
##
##      Country, Diphtheria, Life.expectancy

## The following objects are masked from lifeExpec:
##
##      Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
##      Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
##      Income.composition.of.resources, infant.deaths, Life.expectancy,
##      Measles, percentage.expenditure, Polio, Population, Schooling,
```

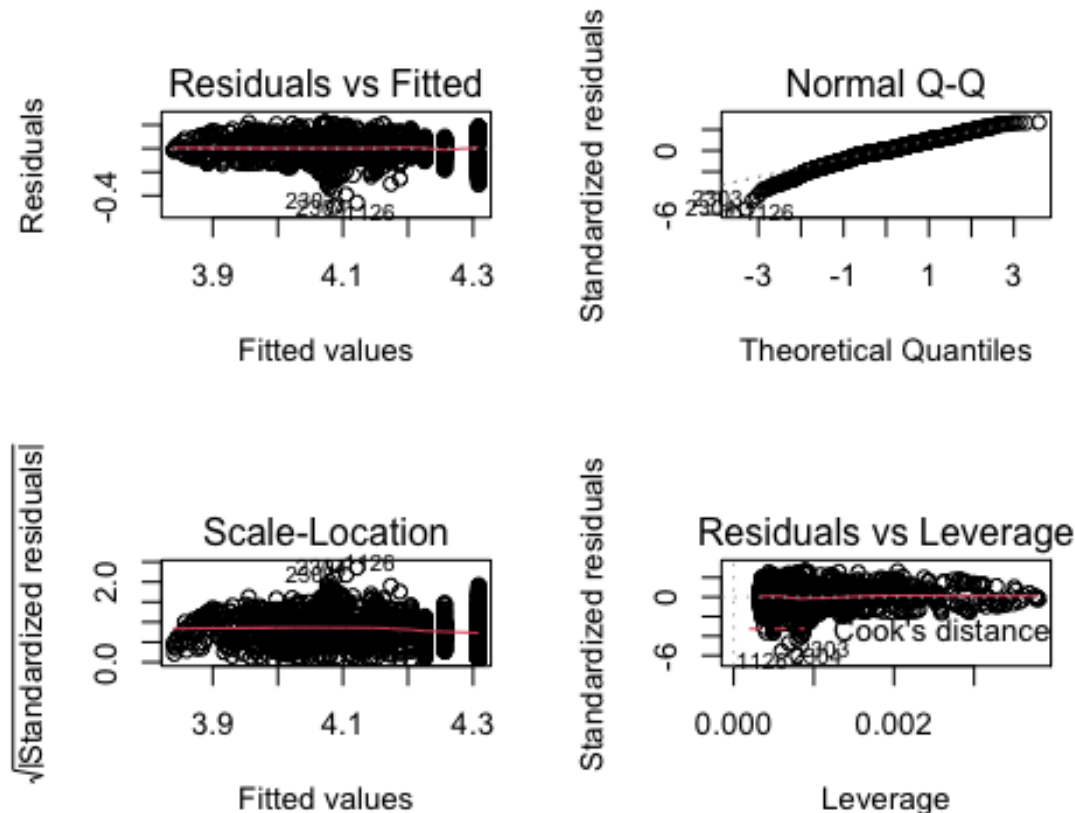
```
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from GDP_clean:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from Alcohol_clean:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from BMI_clean:
##
## BMI, Country, Life.expectancy

HIVlm <- lm(log(Life.expectancy) ~ log(HIV.AIDS))
plot(HIVlm)
```



```
summary(HIVlm)

##
## Call:
## lm(formula = log(Life.expectancy) ~ log(HIV.AIDS))
##
```



```
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.49518 -0.04038  0.00212  0.05570  0.22195
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   4.1353235   0.0019156   2158.7  <2e-16 ***
## log(HIV.AIDS) -0.0752888   0.0009471   -79.5   <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.08275 on 2926 degrees of freedom
## Multiple R-squared:  0.6835, Adjusted R-squared:  0.6834
## F-statistic: 6320 on 1 and 2926 DF,  p-value: < 2.2e-16

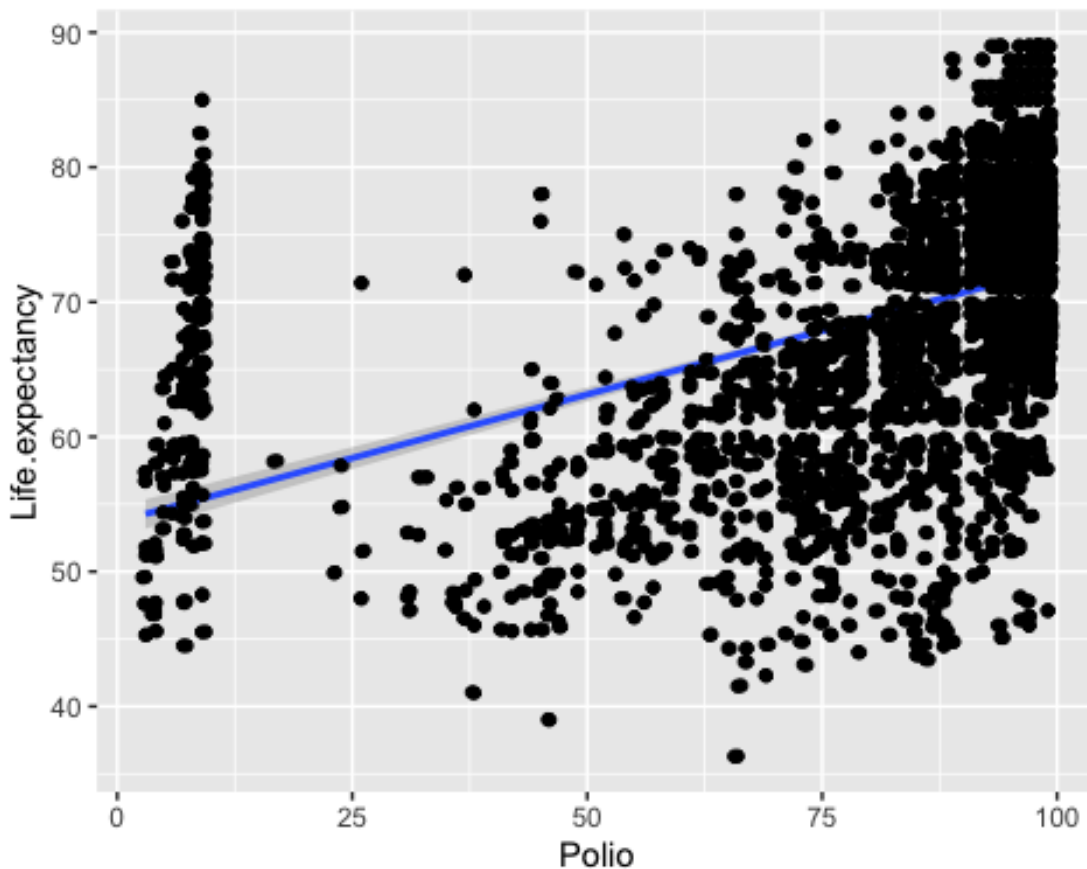
# transformation of both x and y variables allows residual tables to look best.
# Adj R-squared looks much better going from .31 to .68

# Polio
Polio1 <- lifeExp %>% filter(!is.na(Polio))
summary(Polio1$Polio)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      3.00  78.00   93.00   82.55  97.00   99.00

Polio1 %>% ggplot(aes(x=Polio, y = Life.expectancy)) + geom_point() + geom_smooth(method = "lm") + geom_jitter()

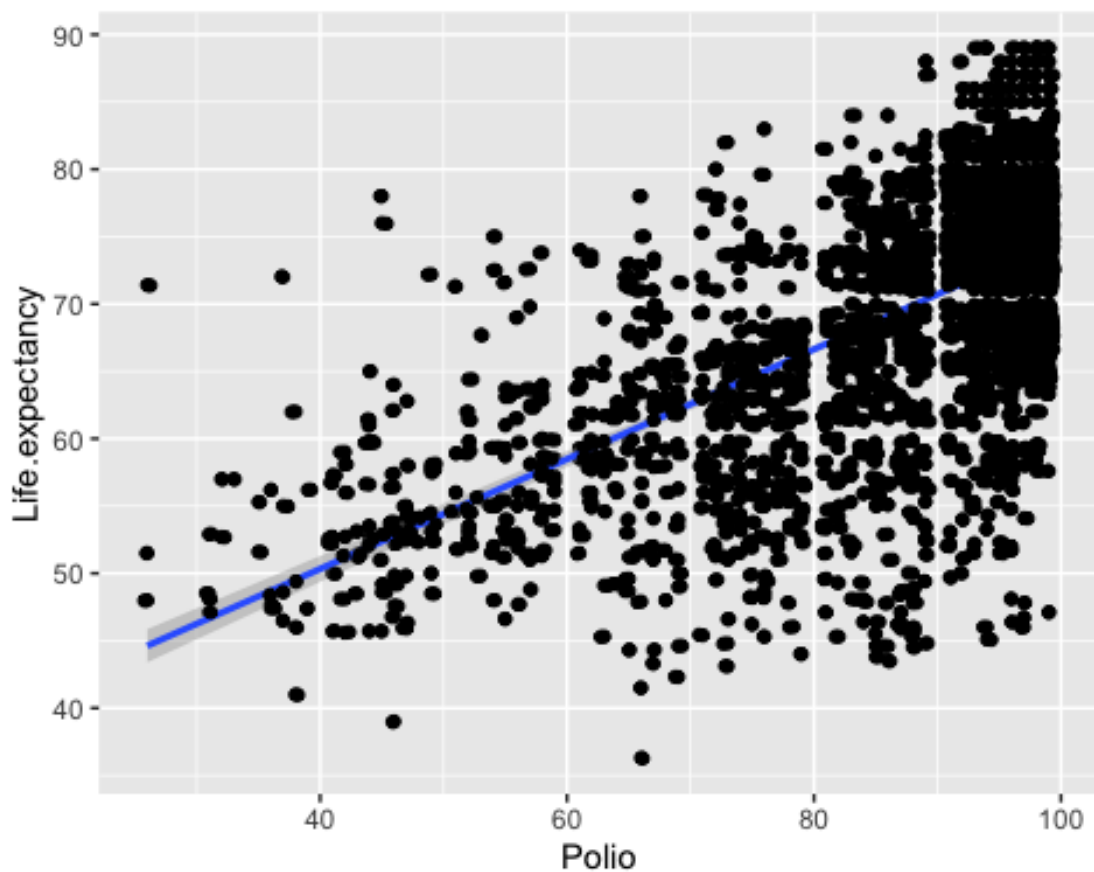
## `geom_smooth()` using formula 'y ~ x'
```



```
#similar to Diphtheria vaccination rates nothing below 25 should have a reasonable effect on total population
Polio_clean <- Polio1 %>% filter(Polio >= 25)
```

```
Polio_clean %>% ggplot(aes(x=Polio, y = Life.expectancy)) +geom_point() + geom_smooth(method = "lm") + geom_jitter()

## `geom_smooth()` using formula 'y ~ x'
```



```
poliooglm <- lm(Life.expectancy~Polio, data = lifeExpec)
summary(poliooglm)

##
## Call:
## lm(formula = Life.expectancy ~ Polio, data = lifeExpec)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -29.862  -4.870   1.275   5.309  29.597
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  53.704164   0.571041   94.05  <2e-16 ***
## Polio         0.188756   0.006655   28.36  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 8.404 on 2907 degrees of freedom
## (19 observations deleted due to missingness)
## Multiple R-squared:  0.2167, Adjusted R-squared:  0.2165
## F-statistic: 804.4 on 1 and 2907 DF, p-value: < 2.2e-16

attach(Polio_clean)

## The following objects are masked from HIV:
##
##      Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
```

```

## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from DIP_clean:
##
## Country, Diphtheria, Life.expectancy

## The following objects are masked from lifeExpec:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

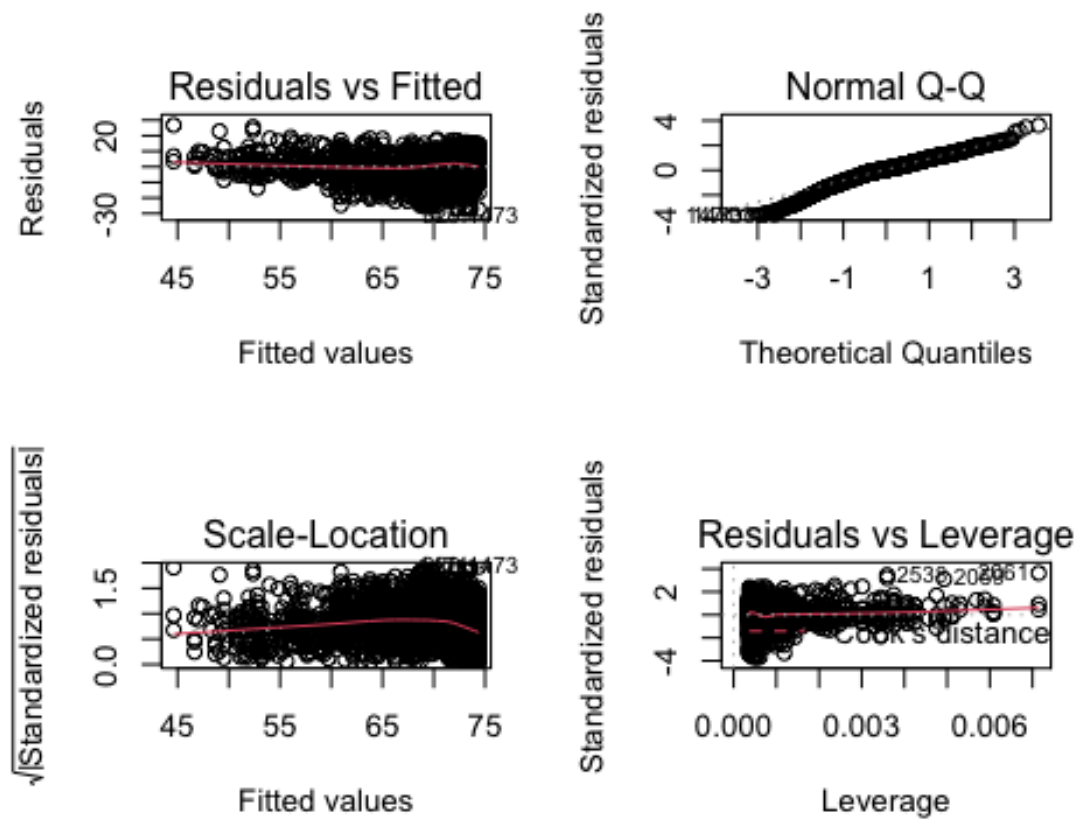
## The following objects are masked from GDP_clean:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from Alcohol_clean:
##
## Adult.Mortality, Alcohol, BMI, continent, Country, CountrytoMatch,
## Diphtheria, GDP, Hepatitis.B, HIV.AIDS,
## Income.composition.of.resources, infant.deaths, Life.expectancy,
## Measles, percentage.expenditure, Polio, Population, Schooling,
## Status, thinness..1.19.years, thinness.5.9.years,
## Total.expenditure, under.five.deaths, Year

## The following objects are masked from BMI_clean:
##
## BMI, Country, Life.expectancy

polioldm <-lm(Life.expectancy~Polio, data = Polio_clean)
plot(polioldm)

```



```
summary(poliolm)

##
## Call:
## lm(formula = Life.expectancy ~ Polio, data = Polio_clean)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -27.5679  -3.9944   0.6668   4.7244  26.7789
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  34.020834   0.879453   38.68  <2e-16 ***
## Polio         0.407701   0.009939   41.02  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.403 on 2732 degrees of freedom
## Multiple R-squared:  0.3811, Adjusted R-squared:  0.3809
## F-statistic: 1683 on 1 and 2732 DF, p-value: < 2.2e-16

#No drastic improvements adj R-Squared went from .22 to .38

#EDA for the life expectancy data

data <- lifeExpec
str(data)

## grouped_df [2,928 × 24] (S3: grouped_df/tbl_df/tbl/data.frame)
##  $ Country                : chr [1:2928] "Afghanistan" "Afghanistan" "Afghanistan" "Afghanistan" .
## ..
##  $ Year                    : int [1:2928] 2015 2014 2013 2012 2011 2010 2009 2008 2007 2006 ...
##  $ Status                  : chr [1:2928] "Developing" "Developing" "Developing" "Developing" ...
##  $ Life.expectancy         : num [1:2928] 65 59.9 59.9 59.5 59.2 58.8 58.6 58.1 57.5 57.3 ...
```

```

## $ Adult.Mortality : int [1:2928] 263 271 268 272 275 279 281 287 295 295 ...
## $ infant.deaths : int [1:2928] 62 64 66 69 71 74 77 80 82 84 ...
## $ Alcohol : num [1:2928] 0.01 0.01 0.01 0.01 0.01 0.01 0.01 0.01 0.03 0.02 0.03 ...
## $ percentage.expenditure : num [1:2928] 71.3 73.5 73.2 78.2 7.1 ...
## $ Hepatitis.B : int [1:2928] 65 62 64 67 68 66 63 64 63 64 ...
## $ Measles : int [1:2928] 1154 492 430 2787 3013 1989 2861 1599 1141 1990 ...
## $ BMI : num [1:2928] 19.1 18.6 18.1 17.6 17.2 16.7 16.2 15.7 15.2 14.7 ...
## $ under.five.deaths : int [1:2928] 83 86 89 93 97 102 106 110 113 116 ...
## $ Polio : int [1:2928] 6 58 62 67 68 66 63 64 63 58 ...
## $ Total.expenditure : num [1:2928] 8.16 8.18 8.13 8.52 7.87 9.2 9.42 8.33 6.73 7.43 ...
## $ Diphtheria : int [1:2928] 65 62 64 67 68 66 63 64 63 58 ...
## $ HIV.AIDS : num [1:2928] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 ...
## $ GDP : num [1:2928] 584.3 612.7 631.7 670 63.5 ...
## $ Population : num [1:2928] 33736494 327582 31731688 3696958 2978599 ...
## $ thinness..1.19.years : num [1:2928] 17.2 17.5 17.7 17.9 18.2 18.4 18.6 18.8 19 19.2 ...
## $ thinness.5.9.years : num [1:2928] 17.3 17.5 17.7 18 18.2 18.4 18.7 18.9 19.1 19.3 ...
## $ Income.composition.of.resources : num [1:2928] 0.479 0.476 0.47 0.463 0.454 0.448 0.434 0.433 0.415 0.40
5 ...
## $ Schooling : num [1:2928] 10.1 10 9.9 9.8 9.5 9.2 8.9 8.7 8.4 8.1 ...
## $ continent : chr [1:2928] "Asia" "Asia" "Asia" "Asia" ...
## $ CountrytoMatch : chr [1:2928] "Afghanistan" "Afghanistan" "Afghanistan" "Afghanistan" .
..
## - attr(*, "groups")= tibble [183 × 2] (S3: tbl_df/tbl/data.frame)
## ..$ Country: chr [1:183] "Afghanistan" "Albania" "Algeria" "Angola" ...
## ..$ .rows : list<int> [1:183]
## .. ..$ : int [1:16] 1 2 3 4 5 6 7 8 9 10 ...
## .. ..$ : int [1:16] 17 18 19 20 21 22 23 24 25 26 ...
## .. ..$ : int [1:16] 33 34 35 36 37 38 39 40 41 42 ...
## .. ..$ : int [1:16] 49 50 51 52 53 54 55 56 57 58 ...
## .. ..$ : int [1:16] 65 66 67 68 69 70 71 72 73 74 ...
## .. ..$ : int [1:16] 81 82 83 84 85 86 87 88 89 90 ...
## .. ..$ : int [1:16] 97 98 99 100 101 102 103 104 105 106 ...
## .. ..$ : int [1:16] 113 114 115 116 117 118 119 120 121 122 ...
## .. ..$ : int [1:16] 129 130 131 132 133 134 135 136 137 138 ...
## .. ..$ : int [1:16] 145 146 147 148 149 150 151 152 153 154 ...
## .. ..$ : int [1:16] 161 162 163 164 165 166 167 168 169 170 ...
## .. ..$ : int [1:16] 177 178 179 180 181 182 183 184 185 186 ...
## .. ..$ : int [1:16] 193 194 195 196 197 198 199 200 201 202 ...
## .. ..$ : int [1:16] 209 210 211 212 213 214 215 216 217 218 ...
## .. ..$ : int [1:16] 225 226 227 228 229 230 231 232 233 234 ...
## .. ..$ : int [1:16] 241 242 243 244 245 246 247 248 249 250 ...
## .. ..$ : int [1:16] 257 258 259 260 261 262 263 264 265 266 ...
## .. ..$ : int [1:16] 273 274 275 276 277 278 279 280 281 282 ...
## .. ..$ : int [1:16] 289 290 291 292 293 294 295 296 297 298 ...
## .. ..$ : int [1:16] 305 306 307 308 309 310 311 312 313 314 ...
## .. ..$ : int [1:16] 321 322 323 324 325 326 327 328 329 330 ...
## .. ..$ : int [1:16] 337 338 339 340 341 342 343 344 345 346 ...
## .. ..$ : int [1:16] 353 354 355 356 357 358 359 360 361 362 ...
## .. ..$ : int [1:16] 369 370 371 372 373 374 375 376 377 378 ...
## .. ..$ : int [1:16] 385 386 387 388 389 390 391 392 393 394 ...
## .. ..$ : int [1:16] 401 402 403 404 405 406 407 408 409 410 ...
## .. ..$ : int [1:16] 417 418 419 420 421 422 423 424 425 426 ...
## .. ..$ : int [1:16] 449 450 451 452 453 454 455 456 457 458 ...
## .. ..$ : int [1:16] 465 466 467 468 469 470 471 472 473 474 ...
## .. ..$ : int [1:16] 481 482 483 484 485 486 487 488 489 490 ...
## .. ..$ : int [1:16] 497 498 499 500 501 502 503 504 505 506 ...
## .. ..$ : int [1:16] 513 514 515 516 517 518 519 520 521 522 ...
## .. ..$ : int [1:16] 529 530 531 532 533 534 535 536 537 538 ...
## .. ..$ : int [1:16] 545 546 547 548 549 550 551 552 553 554 ...
## .. ..$ : int [1:16] 561 562 563 564 565 566 567 568 569 570 ...
## .. ..$ : int [1:16] 577 578 579 580 581 582 583 584 585 586 ...
## .. ..$ : int [1:16] 593 594 595 596 597 598 599 600 601 602 ...
## .. ..$ : int [1:16] 609 610 611 612 613 614 615 616 617 618 ...
## .. ..$ : int [1:16] 625 626 627 628 629 630 631 632 633 634 ...
## .. ..$ : int [1:16] 433 434 435 436 437 438 439 440 441 442 ...
## .. ..$ : int [1:16] 641 642 643 644 645 646 647 648 649 650 ...

```

```
## .. ..$ : int [1:16] 657 658 659 660 661 662 663 664 665 666 ...
## .. ..$ : int [1:16] 673 674 675 676 677 678 679 680 681 682 ...
## .. ..$ : int [1:16] 689 690 691 692 693 694 695 696 697 698 ...
## .. ..$ : int [1:16] 705 706 707 708 709 710 711 712 713 714 ...
## .. ..$ : int [1:16] 721 722 723 724 725 726 727 728 729 730 ...
## .. ..$ : int [1:16] 737 738 739 740 741 742 743 744 745 746 ...
## .. ..$ : int [1:16] 753 754 755 756 757 758 759 760 761 762 ...
## .. ..$ : int [1:16] 769 770 771 772 773 774 775 776 777 778 ...
## .. ..$ : int [1:16] 785 786 787 788 789 790 791 792 793 794 ...
## .. ..$ : int [1:16] 801 802 803 804 805 806 807 808 809 810 ...
## .. ..$ : int [1:16] 817 818 819 820 821 822 823 824 825 826 ...
## .. ..$ : int [1:16] 833 834 835 836 837 838 839 840 841 842 ...
## .. ..$ : int [1:16] 849 850 851 852 853 854 855 856 857 858 ...
## .. ..$ : int [1:16] 865 866 867 868 869 870 871 872 873 874 ...
## .. ..$ : int [1:16] 881 882 883 884 885 886 887 888 889 890 ...
## .. ..$ : int [1:16] 897 898 899 900 901 902 903 904 905 906 ...
## .. ..$ : int [1:16] 913 914 915 916 917 918 919 920 921 922 ...
## .. ..$ : int [1:16] 929 930 931 932 933 934 935 936 937 938 ...
## .. ..$ : int [1:16] 945 946 947 948 949 950 951 952 953 954 ...
## .. ..$ : int [1:16] 961 962 963 964 965 966 967 968 969 970 ...
## .. ..$ : int [1:16] 977 978 979 980 981 982 983 984 985 986 ...
## .. ..$ : int [1:16] 993 994 995 996 997 998 999 1000 1001 1002 ...
## .. ..$ : int [1:16] 1009 1010 1011 1012 1013 1014 1015 1016 1017 1018 ...
## .. ..$ : int [1:16] 1025 1026 1027 1028 1029 1030 1031 1032 1033 1034 ...
## .. ..$ : int [1:16] 1041 1042 1043 1044 1045 1046 1047 1048 1049 1050 ...
## .. ..$ : int [1:16] 1057 1058 1059 1060 1061 1062 1063 1064 1065 1066 ...
## .. ..$ : int [1:16] 1073 1074 1075 1076 1077 1078 1079 1080 1081 1082 ...
## .. ..$ : int [1:16] 1089 1090 1091 1092 1093 1094 1095 1096 1097 1098 ...
## .. ..$ : int [1:16] 1105 1106 1107 1108 1109 1110 1111 1112 1113 1114 ...
## .. ..$ : int [1:16] 1121 1122 1123 1124 1125 1126 1127 1128 1129 1130 ...
## .. ..$ : int [1:16] 1137 1138 1139 1140 1141 1142 1143 1144 1145 1146 ...
## .. ..$ : int [1:16] 1153 1154 1155 1156 1157 1158 1159 1160 1161 1162 ...
## .. ..$ : int [1:16] 1169 1170 1171 1172 1173 1174 1175 1176 1177 1178 ...
## .. ..$ : int [1:16] 1185 1186 1187 1188 1189 1190 1191 1192 1193 1194 ...
## .. ..$ : int [1:16] 1201 1202 1203 1204 1205 1206 1207 1208 1209 1210 ...
## .. ..$ : int [1:16] 1217 1218 1219 1220 1221 1222 1223 1224 1225 1226 ...
## .. ..$ : int [1:16] 1233 1234 1235 1236 1237 1238 1239 1240 1241 1242 ...
## .. ..$ : int [1:16] 1249 1250 1251 1252 1253 1254 1255 1256 1257 1258 ...
## .. ..$ : int [1:16] 1265 1266 1267 1268 1269 1270 1271 1272 1273 1274 ...
## .. ..$ : int [1:16] 1281 1282 1283 1284 1285 1286 1287 1288 1289 1290 ...
## .. ..$ : int [1:16] 1297 1298 1299 1300 1301 1302 1303 1304 1305 1306 ...
## .. ..$ : int [1:16] 1313 1314 1315 1316 1317 1318 1319 1320 1321 1322 ...
## .. ..$ : int [1:16] 1329 1330 1331 1332 1333 1334 1335 1336 1337 1338 ...
## .. ..$ : int [1:16] 1345 1346 1347 1348 1349 1350 1351 1352 1353 1354 ...
## .. ..$ : int [1:16] 1361 1362 1363 1364 1365 1366 1367 1368 1369 1370 ...
## .. ..$ : int [1:16] 1377 1378 1379 1380 1381 1382 1383 1384 1385 1386 ...
## .. ..$ : int [1:16] 1393 1394 1395 1396 1397 1398 1399 1400 1401 1402 ...
## .. ..$ : int [1:16] 1409 1410 1411 1412 1413 1414 1415 1416 1417 1418 ...
## .. ..$ : int [1:16] 1425 1426 1427 1428 1429 1430 1431 1432 1433 1434 ...
## .. ..$ : int [1:16] 1441 1442 1443 1444 1445 1446 1447 1448 1449 1450 ...
## .. ..$ : int [1:16] 1457 1458 1459 1460 1461 1462 1463 1464 1465 1466 ...
## .. ..$ : int [1:16] 1473 1474 1475 1476 1477 1478 1479 1480 1481 1482 ...
## .. ..$ : int [1:16] 1489 1490 1491 1492 1493 1494 1495 1496 1497 1498 ...
## .. ..$ : int [1:16] 1505 1506 1507 1508 1509 1510 1511 1512 1513 1514 ...
## .. ..$ : int [1:16] 1521 1522 1523 1524 1525 1526 1527 1528 1529 1530 ...
## .. ..$ : int [1:16] 1537 1538 1539 1540 1541 1542 1543 1544 1545 1546 ...
## .. ..$ : int [1:16] 1553 1554 1555 1556 1557 1558 1559 1560 1561 1562 ...
## .. ..$ : int [1:16] 1569 1570 1571 1572 1573 1574 1575 1576 1577 1578 ...
## .. .. [list output truncated]
## .. ..@ ptype: int(0)
## ..- attr(*, ".drop")= logi TRUE
```

```
summary(data)
```

```
##      Country      Year      Status      Life.expectancy
## Length:2928      Min.   :2000      Length:2928      Min.   :36.30
## Class :character  1st Qu.:2004      Class :character  1st Qu.:63.10
```

```

## Mode :character Median :2008 Mode :character Median :72.10
## Mean :2008 Mean :69.22
## 3rd Qu.:2011 3rd Qu.:75.70
## Max. :2015 Max. :89.00
##
## Adult.Mortality infant.deaths Alcohol percentage.expenditure
## Min. : 1.0 Min. : 0.00 Min. : 0.010 Min. : 0.000
## 1st Qu.: 74.0 1st Qu.: 0.00 1st Qu.: 0.905 1st Qu.: 4.854
## Median :144.0 Median : 3.00 Median : 3.770 Median : 65.611
## Mean :164.8 Mean : 30.41 Mean : 4.615 Mean : 740.321
## 3rd Qu.:228.0 3rd Qu.: 22.00 3rd Qu.: 7.715 3rd Qu.: 442.614
## Max. :723.0 Max. :1800.00 Max. :17.870 Max. :19479.912
## NA's :193
## Hepatitis.B Measles BMI under.five.deaths
## Min. : 1.00 Min. : 0.0 Min. : 1.00 Min. : 0.00
## 1st Qu.:77.00 1st Qu.: 0.0 1st Qu.:19.30 1st Qu.: 0.00
## Median :92.00 Median : 17.0 Median :43.35 Median : 4.00
## Mean :80.96 Mean : 2427.9 Mean :38.24 Mean : 42.18
## 3rd Qu.:97.00 3rd Qu.: 362.2 3rd Qu.:56.10 3rd Qu.: 28.00
## Max. :99.00 Max. :212183.0 Max. :77.60 Max. :2500.00
## NA's :553 NA's :32
## Polio Total.expenditure Diphtheria HIV.AIDS
## Min. : 3.00 Min. : 0.37 Min. : 2.00 Min. : 0.100
## 1st Qu.:78.00 1st Qu.: 4.26 1st Qu.:78.00 1st Qu.: 0.100
## Median :93.00 Median : 5.75 Median :93.00 Median : 0.100
## Mean :82.55 Mean : 5.93 Mean :82.32 Mean : 1.748
## 3rd Qu.:97.00 3rd Qu.: 7.49 3rd Qu.:97.00 3rd Qu.: 0.800
## Max. :99.00 Max. :17.60 Max. :99.00 Max. :50.600
## NA's :19 NA's :226 NA's :19
## GDP Population thinness..1.19.years
## Min. : 1.68 Min. :3.400e+01 Min. : 0.100
## 1st Qu.: 463.85 1st Qu.:1.967e+05 1st Qu.: 1.600
## Median : 1764.97 Median :1.392e+06 Median : 3.300
## Mean : 7494.21 Mean :1.276e+07 Mean : 4.851
## 3rd Qu.: 5932.90 3rd Qu.:7.427e+06 3rd Qu.: 7.200
## Max. :119172.74 Max. :1.294e+09 Max. :27.700
## NA's :443 NA's :644 NA's :32
## thinness.5.9.years Income.composition.of.resources Schooling
## Min. : 0.100 Min. :0.0000 Min. : 0.0
## 1st Qu.: 1.575 1st Qu.:0.4930 1st Qu.:10.1
## Median : 3.400 Median :0.6770 Median :12.3
## Mean : 4.881 Mean :0.6274 Mean :12.0
## 3rd Qu.: 7.200 3rd Qu.:0.7792 3rd Qu.:14.3
## Max. :28.600 Max. :0.9480 Max. :20.7
## NA's :32 NA's :160 NA's :160
## continent CountrytoMatch
## Length:2928 Length:2928
## Class :character Class :character
## Mode :character Mode :character
##
##
##
##
head(data, 5)

## # A tibble: 5 x 24
## # Groups: Country [1]
## Country Year Status Life.expectancy Adult.Mortality infant.deaths Alcohol
## <chr> <int> <chr> <dbl> <int> <int> <dbl>
## 1 Afghanis... 2015 Develop... 65 263 62 0.01
## 2 Afghanis... 2014 Develop... 59.9 271 64 0.01
## 3 Afghanis... 2013 Develop... 59.9 268 66 0.01
## 4 Afghanis... 2012 Develop... 59.5 272 69 0.01
## 5 Afghanis... 2011 Develop... 59.2 275 71 0.01
## # ... with 17 more variables: percentage.expenditure <dbl>, Hepatitis.B <int>,
## # Measles <int>, BMI <dbl>, under.five.deaths <int>, Polio <int>,

```

[illegible]

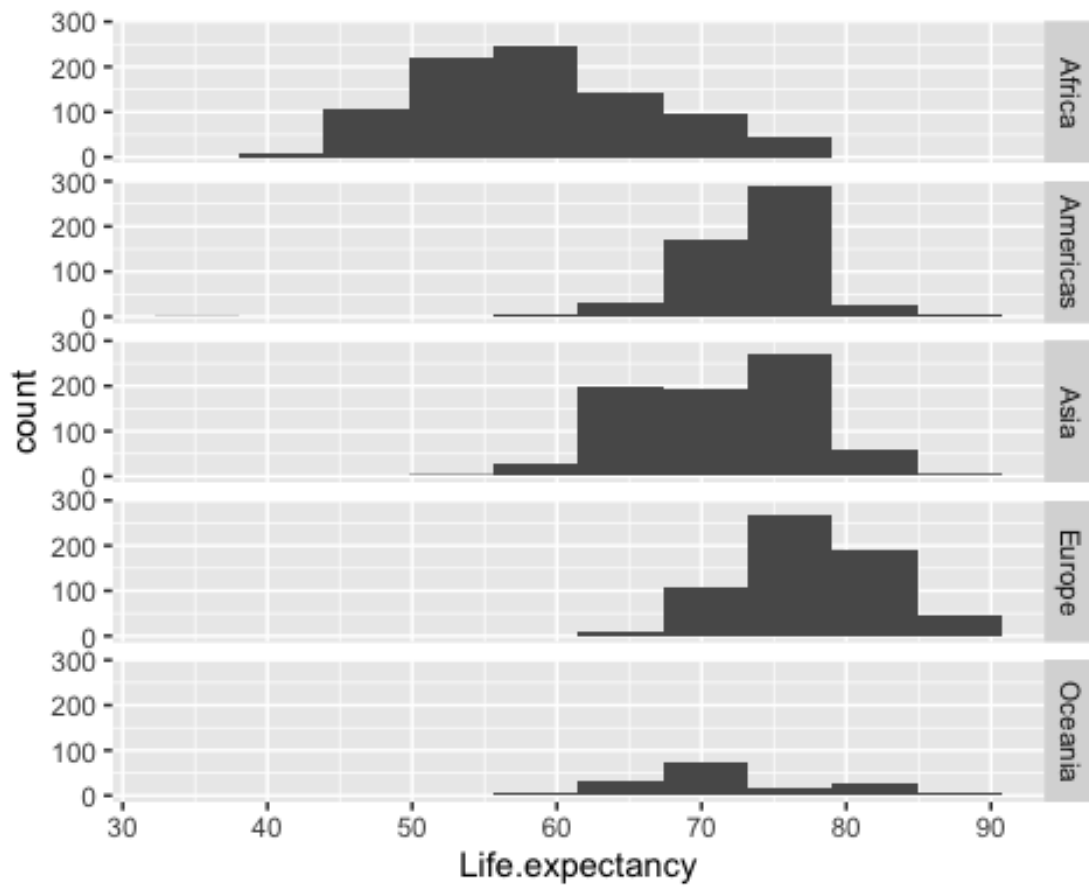

```
## [1962] 0 0 0 0 0 0 1 3 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 1
## [1999] 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 1 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0
## [2036] 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 3 1 1 1 1 1 1
## [2073] 1 1 1 1 1 1 1 1 6 4 4 4 4 4 4 4 4 4 4 4 4 4 6 4 4 4 4 4 4 4 4 4 4 4 4
## [2110] 4 4 4 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 0 0 1 2 0
## [2147] 0 0 0 0 0 0 0 0 0 0 0 0 0 1 1 4 2 2 2 2 2 2 2 2 2 2 2 2 3 3 4 2 2 2 2 2
## [2184] 2 2 2 2 2 2 3 3 3 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0
## [2221] 0 1 1 2 3 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 2 0 0 0 0 0 0 0 0 0 0 0 1 1 1 2
## [2258] 0 0 0 0 0 0 0 0 0 0 0 1 1 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0
## [2295] 0 0 0 1 1 1 1 1 1 1 2 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 4 2 2 2 2 2 2 2
## [2332] 2 2 2 2 2 3 1 1 1 1 1 1 1 1 1 1 1 1 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
## [2369] 5 4 4 6 6 6 6 6 6 6 6 6 6 6 6 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 5 5 5 5 6
## [2406] 8 8 8 9 9 9 9 9 9 9 9 9 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0
## [2443] 0 0 0 1 1 1 5 3 3 3 3 3 3 3 3 3 3 4 4 4 4 2 0 0 0 0 0 0 0 0 0 0 1 1 1 1
## [2480] 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 1 1 1 1 1 1 1 1 1 1 3 1 1 1
## [2517] 1 1 1 1 1 1 1 1 1 1 1 1 1 3 1 1 1 1 1 1 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0
## [2554] 0 0 0 0 0 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 4 2 2 2 2 2 2 2 2 2 3 3 3
## [2591] 3 3 2 0 0 0 0 0 0 0 1 1 1 1 1 1 3 3 2 0 0 0 0 0 0 0 0 1 1 1 1 1 1 2 0 0
## [2628] 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 1 1 2 0 0 0 0 0
## [2665] 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 0
## [2702] 0 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 3 1
## [2739] 1 1 1 1 1 1 1 1 1 1 1 1 1 6 5 5 5 5 5 5 5 5 5 5 5 5 5 5 6 4 4 4 4 4
## [2776] 4 4 4 4 4 4 4 5 6 4 4 4 4 4 4 4 4 4 4 4 4 4 4 4 4 4 2 0 0 0 0 0 0 0 0 0
## [2813] 0 0 0 0 2 0 0 0 0 0 0 0 0 0 0 0 0 1 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 4
## [2850] 2 2 2 2 2 2 2 2 2 2 2 2 2 2 4 2 2 2 2 2 2 2 2 2 2 2 2 3 3 3 4 2 2 2 2
## [2887] 2 2 2 2 2 2 2 2 2 2 2 0 0 0 0 0 0 0 0 0 0 1 1 1 1 1 2 0 0 0 0 0 0 0 0
## [2924] 0 0 0 0 0
```

