

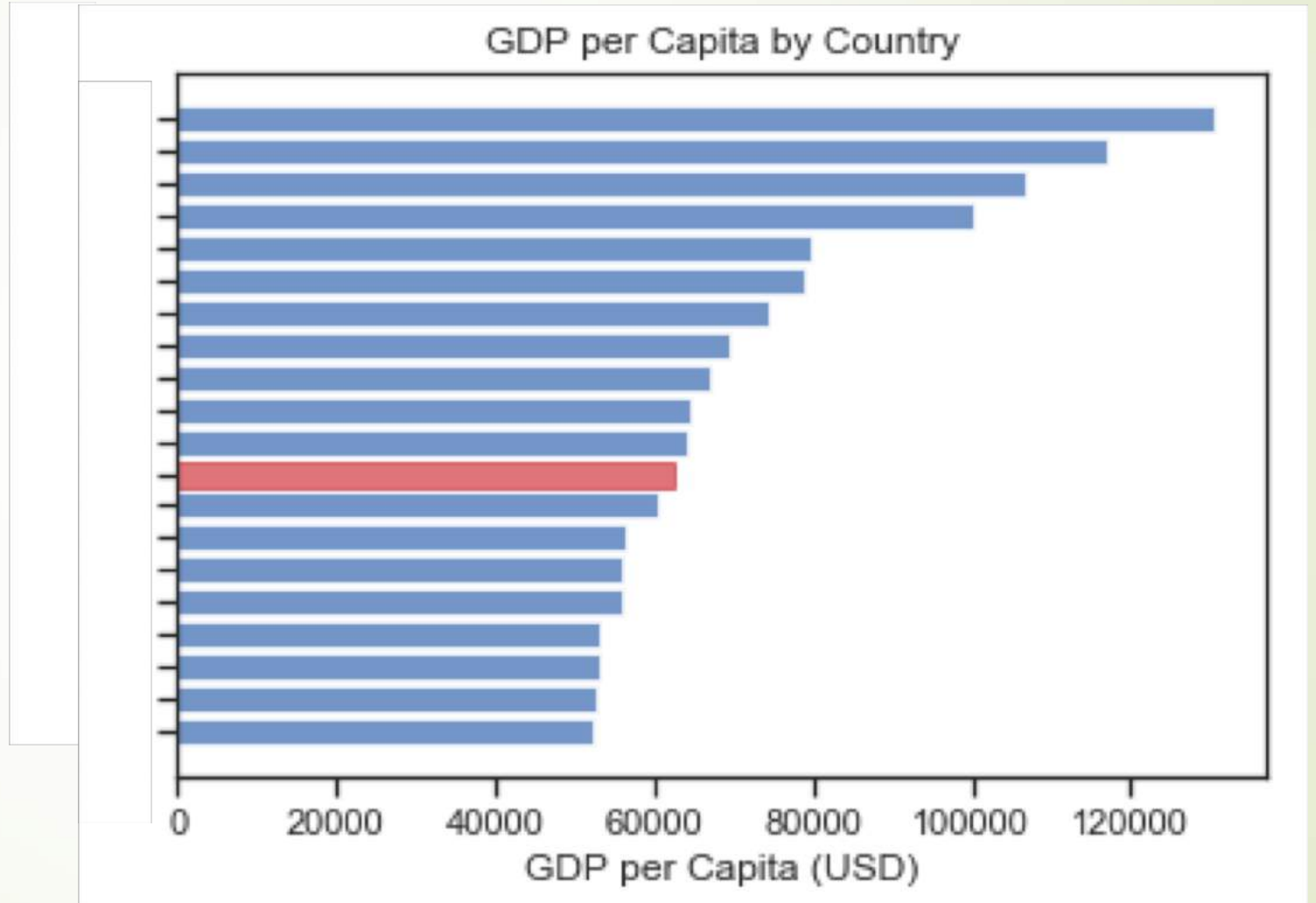
The background of the slide features a light green world map. On the left side, there are several thin, dark green curved lines. A solid orange arrow points to the right, positioned in the lower-left quadrant of the slide.

