

**VISVESVARAYA TECHNOLOGICAL UNIVERSITY**

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***A PROJECT REPORT ON***

**“CORONAVIRUS DETECTION USING MACHINE LEARNING”**

*Submitted in the partial fulfillment of the requirement for the award of the degree of*

**BACHELOR OF ENGINEERING**

*In*

**INFORMATION SCIENCE & ENGINEERING**

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**(2021-22)**

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(An ISO 9001:2008 Certified Institute)  
(Affiliated to Visvesvaraya Technological University, Belagavi)  
**DEPARTMENT OF INFORMATION SCIENCE & ENGINEERING**



**CERTIFICATE**

Certified that project work entitled

**“CORONA VIRUS DETECTION USING MACHINE LEARNING”**

Carried out by

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The students of “**RajaRajeswari College of Engineering**” in partial fulfillment for the award of **Bachelor of Engineering in Information Science & Engineering** of the Visvesvaraya Technological University, Belagavi during the year **2021–2022**. It is certified that all corrections/suggestions indicated for Internal Assessment have been incorporated in the report deposited in the departmental library. The Project report has been approved as it satisfies the academic requirements in respect of project work prescribed for the Eighth semester.

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## **ABSTRACT**

The Coronavirus Disease originated in Wuhan City, Hubei Province, China on December 31, 2019, with pneumonia of unknown variant, but drastically evolved into a pandemic. This disease was named as COVID-19 and the virus is called SARS CoV2. Most corona viruses affect the animals, but because of their zoonotic nature, it is possible that, it can also be transmitted to people. Severe Acute Respiratory Syndrome Corona virus (SARSCoV) and Severe Acute Respiratory Syndrome Corona virus (MERSCoV) are the main causes of severe respiratory disease and death in humans. Asymptomatic patients are the vital source of spreading infection.

The method currently used for corona virus (COVID19) detecting is RTPCR. Chest X-rays, plays a crucial role in the early diagnosis and treatment of Covid-19 disease. Various AI techniques have been applied successfully in predicting the virus. Machine learning based models are implemented to identify the possible threat of Covid-19 all over the world. The researchers had made a statement that the combination of scientific photographic features and laboratory effects will help in early detection of the corona virus (COVID19).

## ACKNOWLEDGEMENT

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## CHAPTER 1

### INTRODUCTION

The Coronavirus disease which is called as the COVID-19 is a highly contagious viral illness which is caused by severe acute respiratory syndrome SARS-CoV-2. Coronavirus are considered to be the family of viruses that cause illness such as respiratory diseases or gastrointestinal diseases and can also cause death. The first cases of this predominantly respiratory viral illness were first reported in Wuhan, Hubei Province, China, in late December 2019. Thereafter when this spread across the world in a short span of time, compelled the World Health Organization (WHO) to declare the outbreak as a global pandemic on the March 11, 2020. Globally as of December 2021, there have been 280,119,931 confirmed cases of COVID-19, including 5,403,662 deaths, reported by WHO.

The COVID-19 is broadly spread by the dust particles and fomites while close unsafe touch between an infector and the infected person happens. The virus travels in respiratory droplets released into air when an infected person coughs, sneezes, talks or breathes near you and a person can be affected by inhaling these droplets. The Airborne distribution for COVID-19 has not been recorded as it is not known to be a significant transmission. Fast spreading has been seen in certain patients, and the active virus has been reported in a small number of clinical studies. Symptoms of COVID-19 are variable, often include fever, cough, headache, difficulty in breathing, loss of smell and taste and few more. By wearing masks in public, keeping distance from others and by often sanitizing themselves, we can reduce the chances of infection being spread. The WHO continues to encourage each and every individual to take care of their own health and also protect others by following all the guidelines generated.

## 1.1 EXISTING SYSTEM

Using existing systems to detect COVID19. Prediction of the symptoms of COVID is done by using various machine learning models such as Naïve Bayes Classifier, Support Vector Machine (SVM), Decision Tree (DT) and Random Forest (RT).

### DRAWBACKS:

- The main challenge faced was, the requirement for the detection of COVID-19 cases with a standard symptom is not verified.
- The main drawback was limited number of samples, and it's not adequate to train and test the model with better accuracy.
- Some of the limitations are susceptible to selection bias among patients, and patients with very slight symptoms are excepted from the study.
- Failed to analyze the high dimensional datasets.
- It was found that the Polynomial Regression model produced the best accuracy of 90%. Still 90% accuracy is not sufficient for medical data analysis.

## 1.2 PROPOSED SYSTEM

Now-a-days the raising covid cases and its complexity in detecting it is posing a greater pressure on the health department with several thousands of samples for testing and timely report generation for them.

This problem can be automated using our proposed system with an efficient algorithm such as K Nearest Neighbors. Here we use [UI] user interface and take the input from users which are basically the symptoms they are facing (which may or may not be covid).

Later we clean the acquired data using some of the libraries from pandas and load these data from processing in the form of datasets to machine learning models. These datasets help to visualize the data clearly and process it accurately. After processing the predicted output is displayed.



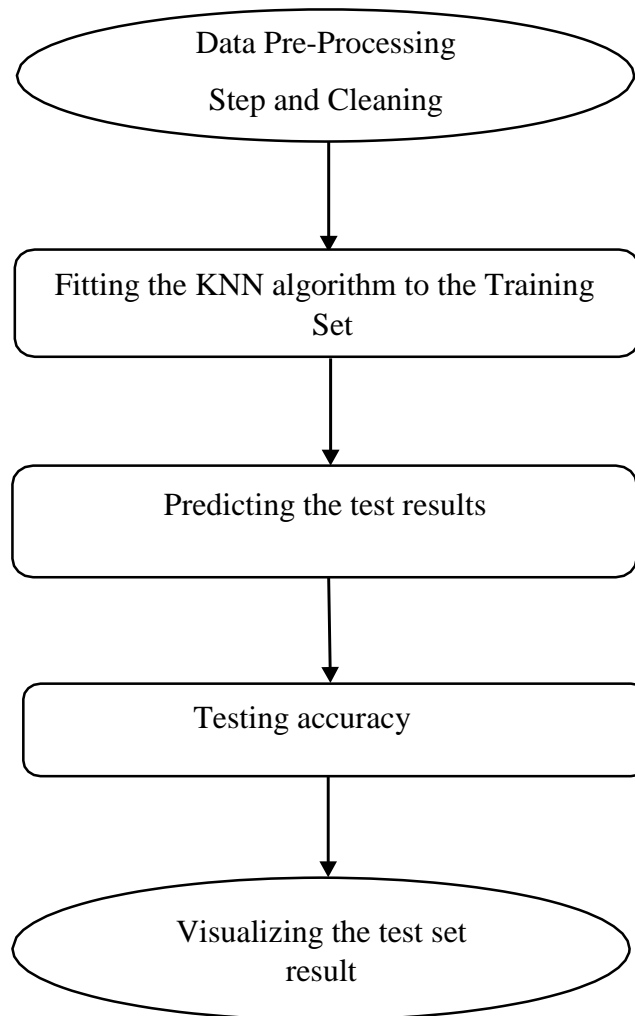


Figure 1.2.1: Proposed KNN System

**ADVANTAGES:**

- The standard symptoms of covid-19 detection cases are **verified effectively**.
- Increasing the **prediction accuracy to 90%+ efficiency** using K Nearest Neighbors Machine Learning technique.
- Based on the we can easily **detect multi-class prediction**.
- Accurate output prediction will be **useful and fruit-full for humanity** and to detect the virus in the early stage and save lot of lives.
- K Nearest Neighbors performs **better compared** to other models like logistic regression and you need **less training data**.

### 1.3 MOTIVATION OF THE PROJECT

**Machine Learning Techniques** are very useful in tracing the COVID-19 cases by predicting the cases and diagnosing it with proper medications, developing alerting systems for generating social distance and few others for controlling the spread of this virus. There are few mechanisms that available to analyze and detect COVID-19 but give the result **with approximately 90% accuracy rate**. Even both the **Reverse Transcription Polymerase Chain Reaction (RT-PCR) and CT scan** for the COVID-19 identification are defective and **are found to have faults**.

Therefore, the **main motive** or the objective of this project is to **effectively improve the prediction of the coronavirus disease** with the **combination of various methods** and by designing a mechanism with the help of the **Machine Learning algorithms** such as the **K Nearest Neighbors**, where it detects whether the individual is suffering with COVID-19 or not at early stages itself and helping in predicting the severity of the COVID-19 positive patients as well.

### 1.4 OBJECTIVE OF THE PROJECT

The main objectives of the project are:

- The main objective of the project is detecting the COVID-19 symptoms in patients using **K Nearest Neighbors**.
- Increasing the prediction accuracy to **90%** efficiency using **K Nearest Neighbors ML technique**.
- The standard symptoms of covid-19 detection cases are verified effectively. Based on the value of we can easily detect multi-class prediction.

