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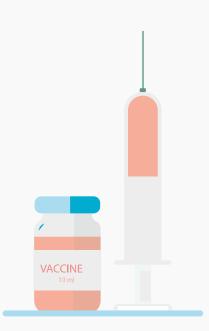
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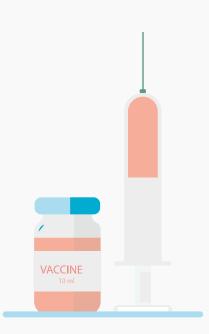


O1Problem Statement

Problem Statement

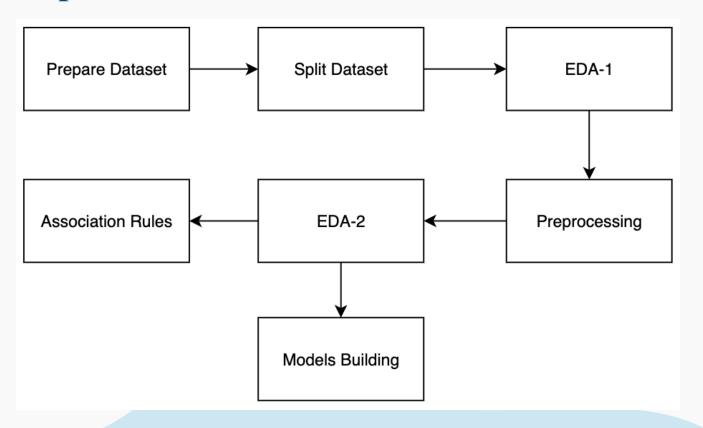
This project aims to determine the mortality status of patients, whether they have passed away or are still alive, in the context of the COVID-19 pandemic. The project utilizes a coronavirus dataset to classify patients based on their symptoms and investigates the association rules between these symptoms, other routines, and diseases. The main objective is to develop a predictive model that accurately identifies patients at risk of mortality and enables early interventions to mitigate the spread of the virus. Furthermore, the study of association rules aids in identifying the co-occurrence of symptoms and underlying diseases, facilitating early diagnosis and effective disease management.

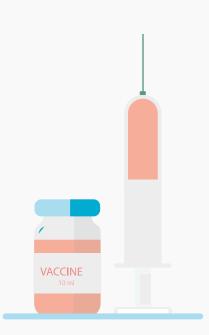




O2Problem Statement

Project Pipeline





- Prepare dataset
- Convert the values 97,98, and 99 in the binary columns to nulls.
- Convert the death date into a binary value to indicate whether the patient died or not.
- Split dataset
 - \Rightarrow Split the dataset into 80% train and 20% test.
- EDA-1

In this step, we analyze the dataset before applying any preprocessing.

Check the percentage of the null value in each column 0

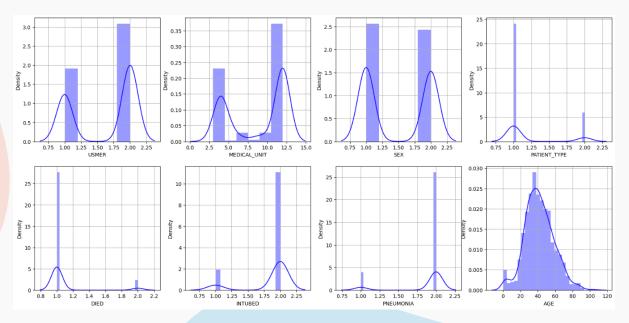
ICU	81.336161
INTUBED	81.336161
PREGNANT	48.992577
PNEUMONIA	1.378579
OTHER_DISEASE	0.424178
T0BACC0	0.318134
OBESITY	0.318134
INMSUPR	0.212089
RENAL_CHRONIC	0.212089
CARDIOVASCULAR	0.212089
DIABETES	0.212089
COPD	0.106045
ASTHMA	0.106045
HIPERTENSION	0.000000
MEDICAL_UNIT	0.000000
AGE	0.000000
DIED	0.000000
PATIENT_TYPE	0.000000
SEX	0.000000
CLASIFFICATION_FINAL	0.000000
USMER	0.000000
Name: missing_percentage	, dtype: float64



