

A Statistical Exploration of Happiness

Team Members

- > Isaac Kim**
- > Urmika Kasi**
- > Andy Tsai**
- > Abhishek Saini**
- > Kevin Torrico**



Learning Objectives

- > Discovering the important factors in determining happiness**
- > Analyzing impacts and correlations Covid-19 had on happiness levels around the world**
- > Understanding and comparing happiness levels between different geographical regions**

Dataset Selection

- > <https://worldhappiness.report/ed/2021/>
- > The Gallup World Poll data was used to calculate the happiness scores and rankings
- > Six factors – economic production, social support, life expectancy, freedom, lack of corruption, and generosity
- > Six geographical regions

How does each feature affect happiness?

- > **Method Used: Linear Regression test for each feature with ladder score as the response variable and each feature as their own predictor variable.**
- > **Null Hypothesis: $H_0 : \beta_1 = 0$ GDP per Capita**
 - $\beta_2 = 0$ Social Support**
 - $\beta_3 = 0$ Healthy Life Expectancy**
 - $\beta_4 = 0$ Freedom to make life choices**
 - $\beta_5 = 0$ Generosity**
 - $\beta_6 = 0$ Perception of corruption**

Linear Regression Results

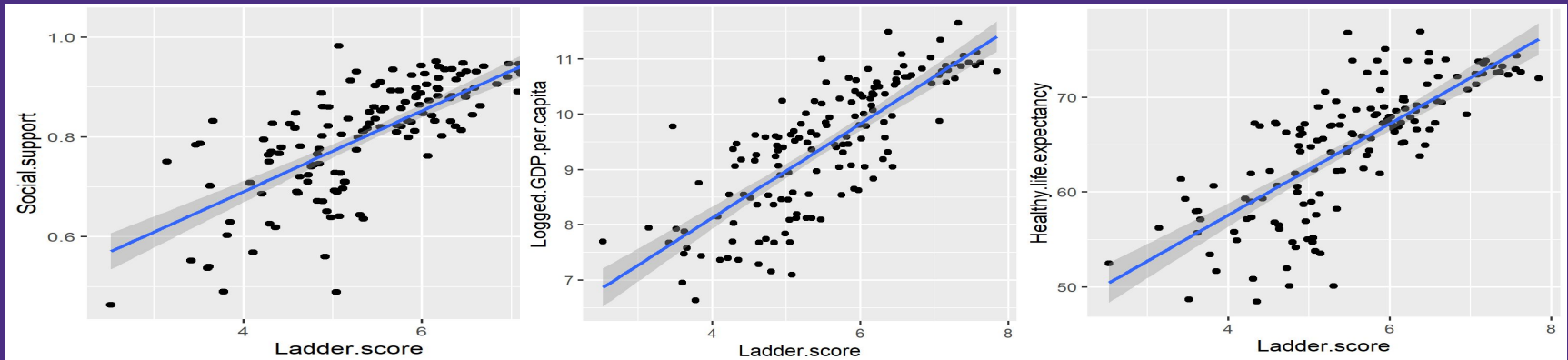
- > There is sufficient evidence to reject the null hypothesis for the following:

p-value: $< 2.2e-16$	$\beta_1 \neq 0$ GDP per Capita
p-value: $< 2.2e-16$	$\beta_2 \neq 0$ Social Support
p-value: $< 2.2e-16$	$\beta_3 \neq 0$ Healthy Life Expectancy
p-value: $< 2.2e-16$	$\beta_4 \neq 0$ Freedom to make life choices
p-value: $8.881e-08$	$\beta_6 \neq 0$ Perception of corruption

- > We fail to reject the null hypothesis for:

p-value: 0.8294	$\beta_5 = 0$ Generosity
-----------------	--------------------------