```
apply(is.na(data), 2, sum)
```

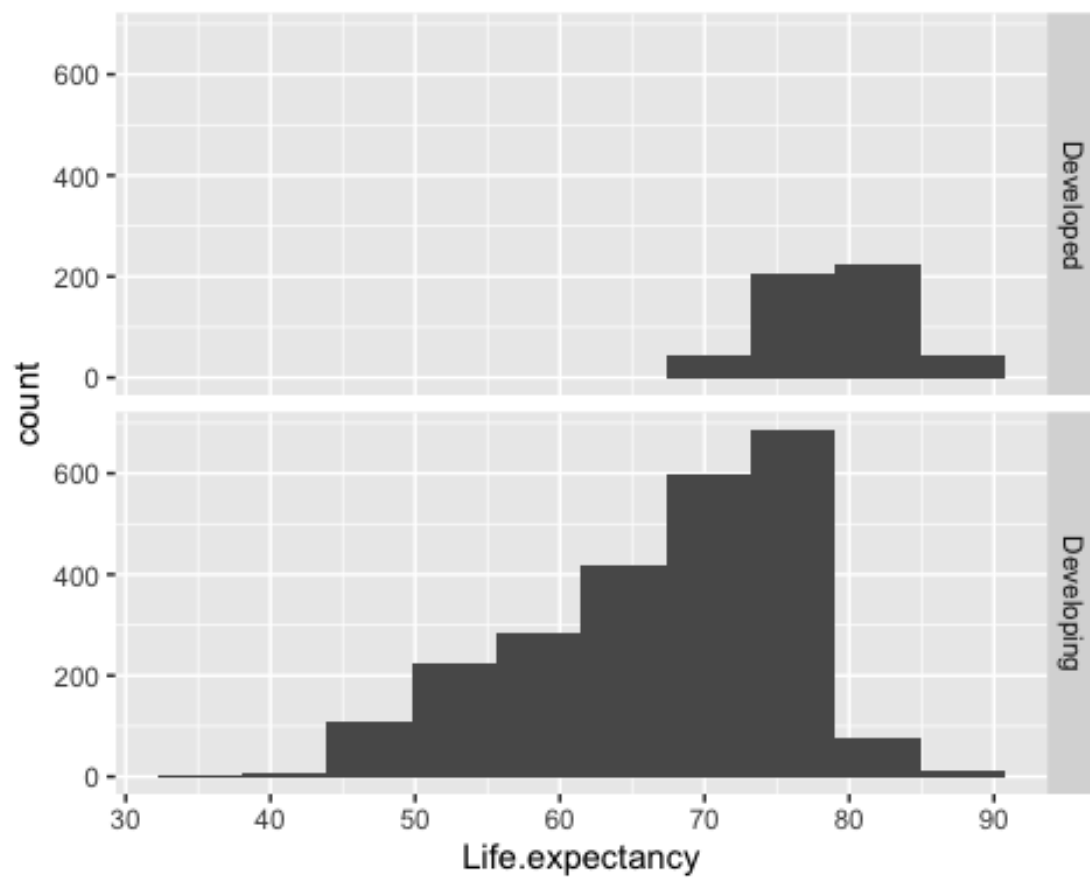
```
##          Country          Year
##          0          0
##          Status      Life.expectancy
##          0          0
##      Adult.Mortality      infant.deaths
##          0          0
##          Alcohol      percentage.expenditure
##          193          0
##      Hepatitis.B          Measles
##          553          0
##          BMI      under.five.deaths
##          32          0
##          Polio      Total.expenditure
##          19          226
##      Diphtheria      HIV.AIDS
##          19          0
##          GDP      Population
##          443          644
##      thinness..1.19.years      thinness.5.9.years
##          32          32
##      Income.composition.of.resources      Schooling
##          160          160
##          continent      CountrytoMatch
##          0          0
```

```
#life expectancy for all the countries
```

```
ggplot(data, aes(Life.expectancy)) + geom_histogram(bins = 10) + facet_grid(vars(continent))
```

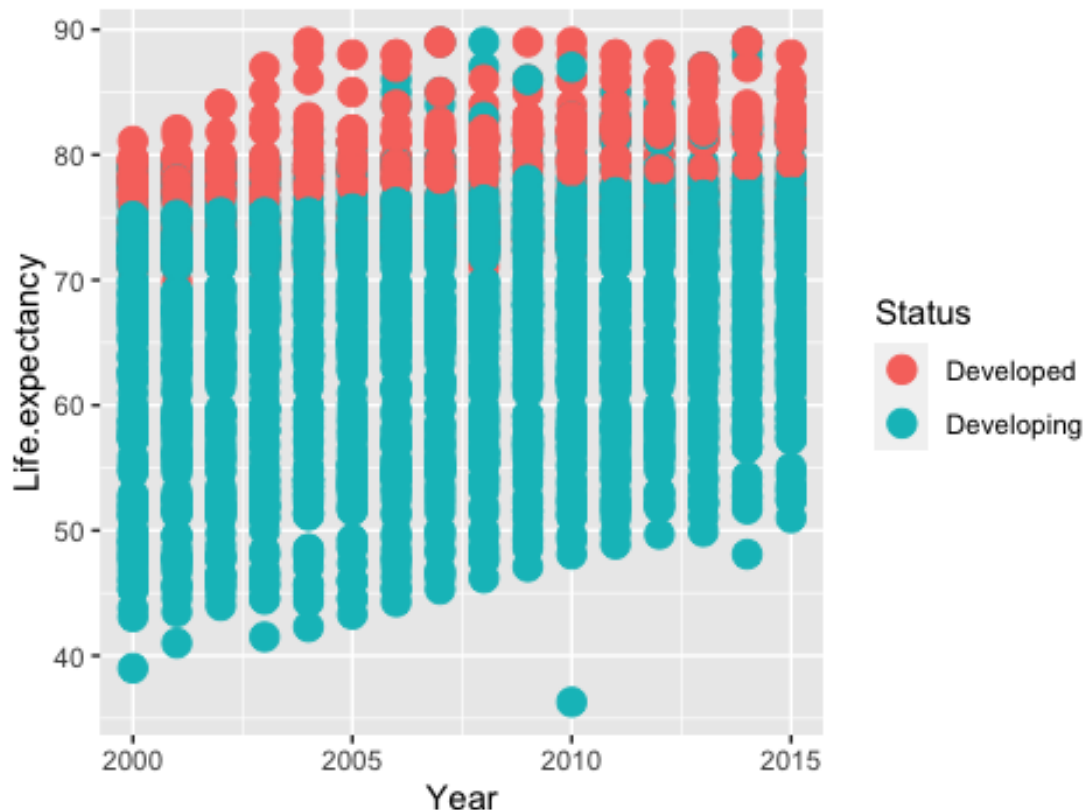


```
#life expectancy for developer vs developed  
ggplot(data, aes(Life expectancy)) + geom_histogram(bins = 10) + facet_grid(vars(Status))
```



```
#life expectancy year vs Life expectancy
ggplot(data, aes(Year, Life.expectancy, color = Status)) + geom_point(size = 4) + ggtitle(("Life Expectancy D
eveloping Countries vs Developed Countries"))
```

Life Expectancy Developing Countries vs Developed Co



#descriptive statistics removing the nas

```
data %>% drop_na(Life.expectancy) %>% group_by(Status) %>% summarize(Avg_lifexp = mean(Life.expectancy), Avg_ChildMort = mean(infant.deaths), Avg_AdultMort = mean(Adult.Mortality))
```

```
## # A tibble: 2 x 4
```

##	Status	Avg_lifexp	Avg_ChildMort	Avg_AdultMort
##	<chr>	<dbl>	<dbl>	<dbl>
## 1	Developed	79.2	1.49	79.7
## 2	Developing	67.1	36.5	183.

#descriptive statistics by continent

```
data %>% drop_na(Life.expectancy) %>% group_by(continent) %>% summarize(Avg_lifexp = mean(Life.expectancy), Avg_ChildMort = mean(infant.deaths), Avg_AdultMort = mean(Adult.Mortality))
```

```
## # A tibble: 5 x 4
```

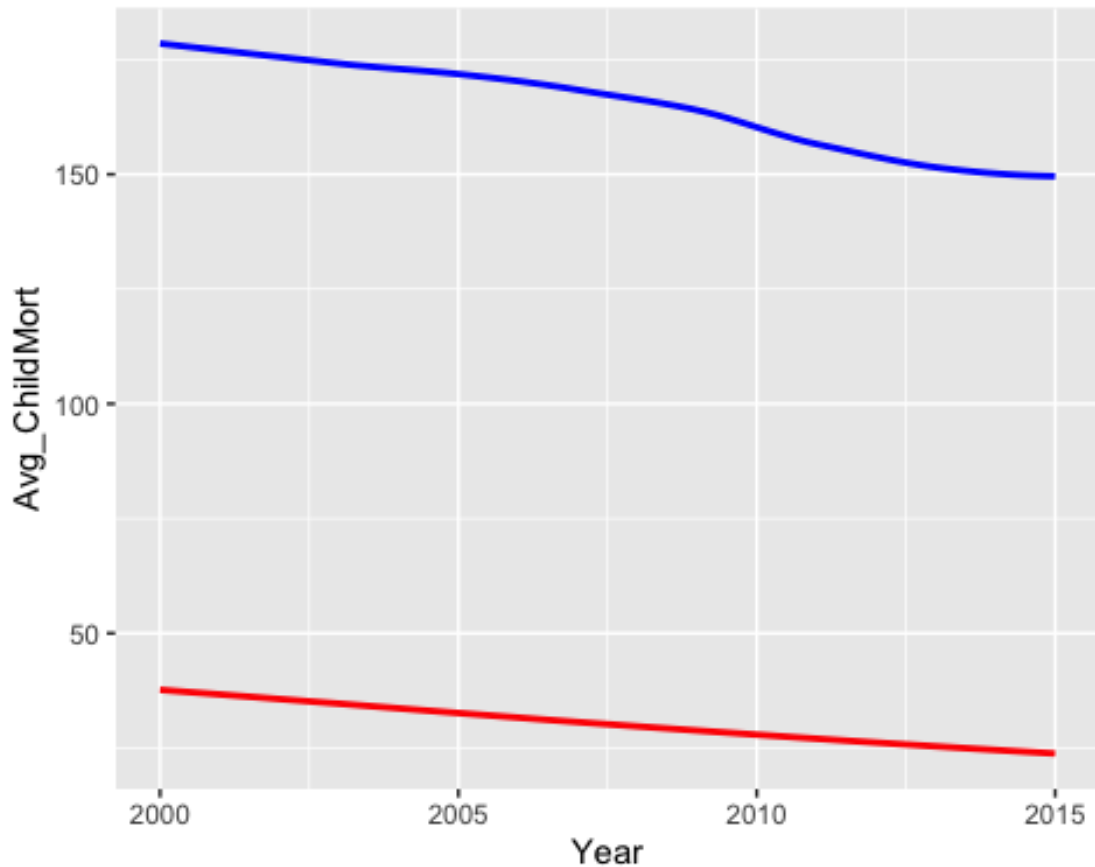
##	continent	Avg_lifexp	Avg_ChildMort	Avg_AdultMort
##	<chr>	<dbl>	<dbl>	<dbl>
## 1	Africa	58.6	44.2	267.
## 2	Americas	73.5	7.78	131.
## 3	Asia	71.2	60.9	133.
## 4	Europe	77.4	1.18	98.0
## 5	Oceania	71.2	1.16	135.

#life expectancy of the developed and developing countries

```
data %>% drop_na(Life.expectancy) %>% group_by(Year) %>% summarize(Avg_lifexp = mean(Life.expectancy), Avg_ChildMort = mean(infant.deaths), Avg_AdultMort = mean(Adult.Mortality)) %>% ggplot() + geom_smooth(aes(Year, Avg_ChildMort), color = 'red', se = FALSE) + geom_smooth(aes(Year, Avg_AdultMort), color = 'blue', se = FALSE)
```

```
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
```

```
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
```



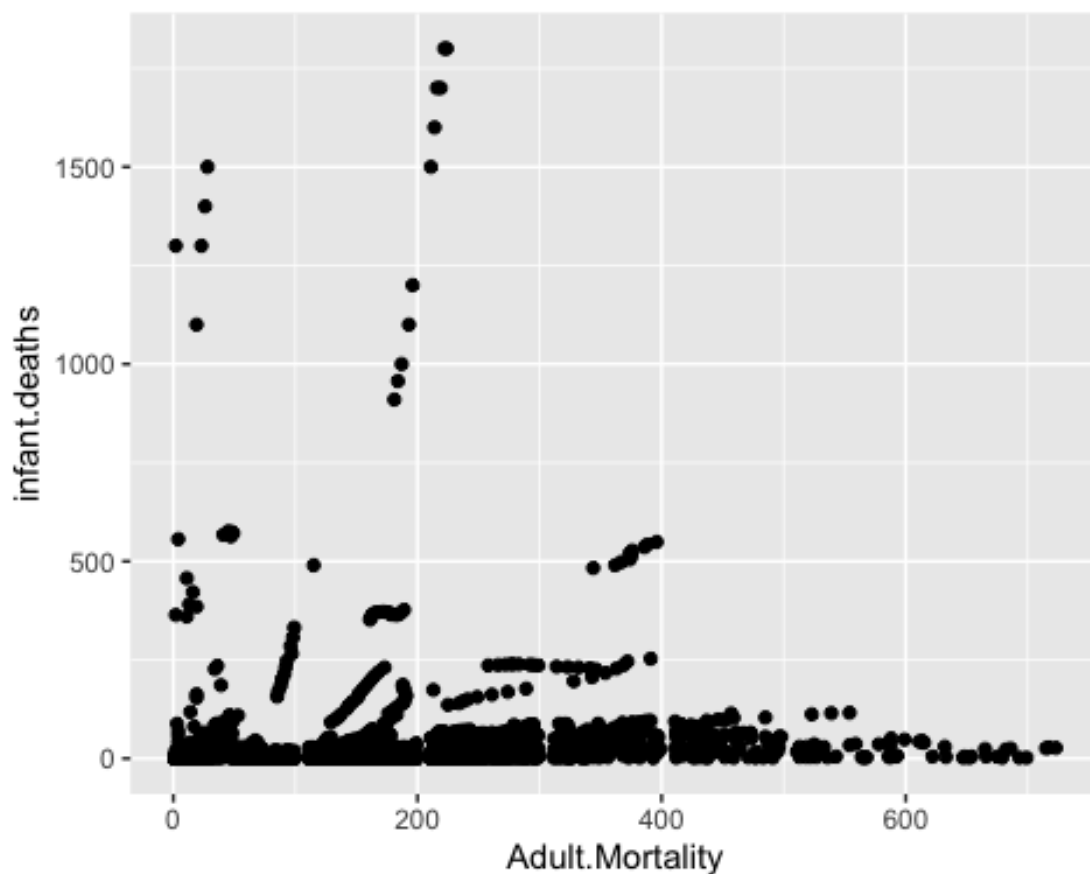
```
clean_data <- data %>% select(-continent, -Country, -Year, -Status)

## Adding missing grouping variables: `Country`

head(clean_data, 5)

## # A tibble: 5 x 21
## # Groups:   Country [1]
##   Country Life.expectancy Adult.Mortality infant.deaths Alcohol percentage.expe...
##   <chr>      <dbl>          <int>      <int>      <dbl>          <dbl>
## 1 Afghan...      65            263         62      0.01          71.3
## 2 Afghan...     59.9            271         64      0.01          73.5
## 3 Afghan...     59.9            268         66      0.01          73.2
## 4 Afghan...     59.5            272         69      0.01          78.2
## 5 Afghan...     59.2            275         71      0.01          7.10
## # ... with 15 more variables: Hepatitis.B <int>, Measles <int>, BMI <dbl>,
## #   under.five.deaths <int>, Polio <int>, Total.expenditure <dbl>,
## #   Diphtheria <int>, HIV.AIDS <dbl>, GDP <dbl>, Population <dbl>,
## #   thinness..1.19.years <dbl>, thinness.5.9.years <dbl>,
## #   Income.composition.of.resources <dbl>, Schooling <dbl>,
## #   CountrytoMatch <chr>

#relationship testing for adult mortality & infant deaths
ggplot(clean_data, aes(Adult.Mortality, infant.deaths )) + geom_point()
```



#correlation between Adult Mortality and Life Expectancy

```
clean_data %>% summarize(N = n(), cor(Adult.Mortality, as.integer(Life.expectancy), use = "pairwise.complete.
obs"))
```

```
## # A tibble: 183 x 3
```

```
##   Country      N `cor(Adult.Mortality, as.integer(Life.expectancy), use...
##   <chr>      <int>      <dbl>
## 1 Afghanistan    16      0.000470
## 2 Albania        16      0.567
## 3 Algeria        16     -0.470
## 4 Angola         16      0.376
## 5 Antigua and Ba... 16     -0.498
## 6 Argentina       16     -0.0769
## 7 Armenia        16     -0.419
## 8 Australia       16     -0.228
## 9 Austria        16     -0.313
## 10 Azerbaijan     16     -0.115
## # ... with 173 more rows
```

```
clean_data %>% summarize(N = n(), cor(Adult.Mortality, infant.deaths, use = "pairwise.complete.obs"))
```

```
## # A tibble: 183 x 3
```

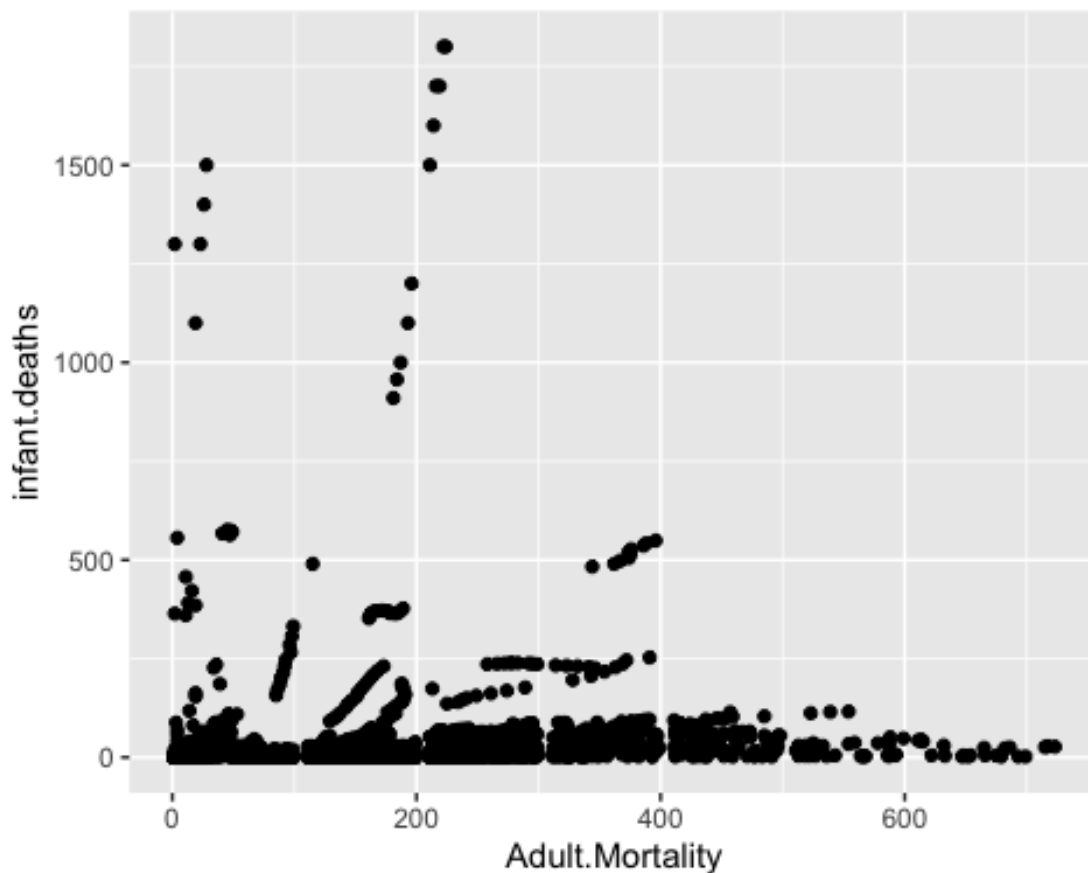
```
##   Country      N `cor(Adult.Mortality, infant.deaths, use = "pairwise....
##   <chr>      <int>      <dbl>
## 1 Afghanistan    16     -0.0796
## 2 Albania        16     -0.407
## 3 Algeria        16     -0.111
## 4 Angola         16     -0.334
## 5 Antigua and Bar... 16      NA
## 6 Argentina       16      0.290
## 7 Armenia        16      NA
## 8 Australia       16      NA
## 9 Austria        16      NA
```

```
## 10 Azerbaijan          16          -0.0913
## # ... with 173 more rows

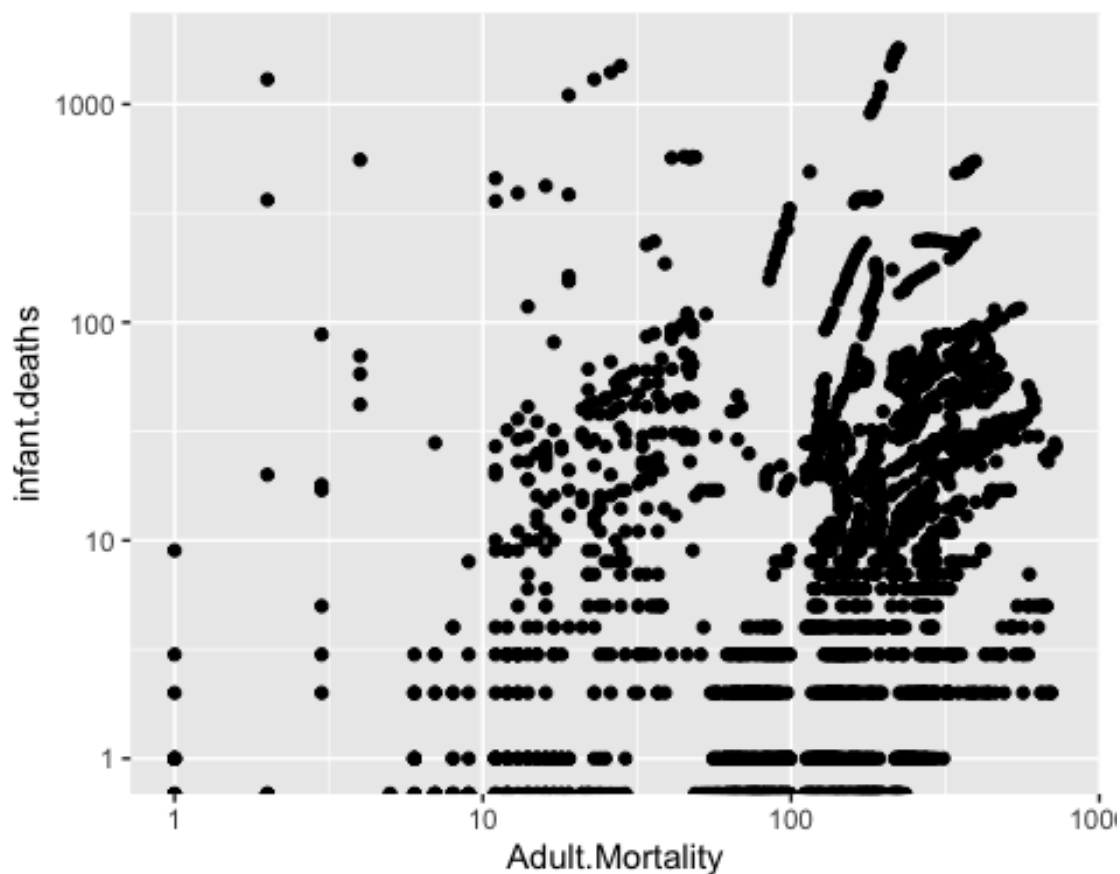
clean_data %>% summarize(N = n(), cor(log(Adult.Mortality), log(infant.deaths), use = "pairwise.complete.obs"
))

## # A tibble: 183 x 3
##   Country          N `cor(log(Adult.Mortality), log(infant.deaths), use = "...
##   <chr>          <int>          <dbl>
## 1 Afghanistan      16          -0.225
## 2 Albania           16           NaN
## 3 Algeria           16         -0.0444
## 4 Angola            16         -0.385
## 5 Antigua and Ba...  16           NaN
## 6 Argentina         16          0.199
## 7 Armenia           16           NA
## 8 Australia         16           NA
## 9 Austria           16           NaN
## 10 Azerbaijan       16         -0.125
## # ... with 173 more rows

#relationship testing for adult mortality & infant deaths
ggplot(clean_data, aes(Adult.Mortality, infant.deaths)) + geom_point()
```

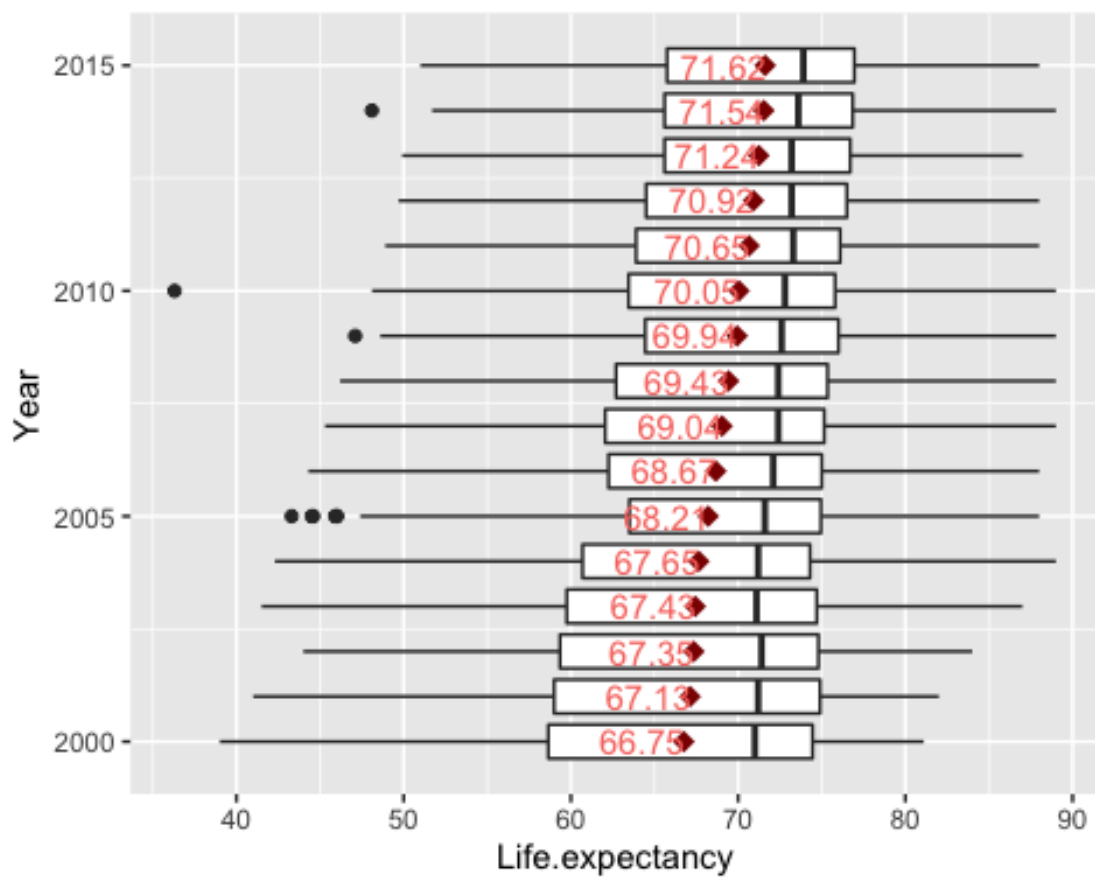


```
ggplot(clean_data, aes(Adult.Mortality, infant.deaths)) + geom_point() + scale_x_log10() + scale_y_log10()
```

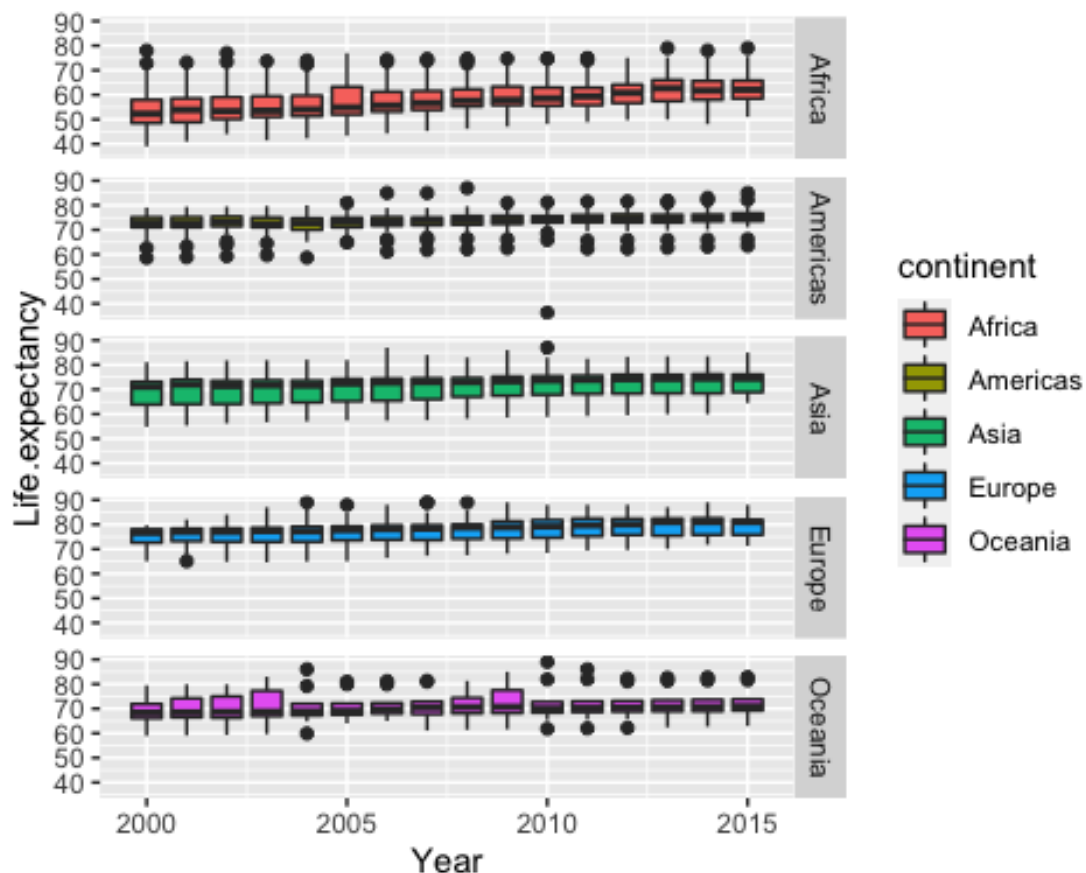


```
# Boxplot of life expectancy vs. year shows that both mean and median of life expectancy is increasing every
year since average (mean) 66.75 in 2000 to average (mean) 71.62 in 2015
Life.expectancy_means <- aggregate(Life.expectancy ~ Year, lifeExpec, mean)

lifeExpec %>% ggplot(aes(x=Year, y=Life.expectancy, group=Year)) +
  geom_boxplot() +
  stat_summary(fun=mean, colour="darkred", geom="point",
              shape=18, size=3, show.legend=FALSE) +
  geom_text(data=Life.expectancy_means, aes(label = format(round(Life.expectancy, 2), nsmall = 2), y = Life.e
xpectancy - 2.5, col = "darkred")) +
  theme(legend.position = "none") +
  coord_flip()
```

```
# Boxplot of life expectancy vs. continent also shows life expectancy increasing trend
lifeExpec %>% ggplot(aes(x=Year, y=Life.expectancy, group=Year)) +
  geom_boxplot(aes(fill=continent)) +
  facet_grid(continent ~ .)
```



World map displays Life expectancy in general (median value from 2000 - 2015) for each country. Africa has the lowest Life expectancy, follows by Asia.

```
medianExpec <- aggregate(lifeExpec[, 4], list(lifeExpec$CountrytoMatch), median)
names(medianExpec)[names(medianExpec)=="Group.1"] <- "Country"

countryMap <- joinCountryData2Map(lifeExpec, joinCode = "NAME", nameJoinColumn = "Country")

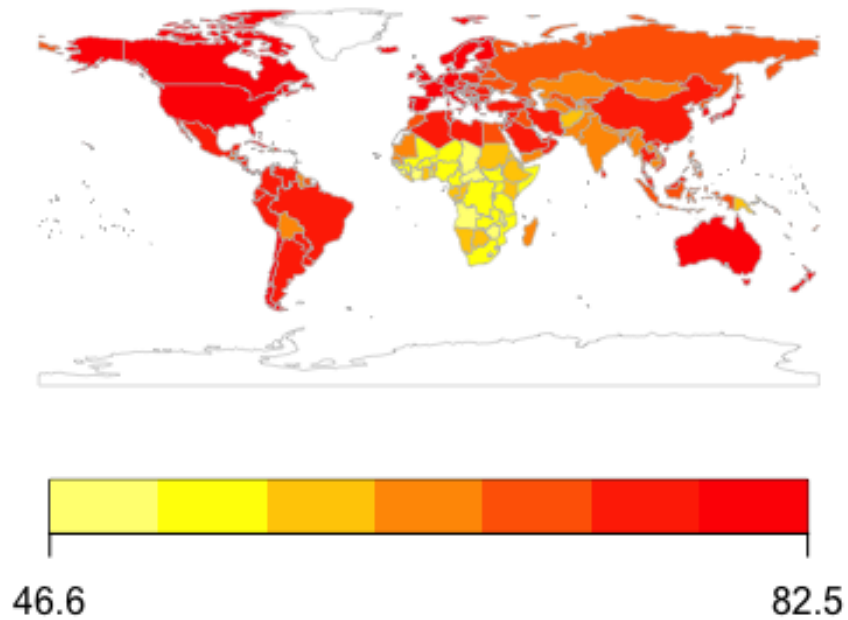
## 2880 codes from your data successfully matched countries in the map
## 48 codes from your data failed to match with a country code in the map
## 63 codes from the map weren't represented in your data

map <- joinCountryData2Map(
  medianExpec,
  joinCode = "NAME",
  nameJoinColumn = "Country",
  verbose = TRUE
)

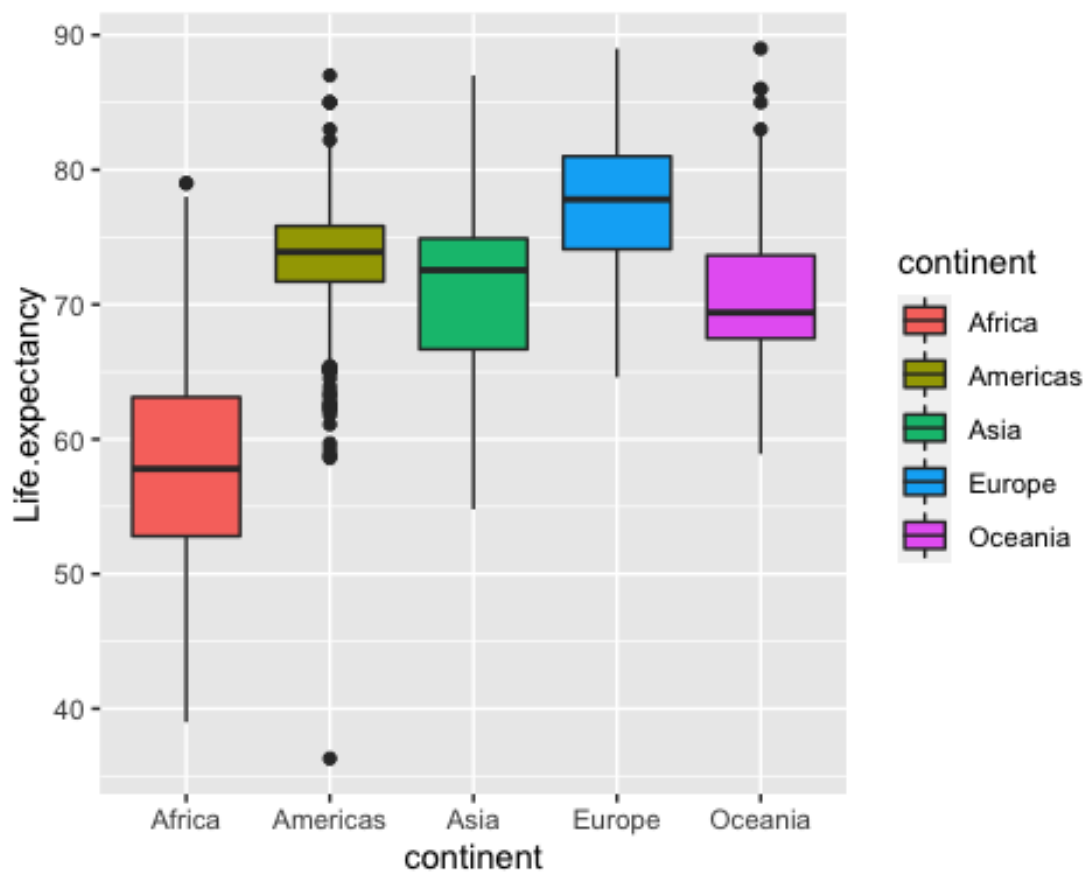
## 183 codes from your data successfully matched countries in the map
## 0 codes from your data failed to match with a country code in the map
## failedCodes failedCountries
## 60 codes from the map weren't represented in your data

mapCountryData(map,
  mapTitle = "Median Life Expectancy (2000 - 2015)",
  nameColumnToPlot = "Life.expectancy",
  catMethod = "fixedWidth"
)
```

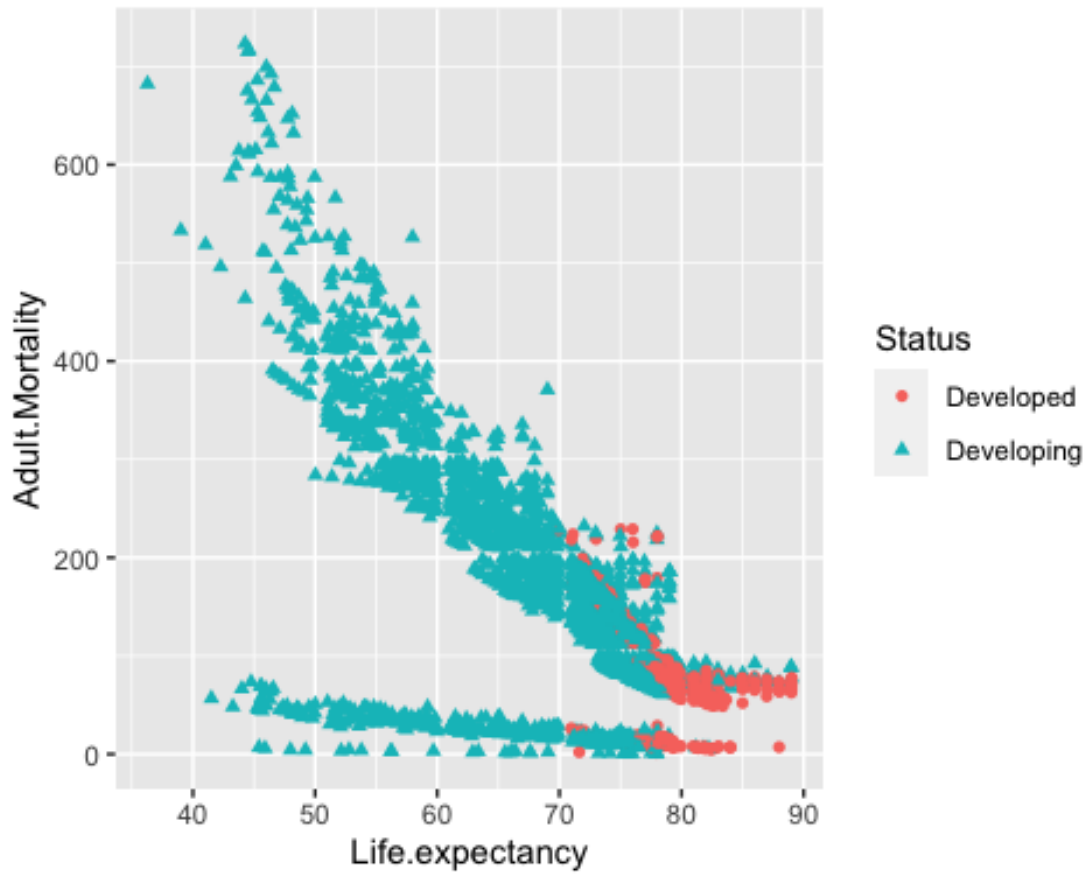
Median Life Expectancy (2000 - 2015)



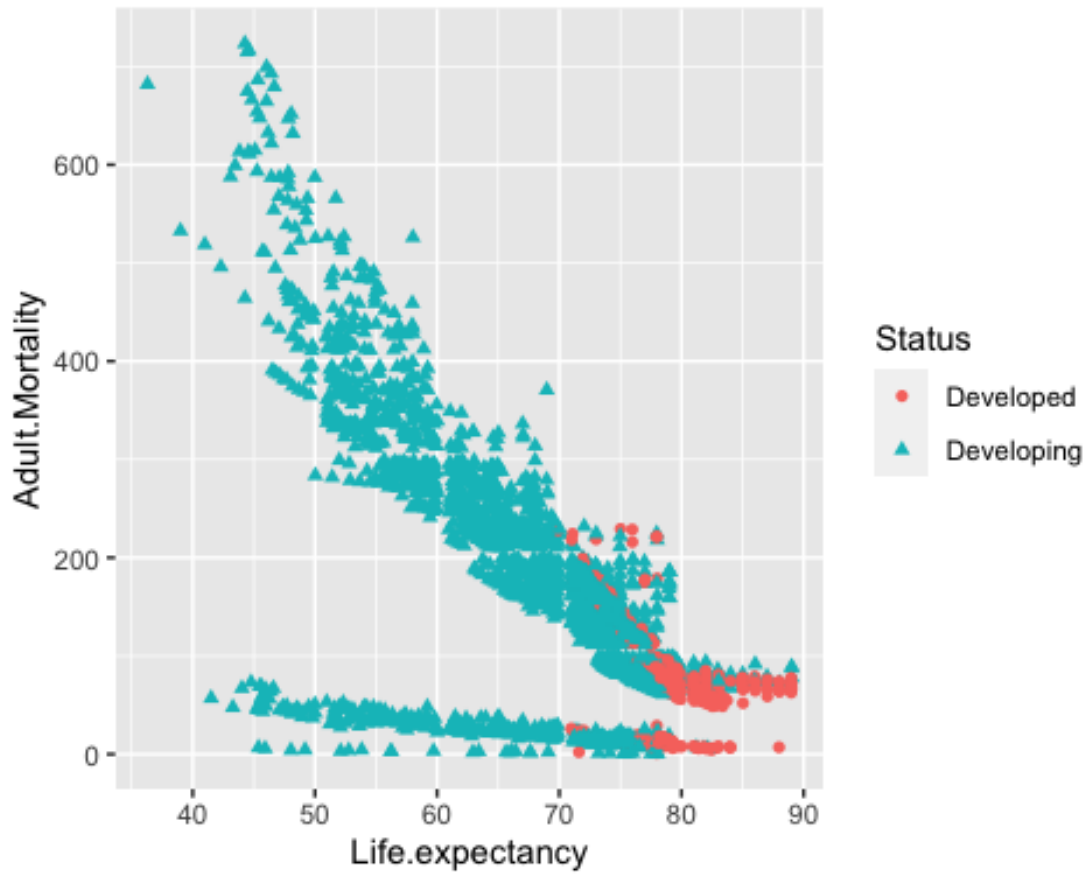
```
# Boxplot life expectancy vs. continent also shows the same trend
lifeExpec %>% ggplot(aes(x=continent, y=Life.expectancy)) +
  geom_boxplot(aes(fill=continent))
```