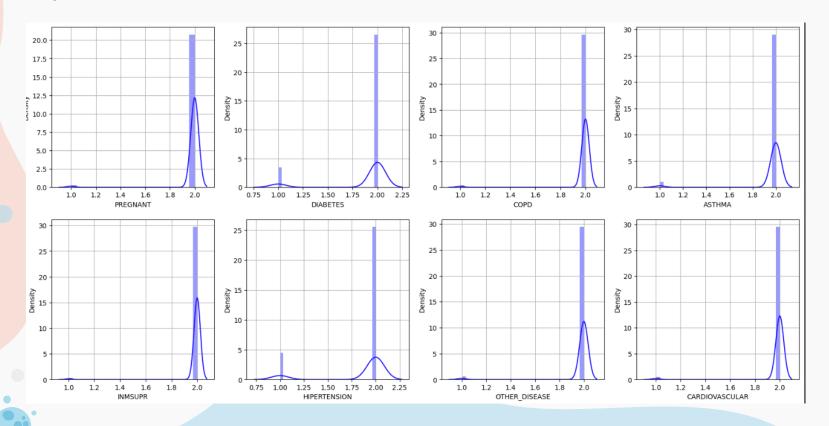


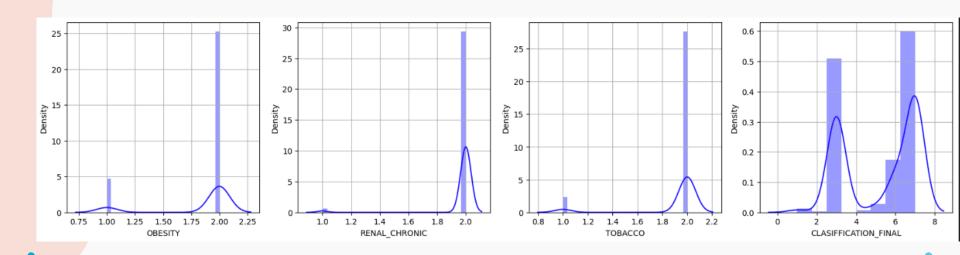
Get unique values for each column

Draw histograms to see the distribution of each feature.



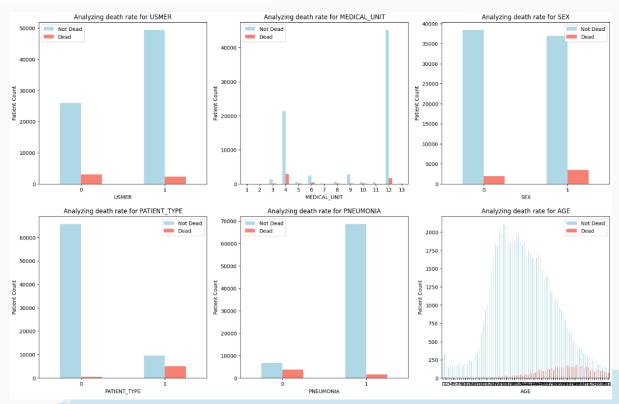


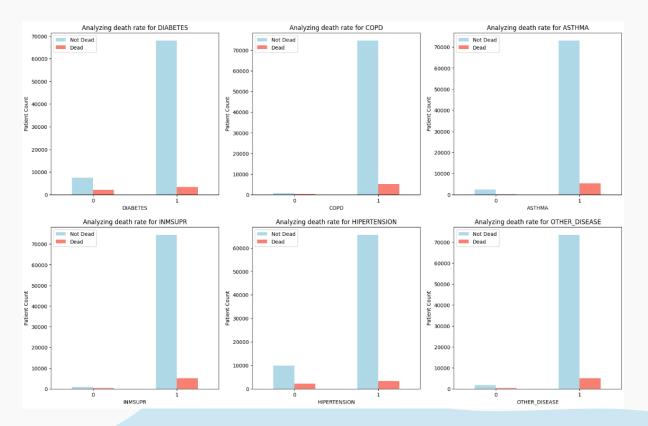




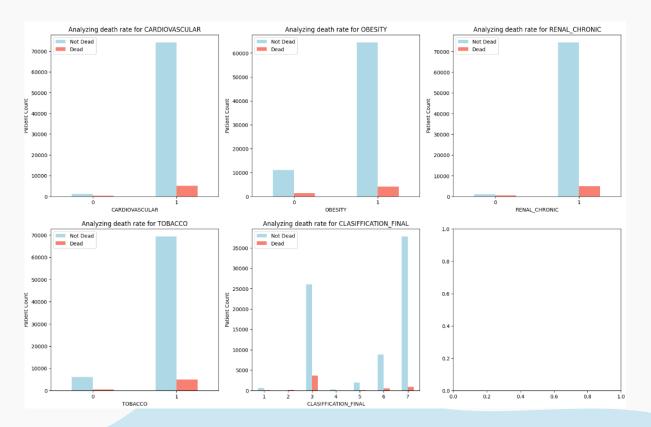


Draw the death value with each feature.