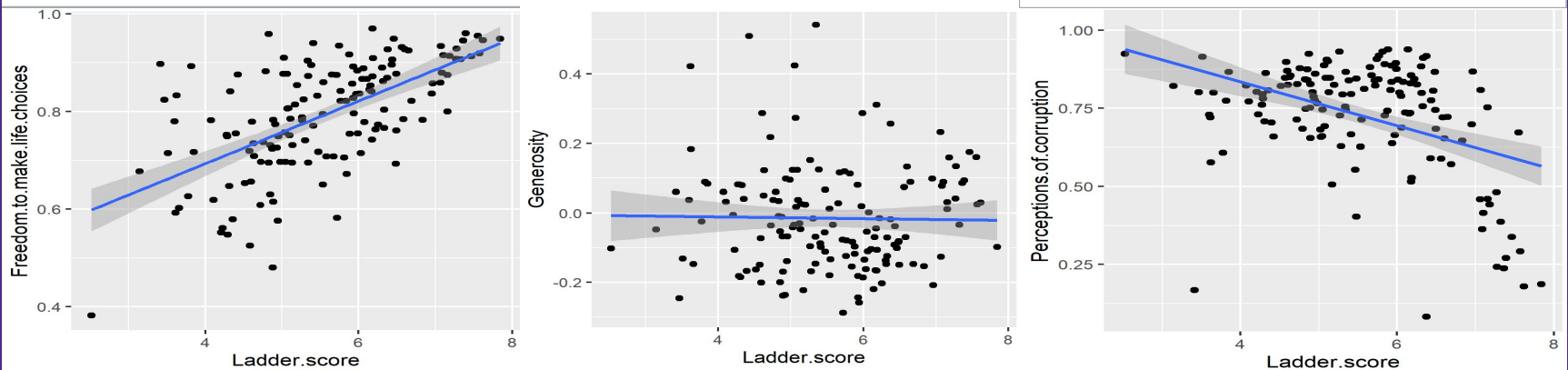
Graphical Results



$$\text{LadderScore} = -0.2315 + 7.075 * \text{SocialSupport}$$

$$\text{LadderScore} = -1.3719 + 0.732 * \text{GDPperCapita}$$

$$\text{LadderScore} = -2.395 + 0.121 * \text{HealthyLifeExpectancy}$$



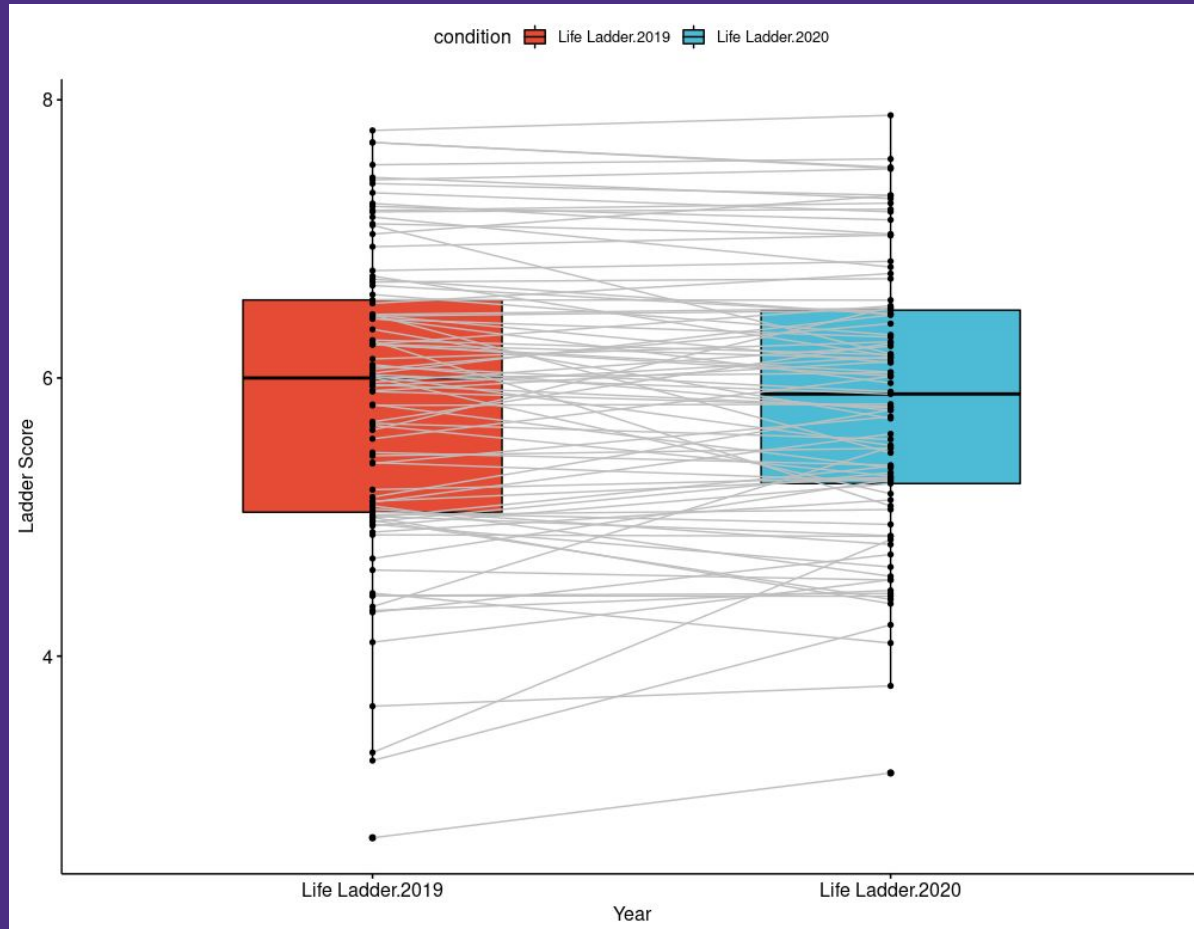
$$\text{LadderScore} = 0.974 + 5.759 * \text{FreedomLifeChoices}$$

