

Machine Learning Assignment

PROJECT REPORT

TEAM ID: 4

PROJECT TITLE: COVID-19 Vaccine Adverse Event Risk Prediction

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Problem Statement

The widespread administration of mRNA-based COVID-19 vaccines has been crucial in mitigating the pandemic's impact. However, certain individuals experience adverse events following vaccination, varying in type and severity. Identifying individuals at higher risk of such reactions can enhance post-vaccination safety monitoring and personalized medical guidance.

Objective / Aim

Predicting the Adverse Events Following Receipt of mRNA Based COVID 19 Vaccines.

Dataset Details

• **Source:** VAERS – Vaccine Adverse Event Reporting System

• **Size:** 8175 Samples, 17 Features

• **Key Features:** Dosage, Symptoms, Vaccination Site, etc.

• Target Variable: IS_SEVERE

Architecture

Model 1:

```
VAX_MANU
                            VAX_DOSE_SERIES
               Raw Data \rightarrow
                              SYMPTOM1-5
                                    VAX_MANU_MODERNA
                               VAX_MANU_OTHER/UNKNOWN
Feature Engineering
                                     VAX_DOSE_SERIES_2
(Cleaning/Grouping)
One-Hot Encoding
                                    VAX_DOSE_SERIES_3+
                                   VAX_DOSE_SERIES_UNK
                           ↓ Training
                    Logistic Regression Model
                    (class_weight='balanced')
                          ↓ Prediction
                           Output: \hat{y}
                     (0: Not Severe, 1: Severe)
```

Model 2:

```
VAX MANU
                                 VAX_DOSE_SERIES
                   Raw Data →
                                    VAX_ROUTE
                                     VAX_SITE
                                    SYMPTOM1-5
     Feature Preprocessing:
                                                      VAX_DOSE_SERIES
_DOSE_SERIES to numeric, NaN to mode.
                                                        VAX MANU *
Impute NaN with mode for all features.
                                                        VAX_ROUTE_*
      3. One-Hot Encoding.
                                                         VAX_SITE_*
                                ↓ Training
                         Random Forest Classifier
                (n_estimators = 100, class_weight='balanced')
                               ↓ Prediction
                                Output: \hat{y}
                        (0: Non-Serious, 1: Serious)
```

Methodology

2 Models used - Logistic Regression and Random Forest

A. Data Cleaning and Target Creation

- 1. **Target Definition:** We created the **IS_SEVERE** target variable by searching the symptom columns (SYMPTOM1 to SYMPTOM5) for key severe terms: 'DEATH', 'SEIZURE', 'ISCHAEMIC STROKE', etc. Any report containing these terms was labelled 1 (Severe). (Based on Model 1)
- 2. **Missing Data:** Missing values in selected features (VAX_DOSE_SERIES, VAX_ROUTE, VAX_SITE) were filled using the **mode** (most frequent value). (Based on Model 2)

B. Modelling Pipeline

- 1. **Splitting:** The cleaned data was split into **70% for training** and **30% for testing** (Based on Model 1) and **80% training** and **20% testing** (Based on Model 2). Crucially, **stratification** was used to maintain the rare event proportion in both sets.
- 2. **Imbalance Handling:** Both models used the **class_weight='balanced'** parameter to tell the algorithm to pay more attention to the small 'Severe' class, preventing it from just predicting 'Non-Severe' all the time.

Results & Evaluation

Due to the imbalance, **Recall** (correctly identifying severe cases) and **Precision-Recall AUC** (**AP**) are the most critical metrics, as simple Accuracy is misleading.

Model 1: Logistic Regression

Metric Score

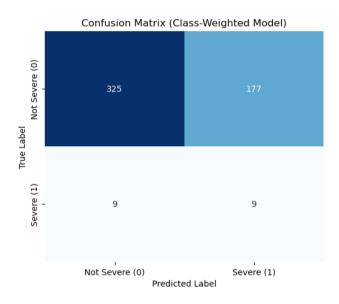
Accuracy 0.6423

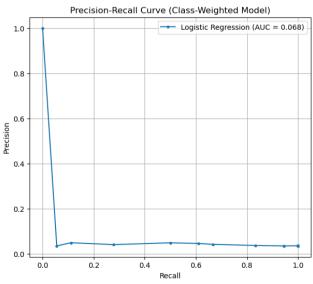
Recall (Severe) 0.50

Precision (Severe) 0.05

F1-score (Severe) 0.09

PR AUC 0.134





Model 2: Random Forest Classifier

Metric Score

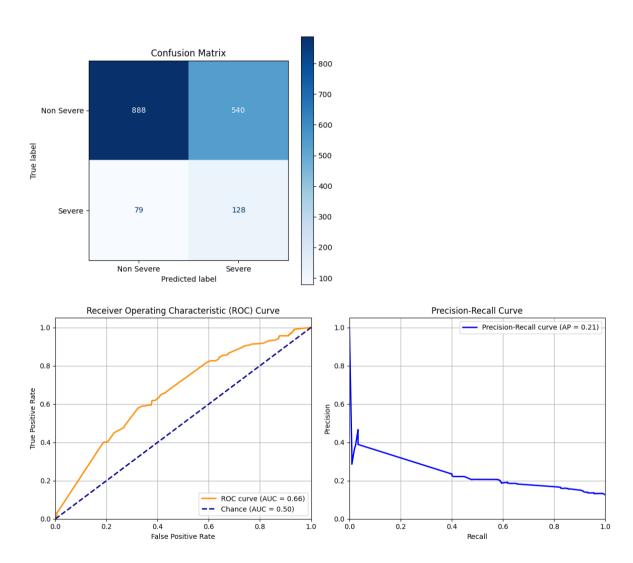
Accuracy 0.6214

Recall (Severe) 0.62

Precision (Severe) 0.19

F1-score (Severe) 0.29

PR AUC 0.29



Conclusion

The **Random Forest Classifier** is the better model for this task. It offers a superior balance of identifying the rare, important severe events (higher Recall) while being less noisy with its predictions (higher Precision and PR AUC) compared to the simpler Logistic Regression model.