CMPT732 Final Project

Analysis and Prediction of US Traffic Accidents

Background

How Many Car Accident Deaths Are There Per Year in US?

1.35 million people are killed Additional 20-50 million are injured or disabled

Economic impact of traffic accidents in US?
 About \$1 trillion loss per year



Source:

https://www.latimes.com/business/autos/la-fi-hy-economic-impact-of-traffic-accidents-2 0140529-story.html

https://www.thewanderingrv.com/car-accident-statistics/

Data

US-Accidents: A Countrywide Traffic Accident Dataset

acquired from Kaggle: https://www.kaggle.com/sobhanmoosavi/us-accidents

- Severity
- Location
- Time
- Weather
- Points of interest

Population and Housing Unit Estimates

obtained from United States Census Bureau: https://www.census.gov/programs-surveys/popest.html

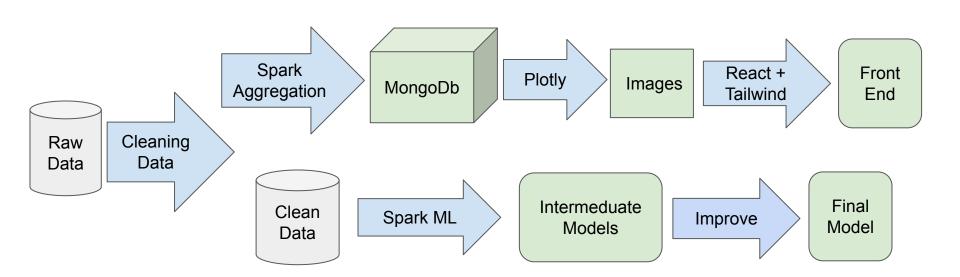
Population

2020 United States Presidential Election Results

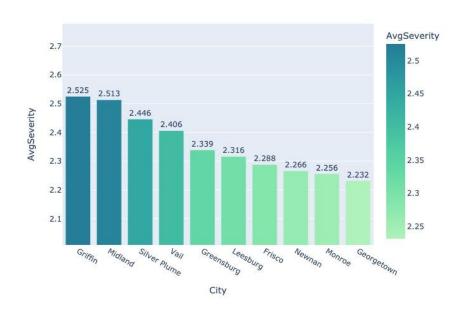
generated from Wikipedia: https://en.wikipedia.org/wiki/2020_United_States_presidential_election#Maps

