A Project/Dissertation Review Report

on

COVID-19 DATA ANALYSIS

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

BACHELOR OF ENGINEERING



Under The Supervision of Name of Supervisor: <u>Dr. S.Srinivasan</u> Designation: <u>Professor</u>

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CANDIDATE'S DECLARATION

I/We hereby certify that the work which is being presented in the thesis/project/dissertation, entitled "Covid-

19 Data Analysis" in partial fulfillment of the requirements for the award of the Bachelor of Technology

submitted in the School of Computing Science and Engineering of Galgotias University, Greater Noida, is an

original work carried out during the period of 2 months, under the supervision of **Dr. S.Srinivasan**

Designation - Professor Department of Computer Science and Engineering/Computer Application and

Information and Science, of School of Computing Science and Engineering , Galgotias University, Greater

Noida

The matter presented in the thesis/project/dissertation has not been submitted by me/us for the award of

any other degree of this or any other places.

Harshit Kaushik 18SCSE1010411 Manish

Tiwari 18SCSE1010687

This is to certify that the above statement made by the candidates is correct

to the best of my knowledge.

Dr.S.Srinivasan Professor

CERTIFICATE

The Final Thesis/Project/ Dissertation Viva-Voce examination of Harshit Kaushik 18SCSE1010411 and

Manish Tiwari 18SCSE1010687 has been held on 05-12-2021 and his/her work is recommended for the

award of Bachelor of Technology.

Signature of Examiner(s)

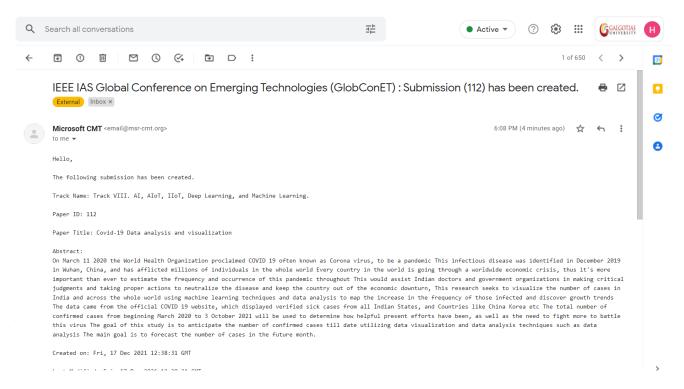
Signature of Supervisor(s)

Signature of Project Coordinator

Signature of Dean

Date: 05-12-2021 Place: Greater Noida

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ABSTRACT

The outbreak of COVID-19 in different parts of the world is a major concern for all the administrative units of respective countries. India is also facing this very tough task for controlling the virus outbreak and has managed its growth rate through some strict measures India reported its first Covid-19 case on 30th Jan 2020 and the number of cases reported heavily escalated from March, 2020.

This project on **COVID -19 data analysis** is initially at a global level and then drills down to the scenario obtained in India. Data is gathered from multiple data sources-several authentic government websites. The need of the hour is to accurately forecast when the numbers will reach at its peak and then diminish. It will be of huge help to public welfare professionals to plan the preventive measures to be taken keeping the economic balance of the country as well. Variables A comparative analysis is also done to understand which model fits the best for our data. Data is considered till date. The project is giving an estimate of the day on which we can expect the number of active cases to reach its peak and also when the curve will start to flatten. This is unique feature of analysis in this project.

What we are trying to do in this project is that we are going to import an already given data in the form of a CSV and XLSX file and then visualise it constantly at every step using an Python package known as covid19.analytics which is a library collection for covid19 data function and it will show the deaths recovered latitude and longitude and various details of that place. We also use different libraries in this like pandas, matplotlib, plotly and many more

We will have time series Forecasting techniques and we will analyzing the summary reports of different countries in same time period which includes death rate, growth rate, recovered and a comparative analysis is also done to understand which model fits best for our data.

