

# HEART DISEASE PREDICTION ANALYSIS AND VISUALIZATION

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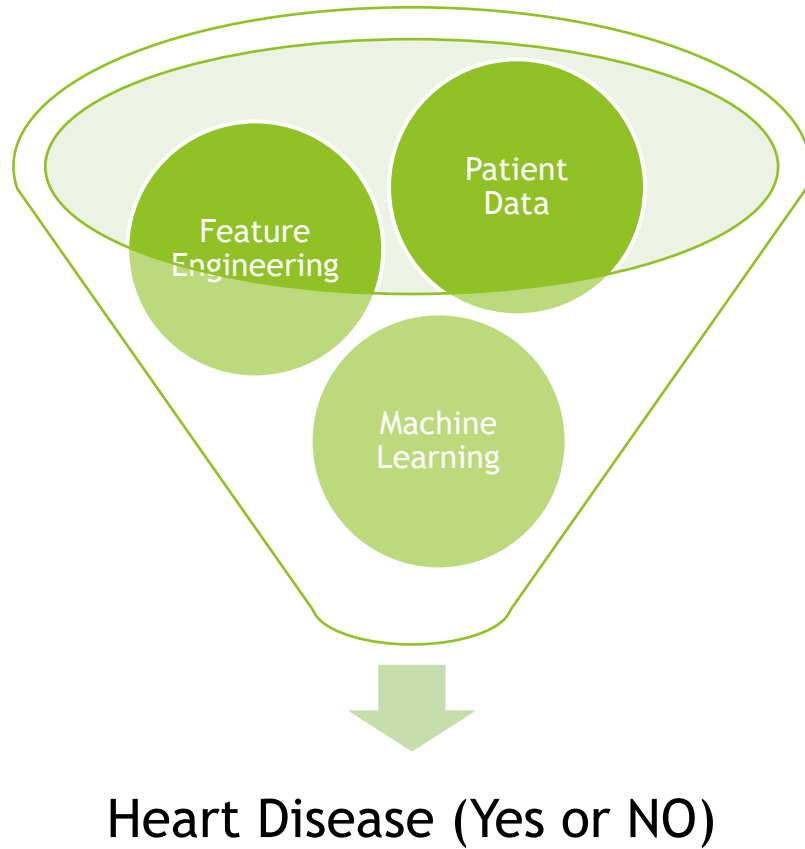
# Motivation

- ❑ Develop a Learning tool which can predict Heart Diseases based on a series of Data Sets accumulated by Doctors.
- ❑ The Learning tool can provide second thoughts or opinions to doctors about whether a heart disease is likely present or not.
- ❑ Same procedure can be applied to predict several other diseases based on their data sets.

# Project Background

- ❑ Heart Failure is one of the leading medical issue in the current era. With the growing number of Heart Failure cases in the past, several data bases have been developed which contains important features (data) that leads to or may have cause Heart Failure.
- ❑ With the data sets available on Kaggle/Other Web Platforms we can perform Machine Learning on the medical database and develop Models that can predict possible heart failure for a patient at a critical time.

