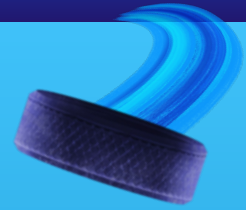




# Predicting NHL Head Injuries

By: Marissa Bush

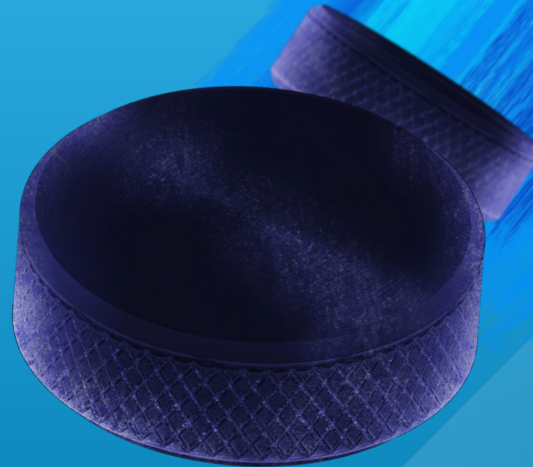
# Outline



- Business Problem
- Data
- Methods
- Findings
- Conclusion
- Future Work

# Business Problem

- This project aims to use data analysis to predict which NHL players may be at a higher risk of sustaining head injuries.
- Reasons this is a concern:
  1. **Player Safety**
  2. **Performance Optimization**
  3. **Financial Implications**

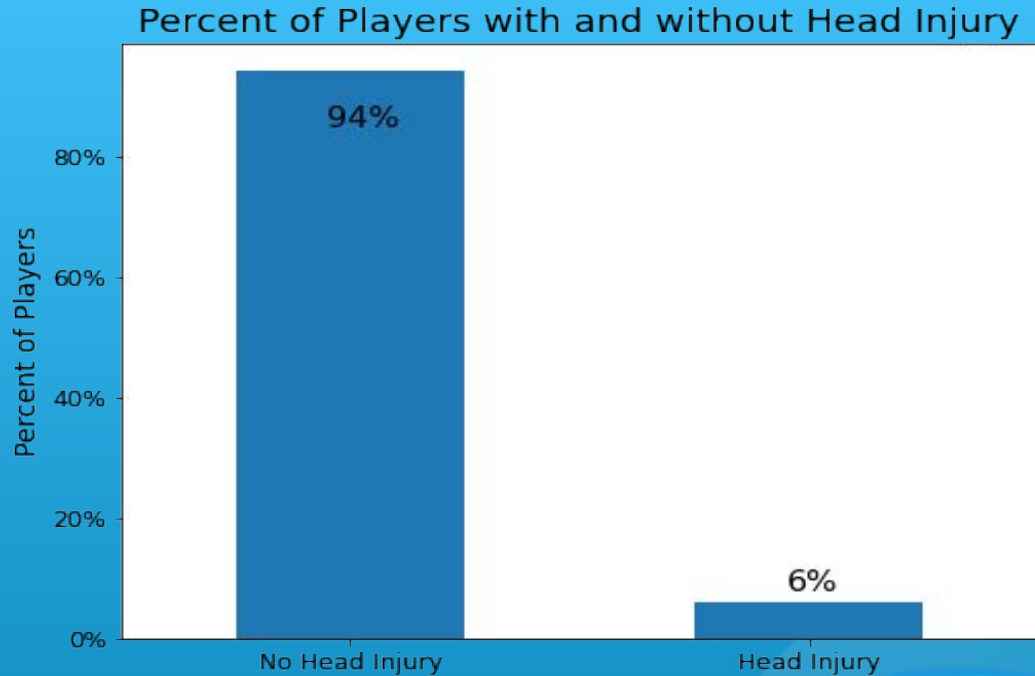


# Data

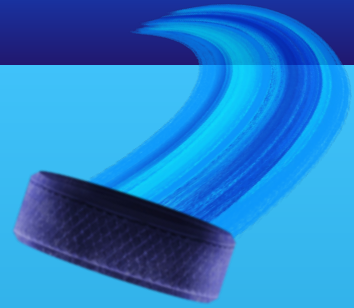
- Eliteprospects.com for NHL player data
  - + Data include: Goals, Assists, Total Points, +/-, Penalty Minutes, Position, Team played on, etc.
- CSV file from NHL injury data
- Final dataset:  
**18,723 rows**  
**47 features**



