# Predicting Life Expectancy With EDA & Machine Learning



Capstone project: PCDSI0121

















#### Scope

- Information on life expectancy dataset
- Challenges faced in dataset
- Approach taken to overcome challenges
- Problem statement
- EDA(Analysis) on dataset
- Machine learning models used for prediction
- Conclusion
- Resources
- End

#### Information on dataset

Name of dataset: <u>Life Expectancy Data (WHO).csv</u>

Link to dataset: <a href="https://www.kaggle.com/code/mrinath/starter-life-expectancy-who-9536c272-3/data">https://www.kaggle.com/code/mrinath/starter-life-expectancy-who-9536c272-3/data</a>

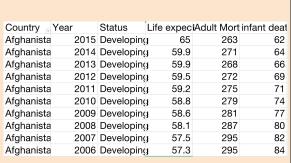
Records: <u>Year 2000 - 2015</u>

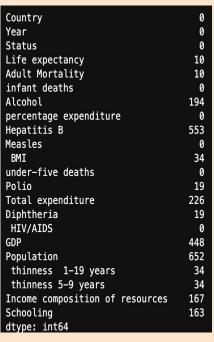
	Country	Year	Status	Life expectancy	Adult Mortality	infant deaths	Alcohol	percentage expenditure	Hepatitis B	Measles	Polio	Total expenditure	Diphtheria	HIV/AIDS	GDP	Population	thinness 1-19 years	
0	Afghanistan	2015	Developing	65.0	263.0	62	0.01	71.279624	65.0	1154	6.0	8.16	65.0	0.1	584.259210	33736494.0	17.2	
1	Afghanistan	2014	Developing	59.9	271.0	64	0.01	73.523582	62.0	492	58.0	8.18	62.0	0.1	612.696514	327582.0	17.5	
2	Afghanistan	2013	Developing	59.9	268.0	66	0.01	73.219243	64.0	430	62.0	8.13	64.0	0.1	631.744976	31731688.0	17.7	
3	Afghanistan	2012	Developing	59.5	272.0	69	0.01	78.184215	67.0	2787	67.0	8.52	67.0	0.1	669.959000	3696958.0	17.9	
4	Afghanistan	2011	Developing	59.2	275.0	71	0.01	7.097109	68.0	3013	68.0	7.87	68.0	0.1	63.537231	2978599.0	18.2	
2933	Zimbabwe	2004	Developing	44.3	723.0	27	4.36	0.000000	68.0	31	67.0	7.13	65.0	33.6	454.366654	12777511.0	9.4	
2934	Zimbabwe	2003	Developing	44.5	715.0	26	4.06	0.000000	7.0	998	7.0	6.52	68.0	36.7	453.351155	12633897.0	9.8	
2935	Zimbabwe	2002	Developing	44.8	73.0	25	4.43	0.000000	73.0	304	73.0	6.53	71.0	39.8	57.348340	125525.0	1.2	
2936	Zimbabwe	2001	Developing	45.3	686.0	25	1.72	0.000000	76.0	529	76.0	6.16	75.0	42.1	548.587312	12366165.0	1.6	
2937	Zimbabwe	2000	Developing	46.0	665.0	24	1.68	0.000000	79.0	1483	78.0	7.10	78.0	43.5	547.358878	12222251.0	11.0	
2938 r	ows × 22 col	umns																