# Project Overview



# Project Overview



Data Extraction



Graphical Exploration of  
Data



Feature Engineering



Selection of ML Models



Develop 5 ML Model and  
apply Stacking



Performance Comparison  
of ML Models



Visualisation on Power BI

# HEART DISEASE PREDICTION MODELING

## Critical Features

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Age

Gender

Chest Pain Type

Cholesterol

Exercise Engina

Resting BP

Resting ECG

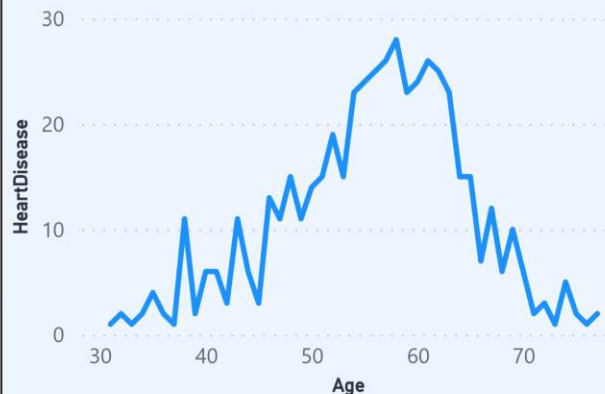
Max Heart Rate

Fasting Blood Sugar

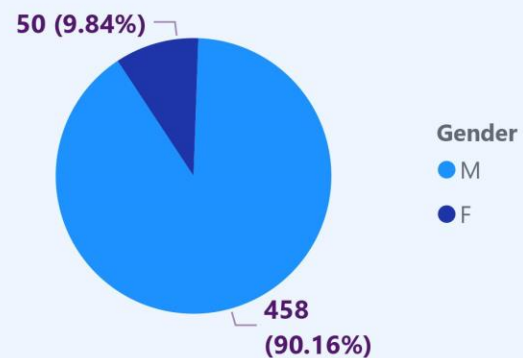
Old Peak

ST\_Slope

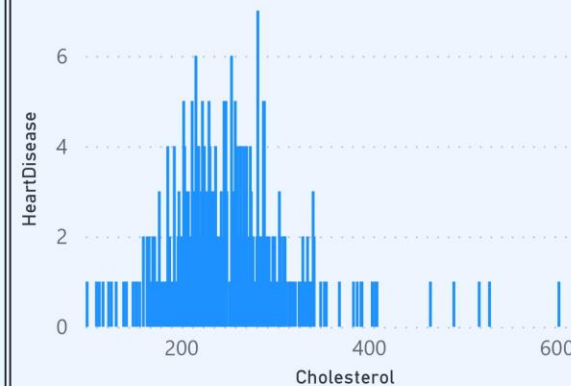
### Heart Disease by Age



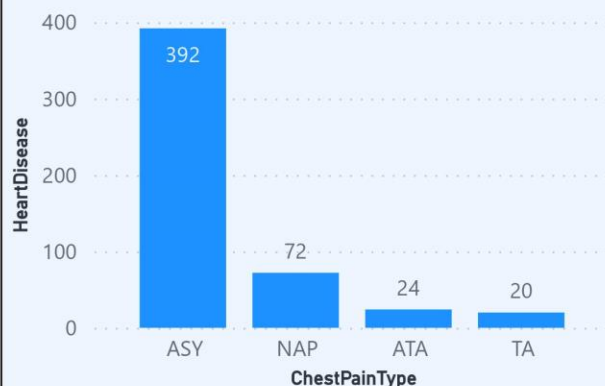
### Heart Disease by Gender



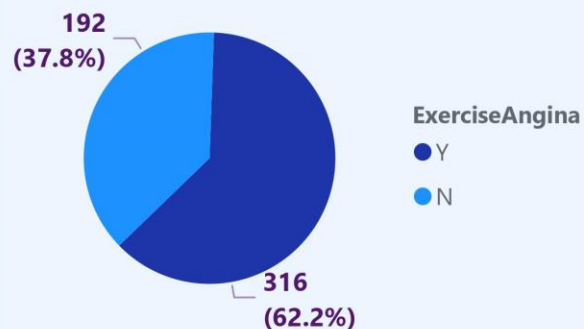
### Heart Disease by Cholesterol Level



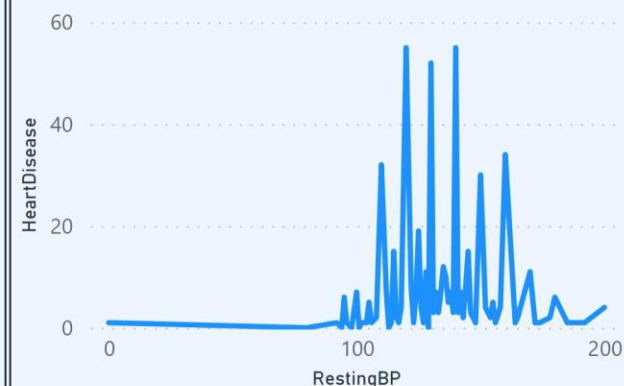
### HeartDisease by ChestPainType



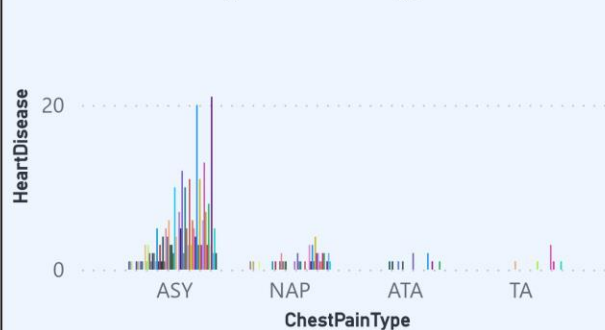
### Heart Disease by Exercise Induced Angina