```
# Scatter plot Life expectancy vs. adult mortality color code by countrys' status.
lifeExpec %>% ggplot(aes(x=Life.expectancy, y=Adult.Mortality, shape=Status, color=Status)) +
  geom_jitter()
```

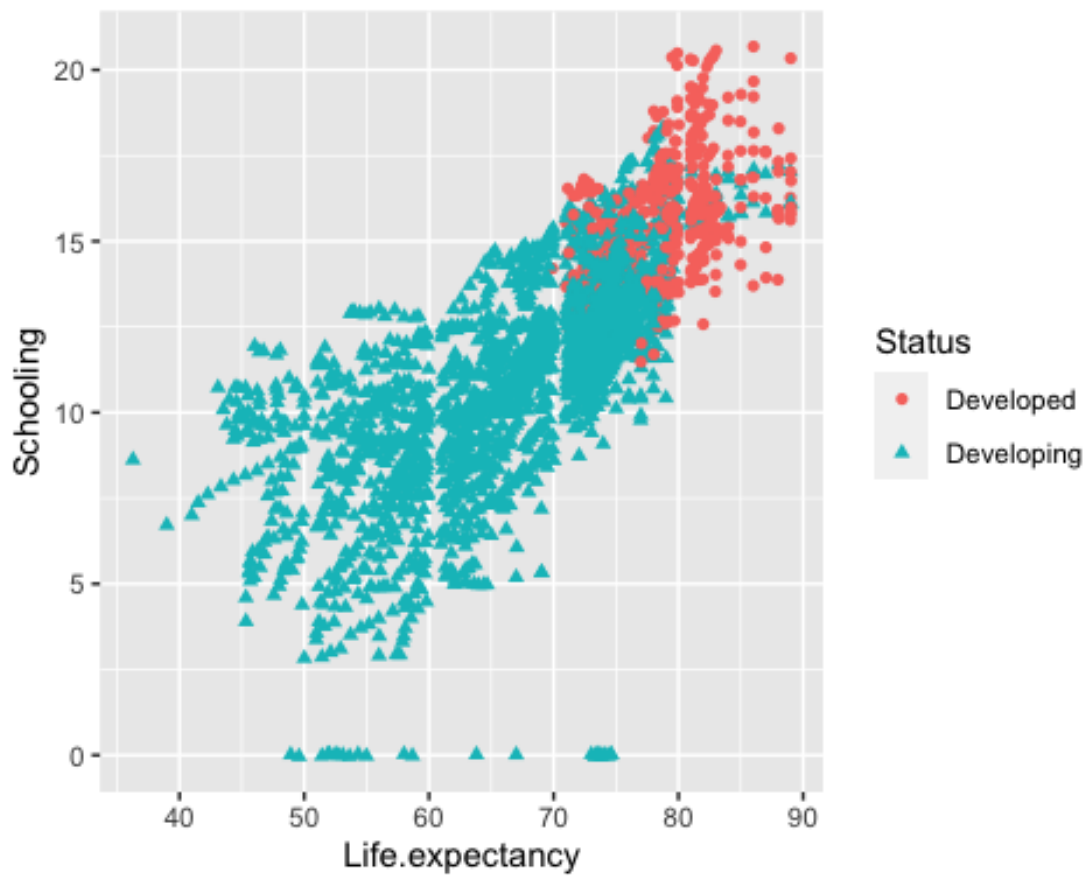


```
# Scatter plot Life expectancy vs. adult mortality color code by countrys' status.  
lifeExpec %>% ggplot(aes(x=Life.expectancy, y=Adult.Mortality, shape=Status, color=Status)) +  
  geom_jitter()
```

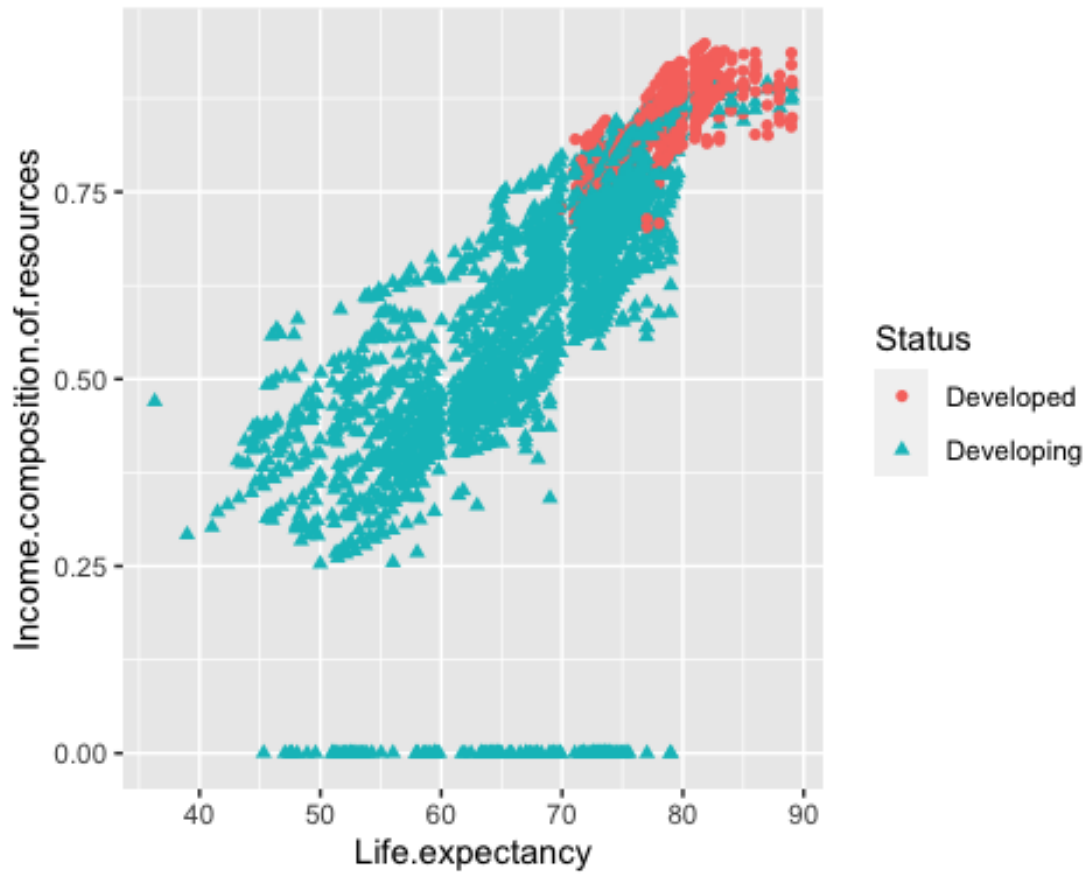


```
lifeExpec %>% ggplot(aes(x=Life.expectancy, y=Schooling, shape=Status, color=Status)) +  
  geom_jitter()
```

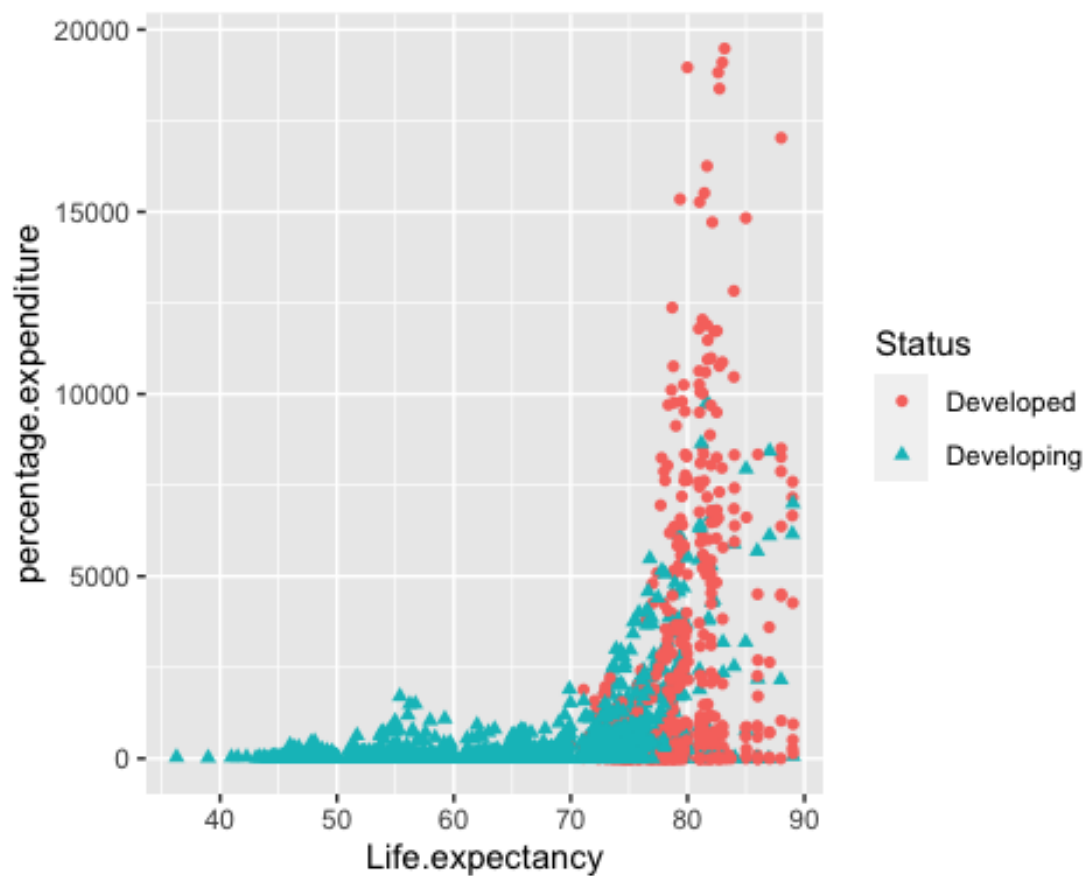
```
## Warning: Removed 160 rows containing missing values (geom_point).
```



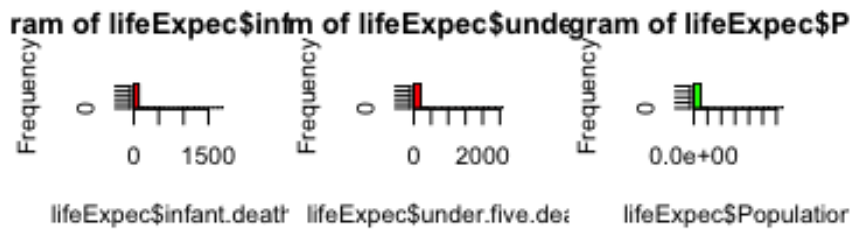
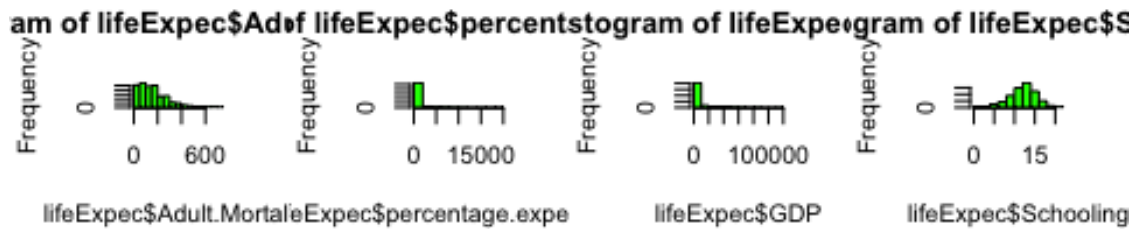
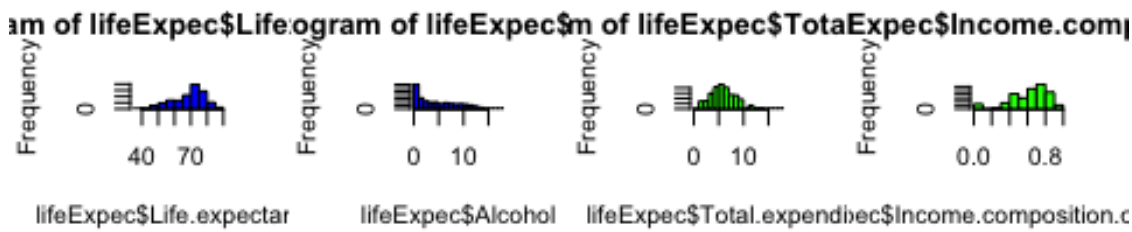
```
lifeExpec %>% ggplot(aes(x=Life.expectancy, y=Income.composition.of.resources, shape=Status, color=Status)) +  
  geom_jitter()  
## Warning: Removed 160 rows containing missing values (geom_point).
```



```
lifeExpec %>% ggplot(aes(x=Life.expectancy, y=percentage.expenditure, shape=Status, color=Status)) +  
  geom_jitter()
```

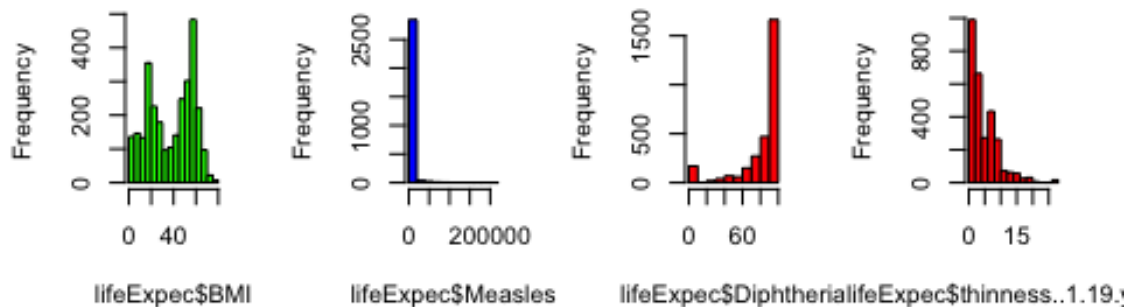



```
par("mfcol"=c(3, 4))
hist(lifeExpec$Life.expectancy, col="blue")
hist(lifeExpec$Adult.Mortality, col="green")
hist(lifeExpec$infant.deaths, col="red")
hist(lifeExpec$Alcohol, col="blue")
hist(lifeExpec$percentage.expenditure, col="green")
hist(lifeExpec$under.five.deaths, col="red")
hist(lifeExpec$Total.expenditure, col="green")
hist(lifeExpec$GDP, col="green")
hist(lifeExpec$Population, col="green")
hist(lifeExpec$Income.composition.of.resources, col="green")
hist(lifeExpec$Schooling, col="green")
par("mfcol"=c(1, 1))
```

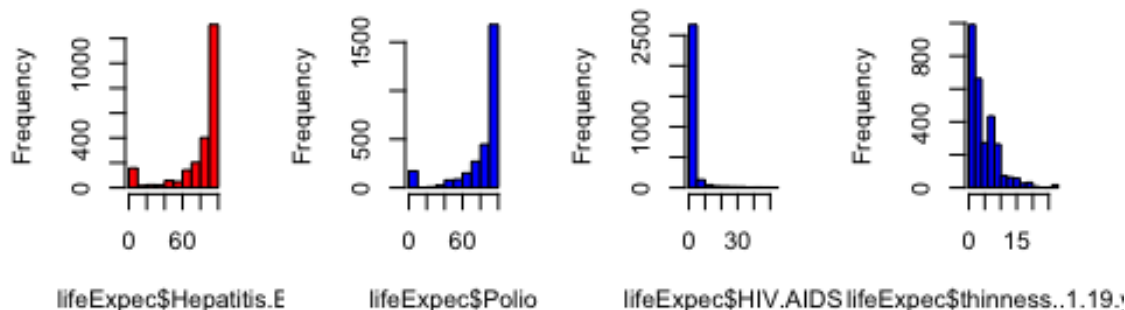


```
par("mfcol"=c(2, 4))
hist(lifeExpect$BMI, col="green")
hist(lifeExpect$Hepatitis.B, col="red")
hist(lifeExpect$Measles, col="blue")
hist(lifeExpect$Polio, col="blue")
hist(lifeExpect$Diphtheria, col="red")
hist(lifeExpect$HIV.AIDS, col="blue")
hist(lifeExpect$thinness..1.19.years, col="red")
hist(lifeExpect$thinness..1.19.years, col="blue")
```

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```
par("mfcol"=c(1, 1))
```

Final Dataset

Final dataset, lifeExpec_final, only includes Life.expectancy, Status, continent, BMI, HIV.AIDS, GDP, Income.composition.of.resources, and Schooling

```
lifeExpec_final <- subset(lifeExpec, select = -c(Country, CountrytoMatch, Year, Adult.Mortality, Alcohol, percentage.expenditure, infant.deaths, Hepatitis.B, Measles, under.five.deaths, Total.expenditure, Population, thinness..1.19.years, thinness.5.9.years, Polio, Diphtheria))
```

```
summary(lifeExpec_final)
```

```
##      Status      Life.expectancy      BMI      HIV.AIDS
## Length:2928   Min.   :36.30   Min.    : 1.00   Min.    : 0.100
## Class :character 1st Qu.:63.10   1st Qu.:19.30   1st Qu.: 0.100
## Mode  :character Median :72.10   Median :43.35   Median : 0.100
##              Mean   :69.22   Mean   :38.24   Mean   : 1.748
##              3rd Qu.:75.70   3rd Qu.:56.10   3rd Qu.: 0.800
##              Max.   :89.00   Max.   :77.60   Max.   :50.600
##              NA's    :32
##      GDP      Income.composition.of.resources      Schooling
## Min.   : 1.68   Min.   :0.0000   Min.   : 0.0
## 1st Qu.: 463.85 1st Qu.:0.4930   1st Qu.:10.1
## Median : 1764.97 Median :0.6770   Median :12.3
## Mean   : 7494.21 Mean   :0.6274   Mean   :12.0
## 3rd Qu.: 5932.90 3rd Qu.:0.7792   3rd Qu.:14.3
## Max.   :119172.74 Max.   :0.9480   Max.   :20.7
## NA's   :443     NA's   :160     NA's   :160
## continent
## Length:2928
## Class :character
## Mode  :character
```

```
##
##
##
##

# Lowest BMI to survive is 12 so we replace everything <12 and NA with overall mean BMI then Log transform
lifeExpec_final$BMI <- replace(lifeExpec_final$BMI, lifeExpec_final$BMI < 12, NA)

lifeExpec_final$BMI[is.na(lifeExpec_final$BMI)]<-mean(lifeExpec_final$BMI,na.rm=TRUE)
lifeExpec_final$BMI

##      [1] 19.10000 18.60000 18.10000 17.60000 17.20000 16.70000 16.20000 15.70000
##      [9] 15.20000 14.70000 14.20000 13.80000 13.40000 13.00000 12.60000 12.20000
##     [17] 58.00000 57.20000 56.50000 55.80000 55.10000 54.30000 53.50000 52.60000
##     [25] 51.70000 41.95655 49.90000 48.90000 47.90000 46.90000 46.00000 45.00000
##     [33] 59.50000 58.40000 57.20000 56.10000 55.00000 53.90000 52.80000 51.80000
##     [41] 41.95655 49.80000 48.90000 47.90000 47.00000 46.10000 45.30000 44.40000
##     [49] 23.30000 22.70000 22.10000 21.50000 21.00000 41.95655 19.80000 19.30000
##     [57] 18.80000 18.20000 17.70000 17.20000 16.80000 16.30000 15.80000 15.40000
##     [65] 47.70000 47.00000 46.40000 45.70000 45.10000 44.40000 43.80000 43.20000
##     [73] 42.60000 42.00000 41.40000 41.95655 41.95655 39.50000 38.90000 38.20000
##     [81] 62.80000 62.20000 61.60000 61.00000 41.95655 59.80000 59.20000 58.60000
##     [89] 58.00000 57.50000 56.90000 56.30000 55.70000 55.10000 54.60000 54.00000
##     [97] 54.90000 54.10000 53.30000 52.60000 51.90000 51.20000 41.95655 41.95655
##    [105] 49.70000 49.20000 48.80000 48.40000 48.10000 47.80000 47.40000 47.10000
##    [113] 66.60000 66.10000 65.50000 65.00000 64.40000 63.90000 63.40000 62.90000
##    [121] 62.50000 62.00000 61.50000 41.95655 41.95655 59.60000 59.00000 58.20000
##    [129] 57.60000 57.10000 56.60000 56.10000 55.70000 55.20000 54.70000 54.20000
##    [137] 53.70000 53.20000 52.70000 52.20000 51.70000 51.20000 41.95655 41.95655
##    [145] 52.50000 51.50000 41.95655 49.70000 48.80000 48.00000 47.30000 46.60000
##    [153] 45.90000 45.30000 44.70000 44.20000 43.60000 43.10000 42.60000 42.10000
##    [161] 64.50000 63.80000 63.20000 62.60000 62.00000 61.30000 41.95655 41.95655
##    [169] 59.40000 58.70000 58.10000 57.40000 56.70000 56.00000 55.20000 54.40000
##    [177] 63.60000 62.90000 62.20000 61.50000 41.95655 41.95655 59.30000 58.50000
##    [185] 57.60000 56.80000 56.10000 55.60000 55.20000 55.00000 54.80000 54.50000
##    [193] 18.30000 17.70000 17.00000 16.40000 15.80000 15.20000 14.60000 14.00000
##    [201] 13.50000 13.00000 12.50000 12.00000 41.95655 41.95655 41.95655 41.95655
##    [209] 54.50000 53.70000 53.00000 52.20000 51.40000 41.95655 49.90000 49.20000
##    [217] 48.40000 47.70000 46.90000 46.20000 45.40000 44.60000 43.80000 43.00000
##    [225] 62.30000 61.70000 61.10000 41.95655 59.90000 59.30000 58.70000 58.20000
##    [233] 57.70000 57.20000 56.70000 56.20000 55.80000 55.30000 54.90000 54.40000
##    [241] 63.70000 63.40000 63.00000 62.60000 62.30000 61.90000 61.60000 61.30000
##    [249] 41.95655 41.95655 41.95655 59.80000 59.40000 59.00000 58.50000 58.10000
##    [257] 41.95655 41.95655 49.30000 48.50000 47.80000 47.00000 46.30000 45.70000
##    [265] 45.00000 44.40000 43.80000 43.20000 42.60000 42.00000 41.40000 41.95655
##    [273] 25.70000 25.20000 24.60000 24.10000 23.50000 23.00000 22.50000 22.00000
##    [281] 21.50000 21.00000 41.95655 41.95655 19.70000 19.20000 18.80000 18.40000
##    [289] 24.50000 23.60000 22.70000 21.90000 21.10000 41.95655 19.50000 18.80000
##    [297] 18.00000 17.40000 16.70000 16.10000 15.50000 14.90000 14.40000 13.90000
##    [305] 52.60000 51.90000 51.20000 41.95655 49.90000 49.30000 48.60000 48.00000
##    [313] 47.30000 46.70000 46.00000 45.40000 44.70000 44.00000 43.30000 42.60000
##    [321] 55.80000 55.30000 54.70000 54.20000 53.70000 53.10000 52.60000 52.10000
##    [329] 51.50000 51.00000 41.95655 49.90000 49.40000 48.80000 48.20000 47.60000
##    [337] 37.90000 37.30000 36.80000 36.20000 35.70000 35.20000 34.70000 34.20000
##    [345] 33.70000 33.20000 32.70000 32.20000 31.60000 31.10000 41.95655 29.90000
##    [353] 56.10000 55.30000 54.50000 53.60000 52.80000 52.00000 51.10000 41.95655
##    [361] 49.40000 48.60000 47.80000 46.90000 46.10000 45.30000 44.50000 43.70000
##    [369] 41.20000 41.95655 39.20000 38.20000 37.20000 36.20000 35.20000 34.20000
##    [377] 33.20000 32.20000 31.20000 41.95655 29.10000 28.00000 27.00000 26.10000
##    [385] 65.70000 65.10000 64.50000 63.90000 63.30000 62.70000 62.10000 61.50000
##    [393] 41.95655 41.95655 59.70000 59.10000 58.60000 58.10000 57.50000 57.00000
##    [401] 19.40000 18.80000 18.20000 17.70000 17.10000 16.60000 16.10000 15.60000
##    [409] 15.10000 14.60000 14.20000 13.70000 13.30000 12.90000 12.50000 12.20000
##    [417] 18.70000 18.20000 17.60000 17.10000 16.60000 16.10000 15.70000 15.20000
##    [425] 14.80000 14.50000 14.10000 13.80000 13.50000 13.30000 13.00000 12.80000
##    [433] 28.00000 27.40000 26.80000 26.20000 25.60000 25.00000 24.40000 23.80000
```

##	[441]	23.20000	22.60000	22.10000	21.50000	41.95655	41.95655	19.90000	19.40000
##	[449]	31.30000	41.95655	29.70000	29.00000	28.20000	27.50000	26.80000	26.20000
##	[457]	25.50000	24.90000	24.30000	23.70000	23.20000	22.60000	22.10000	21.50000
##	[465]	19.60000	18.90000	18.20000	17.60000	17.00000	16.40000	15.90000	15.30000
##	[473]	14.80000	14.30000	13.90000	13.50000	13.10000	12.80000	12.40000	12.10000
##	[481]	29.00000	28.40000	27.80000	27.20000	26.60000	26.00000	25.40000	24.90000
##	[489]	24.40000	23.80000	23.30000	22.80000	22.30000	21.80000	21.30000	41.95655
##	[497]	67.00000	66.40000	65.80000	65.30000	64.70000	64.10000	63.60000	63.00000
##	[505]	62.50000	61.90000	61.30000	41.95655	41.95655	59.30000	58.50000	57.80000
##	[513]	22.70000	22.10000	21.60000	21.20000	41.95655	41.95655	19.80000	19.40000
##	[521]	19.00000	18.60000	18.20000	17.90000	17.50000	17.20000	16.80000	16.50000
##	[529]	19.10000	18.70000	18.20000	17.90000	17.50000	17.10000	16.70000	16.40000
##	[537]	16.10000	15.70000	15.40000	15.10000	14.80000	14.40000	14.10000	13.90000
##	[545]	63.80000	63.10000	62.50000	61.80000	61.20000	41.95655	59.90000	59.30000
##	[553]	58.70000	58.10000	57.40000	56.80000	56.10000	55.40000	54.70000	54.00000
##	[561]	32.90000	31.90000	41.95655	41.95655	29.00000	28.10000	27.30000	26.50000
##	[569]	25.70000	24.90000	24.10000	23.40000	22.60000	21.90000	21.20000	41.95655
##	[577]	57.90000	57.20000	56.40000	55.70000	55.00000	54.20000	53.50000	52.80000
##	[585]	52.00000	51.30000	41.95655	49.80000	49.00000	48.20000	47.50000	46.70000
##	[593]	24.20000	23.70000	23.20000	22.60000	22.10000	21.60000	21.10000	41.95655
##	[601]	41.95655	19.60000	19.20000	18.80000	18.40000	18.00000	17.60000	17.30000
##	[609]	27.40000	26.80000	26.20000	25.60000	25.00000	24.50000	23.90000	23.30000
##	[617]	22.80000	22.30000	21.70000	21.20000	41.95655	41.95655	19.80000	19.30000
##	[625]	41.95655	59.50000	58.50000	57.50000	56.50000	55.50000	54.40000	53.40000
##	[633]	52.40000	51.40000	41.95655	49.30000	48.30000	47.30000	46.40000	45.40000
##	[641]	63.70000	63.10000	62.50000	61.90000	61.30000	41.95655	41.95655	59.40000
##	[649]	58.70000	58.10000	57.50000	56.90000	56.30000	55.80000	55.20000	54.70000
##	[657]	61.40000	41.95655	59.90000	59.20000	58.40000	57.70000	56.90000	56.20000
##	[665]	55.40000	54.60000	53.80000	53.00000	52.10000	51.30000	41.95655	49.40000
##	[673]	41.95655	59.80000	59.20000	58.70000	58.30000	57.80000	57.30000	56.80000
##	[681]	56.30000	55.80000	55.30000	54.80000	54.30000	53.80000	53.30000	52.80000
##	[689]	66.10000	65.60000	65.10000	64.50000	64.00000	63.60000	63.10000	62.60000
##	[697]	62.20000	61.80000	61.30000	41.95655	41.95655	59.90000	59.40000	59.00000
##	[705]	32.90000	32.40000	31.80000	31.30000	41.95655	41.95655	29.70000	29.20000
##	[713]	28.70000	28.20000	27.70000	27.20000	26.70000	26.20000	25.70000	25.20000
##	[721]	21.60000	21.10000	41.95655	41.95655	19.60000	19.10000	18.60000	18.20000
##	[729]	17.80000	17.30000	16.90000	16.50000	16.10000	15.70000	15.30000	14.90000
##	[737]	58.80000	58.40000	58.10000	57.70000	57.40000	57.00000	56.60000	56.30000
##	[745]	55.90000	55.40000	55.00000	54.40000	53.90000	53.30000	52.80000	52.20000
##	[753]	35.00000	34.40000	33.80000	33.20000	32.70000	32.20000	31.70000	31.30000
##	[761]	41.95655	41.95655	41.95655	29.80000	29.40000	29.00000	28.60000	28.20000
##	[769]	58.90000	57.90000	56.80000	55.80000	54.70000	53.60000	52.60000	51.50000
##	[777]	41.95655	49.30000	48.20000	47.20000	46.10000	45.10000	44.10000	43.10000
##	[785]	54.20000	53.50000	52.80000	52.10000	51.40000	41.95655	41.95655	49.30000
##	[793]	48.60000	47.90000	47.20000	46.50000	45.80000	45.10000	44.30000	43.60000
##	[801]	61.10000	41.95655	59.40000	58.60000	57.80000	57.00000	56.20000	55.50000
##	[809]	54.80000	54.20000	53.50000	52.90000	52.30000	51.80000	51.20000	41.95655
##	[817]	56.10000	55.40000	54.70000	54.10000	53.40000	52.80000	52.10000	51.40000
##	[825]	41.95655	41.95655	49.40000	48.60000	47.80000	47.00000	46.20000	45.30000
##	[833]	24.50000	24.00000	23.50000	23.00000	22.60000	22.10000	21.70000	21.30000
##	[841]	41.95655	41.95655	41.95655	19.80000	19.50000	19.10000	18.70000	18.30000
##	[849]	18.60000	18.00000	17.50000	17.00000	16.50000	16.00000	15.50000	15.10000
##	[857]	14.70000	14.30000	13.90000	13.60000	13.30000	13.10000	12.80000	12.60000
##	[865]	59.90000	59.40000	59.00000	58.50000	58.00000	57.60000	57.10000	56.70000
##	[873]	56.30000	55.90000	55.50000	55.20000	54.90000	54.60000	54.30000	54.00000
##	[881]	17.60000	17.20000	16.80000	16.40000	16.00000	15.60000	15.30000	14.90000
##	[889]	14.50000	14.20000	13.80000	13.50000	13.20000	12.90000	12.60000	12.30000
##	[897]	62.70000	61.90000	61.10000	41.95655	59.50000	58.70000	58.00000	57.30000
##	[905]	56.60000	55.90000	55.10000	54.20000	53.20000	52.20000	51.20000	41.95655
##	[913]	62.10000	61.70000	61.40000	61.00000	41.95655	41.95655	59.80000	59.40000
##	[921]	59.00000	58.60000	58.10000	57.60000	57.10000	56.60000	56.10000	55.50000
##	[929]	62.50000	62.00000	61.60000	61.10000	41.95655	41.95655	59.60000	59.10000
##	[937]	58.60000	58.00000	57.50000	57.00000	56.40000	55.80000	55.20000	54.60000
##	[945]	36.30000	35.80000	35.20000	34.60000	34.10000	33.50000	33.00000	32.40000
##	[953]	31.90000	31.40000	41.95655	41.95655	29.80000	29.20000	28.70000	28.10000
##	[961]	27.30000	26.70000	26.00000	25.40000	24.80000	24.10000	23.50000	22.80000