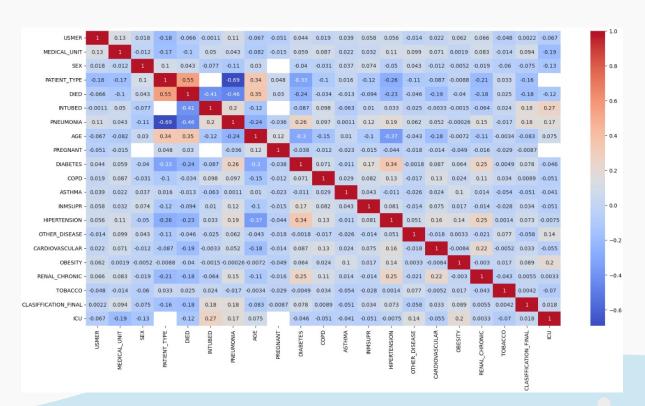






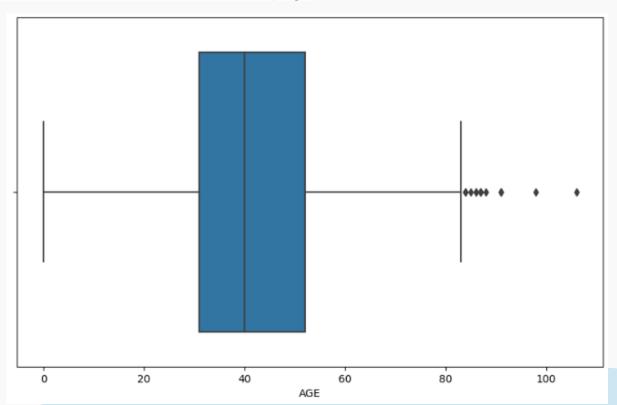


Get the correlation between each pair of features.



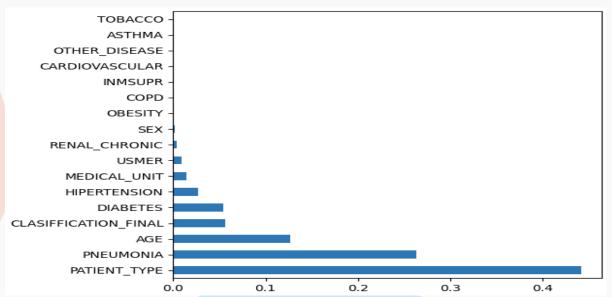


Detect outliers in numerical columns (Age)



- Preprocessing
 - O Drop columns that have high missing values (ICU/ INTUBED / Pregnant)
 - Drop rows with null values
 - o Remove age outliers
 - o Convert Boolean columns to 0,1 instead of 1,2

•EDA-2
The same steps in EDA-1 were applied and the following are the new steps
•Feature importance