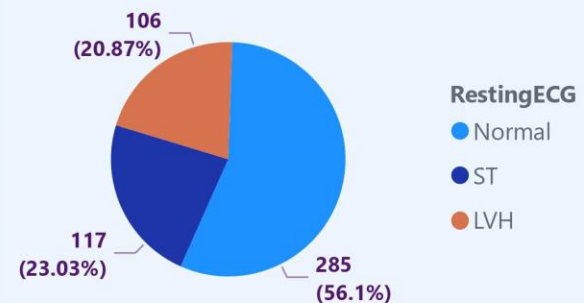
### Heart Disease by RestingBP



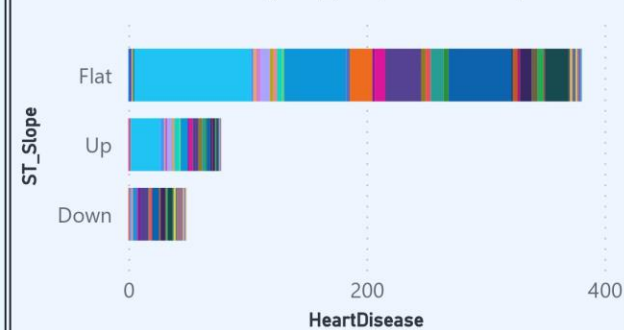
### HeartDisease by ChestPainType and MaxHR



### Heart Disease by RestingECG



### HeartDisease by ST\_Slope and Oldpeak



# Data Information

In [34]: `heart.info()`

```
<class 'pandas.core.frame.DataFrame'>  
RangeIndex: 918 entries, 0 to 917  
Data columns (total 12 columns):  
#   Column                Non-Null Count  Dtype  
---  ---  
0   Age                   918 non-null    int64  
1   Sex                   918 non-null    object  
2   ChestPainType         918 non-null    object  
3   RestingBP             918 non-null    int64  
4   Cholesterol            918 non-null    int64  
5   FastingBS             918 non-null    int64  
6   RestingECG            918 non-null    object  
7   MaxHR                 918 non-null    int64  
8   ExerciseAngina        918 non-null    object  
9   Oldpeak               918 non-null    float64  
10  ST_Slope              918 non-null    object  
11  HeartDisease          918 non-null    int64  
dtypes: float64(1), int64(6), object(5)  
memory usage: 86.2+ KB
```

