

PREDICTING THE LIKELIHOOD OF INDIVIDUALS TAKING H1N1 FLU AND SEASONAL FLU VACCINES USING LOGISTIC REGRESSION MODEL AND DECISION TREE CLASSIFIER (ID3) MODELS

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Introduction

Business Understanding

- Vaccination is a key public health measure used to fight infectious diseases.
- It is a simple, safe, and effective way of protecting a person against harmful diseases, before they come into contact with them (WHO, 2024).
- Vaccines provide immunization for individuals, and enough immunization in a community can further reduce the spread of diseases through "herd immunity."

Overview

- The data for this research on uptake of vaccines based on opinions, demoraphics and doctor's recommendation is from United States National 2009 H1N1 Flu Survey collected to monitor vaccination rates during the US Government Vaccination Campaign that began in October 2009.
- A phone survey was used to ask people whether they had received H1N1 and seasonal flu vaccines, in conjunction with information they shared about their lives, opinions, and behaviors.

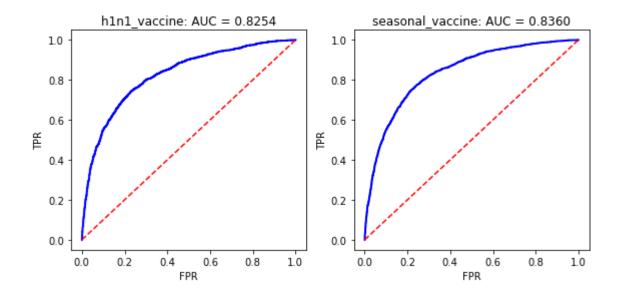
Objectives

- To predict whether people got H1N1 and Seasonal Flue Vaccines using infromation shared about their backgrounds, opinions and Health Behaviour.
- To determine the best performing model in predicting Vaccines

Modelling

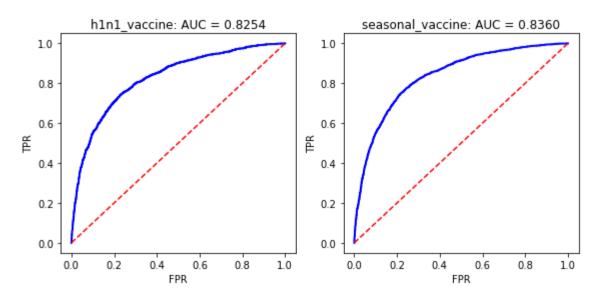
Logistic Regression Model

- It is evident that based on the information that was shared about people's backgrounds, opinions and health behaviours, 83% people took H1N1 and Seasonal Flue Vaccines.
- It therefore implies that a persons background, Opinion and Health Behaviour affect the uptake of a vaccine.
- The model performance is good but it is not perfect since it has an 83% performance out of the total 100%



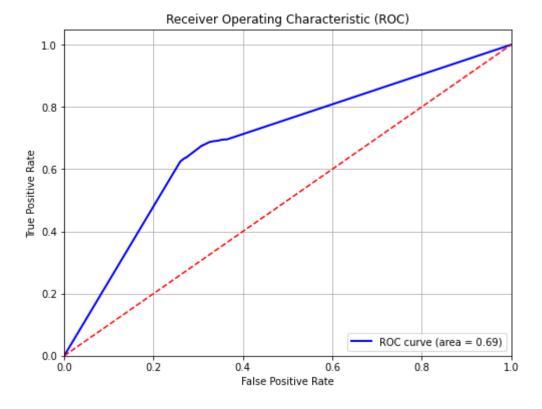
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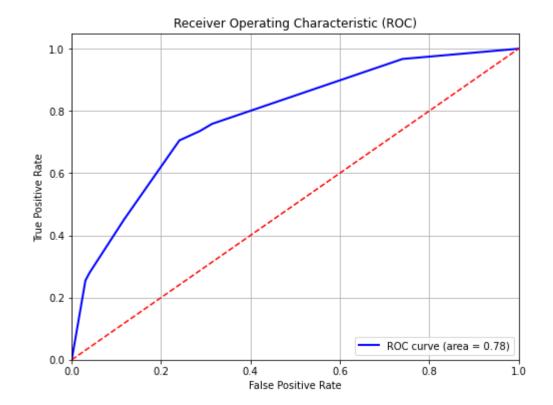
Vanilla Decision Tree Model