##	[969]	22.20000	21.50000	41.95655	41.95655	19.70000	19.10000	18.50000	18.00000
##	[977]	56.20000	55.30000	54.40000	53.60000	52.80000	52.00000	51.30000	41.95655
##	[985]	49.90000	49.20000	48.60000	48.10000	47.50000	47.00000	46.50000	46.00000
##	[993]	62.30000	61.90000	61.40000	41.95655	41.95655	59.90000	59.50000	59.00000
##	[1001]	58.50000	58.00000	57.60000	57.10000	56.60000	56.10000	55.60000	55.10000
##	[1009]	28.60000	28.00000	27.30000	26.70000	26.10000	25.50000	24.90000	24.20000
##	[1017]	23.60000	23.00000	22.40000	21.80000	21.20000	41.95655	41.95655	19.50000
##	[1025]	66.50000	66.00000	65.40000	64.90000	64.30000	63.70000	63.10000	62.40000
##	[1033]	61.80000	61.20000	41.95655	59.90000	59.20000	58.60000	58.00000	57.40000
##	[1041]	48.40000	47.40000	46.50000	45.60000	44.70000	43.90000	43.10000	42.40000
##	[1049]	41.80000	41.10000	41.95655	39.90000	39.40000	38.80000	38.20000	37.70000
##	[1057]	41.95655	49.90000	49.30000	48.60000	47.90000	47.20000	46.50000	45.90000
##	[1065]	45.20000	44.50000	43.80000	43.10000	42.40000	41.70000	41.10000	41.95655
##	[1073]	23.30000	22.70000	22.20000	21.70000	21.20000	41.95655	41.95655	19.80000
##	[1081]	19.40000	19.00000	18.50000	18.10000	17.70000	17.30000	16.90000	16.60000
##	[1089]	26.30000	25.60000	25.00000	24.30000	23.70000	23.10000	22.50000	21.90000
##	[1097]	21.30000	41.95655	41.95655	19.60000	19.00000	18.50000	17.90000	17.40000
##	[1105]	46.70000	45.90000	45.00000	44.10000	43.20000	42.40000	41.60000	41.95655
##	[1113]	41.95655	39.60000	39.00000	38.40000	37.80000	37.10000	36.40000	35.70000
##	[1121]	49.90000	48.80000	47.70000	46.50000	45.30000	44.20000	43.00000	41.80000
##	[1129]	41.95655	39.60000	38.50000	37.50000	36.50000	35.60000	34.80000	34.00000
##	[1137]	51.00000	41.95655	49.30000	48.40000	47.60000	46.80000	45.90000	45.10000
##	[1145]	44.30000	43.50000	42.80000	42.00000	41.20000	41.95655	39.60000	38.80000
##	[1153]	64.80000	64.20000	63.60000	63.00000	62.40000	61.70000	61.10000	41.95655
##	[1161]	59.90000	59.30000	58.80000	58.20000	57.60000	57.10000	56.60000	56.10000
##	[1169]	61.00000	41.95655	41.95655	59.70000	59.30000	58.90000	58.50000	58.10000
##	[1177]	57.80000	57.40000	56.90000	56.50000	55.90000	55.40000	54.80000	54.20000
##	[1185]	18.70000	18.10000	17.50000	17.00000	16.40000	15.90000	15.40000	14.90000
##	[1193]	14.40000	13.90000	13.50000	13.00000	12.60000	12.20000	41.95655	41.95655
##	[1201]	27.40000	26.50000	25.60000	24.70000	23.80000	22.90000	22.10000	21.30000
##	[1209]	41.95655	19.70000	19.00000	18.20000	17.50000	16.70000	16.00000	15.40000
##	[1217]	59.70000	58.50000	57.20000	56.00000	54.80000	53.60000	52.50000	51.40000
##	[1225]	41.95655	49.40000	48.50000	47.60000	46.90000	46.20000	45.50000	44.90000
##	[1233]	59.10000	58.50000	57.80000	57.20000	56.50000	55.80000	55.20000	54.50000
##	[1241]	53.80000	53.20000	52.50000	51.90000	51.30000	41.95655	41.95655	49.50000
##	[1249]	62.80000	62.10000	61.30000	41.95655	59.70000	58.90000	58.20000	57.40000
##	[1257]	56.60000	55.80000	55.10000	54.40000	53.60000	52.90000	52.20000	51.50000
##	[1265]	64.90000	64.60000	64.20000	63.80000	63.40000	63.00000	62.60000	62.10000
##	[1273]	61.60000	61.10000	41.95655	41.95655	59.60000	59.20000	58.70000	58.30000
##	[1281]	63.60000	63.10000	62.60000	62.10000	61.50000	61.00000	41.95655	59.90000
##	[1289]	59.40000	58.80000	58.20000	57.60000	57.00000	56.40000	55.70000	55.00000
##	[1297]	54.20000	53.50000	52.70000	52.00000	51.20000	41.95655	49.70000	48.90000
##	[1305]	48.10000	47.20000	46.30000	45.40000	44.50000	43.50000	42.50000	41.60000
##	[1313]	29.00000	28.60000	28.20000	27.80000	27.40000	26.90000	26.40000	25.90000
##	[1321]	25.40000	24.90000	24.40000	23.80000	23.40000	22.90000	22.50000	22.00000
##	[1329]	65.60000	64.80000	64.00000	63.20000	62.40000	61.70000	41.95655	41.95655
##	[1337]	59.30000	58.60000	57.80000	57.00000	56.30000	55.50000	54.80000	54.00000
##	[1345]	53.10000	52.30000	51.40000	41.95655	49.90000	49.20000	48.50000	47.90000
##	[1353]	47.30000	46.80000	46.30000	45.80000	45.30000	44.80000	44.40000	43.90000
##	[1361]	22.00000	21.30000	41.95655	41.95655	19.50000	18.90000	18.40000	17.90000
##	[1369]	17.30000	16.90000	16.40000	15.90000	15.50000	15.10000	14.70000	14.40000
##	[1377]	77.60000	77.10000	76.70000	76.20000	75.70000	75.20000	74.60000	74.10000
##	[1385]	73.40000	72.80000	72.10000	71.40000	41.95655	69.70000	68.80000	67.90000
##	[1393]	71.40000	41.95655	41.95655	69.50000	69.00000	68.40000	67.90000	67.50000
##	[1401]	67.10000	66.70000	66.30000	65.90000	65.50000	65.00000	64.50000	64.00000
##	[1409]	44.90000	43.90000	43.00000	42.20000	41.40000	41.95655	41.95655	39.50000
##	[1417]	39.00000	38.50000	38.00000	37.50000	37.00000	36.50000	36.00000	35.60000
##	[1425]	21.70000	41.95655	41.95655	19.40000	18.70000	18.00000	17.30000	16.70000
##	[1433]	16.10000	15.50000	14.90000	14.40000	13.80000	13.30000	12.70000	12.30000
##	[1441]	61.20000	41.95655	41.95655	59.80000	59.40000	58.90000	58.50000	58.10000
##	[1449]	57.70000	57.40000	57.00000	56.60000	56.30000	56.00000	55.70000	55.40000
##	[1457]	66.10000	65.40000	64.90000	64.40000	64.00000	63.50000	63.00000	62.50000
##	[1465]	61.90000	61.40000	41.95655	41.95655	59.70000	59.10000	58.60000	57.90000
##	[1473]	32.60000	32.00000	31.40000	41.95655	41.95655	29.70000	29.20000	28.80000
##	[1481]	28.30000	27.90000	27.40000	26.90000	26.40000	25.90000	25.40000	24.90000
##	[1489]	27.30000	26.70000	26.10000	25.60000	25.00000	24.50000	24.00000	23.40000

##	[1497]	22.90000	22.40000	22.00000	21.50000	21.10000	41.95655	41.95655	41.95655
##	[1505]	64.80000	63.80000	62.80000	61.80000	41.95655	59.90000	59.00000	58.20000
##	[1513]	57.40000	56.70000	56.00000	55.30000	54.60000	54.00000	53.40000	52.80000
##	[1521]	62.40000	61.90000	61.40000	41.95655	41.95655	41.95655	59.70000	59.30000
##	[1529]	59.00000	58.70000	58.40000	58.10000	57.80000	57.50000	57.20000	56.90000
##	[1537]	61.30000	41.95655	41.95655	41.95655	59.60000	59.20000	58.80000	58.40000
##	[1545]	57.90000	57.50000	57.00000	56.40000	55.80000	55.20000	54.60000	54.00000
##	[1553]	41.95655	41.95655	19.50000	19.00000	18.50000	18.00000	17.60000	17.10000
##	[1561]	16.70000	16.30000	15.80000	15.40000	15.00000	14.70000	14.30000	13.90000
##	[1569]	19.60000	19.20000	18.80000	18.40000	18.00000	17.60000	17.30000	16.90000
##	[1577]	16.60000	16.20000	15.90000	15.50000	15.20000	14.80000	14.40000	14.10000
##	[1585]	41.95655	39.50000	38.50000	37.40000	36.30000	35.30000	34.40000	33.40000
##	[1593]	32.50000	31.60000	41.95655	29.80000	28.80000	27.90000	27.00000	26.00000
##	[1601]	27.40000	26.20000	25.10000	24.10000	23.10000	22.10000	21.20000	41.95655
##	[1609]	19.50000	18.70000	18.00000	17.30000	16.70000	16.20000	15.60000	15.20000
##	[1617]	23.80000	23.20000	22.50000	21.90000	21.30000	41.95655	41.95655	19.60000
##	[1625]	19.00000	18.50000	18.00000	17.50000	17.00000	16.50000	16.10000	15.60000
##	[1633]	69.60000	69.20000	68.80000	68.40000	68.00000	67.60000	67.10000	66.60000
##	[1641]	66.10000	65.60000	65.00000	64.50000	63.90000	63.40000	62.80000	62.30000
##	[1649]	41.95655	41.95655	29.40000	28.80000	28.10000	27.40000	26.80000	26.10000
##	[1657]	25.50000	24.80000	24.20000	23.60000	22.90000	22.30000	21.70000	21.10000
##	[1665]	33.30000	32.80000	32.30000	31.80000	31.30000	41.95655	41.95655	29.70000
##	[1673]	29.10000	28.60000	28.00000	27.50000	26.90000	26.40000	25.80000	25.30000
##	[1681]	63.50000	62.80000	62.10000	61.50000	41.95655	41.95655	59.40000	58.70000
##	[1689]	57.90000	57.20000	56.40000	55.70000	54.90000	54.10000	53.20000	52.40000
##	[1697]	69.40000	68.70000	68.10000	67.50000	67.00000	66.40000	65.80000	65.20000
##	[1705]	64.70000	64.10000	63.60000	63.20000	62.80000	62.40000	62.00000	61.50000
##	[1713]	52.70000	51.50000	41.95655	49.20000	48.00000	46.90000	45.90000	44.90000
##	[1721]	43.90000	43.00000	42.10000	41.30000	41.95655	39.80000	39.10000	38.50000
##	[1729]	61.80000	61.30000	41.95655	41.95655	59.70000	59.10000	58.50000	57.80000
##	[1737]	57.20000	56.50000	55.70000	55.00000	54.20000	53.50000	52.70000	51.90000
##	[1745]	58.50000	57.50000	56.50000	55.50000	54.60000	53.60000	52.70000	51.70000
##	[1753]	41.95655	49.90000	49.10000	48.20000	47.30000	46.50000	45.70000	44.80000
##	[1761]	22.60000	22.20000	21.80000	21.30000	41.95655	41.95655	41.95655	19.70000
##	[1769]	19.30000	18.90000	18.50000	18.10000	17.70000	17.30000	16.90000	16.50000
##	[1777]	23.80000	22.90000	22.10000	21.30000	41.95655	19.80000	19.10000	18.30000
##	[1785]	17.60000	17.00000	16.40000	15.70000	15.20000	14.60000	14.10000	13.60000
##	[1793]	35.70000	34.90000	34.10000	33.30000	32.50000	31.80000	31.00000	41.95655
##	[1801]	29.40000	28.70000	27.90000	27.20000	26.50000	25.80000	25.10000	24.50000
##	[1809]	19.10000	18.50000	18.00000	17.40000	16.90000	16.40000	15.90000	15.40000
##	[1817]	14.90000	14.40000	13.90000	13.40000	12.90000	12.40000	41.95655	41.95655
##	[1825]	62.10000	61.60000	61.00000	41.95655	59.90000	59.30000	58.60000	57.90000
##	[1833]	57.30000	56.50000	55.80000	55.00000	54.20000	53.40000	52.60000	51.80000
##	[1841]	67.50000	66.90000	66.40000	65.90000	65.30000	64.80000	64.30000	63.80000
##	[1849]	63.20000	62.60000	62.10000	61.50000	41.95655	41.95655	59.60000	58.90000
##	[1857]	54.00000	53.20000	52.40000	51.70000	41.95655	41.95655	49.40000	48.60000
##	[1865]	47.90000	47.10000	46.40000	45.70000	44.90000	44.20000	43.50000	42.80000
##	[1873]	19.30000	18.90000	18.50000	18.10000	17.70000	17.30000	16.90000	16.50000
##	[1881]	16.10000	15.70000	15.40000	15.00000	14.60000	14.30000	13.90000	13.60000
##	[1889]	25.40000	24.70000	24.10000	23.50000	22.80000	22.20000	21.60000	21.00000
##	[1897]	41.95655	19.90000	19.30000	18.80000	18.30000	17.80000	17.30000	16.90000
##	[1905]	61.20000	41.95655	41.95655	59.80000	59.40000	58.90000	58.50000	58.00000
##	[1913]	57.50000	57.00000	56.50000	55.90000	55.30000	54.60000	54.00000	53.30000
##	[1921]	54.60000	53.50000	52.80000	52.30000	52.00000	51.80000	51.50000	51.10000
##	[1929]	41.95655	41.95655	49.50000	48.90000	48.10000	47.30000	46.50000	45.90000
##	[1937]	25.40000	24.70000	23.90000	23.20000	22.50000	21.90000	21.30000	41.95655
##	[1945]	41.95655	19.50000	18.90000	18.40000	17.90000	17.40000	16.90000	16.40000
##	[1953]	57.80000	57.10000	56.30000	55.60000	54.90000	54.20000	53.40000	52.70000
##	[1961]	51.90000	51.10000	41.95655	49.50000	48.60000	47.80000	46.90000	45.90000
##	[1969]	48.60000	47.90000	47.20000	46.40000	45.70000	44.90000	44.20000	43.40000
##	[1977]	42.70000	41.90000	41.10000	41.95655	39.60000	38.90000	38.20000	37.50000
##	[1985]	41.95655	49.40000	48.60000	47.90000	47.10000	46.40000	45.60000	44.90000
##	[1993]	44.20000	43.50000	42.80000	42.00000	41.30000	41.95655	39.80000	39.10000
##	[2001]	55.60000	54.90000	54.20000	53.60000	52.90000	52.20000	51.50000	41.95655
##	[2009]	41.95655	49.50000	48.80000	48.10000	47.40000	46.70000	46.10000	45.40000
##	[2017]	25.40000	24.80000	24.30000	23.70000	23.10000	22.60000	22.10000	21.60000

##	[2025]	21.10000	41.95655	41.95655	19.60000	19.20000	18.70000	18.30000	17.80000
##	[2033]	61.70000	61.10000	41.95655	59.70000	59.10000	58.40000	57.80000	57.20000
##	[2041]	56.60000	56.00000	55.50000	55.00000	54.50000	54.00000	53.60000	53.10000
##	[2049]	61.60000	41.95655	41.95655	59.50000	58.80000	58.10000	57.30000	56.50000
##	[2057]	55.70000	54.90000	54.10000	53.30000	52.50000	51.70000	41.95655	41.95655
##	[2065]	69.30000	68.40000	67.70000	67.00000	66.50000	66.00000	65.60000	65.20000
##	[2073]	65.10000	65.00000	65.10000	65.00000	64.70000	64.10000	63.30000	62.40000
##	[2081]	31.70000	31.20000	41.95655	41.95655	41.95655	29.50000	29.10000	28.60000
##	[2089]	28.20000	27.70000	27.20000	26.70000	26.20000	25.70000	25.20000	24.70000
##	[2097]	53.40000	52.70000	52.10000	51.50000	41.95655	41.95655	49.90000	49.50000
##	[2105]	49.10000	48.70000	48.30000	47.90000	47.60000	47.20000	46.80000	46.50000
##	[2113]	41.95655	59.90000	59.20000	58.40000	57.70000	56.90000	56.30000	55.60000
##	[2121]	55.00000	54.40000	53.90000	53.40000	52.90000	52.40000	51.90000	51.40000
##	[2129]	41.95655	59.90000	59.30000	58.70000	58.10000	57.50000	57.00000	56.60000
##	[2137]	56.10000	55.70000	55.30000	55.00000	54.70000	54.50000	54.20000	54.00000
##	[2145]	21.40000	41.95655	41.95655	19.50000	18.90000	18.30000	17.70000	17.10000
##	[2153]	16.50000	15.90000	15.40000	14.90000	14.50000	14.10000	13.70000	13.20000
##	[2161]	47.50000	46.70000	45.90000	45.20000	44.50000	43.80000	43.00000	42.20000
##	[2169]	41.30000	41.95655	39.60000	39.00000	38.40000	37.90000	37.30000	36.80000
##	[2177]	54.10000	53.10000	52.20000	51.20000	41.95655	49.30000	48.40000	47.50000
##	[2185]	46.60000	45.70000	44.70000	43.80000	42.90000	42.00000	41.00000	41.95655
##	[2193]	74.70000	74.30000	73.80000	73.40000	72.90000	72.50000	72.00000	71.40000
##	[2201]	41.95655	41.95655	69.70000	68.90000	68.20000	67.40000	66.50000	65.60000
##	[2209]	41.95655	41.95655	29.30000	28.50000	27.70000	26.90000	26.20000	25.40000
##	[2217]	24.70000	24.00000	23.40000	22.80000	22.20000	21.70000	21.10000	41.95655
##	[2225]	68.20000	67.30000	66.40000	65.60000	64.70000	63.90000	63.10000	62.40000
##	[2233]	61.60000	41.95655	41.95655	59.40000	58.50000	57.70000	56.90000	56.20000
##	[2241]	24.30000	23.80000	23.20000	22.70000	22.20000	21.70000	21.20000	41.95655
##	[2249]	41.95655	19.90000	19.50000	19.10000	18.70000	18.30000	17.90000	17.50000
##	[2257]	41.95655	59.40000	58.90000	58.30000	57.70000	57.00000	56.40000	55.80000
##	[2265]	55.10000	54.50000	53.90000	53.30000	52.80000	52.20000	51.70000	51.20000
##	[2273]	37.40000	36.20000	35.50000	34.80000	34.20000	33.50000	32.40000	31.80000
##	[2281]	31.20000	41.95655	41.95655	29.20000	28.70000	28.10000	27.60000	27.10000
##	[2289]	24.40000	23.80000	23.30000	22.70000	22.20000	21.70000	21.20000	41.95655
##	[2297]	41.95655	19.70000	19.20000	18.80000	18.40000	17.90000	17.50000	17.20000
##	[2305]	33.20000	32.90000	32.70000	32.40000	32.10000	31.80000	31.50000	31.20000
##	[2313]	41.95655	41.95655	41.95655	29.90000	29.60000	29.20000	28.90000	28.50000
##	[2321]	59.10000	58.40000	57.80000	57.20000	56.50000	55.90000	55.30000	54.80000
##	[2329]	54.20000	53.70000	53.10000	52.60000	52.10000	51.60000	51.10000	41.95655
##	[2337]	41.95655	59.50000	58.90000	58.20000	57.60000	57.00000	56.40000	55.80000
##	[2345]	55.20000	54.70000	54.10000	53.50000	52.90000	52.30000	51.80000	51.20000
##	[2353]	41.95655	49.70000	48.90000	48.10000	47.20000	46.40000	45.50000	44.70000
##	[2361]	43.80000	43.00000	42.10000	41.30000	41.95655	39.60000	38.70000	37.90000
##	[2369]	24.30000	23.80000	23.30000	22.90000	22.40000	22.00000	21.50000	21.10000
##	[2377]	41.95655	41.95655	19.80000	19.40000	19.00000	18.60000	18.20000	17.80000
##	[2385]	51.10000	41.95655	49.50000	48.70000	47.90000	47.20000	46.40000	45.70000
##	[2393]	45.00000	44.30000	43.60000	42.90000	42.20000	41.60000	41.95655	41.95655
##	[2401]	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655
##	[2409]	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655
##	[2417]	66.60000	66.00000	65.40000	64.80000	64.10000	63.50000	62.90000	62.30000
##	[2425]	61.70000	61.10000	41.95655	59.90000	59.30000	58.80000	58.20000	57.60000
##	[2433]	23.40000	22.70000	21.90000	21.20000	41.95655	19.80000	19.20000	18.50000
##	[2441]	17.90000	17.20000	16.60000	16.10000	15.60000	15.10000	14.60000	14.10000
##	[2449]	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655
##	[2457]	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655	41.95655
##	[2465]	58.30000	57.70000	57.00000	56.30000	55.50000	54.80000	54.10000	53.30000
##	[2473]	52.60000	51.80000	51.10000	41.95655	49.70000	49.00000	48.30000	47.60000
##	[2481]	32.30000	31.80000	31.20000	41.95655	41.95655	29.70000	29.30000	28.90000
##	[2489]	28.50000	28.20000	27.80000	27.40000	27.10000	26.70000	26.30000	25.90000
##	[2497]	59.50000	59.00000	58.50000	58.10000	57.70000	57.30000	56.90000	56.50000
##	[2505]	56.10000	55.70000	55.30000	54.90000	54.40000	53.90000	53.40000	52.80000
##	[2513]	57.40000	57.00000	56.60000	56.20000	55.80000	55.40000	55.00000	54.60000
##	[2521]	54.10000	53.70000	53.20000	52.80000	52.30000	51.80000	51.30000	41.95655
##	[2529]	57.10000	56.20000	55.20000	54.20000	53.20000	52.30000	51.30000	41.95655
##	[2537]	49.40000	48.50000	47.60000	46.80000	46.00000	45.30000	44.60000	43.90000
##	[2545]	41.95655	39.90000	39.00000	38.20000	37.40000	36.60000	35.90000	35.30000


```
## [2553] 34.70000 34.10000 33.50000 33.00000 32.50000 32.10000 31.60000 31.30000
## [2561] 33.60000 32.40000 31.30000 41.95655 29.00000 27.90000 26.80000 25.70000
## [2569] 24.60000 23.60000 22.60000 21.70000 41.95655 41.95655 19.40000 18.70000
## [2577] 41.95655 59.70000 59.10000 58.50000 57.90000 57.40000 56.90000 56.40000
## [2585] 55.90000 55.40000 54.90000 54.50000 54.10000 53.60000 53.20000 52.70000
## [2593] 17.40000 17.00000 16.60000 16.20000 15.80000 15.50000 15.10000 14.70000
## [2601] 14.20000 13.90000 13.50000 13.20000 12.90000 12.60000 12.30000 41.95655
## [2609] 24.30000 23.70000 23.10000 22.60000 22.00000 21.40000 41.95655 41.95655
## [2617] 19.80000 19.30000 18.90000 18.40000 17.90000 17.50000 17.10000 16.60000
## [2625] 75.20000 74.80000 74.30000 73.80000 73.30000 72.70000 72.10000 71.50000
## [2633] 41.95655 41.95655 69.40000 68.60000 67.80000 67.00000 66.20000 65.50000
## [2641] 47.10000 46.00000 45.00000 44.00000 43.00000 42.00000 41.10000 41.95655
## [2649] 39.30000 38.40000 37.60000 36.80000 36.00000 35.20000 34.40000 33.60000
## [2657] 61.20000 41.95655 59.30000 58.30000 57.40000 56.50000 55.60000 54.70000
## [2665] 53.90000 53.10000 52.20000 51.40000 41.95655 49.70000 48.90000 48.10000
## [2673] 66.10000 65.30000 64.50000 63.70000 62.80000 61.90000 61.10000 41.95655
## [2681] 59.30000 58.50000 57.60000 56.80000 55.90000 55.10000 54.30000 53.50000
## [2689] 48.60000 47.70000 46.70000 45.90000 45.00000 44.20000 43.40000 42.70000
## [2697] 42.00000 41.30000 41.95655 41.95655 39.40000 38.70000 38.10000 37.50000
## [2705] 18.50000 18.10000 17.60000 17.20000 16.70000 16.30000 15.90000 15.60000
## [2713] 15.20000 14.80000 14.50000 14.20000 13.90000 13.60000 13.30000 13.00000
## [2721] 61.30000 41.95655 41.95655 59.60000 59.00000 58.50000 58.00000 57.60000
## [2729] 57.20000 56.80000 56.40000 56.10000 55.70000 55.40000 55.10000 54.80000
## [2737] 64.20000 62.40000 41.95655 58.60000 57.10000 55.80000 55.10000 54.80000
## [2745] 55.10000 55.80000 56.60000 57.00000 56.80000 56.00000 55.00000 54.10000
## [2753] 66.60000 66.00000 65.40000 64.80000 64.20000 63.60000 63.10000 62.50000
## [2761] 61.90000 61.30000 41.95655 41.95655 59.50000 58.80000 58.20000 57.50000
## [2769] 23.80000 23.20000 22.50000 21.90000 21.30000 41.95655 41.95655 19.60000
## [2777] 19.10000 18.60000 18.10000 17.70000 17.20000 16.80000 16.40000 16.00000
## [2785] 69.60000 69.10000 68.60000 68.00000 67.50000 66.90000 66.30000 65.70000
## [2793] 65.10000 64.40000 63.80000 63.10000 62.40000 61.70000 41.95655 41.95655
## [2801] 64.00000 63.40000 62.90000 62.30000 61.80000 61.20000 41.95655 41.95655
## [2809] 59.50000 58.90000 58.30000 57.70000 57.00000 56.30000 55.70000 55.00000
## [2817] 44.70000 43.90000 43.00000 42.20000 41.40000 41.95655 41.95655 39.30000
## [2825] 38.70000 38.10000 37.50000 37.00000 36.40000 35.90000 35.30000 34.80000
## [2833] 53.30000 52.50000 51.70000 41.95655 49.90000 49.10000 48.20000 47.40000
## [2841] 46.60000 45.70000 44.90000 44.10000 43.30000 42.60000 41.90000 41.10000
## [2849] 62.10000 61.50000 61.00000 41.95655 59.90000 59.30000 58.80000 58.20000
## [2857] 57.60000 57.10000 56.50000 55.90000 55.30000 54.70000 54.10000 53.40000
## [2865] 17.50000 16.70000 16.00000 15.30000 14.70000 14.00000 13.40000 12.90000
## [2873] 12.30000 41.95655 41.95655 41.95655 41.95655 41.95655 41.95655 41.95655
## [2881] 41.30000 41.95655 39.60000 38.70000 37.90000 37.20000 36.40000 35.70000
## [2889] 35.10000 34.50000 33.90000 33.30000 32.70000 32.20000 31.70000 31.20000
## [2897] 23.40000 22.80000 22.30000 21.70000 21.20000 41.95655 41.95655 19.70000
## [2905] 19.20000 18.80000 18.40000 18.00000 17.60000 17.30000 17.10000 16.80000
## [2913] 31.80000 31.30000 41.95655 41.95655 29.90000 29.40000 29.00000 28.60000
## [2921] 28.20000 27.90000 27.50000 27.10000 26.70000 26.30000 25.90000 25.50000
```

```
lifeExpec_final$BMI_log <- log(lifeExpec_final$BMI)
```

```
# Replace zero for Income.composition.of.resources with its mean
```

```
lifeExpec_final$Income.composition.of.resources <- replace(lifeExpec_final$Income.composition.of.resources,
  lifeExpec_final$Income.composition.of.resources ==
  0, NA)
summary(lifeExpec_final$Income.composition.of.resources)
```

```
##      Min. 1st Qu.  Median      Mean 3rd Qu.    Max.     NA's
##  0.2530  0.5230  0.6865  0.6583  0.7840  0.9480     290
```

```
lifeExpec_final$Income.composition.of.resources[is.na(lifeExpec_final$Income.composition.of.resources)] <-
  mean(lifeExpec_final$Income.composition.of.resources, na.rm=TRUE)
lifeExpec_final$Income.composition.of.resources
```

```
##      [1] 0.4790000 0.4760000 0.4700000 0.4630000 0.4540000 0.4480000 0.4340000
##      [8] 0.4330000 0.4150000 0.4050000 0.3960000 0.3810000 0.3730000 0.3410000
```

##	[15]	0.3400000	0.3380000	0.7620000	0.7610000	0.7590000	0.7520000	0.7380000
##	[22]	0.7250000	0.7210000	0.7130000	0.7030000	0.6960000	0.6850000	0.6810000
##	[29]	0.6740000	0.6700000	0.6620000	0.6560000	0.7430000	0.7410000	0.7370000
##	[36]	0.7320000	0.7240000	0.7140000	0.7050000	0.6970000	0.6900000	0.6860000
##	[43]	0.6800000	0.6730000	0.6630000	0.6530000	0.6440000	0.6360000	0.5310000
##	[50]	0.5270000	0.5230000	0.5080000	0.4950000	0.4880000	0.4800000	0.4680000
##	[57]	0.4540000	0.4390000	0.4260000	0.4150000	0.4060000	0.4010000	0.3910000
##	[64]	0.3820000	0.7840000	0.7820000	0.7810000	0.7780000	0.7820000	0.7830000
##	[71]	0.7880000	0.7860000	0.7810000	0.7730000	0.6583378	0.6583378	0.6583378
##	[78]	0.6583378	0.6583378	0.6583378	0.8260000	0.8250000	0.8230000	0.8220000
##	[85]	0.8160000	0.8020000	0.7940000	0.7920000	0.7880000	0.7820000	0.7800000
##	[92]	0.7750000	0.7700000	0.7760000	0.7710000	0.7640000	0.7410000	0.7390000
##	[99]	0.7360000	0.7320000	0.7290000	0.7200000	0.7250000	0.7210000	0.7070000
##	[106]	0.6920000	0.6790000	0.6680000	0.6570000	0.6450000	0.6440000	0.6390000
##	[113]	0.9370000	0.9360000	0.9330000	0.9300000	0.9270000	0.9270000	0.9250000
##	[120]	0.9210000	0.9180000	0.9150000	0.9100000	0.9080000	0.9050000	0.9020000
##	[127]	0.8990000	0.8970000	0.8920000	0.8920000	0.8870000	0.8840000	0.8800000
##	[134]	0.8720000	0.8700000	0.8640000	0.8600000	0.8540000	0.8480000	0.8410000
##	[141]	0.8370000	0.8470000	0.8370000	0.8330000	0.7580000	0.7520000	0.7450000
##	[148]	0.7420000	0.7410000	0.7370000	0.7280000	0.7190000	0.7080000	0.6820000
##	[155]	0.6750000	0.6680000	0.6590000	0.6510000	0.6420000	0.6360000	0.7900000
##	[162]	0.7890000	0.7900000	0.7890000	0.7880000	0.7880000	0.7910000	0.7910000
##	[169]	0.7900000	0.7880000	0.7860000	0.7840000	0.7830000	0.7810000	0.7790000
##	[176]	0.6583378	0.8230000	0.8200000	0.8150000	0.8120000	0.8120000	0.8100000
##	[183]	0.8140000	0.8150000	0.8130000	0.8100000	0.8060000	0.8030000	0.7980000
##	[190]	0.7960000	0.7940000	0.7860000	0.5750000	0.5700000	0.5650000	0.5570000
##	[197]	0.5450000	0.5350000	0.5230000	0.5200000	0.5130000	0.5060000	0.4990000
##	[204]	0.4910000	0.4840000	0.4760000	0.4680000	0.4590000	0.7940000	0.7930000
##	[211]	0.7920000	0.7850000	0.7800000	0.7810000	0.7790000	0.7750000	0.7710000
##	[218]	0.7660000	0.7610000	0.7570000	0.7530000	0.7490000	0.7500000	0.7410000
##	[225]	0.7980000	0.7960000	0.7960000	0.7930000	0.7870000	0.7800000	0.7710000
##	[232]	0.7550000	0.7390000	0.7230000	0.7130000	0.7030000	0.6950000	0.6870000
##	[239]	0.6810000	0.6750000	0.8950000	0.8900000	0.8890000	0.8860000	0.8840000
##	[246]	0.8780000	0.8760000	0.8740000	0.8710000	0.8650000	0.8610000	0.8800000
##	[253]	0.8780000	0.8750000	0.8730000	0.8690000	0.7060000	0.7050000	0.7060000
##	[260]	0.7020000	0.7000000	0.7000000	0.7000000	0.6990000	0.7000000	0.6920000
##	[267]	0.6950000	0.6910000	0.6840000	0.6780000	0.6770000	0.6680000	0.4810000
##	[274]	0.4750000	0.4660000	0.4580000	0.4540000	0.4510000	0.4480000	0.4440000
##	[281]	0.4380000	0.4340000	0.4300000	0.4230000	0.4160000	0.4070000	0.3950000
##	[288]	0.3890000	0.6040000	0.5960000	0.5890000	0.5810000	0.5720000	0.6583378
##	[295]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[302]	0.6583378	0.6583378	0.6583378	0.6710000	0.6660000	0.6610000	0.6550000
##	[309]	0.6490000	0.6430000	0.6360000	0.6320000	0.6260000	0.6250000	0.6220000
##	[316]	0.6200000	0.6170000	0.6100000	0.6070000	0.6000000	0.7470000	0.7420000
##	[323]	0.7350000	0.7280000	0.7110000	0.7170000	0.7160000	0.7100000	0.7030000
##	[330]	0.6970000	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[337]	0.6980000	0.6970000	0.6930000	0.6870000	0.6780000	0.6690000	0.6610000
##	[344]	0.6460000	0.6300000	0.6100000	0.5930000	0.5800000	0.5670000	0.5580000
##	[351]	0.5600000	0.5590000	0.7540000	0.7470000	0.7340000	0.7300000	0.7240000
##	[358]	0.7160000	0.7140000	0.7040000	0.7000000	0.6980000	0.6940000	0.6950000
##	[365]	0.6990000	0.6920000	0.6850000	0.6770000	0.8640000	0.8630000	0.8600000
##	[372]	0.8520000	0.8460000	0.8450000	0.8410000	0.8400000	0.8400000	0.8370000
##	[379]	0.8340000	0.8280000	0.8230000	0.8200000	0.8190000	0.8180000	0.7920000
##	[386]	0.7870000	0.7810000	0.7780000	0.7750000	0.7700000	0.7680000	0.7610000
##	[393]	0.7550000	0.7500000	0.7450000	0.7380000	0.7290000	0.7230000	0.7130000
##	[400]	0.7090000	0.3990000	0.3980000	0.3920000	0.3840000	0.3770000	0.3650000
##	[407]	0.3560000	0.3450000	0.3340000	0.3250000	0.6583378	0.6583378	0.6583378
##	[414]	0.6583378	0.6583378	0.6583378	0.4060000	0.4040000	0.3980000	0.3930000
##	[421]	0.3850000	0.3610000	0.3360000	0.3190000	0.3090000	0.2900000	0.2860000
##	[428]	0.2790000	0.2760000	0.2680000	0.2680000	0.2680000	0.6583378	0.6583378
##	[435]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[442]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[449]	0.6460000	0.6430000	0.6430000	0.6360000	0.6320000	0.6270000	0.6210000
##	[456]	0.6150000	0.6020000	0.5960000	0.5820000	0.5740000	0.5720000	0.5690000
##	[463]	0.5620000	0.6583378	0.5580000	0.5530000	0.5460000	0.5400000	0.5330000
##	[470]	0.5190000	0.5200000	0.5110000	0.4950000	0.4830000	0.4700000	0.4580000

```

## [477] 0.4450000 0.4270000 0.4120000 0.4010000 0.5140000 0.5070000 0.5010000
## [484] 0.4960000 0.4860000 0.4800000 0.4730000 0.4660000 0.4560000 0.4560000
## [491] 0.4560000 0.4550000 0.4520000 0.4520000 0.4370000 0.4330000 0.9190000
## [498] 0.9120000 0.9090000 0.9070000 0.9030000 0.8980000 0.8980000 0.8970000
## [505] 0.8940000 0.8910000 0.8860000 0.8810000 0.8770000 0.8720000 0.8670000
## [512] 0.8640000 0.8470000 0.8450000 0.8370000 0.8360000 0.8360000 0.3520000
## [519] 0.3450000 0.3380000 0.3300000 0.3230000 0.3190000 0.3150000 0.3160000
## [526] 0.3150000 0.3140000 0.3120000 0.3940000 0.3900000 0.3870000 0.3810000
## [533] 0.3700000 0.3600000 0.3430000 0.3380000 0.3060000 0.3030000 0.3060000
## [540] 0.3010000 0.2840000 0.3030000 0.3000000 0.6583378 0.8450000 0.8410000
## [547] 0.8310000 0.8260000 0.8200000 0.8150000 0.8160000 0.8040000 0.7970000
## [554] 0.7960000 0.7900000 0.7810000 0.7750000 0.7680000 0.7610000 0.7550000
## [561] 0.7340000 0.7230000 0.7130000 0.7030000 0.7000000 0.6910000 0.6820000
## [568] 0.6720000 0.6590000 0.6460000 0.6340000 0.6220000 0.6100000 0.6000000
## [575] 0.5920000 0.5830000 0.7240000 0.7200000 0.7120000 0.7070000 0.7000000
## [582] 0.6950000 0.6910000 0.6830000 0.6750000 0.6690000 0.6580000 0.6580000
## [589] 0.6590000 0.6560000 0.6530000 0.6500000 0.4980000 0.4970000 0.4900000
## [596] 0.4840000 0.4790000 0.4760000 0.4650000 0.4610000 0.4590000 0.4510000
## [603] 0.4340000 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.5900000
## [610] 0.5810000 0.5760000 0.5570000 0.5580000 0.5480000 0.5450000 0.5270000
## [617] 0.5170000 0.5070000 0.4960000 0.4970000 0.4920000 0.4880000 0.4870000
## [624] 0.4870000 0.7750000 0.7680000 0.7620000 0.7580000 0.7520000 0.7490000
## [631] 0.7470000 0.7400000 0.7340000 0.7270000 0.7230000 0.7190000 0.7150000
## [638] 0.7120000 0.7080000 0.7020000 0.8230000 0.8200000 0.8170000 0.8150000
## [645] 0.8080000 0.8030000 0.8030000 0.8000000 0.7930000 0.7830000 0.7770000
## [652] 0.7710000 0.7650000 0.7590000 0.7490000 0.7390000 0.7730000 0.7720000
## [659] 0.7730000 0.7780000 0.7800000 0.7840000 0.7820000 0.7710000 0.7540000
## [666] 0.7320000 0.7190000 0.7050000 0.6940000 0.6920000 0.6860000 0.6790000
## [673] 0.8540000 0.8500000 0.8500000 0.8500000 0.8470000 0.8530000 0.8490000
## [680] 0.8440000 0.8360000 0.8290000 0.8260000 0.8230000 0.8150000 0.8050000
## [687] 0.8000000 0.7980000 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
## [694] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
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## [708] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
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## [722] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
## [729] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
## [736] 0.6583378 0.9230000 0.9260000 0.9240000 0.9220000 0.9100000 0.9060000
## [743] 0.9060000 0.9060000 0.9040000 0.9020000 0.8970000 0.8930000 0.8820000
## [750] 0.8750000 0.8620000 0.8600000 0.4700000 0.4670000 0.4640000 0.4600000
## [757] 0.4510000 0.4410000 0.4360000 0.4270000 0.4160000 0.4050000 0.3960000
## [764] 0.3880000 0.3780000 0.3720000 0.3630000 0.3610000 0.7180000 0.7120000
## [771] 0.7090000 0.7060000 0.7030000 0.6970000 0.6950000 0.6920000 0.6850000
## [778] 0.6770000 0.6680000 0.6660000 0.6650000 0.6600000 0.6560000 0.6510000
## [785] 0.7390000 0.7370000 0.7250000 0.7170000 0.7100000 0.7030000 0.7020000
## [792] 0.6980000 0.6960000 0.6930000 0.6880000 0.6820000 0.6790000 0.6750000
## [799] 0.6700000 0.6680000 0.6880000 0.6860000 0.6810000 0.6730000 0.6710000
## [806] 0.6650000 0.6590000 0.6510000 0.6440000 0.6360000 0.6290000 0.6230000
## [813] 0.6210000 0.6170000 0.6120000 0.6060000 0.6780000 0.6760000 0.6750000
## [820] 0.6700000 0.6660000 0.6620000 0.6620000 0.6590000 0.6570000 0.6510000
## [827] 0.6440000 0.6360000 0.6280000 0.6210000 0.6150000 0.6070000 0.5820000
## [834] 0.5820000 0.5860000 0.5830000 0.5800000 0.5890000 0.5900000 0.5920000
## [841] 0.5870000 0.5690000 0.5630000 0.5530000 0.5540000 0.5420000 0.5270000
## [848] 0.6583378 0.4180000 0.4160000 0.4140000 0.4100000 0.4050000 0.4040000
## [855] 0.4020000 0.4060000 0.4050000 0.4050000 0.6583378 0.6583378 0.6583378
## [862] 0.6583378 0.6583378 0.6583378 0.8630000 0.8600000 0.8560000 0.8500000
## [869] 0.8380000 0.8330000 0.8360000 0.8350000 0.8290000 0.8220000 0.8120000
## [876] 0.8050000 0.7980000 0.7910000 0.7810000 0.7640000 0.4410000 0.4350000
## [883] 0.4270000 0.4220000 0.4110000 0.4010000 0.3930000 0.3780000 0.3620000
## [890] 0.3460000 0.3250000 0.3100000 0.3060000 0.2980000 0.2830000 0.6583378
## [897] 0.7340000 0.7270000 0.7190000 0.7140000 0.7090000 0.7060000 0.7040000
## [904] 0.7000000 0.6980000 0.6950000 0.6990000 0.6910000 0.6890000 0.6870000
## [911] 0.6830000 0.6810000 0.8930000 0.8900000 0.8870000 0.8840000 0.8780000
## [918] 0.8740000 0.8780000 0.8760000 0.8730000 0.8690000 0.8640000 0.8690000
## [925] 0.8660000 0.8630000 0.8560000 0.8470000 0.8940000 0.8900000 0.8870000
## [932] 0.8850000 0.8820000 0.8790000 0.8790000 0.8770000 0.8730000 0.8700000