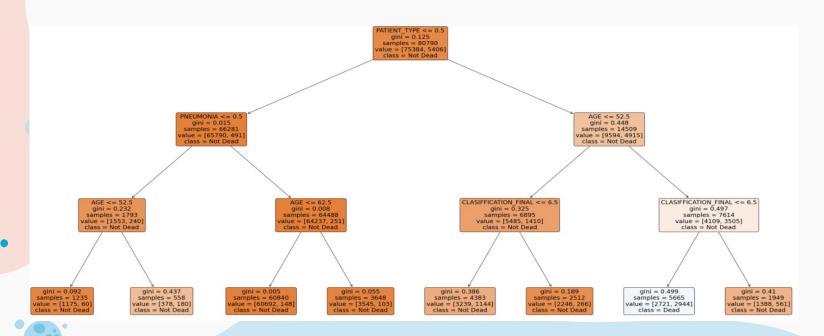




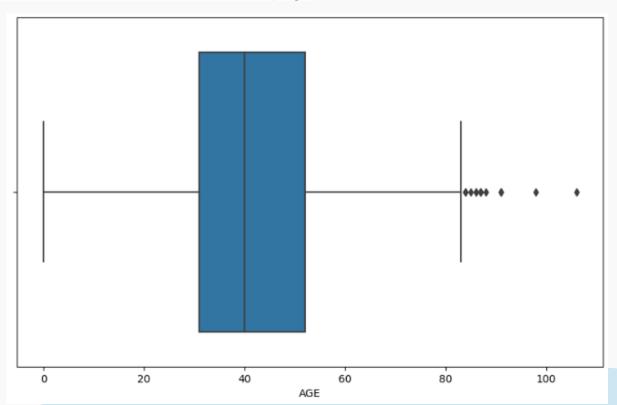
•EDA-2

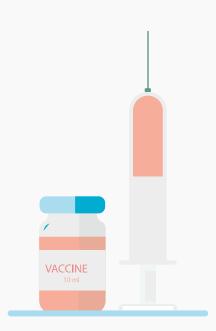
The same steps in EDA-1 were applied and the following are the new steps

•Feature importance



Detect outliers in numerical columns (Age)