Candidate's percentage

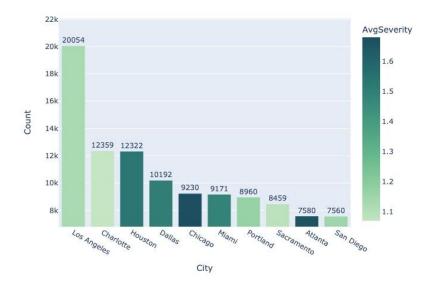
Methodology



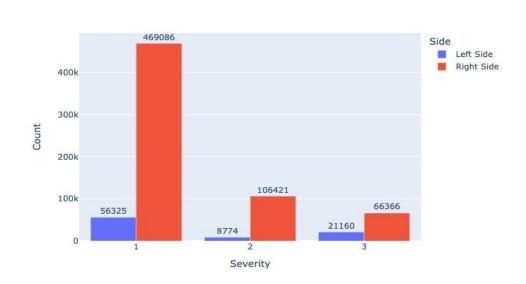
Cities with most severe accidents

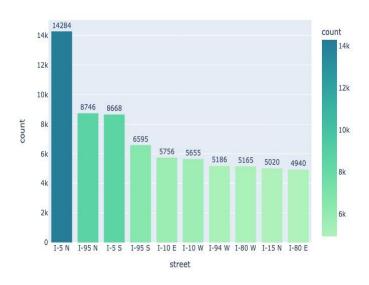


Cities with most number of accidents

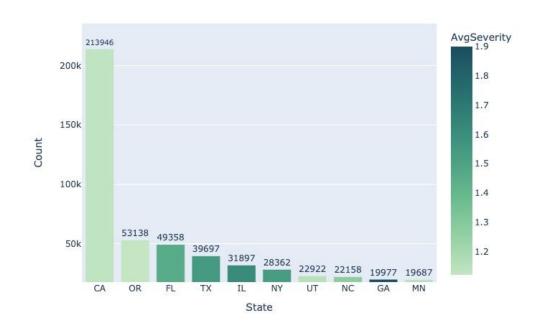


Road vs Accidents

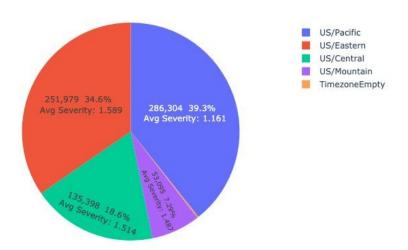




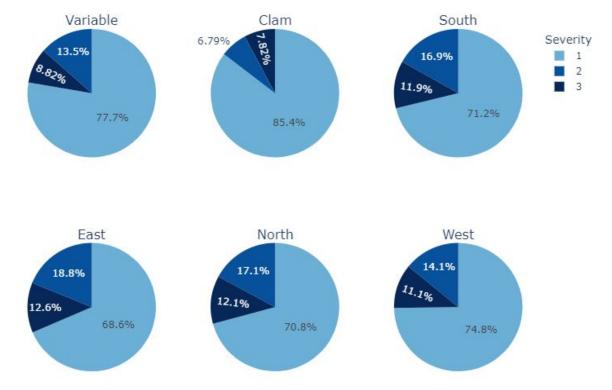
Number of Accidents by States



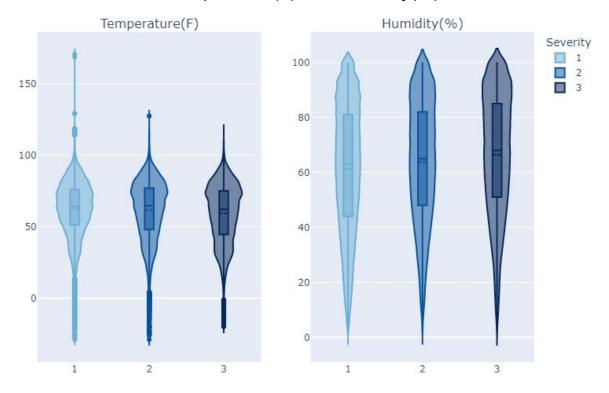
Accidents Timezone Distribution



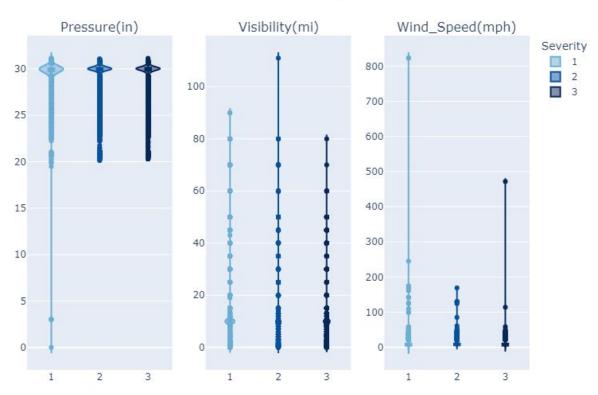
Proportions of Accident Severities in Various Wind Directions



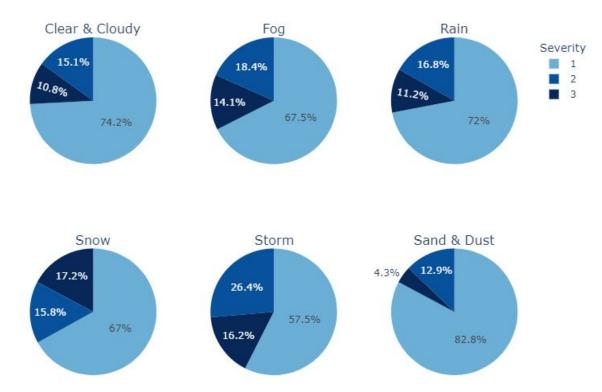
Density of Accident Severities in Temperature(F) and Humidity(%)



Density of Accident Severities in Pressure(in), Visibility(mi), and Wind Speed(mph)