```

##	[939]	0.8600000	0.8570000	0.8520000	0.8510000	0.8490000	0.8440000	0.6940000
##	[946]	0.6870000	0.6780000	0.6690000	0.6640000	0.6600000	0.6520000	0.6510000
##	[953]	0.6450000	0.6460000	0.6400000	0.6400000	0.6380000	0.6360000	0.6330000
##	[960]	0.6370000	0.4500000	0.4490000	0.4450000	0.4400000	0.4410000	0.4390000
##	[967]	0.4340000	0.4260000	0.4200000	0.4150000	0.4120000	0.4040000	0.3950000
##	[974]	0.3920000	0.3840000	0.3770000	0.7680000	0.7590000	0.7550000	0.7490000
##	[981]	0.7420000	0.7380000	0.7340000	0.7350000	0.7220000	0.7140000	0.7030000
##	[988]	0.6940000	0.6840000	0.6770000	0.6730000	0.6583378	0.9240000	0.9200000
##	[995]	0.9190000	0.9160000	0.9120000	0.9070000	0.9060000	0.9030000	0.8980000
##	[1002]	0.8920000	0.8840000	0.8770000	0.8720000	0.8670000	0.8600000	0.8550000
##	[1009]	0.5750000	0.5760000	0.5700000	0.5630000	0.5540000	0.5470000	0.5420000
##	[1016]	0.5300000	0.5190000	0.5100000	0.4990000	0.4910000	0.4890000	0.4840000
##	[1023]	0.4850000	0.4800000	0.8650000	0.8620000	0.8600000	0.8580000	0.8600000
##	[1030]	0.8590000	0.8570000	0.8530000	0.8550000	0.8500000	0.8390000	0.8300000
##	[1037]	0.8230000	0.8110000	0.8010000	0.7940000	0.7510000	0.7490000	0.7460000
##	[1044]	0.7440000	0.7410000	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[1051]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6370000
##	[1058]	0.6140000	0.6110000	0.6160000	0.6090000	0.6020000	0.5960000	0.5890000
##	[1065]	0.5780000	0.5700000	0.5670000	0.5640000	0.5600000	0.5530000	0.5460000
##	[1072]	0.5390000	0.4140000	0.4120000	0.4060000	0.3960000	0.3850000	0.3800000
##	[1079]	0.3760000	0.3710000	0.3640000	0.3560000	0.3460000	0.3250000	0.3380000
##	[1086]	0.3290000	0.3220000	0.3160000	0.4210000	0.4190000	0.4150000	0.4160000
##	[1093]	0.4100000	0.4050000	0.4010000	0.3980000	0.3940000	0.3880000	0.6583378
##	[1100]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6380000	0.6360000
##	[1107]	0.6330000	0.6300000	0.6240000	0.6180000	0.6180000	0.6180000	0.6200000
##	[1114]	0.6220000	0.6190000	0.6130000	0.6110000	0.6090000	0.6060000	0.6020000
##	[1121]	0.4900000	0.4870000	0.4830000	0.4770000	0.4700000	0.4700000	0.4660000
##	[1128]	0.4620000	0.4580000	0.4550000	0.4520000	0.4500000	0.4470000	0.4440000
##	[1135]	0.4430000	0.4390000	0.6230000	0.6180000	0.6140000	0.6140000	0.6110000
##	[1142]	0.6060000	0.6030000	0.5970000	0.5900000	0.5830000	0.5770000	0.5710000
##	[1149]	0.5660000	0.5610000	0.5570000	0.5510000	0.8340000	0.8340000	0.8240000
##	[1156]	0.8230000	0.8210000	0.8170000	0.8160000	0.8120000	0.8090000	0.8020000
##	[1163]	0.7950000	0.7930000	0.7840000	0.7750000	0.7690000	0.7610000	0.9190000
##	[1170]	0.9150000	0.9070000	0.9010000	0.8940000	0.8940000	0.8940000	0.8920000
##	[1177]	0.8870000	0.8840000	0.8790000	0.8730000	0.8660000	0.8590000	0.8540000
##	[1184]	0.8470000	0.6150000	0.6070000	0.5990000	0.5900000	0.5800000	0.5690000
##	[1191]	0.5630000	0.5560000	0.5460000	0.5360000	0.5260000	0.5180000	0.5050000
##	[1198]	0.4990000	0.4940000	0.4890000	0.6860000	0.6820000	0.6770000	0.6690000
##	[1205]	0.6620000	0.6560000	0.6450000	0.6410000	0.6380000	0.6320000	0.6290000
##	[1212]	0.6240000	0.6130000	0.6080000	0.6040000	0.5970000	0.7740000	0.7700000
##	[1219]	0.7690000	0.7550000	0.7450000	0.7350000	0.7280000	0.7160000	0.7040000
##	[1226]	0.6920000	0.6870000	0.6860000	0.6790000	0.6740000	0.6660000	0.6600000
##	[1233]	0.6490000	0.6580000	0.6590000	0.6560000	0.6490000	0.6460000	0.6430000
##	[1240]	0.6380000	0.6360000	0.6310000	0.6280000	0.6030000	0.6160000	0.6140000
##	[1247]	0.6070000	0.6030000	0.9200000	0.9100000	0.9020000	0.8950000	0.9090000
##	[1254]	0.9070000	0.9090000	0.9080000	0.9020000	0.8960000	0.8890000	0.8800000
##	[1261]	0.8700000	0.8620000	0.8570000	0.8480000	0.8980000	0.8950000	0.8910000
##	[1268]	0.8890000	0.8830000	0.8780000	0.8760000	0.8770000	0.8720000	0.8700000
##	[1275]	0.8660000	0.8630000	0.8630000	0.8550000	0.8500000	0.8450000	0.8810000
##	[1282]	0.8770000	0.8760000	0.8770000	0.8720000	0.8690000	0.8680000	0.8660000
##	[1289]	0.8620000	0.8560000	0.8510000	0.8460000	0.8410000	0.8360000	0.8280000
##	[1296]	0.8230000	0.7290000	0.7270000	0.7270000	0.7250000	0.7220000	0.7210000
##	[1303]	0.7210000	0.7180000	0.7140000	0.7090000	0.7060000	0.6890000	0.6940000
##	[1310]	0.6900000	0.6800000	0.6820000	0.9020000	0.8990000	0.8940000	0.8890000
##	[1317]	0.8840000	0.8790000	0.8810000	0.8800000	0.8770000	0.8730000	0.8700000
##	[1324]	0.8660000	0.8630000	0.8600000	0.8560000	0.8520000	0.7410000	0.7370000
##	[1331]	0.7370000	0.7350000	0.7370000	0.7390000	0.7420000	0.7390000	0.7360000
##	[1338]	0.7330000	0.7300000	0.7230000	0.7170000	0.7120000	0.7060000	0.7000000
##	[1345]	0.7930000	0.7890000	0.7820000	0.7740000	0.7660000	0.7630000	0.7580000
##	[1352]	0.7580000	0.7540000	0.7470000	0.7370000	0.7250000	0.7140000	0.7000000
##	[1359]	0.6850000	0.6760000	0.5500000	0.5460000	0.5410000	0.5360000	0.5300000
##	[1366]	0.5230000	0.5140000	0.5060000	0.4940000	0.4830000	0.4740000	0.4610000
##	[1373]	0.4500000	0.4510000	0.4470000	0.4480000	0.5860000	0.5970000	0.5890000
##	[1380]	0.5810000	0.5850000	0.5840000	0.5760000	0.5720000	0.5740000	0.5760000
##	[1387]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.7990000
##	[1394]	0.7870000	0.7960000	0.7940000	0.7920000	0.7900000	0.7880000	0.7870000

##	[1401]	0.7870000	0.7870000	0.7890000	0.7910000	0.7880000	0.7850000	0.7860000
##	[1408]	0.7860000	0.6620000	0.6560000	0.6470000	0.6380000	0.6320000	0.6310000
##	[1415]	0.6290000	0.6240000	0.6180000	0.6130000	0.6120000	0.6090000	0.6020000
##	[1422]	0.6010000	0.5930000	0.5860000	0.5820000	0.5730000	0.5630000	0.5540000
##	[1429]	0.5420000	0.5350000	0.5250000	0.5180000	0.5090000	0.5030000	0.4940000
##	[1436]	0.4850000	0.4770000	0.4680000	0.4630000	0.4590000	0.8280000	0.8220000
##	[1443]	0.8140000	0.8120000	0.8100000	0.8150000	0.8210000	0.8190000	0.8140000
##	[1450]	0.8070000	0.7910000	0.7760000	0.7610000	0.7460000	0.7280000	0.7160000
##	[1457]	0.7630000	0.7630000	0.7660000	0.7630000	0.7580000	0.7520000	0.7460000
##	[1464]	0.7400000	0.7310000	0.7330000	0.6583378	0.6583378	0.6583378	0.6583378
##	[1471]	0.6583378	0.6583378	0.4950000	0.4910000	0.4840000	0.4790000	0.4690000
##	[1478]	0.4640000	0.4530000	0.4470000	0.4400000	0.4370000	0.4370000	0.4390000
##	[1485]	0.4400000	0.4460000	0.4430000	0.4450000	0.4270000	0.4260000	0.4190000
##	[1492]	0.4160000	0.4060000	0.4030000	0.4000000	0.3940000	0.3830000	0.3770000
##	[1499]	0.3720000	0.3350000	0.3730000	0.3760000	0.3860000	0.3380000	0.7190000
##	[1506]	0.7300000	0.7350000	0.7060000	0.7560000	0.7550000	0.7570000	0.7570000
##	[1513]	0.7560000	0.7520000	0.7480000	0.7470000	0.7400000	0.7360000	0.7320000
##	[1520]	0.7270000	0.8460000	0.8410000	0.8340000	0.8300000	0.8260000	0.8240000
##	[1527]	0.8250000	0.8200000	0.8120000	0.8070000	0.7980000	0.7920000	0.7800000
##	[1534]	0.7700000	0.7570000	0.7450000	0.8960000	0.8920000	0.8920000	0.8920000
##	[1541]	0.8940000	0.8840000	0.8880000	0.8870000	0.8770000	0.8800000	0.8740000
##	[1548]	0.8670000	0.8650000	0.8600000	0.8540000	0.8480000	0.5110000	0.5090000
##	[1555]	0.5080000	0.5060000	0.5040000	0.5030000	0.5000000	0.4910000	0.4830000
##	[1562]	0.4780000	0.4730000	0.4660000	0.4570000	0.4620000	0.4560000	0.6583378
##	[1569]	0.4730000	0.4660000	0.4590000	0.4540000	0.4440000	0.4300000	0.4150000
##	[1576]	0.4000000	0.3870000	0.3770000	0.3710000	0.3660000	0.3620000	0.3880000
##	[1583]	0.3870000	0.3910000	0.7870000	0.7830000	0.7790000	0.7760000	0.7740000
##	[1590]	0.7640000	0.7560000	0.7470000	0.7360000	0.7320000	0.7340000	0.7310000
##	[1597]	0.7240000	0.7230000	0.7250000	0.7150000	0.7010000	0.6930000	0.6830000
##	[1604]	0.6750000	0.6630000	0.6530000	0.6510000	0.6410000	0.6320000	0.6220000
##	[1611]	0.6250000	0.6170000	0.6010000	0.5970000	0.5870000	0.5770000	0.4380000
##	[1618]	0.4300000	0.4210000	0.4110000	0.4040000	0.3960000	0.3850000	0.3600000
##	[1625]	0.3630000	0.3500000	0.3380000	0.3330000	0.3180000	0.3080000	0.2970000
##	[1632]	0.2910000	0.8530000	0.8470000	0.8280000	0.8210000	0.8260000	0.8190000
##	[1639]	0.8150000	0.8130000	0.8080000	0.8090000	0.8050000	0.7970000	0.7900000
##	[1646]	0.7860000	0.7830000	0.7790000	0.5130000	0.5090000	0.5010000	0.4910000
##	[1653]	0.4870000	0.4840000	0.4760000	0.4750000	0.4750000	0.4660000	0.4610000
##	[1660]	0.4510000	0.4470000	0.4460000	0.4440000	0.4430000	0.7790000	0.7690000
##	[1667]	0.7650000	0.7560000	0.7480000	0.7400000	0.7340000	0.7280000	0.7200000
##	[1674]	0.7130000	0.7040000	0.6960000	0.6870000	0.6830000	0.6730000	0.6670000
##	[1681]	0.7580000	0.7540000	0.7530000	0.7480000	0.7450000	0.7390000	0.7380000
##	[1688]	0.7350000	0.7310000	0.7230000	0.7190000	0.7140000	0.7080000	0.7030000
##	[1695]	0.7000000	0.6940000	0.6370000	0.6390000	0.6410000	0.6400000	0.6380000
##	[1702]	0.6330000	0.6290000	0.6280000	0.6250000	0.6220000	0.6170000	0.6160000
##	[1709]	0.6120000	0.6080000	0.6040000	0.6583378	0.7330000	0.7290000	0.7200000
##	[1716]	0.7120000	0.7010000	0.6930000	0.6860000	0.6730000	0.6610000	0.6490000
##	[1723]	0.6370000	0.6210000	0.6090000	0.5990000	0.5880000	0.5820000	0.8040000
##	[1730]	0.8030000	0.7990000	0.7970000	0.7920000	0.7870000	0.7850000	0.7740000
##	[1737]	0.7620000	0.7510000	0.7460000	0.7400000	0.6583378	0.6583378	0.6583378
##	[1744]	0.6583378	0.6450000	0.6400000	0.6340000	0.6230000	0.6120000	0.6030000
##	[1751]	0.5960000	0.5890000	0.5810000	0.5750000	0.5690000	0.5610000	0.5510000
##	[1758]	0.5400000	0.5300000	0.5190000	0.4140000	0.4090000	0.4050000	0.4000000
##	[1765]	0.3970000	0.3900000	0.3820000	0.3720000	0.3600000	0.3530000	0.3410000
##	[1772]	0.3320000	0.3180000	0.3110000	0.2980000	0.2910000	0.5520000	0.5470000
##	[1779]	0.5400000	0.5330000	0.5260000	0.5150000	0.5040000	0.4930000	0.4840000
##	[1786]	0.4740000	0.4650000	0.4550000	0.4450000	0.4350000	0.4270000	0.4170000
##	[1793]	0.6370000	0.6320000	0.6250000	0.6190000	0.6120000	0.6040000	0.5980000
##	[1800]	0.5890000	0.5780000	0.5700000	0.5650000	0.5590000	0.5540000	0.5560000
##	[1807]	0.5560000	0.5590000	0.5550000	0.5510000	0.5450000	0.5380000	0.5290000
##	[1814]	0.5150000	0.5020000	0.4920000	0.4860000	0.4760000	0.4690000	0.4630000
##	[1821]	0.4570000	0.4470000	0.4460000	0.4390000	0.9230000	0.9230000	0.9220000
##	[1828]	0.9210000	0.9110000	0.9060000	0.9060000	0.9050000	0.8990000	0.8930000
##	[1835]	0.8880000	0.8850000	0.8810000	0.8820000	0.8780000	0.8730000	0.9130000
##	[1842]	0.9100000	0.9080000	0.9040000	0.9010000	0.8990000	0.8950000	0.8940000
##	[1849]	0.8910000	0.8880000	0.8860000	0.8840000	0.8810000	0.8730000	0.8680000
##	[1856]	0.8640000	0.6420000	0.6360000	0.6300000	0.6250000	0.6200000	0.6140000

##	[1863]	0.6130000	0.6070000	0.6010000	0.5970000	0.5920000	0.5870000	0.5830000
##	[1870]	0.5770000	0.5700000	0.5620000	0.3510000	0.3450000	0.3410000	0.3310000
##	[1877]	0.3230000	0.3120000	0.3070000	0.2980000	0.2930000	0.2860000	0.2780000
##	[1884]	0.2700000	0.2660000	0.2610000	0.2550000	0.2530000	0.5250000	0.5210000
##	[1891]	0.5140000	0.5070000	0.5000000	0.4920000	0.4870000	0.4810000	0.4770000
##	[1898]	0.4660000	0.4630000	0.4450000	0.6583378	0.6583378	0.6583378	0.6583378
##	[1905]	0.9480000	0.9450000	0.9420000	0.9410000	0.9390000	0.9360000	0.9360000
##	[1912]	0.9360000	0.9340000	0.9310000	0.9290000	0.9240000	0.9180000	0.9160000
##	[1919]	0.9170000	0.9110000	0.7950000	0.7960000	0.7960000	0.7970000	0.7970000
##	[1926]	0.7970000	0.7820000	0.7650000	0.7530000	0.7480000	0.7420000	0.7340000
##	[1933]	0.7250000	0.7160000	0.7050000	0.6583378	0.5480000	0.5420000	0.5380000
##	[1940]	0.5290000	0.5250000	0.5210000	0.5140000	0.5130000	0.5050000	0.5010000
##	[1947]	0.4870000	0.4740000	0.4650000	0.4570000	0.4500000	0.4450000	0.7850000
##	[1954]	0.7800000	0.7730000	0.7650000	0.7580000	0.7560000	0.7550000	0.7500000
##	[1961]	0.7430000	0.7440000	0.7400000	0.7330000	0.7280000	0.7250000	0.7210000
##	[1968]	0.7160000	0.5150000	0.5110000	0.5060000	0.5010000	0.4940000	0.4850000
##	[1975]	0.4770000	0.4690000	0.4610000	0.4540000	0.4460000	0.4390000	0.4330000
##	[1982]	0.4280000	0.4220000	0.4180000	0.6920000	0.6880000	0.6790000	0.6790000
##	[1989]	0.6750000	0.6640000	0.6630000	0.6540000	0.6490000	0.6480000	0.6460000
##	[1996]	0.6390000	0.6420000	0.6320000	0.6240000	0.6250000	0.7370000	0.7350000
##	[2003]	0.7310000	0.7250000	0.7210000	0.7080000	0.7060000	0.7000000	0.6960000
##	[2010]	0.6930000	0.6920000	0.6850000	0.6860000	0.6860000	0.6770000	0.6740000
##	[2017]	0.6790000	0.6760000	0.6710000	0.6660000	0.6690000	0.6620000	0.6610000
##	[2024]	0.6550000	0.6480000	0.6460000	0.6420000	0.6360000	0.6310000	0.6250000
##	[2031]	0.6220000	0.6180000	0.8520000	0.8500000	0.8380000	0.8340000	0.8290000
##	[2038]	0.8220000	0.8180000	0.8130000	0.8080000	0.8030000	0.7970000	0.8000000
##	[2045]	0.7960000	0.7900000	0.7840000	0.7770000	0.8410000	0.8370000	0.8270000
##	[2052]	0.8240000	0.8180000	0.8120000	0.8090000	0.8040000	0.7970000	0.7930000
##	[2059]	0.7900000	0.7920000	0.7890000	0.7880000	0.7820000	0.7770000	0.8550000
##	[2066]	0.8540000	0.8430000	0.8370000	0.8270000	0.8250000	0.8280000	0.8250000
##	[2073]	0.8300000	0.8350000	0.8300000	0.8260000	0.8150000	0.8070000	0.8090000
##	[2080]	0.8080000	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2087]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2094]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2101]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2108]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.7980000	0.7970000
##	[2115]	0.7940000	0.7970000	0.7980000	0.7970000	0.7950000	0.7800000	0.7660000
##	[2122]	0.7550000	0.7450000	0.7330000	0.7220000	0.7140000	0.7080000	0.7030000
##	[2129]	0.8050000	0.8030000	0.7990000	0.7920000	0.7850000	0.7730000	0.7760000
##	[2136]	0.7690000	0.7610000	0.7540000	0.7480000	0.7410000	0.7330000	0.7270000
##	[2143]	0.7200000	0.7090000	0.4930000	0.4880000	0.4850000	0.4750000	0.4640000
##	[2150]	0.4540000	0.4470000	0.4380000	0.4240000	0.4040000	0.3880000	0.3710000
##	[2157]	0.3590000	0.3430000	0.3320000	0.3180000	0.7350000	0.7230000	0.7340000
##	[2164]	0.7350000	0.7330000	0.7240000	0.7170000	0.7100000	0.7070000	0.6940000
##	[2171]	0.6890000	0.6860000	0.6840000	0.6810000	0.6840000	0.6583378	0.7200000
##	[2178]	0.7200000	0.7170000	0.7130000	0.7120000	0.7110000	0.7090000	0.7040000
##	[2185]	0.7020000	0.6950000	0.6920000	0.6890000	0.6820000	0.6770000	0.6730000
##	[2192]	0.6583378	0.7020000	0.7010000	0.7000000	0.6980000	0.6930000	0.6900000
##	[2199]	0.6910000	0.6880000	0.6820000	0.6770000	0.6710000	0.6650000	0.6590000
##	[2206]	0.6530000	0.6450000	0.6400000	0.5650000	0.5620000	0.5590000	0.5530000
##	[2213]	0.5460000	0.5420000	0.5330000	0.5310000	0.5270000	0.5210000	0.5140000
##	[2220]	0.5090000	0.5040000	0.5010000	0.4970000	0.4880000	0.8450000	0.8410000
##	[2227]	0.8300000	0.8180000	0.8040000	0.7920000	0.7870000	0.7790000	0.7730000
##	[2234]	0.7670000	0.7610000	0.7540000	0.7470000	0.7450000	0.7420000	0.7370000
##	[2241]	0.4910000	0.4830000	0.4740000	0.4630000	0.4550000	0.4490000	0.4440000
##	[2248]	0.4350000	0.4250000	0.4220000	0.4150000	0.4080000	0.4010000	0.3970000
##	[2255]	0.3810000	0.3780000	0.7750000	0.7710000	0.7660000	0.7670000	0.7570000
##	[2262]	0.7550000	0.7540000	0.7490000	0.7430000	0.7390000	0.7300000	0.7200000
##	[2269]	0.7150000	0.7150000	0.7090000	0.7020000	0.7810000	0.7660000	0.7620000
##	[2276]	0.7550000	0.7440000	0.7400000	0.7390000	0.7390000	0.7330000	0.7280000
##	[2283]	0.7120000	0.7150000	0.7130000	0.7120000	0.7140000	0.6583378	0.4310000
##	[2290]	0.4260000	0.4130000	0.4010000	0.3920000	0.3840000	0.3750000	0.3670000
##	[2297]	0.3570000	0.3480000	0.3410000	0.3320000	0.3220000	0.3060000	0.3020000
##	[2304]	0.2920000	0.9240000	0.9220000	0.9200000	0.9170000	0.9110000	0.8890000
##	[2311]	0.8870000	0.8800000	0.8730000	0.8390000	0.8210000	0.8200000	0.8190000
##	[2318]	0.8180000	0.8200000	0.8100000	0.8420000	0.8410000	0.8380000	0.8350000

##	[2325]	0.8290000	0.8220000	0.8200000	0.8130000	0.8020000	0.7930000	0.7840000
##	[2332]	0.7760000	0.7710000	0.7630000	0.7630000	0.7610000	0.8880000	0.8880000
##	[2339]	0.8780000	0.8770000	0.8760000	0.8720000	0.8730000	0.8690000	0.8650000
##	[2346]	0.8580000	0.8530000	0.8500000	0.8430000	0.8350000	0.8240000	0.8180000
##	[2353]	0.5140000	0.5120000	0.5090000	0.5050000	0.4970000	0.4920000	0.4940000
##	[2360]	0.4890000	0.4820000	0.4700000	0.4650000	0.4590000	0.4530000	0.4460000
##	[2367]	0.4420000	0.4550000	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2374]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2381]	0.6583378	0.6583378	0.6583378	0.6583378	0.6650000	0.6600000	0.6520000
##	[2388]	0.6440000	0.6380000	0.6300000	0.6220000	0.6160000	0.6120000	0.6090000
##	[2395]	0.6090000	0.6110000	0.6130000	0.6200000	0.6290000	0.6350000	0.4210000
##	[2402]	0.4210000	0.4170000	0.4190000	0.4290000	0.6583378	0.6583378	0.6583378
##	[2409]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2416]	0.6583378	0.8820000	0.8770000	0.8740000	0.8710000	0.8670000	0.8600000
##	[2423]	0.8580000	0.8540000	0.8490000	0.8440000	0.8370000	0.8330000	0.8300000
##	[2430]	0.8280000	0.8250000	0.8200000	0.7640000	0.7600000	0.7570000	0.7520000
##	[2437]	0.7460000	0.7390000	0.7350000	0.7310000	0.7250000	0.7180000	0.7120000
##	[2444]	0.7050000	0.6970000	0.6990000	0.6860000	0.6770000	0.4880000	0.4850000
##	[2451]	0.4780000	0.4680000	0.4630000	0.4610000	0.4560000	0.4440000	0.4400000
##	[2458]	0.4300000	0.4230000	0.4150000	0.4090000	0.4030000	0.3990000	0.3940000
##	[2465]	0.7230000	0.7220000	0.7190000	0.7080000	0.7040000	0.7000000	0.6960000
##	[2472]	0.6910000	0.6840000	0.6780000	0.6720000	0.6583378	0.6583378	0.6583378
##	[2479]	0.6583378	0.6583378	0.5410000	0.5410000	0.5390000	0.5340000	0.5260000
##	[2486]	0.5230000	0.5190000	0.5140000	0.5080000	0.5020000	0.4950000	0.4920000
##	[2493]	0.4930000	0.5020000	0.5060000	0.5160000	0.9090000	0.9060000	0.9040000
##	[2500]	0.9030000	0.9010000	0.8950000	0.8980000	0.8970000	0.8950000	0.8920000
##	[2507]	0.8900000	0.8880000	0.8820000	0.8800000	0.8770000	0.8730000	0.9380000
##	[2514]	0.9360000	0.9340000	0.9320000	0.9320000	0.9200000	0.9160000	0.9140000
##	[2521]	0.9110000	0.9040000	0.8990000	0.8950000	0.8890000	0.8900000	0.8880000
##	[2528]	0.8790000	0.5530000	0.5750000	0.6350000	0.6450000	0.6460000	0.6500000
##	[2535]	0.6480000	0.6510000	0.6440000	0.6360000	0.6240000	0.6100000	0.5990000
##	[2542]	0.5960000	0.5890000	0.5880000	0.6250000	0.6220000	0.6170000	0.6130000
##	[2549]	0.6080000	0.6030000	0.6010000	0.5920000	0.5860000	0.5790000	0.5720000
##	[2556]	0.5630000	0.5530000	0.5430000	0.5350000	0.5290000	0.7380000	0.7370000
##	[2563]	0.7330000	0.7290000	0.7200000	0.7110000	0.7060000	0.7000000	0.6870000
##	[2570]	0.6860000	0.6820000	0.6740000	0.6660000	0.6570000	0.6490000	0.6400000
##	[2577]	0.7460000	0.7430000	0.7410000	0.7390000	0.7350000	0.7320000	0.7300000
##	[2584]	0.7140000	0.7090000	0.7030000	0.6583378	0.6583378	0.6583378	0.6583378
##	[2591]	0.6583378	0.6583378	0.6030000	0.6120000	0.6200000	0.6180000	0.6070000
##	[2598]	0.5990000	0.5990000	0.5660000	0.5410000	0.5110000	0.4920000	0.4840000
##	[2605]	0.4850000	0.4750000	0.4700000	0.6583378	0.4840000	0.4750000	0.4700000
##	[2612]	0.4640000	0.4570000	0.4490000	0.4420000	0.4410000	0.4430000	0.4360000
##	[2619]	0.4350000	0.4320000	0.4280000	0.4280000	0.4260000	0.4250000	0.7180000
##	[2626]	0.7160000	0.7180000	0.7170000	0.7120000	0.7070000	0.7030000	0.6980000
##	[2633]	0.6980000	0.6950000	0.6940000	0.6930000	0.6830000	0.6790000	0.6740000
##	[2640]	0.6760000	0.7790000	0.7780000	0.7730000	0.7720000	0.7740000	0.7720000
##	[2647]	0.7730000	0.7670000	0.7600000	0.7510000	0.7450000	0.7360000	0.7290000
##	[2654]	0.7210000	0.7150000	0.7090000	0.7230000	0.7220000	0.7200000	0.7170000
##	[2661]	0.7140000	0.7100000	0.7060000	0.7010000	0.6950000	0.6890000	0.6830000
##	[2668]	0.6730000	0.6670000	0.6620000	0.6540000	0.6460000	0.7640000	0.7590000
##	[2675]	0.7540000	0.7500000	0.7370000	0.7150000	0.7090000	0.7050000	0.6970000
##	[2682]	0.6870000	0.6810000	0.6750000	0.6680000	0.6580000	0.6530000	0.6410000
##	[2689]	0.6880000	0.6830000	0.6780000	0.6720000	0.6650000	0.6583378	0.6583378
##	[2696]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2703]	0.6583378	0.6583378	0.4880000	0.4830000	0.4780000	0.4770000	0.4770000
##	[2710]	0.4730000	0.4640000	0.4530000	0.4420000	0.4340000	0.4290000	0.4270000
##	[2717]	0.4180000	0.4040000	0.3960000	0.3820000	0.7480000	0.7460000	0.7440000
##	[2724]	0.7390000	0.7340000	0.7280000	0.7340000	0.7300000	0.7230000	0.7160000
##	[2731]	0.7070000	0.7000000	0.6910000	0.6830000	0.6730000	0.6690000	0.8360000
##	[2738]	0.8320000	0.8290000	0.8260000	0.8240000	0.8260000	0.8310000	0.8290000
##	[2745]	0.8260000	0.8230000	0.8180000	0.8130000	0.8080000	0.8030000	0.7980000
##	[2752]	0.7910000	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2759]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2766]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2773]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378
##	[2780]	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378	0.6583378

```
## [2787] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
## [2794] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378
## [2801] 0.7940000 0.7910000 0.7880000 0.7840000 0.7800000 0.7770000 0.7740000
## [2808] 0.7700000 0.7600000 0.7560000 0.7530000 0.7500000 0.7470000 0.7460000
## [2815] 0.7420000 0.7380000 0.6970000 0.6900000 0.6810000 0.6730000 0.6640000
## [2822] 0.6570000 0.6510000 0.6440000 0.6310000 0.6260000 0.6200000 0.6130000
## [2829] 0.6070000 0.6000000 0.5940000 0.6583378 0.5980000 0.5960000 0.5910000
## [2836] 0.5920000 0.5910000 0.5900000 0.5890000 0.5820000 0.5790000 0.5720000
## [2843] 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.6583378 0.7690000
## [2850] 0.7710000 0.7700000 0.7670000 0.7560000 0.7540000 0.7540000 0.7450000
## [2857] 0.7280000 0.7140000 0.7000000 0.6870000 0.6880000 0.6840000 0.6720000
## [2864] 0.6700000 0.6780000 0.6750000 0.6680000 0.6620000 0.6550000 0.6470000
## [2871] 0.6410000 0.6330000 0.6250000 0.6180000 0.6090000 0.6010000 0.5920000
## [2878] 0.5840000 0.5760000 0.5690000 0.4990000 0.5000000 0.4980000 0.4940000
## [2885] 0.4930000 0.4880000 0.4830000 0.4800000 0.4770000 0.4750000 0.4700000
## [2892] 0.4640000 0.4570000 0.4500000 0.4440000 0.4360000 0.5760000 0.5700000
## [2899] 0.5650000 0.5540000 0.5430000 0.5330000 0.5180000 0.5040000 0.4920000
## [2906] 0.4790000 0.4670000 0.4560000 0.4430000 0.4330000 0.4240000 0.4180000
## [2913] 0.5070000 0.4980000 0.4880000 0.4640000 0.4520000 0.4360000 0.4190000
## [2920] 0.4210000 0.4140000 0.4080000 0.4060000 0.4070000 0.4180000 0.4270000
## [2927] 0.4270000 0.4340000
```

```
# Replace zero for Schooling with its mean
lifeExp_final$Schooling <- replace(lifeExp_final$Schooling,
                                   lifeExp_final$Schooling == 0, NA)
summary(lifeExp_final$Schooling)
```

```
##      Min. 1st Qu.  Median      Mean 3rd Qu.     Max.      NA's
##      2.80   10.20   12.40   12.11   14.30   20.70       186
```

```
lifeExp_final$Schooling[is.na(lifeExp_final$Schooling)] <-
  mean(lifeExp_final$Schooling, na.rm=TRUE)
lifeExp_final$Schooling
```

```
##      [1] 10.10000 10.00000  9.90000  9.80000  9.50000  9.20000  8.90000  8.70000
##      [9]  8.40000  8.10000  7.90000  6.80000  6.50000  6.20000  5.90000  5.50000
##     [17] 14.20000 14.20000 14.20000 14.20000 13.30000 12.50000 12.20000 12.00000
##     [25] 11.60000 11.40000 10.80000 10.90000 10.70000 10.70000 10.60000 10.70000
##     [33] 14.40000 14.40000 14.40000 14.40000 14.00000 13.60000 13.10000 12.60000
##     [41] 12.30000 12.30000 12.00000 11.70000 11.50000 11.10000 10.90000 10.70000
##     [49] 11.40000 11.40000 11.40000 10.30000  9.40000  9.00000  8.50000  8.10000
##     [57]  7.70000  7.20000  6.80000  6.40000  5.90000  5.50000  5.10000  4.60000
##     [65] 13.90000 13.90000 13.90000 13.80000 14.10000 14.10000 14.20000 14.40000
##     [73] 14.50000 14.70000 12.11342 12.11342 12.11342 12.11342 12.11342 12.11342
##     [81] 17.30000 17.30000 17.30000 17.20000 17.10000 16.80000 16.50000 16.30000
##     [89] 16.30000 16.10000 16.30000 16.30000 16.40000 16.30000 15.60000 15.00000
##     [97] 12.70000 12.70000 12.70000 12.70000 12.70000 12.30000 11.90000 12.30000
##    [105] 11.70000 11.20000 10.90000 10.90000 10.80000 10.80000 11.10000 11.20000
##    [113] 20.40000 20.40000 20.30000 20.10000 19.80000 19.50000 19.10000 19.10000
##    [121] 19.00000 20.30000 20.30000 20.70000 20.60000 20.10000 20.50000 20.40000
##    [129] 15.90000 15.90000 15.70000 15.70000 15.70000 15.40000 15.30000 15.10000
##    [137] 15.20000 15.00000 14.90000 14.70000 14.70000 16.10000 15.50000 15.40000
##    [145] 12.70000 12.20000 11.90000 11.80000 11.70000 11.70000 11.60000 11.60000
##    [153] 11.60000 10.70000 11.20000 11.00000 10.80000 10.60000 10.40000 10.10000
##    [161] 12.60000 12.60000 12.60000 12.60000 12.60000 12.60000 12.60000 12.60000
##    [169] 12.50000 12.40000 12.40000 12.30000 12.20000 12.10000 12.10000 12.00000
##    [177] 14.50000 14.50000 14.50000 14.50000 14.40000 14.40000 14.40000 14.40000
##    [185] 14.40000 14.20000 14.00000 13.90000 13.70000 13.50000 13.30000 13.20000
##    [193] 10.20000 10.00000 10.00000  9.90000  9.40000  8.90000  8.40000  8.60000
##    [201]  8.60000  8.40000  8.20000  8.10000  7.90000  7.70000  7.50000  7.30000
##    [209] 15.30000 15.30000 15.30000 15.30000 15.50000 15.80000 15.50000 15.30000
##    [217] 15.00000 14.80000 14.60000 14.40000 14.20000 14.00000 14.00000 14.00000
##    [225] 15.60000 15.70000 15.70000 15.60000 15.50000 15.50000 15.40000 15.10000
##    [233] 14.90000 14.60000 14.40000 14.10000 13.90000 13.60000 13.30000 13.10000
##    [241] 16.60000 16.30000 16.30000 16.20000 16.10000 15.90000 15.80000 15.80000
##    [249] 15.80000 15.70000 15.70000 18.80000 18.60000 18.80000 18.20000 18.00000
##    [257] 12.80000 12.80000 12.90000 12.50000 12.40000 12.40000 12.70000 12.80000
```


##	[265]	12.80000	12.30000	12.80000	12.50000	12.20000	11.90000	11.80000	11.70000
##	[273]	10.70000	10.70000	10.30000	10.00000	9.80000	9.50000	9.30000	9.10000
##	[281]	8.90000	8.70000	8.50000	8.10000	7.70000	7.30000	6.60000	6.40000
##	[289]	12.50000	12.50000	12.60000	12.30000	11.90000	11.40000	10.90000	10.50000
##	[297]	10.10000	9.60000	9.20000	8.80000	8.40000	8.00000	7.60000	7.30000
##	[305]	13.80000	13.80000	13.80000	13.80000	13.80000	13.80000	13.80000	14.00000
##	[313]	14.10000	14.30000	14.40000	14.60000	14.40000	14.00000	13.70000	13.30000
##	[321]	14.20000	14.20000	14.20000	13.90000	13.40000	13.30000	13.30000	13.10000
##	[329]	12.90000	12.70000	12.50000	12.30000	12.10000	11.90000	11.60000	12.11342
##	[337]	12.60000	12.60000	12.60000	12.50000	12.40000	12.30000	12.20000	12.10000
##	[345]	12.10000	11.90000	11.90000	11.80000	11.80000	11.90000	11.80000	11.70000
##	[353]	15.20000	15.20000	14.20000	14.20000	14.00000	13.80000	13.80000	13.30000
##	[361]	13.50000	13.80000	13.80000	14.00000	14.80000	14.60000	14.30000	14.10000
##	[369]	14.90000	15.00000	14.90000	14.40000	14.10000	14.20000	14.10000	14.20000
##	[377]	14.30000	14.30000	14.10000	13.70000	13.40000	13.30000	13.40000	13.40000
##	[385]	15.00000	14.80000	14.40000	14.30000	14.20000	13.90000	13.80000	13.80000
##	[393]	13.50000	13.50000	13.50000	13.30000	12.90000	12.90000	12.90000	12.90000
##	[401]	7.70000	7.70000	7.50000	7.20000	6.70000	6.30000	5.90000	5.40000
##	[409]	4.90000	4.70000	4.30000	3.90000	3.80000	3.60000	3.50000	3.40000
##	[417]	10.60000	10.60000	10.50000	10.30000	9.90000	9.30000	8.60000	7.90000
##	[425]	7.20000	5.90000	5.60000	5.20000	4.70000	4.40000	4.50000	4.50000
##	[433]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[441]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[449]	13.50000	13.50000	13.60000	13.20000	13.10000	12.70000	12.40000	12.20000
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##	[465]	10.90000	10.90000	10.80000	10.70000	10.70000	10.60000	10.50000	10.50000
##	[473]	10.30000	10.10000	10.00000	9.70000	9.30000	8.20000	7.60000	7.20000
##	[481]	10.40000	10.40000	10.40000	10.40000	10.00000	9.70000	9.20000	8.80000
##	[489]	8.00000	8.20000	8.30000	8.20000	8.10000	8.40000	7.10000	6.90000
##	[497]	16.30000	15.90000	15.90000	15.90000	15.90000	15.90000	15.90000	15.80000
##	[505]	15.80000	15.80000	15.80000	15.80000	15.80000	15.80000	15.80000	15.90000
##	[513]	7.10000	7.10000	7.10000	7.10000	6.80000	6.60000	6.40000	6.30000
##	[521]	6.20000	6.00000	5.90000	5.70000	5.60000	5.40000	5.30000	5.20000
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##	[537]	5.70000	5.50000	5.60000	5.60000	5.40000	5.10000	4.90000	4.70000
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##	[553]	14.80000	14.90000	14.60000	14.30000	14.00000	13.90000	13.70000	13.50000
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##	[569]	11.40000	11.00000	10.60000	10.20000	9.90000	9.70000	9.60000	9.50000
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##	[593]	11.10000	11.10000	10.90000	10.80000	10.60000	10.50000	10.30000	10.20000
##	[601]	10.00000	9.90000	9.70000	9.50000	9.20000	8.80000	8.50000	8.20000
##	[609]	11.10000	11.10000	11.10000	10.20000	10.70000	10.50000	10.30000	10.00000
##	[617]	9.80000	9.60000	9.40000	9.20000	9.40000	9.50000	9.70000	9.80000
##	[625]	14.20000	13.90000	13.70000	13.60000	13.40000	13.30000	13.10000	12.90000
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##	[673]	14.30000	14.00000	13.80000	13.80000	13.80000	14.60000	14.10000	13.70000
##	[681]	13.50000	13.40000	13.50000	13.40000	13.00000	12.50000	12.40000	12.50000
##	[689]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[697]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[705]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[713]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
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##	[729]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[737]	19.20000	19.20000	18.70000	18.40000	16.90000	16.80000	16.80000	16.80000
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##	[753]	6.30000	6.30000	6.30000	6.30000	5.90000	5.50000	5.30000	5.00000
##	[761]	4.50000	4.30000	4.00000	3.70000	3.50000	3.30000	2.90000	2.90000
##	[769]	13.20000	13.20000	13.20000	13.10000	13.00000	12.90000	12.90000	12.80000
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##	[785]	14.00000	14.00000	13.40000	13.30000	13.20000	13.10000	13.10000	13.00000