Modelling Real GDP per Capita

Data Exploration and Regression Analysis

GDP per Capita by Country/Territory

- 1. Qatar: \$ 130,475
- 2. Macau : \$ 116,808
- 3. Luxembourg : \$ 106,704
- 4. Singapore : \$ 100,345
- 5. Brunei : \$ 79,530
- 6. Ireland : \$ 78,785
- 7. Norway : \$ 74,356
- 8. U.A.E.: \$ 69,382
- 9. Kuwait : \$ 67,000
- 10. Switzerland : \$ 64,649
-
- 12. United States: \$ 62,606



What factors predict gross domestic product (GDP) per capita at a country-level?



- Many factors to consider:
 - Global Economics
 - Government Policy
 - Public Health
 - Education
 - Natural Resources

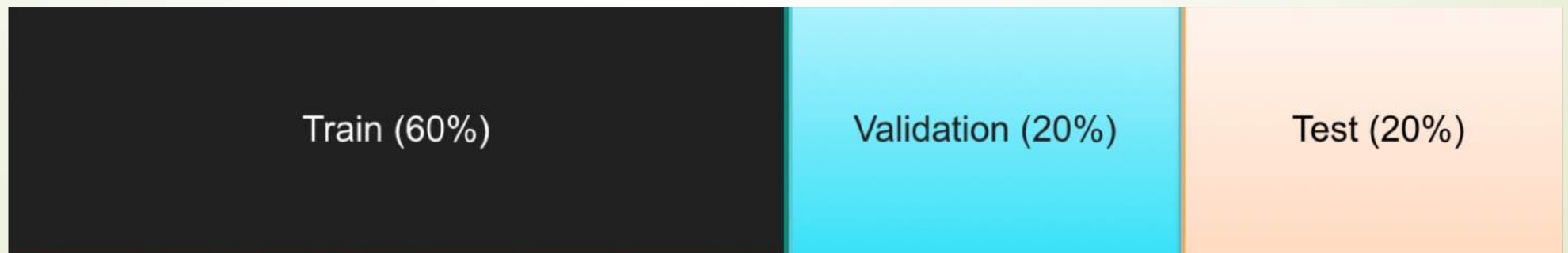
Filtering Out the Noise

- How do we make sense of all the data?
- Generalize our phenomenon with a linear regression model
- Select for features with meaningful relationships
 - Linear Regression
 - Lasso (Least Absolute Shrinkage and Selection Operator) Regression
 - Ridge Regression
- Tune our parameters with feature engineering to optimize our model



