

PREDICTION OF HIT-AND-RUN ACCIDENTS IN NASHVILLE, TN

Zimu Su, Metis DSML bootcamp classification project



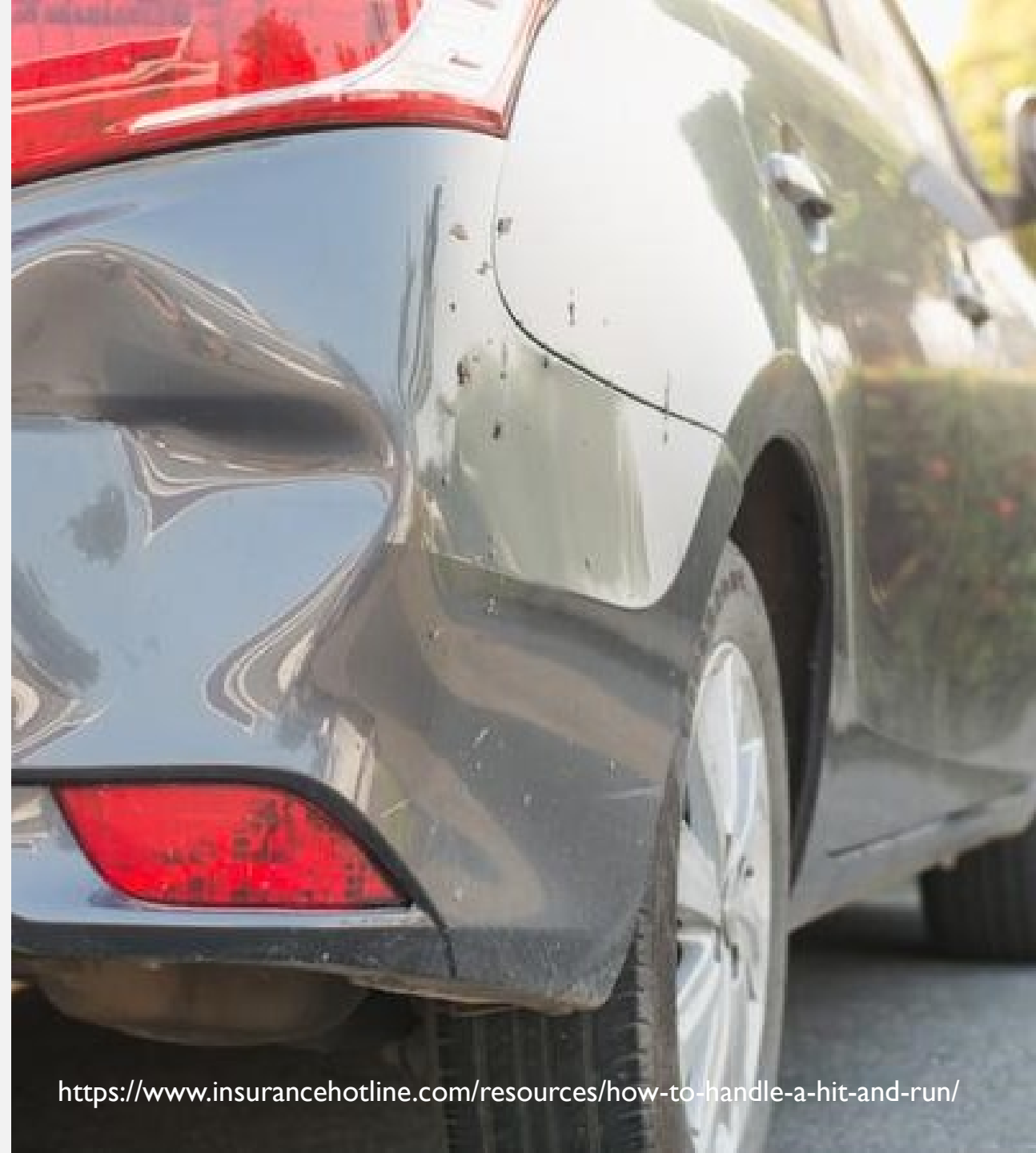


Hit-and-run accidents

- occur if someone who causes the accident leaves the scene without providing personnel information.
- cause severe injuries and properties damage without any penalty or blame.
- are considered as supplemental crimes.