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Introduction

COVID-19, or more commonly known as the Novel Corona Virus is transmitted to the "Nidovirus" family, or "Nidovirales". COVID-19 is associated with a respiratory disorder that has been declared a global epidemic in the first quarter of 2020 by the World Health Organization. The most common signs or symptoms of COVID-19 are fever, fatigue, dry cough, pain and soreness, nasal congestion, runny nose or sore throat. COVID-19 is a "contagious" disease and can be passed through droplets from the nose or mouth when an infected person coughs or breathes and this is a major reason to keep a distance of 1m (3 feet) from the infected person.

According to the latest data, there are currently more than 48.8 million people infected with the Novel Corona Virus worldwide and approximately 145M people are reported from different parts of the world. On January 30, 2020, India reported its first case of coronavirus in Kerala when a student returned from Wuhan (epicenter of coronavirus) and until then the number of cases had increased dramatically. In recent times there is vaccine available especially for the treatment of COVID-19 and it is currently under investigation. This paper analyses the current practice of COVID-19.

Scope/objective

This study will be useful to the Government of India and various regions of India, Administrative Units of India, Indian Frontline health workers, researchers and scientists. This study will also be useful for foreign governance units to consider various factors related to COVID-19 outspread in their regions.

Our main objective is to create a system that can provide a summary report, output (pie chart and bar graph), totals per location, growth rate, totals plot, world map. of cases in each country, SIR model (susceptible infected recovered).

This study attempts to work at a comprehensive level to analyse the spread of COVID19 in India.

To answer a variety of research questions, specific methods were used that included different data sets, data sources, modelling techniques and outcome variability.

Literature Survey

According to the various papers available in the literature, there are some studies that focus on trend analysis and forecasting for the Indian region. The study on the Indian region presents long-term and short-term trends respectively. These studies use time series data from the John Hopkins University database and present forecasts using the ARIMA model, exponential smoothing methods, the SEIR model, and the regression model. In addition, studies in the Indian region from the past are more focused on presenting time series analysis based on aggregate data for the Indian region.

Similarly, there are other mathematical models that were developed to analyze COVID-19 outbreak trends in India. A model was presented to study the effect of social distinction on age and gender of patients in India. It compared the demographics of the country between India, Italy and China and suggested the weakest age categories and gender groups among all countries. The study also predicted an increase in infected cases with different lockdown periods in India. Similarly, a network structure approach was used by one of the studies to see if a specific node cluster was formed. But only travel data nodes were considered by the authors to examine which major areas are affecting Indian travellers returning to India. Also, the study presented the SIR model to see the rate of spread of corona virus among patients in India. Analysis on testing laboratories and infrastructure was also presented by earlier authors.

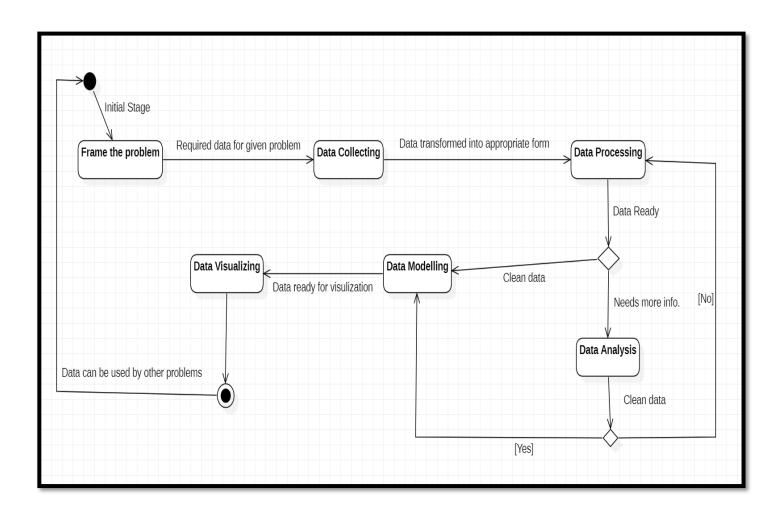
The work of medical doctors and frontline health workers was also presented by some studies. It was found that in India, the role of health workers was less emphasized as the stages of the spread of the corona virus were still in two or more stages, such as community broadcasting compared to other countries such as Italy, Spain and the United States .