Rows: <u>2,938</u> Columns: <u>22</u>

# Column Non-Null Count Dtype				
1 Year 2938 non-null int64 2 Status 2938 non-null object 3 Life expectancy 2928 non-null float64 4 Adult Mortality 2928 non-null float64 5 infant deaths 2938 non-null int64 6 Alcohol 2744 non-null float64 7 percentage expenditure 2938 non-null float64 8 Hepatitis B 2385 non-null float64 9 Measles 2938 non-null float64 10 BMI 2904 non-null float64 11 under-five deaths 2938 non-null int64 12 Polio 2919 non-null float64 13 Total expenditure 2712 non-null float64 14 Diphtheria 2919 non-null float64 15 HIV/AIDS 2938 non-null float64 16 GDP 2490 non-null float64 17 Population 2286 non-null float64 18 thinness 1-19 years 2904 non-null float64 19 thinness 5-9 years 2904 non-null float64	#	Column	Non-Null Count	Dtype
1 Year 2938 non-null int64 2 Status 2938 non-null object 3 Life expectancy 2928 non-null float64 4 Adult Mortality 2928 non-null float64 5 infant deaths 2938 non-null int64 6 Alcohol 2744 non-null float64 7 percentage expenditure 2938 non-null float64 8 Hepatitis B 2385 non-null float64 9 Measles 2938 non-null float64 10 BMI 2904 non-null float64 11 under-five deaths 2938 non-null int64 12 Polio 2919 non-null float64 13 Total expenditure 2712 non-null float64 14 Diphtheria 2919 non-null float64 15 HIV/AIDS 2938 non-null float64 16 GDP 2490 non-null float64 17 Population 2286 non-null float64 18 thinness 1-19 years 2904 non-null float64 19 thinness 5-9 years 2904 non-null float64		<del></del>		
2 Status       2938 non-null float64         3 Life expectancy       2928 non-null float64         4 Adult Mortality       2928 non-null int64         5 infant deaths       2938 non-null int64         6 Alcohol       2744 non-null float64         7 percentage expenditure       2938 non-null float64         8 Hepatitis B       2385 non-null float64         9 Measles       2938 non-null int64         10 BMI       2904 non-null float64         11 under-five deaths       2938 non-null float64         12 Polio       2919 non-null float64         13 Total expenditure       2712 non-null float64         14 Diphtheria       2919 non-null float64         15 HIV/AIDS       2938 non-null float64         16 GDP       2490 non-null float64         17 Population       2286 non-null float64         18 thinness 1-19 years       2904 non-null float64         19 thinness 5-9 years       2904 non-null float64	0	Country	2938 non-null	-
3 Life expectancy 2928 non-null float64 4 Adult Mortality 2928 non-null float64 5 infant deaths 2938 non-null int64 6 Alcohol 2744 non-null float64 7 percentage expenditure 2938 non-null float64 8 Hepatitis B 2385 non-null float64 9 Measles 2938 non-null int64 10 BMI 2904 non-null float64 11 under-five deaths 2938 non-null int64 12 Polio 2919 non-null float64 13 Total expenditure 2712 non-null float64 14 Diphtheria 2919 non-null float64 15 HIV/AIDS 2938 non-null float64 16 GDP 2490 non-null float64 17 Population 2286 non-null float64 18 thinness 1-19 years 2904 non-null float64 19 thinness 5-9 years 2904 non-null float64	1 1	Year	2938 non-null	int64
4       Adult Mortality       2928 non-null float64         5       infant deaths       2938 non-null int64         6       Alcohol       2744 non-null float64         7       percentage expenditure       2938 non-null float64         8       Hepatitis B       2385 non-null int64         9       Measles       2938 non-null int64         10       BMI       2904 non-null float64         11       under-five deaths       2938 non-null float64         12       Polio       2919 non-null float64         13       Total expenditure       2712 non-null float64         14       Diphtheria       2919 non-null float64         15       HIV/AIDS       2938 non-null float64         16       GDP       2490 non-null float64         17       Population       2286 non-null float64         18       thinness       1-19 years       2904 non-null float64         19       thinness       5-9 years       2904 non-null float64	2	Status	2938 non-null	object
5       infant deaths       2938 non-null int64         6       Alcohol       2744 non-null float64         7       percentage expenditure       2938 non-null float64         8       Hepatitis B       2385 non-null float64         9       Measles       2938 non-null int64         10       BMI       2904 non-null float64         11       under-five deaths       2938 non-null int64         12       Polio       2919 non-null float64         13       Total expenditure       2712 non-null float64         14       Diphtheria       2919 non-null float64         15       HIV/AIDS       2938 non-null float64         16       GDP       2490 non-null float64         17       Population       2286 non-null float64         18       thinness       1-19 years       2904 non-null float64         19       thinness       5-9 years       2904 non-null float64	. 3	Life expectancy	2928 non-null	float64
6 Alcohol 2744 non-null float64 7 percentage expenditure 2938 non-null float64 8 Hepatitis B 2385 non-null float64 9 Measles 2938 non-null int64 10 BMI 2904 non-null float64 11 under-five deaths 2938 non-null int64 12 Polio 2919 non-null float64 13 Total expenditure 2712 non-null float64 14 Diphtheria 2919 non-null float64 15 HIV/AIDS 2938 non-null float64 16 GDP 2490 non-null float64 17 Population 2286 non-null float64 18 thinness 1-19 years 2904 non-null float64 19 thinness 5-9 years 2904 non-null float64	4	Adult Mortality	2928 non-null	float64