From EDA

- There is a class imbalance in the data.
- The ratio of patients having diabetes, asthma, and other diseases is very high compared to the normal averages.
- o People who have an infection with a classification value of 3 are more likely to die.
- The death rate in males is higher than in females.
- o People who got admitted to intensive care have a lower death rate.
- The death rate increases with the increase in age.
- O Death is inversely correlated with diabetes and pneumonia.
- Death is highly correlated with patient type which indicated that hospitalized patients are more likely to do. Being in the hospital not the home means that the case is at risk which gives a higher probability of death.
- o There is a good observation that indicates that there is an inverse correlation between age and hypertension.

```
itemsets
     support
                                  (COPD)
    0.988132
   0.986913
                               (INMSUPR)
   0.982614
                         (RENAL CHRONIC)
   0.982207
                        (CARDIOVASCULAR)
36 0.975818
                         (INMSUPR, COPD)
    0.974579
                         (OTHER_DISEASE)
24 0.972063
                  (COPD, CARDIOVASCULAR)
40 0.971835
                  (COPD, RENAL_CHRONIC)
61 0.971468
                (INMSUPR, RENAL_CHRONIC)
   0.970408
               (INMSUPR, CARDIOVASCULAR)
```

```
antecedents consequents support
                                                                                                                                                  confidence
                                                                                                                                                                 lift
                                                                                                                                                                       leverage
(ASTHMA, CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, HIPERTENSION, USMER, DIABETES, OTHER_DISEASE, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.378053
                                                                                                                                                    0.997204 1.009181 0.003439
               (ASTHMA, CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, HIPERTENSION, USMER, DIABETES, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.384016
                                                                                                                                                    0.997196 1.009173 0.003491
         (ASTHMA, CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, HIPERTENSION, USMER, DIABETES, OTHER_DISEASE, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.379826
                                                                                                                                                    0.997191 1.009168 0.003451
                        (ASTHMA, CARDIOVASCULAR, RENAL CHRONIC, OBESITY, HIPERTENSION, USMER, DIABETES, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.386245
                                                                                                                                                    0.997187 1.009164 0.003507
                (ASTHMA, RENAL CHRONIC, OBESITY, INMSUPR, HIPERTENSION, USMER, DIABETES, OTHER DISEASE, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.380064
                                                                                                                                                    0.997141 1.009117 0.003434
               (ASTHMA, CARDIOVASCULAR, OBESITY, INMSUPR, HIPERTENSION, USMER, DIABETES, OTHER DISEASE, PNEUMONIA, TOBACCO)
                                                                                                                                                    0.997138 1.009114 0.003429
                                                                                                                                 (COPD) 0.379618
                              (ASTHMA, RENAL CHRONIC, OBESITY, INMSUPR, HIPERTENSION, USMER, DIABETES, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.386186
                                                                                                                                                    0.997135 1.009112 0.003487
                              (ASTHMA, CARDIOVASCULAR, OBESITY, INMSUPR, HIPERTENSION, USMER, DIABETES, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.385631
                                                                                                                                                    0.997131 1.009107 0.003480
                        (ASTHMA, RENAL_CHRONIC, OBESITY, HIPERTENSION, USMER, DIABETES, OTHER_DISEASE, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.381857
                                                                                                                                                    0.997129 1.009105 0.003445
                                        (ASTHMA, RENAL_CHRONIC, OBESITY, HIPERTENSION, USMER, DIABETES, PNEUMONIA, TOBACCO)
                                                                                                                                 (COPD) 0.388455
                                                                                                                                                    0.997126 1.009103 0.003504
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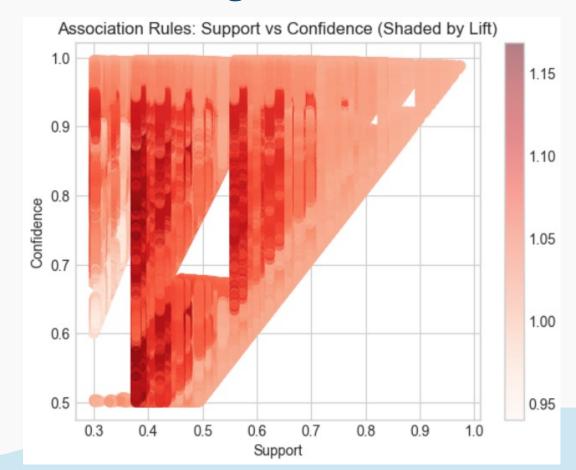
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antecedents
                                                                                                                                                 consequents support
                                                                                                                                                                        confidence
                                                                                                                                                                                       lift leverage
                    (ASTHMA, HIPERTENSION, OTHER_DISEASE, PNEUMONIA, TOBACCO)
                                                                                    (CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, COPD, USMER, DIABETES) 0.378053
                                                                                                                                                                         0.564579 1.168576 0.054537
     (CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, COPD, USMER, DIABETES)
                                                                                                   (ASTHMA, HIPERTENSION, OTHER_DISEASE, PNEUMONIA, TOBACCO) 0.378053
                                                                                                                                                                         0.782501 1.168576 0.054537
(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, USMER, DIABETES, OTHER DISEASE)
                                                                                                         (ASTHMA, INMSUPR, HIPERTENSION, PNEUMONIA, TOBACCO) 0.378053
