Cal Colistra Github link: Introduction to Data Science Project 3 2/28/2022

Purpose of Project 3:

Previously there have been various studies that aimed to identify certain factors that affect life expectancy. These studies considered demographic variables, income composition and mortality rates. Also, some of these studies were only based on the data from one year. The purpose of this project is to take into account more factors such as the effect of immunization and human development index. The data set provided for this project considers data from a period of 2010 to 2015 for all countries. Unlike the past studies, this project focuses on mortality factors, economic factors, social factors and other health related factors. Since this dataset considers different countries over a span of 5 years, it will be easier to determine which factors are contributing to life expectancy.

Methodology:

The data set was provided by the World Health Organization and was found under The Global health Observatory data repository. The data consists of 11 columns and 1108 rows for 193 countries. To cleanse the data I deleted rows where population = 0 because it wouldn't make sense to consider data of a country with a population of 0. Next, I decided to fill in where countries had 0 total expenditure and 0 percentage expenditure. I use the average of the columns that had a total expenditure and percentage expenditure greater than 0. Next, I deleted 7 rows where GDP was 0. After this I noticed there were a couple rows that had multiple values equaling 0. Palau had life expectancy, adult mortality and alcohol equaling 0 and Tuvalu had life expectancy and adult mortality equaling 0. After data cleansing the total number of countries in the data set became 847.

Summary:

List of Countries with

lowest average mortality rates:

| Country | format(avg(Adult_Mortality), 2) |
|-------------|---------------------------------|
| Tunisia | 10.67 |
| Italy | 31.50 |
| Iceland | 35.33 |
| Israel | 42.17 |
| Montenegro | 48.50 |
| Kiribati | 49.83 |
| Spain | 51.33 |
| Netherlands | 51.67 |
| Australia | 52.33 |
| Switzerland | 53.00 |
| Myanmar | 53.83 |
| Cyprus | 55.17 |
| Croatia | 55.50 |
| Sweden | 56.17 |
| Canada | 56.50 |
| Ireland | 56.83 |
| Malta | 57.50 |
| Luxembourg | 58.00 |
| Japan | 58.67 |

List of Countries with

lowest average population:

| Country | format(avg(Population) |
|-----------------------|------------------------|
| Sri Lanka | 2,522.83 |
| Maldives | 8,454.33 |
| Georgia | 9,383.33 |
| Kiribati | 14,193.50 |
| Tonga | 15,189.83 |
| Israel | 43,490.33 |
| Seychelles | 63,329.67 |
| Samoa | 104,704.83 |
| Japan | 106,435.17 |
| Sao Tome and Principe | 127,502.83 |
| Iceland | 130,239.33 |
| China | 135,528.33 |
| Vanuatu | 171,856.83 |
| Albania | 199,472.67 |
| Uzbekistan | 209,960.17 |
| Suriname | 215,914.83 |
| Luxembourg | 216,144.17 |
| Slovenia | 218,044.50 |
| Montenegro | 229,739.17 |

List of Countries with **highest** average mortality rates:

| Country | format(avg(Adult_Mortality), |
|--------------------------|------------------------------|
| Lesotho | 436.00 |
| Central African Republic | 435.50 |
| Zimbabwe | 421.00 |
| Swaziland | 409.50 |
| Nigeria | 366.00 |
| Chad | 363.33 |
| Sierra Leone | 362.67 |
| Angola | 353.67 |
| Malawi | 346.83 |
| South Sudan | 346.83 |
| South Africa | 322.50 |
| Cameroon | 310.67 |
| Zambia | 292.17 |
| Eritrea | 292.00 |
| Haiti | 287.00 |
| Uganda | 283.67 |
| Guinea-Bissau | 282.83 |
| Papua New Guinea | 282.80 |
| Liberia | 274.17 |