##	[793]	12.90000	12.80000	12.80000	12.70000	12.60000	12.50000	12.40000	12.40000
##	[801]	13.10000	13.10000	12.80000	12.40000	12.40000	12.20000	12.00000	11.90000
##	[809]	11.70000	11.50000	11.40000	11.20000	11.30000	11.20000	11.10000	11.00000
##	[817]	13.20000	13.20000	13.20000	13.20000	13.00000	12.90000	12.80000	13.40000
##	[825]	12.90000	12.90000	12.70000	12.40000	12.00000	11.80000	11.60000	11.30000
##	[833]	9.20000	9.20000	9.20000	9.20000	9.20000	9.20000	9.10000	9.10000
##	[841]	9.00000	9.00000	8.70000	8.50000	8.40000	8.20000	8.00000	12.11342
##	[849]	5.00000	5.00000	5.00000	5.00000	5.00000	5.10000	5.20000	5.20000
##	[857]	5.30000	5.30000	5.40000	5.00000	4.70000	4.40000	4.30000	3.90000
##	[865]	16.50000	16.50000	16.50000	16.50000	16.40000	16.20000	16.10000	16.10000
##	[873]	16.10000	16.10000	15.90000	15.70000	15.60000	15.40000	15.00000	14.40000
##	[881]	8.40000	8.40000	8.40000	8.40000	8.20000	8.10000	8.10000	7.60000
##	[889]	7.10000	6.60000	5.80000	5.40000	5.20000	4.90000	4.30000	3.90000
##	[897]	15.30000	15.20000	15.00000	14.90000	14.70000	14.60000	14.50000	14.30000
##	[905]	14.20000	14.00000	13.90000	13.40000	13.30000	13.30000	13.20000	13.10000
##	[913]	17.00000	17.00000	17.00000	17.00000	16.90000	16.80000	17.00000	17.10000
##	[921]	17.20000	17.20000	17.10000	18.30000	18.10000	18.00000	17.70000	17.30000
##	[929]	16.30000	16.20000	16.20000	16.10000	16.10000	16.00000	16.00000	16.10000
##	[937]	16.10000	16.10000	15.50000	15.50000	15.40000	15.50000	15.60000	15.70000
##	[945]	12.60000	12.60000	12.50000	12.50000	12.50000	12.50000	12.40000	12.40000
##	[953]	12.40000	12.40000	12.40000	12.30000	12.30000	12.30000	12.30000	12.20000
##	[961]	8.90000	8.90000	8.90000	8.80000	8.70000	8.80000	8.90000	8.60000
##	[969]	8.40000	8.10000	7.80000	7.60000	7.30000	7.00000	6.80000	6.50000
##	[977]	13.90000	13.50000	13.50000	13.40000	13.30000	13.30000	12.80000	13.10000
##	[985]	12.50000	12.60000	12.20000	12.00000	11.80000	11.80000	11.70000	11.40000
##	[993]	17.10000	17.00000	16.90000	16.90000	16.80000	16.70000	16.70000	16.60000
##	[1001]	16.60000	16.50000	16.40000	16.40000	16.30000	16.30000	16.20000	16.20000
##	[1009]	11.40000	11.70000	11.50000	11.20000	10.90000	10.50000	10.40000	9.80000
##	[1017]	9.10000	8.70000	8.10000	7.70000	7.90000	7.60000	8.00000	7.70000
##	[1025]	17.20000	17.20000	17.10000	16.80000	16.70000	16.40000	16.20000	15.90000
##	[1033]	16.40000	16.30000	15.60000	15.30000	15.20000	14.60000	14.20000	13.90000
##	[1041]	15.80000	15.80000	15.80000	15.80000	15.80000	15.80000	15.60000	15.40000
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##	[1057]	10.70000	10.70000	10.70000	10.60000	10.50000	10.50000	10.40000	10.40000
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##	[1073]	8.80000	8.60000	8.50000	8.50000	8.40000	8.30000	8.10000	7.90000
##	[1081]	7.60000	7.10000	6.60000	5.10000	5.90000	5.50000	5.10000	4.80000
##	[1089]	9.20000	9.20000	9.10000	9.10000	9.00000	8.90000	8.90000	8.80000
##	[1097]	8.80000	8.30000	8.00000	7.70000	7.40000	7.10000	6.70000	6.40000
##	[1105]	10.30000	10.30000	10.30000	10.60000	10.30000	10.20000	10.50000	10.70000
##	[1113]	11.20000	11.70000	11.40000	11.20000	11.10000	11.00000	10.90000	10.90000
##	[1121]	9.10000	9.10000	9.10000	8.90000	8.70000	8.60000	8.50000	8.40000
##	[1129]	8.40000	8.30000	8.20000	8.10000	8.10000	8.00000	7.90000	7.80000
##	[1137]	11.20000	11.40000	11.60000	11.60000	11.70000	11.50000	11.30000	11.10000
##	[1145]	10.90000	10.80000	10.60000	10.40000	10.30000	10.10000	9.90000	9.80000
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##	[1169]	19.00000	19.00000	19.00000	18.70000	18.60000	18.40000	18.40000	18.20000
##	[1177]	18.20000	18.10000	17.90000	18.30000	17.60000	17.20000	17.10000	16.80000
##	[1185]	11.60000	11.60000	11.50000	11.30000	10.80000	10.40000	10.50000	10.20000
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##	[1201]	12.90000	12.90000	12.90000	12.60000	12.30000	12.10000	11.70000	11.70000
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##	[1225]	11.80000	11.40000	11.40000	11.80000	11.80000	11.90000	11.60000	11.60000
##	[1233]	10.10000	10.10000	10.30000	10.50000	10.40000	10.40000	10.30000	10.30000
##	[1241]	10.20000	10.20000	10.10000	9.80000	9.40000	9.10000	8.70000	8.60000
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##	[1257]	17.60000	17.60000	17.50000	17.10000	16.80000	16.50000	16.40000	16.20000
##	[1265]	16.00000	16.00000	15.90000	15.90000	15.80000	15.70000	15.60000	15.80000
##	[1273]	15.70000	15.70000	15.80000	15.90000	16.00000	15.30000	15.10000	15.20000
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##	[1289]	16.10000	16.00000	15.80000	15.60000	15.40000	15.20000	14.90000	14.80000
##	[1297]	12.80000	12.80000	12.80000	12.80000	12.80000	12.70000	12.70000	12.60000
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## [1801] 11.30000 11.40000 11.60000 11.70000 11.70000 11.80000 11.70000 11.50000
## [1809] 12.20000 12.40000 12.30000 12.30000 12.00000 11.10000 10.50000 10.10000
## [1817] 10.00000 9.60000 9.40000 9.30000 9.20000 8.60000 9.00000 8.90000
## [1825] 18.10000 18.10000 18.10000 18.10000 17.20000 17.00000 16.90000 16.80000
## [1833] 16.60000 16.50000 16.40000 16.50000 16.50000 16.90000 16.70000 16.50000
## [1841] 19.20000 19.20000 19.30000 19.50000 19.70000 20.30000 19.30000 19.50000

```

##	[1849]	19.20000	19.10000	18.90000	18.40000	18.20000	17.50000	17.40000	17.20000
##	[1857]	11.70000	11.60000	11.50000	11.50000	11.50000	11.40000	11.30000	11.10000
##	[1865]	11.00000	11.00000	11.00000	11.00000	11.00000	10.70000	10.40000	10.10000
##	[1873]	5.40000	5.30000	5.30000	5.10000	4.80000	4.50000	4.20000	4.00000
##	[1881]	3.80000	3.70000	3.50000	3.10000	3.00000	2.90000	2.90000	2.80000
##	[1889]	10.00000	10.00000	9.80000	9.70000	9.60000	9.50000	9.30000	9.20000
##	[1897]	9.10000	9.00000	8.90000	8.50000	8.10000	7.70000	8.00000	7.60000
##	[1905]	17.70000	17.70000	17.50000	17.60000	17.60000	17.40000	17.40000	17.60000
##	[1913]	17.60000	17.50000	17.60000	17.50000	17.10000	17.10000	17.50000	17.10000
##	[1921]	13.70000	13.70000	13.70000	13.70000	13.60000	13.50000	12.40000	11.90000
##	[1929]	11.50000	11.60000	11.50000	11.50000	11.20000	11.00000	10.70000	10.40000
##	[1937]	8.10000	7.80000	7.70000	7.60000	7.50000	7.50000	7.30000	7.30000
##	[1945]	6.70000	6.50000	6.10000	5.60000	5.60000	5.50000	5.40000	5.30000
##	[1953]	13.00000	13.00000	12.90000	12.80000	12.90000	12.80000	12.80000	12.80000
##	[1961]	12.90000	12.90000	12.90000	12.80000	12.80000	12.60000	12.40000	12.10000
##	[1969]	10.00000	10.00000	10.00000	9.90000	9.90000	9.60000	9.20000	8.90000
##	[1977]	8.60000	8.20000	7.90000	7.60000	7.20000	6.90000	6.60000	6.20000
##	[1985]	12.30000	12.30000	12.30000	12.30000	12.30000	12.40000	12.10000	11.90000
##	[1993]	12.00000	12.10000	12.30000	12.10000	12.70000	12.20000	11.80000	11.60000
##	[2001]	13.40000	13.40000	13.40000	13.40000	13.40000	13.30000	13.30000	13.20000
##	[2009]	13.20000	13.00000	13.00000	12.80000	13.30000	13.90000	13.40000	13.50000
##	[2017]	11.70000	11.70000	11.70000	11.60000	11.50000	11.40000	11.70000	11.50000
##	[2025]	11.40000	11.50000	11.60000	11.60000	11.60000	11.40000	11.40000	11.40000
##	[2033]	16.40000	16.40000	15.40000	15.30000	15.40000	15.10000	15.10000	15.00000
##	[2041]	15.00000	15.00000	14.80000	15.50000	15.30000	15.00000	14.70000	14.60000
##	[2049]	16.60000	16.80000	16.30000	16.30000	16.20000	16.00000	16.00000	15.80000
##	[2057]	15.40000	15.40000	15.40000	15.90000	15.80000	15.90000	15.70000	15.50000
##	[2065]	13.40000	13.40000	13.40000	13.40000	12.40000	12.00000	11.80000	11.70000
##	[2073]	12.60000	13.70000	13.70000	13.50000	12.80000	12.20000	12.60000	13.00000
##	[2081]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2089]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2097]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2105]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2113]	14.70000	14.70000	14.70000	15.30000	15.70000	15.80000	15.40000	14.70000
##	[2121]	14.10000	13.70000	13.40000	12.90000	12.50000	12.00000	11.70000	11.50000
##	[2129]	15.00000	14.90000	14.60000	14.30000	14.00000	13.70000	14.00000	13.90000
##	[2137]	13.80000	13.80000	13.70000	13.60000	13.20000	12.80000	12.50000	12.10000
##	[2145]	10.80000	10.80000	10.80000	10.50000	10.20000	10.00000	10.20000	10.40000
##	[2153]	10.10000	9.30000	8.80000	8.20000	7.60000	7.20000	7.10000	6.60000
##	[2161]	13.10000	13.10000	13.10000	13.00000	12.90000	12.80000	12.70000	12.60000
##	[2169]	12.80000	12.40000	12.20000	12.30000	12.40000	12.50000	12.60000	12.80000
##	[2177]	13.30000	13.30000	13.30000	13.30000	13.30000	13.30000	13.30000	13.30000
##	[2185]	13.30000	13.30000	13.30000	13.20000	13.00000	12.90000	12.80000	12.70000
##	[2193]	12.90000	12.90000	12.90000	12.90000	12.90000	12.90000	12.90000	12.90000
##	[2201]	12.90000	12.70000	12.60000	12.40000	12.30000	12.10000	12.00000	12.10000
##	[2209]	11.20000	11.10000	11.00000	10.80000	10.60000	10.60000	10.10000	10.40000
##	[2217]	10.30000	10.20000	10.00000	9.80000	9.70000	9.60000	9.40000	9.30000
##	[2225]	16.10000	15.80000	15.20000	14.50000	13.90000	13.30000	13.00000	12.80000
##	[2233]	12.70000	12.50000	12.40000	12.30000	12.20000	12.10000	12.00000	11.80000
##	[2241]	9.50000	9.10000	8.70000	8.30000	7.90000	7.70000	7.50000	7.10000
##	[2249]	6.80000	6.60000	6.40000	6.20000	5.90000	5.70000	5.40000	5.20000
##	[2257]	14.40000	14.30000	14.10000	14.00000	13.50000	13.60000	13.60000	13.50000
##	[2265]	13.50000	13.40000	13.20000	13.10000	13.00000	13.20000	13.10000	13.00000
##	[2273]	14.10000	13.20000	13.50000	13.50000	13.30000	13.20000	13.20000	13.20000
##	[2281]	13.10000	13.10000	12.10000	12.30000	12.10000	12.10000	12.20000	12.30000
##	[2289]	9.50000	9.50000	9.30000	9.10000	8.90000	8.70000	8.50000	8.30000
##	[2297]	8.20000	8.00000	7.80000	7.60000	7.40000	7.20000	7.00000	6.70000
##	[2305]	15.40000	15.40000	15.40000	15.40000	15.20000	14.50000	14.40000	14.20000
##	[2313]	14.10000	13.90000	12.60000	12.70000	12.70000	12.60000	12.70000	12.50000
##	[2321]	15.00000	15.10000	15.00000	15.00000	15.00000	15.00000	14.90000	14.80000
##	[2329]	14.50000	14.30000	14.00000	13.80000	13.60000	13.30000	13.30000	13.00000
##	[2337]	17.30000	17.60000	16.80000	16.80000	17.00000	16.90000	16.90000	16.90000
##	[2345]	16.80000	16.70000	16.30000	16.60000	16.10000	15.60000	14.70000	14.60000
##	[2353]	9.60000	9.60000	9.50000	9.40000	9.40000	9.30000	9.30000	9.20000
##	[2361]	9.00000	8.40000	8.30000	8.10000	8.00000	7.30000	6.60000	7.20000
##	[2369]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342

##	[2377]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2385]	13.00000	13.00000	12.80000	12.80000	12.80000	12.80000	12.80000	12.90000
##	[2393]	12.90000	12.90000	12.90000	12.90000	12.90000	12.90000	13.00000	13.00000
##	[2401]	4.90000	4.90000	4.90000	4.90000	4.90000	12.11342	12.11342	12.11342
##	[2409]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2417]	17.70000	17.60000	17.50000	17.20000	16.90000	16.40000	16.30000	16.10000
##	[2425]	16.00000	15.90000	15.80000	15.60000	15.60000	15.70000	15.70000	15.70000
##	[2433]	14.00000	14.00000	13.80000	13.70000	13.60000	13.50000	13.40000	13.30000
##	[2441]	13.20000	13.10000	12.90000	12.80000	12.70000	12.60000	12.50000	12.40000
##	[2449]	7.20000	7.20000	7.00000	6.80000	7.00000	7.00000	6.80000	6.30000
##	[2457]	6.40000	6.20000	6.10000	5.70000	5.60000	5.60000	5.60000	5.50000
##	[2465]	12.70000	12.70000	12.70000	12.70000	12.50000	12.30000	12.10000	11.90000
##	[2473]	11.70000	11.50000	11.30000	11.10000	10.90000	11.00000	11.00000	11.10000
##	[2481]	11.40000	11.40000	11.40000	11.30000	11.20000	11.00000	10.80000	10.60000
##	[2489]	10.50000	9.90000	9.70000	9.40000	9.10000	9.20000	9.30000	9.40000
##	[2497]	15.90000	15.80000	15.80000	15.80000	16.00000	15.80000	15.80000	15.70000
##	[2505]	15.80000	15.90000	16.00000	16.00000	15.90000	15.90000	15.90000	15.90000
##	[2513]	16.00000	15.90000	15.80000	15.70000	15.60000	15.40000	15.30000	15.30000
##	[2521]	15.30000	15.20000	15.20000	15.10000	15.00000	15.20000	15.20000	15.10000
##	[2529]	9.00000	9.00000	13.00000	12.50000	12.00000	11.70000	11.80000	11.60000
##	[2537]	11.50000	11.40000	11.00000	10.60000	10.30000	10.20000	10.10000	10.00000
##	[2545]	11.30000	11.30000	11.20000	11.10000	11.10000	11.10000	11.10000	10.80000
##	[2553]	10.90000	10.70000	10.60000	10.50000	10.10000	9.80000	9.70000	9.60000
##	[2561]	13.60000	13.60000	13.60000	13.70000	13.30000	13.10000	13.00000	12.90000
##	[2569]	12.30000	12.40000	12.00000	11.90000	11.80000	11.50000	11.20000	10.90000
##	[2577]	12.90000	12.90000	12.90000	12.90000	12.90000	13.00000	13.00000	12.20000
##	[2585]	12.20000	12.10000	11.90000	11.90000	11.90000	11.90000	11.80000	11.70000
##	[2593]	12.50000	12.50000	12.50000	12.50000	12.50000	12.40000	12.10000	11.70000
##	[2601]	11.30000	11.00000	10.60000	10.20000	9.80000	9.80000	9.80000	12.11342
##	[2609]	12.00000	12.00000	12.00000	12.00000	11.50000	11.00000	10.60000	10.10000
##	[2617]	10.60000	10.20000	10.10000	10.00000	9.90000	9.70000	9.40000	9.30000
##	[2625]	14.30000	14.30000	14.30000	14.40000	14.40000	14.40000	14.50000	14.50000
##	[2633]	14.50000	14.60000	14.60000	14.60000	13.70000	13.50000	13.20000	13.70000
##	[2641]	12.70000	12.70000	12.70000	12.60000	12.60000	12.50000	12.50000	12.40000
##	[2649]	12.40000	12.30000	12.30000	12.20000	12.00000	11.90000	11.80000	11.70000
##	[2657]	14.60000	14.70000	14.70000	14.60000	14.50000	14.40000	14.40000	14.30000
##	[2665]	14.30000	14.20000	13.90000	13.60000	13.50000	13.30000	13.10000	12.80000
##	[2673]	14.50000	14.50000	14.40000	14.30000	13.80000	13.00000	12.50000	12.50000
##	[2681]	12.30000	11.90000	11.90000	12.00000	11.90000	11.50000	11.10000	10.70000
##	[2689]	10.80000	10.80000	10.70000	10.70000	10.60000	10.60000	10.50000	10.50000
##	[2697]	10.40000	10.40000	10.30000	10.30000	10.30000	10.20000	10.20000	12.11342
##	[2705]	10.00000	10.00000	10.00000	10.00000	10.70000	10.90000	10.80000	10.60000
##	[2713]	10.30000	10.60000	10.90000	11.60000	11.50000	11.00000	10.80000	9.80000
##	[2721]	15.30000	15.20000	15.20000	15.10000	14.90000	14.90000	14.90000	14.90000
##	[2729]	14.80000	14.70000	14.50000	14.60000	14.30000	13.90000	13.20000	13.30000
##	[2737]	13.30000	13.30000	13.30000	13.30000	13.30000	13.30000	13.20000	13.10000
##	[2745]	12.90000	12.80000	12.60000	12.40000	12.30000	12.10000	12.00000	11.80000
##	[2753]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2761]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2769]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2777]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2785]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2793]	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342	12.11342
##	[2801]	15.50000	15.50000	15.50000	15.50000	15.50000	15.60000	15.50000	15.70000
##	[2809]	15.30000	15.20000	15.50000	15.50000	15.00000	14.70000	14.20000	14.00000
##	[2817]	12.10000	12.10000	12.00000	12.00000	12.00000	11.90000	11.80000	11.90000
##	[2825]	11.80000	11.80000	11.70000	11.60000	11.30000	11.00000	10.70000	10.60000
##	[2833]	10.80000	10.80000	10.80000	10.80000	10.80000	10.80000	10.70000	10.70000
##	[2841]	10.70000	10.60000	10.60000	10.70000	10.40000	10.20000	10.10000	9.60000
##	[2849]	14.30000	14.20000	14.20000	14.10000	14.10000	14.00000	14.00000	13.40000
##	[2857]	12.90000	12.40000	11.80000	11.60000	11.60000	11.00000	10.40000	10.60000
##	[2865]	12.60000	12.50000	12.30000	12.20000	12.00000	11.90000	11.70000	11.60000
##	[2873]	11.40000	11.30000	11.10000	11.00000	10.90000	10.70000	10.60000	10.40000
##	[2881]	9.00000	9.00000	9.00000	9.00000	8.60000	8.50000	8.40000	8.50000
##	[2889]	8.60000	8.70000	8.60000	8.40000	8.20000	8.00000	7.90000	7.70000
##	[2897]	12.50000	12.50000	12.50000	12.30000	12.00000	11.80000	11.60000	11.40000

```
## [2905] 11.10000 10.90000 10.70000 10.50000 10.20000 10.00000 9.80000 9.60000
## [2913] 10.30000 10.30000 10.40000 9.80000 10.10000 10.00000 9.90000 9.70000
## [2921] 9.60000 9.50000 9.30000 9.20000 9.50000 10.00000 9.80000 9.80000
```

```
# Replace GDP's NA with its mean then log transform
summary(lifeExpec_final$GDP)
```

```
##      Min.      1st Qu.      Median      Mean      3rd Qu.      Max.      NA's
##      1.68      463.85     1764.97     7494.21     5932.90    119172.74      443
```

```
lifeExpec_final$GDP[is.na(lifeExpec_final$GDP)]<-mean(lifeExpec_final$GDP,na.rm=TRUE)
lifeExpec_final$GDP
```

```
##      [1] 5.842592e+02 6.126965e+02 6.317450e+02 6.699590e+02 6.353723e+01
##      [6] 5.533289e+02 4.458933e+02 3.733611e+02 3.698358e+02 2.725638e+02
##     [11] 2.529413e+01 2.191414e+02 1.987285e+02 1.878459e+02 1.174970e+02
##     [16] 1.145600e+02 3.954228e+03 4.575764e+03 4.414723e+03 4.247614e+03
##     [21] 4.437179e+03 4.943588e+02 4.114137e+03 4.375396e+02 3.631368e+02
##     [26] 3.512930e+01 2.791429e+02 2.416588e+03 1.896816e+02 1.453643e+03
##     [31] 1.326973e+03 1.175789e+03 4.132763e+03 5.478517e+02 5.471867e+03
##     [36] 5.564826e+03 5.432252e+03 4.463395e+03 3.868831e+03 4.952549e+02
##     [41] 3.935183e+03 3.464618e+03 3.112238e+01 2.598982e+03 2.943356e+02
##     [46] 1.774337e+03 1.732858e+03 1.757178e+03 3.695794e+03 4.793122e+02
##     [51] 4.846169e+02 4.598250e+03 4.299129e+03 3.529535e+03 3.347845e+03
##     [56] 3.868579e+03 2.878837e+03 2.624151e+02 1.443992e+03 1.418684e+02
##     [61] 7.794684e+02 7.111817e+02 5.261687e+02 5.552969e+02 1.356695e+04
##     [66] 1.288830e+04 1.222486e+04 1.256544e+04 1.192935e+04 1.212688e+04
##     [71] 1.312467e+03 1.473319e+03 1.425229e+04 1.272439e+04 1.137194e+04
##     [76] 1.352837e+03 9.739826e+03 9.386716e+03 9.358154e+03 9.875162e+03
##     [81] 1.346712e+04 1.224526e+04 1.297664e+04 1.296977e+04 1.272698e+04
##     [86] 1.276265e+03 8.161370e+03 8.953359e+03 7.193618e+03 5.878761e+03
##     [91] 5.768838e+02 4.251574e+03 3.334376e+02 2.579193e+03 7.176947e+02
##     [96] 7.669274e+03 3.696548e+02 3.994712e+03 3.843591e+03 3.684848e+03
##    [101] 3.526978e+03 3.218382e+03 2.993833e+03 4.126997e+01 3.138887e+03
##    [106] 2.158299e+03 1.643758e+03 1.191962e+03 9.316616e+01 7.832617e+02
##    [111] 6.944351e+02 6.227427e+02 5.655439e+04 6.221469e+04 6.779234e+04
##    [116] 6.767763e+04 6.224513e+04 5.187485e+04 4.274300e+04 4.966469e+04
##    [121] 4.991983e+03 3.611828e+04 3.416715e+03 3.472380e+03 2.346539e+04
##    [126] 2.818176e+02 1.951784e+04 2.169921e+03 4.366595e+04 5.132264e+04
##    [131] 5.547153e+02 4.833357e+04 5.112674e+04 4.665763e+04 4.765419e+04
##    [136] 5.138638e+04 4.658665e+04 4.439936e+02 3.824243e+04 3.669343e+04
##    [141] 3.212936e+03 2.635138e+04 2.448974e+04 2.451727e+04 5.531382e+01
##    [146] 7.891300e+03 7.875757e+03 7.496336e+03 7.189691e+03 5.842858e+03
##    [151] 4.952948e+02 5.574638e+03 3.851438e+03 2.473858e+03 1.578424e+03
##    [156] 1.452163e+02 8.836440e+02 7.637386e+02 7.368384e+01 6.559743e+02
##    [161] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
##    [166] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
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## [2831] 4.567349e+02 5.582211e+02 2.858341e+02 3.148365e+03 3.167344e+03
## [2836] 3.158587e+03 3.275917e+03 2.965824e+03 2.643441e+03 2.697961e+03
## [2841] 2.393367e+03 2.479782e+02 1.886433e+03 1.787947e+03 1.585272e+02
## [2846] 1.353935e+03 1.362617e+03 1.469849e+03 7.494211e+03 7.494211e+03
## [2851] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2856] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2861] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2866] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2871] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2876] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2881] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2886] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2891] 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03 7.494211e+03
## [2896] 7.494211e+03 1.313890e+03 1.738882e+03 1.857934e+02 1.734936e+03
## [2901] 1.644620e+03 1.463214e+03 1.139112e+03 1.369682e+03 1.145880e+02
## [2906] 1.315420e+01 6.913178e+02 5.327722e+01 4.291583e+02 3.771352e+02

```

```
## [2911] 3.782736e+02 3.419556e+02 1.186938e+02 1.274746e+02 1.112274e+02
## [2916] 9.556485e+02 8.399279e+02 7.136356e+02 6.582412e+01 3.256786e+02
## [2921] 3.969982e+02 4.147962e+02 4.447658e+02 4.543667e+02 4.533512e+02
## [2926] 5.734834e+01 5.485873e+02 5.473589e+02

lifeExpec_final$GDP_log <- log(lifeExpec_final$GDP)

# Replace HIV.AIDS's NA with its mean then Log transform
summary(lifeExpec_final$HIV.AIDS)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##    0.100   0.100   0.100   1.748   0.800   50.600

lifeExpec_final$HIV.AIDS[is.na(lifeExpec_final$HIV.AIDS)]<-mean(lifeExpec_final$HIV.AIDS,na.rm=TRUE)
lifeExpec_final$HIV.AIDS

##      [1] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##     [15] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##     [29] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##     [43] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 1.9 2.0 2.3 2.6 2.5 2.5 2.5 2.6
##     [57] 2.6 2.5 2.6 2.5 2.4 2.3 2.1 2.0 0.2 0.2 0.2 0.2 0.1 0.1
##     [71] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##     [85] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##     [99] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [113] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [127] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [141] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [155] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.2 0.1 0.2 0.1
##    [169] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.2 0.1 0.1 0.1 0.1 0.1 0.1
##    [183] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [197] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [211] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.2 0.4 0.8 0.7
##    [225] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [239] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [253] 0.1 0.1 0.1 0.1 0.2 0.2 0.2 0.1 0.5 0.2 0.3 0.1 0.6 0.6
##    [267] 0.8 0.8 1.5 0.1 0.4 0.3 1.0 1.1 1.2 1.3 1.4 1.4 1.6 1.8
##    [281] 2.0 2.0 2.1 2.1 2.1 2.1 2.1 2.0 0.5 0.5 0.6 0.6 0.5 0.5
##    [295] 0.4 0.4 0.3 0.3 0.3 0.3 0.2 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [309] 0.2 0.2 0.2 0.2 0.2 0.2 0.2 0.2 0.2 0.1 0.1 0.1 0.1 0.1
##    [323] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [337] 2.2 2.3 2.8 4.4 5.5 6.2 9.0 12.7 13.4 14.4 20.6 28.4 31.9 34.6
##    [351] 37.2 38.8 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [365] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [379] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [393] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.6 0.6 0.7 0.8 0.9 1.0
##    [407] 1.1 1.5 1.7 2.0 2.3 2.5 2.9 3.2 3.6 4.0 0.7 0.7 1.0 1.2
##    [421] 1.5 1.9 2.4 2.9 3.4 3.8 4.3 4.8 5.1 5.2 5.3 5.2 1.9 2.0
##    [435] 2.4 2.9 3.3 3.3 3.7 4.1 5.3 5.8 6.1 6.5 6.7 6.9 7.0 7.1
##    [449] 0.2 0.2 0.2 0.3 0.3 0.4 0.4 0.4 0.6 0.6 0.8 0.8 0.9 0.8
##    [463] 0.8 0.8 0.2 0.2 0.2 0.3 0.3 0.5 0.6 0.7 0.9 1.1 1.4 1.7
##    [477] 1.9 2.1 2.2 2.1 3.5 3.7 4.0 4.6 4.9 5.5 6.3 6.7 7.0 7.2
##    [491] 7.4 7.5 7.7 7.8 7.9 7.7 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [505] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 4.4 4.5 5.1 5.1 5.8
##    [519] 7.3 8.3 9.0 10.0 11.2 12.0 12.8 13.4 13.9 14.3 2.8 2.9 3.1 3.6
##    [533] 3.9 4.1 4.4 4.7 4.9 5.1 5.2 5.2 5.1 5.0 4.8 4.6 0.1 0.1
##    [547] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [561] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [575] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [589] 0.1 0.1 0.1 0.1 0.8 0.8 0.8 0.8 0.2 0.1 0.1 0.1 0.1 0.1
##    [603] 0.1 0.1 0.1 0.1 0.1 0.1 2.8 3.0 3.0 3.3 3.5 3.8 4.0 4.3
##    [617] 5.0 5.5 5.9 6.3 6.8 7.2 7.6 7.8 0.1 0.1 0.1 0.1 0.1 0.1
##    [631] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [645] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [659] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
##    [673] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
```

##	[687]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[701]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[715]	0.1	0.1	0.1	0.1	0.1	0.1	1.1	1.1	1.2	1.5	1.6	1.6	1.7	1.8
##	[729]	1.9	2.0	2.0	2.1	2.2	2.4	2.4	2.5	0.1	0.1	0.1	0.1	0.1	0.1
##	[743]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	2.1	2.1	2.1	2.1	1.9
##	[757]	2.7	3.1	3.2	3.3	3.5	3.7	3.9	4.0	4.2	4.3	4.3	4.1	0.3	0.3
##	[771]	0.3	0.4	0.7	0.9	1.2	1.4	1.6	1.8	2.0	2.1	2.3	2.4	2.5	2.5
##	[785]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.2	0.3	0.3	0.3	0.3	0.3
##	[799]	0.3	0.3	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[813]	0.1	0.1	0.1	0.1	0.2	0.2	0.2	0.3	0.3	0.3	0.3	0.3	0.3	0.2
##	[827]	0.2	0.3	0.3	0.4	0.4	0.4	4.2	4.4	5.7	8.2	7.7	7.2	7.3	6.3
##	[841]	5.9	5.3	4.9	4.4	3.6	2.9	2.3	1.9	0.4	0.4	0.5	0.6	0.7	0.9
##	[855]	1.0	1.1	1.3	1.4	1.6	1.8	1.9	1.9	2.0	1.9	0.1	0.1	0.1	0.1
##	[869]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.6	0.6
##	[883]	0.9	1.2	1.4	1.7	2.0	2.4	2.8	3.3	3.7	4.1	4.4	4.6	4.9	5.0
##	[897]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[911]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[925]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[939]	0.1	0.1	0.1	0.1	0.1	0.1	2.7	2.8	3.7	4.9	6.0	7.0	8.0	8.9
##	[953]	10.0	10.7	10.9	11.1	11.0	10.7	10.1	9.5	1.7	1.7	1.6	1.4	1.8	2.1
##	[967]	2.7	3.0	3.1	3.0	3.0	2.9	2.7	2.5	2.3	2.0	0.1	0.1	0.1	0.1
##	[981]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[995]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1009]	0.7	0.8	0.9	0.9	1.3	1.9	2.1	2.2	2.6	2.9	3.1	3.2	3.4	3.5
##	[1023]	3.5	3.6	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1037]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1051]	0.1	0.1	0.1	0.1	0.1	0.1	0.4	0.4	0.4	0.4	0.4	0.4	0.4	0.4
##	[1065]	0.4	0.4	0.4	0.4	0.4	0.3	0.3	0.2	0.5	0.5	1.0	1.9	2.0	2.2
##	[1079]	2.3	2.3	2.4	2.6	2.7	2.8	2.9	3.0	3.0	3.0	3.2	3.4	4.5	5.3
##	[1093]	5.7	5.9	6.0	6.0	5.7	5.6	5.4	5.0	4.6	4.1	3.6	3.1	0.3	0.3
##	[1107]	0.3	0.3	0.4	0.4	0.3	0.8	1.9	1.1	1.8	1.9	2.1	2.3	1.7	1.1
##	[1121]	0.5	0.5	0.5	0.8	1.5	1.9	2.0	2.4	2.7	3.3	3.9	4.3	4.6	4.8
##	[1135]	5.0	5.1	0.3	0.3	0.4	0.4	0.4	0.4	0.5	0.6	0.7	0.8	0.9	1.2
##	[1149]	1.4	1.5	1.6	1.7	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1163]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1177]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.2	0.2	0.2	0.2	0.2	0.2
##	[1191]	0.2	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.3
##	[1205]	0.3	0.3	0.3	0.2	0.2	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1219]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1233]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1247]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1261]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1275]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1289]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.5	0.5	0.6	0.5	0.6	0.5
##	[1303]	0.6	0.4	0.9	1.5	1.9	2.3	2.3	2.3	2.2	2.2	0.1	0.1	0.1	0.1
##	[1317]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1331]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1345]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1359]	0.1	0.1	2.8	2.9	3.0	3.0	3.4	4.3	5.0	6.4	9.1	10.3	11.6	13.2
##	[1373]	14.5	15.7	16.9	18.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1387]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1401]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.2	0.1
##	[1415]	0.1	0.2	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.2	0.2	0.3	0.3
##	[1429]	0.3	0.3	0.2	0.2	0.2	0.2	0.2	0.2	0.1	0.1	0.1	0.1	0.1	0.1
##	[1443]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1457]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1471]	0.1	0.1	9.3	9.4	9.6	9.0	10.5	13.4	18.2	27.3	30.0	34.1	34.8	34.6
##	[1485]	33.8	32.5	31.2	29.8	0.9	0.9	1.1	1.2	1.5	1.8	2.1	2.4	2.8	3.0
##	[1499]	3.1	3.2	3.2	3.1	3.1	3.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1513]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1527]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1541]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.3	0.3
##	[1555]	0.4	0.4	0.4	0.5	0.5	0.5	0.6	0.6	0.6	0.6	0.7	0.7	0.7	0.6
##	[1569]	4.8	5.1	6.3	8.3	11.2	13.7	14.9	16.9	19.3	21.1	22.4	23.4	24.2	24.7
##	[1583]	25.1	25.5	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
##	[1597]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1

## [1611]	0.1	0.1	0.1	0.1	0.1	0.1	1.5	1.6	1.6	1.5	1.5	1.5	1.6	1.6
## [1625]	1.7	1.8	1.9	2.0	2.2	2.3	2.4	2.5	0.1	0.1	0.1	0.1	0.1	0.1
## [1639]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.9	0.9	1.1
## [1653]	1.2	1.2	1.2	1.3	1.3	1.3	1.3	1.3	1.3	1.2	1.2	1.1	0.1	0.1
## [1667]	0.1	0.1	0.1	0.2	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1681]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1695]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1709]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1723]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1737]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1751]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	3.9	4.1	5.1	6.9
## [1765]	9.6	10.8	11.3	12.6	14.1	16.3	16.2	15.9	15.3	14.5	13.4	12.2	0.3	0.3
## [1779]	0.4	0.5	0.5	0.5	0.6	0.6	0.6	0.6	0.5	0.5	0.5	0.4	0.4	0.4
## [1793]	2.1	2.2	2.5	3.7	4.7	6.2	8.7	11.7	15.2	19.2	22.1	24.0	24.7	24.6
## [1807]	23.9	22.8	0.1	0.1	0.1	0.2	0.2	0.2	0.2	0.2	0.2	0.2	0.2	0.2
## [1821]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1835]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1849]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1863]	0.2	0.2	0.2	0.3	0.3	0.3	0.3	0.4	0.4	0.4	0.4	0.5	0.6	0.7
## [1877]	0.7	0.9	1.1	1.3	1.4	1.5	1.6	1.6	1.6	1.6	1.6	1.5	3.7	3.9
## [1891]	3.9	4.4	4.7	4.8	4.9	5.0	5.2	5.3	5.4	5.4	5.4	5.3	5.1	4.9
## [1905]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1919]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1933]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1947]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [1961]	0.2	0.1	0.1	0.2	0.1	0.2	0.1	0.2	0.6	0.7	0.8	1.0	1.0	1.1
## [1975]	1.1	1.3	1.4	1.5	1.5	1.5	1.4	1.4	1.3	1.1	0.2	0.2	0.2	0.1
## [1989]	0.1	0.1	0.1	0.1	0.1	0.2	0.2	0.2	0.1	0.1	0.1	0.1	0.1	0.1
## [2003]	0.1	0.1	0.2	0.2	0.3	0.3	0.3	0.4	0.4	0.4	0.4	0.4	0.5	0.5
## [2017]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2031]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2045]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2059]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2073]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2087]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2101]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2115]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2129]	0.1	0.1	0.2	0.3	0.3	0.2	0.3	0.3	0.3	0.3	0.3	0.3	0.4	0.3
## [2143]	0.3	0.2	0.4	0.4	0.5	0.7	1.3	2.3	2.8	3.7	5.0	6.2	7.1	7.7
## [2157]	8.1	8.0	8.1	8.5	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2171]	0.2	0.2	0.2	0.1	0.3	0.4	0.1	0.1	0.1	0.1	0.1	0.1	0.2	0.3
## [2185]	0.3	0.3	0.2	0.4	0.4	0.4	0.7	0.7	0.1	0.1	0.1	0.1	0.1	0.1
## [2199]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.2	0.2	0.2	0.5
## [2213]	0.5	0.5	0.9	0.9	1.2	1.2	1.6	1.6	1.6	1.4	1.5	1.5	0.1	0.1
## [2227]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2241]	0.3	0.3	0.3	0.4	0.4	0.4	0.5	0.6	0.7	0.7	0.7	0.7	0.7	0.7
## [2255]	0.6	0.5	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2269]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2283]	0.1	0.1	0.1	0.1	0.1	0.1	0.5	0.6	0.8	0.9	1.3	1.6	1.7	1.9
## [2297]	2.2	2.2	2.2	2.1	1.9	1.7	1.5	1.2	0.1	0.1	0.1	0.1	0.1	0.1
## [2311]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2325]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2339]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2353]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2367]	0.1	0.1	0.7	0.8	0.8	0.8	0.8	0.8	0.8	0.9	0.9	0.9	0.9	0.9
## [2381]	0.9	0.9	0.8	0.8	3.6	3.7	4.5	7.6	8.5	11.0	19.0	23.5	26.4	28.1
## [2395]	29.5	29.7	28.9	26.6	24.0	21.3	3.4	3.5	3.6	3.8	3.9	4.0	4.2	4.2
## [2409]	4.2	4.1	3.9	3.8	3.5	3.3	3.0	2.7	0.1	0.1	0.1	0.1	0.1	0.1
## [2423]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2437]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.3	0.3
## [2451]	0.3	0.3	0.3	0.3	0.3	0.3	0.3	0.2	0.2	0.2	0.2	0.2	0.2	0.1
## [2465]	0.4	0.4	0.4	0.9	0.1	0.5	0.6	1.2	0.8	0.6	0.6	0.9	1.0	1.6
## [2479]	1.8	0.4	7.1	7.3	9.8	12.2	15.7	21.6	33.7	40.2	40.7	43.7	49.1	50.3
## [2493]	50.6	49.9	48.8	46.4	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2507]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
## [2521]	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1