Optimizing Model Choices

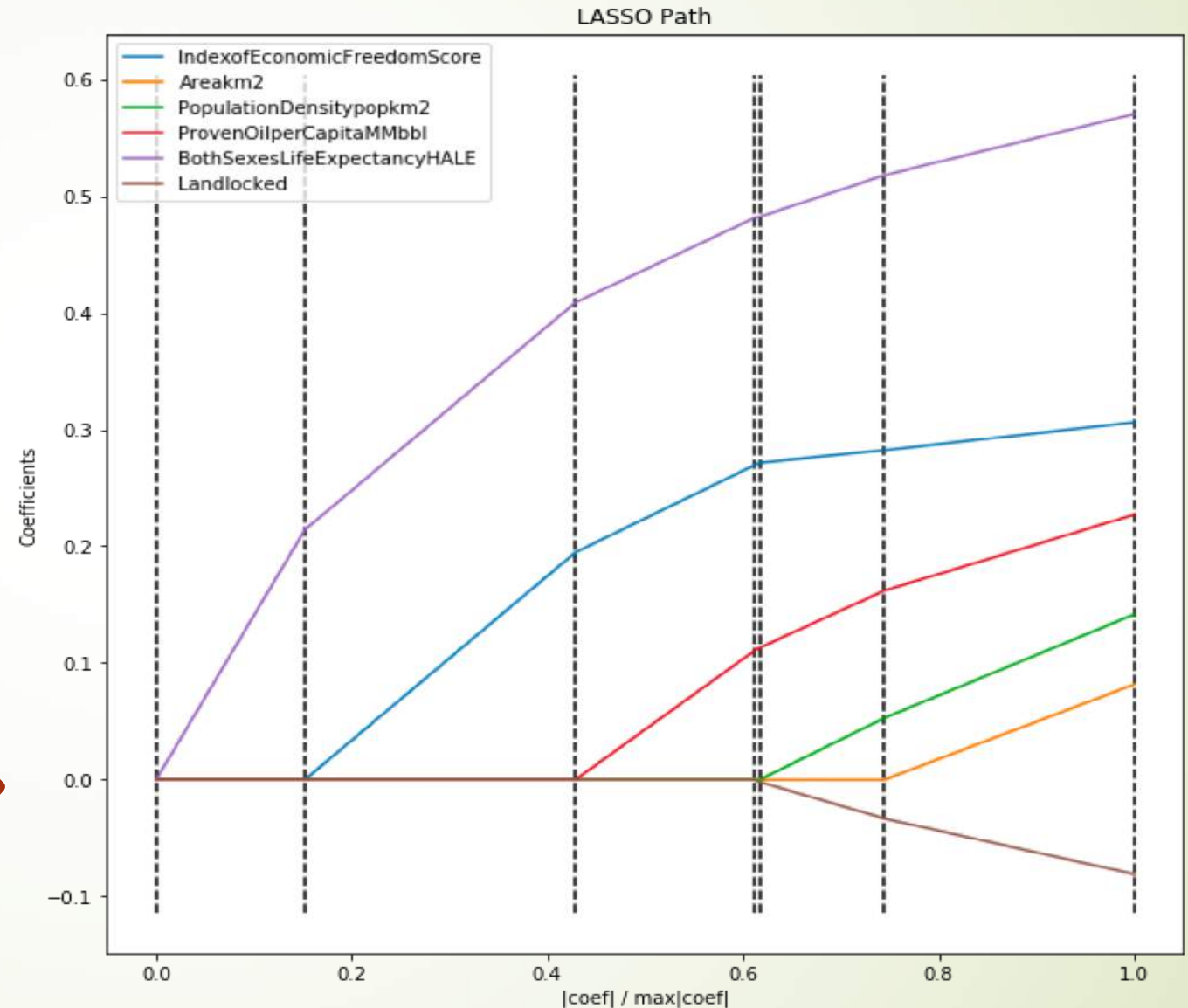
- ▶ Train, Validate & Test our model:
 - ▶ This framework gives us an empirical way to select features and avoid over/under-fitting
- ▶ Train:
 - ▶ Linear Regression, Lasso Regression, Ridge Regression
- ▶ Validate:
 - ▶ Score each regression based on how well each model generalizes validation set
- ▶ Test:
 - ▶ Retrain best candidate on train & validation set and score final model on test set