# Data Exploration: Checking Null Values

In [36]: *# Checking for Missing of Null Values in Data Set*

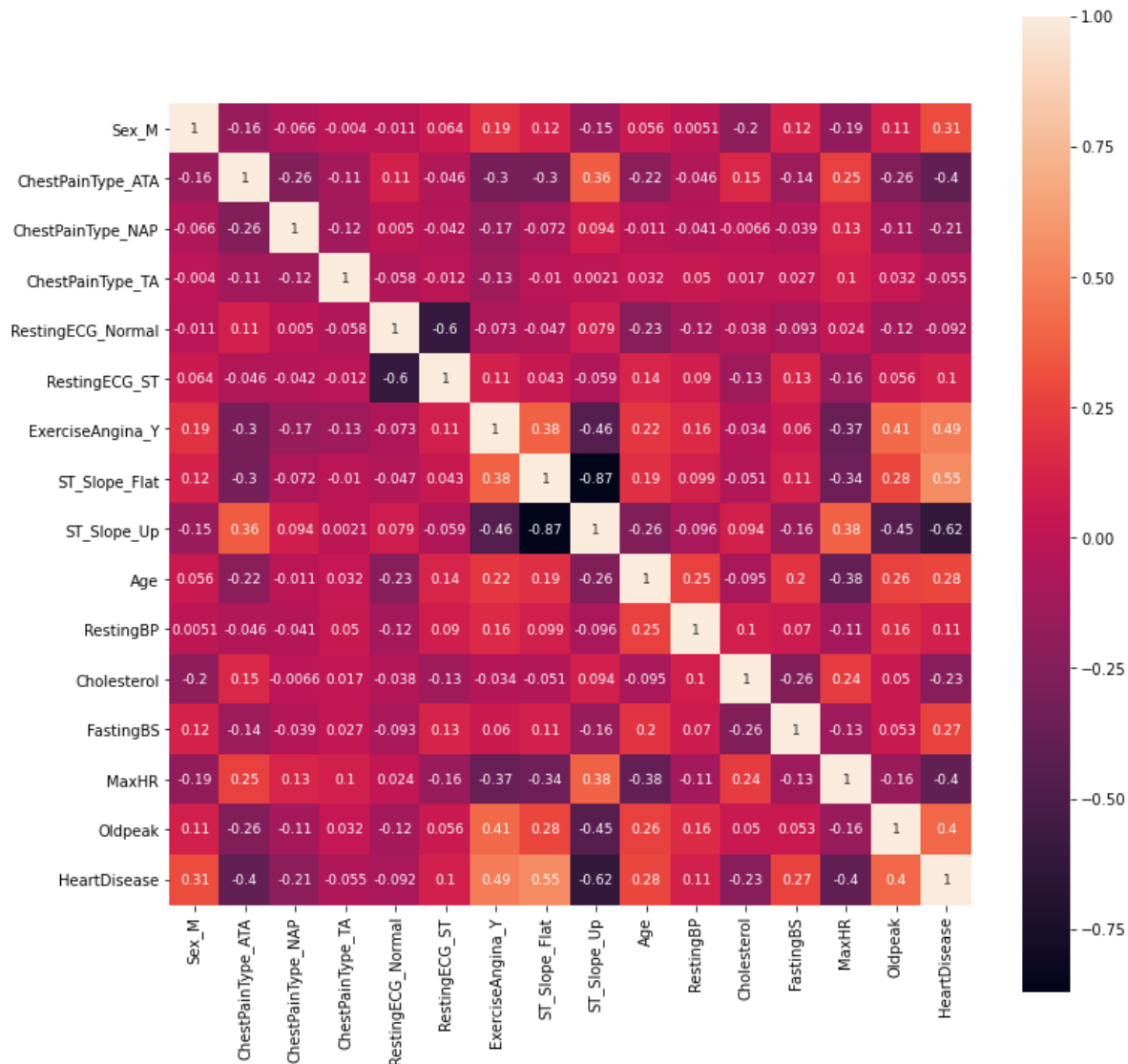
```
heart.isnull().sum()
```

Out[36]:

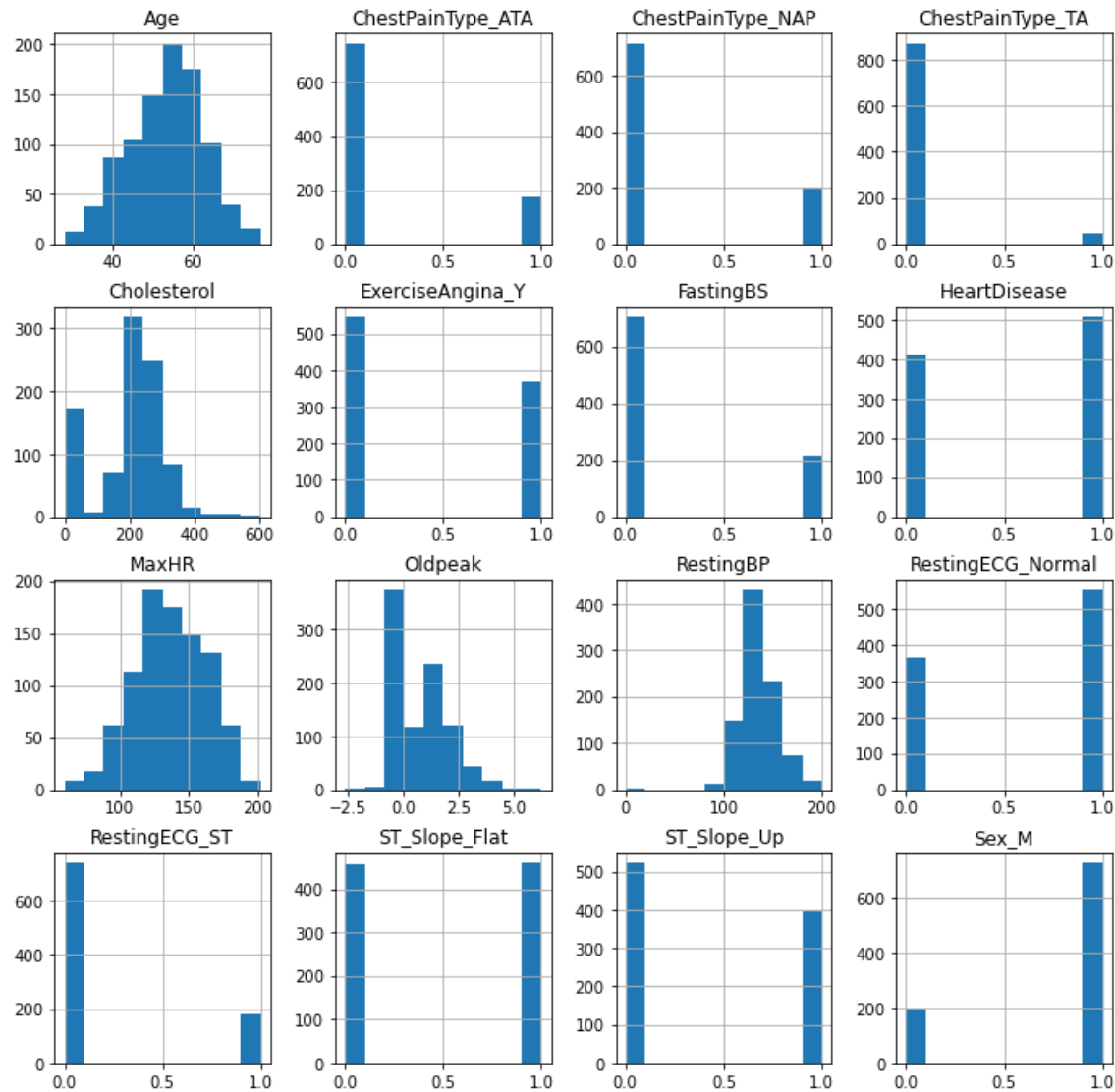
Age	0
Sex	0
ChestPainType	0
RestingBP	0
Cholesterol	0
FastingBS	0
RestingECG	0
MaxHR	0
ExerciseAngina	0
Oldpeak	0
ST_Slope	0
HeartDisease	0
dtype:	int64