Apart from India, some models are also available for other countries mainly for China, Italy and USA as the number of infected patients was high. The study worked on various mathematical models to determine the spread of the disease, predicted the number of infected patients, commented on each country's preparedness to deal with the spread of COVID-19, and the pattern of the flattened curve under different conditions Searched A lot of research for the world stage is still in its first phase and is yet to be reviewed.

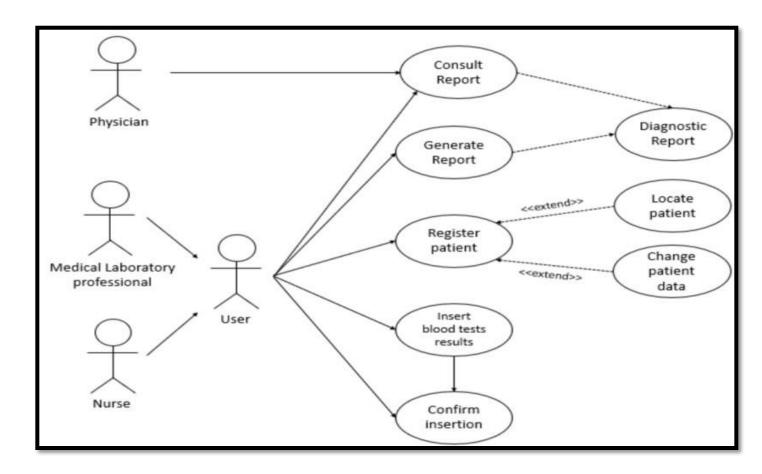
In relation to the research activities conducted in the Indian region, the study remains to work on the impact of various policies working towards the control of the corona virus. Therefore, this study attempts to work on a broader level for the analysis of COVID19 spread in India.

Project Design

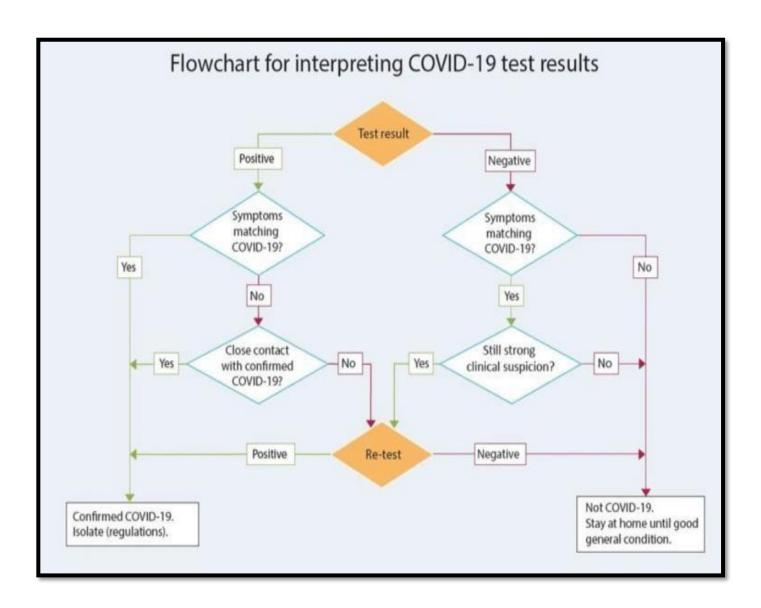
UML Diagram



Use-Case Diagram



Flow Diagram



Problem Formulation

The number of COVID-19 cases in India is increasing rapidly. National and local authorities have a difficult time compiling a pattern, analyzing and predicting the spread of COVID19 in India. The main purpose of this paper is to draw a statistical model to better understand the spread of COVID-19 in India by a careful study of the reported cases.

