

## **Outline**

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## **Overview/Business Problem**

I am acting as a data scientist with an environmental conservation organization in Brazil to determine if Amazon deforestation is increasing. I want to determine what factors influence the deforestation of the Amazon and on what scale their influence lies. I plan to conclude whether forest fires are correlated with deforestation, and what patterns and information lie within the occurrences of forest fires across a variety of Brazilian states that may impact deforestation.

### **Data**

### 3 Kaggle Datasets:

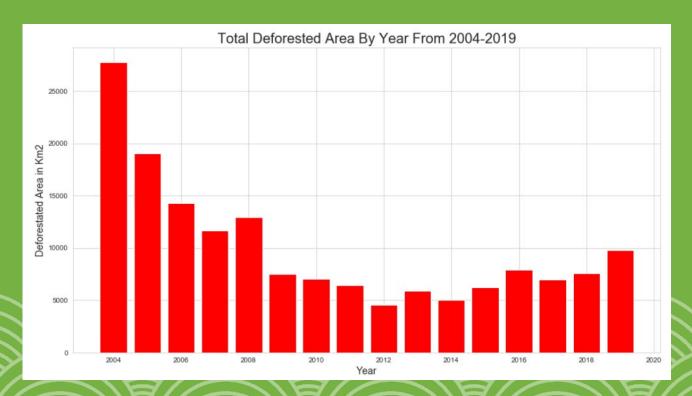
- Deforestation data: The Brazilian Amazon Rainforest Monitoring Program by Satellite (16 rows, 11 columns)
- Fires data: The Fires Database at The National Institute for Space Research (2104 rows, 6 columns)
- Weather data: Golden Gate Weather Services (16 rows, 5 columns)

#### 2 Websites:

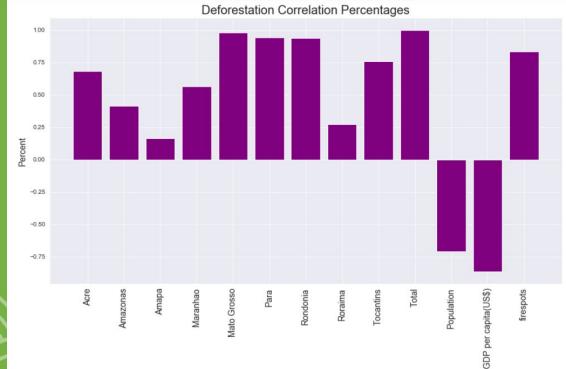
- Population statistics from https://www.macrotrends.net/countries/BRA/brazil/population.
- Brazil GDP statistics from The World Bank Group at https://data.worldbank.org/indicator/NY.GDP.PCAP.CD?end=2019&locations= BR&start=1960&view=chart.

# **Data Preparation**

- Plots of Total Deforested Area Across Brazilian
  States between 2004-2019 and Correlation Plot
- Deforestation decreased 2004-2012 and then increased



- Weather patterns left out of analysis
- Correlation analysis:
  Mato Grosso- 98% Firespots- 83%
  Para- 94% Population- -71%
  Rondonia- 93% GDP(\$) per capita- -86%



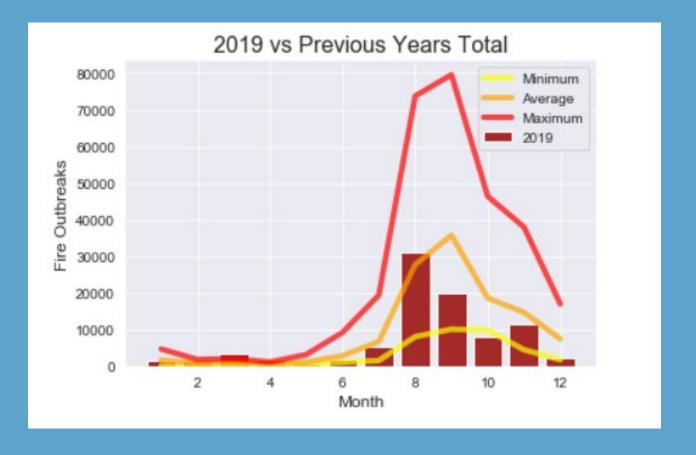
# **Data Modeling- Part 1**

### Model 1:

- Linear Regression model
- Population, GDP per capita(\$), and Firespots all negative coefficients
- R2 Train 0.86
  R2 Test 0.44

### Model 2:

 Built out Function for Firespots for a Given Year Compared With Average, Minimum, and Maximum Firespots for Previous Years  Year 2019 had higher than maximum fire outbreaks for months of March and April than previous years

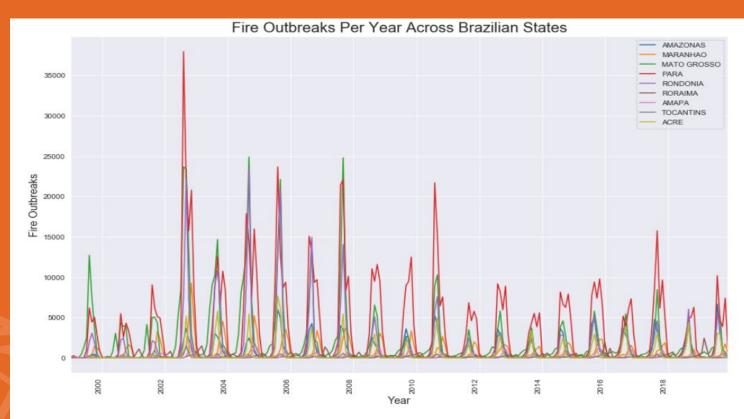


## **Data Modeling- Continued**

State	Amazonas	Maranhao	Mato Grosso	Para	Rondonia	Roraima	Amapa	Tocantins	Acre
<b>Pred Fires</b>	11698	5864	14146	38988	16934	2070	1693	735	7185
<b>Actual Fires</b>	12665	3989	17479	29700	11206	4775	1272	247	6802
R2 Score	0.75	0.40	0.78	0.61	0.55	0.02	0.87	-4.91	0.72

### Model 3:

- Arima models for each Brazilian state to predict firespots by month and year in 2019
- Mato Grosso, Para, and Rondonia lead seasonality trends from June to November
- Amazonas and Roraima had an unprecedented high number of firespots for 2019



## **Conclusions**

- Deforestation has not necessarily decreased.
  Acknowledge high deforestation totals and strong seasonality trends of firespots particularly within the Brazilian states of Mato Grosso, Para, and Rondonia.
- Recognize possible implications of an unprecedented high number of firespots for the months of March and April in 2019 and the states of Amazonas and Roraima in 2019.
- Employ efforts to enforce stronger fire restrictions during strong firespot season to reduce deforestation.

# **Recommendations for Further Analysis**

- Integrate more features in future modeling such as annual soybean yields, annual timber production amounts, and number of cattle ranches in Brazil per year.
- Incorporate and analyze satellite image classification that show different activities related to whether or not deforestation is occurring at given times.



### **Contact Information**

### **Email:**

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### **Github link:**

https://github.com/jmstipanowich/AmazonDeforestation

### **Picture Source:**

https://www.stockholmresilience.org/research/research-news/2020-04-02-amazon-deforestation-leads-to-increasingly-severe-dry-seasons.html

THANK YOU!!!!!!!!