7 percentage expenditure 2938 non-null float64 8 Hepatitis B 2385 non-null float64 9 Measles 2938 non-null int64 10 BMI 2904 non-null float64 11 under-five deaths 2938 non-null int64 12 Polio 2919 non-null float64 13 Total expenditure 2712 non-null float64 14 Diphtheria 2919 non-null float64 15 HIV/AIDS 2938 non-null float64 16 GDP 2490 non-null float64 17 Population 2286 non-null float64 18 thinness 1-19 years 2904 non-null float64 19 thinness 5-9 years 2904 non-null float64	5	infant deaths	2938 non-null	int64
8 Hepatitis B       2385 non-null float64         9 Measles       2938 non-null int64         10 BMI       2904 non-null float64         11 under-five deaths       2938 non-null int64         12 Polio       2919 non-null float64         13 Total expenditure       2712 non-null float64         14 Diphtheria       2919 non-null float64         15 HIV/AIDS       2938 non-null float64         16 GDP       2490 non-null float64         17 Population       2286 non-null float64         18 thinness 1-19 years       2904 non-null float64         19 thinness 5-9 years       2904 non-null float64	6	Alcohol	2744 non-null	float64
9 Measles         2938 non-null int64           10 BMI         2904 non-null float64           11 under-five deaths         2938 non-null int64           12 Polio         2919 non-null float64           13 Total expenditure         2712 non-null float64           14 Diphtheria         2919 non-null float64           15 HIV/AIDS         2938 non-null float64           16 GDP         2490 non-null float64           17 Population         2286 non-null float64           18 thinness 1-19 years         2904 non-null float64           19 thinness 5-9 years         2904 non-null float64	7	percentage expenditure	2938 non-null	float64
10       BMI       2904 non-null float64         11       under-five deaths       2938 non-null int64         12       Polio       2919 non-null float64         13       Total expenditure       2712 non-null float64         14       Diphtheria       2919 non-null float64         15       HIV/AIDS       2938 non-null float64         16       GDP       2490 non-null float64         17       Population       2286 non-null float64         18       thinness 1-19 years       2904 non-null float64         19       thinness 5-9 years       2904 non-null float64	8	Hepatitis B	2385 non-null	float64
11 under-five deaths       2938 non-null int64         12 Polio       2919 non-null float64         13 Total expenditure       2712 non-null float64         14 Diphtheria       2919 non-null float64         15 HIV/AIDS       2938 non-null float64         16 GDP       2490 non-null float64         17 Population       2286 non-null float64         18 thinness 1-19 years       2904 non-null float64         19 thinness 5-9 years       2904 non-null float64	9	Measles	2938 non-null	int64
12 Polio       2919 non-null float64         13 Total expenditure       2712 non-null float64         14 Diphtheria       2919 non-null float64         15 HIV/AIDS       2938 non-null float64         16 GDP       2490 non-null float64         17 Population       2286 non-null float64         18 thinness 1-19 years       2904 non-null float64         19 thinness 5-9 years       2904 non-null float64	10	BMI	2904 non-null	float64
13 Total expenditure       2712 non-null float64         14 Diphtheria       2919 non-null float64         15 HIV/AIDS       2938 non-null float64         16 GDP       2490 non-null float64         17 Population       2286 non-null float64         18 thinness 1-19 years       2904 non-null float64         19 thinness 5-9 years       2904 non-null float64	11	under-five deaths	2938 non-null	int64
14 Diphtheria       2919 non-null float64         15 HIV/AIDS       2938 non-null float64         16 GDP       2490 non-null float64         17 Population       2286 non-null float64         18 thinness 1-19 years       2904 non-null float64         19 thinness 5-9 years       2904 non-null float64	12	Polio	2919 non-null	float64
15       HIV/AIDS       2938 non-null float64         16       GDP       2490 non-null float64         17       Population       2286 non-null float64         18       thinness 1-19 years       2904 non-null float64         19       thinness 5-9 years       2904 non-null float64	13	Total expenditure	2712 non-null	float64
16GDP2490 non-nullfloat6417Population2286 non-nullfloat6418thinness 1-19 years2904 non-nullfloat6419thinness 5-9 years2904 non-nullfloat64	14	Diphtheria	2919 non-null	float64
17Population2286 non-nullfloat6418thinness 1-19 years2904 non-nullfloat6419thinness 5-9 years2904 non-nullfloat64	15	HIV/AIDS	2938 non-null	float64
18 thinness 1-19 years 2904 non-null float64 19 thinness 5-9 years 2904 non-null float64	16	GDP	2490 non-null	float64
19 thinness 5-9 years 2904 non-null float64	17	Population	2286 non-null	float64
	18	thinness 1-19 years	2904 non-null	float64
20 Income composition of resources 2771 non-null float64	19	thinness 5-9 years	2904 non-null	float64
	20	Income composition of resources	2771 non-null	float64
21 Schooling 2775 non-null float64	21	Schooling	2775 non-null	float64
dtypes: float64(16), int64(4), object(2)				
memory usage: 505.1+ KB				