As we know some efforts have been made for the analysis of the spread of Covid-19. We aim to create a system that can provide a summary report, output (pie chart and bar graph), totals per location, growth rate, totals plot, incoming world map. of cases in each country, the SIR model (susceptible infected recovered) and predicts the appropriate number of cases in the future. Therefore, we can prepare and take steps to protect ourselves.

Tools used for implementation

Hardware Required:

- PC/LAPTOP.
- PC/LAPTOP having ram of at least 4 GB free space of 2 GB.
- PC/LAPTOP should have internet connectivity before executing the project.

Software Required:

- Anaconda Navigator
- Jupyter Notebook
- Libraries/Packages:
 - Pandas
 - matplotlib.pyplot
 - matplotlib
 - plotly
 - cufflinks
 - folium

Feasibility Analysis

The corona virus epidemic (covid-19) presents a range of challenges for ongoing clinical trials, including new and non-standard causes of disappearance, including essentially high rates of missing outcome data. The International Drug Trial Guidelines advise testers to review plans for dealing with missing data in conduct and statistical analysis, but lack clear recommendations. Since the virus is new to us and little is known about it, there may be discrepancies in predictions because the data is not very accurate and therefore not giving an approximate number. Minor to major changes may occur in infected people in the future.

Complete Work Plan Layout

• 1st Phase

We will start by writing the programming part on Jupyter Notebook on covid-19 data analysis in which first we will install some libraries(Pandas, matplotlib.pyplot ,matplotlib, plotly etc) from packages which will help in understanding the analysis of the covid-19. In this analysis first we will be storing inbuilt data functions of particular libraries in function by saving it and it will gave information about the confirmed cases, cured cases, total per location, totals plot, deaths of people through covid-19 pandemic along with names of cities with their latitudes and longitudes giving us the exact location. Then we will be producing a timeseries summary report of top 10 countries which has the following details: For Confirmed Cases and For Death Cases we will represent:

- Countries and Cities reported
- Graphical outputs showing in the form of graphs and pie-chart
- Comparison of cases with global percentage and for predicting upcoming threat.

• 2nd Phase

Gathering multiple review papers i.e. about 50 and then we will be skimming through them, picking important points and connecting the gaps between them and in the final phase we will use time series forecasting in order to predict the future of Covid - 19 in India.

Modules Description

Data Collection

Data collection is defined as the procedure of collecting, measuring and analyzing accurate insights for research using standard validated techniques. A researcher can evaluate their hypothesis on the basis of collected data. In most cases, data collection is the primary and most important step for research, irrespective of the field of research. The approach of data collection is different for different fields of study, depending on the required information.

The most critical objective of data collection is ensuring that information-rich and reliable data is collected for statistical analysis so that data-driven decisions can be made for research.

Data Analysis

Data analysis is the practice of working with data to glean useful information, which can then be used to make informed decisions.

As the data companies have available to them continues to grow in both amount and complexity, so does the need for an effective and efficient process by which to harness the value of that data. The analysis method typically moves through several iterative phases. Let's take a closer look at each.

Identify the business question you'd like to answer. What problem is the company trying to solve? What do you need to measure, and how will you measure it?

Collect the raw data sets you'll need to help you answer the identified question. Data

collection might come from internal sources, like a company's client relationship management (CRM) software, or from secondary sources, like government records or social media application programming interfaces (APIs).

Clean the data to prepare it for analysis. This often involves purging duplicate and anomalous data, reconciling inconsistencies, standardizing data structure and format, and dealing with white spaces and other syntax errors.

Analyze the data. By manipulating the data using various data analysis techniques and tools, you can begin to find trends, correlations, outliers, and variations that begin to tell a story. During this stage, you might use data mining to discover patterns within databases or data visualization software to help transform data into an easy-to-understand graphical format.