```
## [2535] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.2 0.2 0.2 0.2
## [2549] 0.2 0.2 0.2 0.3 0.3 0.3 0.3 0.3 0.3 0.3 0.3 0.3 0.3 0.1 0.1
## [2563] 0.1 0.1 0.2 0.2 0.3 0.3 0.4 0.5 0.5 0.5 0.6 0.7 0.8 0.8
## [2577] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2591] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2605] 0.1 0.1 0.1 0.1 1.0 1.0 1.5 1.7 2.6 3.8 4.3 4.8 5.1 5.0
## [2619] 5.0 5.1 5.2 5.3 5.3 5.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2633] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.3 0.3 0.3 0.4 0.4 0.4
## [2647] 0.2 0.3 0.7 0.6 0.5 1.0 0.5 2.0 1.2 0.9 0.1 0.1 0.1 0.1
## [2661] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2675] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2689] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2703] 0.1 0.1 3.1 3.2 4.0 4.6 6.8 8.0 8.1 8.2 8.4 8.6 8.7 8.9
## [2717] 9.4 10.0 10.8 11.6 0.2 0.2 0.2 0.2 0.2 0.2 0.3 0.4 0.7 0.8
## [2731] 0.9 1.0 0.9 0.9 0.8 0.7 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2745] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2759] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 1.4 1.4 2.1 2.4
## [2773] 3.1 4.6 6.4 7.4 8.5 9.4 10.0 10.8 11.5 12.1 12.5 12.8 0.1 0.1
## [2787] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2801] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2815] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.2 0.2 0.3 0.3 0.4 0.3 0.3
## [2829] 0.3 0.2 0.2 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2843] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2857] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1
## [2871] 0.1 0.2 0.2 0.2 0.2 0.2 0.2 0.2 0.1 0.1 0.1 0.1 0.1 0.1
## [2885] 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 4.1 4.3
## [2899] 4.8 5.6 6.3 6.8 9.1 11.9 13.6 15.9 17.0 17.6 18.2 18.4 18.6 18.7
## [2913] 6.2 6.3 6.8 8.8 13.3 15.7 18.1 20.5 23.7 26.8 30.3 33.6 36.7 39.8
## [2927] 42.1 43.5
```

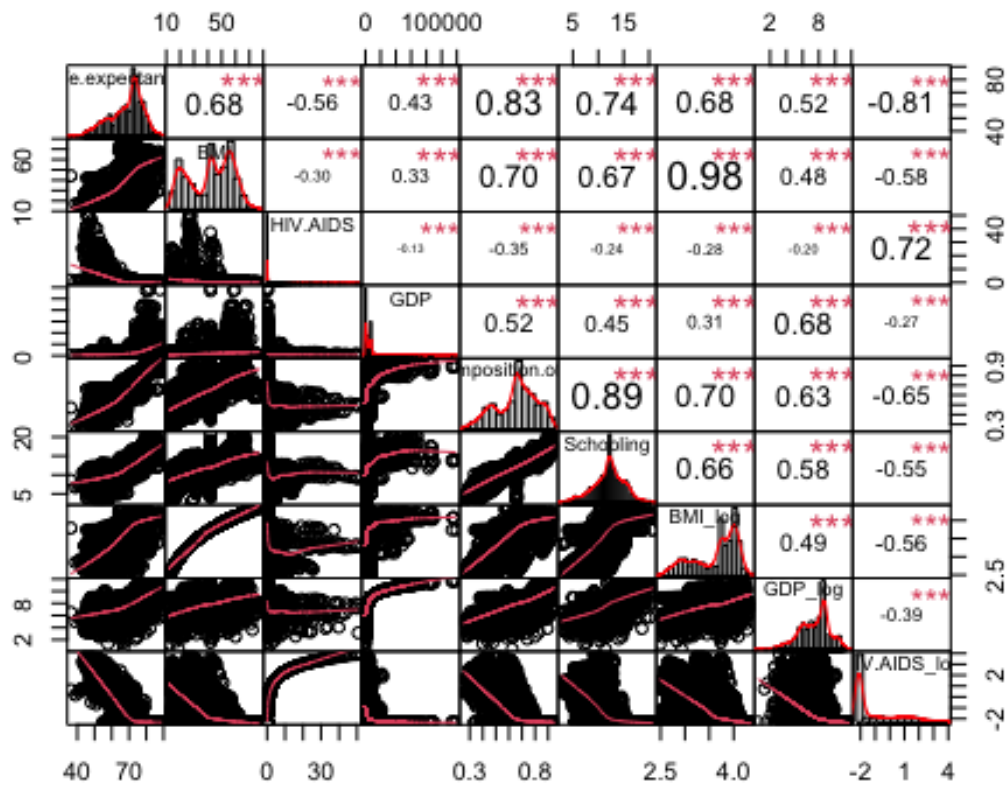
```
lifeExpec_final$HIV.AIDS_log <- log(lifeExpec_final$HIV.AIDS)
```

Correlation plot for final dataset and VIF value

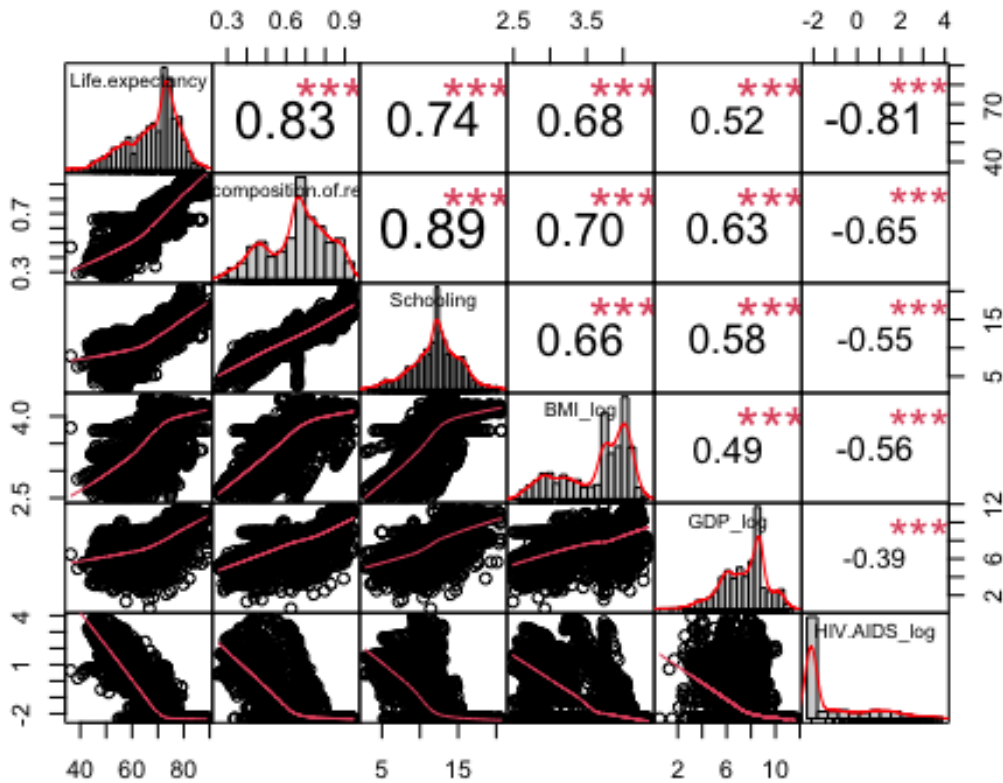
```
# Plot correlation chart for final dataset numerical variables
```

```
## Original variables before transformation included
```

```
lifeExpec_final_numCol_Orig <- subset(lifeExpec_final, select = -c(Status, continent))
chart.Correlation(lifeExpec_final_numCol_Orig, histogram=TRUE, pch=19)
```



```
## Remove unLog BMI, GDP, and HIV.AIDS
lifeExpec_final_numCol <- subset(lifeExpec_final, select = -c(Status, continent, BMI, GDP, HIV.AIDS))
chart.Correlation(lifeExpec_final_numCol, histogram=TRUE, pch=19)
```



```
lifeExpec_final <- subset(lifeExpec_final, select = -c(BMI, GDP, HIV.AIDS))
summary(lifeExpec_final)
```

```
##      Status      Life expectancy Income.composition.of.resources
## Length:2928      Min.   :36.30   Min.   :0.2530
## Class :character  1st Qu.:63.10   1st Qu.:0.5540
## Mode  :character  Median :72.10   Median :0.6620
##                               Mean   :69.22   Mean   :0.6583
##                               3rd Qu.:75.70   3rd Qu.:0.7730
##                               Max.    :89.00   Max.    :0.9480
##      Schooling    continent      BMI_log      GDP_log
## Min.   : 2.80     Length:2928     Min.   :2.485   Min.   : 0.5196
## 1st Qu.:10.38     Class :character  1st Qu.:3.246   1st Qu.: 6.3609
## Median :12.11     Mode  :character  Median :3.761   Median : 8.0432
## Mean   :12.11                      Mean   :3.638   Mean   : 7.6878
## 3rd Qu.:14.10                      3rd Qu.:4.027   3rd Qu.: 8.9219
## Max.   :20.70                      Max.   :4.352   Max.   :11.6883
##      HIV.AIDS_log
## Min.   :-2.3026
## 1st Qu.: -2.3026
## Median :-2.3026
## Mean   :-1.2183
## 3rd Qu.: -0.2231
## Max.    : 3.9240
```

VIF for selected variables

*## Refer to $GVIF^{1/(2*Df)}$, Income_comp shows the highest VIF = 2.77, follows by Schooling at 2.33.*

Other variables shows VIF between 1.26 - 1.69

```
full.model <- lm(Life expectancy ~ ., data = lifeExpec_final)
vif(full.model)
```

```
##              GVIF Df GVIF^(1/(2*Df))
## Status              2.105181 1      1.450924
## Income.composition.of.resources 7.655455 1      2.766849
```

```
## Schooling          5.431457  1      2.330549
## continent          6.174644  4      1.255528
## BMI_log            2.630606  1      1.621914
## GDP_log            1.710327  1      1.307795
## HIV.AIDS_log       2.859684  1      1.691060
```

```
set.seed(7)
splitPerc = .85
trainIndices = sample(1:dim(lifeExpec_final)[1],round(splitPerc * dim(lifeExpec_final)[1]))
train = lifeExpec_final[trainIndices,]
test = lifeExpec_final[-trainIndices,]
```

Build Simple Multiple Linear Regression Models

```
#model1 <- lm(Life.expectancy ~ Status + continent + Income.composition.of.resources + Schooling + BMI_Log +
GDP_Log + HIV.AIDS_Log, data = train)
```

```
model.fwd = regsubsets(Life.expectancy~.,data=train, method="forward", nvmax=10)
```

```
summary(model.fwd)$adjr2
```

```
## [1] 0.6864399 0.8131832 0.8213125 0.8328051 0.8351690 0.8357808 0.8363717
## [8] 0.8369654 0.8369035 0.8368390
```

```
summary(model.fwd)$rss
```

```
## [1] 70167.07 41788.21 39953.73 37368.98 36825.81 36674.34 36527.67 36380.46
## [9] 36379.60 36379.30
```

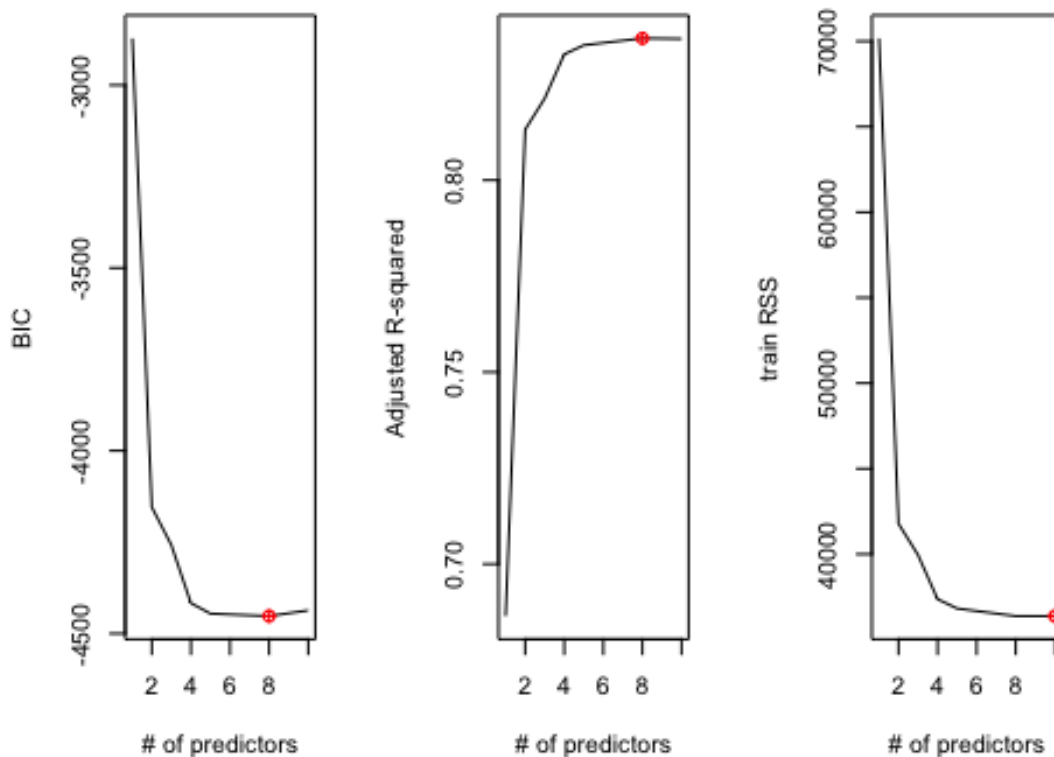
```
summary(model.fwd)$bic
```

```
## [1] -2872.014 -4154.156 -4258.073 -4416.720 -4445.344 -4447.784 -4449.938
## [8] -4452.170 -4444.409 -4436.610
```

```
par(mfrow=c(1,3))
bics<-summary(model.fwd)$bic
plot(1:10,bics,type="l",ylab="BIC",xlab="# of predictors")
index<-which(bics==min(bics))
points(index,bics[index],col="red",pch=10)
```

```
adjr2<-summary(model.fwd)$adjr2
plot(1:10,adjr2,type="l",ylab="Adjusted R-squared",xlab="# of predictors")
index<-which(adjr2==max(adjr2))
points(index,adjr2[index],col="red",pch=10)
```

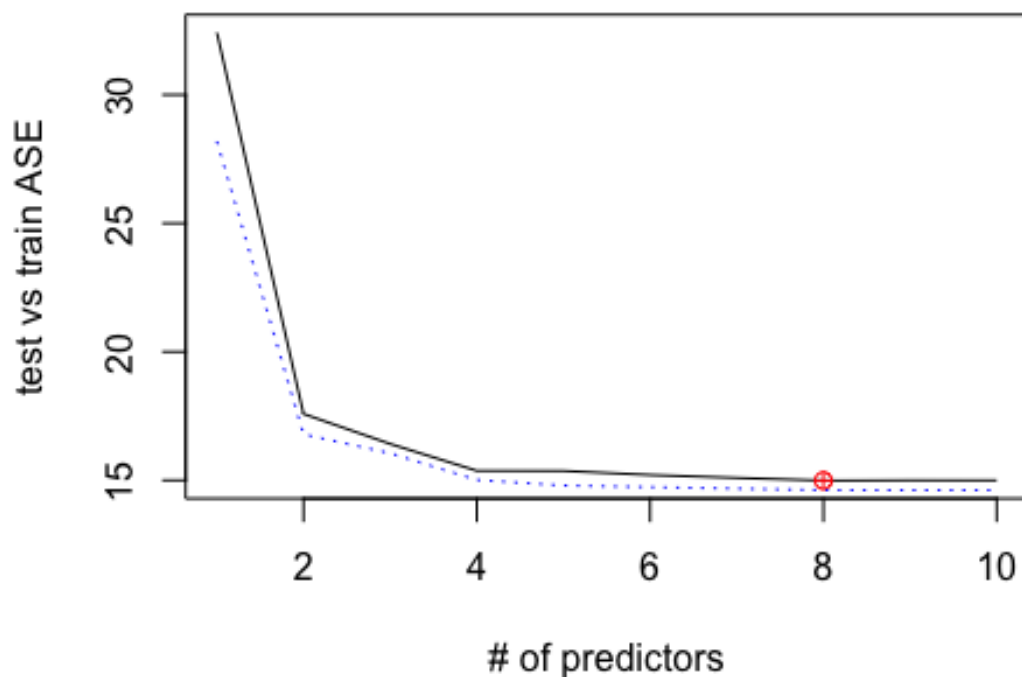
```
rss<-summary(model.fwd)$rss
plot(1:10,rss,type="l",ylab="train RSS",xlab="# of predictors")
index<-which(rss==min(rss))
points(index,rss[index],col="red",pch=10)
```



```
predict.regsbsets =function (object , newdata ,id ,...){
  form=as.formula (object$call [[2]])
  mat=model.matrix(form ,newdata)
  coefi=coef(object ,id=id)
  xvars=names(coefi)
  mat[,xvars]%%coefi
}

testASE<-c()
#note my index is to 20 since that what I set it in regsubsets
for (i in 1:10){
  predictions <-predict.regsbsets(object=model.fwd,newdata=test,id=i)
  testASE[i]<-mean((test$Life.expectancy-predictions)^2)
}

par(mfrow=c(1,1))
plot(1:10,testASE,type="l",xlab="# of predictors",ylab="test vs train ASE")
index<-which(testASE==min(testASE))
points(index,testASE[index],col="red",pch=10)
rss<-summary(model.fwd)$rss
lines(1:10,rss/2489,lty=3,col="blue") #Dividing by 100 since ASE=RSS/sample size
```



```
coef(model.fwd,8)
```

```
##              (Intercept)              StatusDeveloping
##              46.6054768              -3.0958074
## Income.composition.of.resources              Schooling
##              19.5325569              0.2155874
##              continentAmericas              continentAsia
##              3.4329479              1.1371771
##              continentEurope              BMI_log
##              1.0149562              1.5071876
##              HIV.AIDS_log
##              -2.5741339
```

```
forward.final <-lm(Life.expectancy~Status+Income.composition.of.resources+Schooling+continent+BMI_log+HIV.AIDS_log, data= lifeExpec_final)
```

```
summary(forward.final)
```

```
##
## Call:
## lm(formula = Life.expectancy ~ Status + Income.composition.of.resources +
##     Schooling + continent + BMI_log + HIV.AIDS_log, data = lifeExpec_final)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -25.6374  -2.2019   0.2547   2.1975  15.8103
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    46.67572     0.78491   59.466 < 2e-16 ***
## StatusDeveloping -3.08664     0.26959  -11.449 < 2e-16 ***
## Income.composition.of.resources 19.14419     1.23391   15.515 < 2e-16 ***
## Schooling         0.24018     0.05418    4.433 9.62e-06 ***
## continentAmericas  3.49645     0.27905   12.530 < 2e-16 ***
```

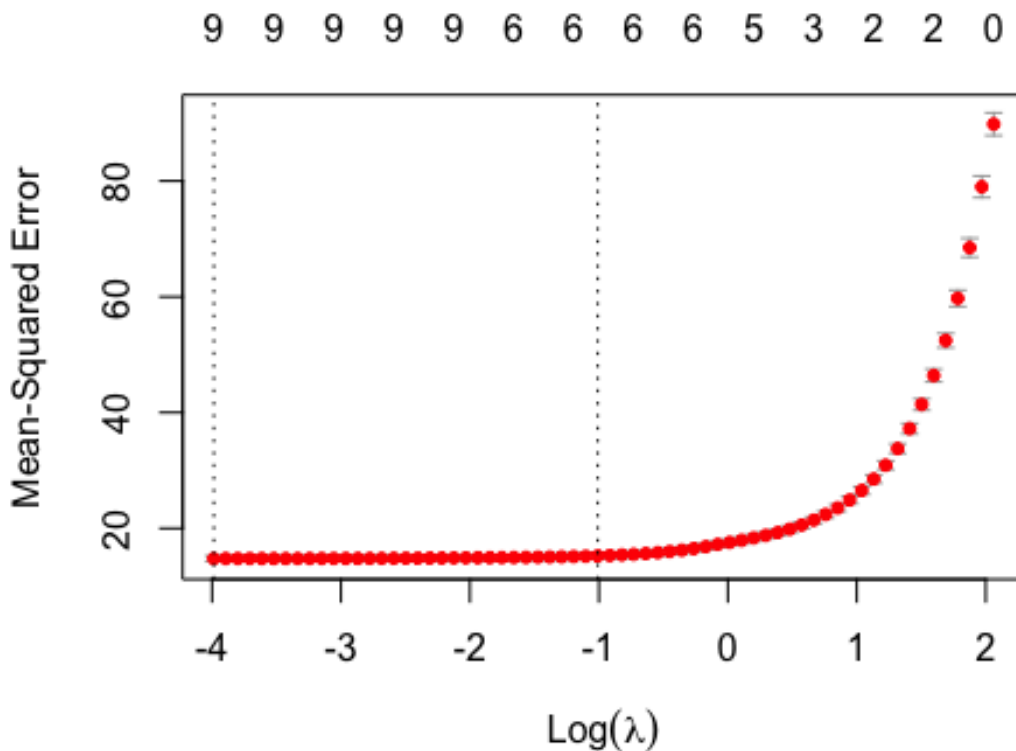
```
## continentAsia          1.14281    0.27201    4.201 2.73e-05 ***
## continentEurope        0.97855    0.34180    2.863 0.00423 **
## continentOceania       -0.18630    0.39872   -0.467 0.64036
## BMI_log                1.44535    0.24047    6.011 2.08e-09 ***
## HIV.AIDS_log           -2.62897    0.07424  -35.412 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.836 on 2918 degrees of freedom
## Multiple R-squared:  0.8383, Adjusted R-squared:  0.8378
## F-statistic: 1681 on 9 and 2918 DF,  p-value: < 2.2e-16

x=model.matrix(Life.expectancy~.,train)[,-1]
y=train$Life.expectancy

xtest<-model.matrix(Life.expectancy~.,test)[,-1]
ytest<-test$Life.expectancy

grid=10^seq(10,-2, length =100)
lasso.mod=glmnet(x,y,alpha=1, lambda =grid)

cv.out=cv.glmnet(x,y,alpha=1) #alpha=1 performs LASSO
plot(cv.out)
```



```
bestlambda<-cv.out$lambda.min #Optimal penalty parameter. You can make this call visually.
lasso.pred=predict (lasso.mod ,s=bestlambda ,newx=xtest)

testMSE_LASSO<-mean((ytest-lasso.pred)^2)
testMSE_LASSO

## [1] 15.02061
```



```

coef(lasso.mod, s=bestlambda)

## 11 x 1 sparse Matrix of class "dgCMatrix"
##                                     1
## (Intercept)                      46.64029783
## StatusDeveloping                 -3.05610765
## Income.composition.of.resources  19.77090480
## Schooling                        0.20978999
## continentAmericas                 3.24710386
## continentAsia                     0.94585317
## continentEurope                   0.83162798
## continentOceania                 -0.09025952
## BMI_log                          1.49178345
## GDP_log                          .
## HIV.AIDS_log                     -2.59772732

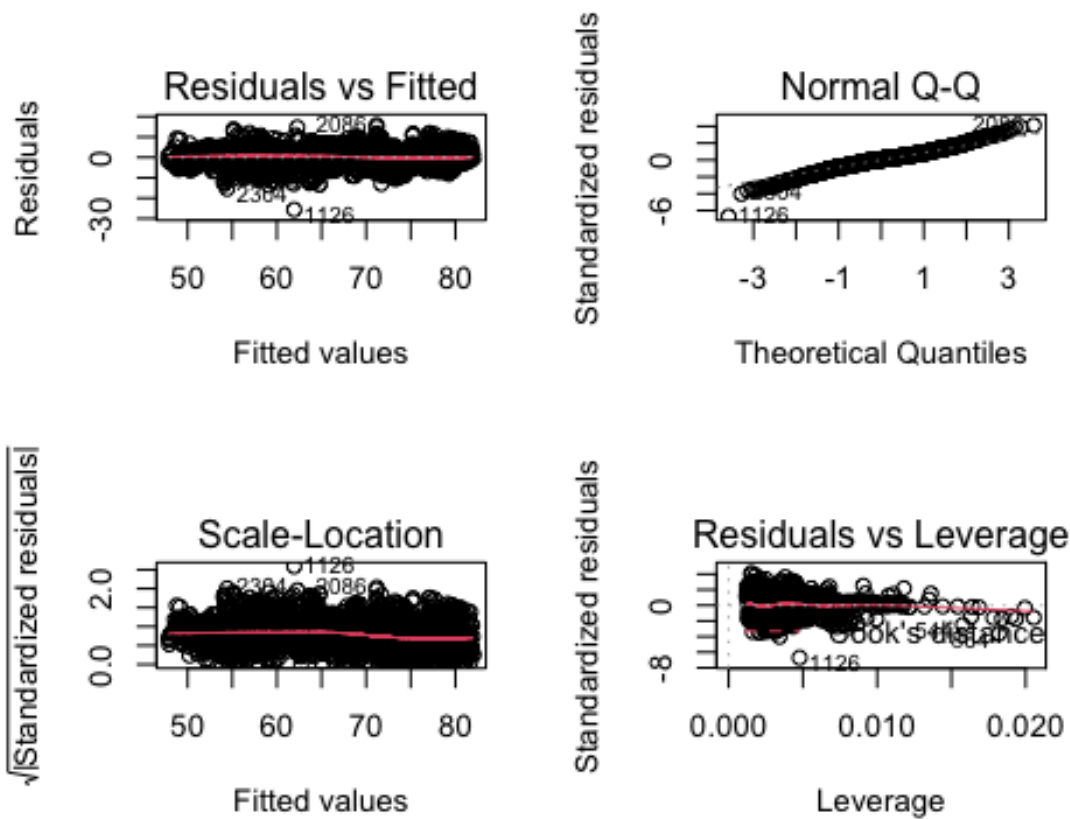
lasso.final <- lm(Life.expectancy~Status+Income.composition.of.resources+Schooling+continent+BMI_log+HIV.AIDS_log, data= lifeExpec_final)

summary(lasso.final)

##
## Call:
## lm(formula = Life.expectancy ~ Status + Income.composition.of.resources +
##     Schooling + continent + BMI_log + HIV.AIDS_log, data = lifeExpec_final)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -25.6374  -2.2019   0.2547   2.1975  15.8103
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    46.67572     0.78491   59.466 < 2e-16 ***
## StatusDeveloping -3.08664     0.26959  -11.449 < 2e-16 ***
## Income.composition.of.resources 19.14419     1.23391  15.515 < 2e-16 ***
## Schooling        0.24018     0.05418   4.433 9.62e-06 ***
## continentAmericas  3.49645     0.27905  12.530 < 2e-16 ***
## continentAsia     1.14281     0.27201   4.201 2.73e-05 ***
## continentEurope   0.97855     0.34180   2.863 0.00423 **
## continentOceania -0.18630     0.39872  -0.467 0.64036
## BMI_log          1.44535     0.24047   6.011 2.08e-09 ***
## HIV.AIDS_log     -2.62897     0.07424 -35.412 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.836 on 2918 degrees of freedom
## Multiple R-squared:  0.8383, Adjusted R-squared:  0.8378
## F-statistic: 1681 on 9 and 2918 DF,  p-value: < 2.2e-16

par(mfrow=c(2,2))
plot(lasso.final)

```



```
lifeExpec_final[1126,]
```

```
## # A tibble: 1 x 8
##   Status Life expectancy Income.compositio... Schooling continent BMI_log GDP_log
##   <chr>      <dbl>          <dbl>      <dbl> <chr>      <dbl>  <dbl>
## 1 Develo...      36.3            0.47      8.6 Americas    3.79   6.50
## # ... with 1 more variable: HIV.AIDS_log <dbl>
```

```
lifeExpec_final[544,]
```

```
## # A tibble: 1 x 8
##   Status Life expectancy Income.compositio... Schooling continent BMI_log GDP_log
##   <chr>      <dbl>          <dbl>      <dbl> <chr>      <dbl>  <dbl>
## 1 Develo...      47.6            0.658     4.7 Africa     2.63   5.11
## # ... with 1 more variable: HIV.AIDS_log <dbl>
```

```
lifeExpec_final[864,]
```

```
## # A tibble: 1 x 8
##   Status Life expectancy Income.compositio... Schooling continent BMI_log GDP_log
##   <chr>      <dbl>          <dbl>      <dbl> <chr>      <dbl>  <dbl>
## 1 Develo...      45.3            0.658     3.9 Africa     2.53   3.34
## # ... with 1 more variable: HIV.AIDS_log <dbl>
```

```
lifeExpec[1126,]
```

```
## # A tibble: 1 x 24
## # Groups:   Country [1]
##   Country Year Status Life expectancy Adult.Mortality infant.deaths Alcohol
##   <chr>   <int> <chr>      <dbl>          <int>      <int>  <dbl>
## 1 Haiti   2010 Developing    36.3            682         23    5.76
## # ... with 17 more variables: percentage.expenditure <dbl>, Hepatitis.B <int>,
## #   Measles <int>, BMI <dbl>, under.five.deaths <int>, Polio <int>,
## #   Total.expenditure <dbl>, Diphtheria <int>, HIV.AIDS <dbl>, GDP <dbl>,
```

```
## # Population <dbl>, thinness..1.19.years <dbl>, thinness.5.9.years <dbl>,
## # Income.composition.of.resources <dbl>, Schooling <dbl>, continent <chr>,
## # CountrytoMatch <chr>

lifeExpec[544,]

## # A tibble: 1 x 24
## # Groups:   Country [1]
##   Country Year Status      Life.expectancy Adult.Mortality infant.deaths Alcohol
##   <chr>   <int> <chr>          <dbl>          <int>          <int>   <dbl>
## 1 Chad    2000 Developing      47.6            44            41     0.25
## # ... with 17 more variables: percentage.expenditure <dbl>, Hepatitis.B <int>,
## # Measles <int>, BMI <dbl>, under.five.deaths <int>, Polio <int>,
## # Total.expenditure <dbl>, Diphtheria <int>, HIV.AIDS <dbl>, GDP <dbl>,
## # Population <dbl>, thinness..1.19.years <dbl>, thinness.5.9.years <dbl>,
## # Income.composition.of.resources <dbl>, Schooling <dbl>, continent <chr>,
## # CountrytoMatch <chr>

lifeExpec[864,]

## # A tibble: 1 x 24
## # Groups:   Country [1]
##   Country Year Status      Life.expectancy Adult.Mortality infant.deaths Alcohol
##   <chr>   <int> <chr>          <dbl>          <int>          <int>   <dbl>
## 1 Eritrea 2000 Developing      45.3            593            7     0.83
## # ... with 17 more variables: percentage.expenditure <dbl>, Hepatitis.B <int>,
## # Measles <int>, BMI <dbl>, under.five.deaths <int>, Polio <int>,
## # Total.expenditure <dbl>, Diphtheria <int>, HIV.AIDS <dbl>, GDP <dbl>,
## # Population <dbl>, thinness..1.19.years <dbl>, thinness.5.9.years <dbl>,
## # Income.composition.of.resources <dbl>, Schooling <dbl>, continent <chr>,
## # CountrytoMatch <chr>

#complex model with interaction terms
fwdcpmodel1 <- regsubsets(Life.expectancy ~ Status + continent + Income.composition.of.resources + Schooling
+ BMI_log + GDP_log + HIV.AIDS_log + Income.composition.of.resources*Schooing + Income.composition.of.resour
ces*BMI_log + Income.composition.of.resources*GDP_log + Schooling*BMI_log+Schooing*GDP_log + BMI_log*GDP_log
, data = train, method = 'backward', nvmax=13)

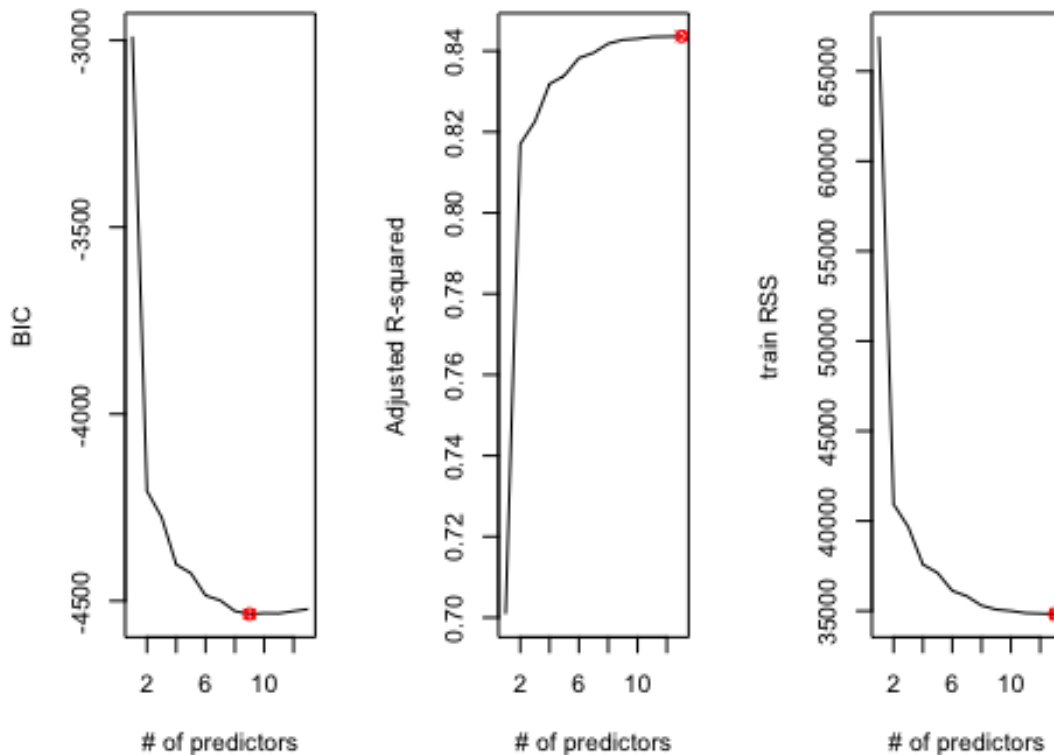
#base check of model summary with VIF
#par(mfrow=c(2,2))
#plot(fwdcpmodel1)
#summary(fwdcpmodel1)

#plot of BIC, ADJR^2, and RSS
bicsb <- summary(fwdcpmodel1)$bic
adjr2b <- summary(fwdcpmodel1)$adjr2
rssb <- summary(fwdcpmodel1)$rss

par(mfrow=c(1,3))
plot(1:13,bicsb,type="l",ylab="BIC",xlab="# of predictors")
index<-which(bicsb==min(bicsb))
points(index,bicsb[index],col="red",pch=13)

plot(1:13,adjr2b,type="l",ylab="Adjusted R-squared",xlab="# of predictors")
index<-which(adjr2b==max(adjr2b))
points(index,adjr2b[index],col="red",pch=13)

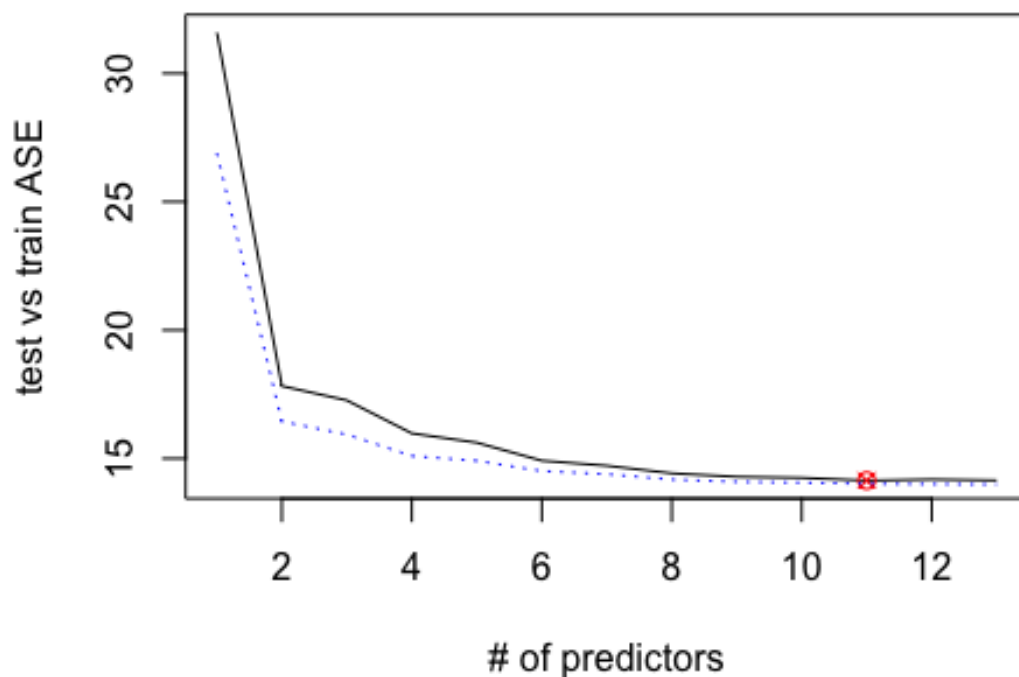
plot(1:13,rssb,type="l",ylab="train RSS",xlab="# of predictors")
index<-which(rssb==min(rssb))
points(index,rssb[index],col="red",pch=13)
```



