

A large crowd of diverse people, representing various ages, ethnicities, and genders, is arranged to form the shape of a world map. The people are standing on a light-colored surface, and their shadows are cast to the right. The map is centered on the Atlantic Ocean, with North and South America on the left and Europe and Africa on the right.

THE DRIVERS OF HAPPINESS ACROSS COUNTRIES

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The logo for the World Happiness Report. It features a large, stylized white 'W' and 'H' on a dark purple circular background. Below the letters, the words 'World Happiness Report' are written in white.

World Happiness
Report

WHY DOES THE HAPPINESS REPORT MATTER?

- Shifting\Complement Economic Metrics
- Understand Human Flourishing
- Improve Public Policy



DATA

<https://www.kaggle.com/datasets/unsdsn/world-happiness>

Rank	Country	Score	GDP	Social support	Healthy life expectancy	Freedom to make life choices	Generosity	Perception of corruption
1	Finland	7.632	1.305	1.592	0.874	0.681	0.202	0.393
2	Norway	7.594	1.456	1.582	0.861	0.686	0.286	0.34
3	Denmark	7.555	1.351	1.59	0.868	0.683	0.284	0.408
4	Iceland	7.495	1.343	1.644	0.914	0.677	0.353	0.138
5	Switzerland	7.487	1.42	1.549	0.927	0.66	0.256	0.357
6	Netherlands	7.441	1.361	1.488	0.878	0.638	0.333	0.295
7	Canada	7.328	1.33	1.532	0.896	0.653	0.321	0.291
8	New Zealand	7.324	1.268	1.601	0.876	0.669	0.365	0.389

The dataset is derived from the World Happiness Report, which collects and aggregates data from surveys conducted across 156 countries.

FEATURES

- Ladder score
- GDP
- Social support
- Healthy life expectancy
- Freedom to make life choices
- Generosity
- Perception of corruption

The ladder score is rated by people on a scale from 0 to 10, while the other variables are based on survey responses or national statistics and are scaled between 0 and 1



RESEARCH QUESTION

***What Are the Key Leading
Factors Behind Happiness
Across Countries?***



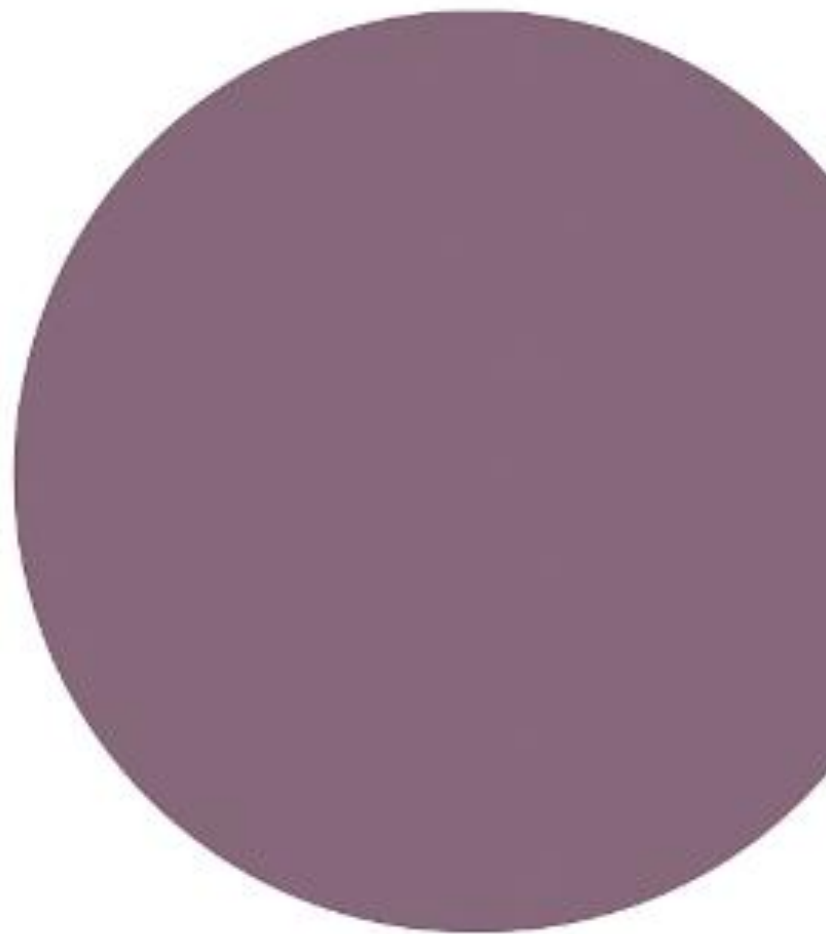
Research plan:

Initial Work:

- Visual data exploration
- Checked for outliers
- Normality testing (Shapiro Wilk test, Histogram and Q-Q plots inspection)
- **Spearman correlation matrix**
- Performed **Mann-Whitney U test**

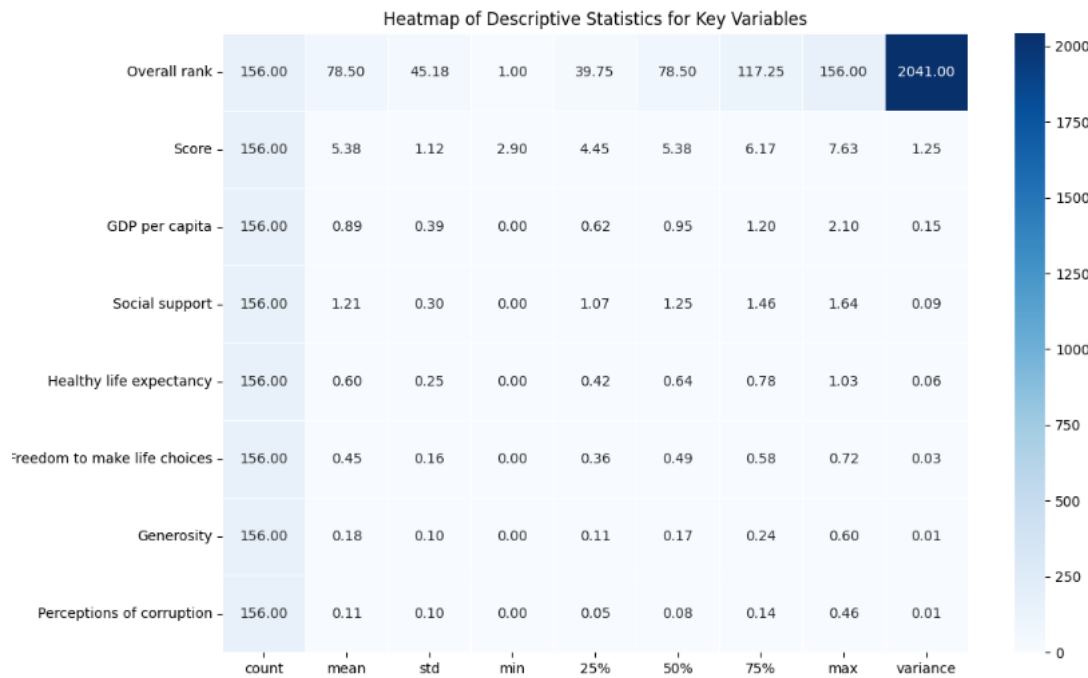
Next steps:

- Fit a **multiple linear regression model** to predict ladder score
 - **Factor analysis** and **PCA** and for deeper insights.
 - Open to suggestions..
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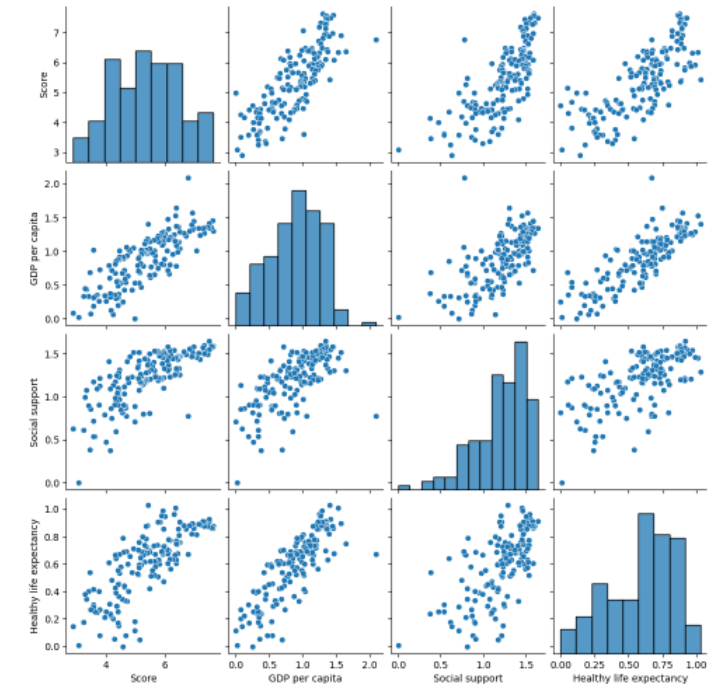


**FIRST
INSIGHTS**

Descriptive statistic



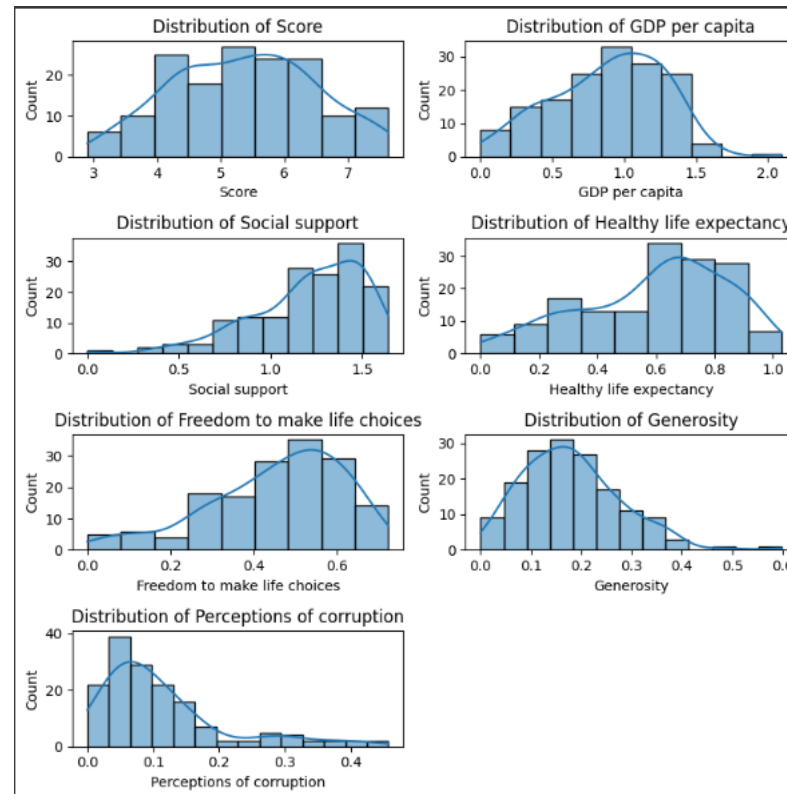
- **Low-to-moderate variability** ($CV \leq 50\%$) – includes score, GDP, social support, health, and freedom.
- **High variability** ($CV > 50\%$) – includes generosity and perceptions of corruption.



- **Positive linear relationships** are visible between **Happiness**, **GDP**, **Life expectancy** and **Social support**.

Normality Testing

- Kolmogorov-Smirnov
- *Shapiro-Wilk* test
- Histograms and Q-Q Plot



Findings:

Most variables exhibit **non-normal distributions** in the **Shapiro-Wilk** test. Although the **Kolmogorov-Smirnov** test failed to reject the normality assumption for most. The **happiness score** appears to be the only variable that closely follows a normal distribution.

4.1 Kolmogorov-Smirnov Test

(H_0): The sample distribution matches the reference normal distribution.

(H_1): The sample distribution does not match the reference normal distribution.