**CHAPTER 2****LITERATURE SURVEY**

<b>Sl no.</b>	<b>Author's Name</b>	<b>Title of the Paper</b>	<b>Journal Name</b>	<b>Year of Publication</b>	<b>Advantages</b>	<b>Drawbacks</b>
1	Rohini M, Naveena K R, Jothipriya G, Kameshwaran S, Jagadeeswari M	A Comparative Approach to predict Corona Virus using Machine Learning. <b>"Base Paper"</b>	International Conference on Artificial Intelligence and Smart Systems (ICAIS-2021)	2021	This work helped in the study of COVID-19 outbreak that has utilized many Machine Learning classification results that visualizing the origin of this disease and by performing predictions which helped to control the impact of this disease in future.	Could have provided better results by using several other Machine Learning models and techniques for finding estimates that helped the clinicians, medical and Governmental Organizations to look forward for real-time preparations.
2	Sugandh Bhatia, Jyoteesh Malhotra	Naïve Bayes Classifier for predicting the Novel Coronavirus.	Third International Conference on Intelligent Communication Technologies and Virtual Mobile Networks (ICICV 2021)	2021	The objective was to design a mechanism for detecting and predicting the COVID-19 disease using Naïve Bayes classifier to decide and detect whether a person is suffering with COVID-19 or not.	It wasn't possible to find out both the cases of coronavirus, which are with the symptomatic or asymptomatic as it is the only way to break the chain in order to control the spread of coronavirus.

Sl. no	Author's Name	Title of the Paper	Journal Name	Year of Publication	Advantages	Drawbacks
3	Chekuri Sri Sumanth, Rudra Kalyan Nayak	Machine Intelligent Techniques for COVID-19 Detection: A Critical Review and Analysis.	12th International Conference on Computing Communication and Networking Technologies (ICCCNT)	2021	The survey here is on the COVID 19 diagnosis with a chain of CT scan pictures obtained from the COVID-19 data sets by using ML algorithms like marine predator, simplified suspected infected recovered (SIR), image acquisition, and few other techniques of ML.	This work would have been very much useful if it was embedded with two or more models with proper compatibility to the dataset to have gotten even more better results while detecting COVID 19. This will help the human race too.
4	Hina Gull, Gomathi Krishna, May Issa Aldossary, Sardar Zafar Iqbal	Severity Prediction of COVID-19 Patients using Machine Learning Classification.	6 <sup>th</sup> International Conference on Computer and Communications (ICCC)	2020	Support Vector Machine (SVM) was identified the better classification algorithm in order to predict the severity of the disease. The early detection of the COVID patients, support the concerned authorities to take better action in prior. And also this helped to isolate the affected people as early as possible.	The main challenge faced in this study was, the basic requirement for the detection of coronavirus cases with a standard symptom was not verified as these cases have been difficult to obtain in the present situation

Sl no.	Author's Name	Title of the Paper	Journal Name	Year of Publication	Advantages	Drawbacks
5	Akshay Kumar Siddhu, Dr.Ashok Kumar and Dr.Shakti Kundu	Detection of COVID-19 from Medical images and/or Symptoms of Patient using Machine Learning Approaches.	9 <sup>th</sup> International Conference System Modeling and Advancement in Research Trends (SMART)	2020	It is mainly focused to select the best Deep Learning models in order to detect the segment of the lungs and to predict the COVID-19 patients using the Deep Learning techniques.	If in case there was the availability of more public databases, then better Deep Learning models could have been developed to detect and predict the COVID-19 accurately, thus helping to develop the best performing model.

## CHAPTER 3

# SYSTEM REQUIREMENTS AND SPECIFICATION

### 3.1 SYSTEM ANALYSIS

System analysis is nothing but a process which is responsible for grouping, interpreting and collecting the facts, identifying and solving the problems and further decomposing the system into its components. The main aim of the system analysis is to get to know about the system and its parts for the purpose of identifying its objectives and it is a technique which helps the system to work efficiently in order to accomplish their purpose. The main focus is basically on **Systems, Processes** and **Technology**.

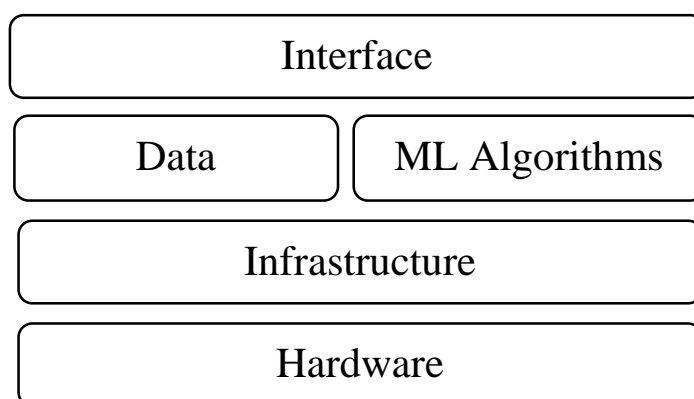


Figure 3.1.1: Schematic Diagram for ML Systems

### 3.2 FUNCTIONAL REQUIREMENTS

In order to enable the success of a system, the requirement analysis is a very important process. The functional requirements are those where there are demands put on by the end user based on the basic facilities that the system should provide or offer. This is a type of requirement where one can see the **final product directly**.

- **Software Interface:** An interactive UI is required for interaction between user and system designed.
- **Software Interface:** Python packages required for Modeling, Interfacing and Data extraction is needed.

### 3.3 NON-FUNCTIONAL REQUIREMENTS

A non-functional requirement is that where the quality attributes of the system must be satisfied in accordance with the project contract. The attributes like **usability** and **effectiveness** of the system entirely is essential in a non-functional requirement. There can be possibility where the satisfaction of the user needs fails when the system fails to meet non-functional requirements.

The non-functional requirement mainly deals with the issues like **flexibility, reliability, scalability, security** etc. It helps in the verification of performance of the software. For example, when the number of simultaneous users are greater than 10000, the site should load in 3 seconds.

- **Efficiency:** The Machine Learning algorithm prediction ability must be greater than 90% for accurate results.
- **Portability:** The system is designed to work on a computer system with low processing capacities and also independent OS.
- **Scalability:** The current system will be system dependent and hence any cloud platform can be used to scale up to any device by hosting the same system.
- **Robustness:** The data applied to the Machine Learning algorithm should train the model for all data vulnerabilities.

### 3.4 TOOLS AND TECHNOLOGY REQUIRED

#### ➤ **HARDWARE REQUIREMENTS:**

- Processor : AMD Ryzen 3 or more
- Random Access Memory(RAM) : 512 MB or more
- Processor Speed : 250Mhz to 830Mhz
- Hard Disk : 1GB Recommended

#### ➤ **SOFTWARE REQUIREMENTS:**

- Operating system : Windows 10 or above
- Editor : Python 3.7 and above interpreter and compiler
- Python Packages : Tkinter, Scikit Learn, Pandas, Numpy and Matplotlib