```
#Cross validation function
predict.regsbsets =function (object , newdata ,id ,...){
  form=as.formula (object$call [[2]])
  mat=model.matrix(form ,newdata)
  coefi=coef(object ,id=id)
  xvars=names(coefi)
  mat[,xvars]%%coefi
}

#test versus train
testASEb<-c()
for (i in 1:13){
  predictions <-predict.regsbsets(object=fwdcpmodel1,newdata=test,id=i)
  testASEb[i]<-mean((test$Life.expectancy-predictions)^2)
}

#test versus train graph
par(mfrow=c(1,1))
plot(1:13,testASEb,type="l",xlab="# of predictors",ylab="test vs train ASE")
index<-which(testASEb==min(testASEb))
points(index,testASEb[index],col="red",pch=13)
lines(1:13,rsb/2489,lty=3,col="blue")
```



#8 seems to be optimum number of variables

```
coef(fwdcpmodel1,8)
```

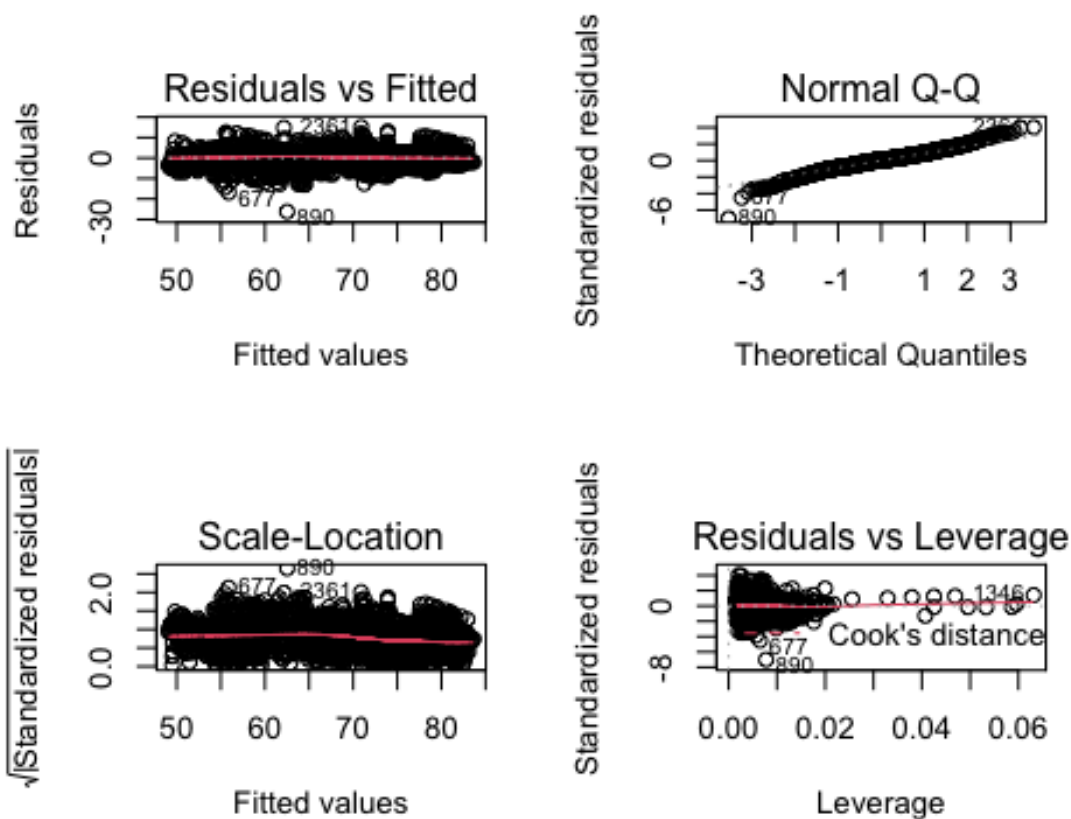
```
##              (Intercept)
##              56.5759918
##      StatusDeveloping
##             -2.4211025
##      continentAmericas
##             2.9347051
##      Income.composition.of.resources
##             -45.9258346
##              Schooling
##             2.3990868
##      HIV.AIDS_log
##             -2.7567059
##      Income.composition.of.resources:Schooling
##              0.9680913
##      Income.composition.of.resources:BMI_log
##             16.9911794
##      Schooling:BMI_log
##             -0.8376356
```

#vif check before final model

```
vifcheckmodel <- lm(Life.expectancy ~ Status + continent + Income.composition.of.resources + Schooling + HIV
.AIDS_log + Income.composition.of.resources*Schooling + Income.composition.of.resources*BMI_log + Schooling*B
MI_log, data = train)
```

#base check of model summary with VIF

```
par(mfrow=c(2,2))
plot(vifcheckmodel)
```



```
summary(vifcheckmodel)
```

```
##
## Call:
## lm(formula = Life.expectancy ~ Status + continent + Income.composition.of.resources +
##      Schooling + HIV.AIDS_log + Income.composition.of.resources *
##      Schooling + Income.composition.of.resources * BMI_log + Schooling *
##      BMI_log, data = train)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -26.2137  -2.2354   0.1633   2.1307  15.0978
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      45.36392    2.83125   16.023 < 2e-16
## StatusDeveloping  -2.22758    0.30496   -7.305 3.73e-13
## continentAmericas  3.61332    0.30051  12.024 < 2e-16
## continentAsia      1.02960    0.29643   3.473 0.000523
## continentEurope    1.07408    0.37057   2.898 0.003783
## continentOceania   0.36429    0.43999   0.828 0.407774
## Income.composition.of.resources -34.23500    7.17998  -4.768 1.97e-06
## Schooling          2.20670    0.34944   6.315 3.19e-10
## HIV.AIDS_log       -2.59254    0.07974 -32.513 < 2e-16
## BMI_log            4.65385    1.07333   4.336 1.51e-05
## Income.composition.of.resources:Schooling  1.68300    0.22415   7.508 8.31e-14
## Income.composition.of.resources:BMI_log    10.94063    2.19690   4.980 6.80e-07
## Schooling:BMI_log   -0.90157    0.10873  -8.292 < 2e-16
##
## (Intercept)      ***
## StatusDeveloping  ***
## continentAmericas ***
## continentAsia     ***
## continentEurope   **
## continentOceania  **
## Income.composition.of.resources ***
## Schooling         ***
## HIV.AIDS_log      ***
## BMI_log           ***
## Income.composition.of.resources:Schooling ***
## Income.composition.of.resources:BMI_log ***
## Schooling:BMI_log ***
```

```
## continentOceania
## Income.composition.of.resources ***
## Schooling ***
## HIV.AIDS_log ***
## BMI_log ***
## Income.composition.of.resources:Schooling ***
## Income.composition.of.resources:BMI_log ***
## Schooling:BMI_log ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.753 on 2476 degrees of freedom
## Multiple R-squared:  0.8442, Adjusted R-squared:  0.8435
## F-statistic: 1118 on 12 and 2476 DF, p-value: < 2.2e-16
```

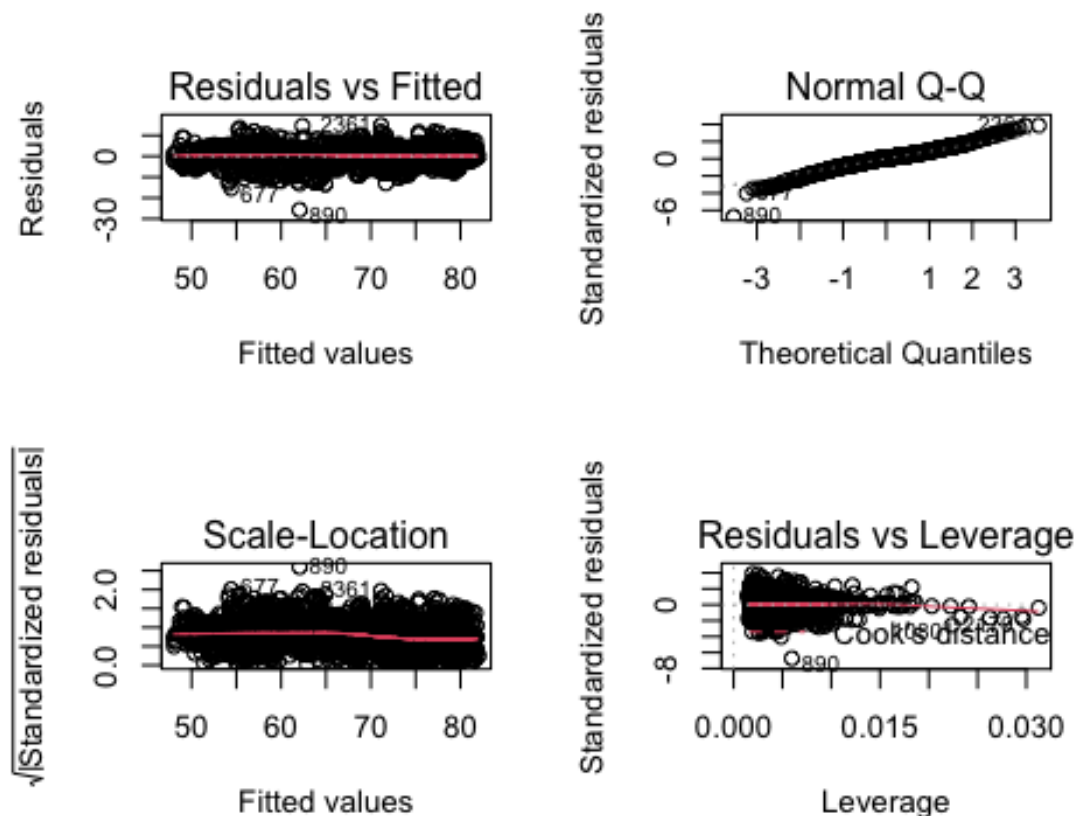
```
vif(vifcheckmodel)
```

##		GVI	Df	$GVI^{1/(2 \cdot Df)}$
## Status	2.383054	1	1.543714	
## continent	7.458016	4	1.285517	
## Income.composition.of.resources	218.625856	1	14.786002	
## Schooling	202.708328	1	14.237567	
## HIV.AIDS_log	2.896186	1	1.701818	
## BMI_log	46.716817	1	6.834970	
## Income.composition.of.resources:Schooling	121.312511	1	11.014196	
## Income.composition.of.resources:BMI_log	528.450555	1	22.988052	
## Schooling:BMI_log	478.920429	1	21.884251	

```
vifcheckmodelb <- lm(Life.expectancy ~ Status + continent + Income.composition.of.resources + HIV.AIDS_log +  
Schooling*BMI_log, data = train)
```

```
#base check of model summary with VIF
```

```
par(mfrow=c(2,2))
plot(vifcheckmodelb)
```



```
summary(vifcheckmodelb)
```

```
##
## Call:
## lm(formula = Life.expectancy ~ Status + continent + Income.composition.of.resources +
##     HIV.AIDS_log + Schooling * BMI_log, data = train)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -25.760  -2.192   0.244   2.211  14.853
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    45.57293     2.27797   20.006 < 2e-16 ***
## StatusDeveloping -3.11821     0.29531  -10.559 < 2e-16 ***
## continentAmericas  3.41218     0.30467   11.200 < 2e-16 ***
## continentAsia     1.10111     0.29902    3.682 0.000236 ***
## continentEurope   1.01153     0.37530    2.695 0.007081 **
## continentOceania  -0.03569     0.44514   -0.080 0.936110
## Income.composition.of.resources 19.56617     1.35754   14.413 < 2e-16 ***
## HIV.AIDS_log     -2.57986     0.08131  -31.728 < 2e-16 ***
## Schooling         0.31672     0.21628    1.464 0.143219
## BMI_log           1.81334     0.67093    2.703 0.006924 **
## Schooling:BMI_log  -0.02889     0.05992   -0.482 0.629753
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.831 on 2478 degrees of freedom
## Multiple R-squared:  0.8375, Adjusted R-squared:  0.8369
## F-statistic: 1277 on 10 and 2478 DF, p-value: < 2.2e-16
```

```
vif(vifcheckmodelb)
```

```
##              GVIF Df GVIF^(1/(2*Df))
## Status          2.144139  1      1.464288
## continent        6.820763  4      1.271245
## Income.composition.of.resources  7.498905  1      2.738413
## HIV.AIDS_log     2.889566  1      1.699872
## Schooling        74.506796  1      8.631732
## BMI_log          17.514491  1      4.185032
## Schooling:BMI_log 139.552841  1     11.813249
```

```
#Final model with VIF handled.
```

```
finalcpmodelb <- lm(Life.expectancy ~ Status + continent + Income.composition.of.resources + HIV.AIDS_log + Schooling*BMI_log, data = train)
```

```
#checkign final residual plots.
```

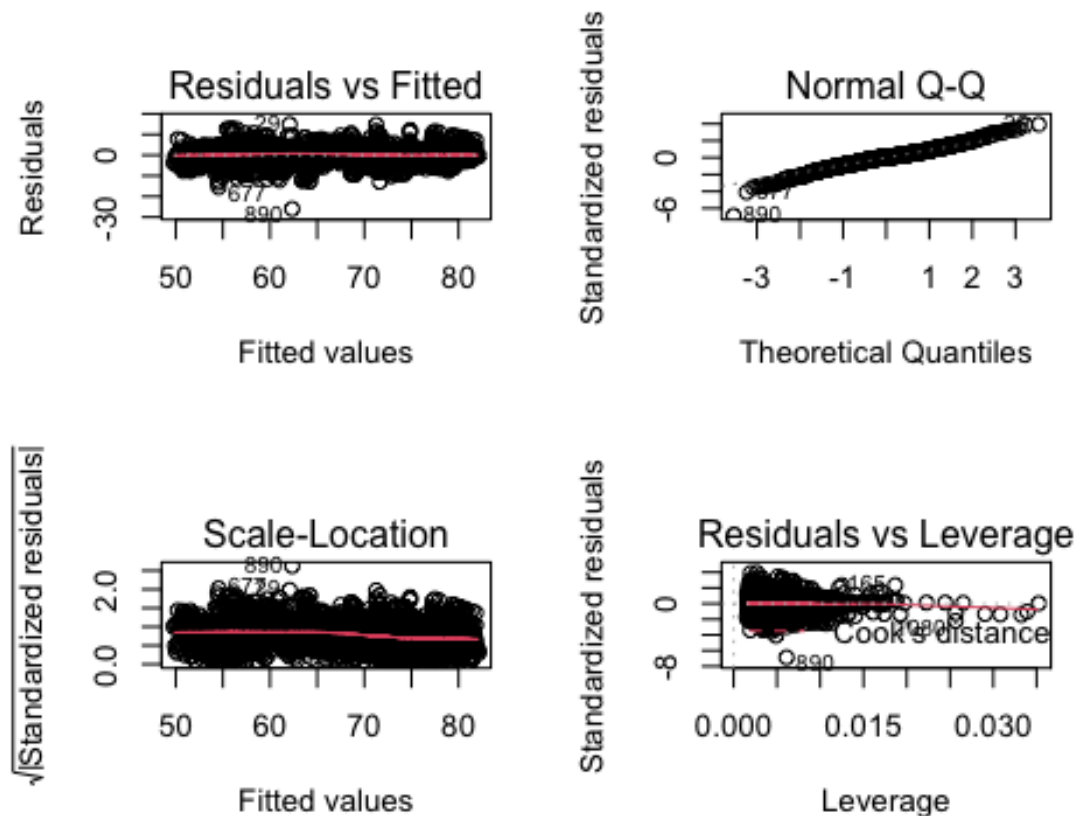
```
par(mfrow=c(2,2))
summary(finalcpmodelb)
```

```
##
## Call:
## lm(formula = Life.expectancy ~ Status + continent + Income.composition.of.resources +
##     HIV.AIDS_log + Schooling * BMI_log, data = train)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -26.0481  -2.2967   0.1816   2.2121  14.9192
##
## Coefficients:
##              Estimate Std. Error t value
## (Intercept)    40.35037     2.39793  16.827
## StatusDeveloping -2.73127     0.29888  -9.138
## continentAmericas  3.57671     0.30323  11.795
## continentAsia     1.03473     0.29674   3.487
## continentEurope   1.07395     0.37234   2.884
## continentOceania  0.26041     0.44383   0.587
```



```
## Income.composition.of.resources 17.93391 1.36961 13.094
## HIV.AIDS_log -0.90329 0.27030 -3.342
## Schooling 0.88285 0.23152 3.813
## BMI_log 3.54723 0.71692 4.948
## Income.composition.of.resources:HIV.AIDS_log -3.03832 0.46754 -6.499
## Schooling:BMI_log -0.20908 0.06558 -3.188
## Pr(>|t|)
## (Intercept) < 2e-16 ***
## StatusDeveloping < 2e-16 ***
## continentAmericas < 2e-16 ***
## continentAsia 0.000497 ***
## continentEurope 0.003957 **
## continentOceania 0.557442
## Income.composition.of.resources < 2e-16 ***
## HIV.AIDS_log 0.000845 ***
## Schooling 0.000140 ***
## BMI_log 8.01e-07 ***
## Income.composition.of.resources:HIV.AIDS_log 9.77e-11 ***
## Schooling:BMI_log 0.001449 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.8 on 2477 degrees of freedom
## Multiple R-squared:  0.8402, Adjusted R-squared:  0.8395
## F-statistic: 1184 on 11 and 2477 DF, p-value: < 2.2e-16
```

```
plot(finalcpmodelb)
```



```
# the KNN regression model for project 1 using final dataset
```

```
head(lifeExpec_final)
```

```
## # A tibble: 6 x 8
##   Status Life.expectancy Income.compositio... Schooling continent BMI_log GDP_log
```

```
##   <chr>           <dbl>           <dbl>           <dbl> <chr>           <dbl>   <dbl>
## 1 Develo...      65             0.479          10.1 Asia         2.95   6.37
## 2 Develo...      59.9           0.476          10   Asia         2.92   6.42
## 3 Develo...      59.9           0.47           9.9 Asia         2.90   6.45
## 4 Develo...      59.5           0.463          9.8 Asia         2.87   6.51
## 5 Develo...      59.2           0.454          9.5 Asia         2.84   4.15
## 6 Develo...      58.8           0.448          9.2 Asia         2.82   6.32
## # ... with 1 more variable: HIV.AIDS_log <dbl>

lifeExpec_final$Life.expectancy <- as.numeric(lifeExpec_final$Life.expectancy)
lifeExpec_final$Income.composition.of.resources <- as.numeric(lifeExpec_final_numCol$Income.composition.of.re
sources)
lifeExpec_final$Schooling <- as.numeric(lifeExpec_final$Schooling)
lifeExpec_final$BMI_log <- as.numeric(lifeExpec_final$BMI_log)
lifeExpec_final$GDP_log <- as.numeric(lifeExpec_final$GDP_log)
lifeExpec_final$HIV.AIDS_log <- as.numeric(lifeExpec_final$HIV.AIDS_log)
lifeExpec_final$Status <- as.numeric(as.factor(lifeExpec_final$Status))
lifeExpec_final$continent <- as.numeric(as.factor(lifeExpec_final$continent))

head(lifeExpec_final, 5)

## # A tibble: 5 x 8
##   Status Life.expectancy Income.composition... Schooling continent BMI_log GDP_log
##   <dbl>      <dbl>           <dbl>      <dbl>      <dbl>      <dbl>   <dbl>
## 1     2          65             0.479      10.1        3         2.95   6.37
## 2     2          59.9           0.476      10          3         2.92   6.42
## 3     2          59.9           0.47       9.9         3         2.90   6.45
## 4     2          59.5           0.463      9.8         3         2.87   6.51
## 5     2          59.2           0.454      9.5         3         2.84   4.15
## # ... with 1 more variable: HIV.AIDS_log <dbl>

#Test and train sets
set.seed(7)
splitPerc = .85
trainIndices = sample(1:dim(lifeExpec_final)[1],round(splitPerc * dim(lifeExpec_final)[1]))
train = lifeExpec_final[trainIndices,]
test = lifeExpec_final[-trainIndices,]

#estimation-validation split
lifeEst_trn_idx <- sample(nrow(train), size = 0.8 * nrow(train))
lifeEst_est <- train[lifeEst_trn_idx,]
lifeEst_val <- train[-lifeEst_trn_idx,]

#verify data
head(train, 10)

## # A tibble: 10 x 8
##   Status Life.expectancy Income.compositio... Schooling continent BMI_log GDP_log
##   <dbl>      <dbl>           <dbl>      <dbl>      <dbl>      <dbl>   <dbl>
## 1     2          61.1           0.419      9.8         1         3.26   6.12
## 2     2          61.5           0.458      9.7         3         2.60   3.88
## 3     1          81             0.658     12.1         4         4.19   8.92
## 4     2          56.5           0.556     11.7         1         3.22   7.51
## 5     2          73.6           0.739     13.4         4         4.00   8.33
## 6     2          74.2           0.715      13          3         4.13   7.42
## 7     2          67.6           0.624     12.6         3         3.68   8.92
## 8     2          65.4           0.498      9          3         3.68   8.92
## 9     2          58.6           0.394      9.8         1         3.15   5.45
## 10    2          65.4           0.531     10.4         1         3.23   7.03
## # ... with 1 more variable: HIV.AIDS_log <dbl>

#building KNN reg model
lifeEst_knn_01 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 1)
lifeEst_knn_05 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 5)
lifeEst_knn_10 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 10)
lifeEst_knn_25 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 25)
```

```

head(lifeEst_knn_10$learn$X)

##      Status Income.composition.of.resources Schooling continent BMI_log GDP_log
## 1      2      0.479      10.1      3 2.949688 6.370345
## 2      2      0.476      10.0      3 2.923162 6.417870
## 3      2      0.470      9.9      3 2.895912 6.448486
## 4      2      0.463      9.8      3 2.867899 6.507217
## 5      2      0.454      9.5      3 2.844909 4.151626
## 6      2      0.448      9.2      3 2.815409 6.315953
##      HIV.AIDS_log
## 1      -2.302585
## 2      -2.302585
## 3      -2.302585
## 4      -2.302585
## 5      -2.302585
## 6      -2.302585

dist(head(lifeEst_knn_10$learn$X))

##           1           2           3           4           5
## 2 0.1138916
## 3 0.2215376 0.1082399
## 4 0.3401167 0.2262870 0.1195116
## 5 2.3009381 2.3221688 2.3320424 2.3747455
## 6 0.9121132 0.8141141 0.7173073 0.6321092 2.1852267

#calculating the distance between the 3rd observation and 4th observation
sqrt(sum((lifeEst_knn_10$learn$X[3,] - lifeEst_knn_10$learn$X[4,])^4))

## [1] 0.01060735

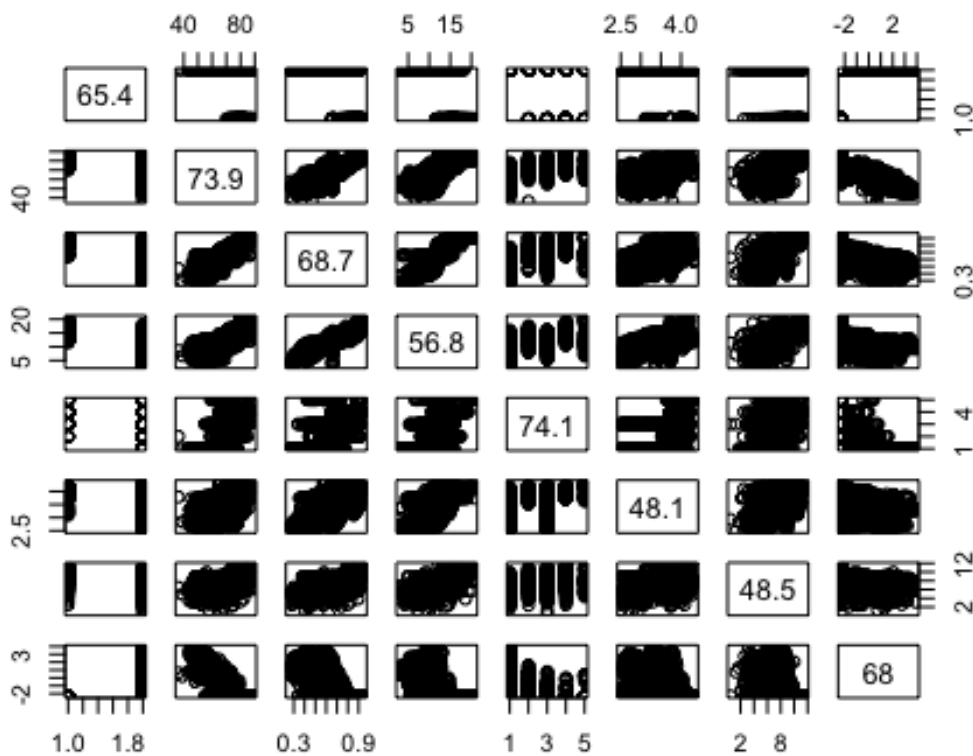
#test the predict function
predict(lifeEst_knn_10, lifeEst_val[1:50,])

## [1] 66.37 67.91 71.83 56.69 74.89 51.48 47.92 69.52 81.59 74.01 78.41 52.42
## [13] 75.20 77.55 80.88 77.43 59.62 50.79 77.47 82.37 72.49 71.93 57.05 74.23
## [25] 70.35 74.32 75.98 80.20 73.82 72.04 64.81 52.99 68.56 71.42 81.86 74.86
## [37] 72.49 80.30 82.50 67.43 75.00 73.41 52.28 76.26 80.13 76.39 58.01 56.48
## [49] 76.05 56.28

#calculating the RMSE for the models
knn_mod_list = list(
  lifeEst_knn_01 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 1),
  lifeEst_knn_05 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 5),
  lifeEst_knn_10 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 10),
  lifeEst_knn_25 <- knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = 25)
)

plot(lifeEst_est, predict(lifeEst_knn_01, lifeEst_val))

```



```
#creating function for multiple k values
train_knn <- function(neighbors) {
  knnreg(Life.expectancy ~ ., data = lifeExpec_final, k = neighbors)
}

train_knn(neighbors = 5)

## 5-nearest neighbor regression model

knn_list <- lapply(1:50, train_knn)

#knn_val_pred <- lapply(knn_mod_list, predict, lifeEst_val)
knn_val_pred <- lapply(knn_list, predict, lifeEst_val)
knn_trn_pred <- lapply(knn_list, predict, lifeEst_est)

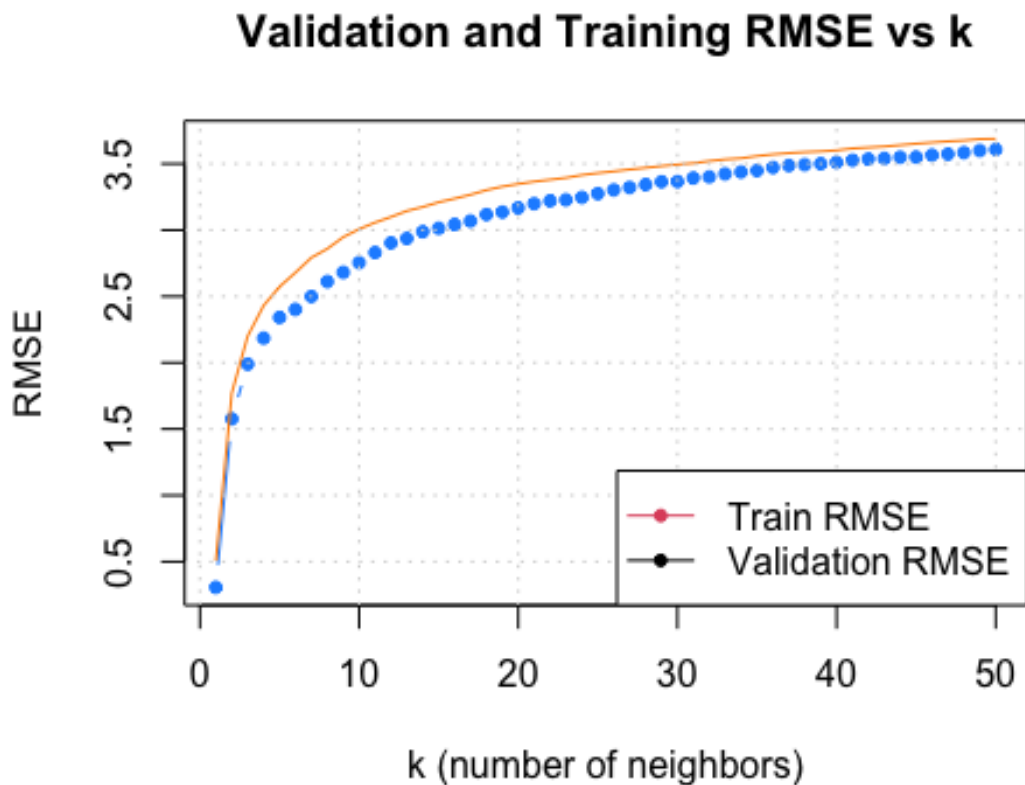
calc_rmse <- function(actual, predicted) {
  sqrt(mean((actual - predicted)^ 2))
}

sapply(knn_val_pred, calc_rmse, lifeEst_val$Life.expectancy)

## [1] 0.306514 1.576745 1.989147 2.185706 2.341607 2.402107 2.499234 2.611717
## [9] 2.681358 2.754214 2.830446 2.903354 2.936884 2.987867 3.013963 3.042504
## [17] 3.068280 3.116854 3.135562 3.167476 3.198770 3.220902 3.228075 3.246438
## [25] 3.274740 3.302256 3.320787 3.343251 3.364019 3.365576 3.392567 3.401452
## [33] 3.423567 3.438009 3.448571 3.471555 3.486836 3.492804 3.500346 3.511069
## [41] 3.526076 3.535482 3.540822 3.548902 3.550561 3.565843 3.572830 3.583675
## [49] 3.599456 3.608142

#create vectors for RMSE val and pred
knn_rmse_val <- sapply(knn_val_pred, calc_rmse, lifeEst_val$Life.expectancy)
knn_rmse_trn <- sapply(knn_trn_pred, calc_rmse, lifeEst_est$Life.expectancy)
```

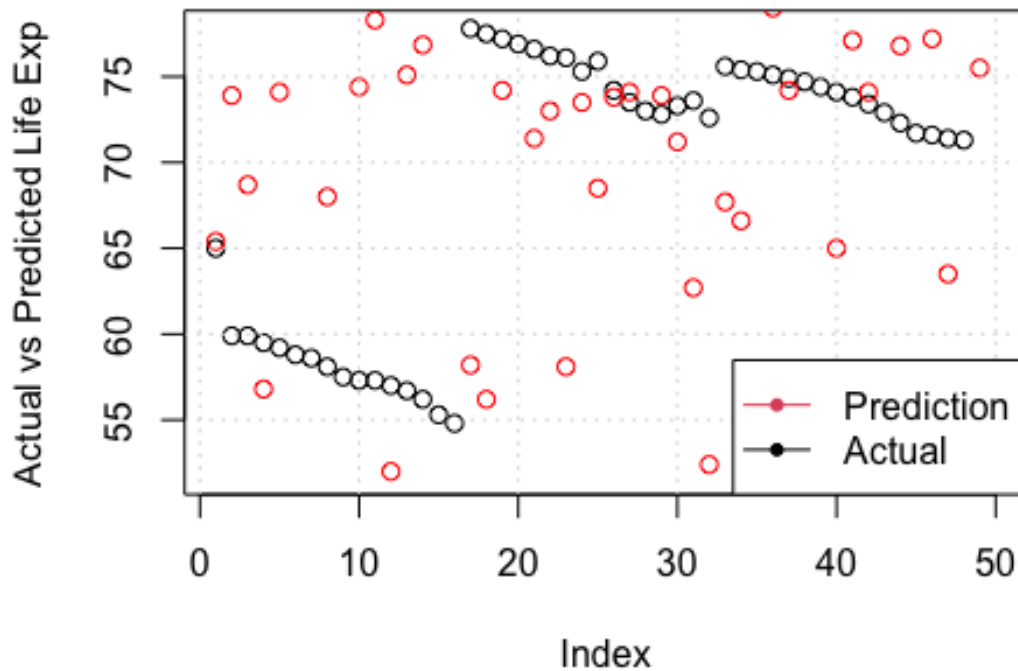
```
#plot rmse
plot(1:50, knn_rmse_val, type = "b", col = "dodgerblue", pch = 20, ylim = range(c(knn_rmse_val,knn_rmse_trn))
, xlab = "k (number of neighbors)", ylab = "RMSE", main = "Validation and Training RMSE vs k")
lines(1:50, knn_rmse_trn, col = "darkorange")
grid()
legend('bottomright',
      c("Train RMSE", "Validation RMSE"),
      col = c(2,1),
      lty = 1,
      pch = 20)
```



```
#plot the predict function KNN K=1
pred01 <- predict(lifeEst_knn_01, lifeEst_val[1:50,])
actual <- lifeExpec_final[1:50,]

plot(actual$Life.expectancy, col = "black", ylab = "Actual vs Predicted Life Exp", main = "KNN K=1 Actual vs Predicted Life Expectancy")
points(1:50,pred01, col = "red")
grid()
legend('bottomright',
      c("Prediction", "Actual"),
      col = c(2,1),
      lty = 1,
      pch = 20)
```

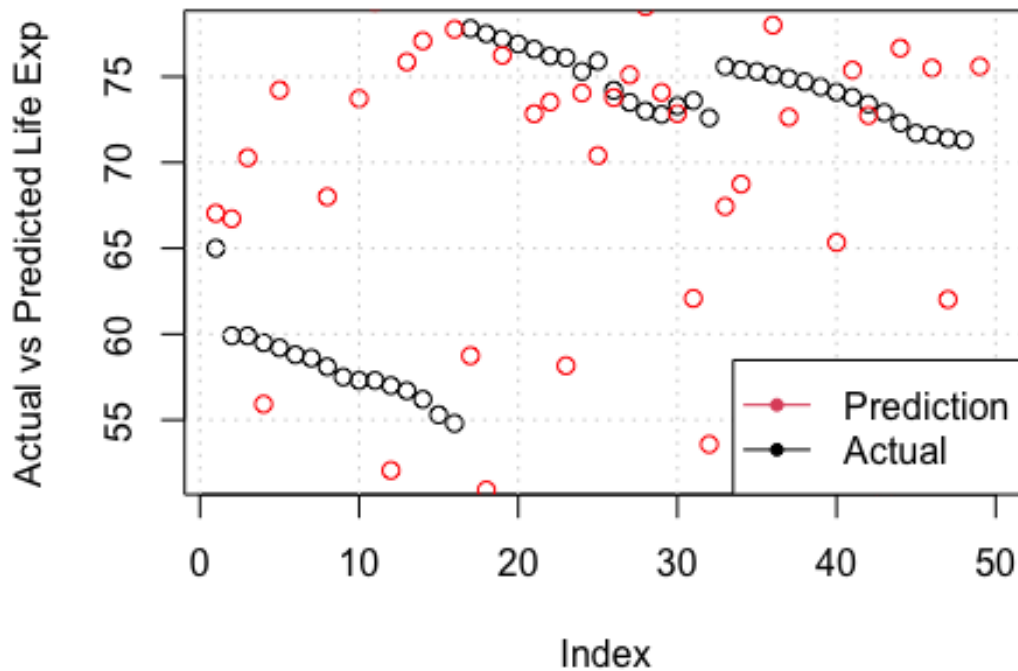
KNN K=1 Actual vs Predicted Life Expectancy



```
#plot the predict function KNN K=5
pred05 <- predict(lifeEst_knn_05, lifeEst_val[1:50,])
actual <- lifeExpec_final[1:50,]

plot(actual$Life.expectancy, col = "black", ylab = "Actual vs Predicted Life Exp", main = "KNN K=5 Actual vs
Predicted Life Expectancy")
points(1:50,pred05, col = "red")
grid()
legend('bottomright',
      c("Prediction", "Actual"),
      col = c(2,1),
      lty = 1,
      pch = 20)
```

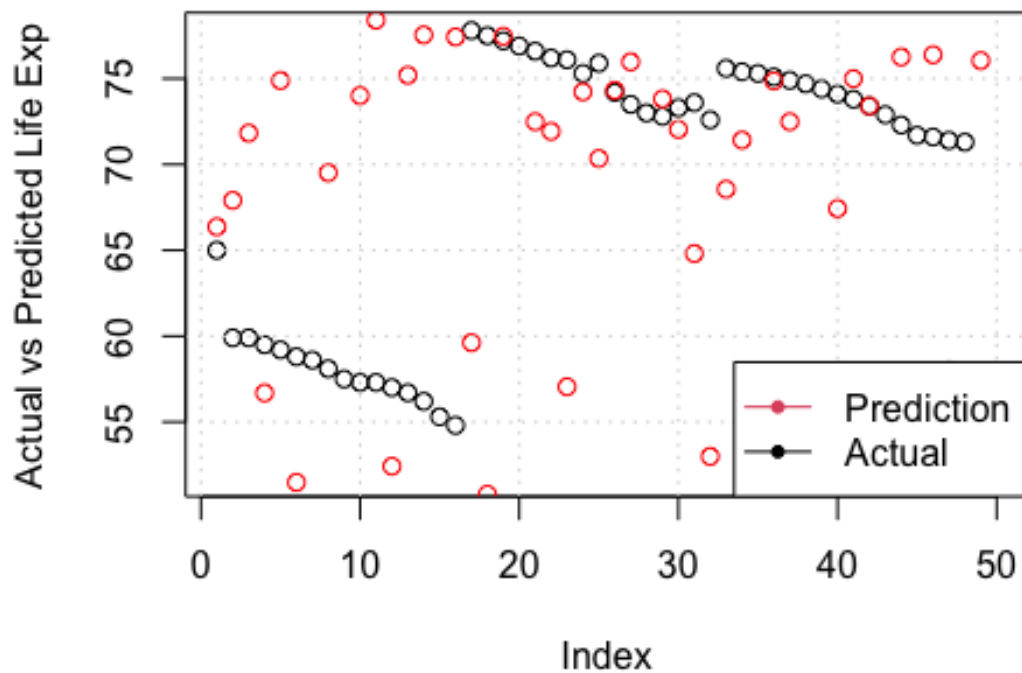
KNN K=5 Actual vs Predicted Life Expectancy



```
#plot the predict function KNN K=10
pred10 <- predict(lifeEst_knn_10, lifeEst_val[1:50,])
actual <- lifeExpec_final[1:50,]

plot(actual$Life.expectancy, col = "black", ylab = "Actual vs Predicted Life Exp", main = "KNN K=10 Actual vs
Predicted Life Expectancy")
points(1:50,pred10, col = "red")
grid()
legend('bottomright',
      c("Prediction", "Actual"),
      col = c(2,1),
      lty = 1,
      pch = 20)
```

KNN K=10 Actual vs Predicted Life Expectancy



```
#plot the predict function KNN K=25
pred25 <- predict(lifeEst_knn_25, lifeEst_val[1:50,])
actual <- lifeExpec_final[1:50,]

plot(actual$Life.expectancy, col = "black", ylab = "Actual vs Predicted Life Exp", main = "KNN K=25 Actual vs Predicted Life Expectancy")
points(1:50,pred25, col = "red")
grid()
legend('bottomright',
      c("Prediction", "Actual"),
      col = c(2,1),
      lty = 1,
      pch = 20)
```


KNN K=25 Actual vs Predicted Life Expectancy