List of Countries with **highest**

average population:

| Country | format(avg(Population) |
|--------------------|------------------------|
| India | 281,099,848.50 |
| Indonesia | 175,751,726.33 |
| Pakistan | 123,341,557.50 |
| Nigeria | 90,382,108.33 |
| Brazil | 70,799,653.83 |
| Bangladesh | 59,971,506.33 |
| Russian Federation | 55,182,376.17 |
| Turkey | 51,513,111.50 |
| Ethiopia | 49,418,339.50 |
| Mexico | 42,514,971.50 |
| Algeria | 37,971,074.17 |
| Philippines | 36,966,300.00 |
| Argentina | 36,019,452.00 |
| Colombia | 33,247,267.83 |
| Italy | 30,963,837.83 |
| Kenya | 30,465,692.17 |
| South Africa | 29,322,660.17 |
| France | 26,338,424.83 |
| Sudan | 25,267,513.83 |

List of Countries with **lowest** average GDP:

| Country | format(avg(GDP), |
|---------------|------------------|
| Senegal | 94.40 |
| Burundi | 192.02 |
| Sierra Leone | 298.39 |
| Niger | 322.34 |
| Guinea | 353.51 |
| Madagascar | 377.95 |
| Malawi | 399.30 |
| Ethiopia | 405.60 |
| Haiti | 413.83 |
| Liberia | 414.58 |
| Central Afri | 415.03 |
| Guinea-Bissau | 434.25 |
| Rwanda | 449.40 |
| Mozambique | 454.98 |
| Togo | 467.78 |
| Zimbabwe | 477.77 |
| Afghanistan | 519.25 |
| Eritrea | 532.46 |
| Cambodia | 542,29 |

List of Countries with lowest average Schooling:

| Country | format(avg(Schooling), |
|--------------------------|------------------------|
| South Sudan | 4.08 |
| Eritrea | 5.05 |
| Niger | 5.07 |
| Djibouti | 6.10 |
| Central African Republic | 6.97 |
| Sudan | 7.03 |
| Chad | 7.10 |
| Burkina Faso | 7.18 |
| Pakistan | 7.70 |
| Mali | 7.85 |
| Mauritania | 8.05 |
| Ethiopia | 8.32 |
| Guinea | 8.52 |
| Senegal | 8.53 |
| Haiti | 8.92 |
| Myanmar | 9.05 |
| Guinea-Bissau | 9.08 |
| Sierra Leone | 9.17 |
| Equatorial Guinea | 9.20 |

List of Countries with **highest** average GDP:

| Country | format(avg(GDP), |
|-------------|------------------|
| Switzerland | 70,817.14 |
| Luxembourg | 63,600.08 |
| Australia | 61,393.17 |
| Austria | 40,276.87 |
| Netherlands | 34,698.75 |
| Denmark | 33,730.66 |
| Canada | 33,583.38 |
| Israel | 29,932.44 |
| Ireland | 27,964.95 |
| Finland | 26,069.41 |
| Iceland | 24,840.91 |
| Italy | 24,713.54 |
| Sweden | 23,298.50 |
| France | 21,954.84 |
| Greece | 19,802.19 |
| Norway | 18,417.94 |
| Germany | 16,925.93 |
| Japan | 16,718.99 |
| Spain | 15,505.83 |

List of Countries with **highest** average Schooling:

| format(avg(Schooling), 2) |
|---------------------------|
| 20.08 |
| 18.78 |
| 18.50 |
| 18.20 |
| 17.77 |
| 17.58 |
| 17.22 |
| 17.17 |
| 17.07 |
| 16.95 |
| 16.90 |
| 16.90 |
| 16.57 |
| 16.43 |
| 16.42 |
| 16.37 |
| 16.23 |
| 16.15 |
| 15.97 |
| 15.97 |
| |

List of Countries with lowest average alcohol consumption:

| Country | format(avg(Alcohol), 2) |
|-------------|-------------------------|
| South Sudan | 0.00 |
| Bangladesh | 0.01 |
| Mauritania | 0.01 |
| Afghanistan | 0.01 |
| Pakistan | 0.03 |
| Comoros | 0.05 |
| Niger | 0.05 |
| Iraq | 0.06 |
| Indonesia | 0.07 |
| Guinea | 0.08 |
| Bhutan | 0.09 |
| Timor-Leste | 0.10 |
| Tajikistan | 0.11 |
| Kiribati | 0.17 |
| Nepal | 0.18 |
| Mali | 0.21 |
| Senegal | 0.23 |
| Vanuatu | 0.30 |
| Myanmar | 0.32 |