$$\text{LadderScore} = 5.53 - 0.126 * \text{Generosity}$$

$$\text{LadderScore} = 7.368 - 2.523 * \text{PerceptionsOfCorruption}$$

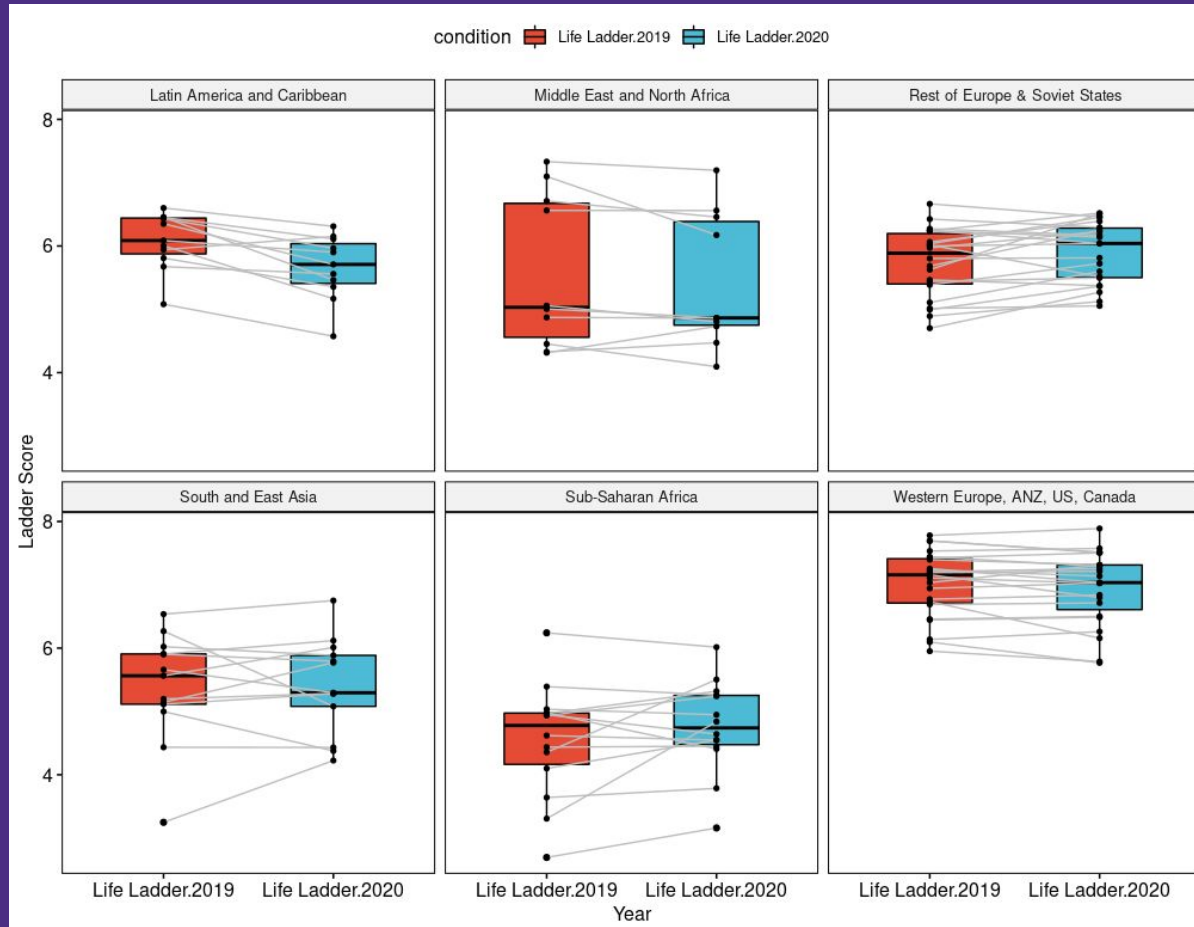
Impact of COVID-19 on happiness scores?