#### Challenges faced in dataset







There were several missing data values in dataset.



Not able to clearly see how each feature affected life expectancy data.



Not all data values were numerical.



Some of the data were in random sequence.



### Approach taken to overcome challenges

- → Use EDA to analyse and clean data, drop the data that has missing values.
- → Use EDA to analyse and use scatter plot graphs, histogram and correlation matrix to show how each feature affected the life expectancy data.
- → Use Label Encoding and Normalising for non-numerical data.
- → Use Machine learning models such as Linear regression, Polynomial regression, Decision tree regression and Random forest regression for prediction in data.



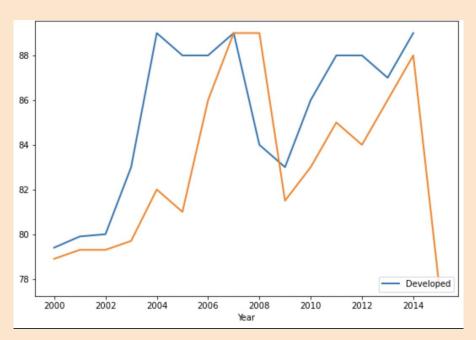
#### **Problem Statement**

#### **Predicting Life Expectancy**

- ★ Life expectancy means how long can a person live up to. It can be dependent upon his/her age, health, schooling, lifestyles and many more.
- ★ Aim of this project is to predict life expectancy using "Life Expectancy Data(WHO)" dataset.
- ★ By performing the use of Exploratory data analysis (EDA) and Machine learning models to predict life expectancy.