List of Countries with **highest** average alcohol consumption:

| Country | format(avg(Alcohol), 2) |
|-------------|-------------------------|
| Belarus | 12.78 |
| Lithuania | 11.82 |
| Austria | 10.09 |
| Croatia | 10.05 |
| France | 9.60 |
| Bulgaria | 9.43 |
| Luxembourg | 9.39 |
| Ireland | 9.39 |
| Portugal | 9.34 |
| Germany | 9.26 |
| Belgium | 9.13 |
| Poland | 9.11 |
| Russian Fe | 8.96 |
| Slovenia | 8.64 |
| Australia | 8.40 |
| Switzerland | 8.20 |
| Denmark | 8.19 |
| Serbia | 7.81 |
| Finland | 7.76 |

Do densely populated countries tend to have lower life expectancy?

Countries with highest population:

- India, Indonesia, Brazil, Pakistan, Nigeria, Bangladesh, Russia

Countries with **lowest Life Expectancy**:

- Haiti, Sierra Leone, Central African Republic, Angola, Lesotho, Chad, Nigeria, Zimbabwe

<u>Answer:</u> No, other than Nigeria, the densely populated countries don't match the countries with low life expectancy

Python:

How does adult mortality affect life expectancy?

Adult mortality and life expectancy have a negative correlation (-0.75212). This means that when a country has a high life expectancy, their adult mortality rates will be lower. It also means the opposite: when a country has lower life expectancy, their adult mortality rates will be higher.

<u>Does life expectancy have positive or negative correlation with eating habits, drinking alcohol, social factors, and economic factors?</u>

Correlation table:

| | Year | Life_Expectancy | Adult_Mortality | Alcohol | Percentage_Expenditure | BMI | Total_Expenditure | GDP | Population | Schooling |
|------------------------|-----------|-----------------|-----------------|-----------|------------------------|-----------|-------------------|-----------|------------|-----------|
| Year | 1.000000 | 0.065634 | -0.037776 | -0.358063 | 0.010327 | 0.048177 | 0.013623 | -0.012964 | 0.023228 | 0.071349 |
| Life_Expectancy | 0.065634 | 1.000000 | -0.752118 | 0.399364 | 0.393558 | 0.548622 | 0.237063 | 0.466719 | -0.034120 | 0.804695 |
| Adult_Mortality | -0.037776 | -0.752118 | 1.000000 | -0.217801 | -0.250781 | -0.412567 | -0.138235 | -0.299109 | 0.024284 | -0.555038 |
| Alcohol | -0.358063 | 0.399364 | -0.217801 | 1.000000 | 0.356947 | 0.265208 | 0.237866 | 0.404765 | -0.021096 | 0.492724 |
| Percentage_Expenditure | 0.010327 | 0.393558 | -0.250781 | 0.356947 | 1.000000 | 0.219910 | 0.277197 | 0.903099 | -0.033152 | 0.383069 |
| ВМІ | 0.048177 | 0.548622 | -0.412567 | 0.265208 | 0.219910 | 1.000000 | 0.161114 | 0.279447 | -0.071932 | 0.552770 |
| Total_Expenditure | 0.013623 | 0.237063 | -0.138235 | 0.237866 | 0.277197 | 0.161114 | 1.000000 | 0.261385 | -0.075150 | 0.252240 |
| GDP | -0.012964 | 0.466719 | -0.299109 | 0.404765 | 0.903099 | 0.279447 | 0.261385 | 1.000000 | -0.029179 | 0.477967 |
| Population | 0.023228 | -0.034120 | 0.024284 | -0.021096 | -0.033152 | -0.071932 | -0.075150 | -0.029179 | 1.000000 | -0.046832 |
| Schooling | 0.071349 | 0.804695 | -0.555038 | 0.492724 | 0.383069 | 0.552770 | 0.252240 | 0.477967 | -0.046832 | 1.000000 |