## CHAPTER 4

### SYSTEM DESIGN

#### 4.1 SYSTEM ARCHITECTURE:

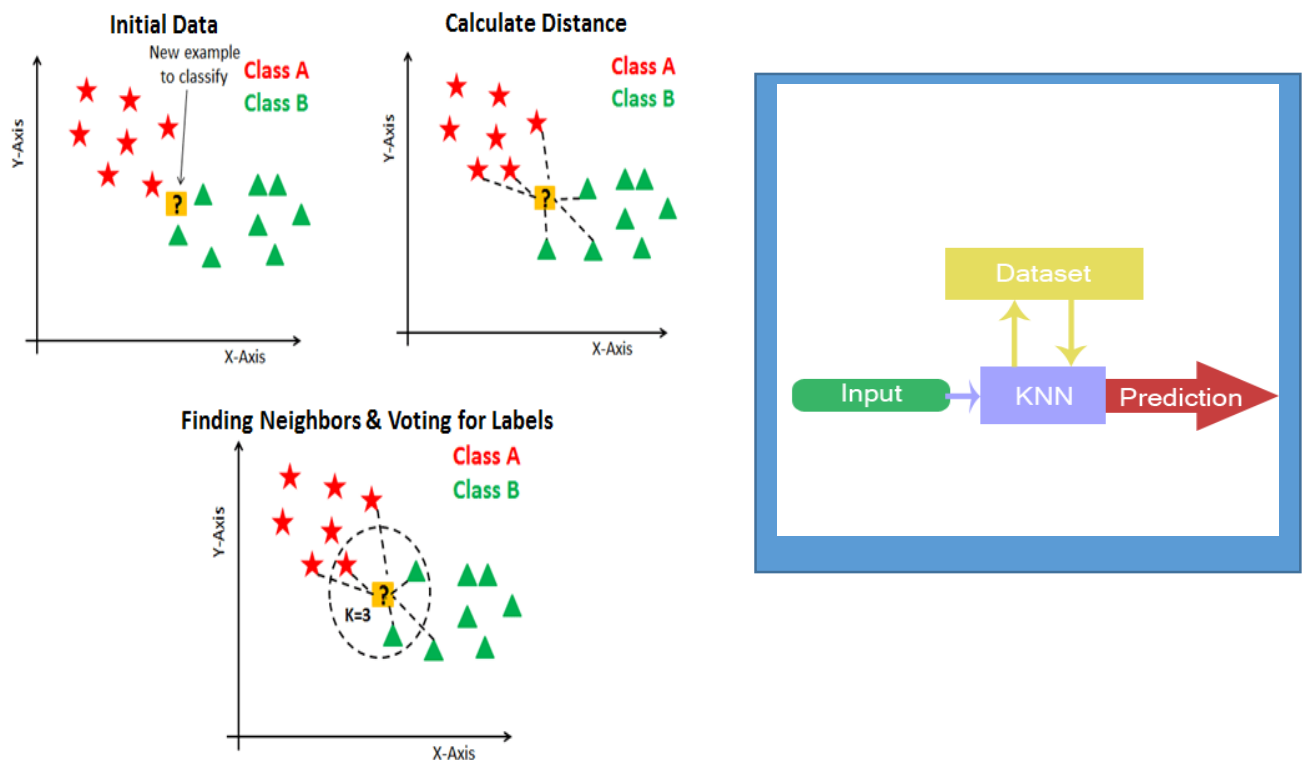


Figure 4.1.1: System Architecture

#### 4.2 INPUT/OUTPUT DESIGN:

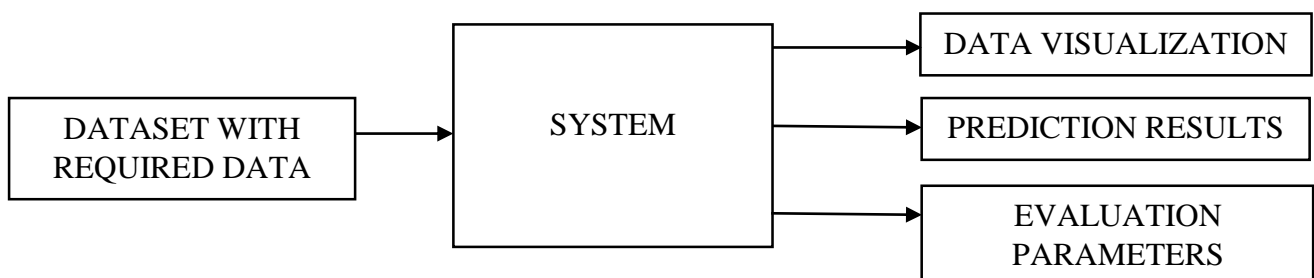


Figure 4.2.1: Input/ Output Design

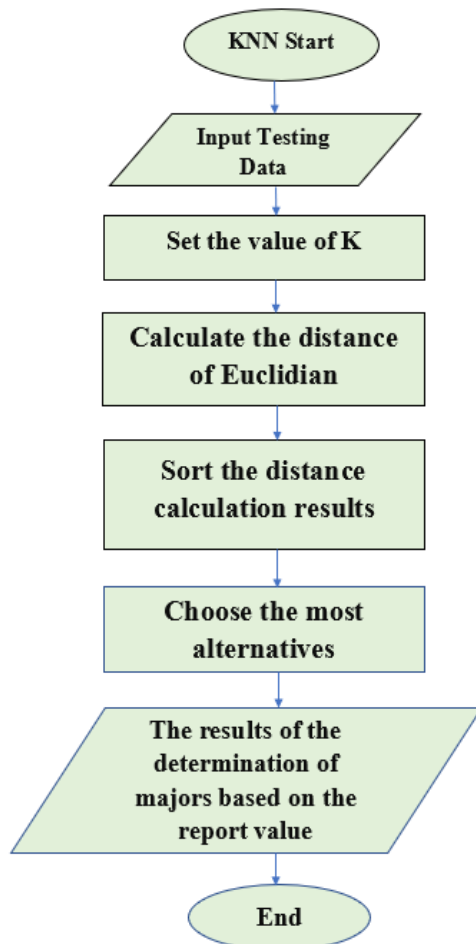


### 4.3 ALGORITHM:

#### ALGORITHM TO BE IMPLEMENTED: K Nearest Neighbors for The Prediction Of COVID- 19

- **Step-1:** Start
- **Step-2:** Select the number K of the neighbor.
- **Step-3:** Calculate the Euclidean distance of **K number of neighbors**.
- **Step-4:** Take the K nearest neighbors as per the calculated Euclidean distance.
- **Step-5:** Among these k neighbors, count the number of the data points in each category.
- **Step-6:** Assign the new data points to that category for which the number of the neighbor is maximum.
- **Step-7:** End

#### FLOW CHART:



$$\text{Euclidean distance} = \sqrt{\sum_{i=1}^n (x_i - y_i)^2}$$

Figure 4.3.1: KNN Flow Chart

## CHAPTER 5

### SYSTEM IMPLEMENTATION

#### 5.1 MODULE DESCRIPTION:

##### ➤ DATA ACQUISITION AND CLEANING:

Data Acquisition means collecting the data from the relevant sources before it can be stored. Data Cleaning refers to identification and correction of the errors in the datasets that may negatively or wrongly impact a predictive model.

##### ➤ DATA VISUALIZATION:

Data Visualization means graphically representing the data and information in a graphical or pictorial formats like maps, charts, graphs. Data Visualization enables the users to see and understand the pattern and trends in data and outliers.

##### ➤ DATA MODELLING:

The data that are cleaned and processed has to be trained to recognize certain types of patterns. Here we train a model over datasets by, providing it an algorithm so that it can use to reason over and learn from those datasets.

##### ➤ TESTING:

Testing is the process where the performance of a fully trained model is evaluated. The tested data provides a final and real-world check of an unseen data to confirm that the Machine Learning algorithm was trained productively.

##### ➤ COMPARISON AND MEASUREMENT:

Here the objective is to compare the result of the testing with other Machine Learning algorithms and choose the best algorithm that suits the data. Hence, the performance of the algorithm is efficient.

### 1) **LR:**

Logistic regression predicts the output of a categorical dependent variable. Therefore, the outcome must be a categorical or discrete value. It can be either Yes or No, 0 or 1, true or False, etc. but instead of giving the exact value as 0 and 1, **it gives the probabilistic values which lie between 0 and 1.** Logistic Regression is much similar to the Linear Regression except that how they are used. Linear Regression is used for solving Regression problems, whereas **Logistic regression is used for solving the classification problems.**

#### Assumptions for Logistic Regression:

- The dependent variable must be categorical in nature. The independent variable should not have multi-collinearity

$$\log \left[ \frac{y}{1-y} \right] = b_0 + b_1x_1 + b_2x_2 + b_3x_3 + \dots + b_nx_n$$

- The above equation is the final equation for Logistic Regression

### 2) **LDA:**

**Linear Discriminant Analysis** or **Normal Discriminant Analysis** or **Discriminant Function Analysis** is a dimensionality reduction technique that is commonly used for supervised classification problems. It is used for modelling differences in groups i.e. separating two or more classes. It is used to project the features in higher dimension space into a lower dimension space. But Linear Discriminant Analysis fails when the mean of the distributions are shared, as it becomes impossible for LDA to find a new axis that makes both the classes linearly separable. In such cases, we use non-linear discriminant analysis.

### 3) **CART:**

The CART algorithm is a type of classification algorithm that is required to build a decision tree on the basis of Gini's impurity index. It is a basic machine learning algorithm and provides a wide variety of use cases. A statistician named Leo Breiman coined the phrase to describe Decision Tree algorithms that may be used for classification or regression predictive modeling issues.

CART is an umbrella word that refers to the following types of decision trees:

- **Classification Trees:** When the target variable is continuous, the tree is used to find the "class" into which the target variable is most likely to fall.
- **Regression trees:** These are used to forecast the value of a continuous variable.

**4) NAÏVE BAYES CLASSIFIER:**

- Basically, Naïve Bayes is a model of conditional probability.
- It is possible to classify an instance of given problem which is denoted by a vector  $X = (x_1, \dots, x_n)$  where  $n$  represents features of independent variables.
- Results were accumulated and when the test data was provided, we receive the probabilities for various classes on the basis of provided symptom details.

**5) SVM:**

Support Vector Machine or SVM is one of the most popular Supervised Learning algorithms, which is used for Classification as well as Regression problems. However, primarily, it is used for Classification problems in Machine Learning. The goal of the SVM algorithm is to create the best line or decision boundary that can segregate  $n$ -dimensional space into classes so that we can easily put the new data point in the correct category in the future. This best decision boundary is called a hyperplane.