The project aims at...

- identifying the significant factors to hit-and-run accidents in Nashville area.
- predicting probability of hit-and-run accident based on accident feature (collision type, location, etc.)
- Providing suggestion for Nashville Metro Police to decrease rate of hit-and-run accidents.



Nashville Downtown (photo by myself)



Data.Nashville.gov

Data Source:

- Nashville Open Data Portal:

<https://data.nashville.gov/Police/Traffic-Accidents/6v6w-hpcw>

Data range:

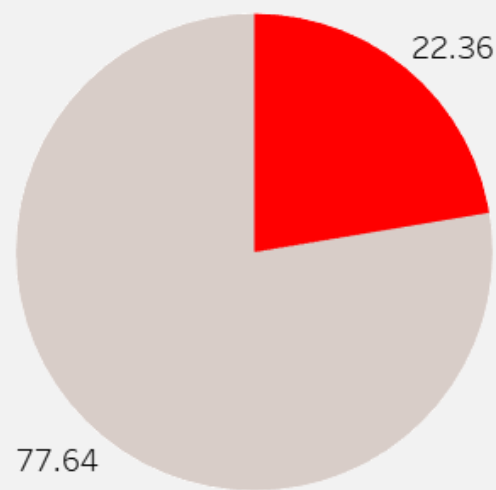
- 01/01/2015 – 04/10/2022
- 213424 accidents information in total

Main Features:

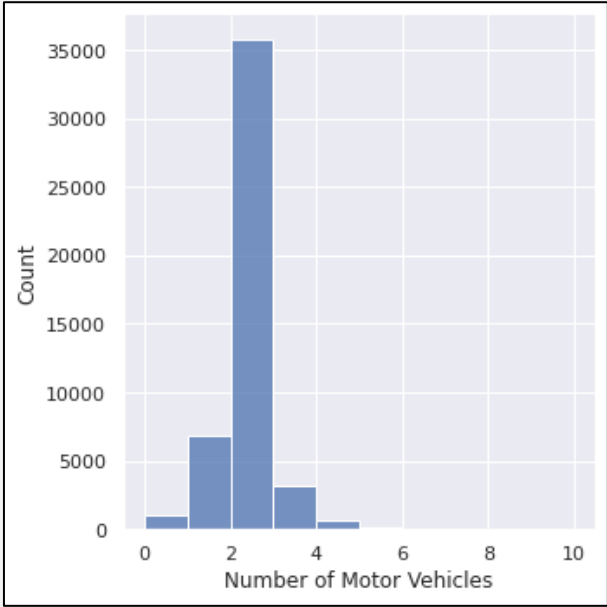
- Date and Time, Number of Motor Vehicles, Number of Injuries, Number of Fatalities,
- Property Damage, Hit and Run, Collision Type, Harm type
- Weather, Illumination.
- Street Address, ZIP, Latitude, Longitude

HIT-AND-RUN ACCIDENTS STATISTICS:

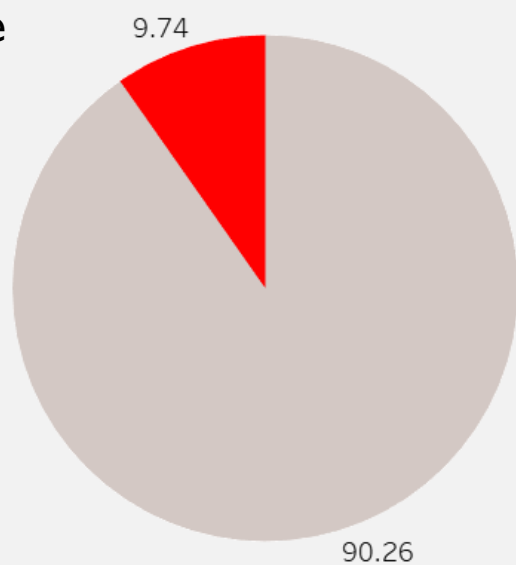
Ratio of hit-and-run accidents:



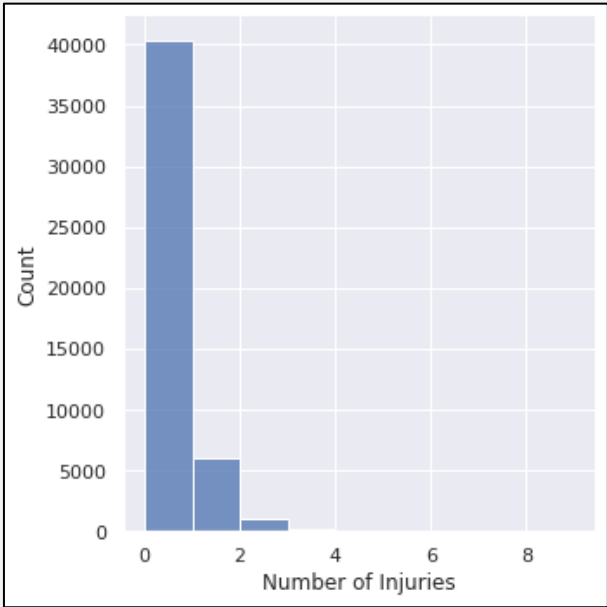
Mostly 2 vehicles involved in hit-and-run accidents:



Ratio of property damage in hit-and-run accidents:



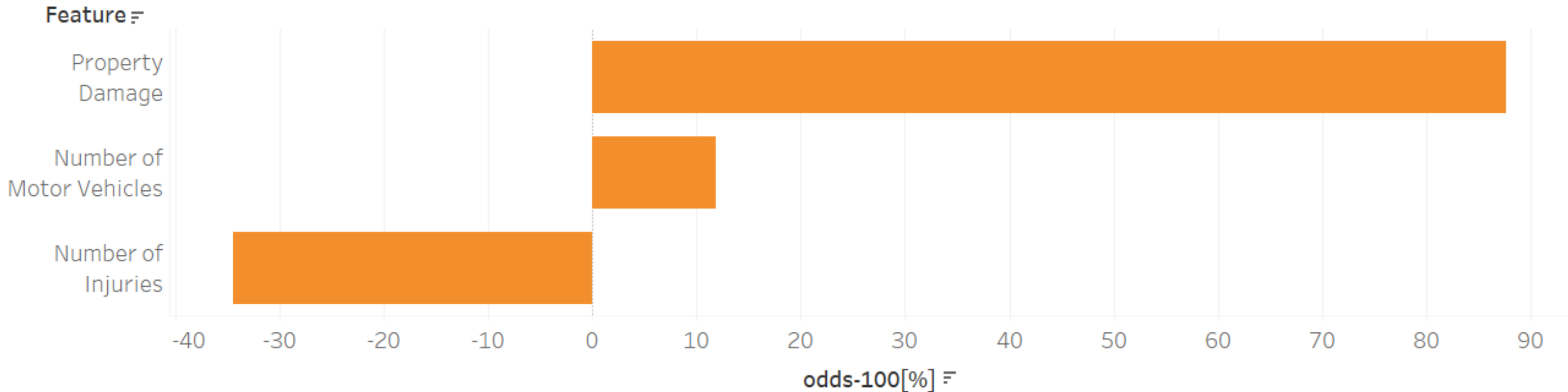
~1/8 hit-and-run accidents have injuries:



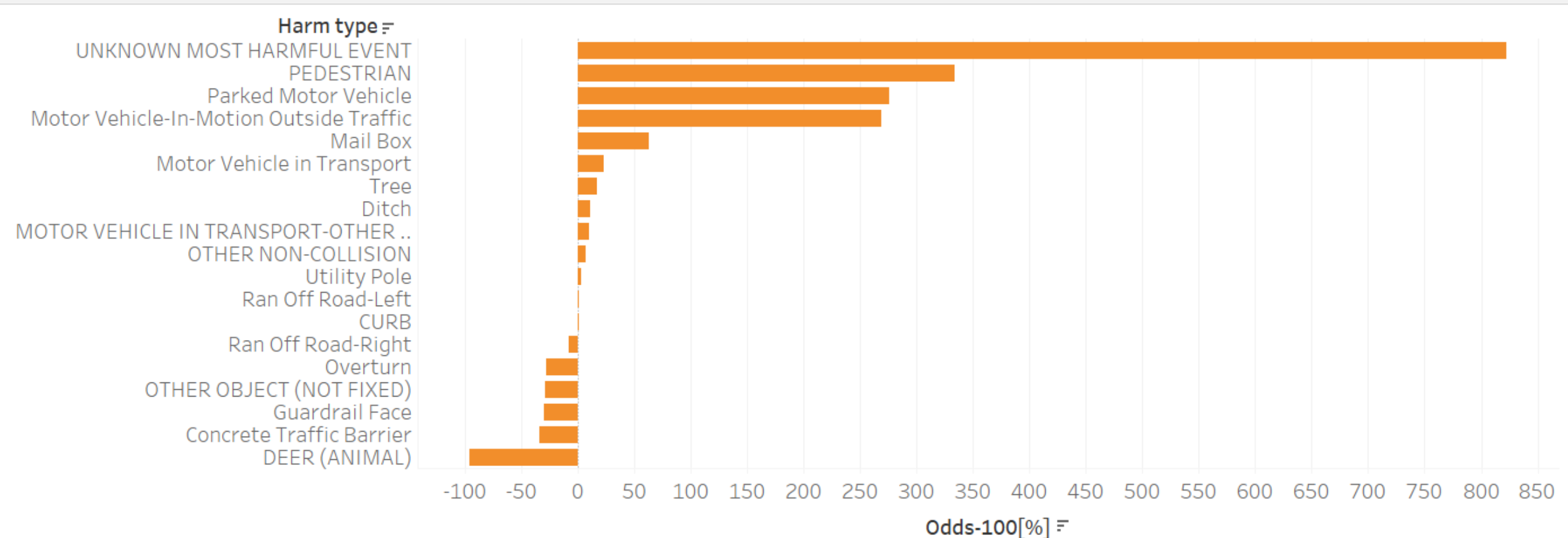
ALGORITHM AND TEST SCORES

- **Feature selection:**
 - Number of Motor Vehicles, Number of Injuries;
 - Property Damage, Collision Type, Harm type;
 - Weather, Illumination condition.
- **Feature engineering:**
 - One hot encoder for the features of collision type, weather, illumination, harm type.
 - Standardize the continuous features: Number of Motor Vehicles, Number of Injuries.
 - 83 feature in total.
- **Logistic regression algorithm with regularization ($C=0.1$) and balanced weight.**
 - Optimal f1 scores: 0.456 at prob decision of threshold ≥ 0.503 , ROC AUC score: 0.73. Accuracy: 0.71.
- **Random forest algorithm.**
 - Optimal f1 scores: 0.456 at prob decision of threshold ≥ 0.249 , ROC AUC score: 0.73. Accuracy: 0.71.