**Data: Target Variable**  
**Class imbalance :Only**  
**6% of players had a head**  
**injury**

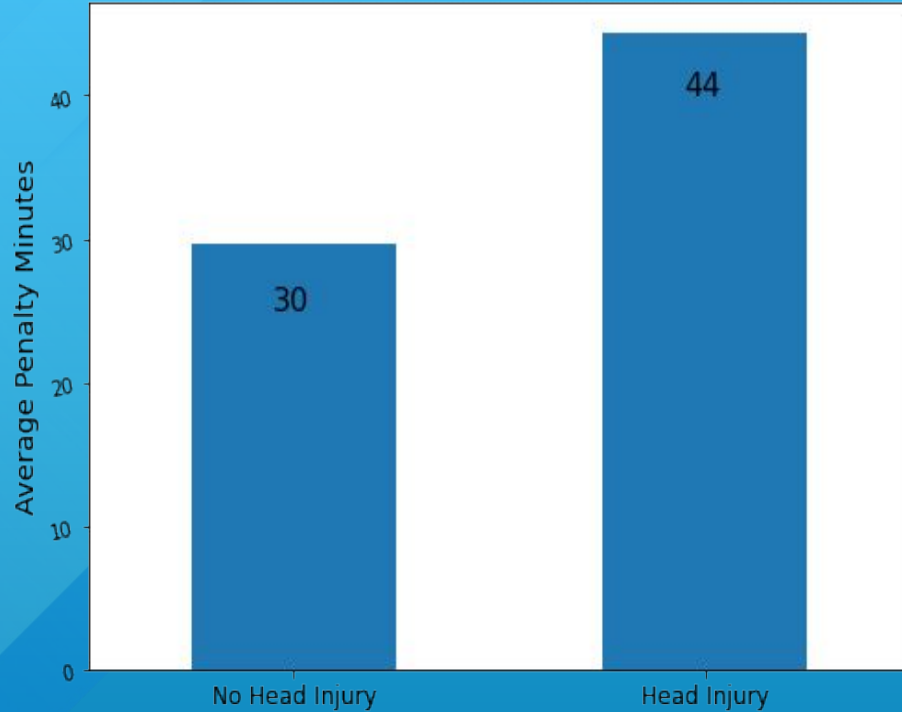


# Methods



- OSEMN method for data analysis
- Iterative modeling
- Function called model\_helper to run through five machine learning models:
  1. Logistic Regression
  2. Decision Tree Classifier
  3. Random Forest Classifier
  4. Support Vector Machine (SVM)
  5. Gradient boosting