**Types of SVM****SVM can be of two types:**

- **Linear SVM:** Linear SVM is used for linearly separable data, which means if a dataset can be classified into two classes by using a single straight line, then such data is termed as linearly separable data, and classifier is used called as Linear SVM classifier.
- **Non-linear SVM:** Non-Linear SVM is used for non-linearly separated data, which means if a dataset cannot be classified by using a straight line, then such data is termed as non-linear data and classifier used is called as Non-linear SVM classifier.
- The Gini Index, which is used to find the information gained by selecting an attribute. The Gini Index favours larger partitions and is calculated for  $i = 1$  to the  $n$ , number of attributes:
- $Gini = 1 - \sum(p_i)$  Here,  $p$  is the probability that a tuple in  $D$  belongs to the class  $C_i$ .

**6) K NEAREST NEIGHBORS:**

K- Nearest Neighbors algorithm is a non- parametric supervised learning method. It is used for classification and regression. In both cases, the input consists of the  $k$  closest training examples in a data set.

## CHAPTER 6

### SYSTEM TESTING

#### 6.1 SYSTEM TESTING:

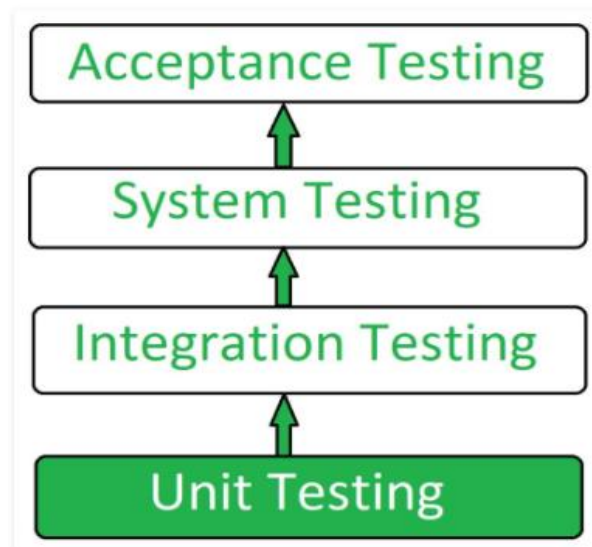


Figure 6.1.1: System Testing

#### 6.2 UNIT TESTING:

**Unit Testing** is a software testing technique by which individual units of software (i.e., group of computer program modules, usage procedures and operating procedures) are tested to determine whether they are suitable for use or not.

It is a testing method or procedure using which each and every independent module are tested to determine if there are any issue by the developer himself. It is correlated with functional correctness of the independent modules.

##### The objectives of Unit Testing are:

- To isolate and test a section of code.
- To detect the correctness of code.
- To test all the function and procedure present.
- To fix bug early in development cycle and to reduce expenditure.
- To help the developers to understand the code base and enable them to make changes quickly.
- To facilitate for code reuse.

**❖ Advantages of Unit Testing:**

- Unit Testing allows developers to learn the functionality and gain a basic understanding of the unit API.
- It allows the programmer to refine code and make sure the module works properly.
- It enables to test parts of the project without waiting for others to complete.

**6.3 INTEGRATION TESTING**

The second level of the software testing process is Integration testing which comes after unit testing. In this, units or individual components of the software are tested in a group. The focus of the integration testing level is to expose defects at the time of interaction between integrated components or units.

**➤ Types of Integration Testing:**

Integration testing can be classified into two parts:

- **Incremental integration testing**
- **Non-incremental integration testing**

**➤ Advantages:**

Successful integration of modules.

- **Data integrity.**
- **User-based scenarios.**
- **Third-party testing.**

## CHAPTER 7

## SNAPSHOTS

test_date	cough	fever	sore_thro	shortness	head_ach	corona_re	age_60_a	gender	test_indication
03-03-2022	0	0	0	0	0	1	0	2	1
03-03-2022	0	0	0	0	0	1	0	1	1
03-03-2022	0	0	0	0	0	1	0	1	1
03-03-2022	0	0	0	0	0	1	0	2	1
03-03-2022	0	0	0	0	0	1	0	2	2
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03-03-2022	1	0	1	0	1	1	0	2	1
03-03-2022	0	0	0	0	0	1	0	2	1
03-03-2022	0	0	0	0	0	1	0	2	1

Figure 7.1: Datasets Stored in CSV Format

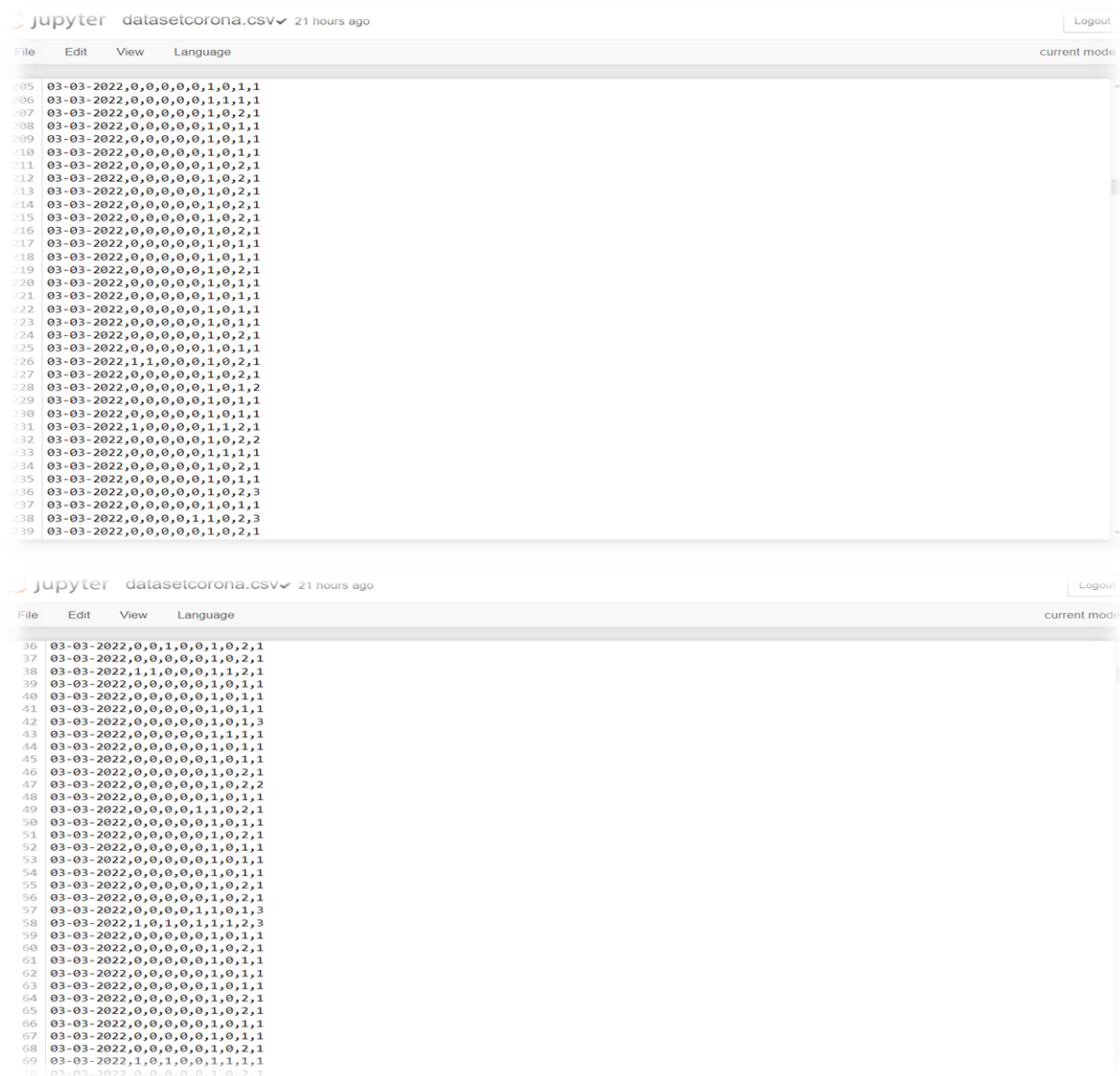
Jupyter datasetcorona.csv ✓ 21 hours ago Logout