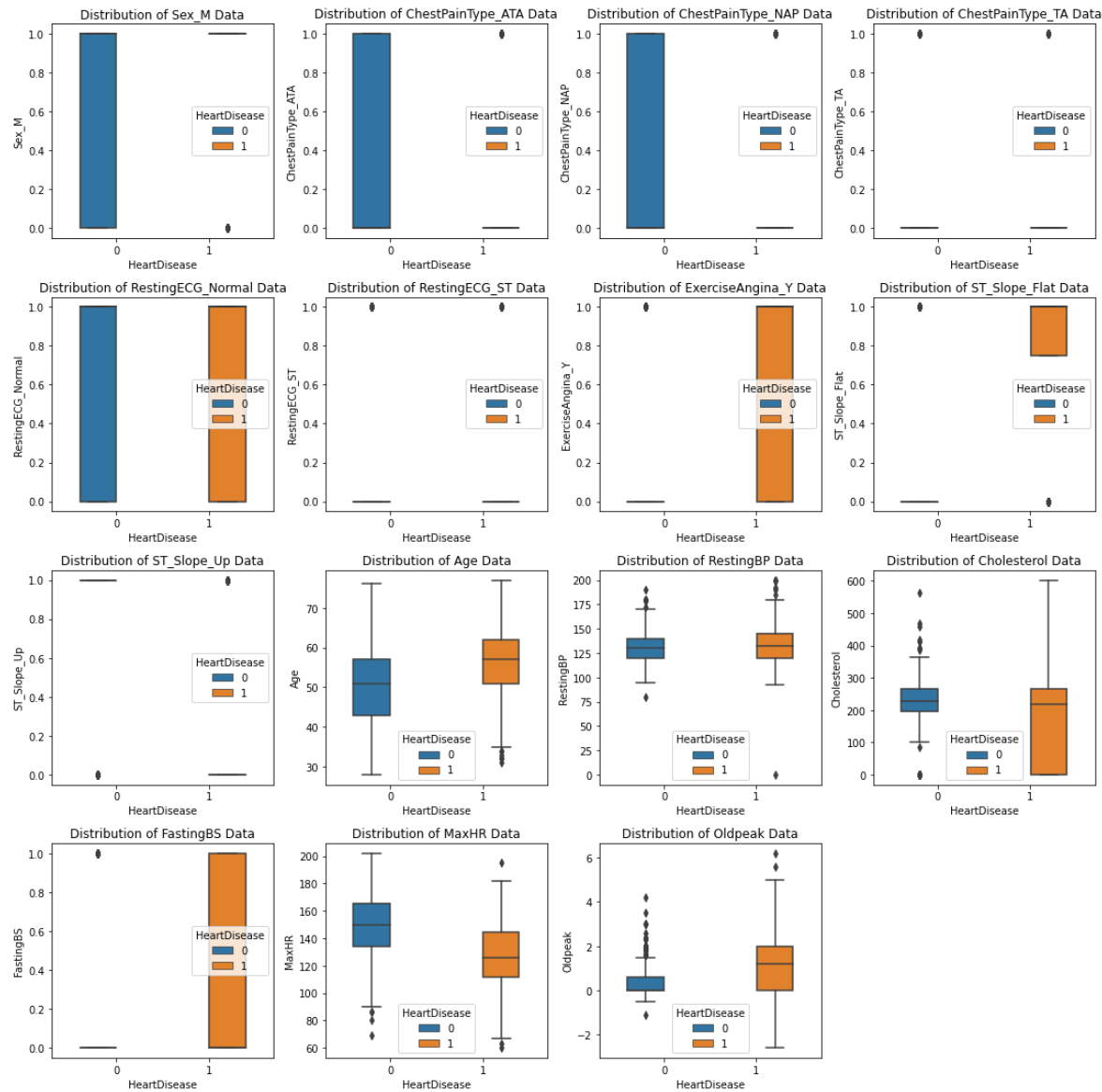
# Data Exploration: Correlation



# Data Exploration: Data Distribution



# Data Exploration: Outliers



# Machine Learning: Lazy Predict Method

## Selection of Models

Model	Accuracy	Balanced Accuracy	ROC AUC	F1 Score	Time Taken
NearestCentroid	0.93	0.94	0.94	0.93	0.02
BernoulliNB	0.92	0.92	0.92	0.92	0.02
NuSVC	0.92	0.92	0.92	0.92	0.02
ExtraTreesClassifier	0.91	0.91	0.91	0.91	0.11
KNeighborsClassifier	0.91	0.91	0.91	0.91	0.01
RidgeClassifierCV	0.90	0.90	0.90	0.90	0.02
RidgeClassifier	0.90	0.90	0.90	0.90	0.02
LinearDiscriminantAnalysis	0.90	0.90	0.90	0.90	0.01
LinearSVC	0.90	0.90	0.90	0.90	0.04
LogisticRegression	0.90	0.90	0.90	0.90	0.01
CalibratedClassifierCV	0.90	0.90	0.90	0.90	0.11
SVC	0.90	0.90	0.90	0.90	0.02
RandomForestClassifier	0.90	0.90	0.90	0.90	0.14
SGDClassifier	0.89	0.89	0.89	0.89	0.01
LGBMClassifier	0.88	0.88	0.88	0.88	0.13
QuadraticDiscriminantAnalysis	0.88	0.88	0.88	0.88	0.01
XGBClassifier	0.88	0.88	0.88	0.88	0.06
PassiveAggressiveClassifier	0.88	0.87	0.87	0.88	0.02
GaussianNB	0.87	0.87	0.87	0.87	0.02
AdaBoostClassifier	0.87	0.87	0.87	0.87	0.09
BaggingClassifier	0.85	0.85	0.85	0.85	0.02
DecisionTreeClassifier	0.85	0.85	0.85	0.85	0.01