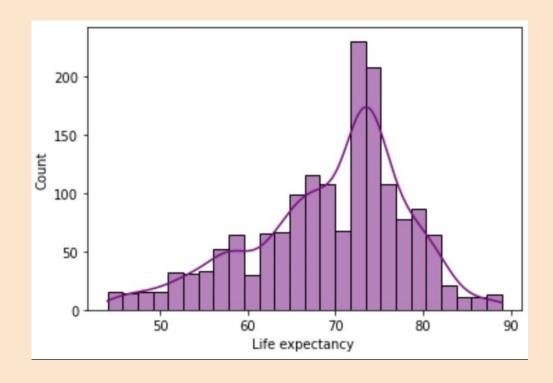
### Life expectancy based on country status

#### Developed vs Developing



It is observed that Developed status had higher life expectancy compared to Developing status.

#### Distribution graph on Life Expectancy

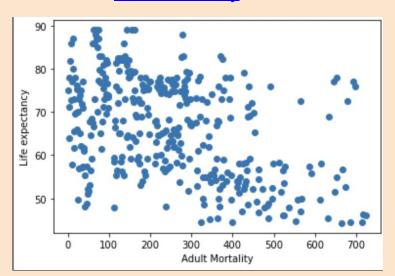


It is observed the life expectancy commonly ranges from 45 years to 90 years.

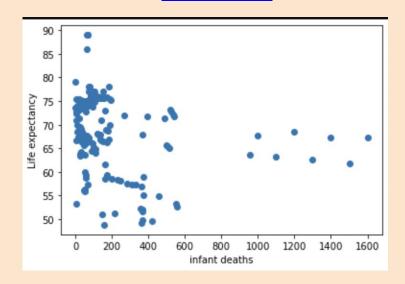
## Scatter plot graph on Life Expectancy affected by Adult Mortality and Infant deaths

It is observed that Adult Mortality affect life expectancy more than infant deaths. Adult mortality also known as deaths caused by specific or general reasons.

#### **Adult mortality**

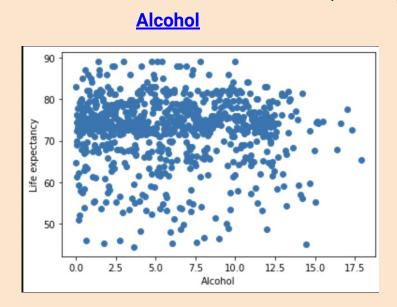


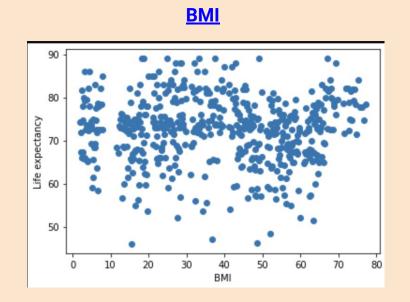
#### **Infant deaths**



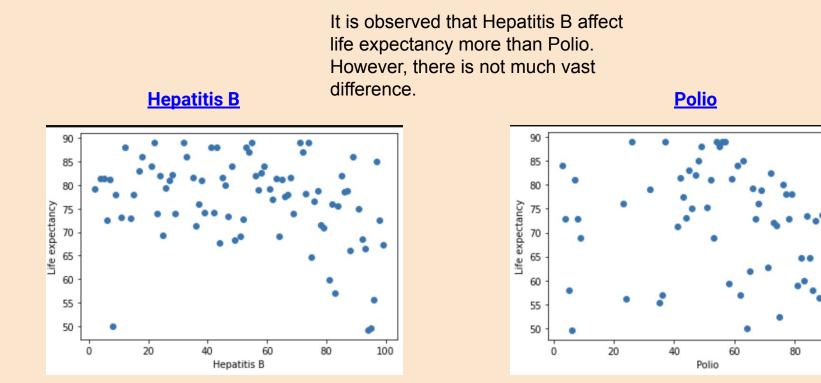
## Scatter plot graph on Life Expectancy affected by Alcohol and BMI

It is observed that Alcohol affect life expectancy more than BMI.