Correlations with life expectancy:

Eating habits(BMI) = .548622 (**Positive** correlation, strength = medium)

Drinking alcohol = .399364 (**Positive** correlation, strength = weak)

Social factors (Schooling) = .804695 (**Positive** correlation, strength = strong)

Economic Factors

- Percent Expenditure = 0.393558 (Positive correlation, strength = weak)
- Total Expenditure = 0.237063 (**Positive** correlation, strength = weak)

What is the impact of schooling on the lifespan of humans?

- Life expectancy and Schooling have a strong positive correlation (0.8). This means that countries with more schooling have higher life expectancy rates.

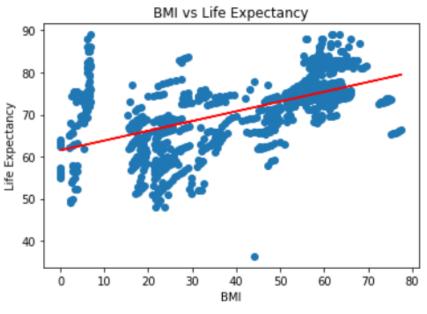
Create and **plot** several linear regression models for **life expectancy** (as the **dependent variable**) and the independent variables that had the highest correlation with life expectancy as found in your correlation analysis.



MSE: 27.99 R2: 0.6475

Equation:

y = (2.38)x + 40.47

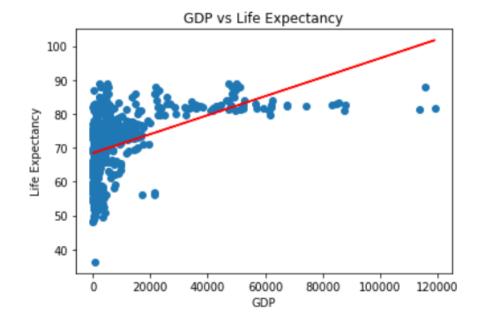


MSE: 55.51

R2: 0.3

Equation:

y = (0.232)x + 61.5



MSE: 62.12

R2: 0.2178

Equation:

y = (0.00027)x + 68.4

Which model performs the best?

- When trying to figure out which factors had the most significant effect on life expectancy I chose to compare schooling, BMI, and GDP because these had the strongest correlation with life expectancy. The model that performed best is the "Schooling and Life Expectancy" model because, when compared to BMI and GDP, it has the lowest mean square error and the highest R2 (coefficient determination).

Conclusion:

The predicting factors that were previously chosen such as demographic variables and income composition don't seem to really affect life expectancy. But, mortality rates (also a previously chosen factor) does seem to at least have a strong correlation with life expectancy. The correlation between life expectancy and mortality rates is -0.75. This means if a country has high mortality rates, they are more likely to have low life expectancy and vice versa. This makes sense because a high mortality rate means that the country has a high death rate and this could be considered as the opposite of a high life expectancy.

Countries with low life expectancy (<65) would most likely improve their average lifespan if they increase healthcare expenditure. Although the correlation between

percent of healthcare expenditure and life expectancy is only .39, it is still a positive correlation and therefore an increase in healthcare expenditure would most likely increase life expectancy over time.

An odd correlation made from the data set is a positive correlation between life expectancy and alcohol consumption. I would expect that this correlation would be negative but according to the data, it is positive. I would expect this because alcohol is known to be bad for one's health and therefore I would think that it would decrease life expectancy rates. It is possible that this positive correlation between life expectancy and alcohol was caused by error in the data, but this is very unlikely because the data came from a well known national organization. Another possibility is that countries with higher alcohol consumption may be more wealthy or developed, and for that same reason their life expectancy is also higher.