# Machine Learning: NUSVC Model

Model Performance NuSVC

Accuracy Train: 0.8514986376021798

MCC Train: 0.6994572721327352

F1 Score Train : 0.8706998813760378

Accuracy Test: 0.875

MCC Test: 0.746633218777735

F1 Score Test : 0.8899521531100477

	precision	recall	f1-score	support
0	0.83	0.88	0.86	77
1	0.91	0.87	0.89	107
accuracy			0.88	184
macro avg	0.87	0.88	0.87	184
weighted avg	0.88	0.88	0.88	184

# Machine Learning: GRADIENT BOOSTING CLASSIFIER

Model Performance GRADIENT BOOSTING

Accuracy Train: 0.9373297002724795

MCC Train: 0.873132298894877

F1 Score Train : 0.9436274509803921

Accuracy Test: 0.9565217391304348

MCC Test: 0.9120038259206121

F1 Score Test : 0.9607843137254902

	precision	recall	f1-score	support
0	0.95	0.95	0.95	82
1	0.96	0.96	0.96	102
accuracy			0.96	184
macro avg	0.96	0.96	0.96	184
weighted avg	0.96	0.96	0.96	184

# Machine Learning: XGBOOST

Model Performance XGBOOST

Accuracy Train: 0.9877384196185286

MCC Train: 0.9752077070247509

F1 Score Train : 0.9889025893958077

Accuracy Test: 0.9891304347826086

MCC Test: 0.978289060789934

F1 Score Test : 0.99009900990099

	precision	recall	f1-score	support
0	1.00	0.98	0.99	84
1	0.98	1.00	0.99	100
accuracy			0.99	184
macro avg	0.99	0.99	0.99	184
weighted avg	0.99	0.99	0.99	184

# Machine Learning: EXTRA TRESS CLASSIFIER

Model Performance EXTRA TRESS CLASSIFIER

Accuracy Train: 1.0

MCC Train: 1.0

F1 Score Train : 1.0

Accuracy Test: 0.8804347826086957

MCC Test: 0.7579384823238913

F1 Score Test : 0.8952380952380952

	precision	recall	f1-score	support
0	0.83	0.89	0.86	76
1	0.92	0.87	0.90	108
accuracy			0.88	184
macro avg	0.88	0.88	0.88	184
weighted avg	0.88	0.88	0.88	184