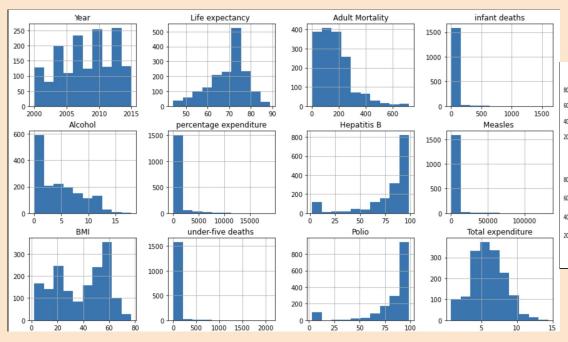


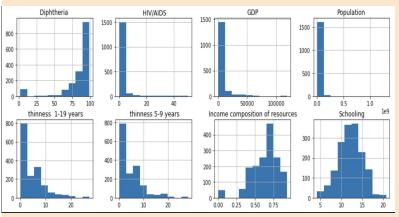


## Scatter plot graph on Life Expectancy affected by Polio and Hepatitis B

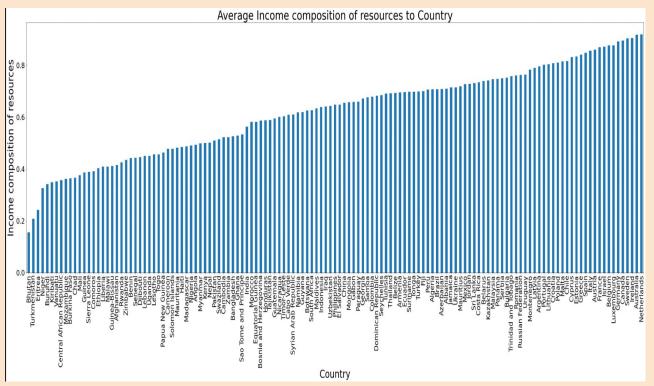


## Overview of histogram graphs showing all features



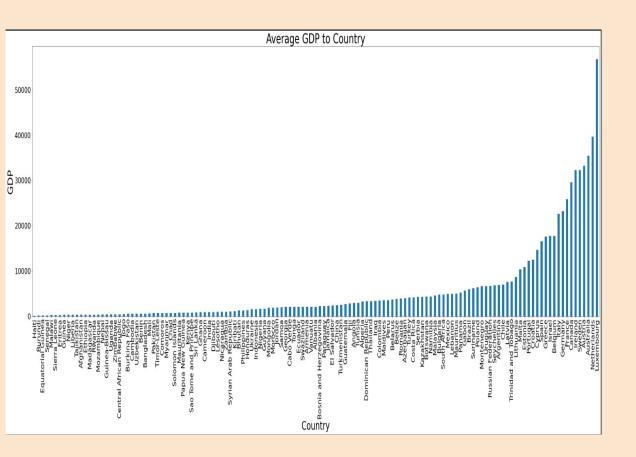


### Plot graph for Income composition of resources in each country



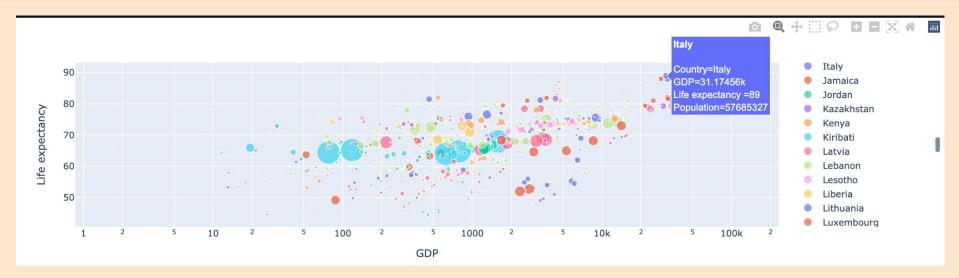
It is observed that countries such as Netherlands, Australia and Ireland have highest income composition resources.

### Plot graph for Average GDP in each country



It is observed that countries such as Luxembourg, Netherlands, Australia and Ireland have highest average GDP (gross domestic product).