                                                                                                                                                                         0.791541 1.167892 0.054347
                          (ASTHMA, INMSUPR, HIPERTENSION, PNEUMONIA, TOBACCO) (CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, USMER, DIABETES, OTHER_DISEASE) 0.378053
                                                                                                                                                                         0.557803 1.167892 0.054347
                    (CARDIOVASCULAR, OBESITY, INMSUPR, COPD, USMER, DIABETES)
                                                                                    (ASTHMA, RENAL_CHRONIC, HIPERTENSION, OTHER_DISEASE, PNEUMONIA, TOBACCO) 0.378053
                                                                                                                                                                         0.777241 1.167146 0.054140
     (ASTHMA, RENAL CHRONIC, HIPERTENSION, OTHER DISEASE, PNEUMONIA, TOBACCO)
                                                                                                   (CARDIOVASCULAR, OBESITY, INMSUPR, COPD, USMER, DIABETES) 0.378053
                                                                                                                                                                         0.567703 1.167146 0.054140
              (ASTHMA, COPD, HIPERTENSION, OTHER DISEASE, PNEUMONIA, TOBACCO)
                                                                                          (CARDIOVASCULAR, RENAL CHRONIC, OBESITY, INMSUPR, USMER, DIABETES) 0.378053
                                                                                                                                                                         0.566868 1.166712 0.054020
                                                                                             (ASTHMA, COPD, HIPERTENSION, OTHER_DISEASE, PNEUMONIA, TOBACCO) 0.378053
           (CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, USMER, DIABETES)
                                                                                                                                                                         0.778097 1.166712 0.054020
              (CARDIOVASCULAR, RENAL CHRONIC, OBESITY, COPD, USMER, DIABETES)
                                                                                          (ASTHMA, INMSUPR, HIPERTENSION, OTHER DISEASE, PNEUMONIA, TOBACCO) 0.378053
                                                                                                                                                                         0.776293 1.166710 0.054020
           (ASTHMA, INMSUPR, HIPERTENSION, OTHER DISEASE, PNEUMONIA, TOBACCO)
                                                                                             (CARDIOVASCULAR, RENAL CHRONIC, OBESITY, COPD, USMER, DIABETES) 0.378053
                                                                                                                                                                         0.568185 1.166710 0.054020
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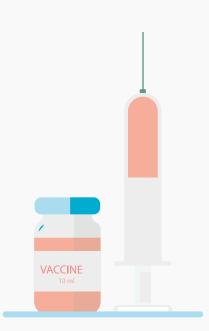
antecedents	consequents s	support confidence	lift	leverage
(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, DIABETES, OTHER_DISEASE)	(INMSUPR, PNEUMONIA, HIPERTENSION, TOBACCO) 0.	573394 0.789381	1.131092	0.066456
(INMSUPR, PNEUMONIA, HIPERTENSION, TOBACCO)	(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, DIABETES, OTHER_DISEASE) 0.	573394 0.821608	1.131092	0.066456
(ASTHMA, INMSUPR, HIPERTENSION, PNEUMONIA, TOBACCO)	(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, DIABETES, OTHER_DISEASE) 0.	558732 0.824390	1.134922	0.066423
(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, DIABETES, OTHER_DISEASE)	(ASTHMA, INMSUPR, HIPERTENSION, PNEUMONIA, TOBACCO) 0.	558732 0.769196	1.134922	0.066423
(HIPERTENSION, PNEUMONIA, ASTHMA, TOBACCO)	(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, COPD, DIABETES, OTHER_DISEASE) 0.	558732 0.817946	1.134280	0.066145
(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, COPD, DIABETES, OTHER_DISEASE)	(HIPERTENSION, PNEUMONIA, ASTHMA, TOBACCO) 0.	558732 0.774818	1.134280	0.066145
(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, DIABETES, OTHER_DISEASE)	(INMSUPR, HIPERTENSION, PNEUMONIA, ASTHMA) 0.	600123 0.826178	1.123819	0.066120
(INMSUPR, HIPERTENSION, PNEUMONIA, ASTHMA)	(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, COPD, DIABETES, OTHER_DISEASE) 0.	600123 0.816325	1.123819	0.066120
(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, COPD, DIABETES, OTHER_DISEASE)	(PNEUMONIA, HIPERTENSION, TOBACCO) 0.	573394 0.795150	1.130294	0.066098
(PNEUMONIA, HIPERTENSION, TOBACCO)	(CARDIOVASCULAR, RENAL_CHRONIC, OBESITY, INMSUPR, COPD, DIABETES, OTHER_DISEASE) 0.	573394 0.815071	1.130294	0.066098



From EDA

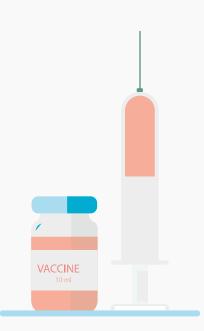
- There is a class imbalance in the data.
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- o People who have an infection with a classification value of 3 are more likely to die.
- The death rate in males is higher than in females.
- o People who got admitted to intensive care have a lower death rate.
- The death rate increases with the increase in age.
- O Death is inversely correlated with diabetes and pneumonia.
- Death is highly correlated with patient type which indicated that hospitalized patients are more likely to do. Being in the hospital not the home means that the case is at risk which gives a higher probability of death.
- o There is a good observation that indicates that there is an inverse correlation between age and hypertension.





O5 Model Training and Evaluation

		Dataset	Accuracy	Weighted Precision	Weighted Recall	Weighted F1
Logist	tic Regression	Train	0.941	0.933	0.941	0.935
		Test	0.941	0.932	0.941	0.935
Ran	Random Forest	Train	0.941	0.928	0.941	0.929
		Train	0.939	0.926	0.939	0.927
Dec	cision Trees	Train	0.94	0.927	0.94	0.927
		Test	0.939	0.926	0.939	0.925
	Bayes (map-	Train	0.921	0.945	0.921	0.93
	reduce)	Test	0.922	0.944	0.922	0.93



O6 Unsuccessful Trials & Future Work

Unsuccessful Trials

- 1. Impute the values of the three columns that have missing values of more than 40%. When using these columns, the model results were not good enough as the final models.
- 2. After Dropping these columns using the imputation for the missing values for other columns is not good as dropping null columns. We were able to drop null rows as the size of the data was large enough.
- 3. Before using feature, importance, and dropping unimportant columns the performance was lower than the final performance and this is justified by that there are so columns that are not correlated to the feature we are predicting.
- 4. Making the classification final feature a Boolean was no good idea, it is better to have a measure of how the patient is infected.

Future Work

- 1. Using other models
- 2. Try a neural network on this large number of rows
- 3. Do more feature engineering and try to define a feature that mixes two or more features to predict the results correctly.
- 4. Doing more data mining on the data.

Thanks