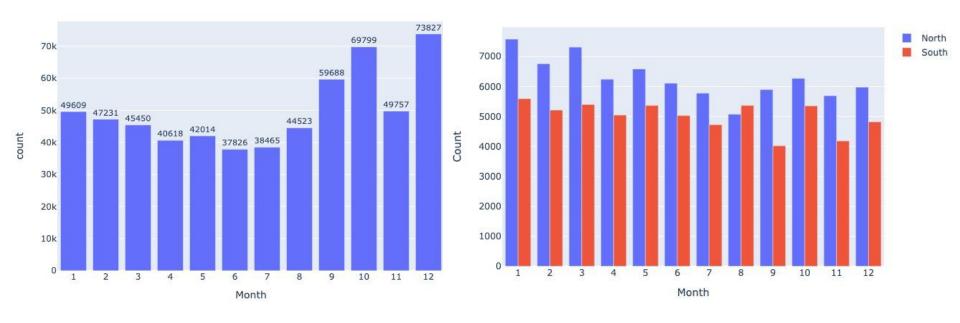


Proportions of Accident Severity in Various Weather Conditions



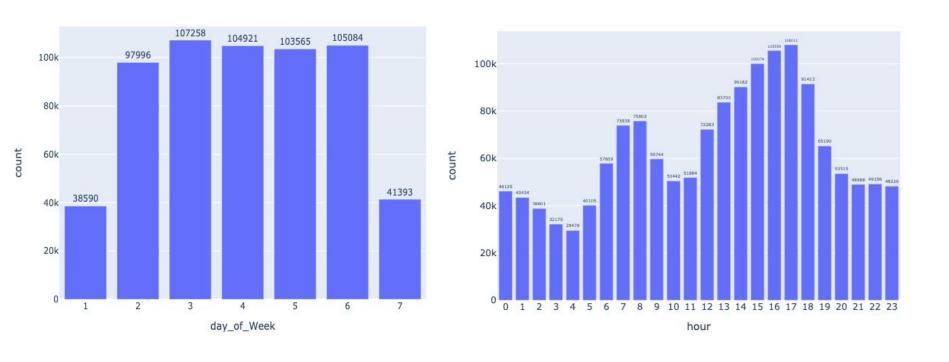
Car Accident Time Analysis

The left graph shows the monthly statistics of traffic accidents, and the right graph shows the monthly statistics of traffic accidents in the north and south (latitude >40 and <35).



Car Accident Time Analysis

Traffic accident counts by day of week(left) and hourly traffic accident counts(right)



Car Accident Time Analysis

The left table shows that which days has the most accidents in the cities with the most traffic accidents. And the right trale shows that Weather conditions on the day with the highest number of traffic accidents in LA.

date	city	count
2019-12-23	Los Angeles	138
2019-11-08	Los Angeles	124
2019-12-06	Los Angeles	115
2019-12-04	Los Angeles	114
2019-09-13	Los Angeles	107
2019-12-19	Los Angeles	106
2019-10-08	Los Angeles	101
2019-11-01	Los Angeles	100
2019-10-04	Los Angeles	100
2019-09-03	Los Angeles	99
2019-12-23	San Diego	98
2019-10-25	Los Angeles	94

Weather_Conditio	count	City	Date
Light Rain	51	Los Angeles	2019/12/23
Cloudy	31	Los Angeles	2019/12/23
Heavy Rain	21	Los Angeles	2019/12/23
Rain	15	Los Angeles	2019/12/23
Mostly Cloudy	8	Los Angeles	2019/12/23
Partly Cloudy	6	Los Angeles	2019/12/23
Fair	4	Los Angeles	2019/12/23
Light Rain / Windy	2	Los Angeles	2019/12/23

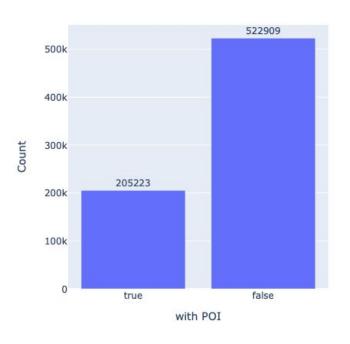
RED vs. BLUE

Rea StatesVS. Blue States: We find out five states (CA, NY, IL, MA, NJ) that Biden won in the 2020 election, and five states (OH, TX, TN, IN, MO) that Trump won. We can see that the number of accidents per capita in blue states is more than twice that of red states.