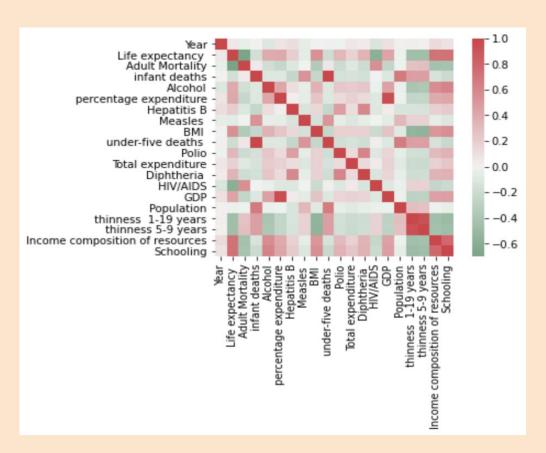
#### Plotly bubble chart for life expectancy and GDP in each country



E.g Show Italy

It is observed that countries such as Italy, France, Spain, Netherlands, Australia and Ireland have highest GDP and highest life expectancy. The bubble size indicates the population size in each country.

#### Correlation heatmap of all features affecting life expectancy



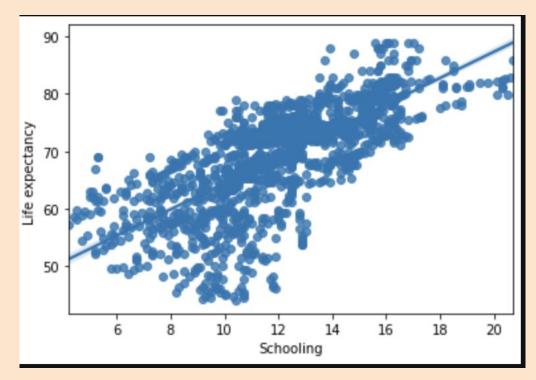
It is observed that **schooling** has highest positive correlation with life expectancy. Perhaps, this shows that schooling is very important to cultivate proper education to lead safe and healthy lifestyles which may help to increase life expectancy rate.

### Use of label encoding and normalising data

#### For those non numerical data

	Year	Status	Life_expectancy_	Adult_Mortality	infant_deaths	Alcohol	percentage_expenditure	Hepatitis_B	Measles_	_BMI_	Polio	Total_expenditure	Diphtheria_	_HIV/AII
0	2015	0	0.730337	0.363762	0.038750	0.000560	0.003759	0.656566	0.008780	0.247730	0.060606	0.567060	0.656566	0.0019
1	2014	0	0.673034	0.374827	0.040000	0.000560	0.003878	0.626263	0.003743	0.241245	0.585859	0.568450	0.626263	0.0019
2	2013	0	0.673034	0.370678	0.041250	0.000560	0.003861	0.646465	0.003271	0.234760	0.626263	0.564976	0.646465	0.0019
3	2012	0	0.668539	0.376210	0.043125	0.000560	0.004123	0.676768	0.021203	0.228275	0.676768	0.592078	0.676768	0.0019
4	2011	0	0.665169	0.380360	0.044375	0.000560	0.000374	0.686869	0.022923	0.223087	0.686869	0.546908	0.686869	0.0019
2933	2004	0	0.497753	1.000000	0.016875	0.243984	0.000000	0.686869	0.000236	0.351492	0.676768	0.495483	0.656566	0.6640
2934	2003	0	0.500000	0.988935	0.016250	0.227196	0.000000	0.070707	0.007593	0.346304	0.070707	0.453092	0.686869	0.7252
2935	2002	0	0.503371	0.100968	0.015625	0.247902	0.000000	0.737374	0.002313	0.341115	0.737374	0.453787	0.717172	0.7865
2936	2001	0	0.508989	0.948824	0.015625	0.096251	0.000000	0.767677	0.004025	0.335927	0.767677	0.428075	0.757576	0.8320
2937	2000	0	0.516854	0.919779	0.015000	0.094012	0.000000	0.797980	0.011283	0.330739	 0.787879	0.493398	0.787879	0.8596