# Machine Learning: RANDOMFORESTCLASSIFIER

Model Performance RANDOM FORREST

Accuracy Train: 1.0

MCC Train: 1.0

F1 Score Train : 1.0

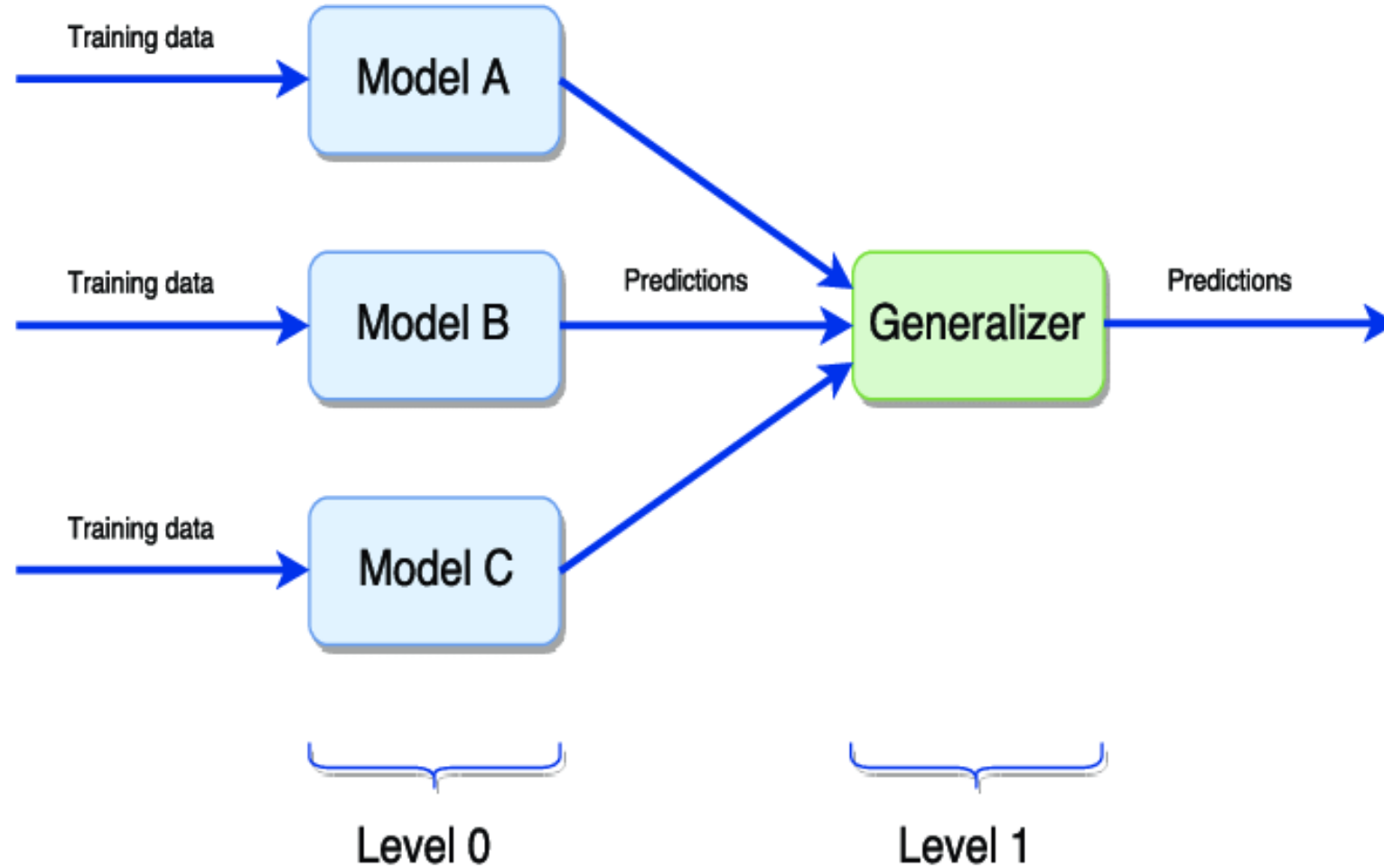
Accuracy Test: 0.8695652173913043

MCC Test: 0.7360114777618364

F1 Score Test : 0.8823529411764706

	precision	recall	f1-score	support
0	0.85	0.85	0.85	82
1	0.88	0.88	0.88	102
accuracy			0.87	184
macro avg	0.87	0.87	0.87	184
weighted avg	0.87	0.87	0.87	184

# Machine Learning: STACKING



# Machine Learning: STACKING

Model Performance STACKING MODEL  
Accuracy Train: 0.9959128065395095  
MCC Train: 0.9917589340613957  
MCC Train fold: 0.943706492883453  
F1 Score Train : 0.996319018404908

Accuracy Test: 0.8913043478260869  
MCC Test: 0.7800095648015304  
MCC Test fold: 1.0  
F1 Score Test : 0.9019607843137255

	precision	recall	f1-score	support
0	0.88	0.88	0.88	82
1	0.90	0.90	0.90	102
accuracy			0.89	184
macro avg	0.89	0.89	0.89	184
weighted avg	0.89	0.89	0.89	184

## PREDICTION PERFORMANCE RESULTS COMPARISON OF MACHINE LEARNING MODELS FOR HEART DISEASE DETECTION

NU-SVC Model Results	Gradient Boosting Model Results	XG Boosting Model Results	ExtraTree Classifier Model	Random Forrest Model Results	Stacked ModelResults
F1 Score Test 0.89	F1 Score Test 0.96	F1 Score Test 0.99	F1 Score Train 1.00	F1 Score Test 0.88	F1 Score Test 0.90
F1 Score Train 0.87	F1 Score Train 0.94	F1 Score Train 0.99	Train Accuracy 1.00	F1 Score Train 1.00	F1 Score Train 0.99
Precision 0.87	Precision 0.96	Precision 0.99	F1 Score Test 0.89	Precision 0.87	Precision 0.89
Recall 0.87	Recall 0.96	Recall 0.99	Precision 0.88	Recall 0.87	Recall 0.89
Test Accuracy 0.88	Test Accuracy 0.95	Test Accuracy 0.99	Recall 0.88	Test Accuracy 0.87	Test Accuracy 0.89
Train Accuracy 0.85	Train Accuracy 0.94	Train Accuracy 0.99	Test Accuracy 0.88	Train Accuracy 1.00	Train Accuracy 0.99