- The model performance using the decision tree is lower compared to the performance of the Logistic Regression Model.
- The score roc_auc is 69% whereas the score in the Logistic Regression is 83%.
- This might be because the number of features selected in the Logistic Regression Model were higher compared to the features selected for Decision Tree.
- The difference in score might also be caused by overfitting in the desion tree.
- To solve the overfitting problem, tree prunning / hyperparameter tuning will be done in the next model



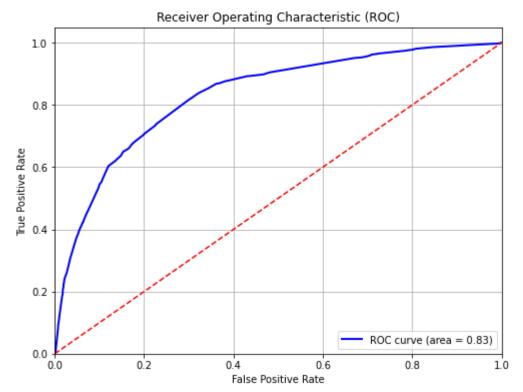
Tuned Decision Tree Model

- The model has significantly improved (73% performance score) compaired to the Vanilla decision tree model (69% performance score) that was not prunned.
- The Logistic Regression Model that had two target variables still performs better (83% performance score) compaired to the two Decision Tree models.
- This might be attributed to the size of the Logistic Regression Model that had a higher number of Features compaired to the features selected for Decision Tree.



Complex Decision Tree Model

- The performance of the model has significantly improved (83% auc_roc score) compaired to the second and third models which were both decision tree models but had a performance of 69% and 78% respectively.
- This improvement in performance is attributed to the use of more features and the use of correct depth limit achieved through hyperparameter tuning.
- The model however, has thesame performance when compaired to the Logistic Regression model that had a performance score of 83% despite model four having more features than the Logistic Regression Model.
- o To further improve the performance of the Decision Tree Classifier, other tree prunning methods like (minimum samples with leaf split, minimum leaf sample size, maximum leaf nodes, and maximum features) can be used instead of using miaximum depth alone.



MODEL PERFORMANCE COMPARISON TABLE

| CLASSIFICATION MODEL | TRAIN SCORE | TEST SCORE |
|---------------------------|-------------|------------|
| Logistic Regression Model | 0.8296 | 0.8307 |
| Vanilla Decision Tree | 0.9962 | 0.6902 |
| Tuned Decision Tree | 0.7856 | 0.7828 |
| Complex Decision Tree | 0.8491 | 0.8312 |

FINDINGS

- Logistic Regression Model has an average roc_auc score of 83.07% indicating that the model performs well in predicting H1N1 and Seasonal Flu Vaccines uptake
- The Vanilla Decision Tree Model has an roc_auc score of 69% which is a poor performance compaired to the logistic regression model. This indicate that use of less variables without hyperparameter tuning results to poor model performance in Decision Trees.
- The tuned decision tree using similar features as the Vanilla model had a n roc_auc score of 78% indicating that proper prunning of decision tree can lead to good performance of a model
- The tuned decision tree that was developed using an optimal depth with more three more features ('sex', 'race' and 'age_group') compaired to the logistic regression that had only 23 features performed better than all the models (roc_auc of 83.12%). This indicate that with proper tuning and increasing the number features the model caperform better in predicting vaccines

Conclusion

- A persons background, Opinion and Health Behaviour can be used to predict whether someone can accept a vaccine.
- The government and health practitioners should focus on proper sensitization since the doctor's recommendation of vaccines had significant correllation with both vaccines.

Recommendations

- When performing hypeparameter tuning for the decision tree classifier, only the Maximum Depth was used. To improve the performance of the Decision Tree Classifier, other tree prunning methods like (minimum samples with leaf split, minimum leaf sample size, maximum leaf nodes, and maximum features) can be used instead of using miaximum depth alone.
- The decision tree classifier used only one target variable (seasonal_vaccine). Both outcomes can be included in the decision tree model to determine whether the model performance will improve.

THANK YOU!