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```

1 test_date,cough,fever,sore_throat,shortness_of_breath,head_ache,corona_result,age_60_and_above,gender,test_indication
2 03-03-2022,0,0,0,0,0,1,0,2,1
3 03-03-2022,0,0,0,0,0,1,0,1,1
4 03-03-2022,0,0,0,0,0,1,0,1,1
5 03-03-2022,0,0,0,0,0,1,0,2,1
6 03-03-2022,0,0,0,0,0,1,0,2,2
7 03-03-2022,0,0,0,0,0,1,0,2,2
8 03-03-2022,0,0,0,0,0,1,0,2,1
9 03-03-2022,1,1,1,0,1,1,0,2,1
10 03-03-2022,1,1,0,0,0,1,1,2,3
11 03-03-2022,0,0,0,0,0,1,0,1,1
12 03-03-2022,0,0,0,0,0,1,0,1,1
13 03-03-2022,0,0,0,0,0,1,0,1,1
14 03-03-2022,0,0,0,0,0,1,0,1,1
15 03-03-2022,0,0,0,0,0,1,0,2,1
16 03-03-2022,1,0,0,0,0,1,0,2,3
17 03-03-2022,0,0,0,0,0,1,0,1,1
18 03-03-2022,0,0,0,0,0,1,0,1,2
19 03-03-2022,0,0,0,0,0,1,0,1,2
20 03-03-2022,0,0,1,0,0,1,0,2,1
21 03-03-2022,0,0,0,0,0,0,1,2,1
22 03-03-2022,0,0,1,0,1,1,0,2,3
23 03-03-2022,0,0,0,0,0,1,0,1,2
24 03-03-2022,1,0,0,0,0,1,1,2,1
25 03-03-2022,0,1,0,0,0,1,0,2,1
26 03-03-2022,0,0,0,0,0,1,0,1,1
27 03-03-2022,0,0,0,0,0,1,0,1,1
28 03-03-2022,0,0,0,0,0,1,0,2,1
29 03-03-2022,1,0,1,0,1,1,0,2,1
30 03-03-2022,0,0,0,0,0,1,0,2,1
31 03-03-2022,0,0,0,0,0,1,0,2,1
32 03-03-2022,0,0,0,0,0,1,0,2,1
33 03-03-2022,0,0,0,0,0,1,0,1,1
34 03-03-2022,0,0,0,0,0,1,0,1,1
35 03-03-2022,0,0,0,0,0,1,0,1,1

```



datasetcorona.csv 21 hours ago

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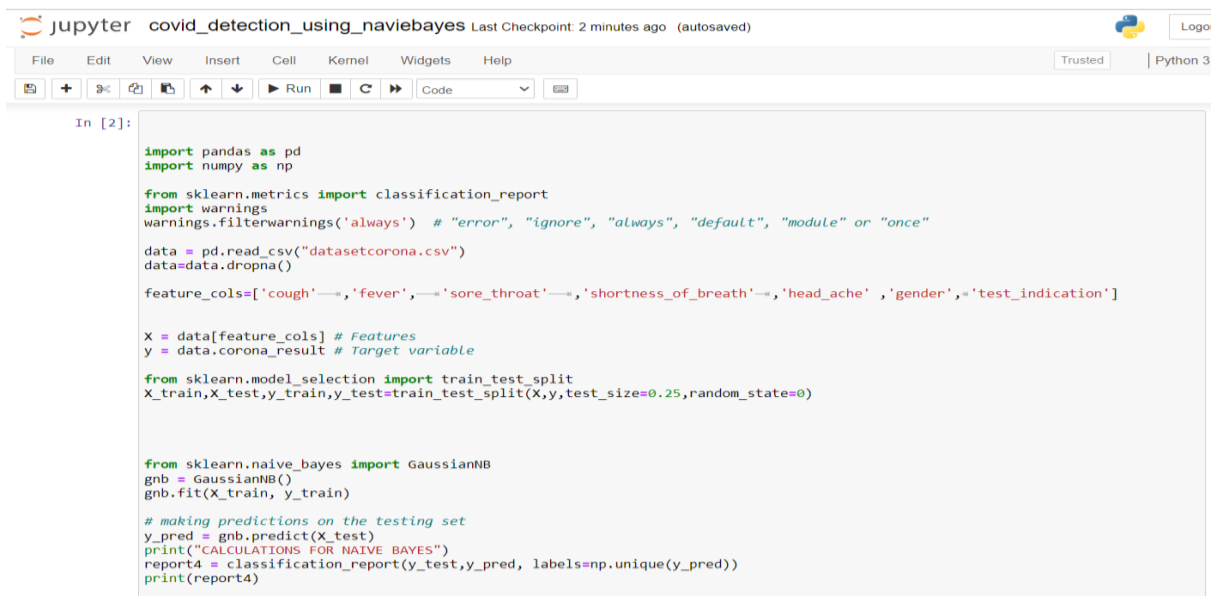
205 03-03-2022,0,0,0,0,0,1,0,1,1  
 206 03-03-2022,0,0,0,0,0,1,1,1,1  
 207 03-03-2022,0,0,0,0,0,1,0,2,1  
 208 03-03-2022,0,0,0,0,0,1,0,1,1  
 209 03-03-2022,0,0,0,0,0,1,0,1,1  
 210 03-03-2022,0,0,0,0,0,1,0,1,1  
 211 03-03-2022,0,0,0,0,0,1,0,2,1  
 212 03-03-2022,0,0,0,0,0,1,0,2,1  
 213 03-03-2022,0,0,0,0,0,1,0,2,1  
 214 03-03-2022,0,0,0,0,0,1,0,2,1  
 215 03-03-2022,0,0,0,0,0,1,0,2,1  
 216 03-03-2022,0,0,0,0,0,1,0,2,1  
 217 03-03-2022,0,0,0,0,0,1,0,1,1  
 218 03-03-2022,0,0,0,0,0,1,0,1,1  
 219 03-03-2022,0,0,0,0,0,1,0,2,1  
 220 03-03-2022,0,0,0,0,0,1,0,1,1  
 221 03-03-2022,0,0,0,0,0,1,0,1,1  
 222 03-03-2022,0,0,0,0,0,1,0,1,1  
 223 03-03-2022,0,0,0,0,0,1,0,1,1  
 224 03-03-2022,0,0,0,0,0,1,0,2,1  
 225 03-03-2022,0,0,0,0,0,1,0,1,1  
 226 03-03-2022,1,1,0,0,0,1,0,2,1  
 227 03-03-2022,0,0,0,0,0,1,0,2,1  
 228 03-03-2022,0,0,0,0,0,1,0,1,2  
 229 03-03-2022,0,0,0,0,0,1,0,1,1  
 230 03-03-2022,0,0,0,0,0,1,0,1,1  
 231 03-03-2022,1,0,0,0,0,1,1,2,1  
 232 03-03-2022,0,0,0,0,0,1,0,2,2  
 233 03-03-2022,0,0,0,0,0,1,1,1,1  
 234 03-03-2022,0,0,0,0,0,1,0,2,1  
 235 03-03-2022,0,0,0,0,0,1,0,1,1  
 236 03-03-2022,0,0,0,0,0,1,0,2,3  
 237 03-03-2022,0,0,0,0,0,1,0,1,1  
 238 03-03-2022,0,0,0,0,1,1,0,2,3  
 239 03-03-2022,0,0,0,0,0,1,0,2,1

datasetcorona.csv 21 hours ago

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36 03-03-2022,0,0,1,0,0,1,0,2,1  
 37 03-03-2022,0,0,0,0,0,1,0,2,1  
 38 03-03-2022,1,1,0,0,0,1,1,2,1  
 39 03-03-2022,0,0,0,0,0,1,0,1,1  
 40 03-03-2022,0,0,0,0,0,1,0,1,1  
 41 03-03-2022,0,0,0,0,0,1,0,1,1  
 42 03-03-2022,0,0,0,0,0,1,0,1,3  
 43 03-03-2022,0,0,0,0,0,1,1,1,1  
 44 03-03-2022,0,0,0,0,0,1,0,1,1  
 45 03-03-2022,0,0,0,0,0,1,0,1,1  
 46 03-03-2022,0,0,0,0,0,1,0,2,1  
 47 03-03-2022,0,0,0,0,0,1,0,2,2  
 48 03-03-2022,0,0,0,0,0,1,0,1,1  
 49 03-03-2022,0,0,0,0,1,1,0,2,1  
 50 03-03-2022,0,0,0,0,0,1,0,1,1  
 51 03-03-2022,0,0,0,0,0,1,0,2,1  
 52 03-03-2022,0,0,0,0,0,1,0,1,1  
 53 03-03-2022,0,0,0,0,0,1,0,1,1  
 54 03-03-2022,0,0,0,0,0,1,0,1,1  
 55 03-03-2022,0,0,0,0,0,1,0,2,1  
 56 03-03-2022,0,0,0,0,0,1,0,2,1  
 57 03-03-2022,0,0,0,0,1,1,0,1,3  
 58 03-03-2022,1,0,1,0,1,1,1,2,3  
 59 03-03-2022,0,0,0,0,0,1,0,1,1  
 60 03-03-2022,0,0,0,0,0,1,0,2,1  
 61 03-03-2022,0,0,0,0,0,1,0,1,1  
 62 03-03-2022,0,0,0,0,0,1,0,1,1  
 63 03-03-2022,0,0,0,0,0,1,0,1,1  
 64 03-03-2022,0,0,0,0,0,1,0,2,1  
 65 03-03-2022,0,0,0,0,0,1,0,2,1  
 66 03-03-2022,0,0,0,0,0,1,0,1,1  
 67 03-03-2022,0,0,0,0,0,1,0,1,1  
 68 03-03-2022,0,0,0,0,0,1,0,2,1  
 69 03-03-2022,1,0,1,0,0,1,1,1,1  
 70 03-03-2022,0,0,0,0,0,1,0,2,1

Figure 7.2: Datasets



jupyter covid\_detection\_using\_naviebayes Last Checkpoint: 2 minutes ago (autosaved)

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In [2]:

```
import pandas as pd
import numpy as np

from sklearn.metrics import classification_report
import warnings
warnings.filterwarnings('always') # "error", "ignore", "always", "default", "module" or "once"

data = pd.read_csv("datasetcorona.csv")
data=data.dropna()

feature_cols=['cough'==>,'fever'==>,'sore_throat'==>,'shortness_of_breath'==>,'head_ache' , 'gender',='test_indication']

X = data[feature_cols] # Features
y = data.corona_result # Target variable

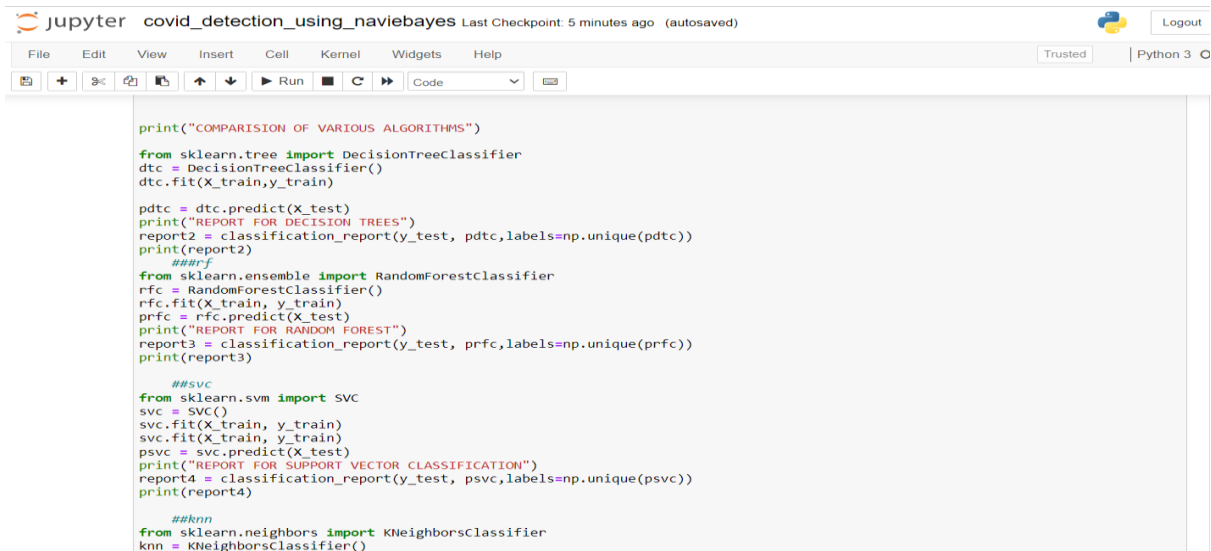
from sklearn.model_selection import train_test_split
X_train,X_test,y_train,y_test=train_test_split(X,y,test_size=0.25,random_state=0)

from sklearn.naive_bayes import GaussianNB
gnb = GaussianNB()
gnb.fit(X_train, y_train)

# making predictions on the testing set
y_pred = gnb.predict(X_test)
print("CALCULATIONS FOR NAIVE BAYES")
report4 = classification_report(y_test,y_pred, labels=np.unique(y_pred))
print(report4)
```

Figure 7.3: Import libraries &amp; making prediction on testing set





```

jupyter covid_detection_using_naivebayes Last Checkpoint: 5 minutes ago (autosaved)

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print("COMPARISION OF VARIOUS ALGORITHMS")

from sklearn.tree import DecisionTreeClassifier
dtc = DecisionTreeClassifier()
dtc.fit(X_train,y_train)

pdtc = dtc.predict(X_test)
print("REPORT FOR DECISION TREES")
report2 = classification_report(y_test, pdtc,labels=np.unique(pdtc))
print(report2)

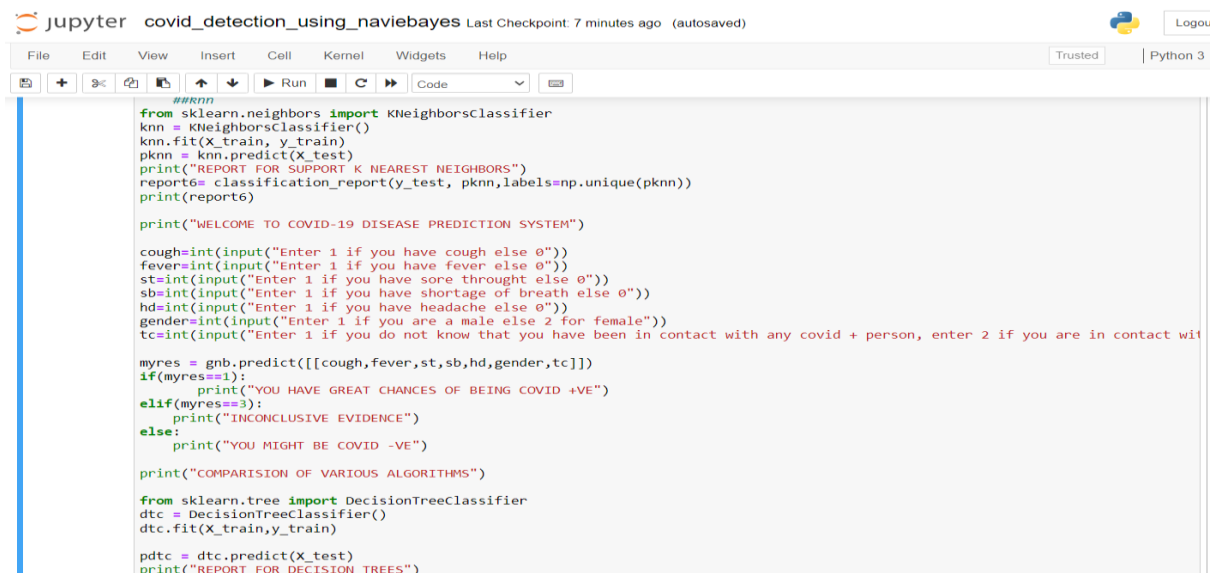
from sklearn.ensemble import RandomForestClassifier
rfc = RandomForestClassifier()
rfc.fit(X_train, y_train)
prfc = rfc.predict(X_test)
print("REPORT FOR RANDOM FOREST")
report3 = classification_report(y_test, prfc,labels=np.unique(prfc))
print(report3)

from sklearn.svm import SVC
svc = SVC()
svc.fit(X_train, y_train)
psvc = svc.predict(X_test)
print("REPORT FOR SUPPORT VECTOR CLASSIFICATION")
report4 = classification_report(y_test, psvc,labels=np.unique(psvc))
print(report4)

from sklearn.neighbors import KNeighborsClassifier
knn = KNeighborsClassifier()

```

Figure 7.3.1: Comparison of various algorithms



```

jupyter covid_detection_using_naivebayes Last Checkpoint: 7 minutes ago (autosaved)

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from sklearn.neighbors import KNeighborsClassifier
knn = KNeighborsClassifier()
knn.fit(X_train, y_train)
pknn = knn.predict(X_test)
print("REPORT FOR SUPPORT K NEAREST NEIGHBORS")
report6 = classification_report(y_test, pknn,labels=np.unique(pknn))
print(report6)

print("WELCOME TO COVID-19 DISEASE PREDICTION SYSTEM")

cough=int(input("Enter 1 if you have cough else 0"))
fever=int(input("Enter 1 if you have fever else 0"))
st=int(input("Enter 1 if you have sore throat else 0"))
sb=int(input("Enter 1 if you have shortage of breath else 0"))
hd=int(input("Enter 1 if you have headache else 0"))
gender=int(input("Enter 1 if you are a male else 2 for female"))
tc=int(input("Enter 1 if you do not know that you have been in contact with any covid + person, enter 2 if you are in contact with"))

myres = gnb.predict([[cough,fever,st,sb,hd,gender,tc]])
if(myres==1):
    print("YOU HAVE GREAT CHANCES OF BEING COVID +VE")
elif(myres==3):
    print("INCONCLUSIVE EVIDENCE")
else:
    print("YOU MIGHT BE COVID -VE")