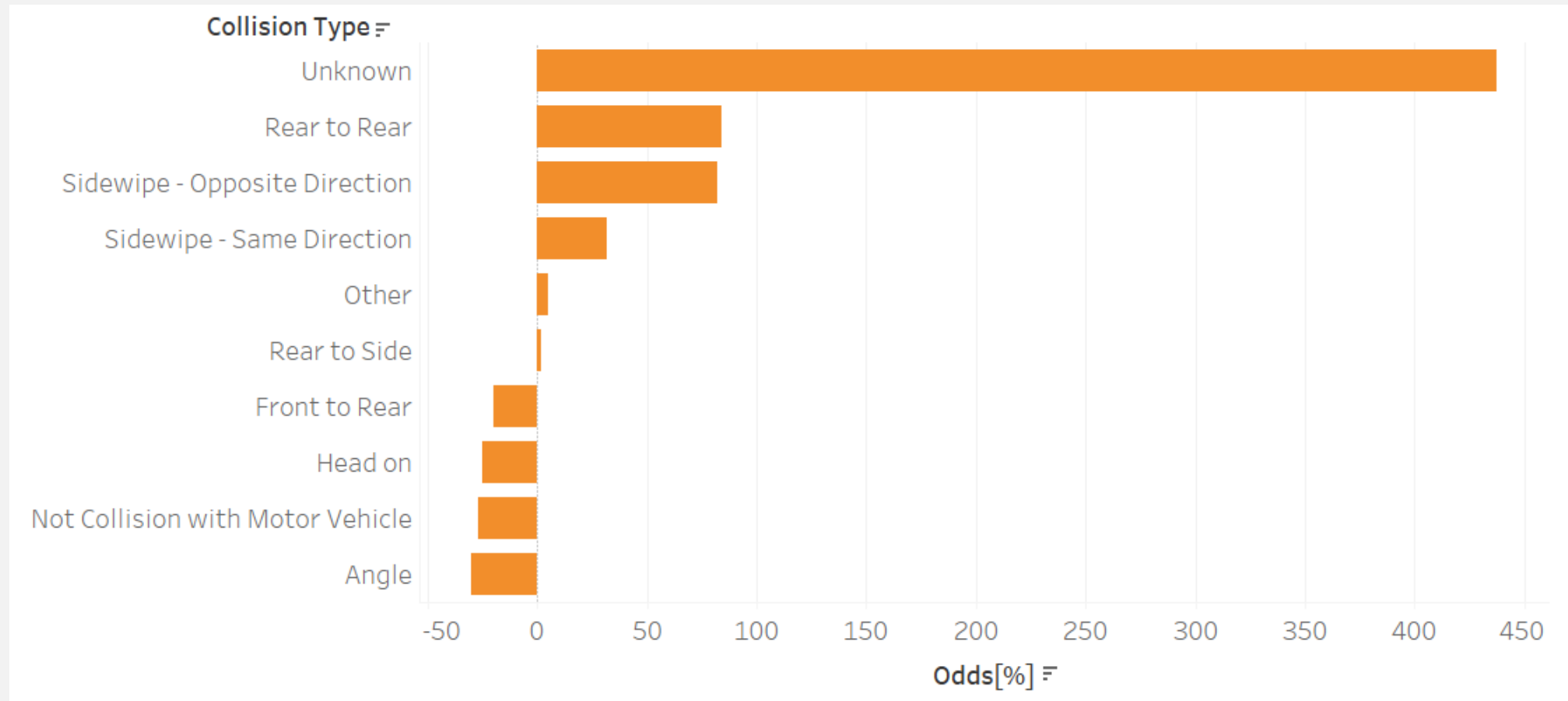
- Hit-and-run accidents are more likely to
 - be caused with property damage (~1.9 odds)
 - involve more vehicles (~1.1 odds)



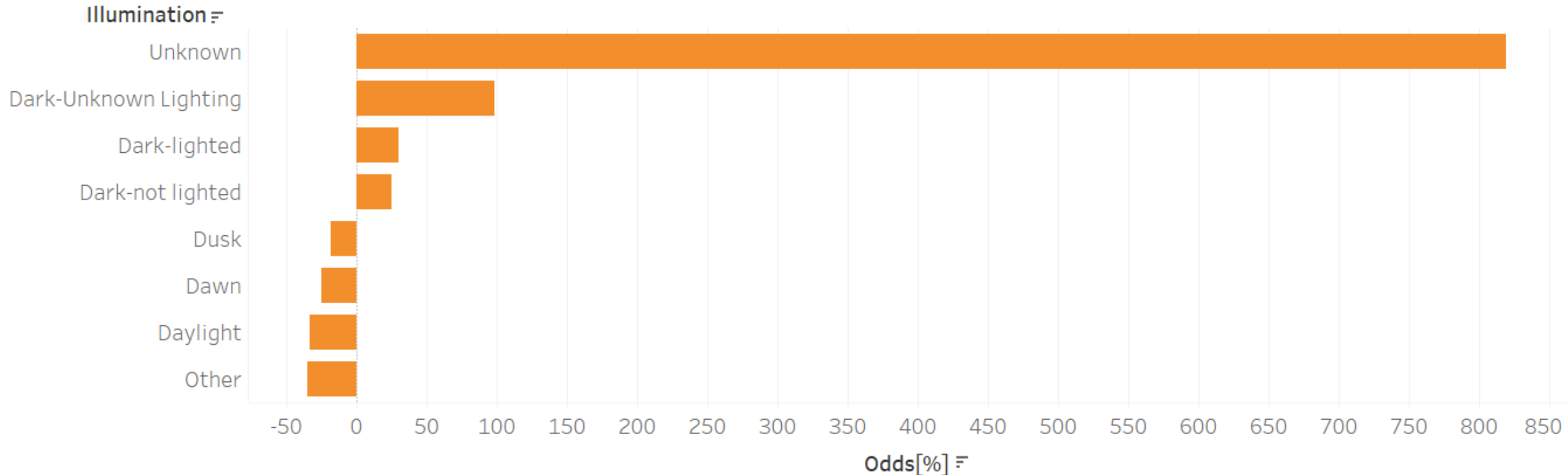
- Hit-and-run accidents are more likely that
 - have unknown type of harm (~9 odds)
 - Pedestrian are hit (~4.5 odds)
 - occur for parked motor vehicles (~3.5 odds)
 - auto in outside traffic (~3.5 odds)