Kolmogorov-Smirnov Test for Score: Test Statistic=0.05605680817111691, p-value=0.6895308864938953
Fail to reject H_0 : Score appears to be normally distributed ($p > 0.05$).

Kolmogorov-Smirnov Test for GDP per capita: Test Statistic=0.06842252836460072, p-value=0.4389334233429809
Fail to reject H_0 : GDP per capita appears to be normally distributed ($p > 0.05$).

Kolmogorov-Smirnov Test for Social support: Test Statistic=0.1044977237433945, p-value=0.06159779950659561
Fail to reject H_0 : Social support appears to be normally distributed ($p > 0.05$).

Kolmogorov-Smirnov Test for Healthy life expectancy: Test Statistic=0.10361769279265903, p-value=0.06527112886744046
Fail to reject H_0 : Healthy life expectancy appears to be normally distributed ($p > 0.05$).

Kolmogorov-Smirnov Test for Freedom to make life choices: Test Statistic=0.09366928154810306, p-value=0.12141420175917983
Fail to reject H_0 : Freedom to make life choices appears to be normally distributed ($p > 0.05$).

Kolmogorov-Smirnov Test for Generosity: Test Statistic=0.06943298865363323, p-value=0.42053826539284933
Fail to reject H_0 : Generosity appears to be normally distributed ($p > 0.05$).

Kolmogorov-Smirnov Test for Perceptions of corruption: Test Statistic=0.1755482885735195, p-value=0.00011245982196460581
Reject H_0 : Perceptions of corruption does not appear to be normally distributed ($p \leq 0.05$).

Shapiro-Wilk test for Generosity

Shapiro-Wilk Test for Score: Test Statistic=0.9847009168993887, p-value=0.08279644536822618
Fail to reject H_0 : Score appears to be normally distributed ($p > 0.05$).

Shapiro-Wilk Test for GDP per capita: Test Statistic=0.9783647566293384, p-value=0.014863139765569156
Reject H_0 : GDP per capita does not appear to be normally distributed ($p \leq 0.05$).

Shapiro-Wilk Test for Social support: Test Statistic=0.9157709523766362, p-value=7.14616542841997e-08
Reject H_0 : Social support does not appear to be normally distributed ($p \leq 0.05$).

Shapiro-Wilk Test for Healthy life expectancy: Test Statistic=0.9553927811486822, p-value=6.741699526378972e-05
Reject H_0 : Healthy life expectancy does not appear to be normally distributed ($p \leq 0.05$).

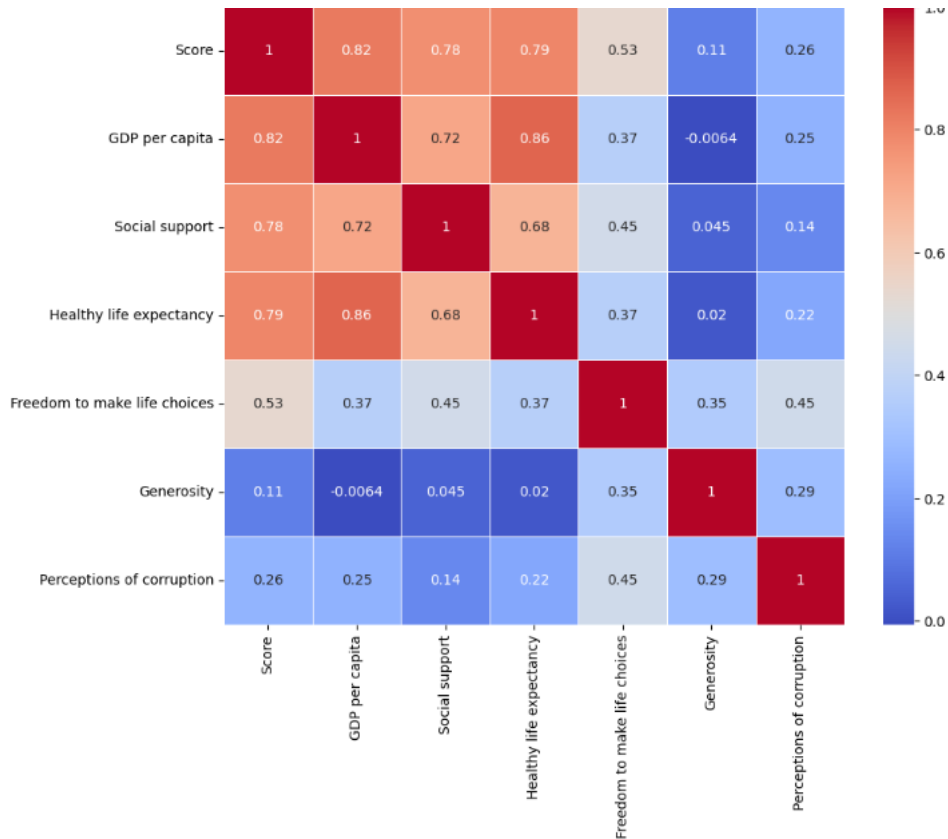
Shapiro-Wilk Test for Freedom to make life choices: Test Statistic=0.9454755060515656, p-value=9.620930219590556e-06
Reject H_0 : Freedom to make life choices does not appear to be normally distributed ($p \leq 0.05$).