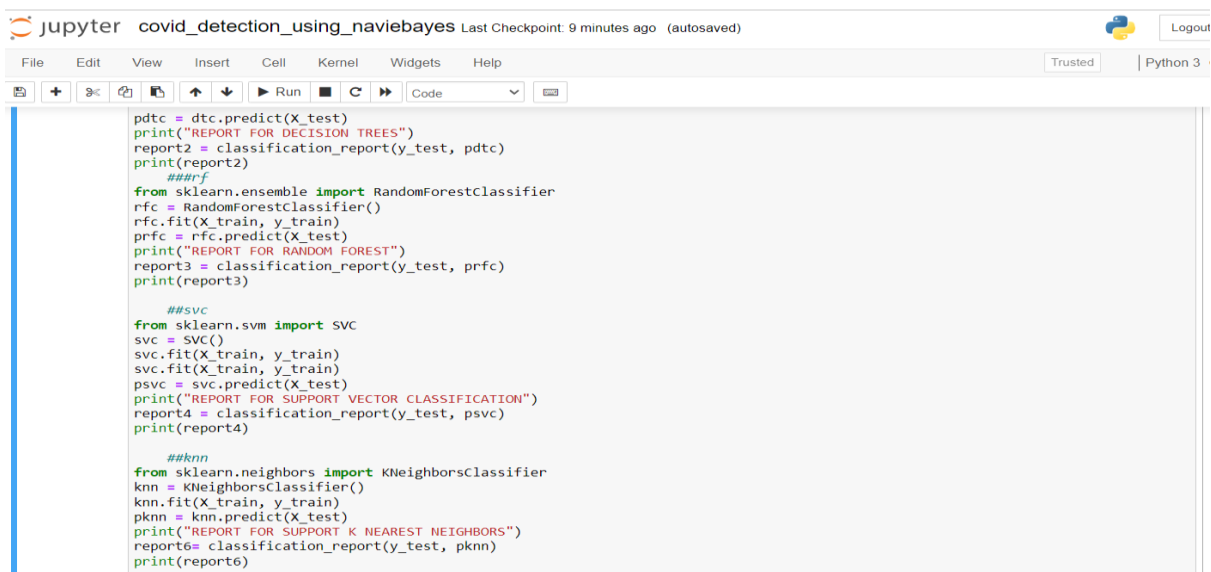
print("COMPARISION OF VARIOUS ALGORITHMS")

from sklearn.tree import DecisionTreeClassifier
dtc = DecisionTreeClassifier()
dtc.fit(X_train,y_train)

pdtc = dtc.predict(X_test)
print("REPORT FOR DECISION TREES")

```

Figure 7.3.2: Taking inputs from users



```

jupyter covid_detection_using_naivebayes Last Checkpoint: 9 minutes ago (autosaved)

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pdtc = dtc.predict(X_test)
print("REPORT FOR DECISION TREES")
report2 = classification_report(y_test, pdtc)
print(report2)

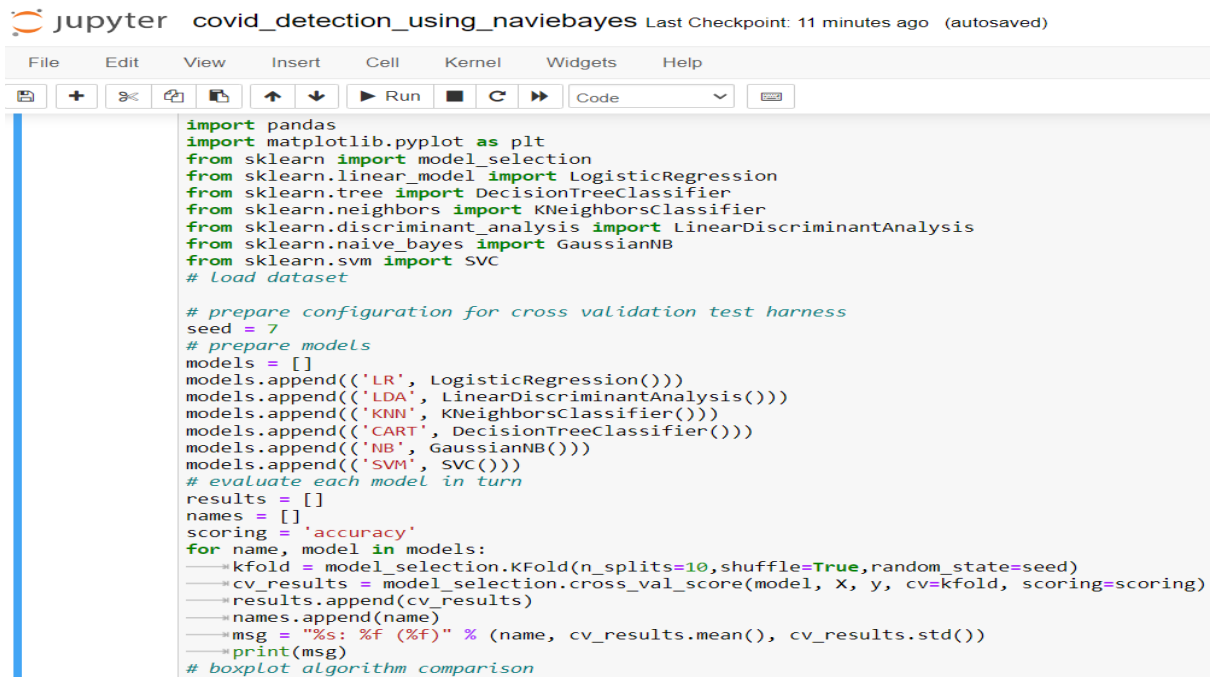
from sklearn.ensemble import RandomForestClassifier
rfc = RandomForestClassifier()
rfc.fit(X_train, y_train)
prfc = rfc.predict(X_test)
print("REPORT FOR RANDOM FOREST")
report3 = classification_report(y_test, prfc)
print(report3)

from sklearn.svm import SVC
svc = SVC()
svc.fit(X_train, y_train)
psvc = svc.predict(X_test)
print("REPORT FOR SUPPORT VECTOR CLASSIFICATION")
report4 = classification_report(y_test, psvc)
print(report4)

from sklearn.neighbors import KNeighborsClassifier
knn = KNeighborsClassifier()
knn.fit(X_train, y_train)
pknn = knn.predict(X_test)
print("REPORT FOR SUPPORT K NEAREST NEIGHBORS")
report6 = classification_report(y_test, pknn)
print(report6)

```

Figure 7.3.3: Calculating to prepare configuration for CV



The image shows a Jupyter Notebook window titled 'covid\_detection\_using\_naviebayes'. The interface includes a menu bar (File, Edit, View, Insert, Cell, Kernel, Widgets, Help) and a toolbar with icons for file operations, running cells, and other functions. The code in the notebook cell is as follows:

```
import pandas
import matplotlib.pyplot as plt
from sklearn import model_selection
from sklearn.linear_model import LogisticRegression
from sklearn.tree import DecisionTreeClassifier
from sklearn.neighbors import KNeighborsClassifier
from sklearn.discriminant_analysis import LinearDiscriminantAnalysis
from sklearn.naive_bayes import GaussianNB
from sklearn.svm import SVC
# load dataset

# prepare configuration for cross validation test harness
seed = 7
# prepare models
models = []
models.append(('LR', LogisticRegression()))
models.append(('LDA', LinearDiscriminantAnalysis()))
models.append(('KNN', KNeighborsClassifier()))
models.append(('CART', DecisionTreeClassifier()))
models.append(('NB', GaussianNB()))
models.append(('SVM', SVC()))
# evaluate each model in turn
results = []
names = []
scoring = 'accuracy'
for name, model in models:
    kfold = model_selection.KFold(n_splits=10, shuffle=True, random_state=seed)
    cv_results = model_selection.cross_val_score(model, X, y, cv=kfold, scoring=scoring)
    results.append(cv_results)
    names.append(name)
    msg = "%s: %f (%f)" % (name, cv_results.mean(), cv_results.std())
    print(msg)
# boxplot algorithm comparison
```

### 7.3.4: Model preparation and evaluation