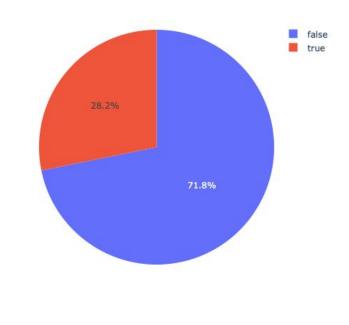
State	population	count	avg_accident
Red States	60383802	61729	0.001022
Blue States	87412298	239559	0.002741

POI Analysis

The Number of Accidents w/o POI

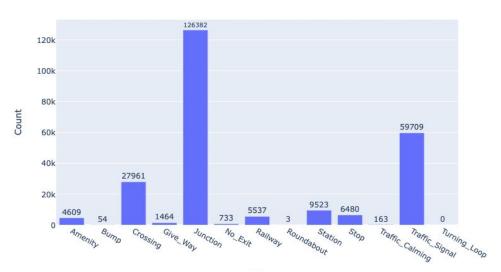


The Percentages of POI

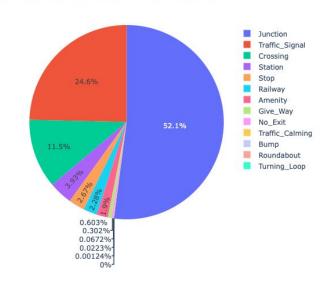


POI Analysis

The Number of Accidents with Different POI



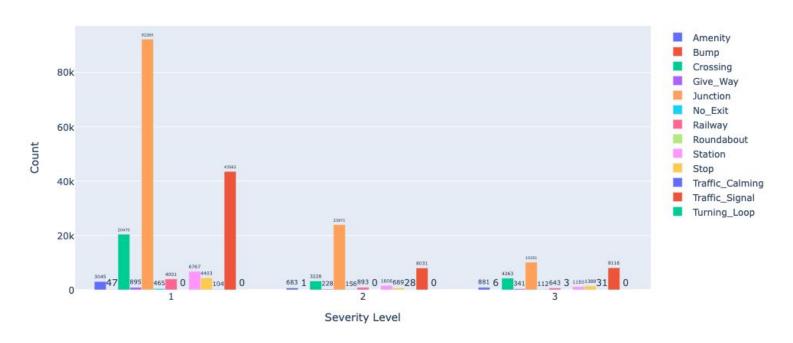
The Percentages of Accidents with Different POI



POI

POI Analysis

The Bar Chart of Severity Level with POI

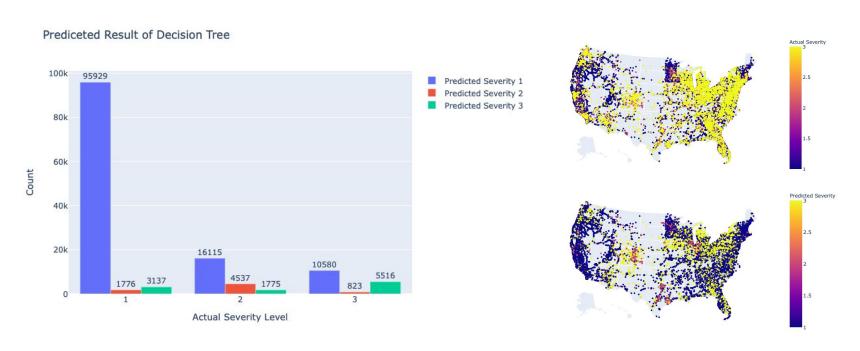


Classification and Prediction with Machine Learning

- Feature Selection
- Model: Decision Tree
- Training
- Evaluation
- Hyperparameter Tuning

Prediction Results

Traning accuracy: 78.04% Validation accuracy: 75.79%



Undersampling

Traning accuracy: 66.16% Validation accuracy: 61.64%

Prediceted Result of Decision Tree with Undersampling 12941 Predicted Severity 1 Predicted Severity 2 12k 11554 Predicted Severity 3 10k 8k Count 6k 4625 4247 4k 3296 2782 2606 2k Actual Severity Level

Undersampling and Oversampling

Traning accuracy: 67.30% Validation accuracy: 64.97%

Prediceted Result of Decision Tree with Oversampling and Undersampling Predicted Severity 26474 25k 24001 23661 Predicted Severity 3 20k 15k 10335 10k 9640 9127 8145 6955 4914 5k Actual Severity Level