### Regression plot of schooling with life expectancy

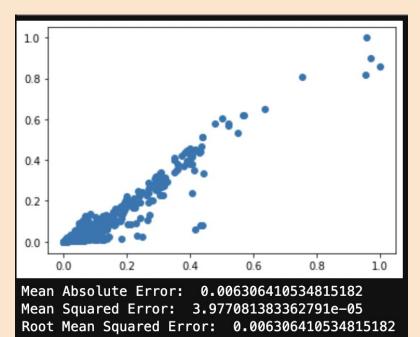


It is observed that schooling has a very close-knitted relationship with life expectancy.

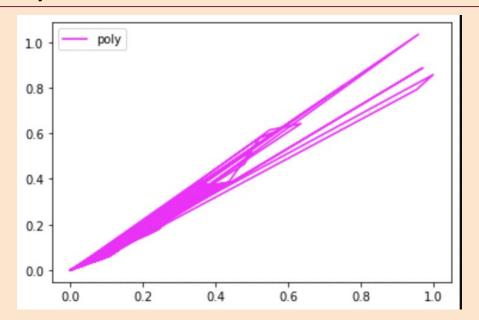
## Linear Regression model using GDP, year, life expectancy and percentage expenditure

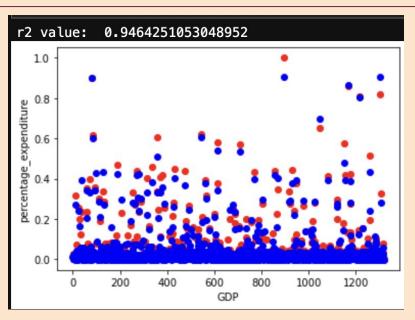
Description	Value
Linear regression coefficient	0.96
Mean absolute error	0.0063
Mean squared error	3.977
Root Mean squared error	0.0063

It is observed that the coefficient value closer to 1, indicate a more optimal prediction.



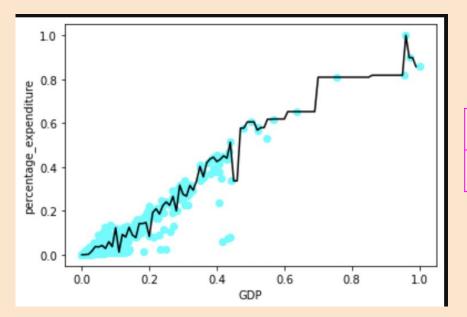
## Polynomial Regression model using GDP and percentage expenditure





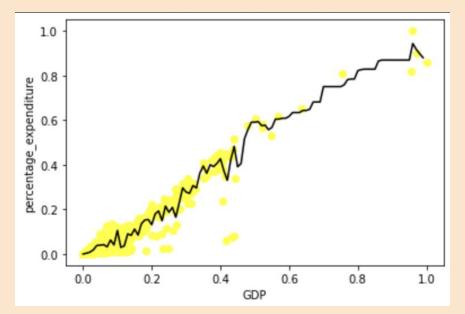
Description	Value
r2	0.95

## Decision Tree Regression model using GDP and percentage expenditure



Description	Value
Prediction	0.86

## Random Forest Regression model using GDP and percentage expenditure



Description	Value
Prediction	0.88

#### Conclusion

To conclude, it has been observed from this project, how the different features affect the life expectancy. From the correlation heatmap, it was seen that schooling has the highest correlation with life expectancy. Then, from the machine learning models applied, it was seen that Linear Regression provided a more accurate prediction value that was closer to 1.

However, certain features were not included in the dataset such as environmental factors that may affect life expectancy. Thus, the overall analysis in this project may not be wholesome to make the best accurate prediction yet.





#### Resources

- https://www.kaggle.com/code/mrinath/starter-life-expectancy-who-9536c272-3/data
- ☐ <u>Towardsdatascience.com</u>
- ☐ Kaggle.com
- □ Stackoverflow,com
- □ github.com

### End