```
# boxplot algorithm comparison
fig = plt.figure()
fig.suptitle('Algorithm Comparison')
ax = fig.add_subplot(111)
plt.boxplot(results)
ax.set_xticklabels(names)
plt.show()
```

### 7.4: Boxplot algorithm comparison

CALCULATIONS FOR NAIVE BAYES				
	precision	recall	f1-score	support
0	0.40	1.00	0.58	57
1	0.93	0.14	0.24	102
3	0.00	0.00	0.00	2
accuracy			0.44	161
macro avg	0.45	0.38	0.27	161
weighted avg	0.73	0.44	0.36	161
COMPARISION OF VARIOUS ALGORITHMS				
REPORT FOR DECISION TREES				
	precision	recall	f1-score	support
0	0.00	0.00	0.00	57
1	0.62	0.96	0.76	102
micro avg	0.61	0.62	0.61	159
macro avg	0.31	0.48	0.38	159
weighted avg	0.40	0.62	0.49	159
REPORT FOR RANDOM FOREST				
	precision	recall	f1-score	support
1	0.63	1.00	0.78	102
micro avg	0.63	1.00	0.78	102
macro avg	0.63	1.00	0.78	102
weighted avg	0.63	1.00	0.78	102

Figure 7.5: Output comparing various algorithm

REPORT FOR SUPPORT VECTOR CLASSIFICATION				
	precision	recall	f1-score	support
1	0.63	1.00	0.78	102
micro avg	0.63	1.00	0.78	102
macro avg	0.63	1.00	0.78	102
weighted avg	0.63	1.00	0.78	102
REPORT FOR SUPPORT K NEAREST NEIGHBORS				
	precision	recall	f1-score	support
0	0.26	0.28	0.27	57
1	0.57	0.55	0.56	102
micro avg	0.45	0.45	0.45	159
macro avg	0.41	0.41	0.41	159
weighted avg	0.46	0.45	0.45	159
WELCOME TO COVID-19 DISEASE PREDICTION SYSTEM				
Enter 1 if you have cough else 0 <input type="text"/>				

Figure 7.5.1: Output on report for SVC &amp; KNN

WELCOME TO COVID-19 DISEASE PREDICTION SYSTEM  
 Enter 1 if you have cough else 01  
 Enter 1 if you have fever else 00  
 Enter 1 if you have sore throat else 01  
 Enter 1 if you have shortage of breath else 00  
 Enter 1 if you have headache else 00  
 Enter 1 if you are a male else 2 for female2

Enter 1 if you do not know that you have been in contact with any covid + person, enter 2 if you are in contact with abroad person, enter 3 if you are direct contact of covid +ve person

Figure 7.5.2: User input details

YOU HAVE GREAT CHANCES OF BEING COVID +VE					
COMPARISION OF VARIOUS ALGORITHMS					
REPORT FOR DECISION TREES					
	precision	recall	f1-score	support	
0	0.00	0.00	0.00	57	
1	0.62	0.96	0.76	102	
3	0.00	0.00	0.00	2	
accuracy			0.61	161	
macro avg	0.21	0.32	0.25	161	
weighted avg	0.40	0.61	0.48	161	
REPORT FOR RANDOM FOREST					
	precision	recall	f1-score	support	
0	0.00	0.00	0.00	57	
1	0.63	0.97	0.76	102	
3	0.00	0.00	0.00	2	

Figure 7.5.3: Report for Decision Tree

	1	0.62	0.96	0.76	102
	3	0.00	0.00	0.00	2
accuracy				0.61	161
macro avg	0.21	0.32	0.25		161
weighted avg	0.40	0.61	0.48		161
REPORT FOR RANDOM FOREST					
	precision	recall	f1-score	support	
0	0.00	0.00	0.00	57	
1	0.63	0.97	0.76	102	
3	0.00	0.00	0.00	2	
accuracy				0.61	161
macro avg	0.21	0.32	0.25		161
weighted avg	0.40	0.61	0.48		161
REPORT FOR SUPPORT VECTOR CLASSIFICATION					

Figure 7.5.4: Report for Random Forest

	precision	recall	f1-score	support
0	0.00	0.00	0.00	57
1	0.63	1.00	0.78	102
3	0.00	0.00	0.00	2
accuracy			0.63	161
macro avg	0.21	0.33	0.26	161
weighted avg	0.40	0.63	0.49	161

REPORT FOR SUPPORT K NEAREST NEIGHBORS

	precision	recall	f1-score	support
0	0.26	0.28	0.27	57
1	0.57	0.55	0.56	102
3	0.00	0.00	0.00	2
accuracy			0.45	161
macro avg	0.27	0.28	0.28	161

Figure 7.5.5: Report for SVC

weighted avg	0.40	0.63	0.49	161
--------------	------	------	------	-----

REPORT FOR SUPPORT K NEAREST NEIGHBORS

	precision	recall	f1-score	support
0	0.26	0.28	0.27	57
1	0.57	0.55	0.56	102
3	0.00	0.00	0.00	2
accuracy			0.45	161
macro avg	0.27	0.28	0.28	161
weighted avg	0.45	0.45	0.45	161

LR: 0.665745 (0.036537)  
LDA: 0.659495 (0.031227)  
KNN: 0.678053 (0.047075)  
CART: 0.650144 (0.029682)  
NB: 0.405938 (0.044483)  
SVM: 0.665745 (0.036537)

Figure 7.5.6: Report for Support KNN

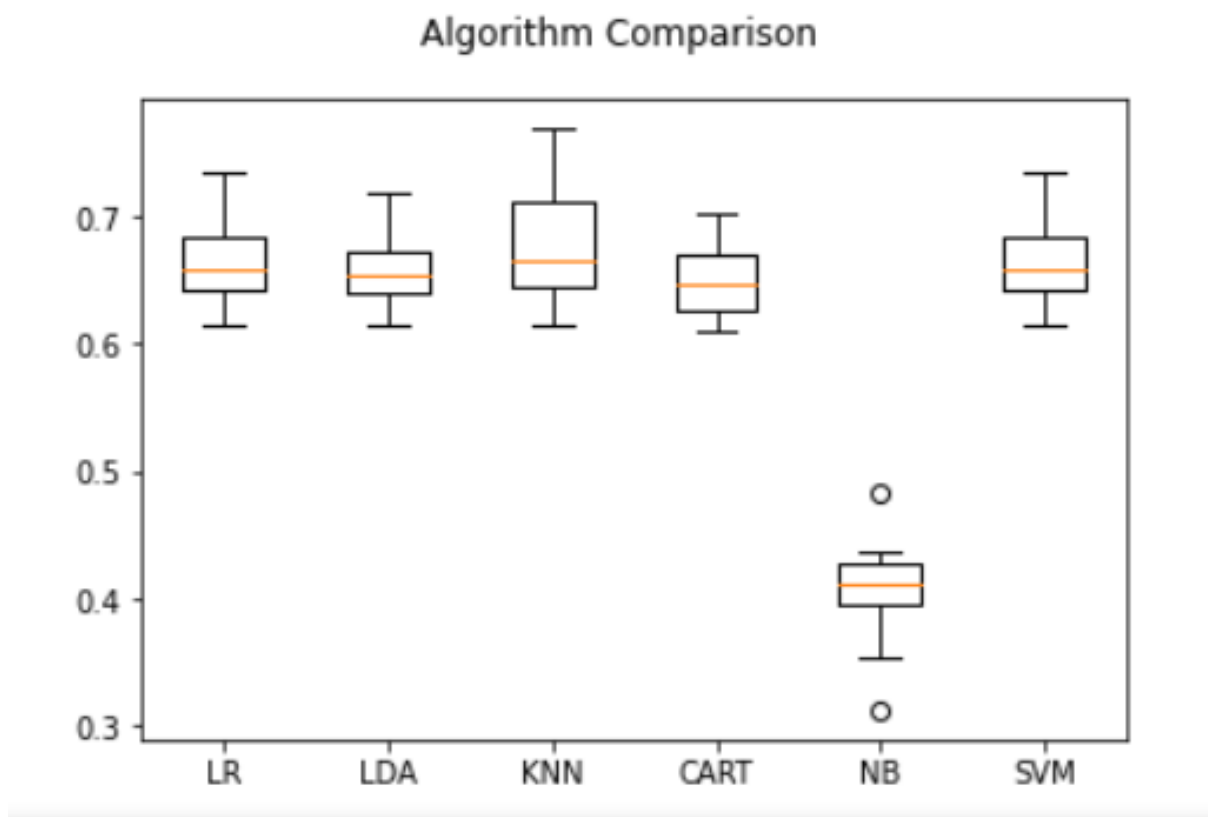


Figure 7.6: Accuracy of all Algorithms

## CHAPTER 8

### CONCLUSION

Coronavirus Pandemic now appears to be the most serious infected spreading disease like any other wide-spread diseases. Because of drastic rise in the number of COVID-19 cases during pandemic, it has caused severe problems in the healthcare sector to come up with appropriate and suitable treatment solutions. Machine Learning methodologies are used as a different method for classification and prediction of virus. In our project the supervised Machine Learning classification model for COVID-19 virus developed using K Nearest Neighbors algorithm. The data mining techniques can be implemented with the K Nearest Neighbors algorithm which plays a prominent role in diagnosing the COVID-19 or coronavirus infection which is declared as pandemic by World Health Organization.

By implementing K Nearest Neighbors algorithm in our project we can conclude that,

- The standard symptoms of covid-19 detection cases are verified effectively.
- Increasing the prediction accuracy to 90%+ efficiency using K Nearest Neighbors Machine Learning technique.
- Based on the value we can easily detect multi-class prediction.
- K Nearest Neighbors performs better compared to other models like LR, LDA, CART, NB and SVM with less training data.
- Accurate output prediction will be useful and fruit-full for humanity and to detect the virus in the early stage and save lot of lives.



## **REFERENCES:**

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