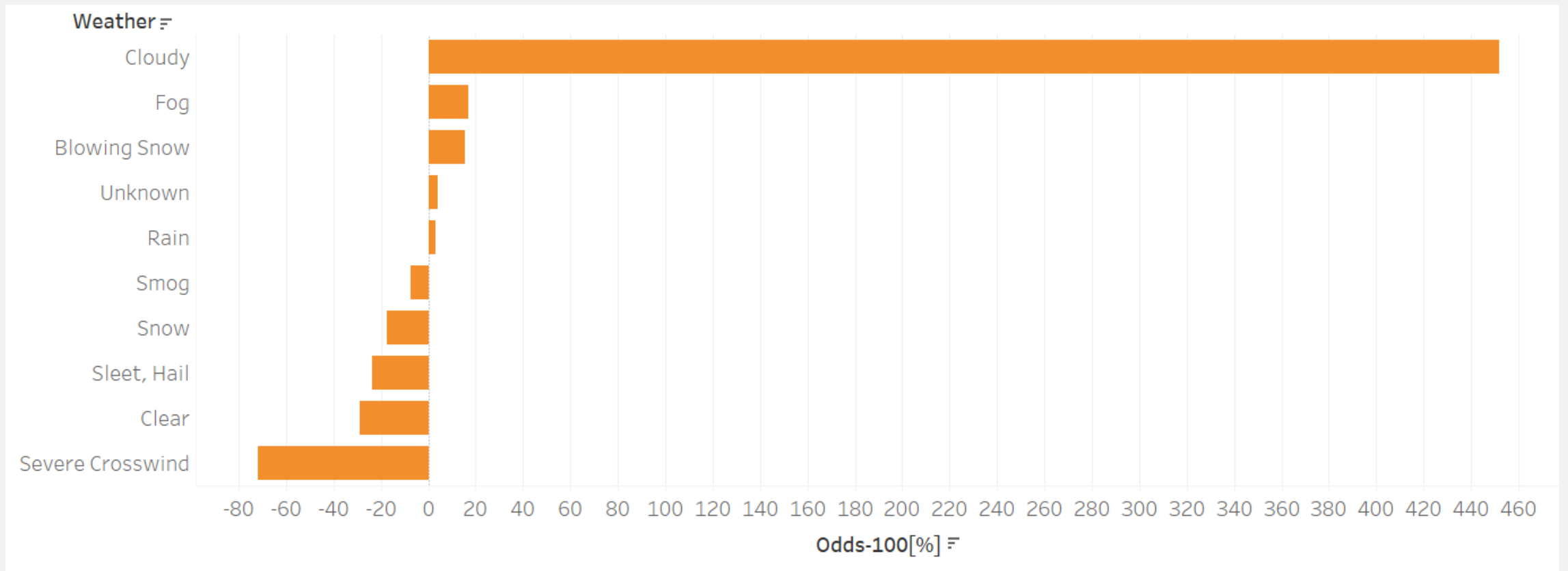
- The collision type of hit-and-run accidents are mostly unknown(5.5 odds), rear to rear (~2 odds), opposite sidewipe(~2 odds).
- The unknown type might be responsible for pedestrian or collision with parked motor.



- Besides unknown illumination, dark illumination is more likely to lead to hit-and-run accidents.