Data Viz. Change in Ladder Score from 2019 to 2020 - all countries



Impact of COVID-19 on happiness scores?

Data Viz. Change in Ladder Score from 2019 to 2020 - by region



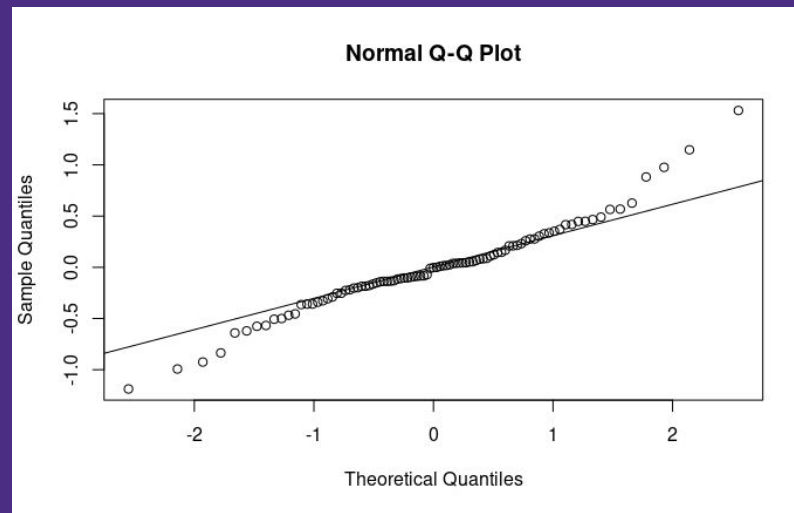
Impact of COVID-19 on happiness scores?

Hypothesis Testing

- > Paired t-test
- > Null Hypothesis
 - For all the countries, ladder scores are the same before and after the pandemic. $H_0 : \mu_{2019} = \mu_{2020}$ versus $H_1 : \mu_{2019} \neq \mu_{2020}$
 - For every region, ladder scores are the same before and after the pandemic. $H_0 : \mu_{2019} = \mu_{2020}$ versus $H_1 : \mu_{2019} \neq \mu_{2020}$

Impact of COVID-19 on happiness scores?

Validation of Assumptions for paired t-test



- > Normality assumption doesn't hold and outliers are present

Impact of COVID-19 on happiness scores?