Lasso Regularization

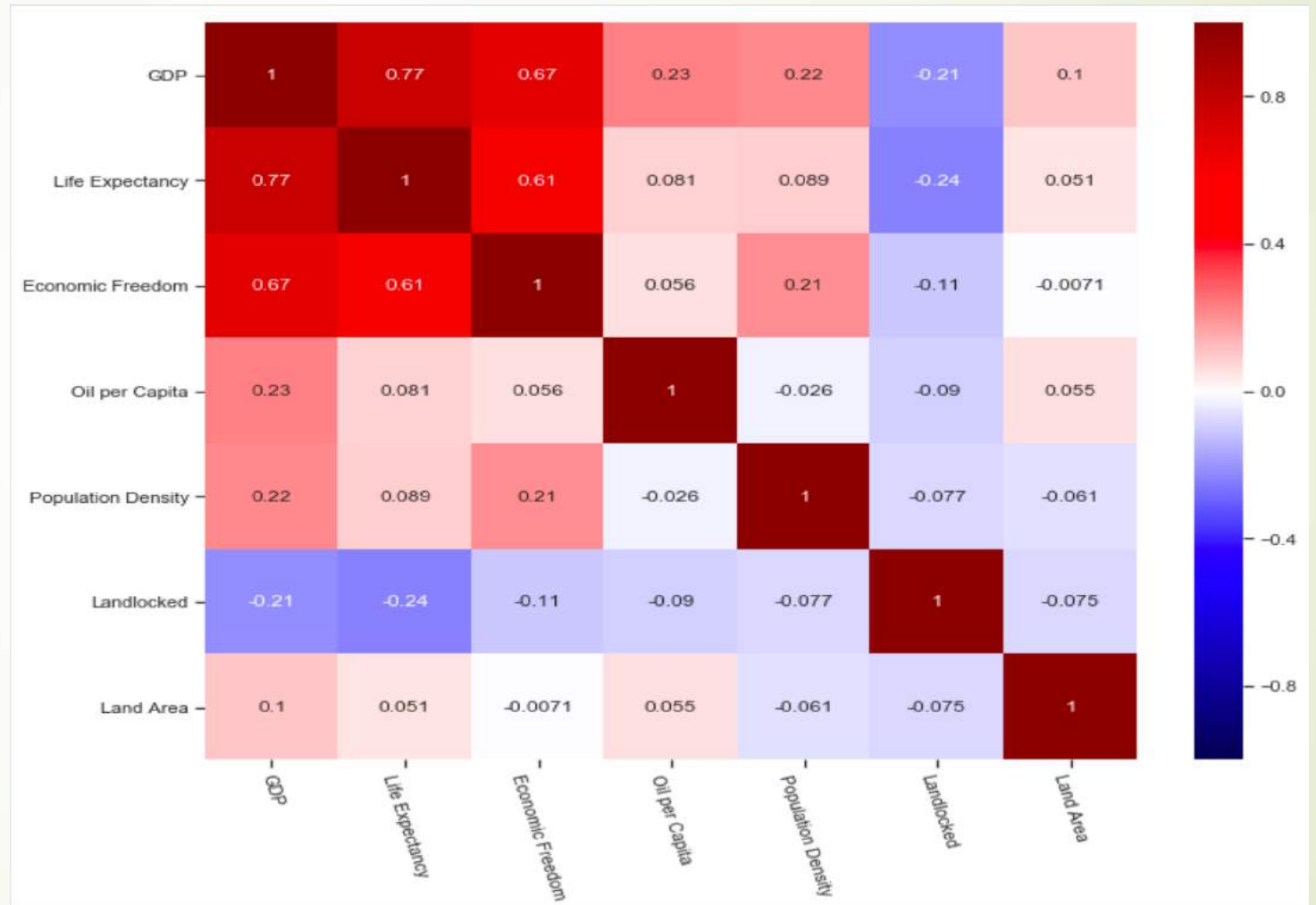
Linear
Equation:

$$\hat{y} = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \beta_3 x_3 + \beta_4 x_4 \dots$$



Correlation Heatmap

- Lasso Regression
- GDP Per Capita (\hat{y}):
 - Health Adjusted Life Expectancy (HALE)
 - > Economic Freedom
 - > Oil Reserves per Capita
 - > Population Density
 - > Coastline Nations
 - > Land Area



Key Takeaways

- ▶ Lasso Regression: $r^2 = 0.68$
 - ▶ Statistical measure of how close the data are to the fitted regression line
- ▶ Health adjusted life expectancy (HALE)
- ▶ Economic Freedom
 - ▶ Oil reserves per capita
 - ▶ > Population Density
 - ▶ > Coastline Nations
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