Shapiro-Wilk Test for Generosity: Test Statistic=0.9580657359730878, p-value=0.00011795787790420376
Reject H_0 : Generosity does not appear to be normally distributed ($p \leq 0.05$).

Shapiro-Wilk Test for Perceptions of corruption: Test Statistic=0.8192201046017141, p-value=1.312741153798697e-12
Reject H_0 : Perceptions of corruption does not appear to be normally distributed ($p \leq 0.05$).

Non-parametric tests

Spearman Correlation Matrix



Mann-Whitney U test

(H_0) : The distribution of happiness scores is the same for both groups (e.g., countries with high and low social support).
 (H_1) : The distribution of happiness scores is different between the two groups.

Mann-Whitney U Test for GDP per capita: U-statistic = 5509.0, p-value = 2.2831859588712224e-18

Reject H_0 : There is a significant difference in happiness scores between high and low GDP per capita groups.

Mann-Whitney U Test for Social support: U-statistic = 5473.0, p-value = 7.00964721691908e-18

Reject H_0 : There is a significant difference in happiness scores between high and low Social support groups.

Mann-Whitney U Test for Healthy life expectancy: U-statistic = 5369.0, p-value = 1.6361291019341514e-16

Reject H_0 : There is a significant difference in happiness scores between high and low Healthy life expectancy groups.

Mann-Whitney U Test for Freedom to make life choices: U-statistic = 4555.5, p-value = 8.197418156509714e-08

Reject H_0 : There is a significant difference in happiness scores between high and low Freedom to make life choices groups.

Mann-Whitney U Test for Perceptions of corruption: U-statistic = 3685.5, p-value = 0.02163472889022436

Reject H_0 : There is a significant difference in happiness scores between high and low Perceptions of corruption groups.

Mann-Whitney U Test for Generosity: U-statistic = 3270.5, p-value = 0.41901521548437626

Fail to reject H_0 : There is no significant difference in happiness scores between high and low Generosity groups.

Mann-Whitney U Test:

Most predictors are associated with **notable shifts in happiness scores** when countries are divided by the median level of each factor.

However, **generosity** does **not** show a difference in happiness between high and low generosity groups ($p = 0.42$).

- Strongest correlations with happiness are :
GDP per capita ($\rho = 0.82$), **Healthy life expectancy ($\rho = 0.79$)**, and **Social support ($\rho = 0.78$)**.
- Weaker correlations:
Freedom ($\rho = 0.53$), **Perceptions of corruption ($\rho = 0.26$)**,
Generosity ($\rho = 0.11$).



- **GDP per capita, healthy life expectancy, and social support** appear to be the most influential factors associated with happiness.
- Apply **multiple linear regression** and **PCA** to identify key influencing factors
- Investigate **relationships between variables**, not only with happiness but among themselves
- For a more **objective comparison**, consider using the **Misery Index** (inflation + unemployment) for comparison.
- The survey has some limitation which we will mention later on.

Conclusions & Future Work