Average Penalty Minutes of Players with and without Head Injury

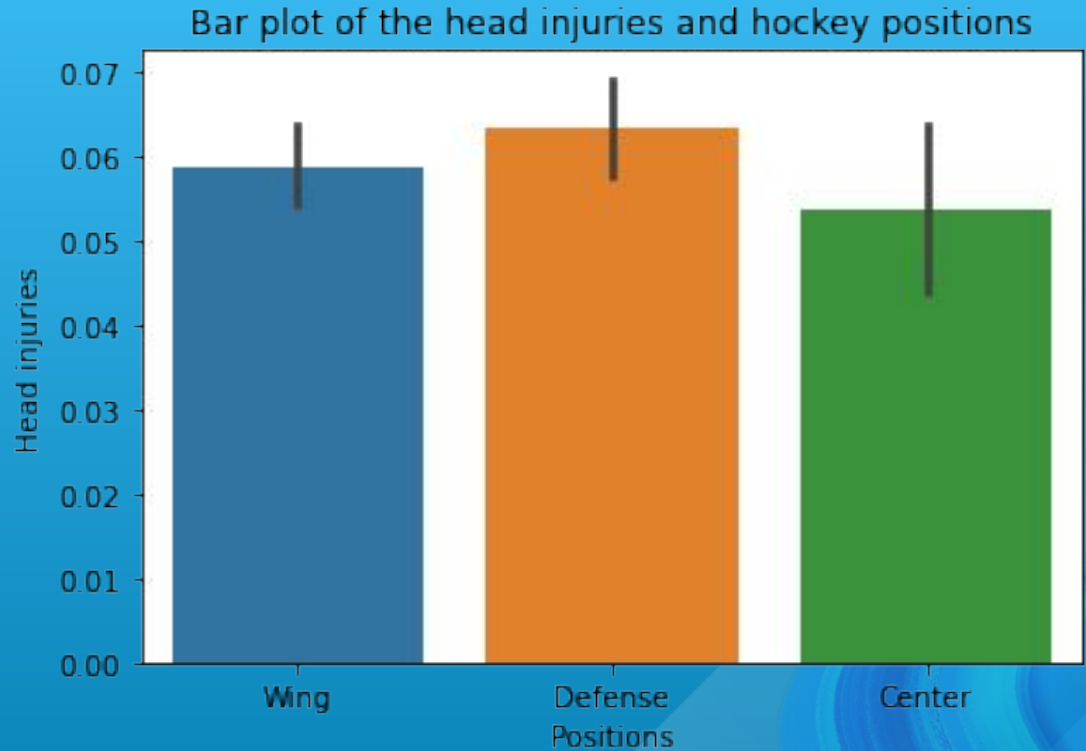


**Findings:**  
Players with head injuries on average have more penalty minutes.



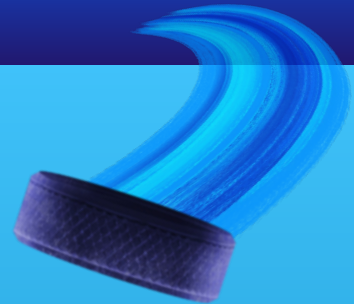
## Findings:

Defense have the most head injuries followed by wings, and centers have the least.





# Findings



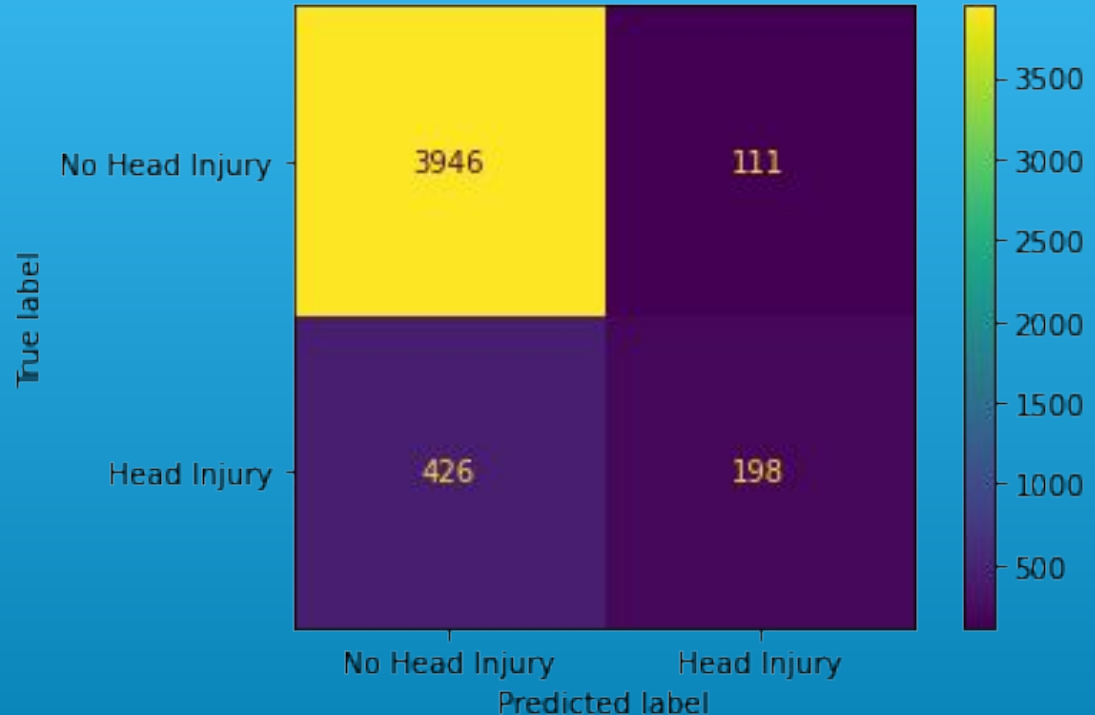
| Model                        | F1 Score    |
|------------------------------|-------------|
| Dummy Classifier             | 0.00        |
| Logistic Regression          | 0.03        |
| Decision Tree                | 0.16        |
| <b>Random Forest</b>         | <b>0.17</b> |
| Support Vector Machine (SVM) | 0.13        |
| Gradient Boosting            | 0.10        |