Results

- > We find a statistically significant drop in happiness scores in 'Latin America and Caribbean' region

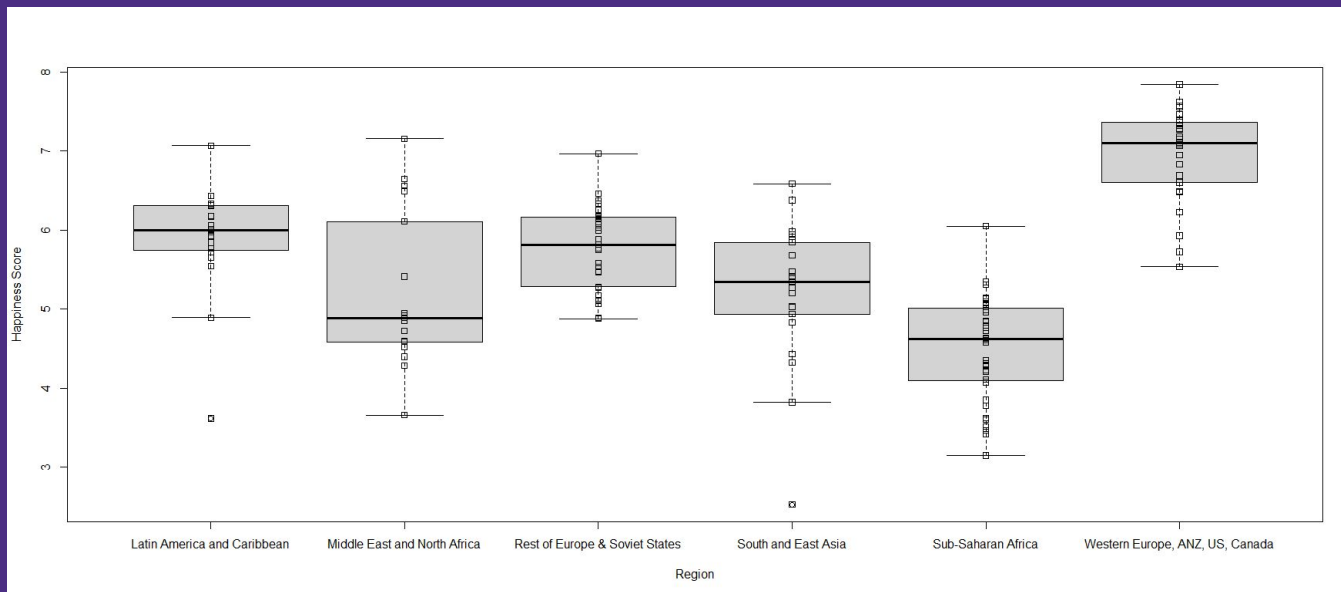
region	n	mean_2019	mean_2020	change	p_val_t_test	p_val_wilc
Rest of Europe & Soviet States	22	5.74	5.90	0.16	0.0303	0.0425
Latin America and Caribbean	11	6.08	5.66	-0.42	0.0020	0.0049
Western Europe, ANZ, US, Canada	23	7.02	6.95	-0.07	0.1222	0.1792
Middle East and North Africa	10	5.57	5.42	-0.15	0.2051	0.1934
South and East Asia	13	5.38	5.41	0.03	0.8802	0.6848
Sub-Saharan Africa	14	4.55	4.76	0.21	0.1783	0.2958
Overall	93	5.85	5.84	-0.01	0.8536	0.5926

Are all regions of the world equally happy?

- > Method Used: ANOVA test.
- > Null Hypothesis: $H_0: \mu_{R1} = \mu_{R2} = \mu_{R3} = \mu_{R4} = \mu_{R5} = \mu_{R6}$
 H_1 : The means are not all equal
- > Assumptions:
 - Independence
 - Equal variances
 - Large sample size or normal distribution

Are all regions of the world equally happy?

- > Using ANOVA, we'd reject the null hypothesis with a p-value $< 2e-16$
- > The regions do not have constant variance, but a comparison of the equal variance t-test and Welch t-test showed little impact for violating that assumption.



Q&A and Discussion