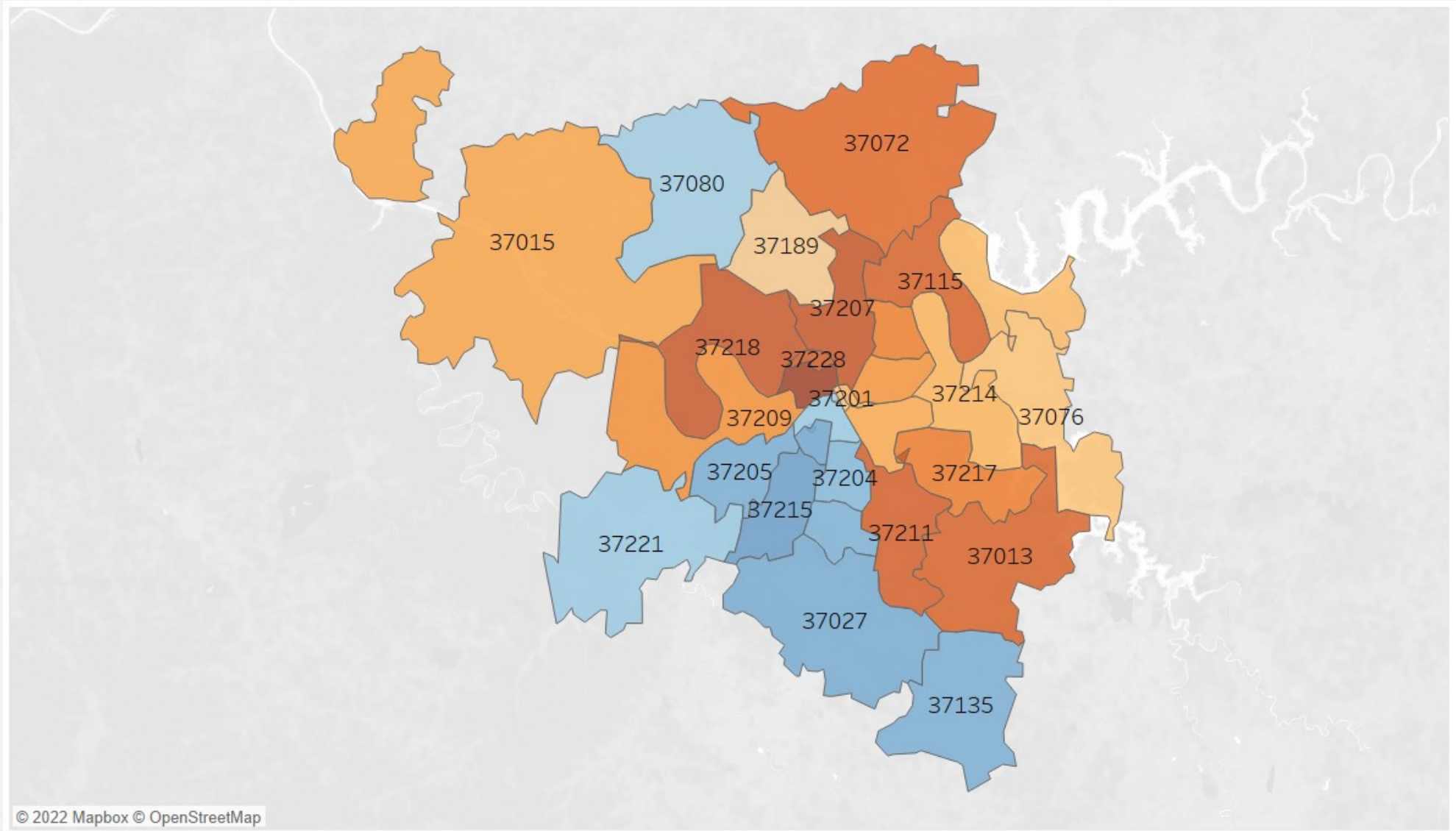


- Cloudy, fog, blowing snow are more likely to cause hit-and-run accidents.





Odds of hit-and-run accidents



- Next step:
 - Check exact the meaning of each feature (such as unknown illumination condition);
 - Do more feature engineering to improve f1 score.
 - Check exact location of hit-and-run accidents (crime rate, road condition, etc.) and related to illumination condition (light or not at night)

Thank you!