# Findings

| Model                          | F1 Score    |
|--------------------------------|-------------|
| Dummy Classifier               | 0.00        |
| Logistic Regression            | 0.03        |
| Decision Tree                  | 0.16        |
| Random Forest                  | 0.17        |
| Support Vector Machine (SVM)   | 0.13        |
| Gradient Boosting              | 0.10        |
| <b>Random Forest (3 years)</b> | <b>0.25</b> |

# Confusion Matrix

- 3,946 True Negatives
- 198 True Positives
- 426 False Negatives
- 111 False Positives



# Top 10 Current NHL Players with highest risk of head injury



| Player              | Probability of Head Injury |
|---------------------|----------------------------|
| Brandon Montour     | 91%                        |
| Jeff Petry          | 89%                        |
| Cam Fowler          | 89%                        |
| Shea Weber          | 87%                        |
| Erik Gudbranson     | 87%                        |
| Steven Santini      | 87%                        |
| Shayne Gostisbehere | 87%                        |
| Brett Kulak         | 86%                        |
| Erik Gustafsson     | 86%                        |
| Steven Kampfer      | 86%                        |

# Recommendation: 1

- **Penalty Minutes:** Players that have more penalty minutes get more head injuries.
- **Actionable Step:** NHL coaches and managers make a greater consequence for players who are given penalties.

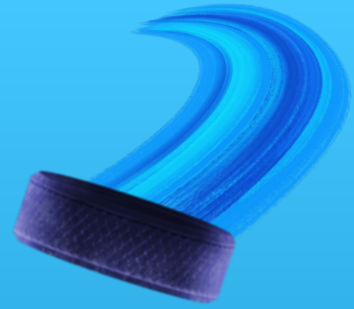
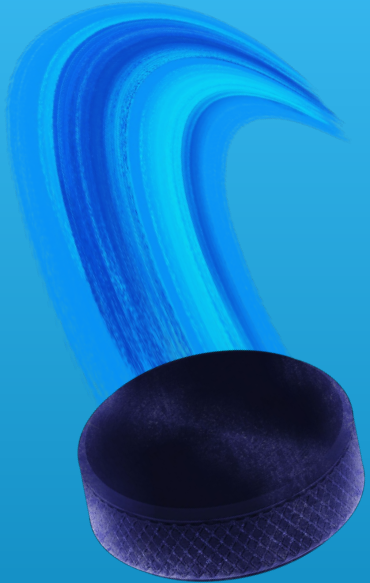
## Recommendation 2:

- **Current NHL Players:** We now have a list of players that have a high probability of head injury.
- **Actionable Step:** NHL coaches and managers can have team personnel monitoring for a head injury.

# Conclusion

Using machine learning, we are able to predict whether someone has a head injury at a higher rate, than by random guessing.

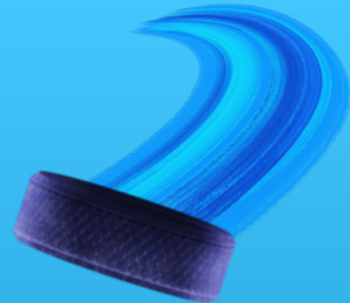
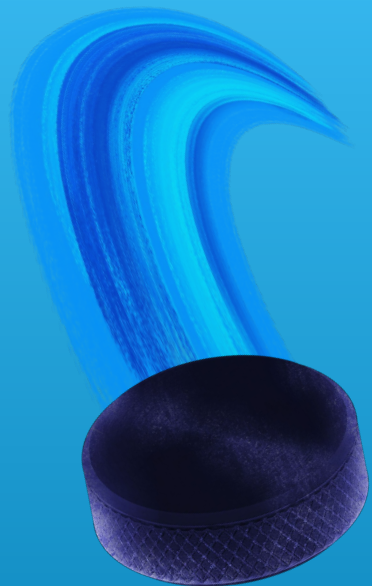
However, due to the randomness of head injuries, this is still a challenging problem.





# Future Work

- More feature engineering
- Validating the target variable with another nhl injury dataset (injury data is not always accurately reported)



# Thank you!

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[https://github.com/Marissa841/phase\\_5\\_project](https://github.com/Marissa841/phase_5_project)

# Resources

## NHL Injury Data

- <https://nhlinjuryviz.blogspot.com/2015/11/nhl-injury-database.html>

## Eliteprospectscraper

- <https://pypi.org/project/eliteprospectscraper/>