My SQL Queries:

```
use ids6db;
desc Life_Expectancy;
select * from Life_Expectancy;
-- Data Cleansing: --
select count(*) from Life Expectancy; -- 1108 rows prior to deletion
select count(*) from Life_Expectancy where (Population = 0); -- 252 rows with (population = 0)
-- delete rows where (population = 0):
set SQL_SAFE_UPDATES = 0;
delete from Life Expectancy where (Population = 0);
-- success: 252 row(s) affected
-- fill in where (total_expenditure = 0) with avg(total_expenditure) where (total_expenditure != 0)
select * from Life_Expectancy where (Total_Expenditure < .5);
select avg(Total_Expenditure) from Life_Expectancy where (Total_Expenditure != 0);
-- avg = 6.2
update Life Expectancy set Total Expenditure = 6.2
where (Total Expenditure = 0);
```

```
-- fill in where (Percentage Expenditure = 0) with avg(Percentage Expenditure)
where(percentage Expenditure != 0)
select * from Life Expectancy where (Percentage Expenditure = 0);
select avg(Percentage Expenditure) from Life Expectancy where (Percentage Expenditure != 0);
-- avg = 1041.79
update Life_Expectancy set Percentage Expenditure = 1041.79
where (Percentage Expenditure = 0);
-- delete countries with 0 GDP
delete from Life Expectancy where (GDP = 0);
-- 7 rows affected
-- delete Palau because Life expectancy, adult mortality & alcohol = 0
delete from Life_Expectancy where (Country = "Palau");
-- delete Tuvalu because life expectancy & adult mortality = 0
delete from Life Expectancy where (Country = "Tuvalu");
-- display total count of countries after data cleansing:
select count(Country) from Life Expectancy; -- 847
-- List of countries with the highest and lowest average mortality rates (years 2010-2015):
select Country, format(avg(Adult Mortality), 2) from Life Expectancy
group by Country order by avg(Adult Mortality) asc;
select Country, format(avg(Adult Mortality), 2) from Life Expectancy
group by Country order by avg(Adult Mortality) desc;
select * from Life Expectancy where (Country = "Palau");
-- List of countries with the highest and lowest average population (years 2010-2015):
select Country, format(avg(Population), 2) from Life Expectancy
group by Country order by avg(Population) asc;
select Country, format(avg(Population), 2) from Life Expectancy
group by Country order by avg(Population) desc;
-- List of countries with the highest and lowest average GDP (years 2010-2015):
select Country, format(avg(GDP), 2) from Life_Expectancy
group by Country order by avg(GDP) asc;
```

select Country, format(avg(GDP), 2) from Life_Expectancy group by Country order by avg(GDP) desc;

- -- List of countries with the highest and lowest average Schooling (years 2010-2015): select Country, format(avg(Schooling), 2) from Life_Expectancy group by Country order by avg(Schooling) asc; select Country, format(avg(Schooling), 2) from Life_Expectancy group by Country order by avg(Schooling) desc;
- -- Which countries have the highest and lowest average alcohol consumption (years 2010-2015)? select Country, format(avg(Alcohol), 2) from Life_Expectancy group by Country order by avg(Alcohol) asc;
- -- Countries with lowest avg alc consumption:
- -- Sudan, Bangladesh, Mauritania, Afghanistan, Pakistan select Country, format(avg(Alcohol), 2) from Life_Expectancy group by Country order by avg(Alcohol) desc;
- -- Countries with highest avg alc consumption:
- -- Belarus, Lithuania, Austria, Croatia, France, Bulgaria
- -- Do densely populated countries tend to have lower life expectancy?Select Country, Life_Expectancy, Populationfrom Life_Expectancy order by (Population) desc;
- -- countries with highest population:
- India, Indonesia, Brazil, Pakistan, Nigeria, Bangladesh, Russia
 Select Country, Life_Expectancy, Population
 from Life_Expectancy order by Life_Expectancy asc;
- -- countries with lowest Life Expectancy:
- -- Haiti, Sierra Leone, Central African Republic, Angola, Lesotho, Chad, Nigeria, Zimbabwe
- -- ans: No, except for Nigeria, the densely populated countries don't match the
- -- countries with low life expectancy