Interpret the results of your analysis to see how well the data answered your original question. What recommendations can you make based on the data? What are the limitations to your conclusions?

Prediction using ML

"Prediction" refers to the output of an algorithm after it has been trained on a historical dataset and applied to new data when forecasting the likelihood of a particular outcome, such as whether or not a customer will churn in 30 days. The algorithm will generate probable values for an unknown variable for each record in the new data, allowing the model builder to identify what that value will most likely be.

The word "prediction" can be misleading. In some cases, it really does mean that you are predicting a future outcome, such as when you're using machine learning to determine the next best action in a marketing campaign. Other times, though, the "prediction" has to do with, for example, whether or not a transaction that already occurred was fraudulent. In that case, the transaction already happened, but you're making an educated guess about whether or not it was legitimate, allowing you to take the appropriate action.

Algorithms used in this research in order to study and analyze the Covid-19 trends in order to predict the upcoming situations are:

- 1) Linear Regression Algorithm
- 2) Polynomial Regression Algorithm
- 3) Support Vector Regression Algorithm

i) Linear Regression

Because of its straightforward representation, linear regression is a popular model. The representation is a linear equation that combines a collection of input values (x), with the solution being the projected output for that set of input values (y). As a result, both the input (x) and output (y) values are numeric.

Each input value or column is assigned one scale factor, referred to as a coefficient and denoted by the capital Greek letter Beta in the linear equation (B). One more coefficient is added, which gives the line an extra degree of freedom (for example, going up and down on a two-dimensional plot) and is known as the intercept or bias coefficient.

For example, in a simple regression problem (with only one x and one y), the model would have the following form:

$$y = B0 + B1*x$$

When there are several inputs (x) in higher dimensions, the line is called a plane or a hyper-plane. As a result, the representation is the equation's form as well as the coefficients' specific values (e.g. B0 and B1 in the above example).

The complexity of a regression model, such as linear regression, is frequently discussed. The number of coefficients utilized in the model is referred to as this.

When a coefficient becomes zero, it effectively removes the input variable's influence on the model and, as a result, the model's prediction (0 * x = 0). This is important to consider when considering regularization strategies, which alter the learning algorithm to minimize the complexity of regression models by exerting pressure on the absolute magnitude of the coefficients and driving some to zero. By applying Linear Regression algorithm on our accurate dataset we achieve a accuracy rate of 82 percent.

ii) Polynomial Regression

Polynomial Regression is a regression approach that uses an nth degree polynomial to represent the connection between a dependent(y) and independent variable(x). The equation for polynomial regression is as follow:

$$y = b_0 + b_1 x_1 + b_2 x_1^2 + b_2 x_1^3 + \dots b_2 x_1^n$$

In machine learning, it's also known as the specific case of Multiple Linear Regression. Because we turn the Multiple Linear Regression equation into Polynomial Regression by adding certain polynomial terms.

It's a linear model that's been tweaked a little to improve accuracy.

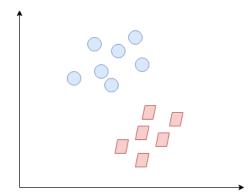
The training dataset for polynomial regression is non-linear in character.

To fit the intricate and non-linear functions and datasets, it employs a linear regression model. "In Polynomial regression, the original features are converted into Polynomial features of the desired degree (2,3,...,n) and then modeled using a linear model," explains the author. By applying this algorithm to study and investigate the covid-19 dataset it gives us the accuracy of about 99 percent which is very great but the only drawback that comes with this algorithm is that it can linearly increase but it will not be able to take good curves when the case will start decreasing all of a sudden. So in order to rise above it we will try another algorithm which is support vector regression

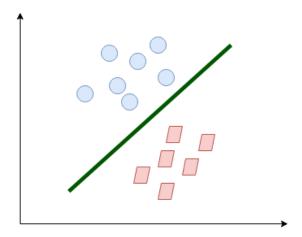
iii) Support Vector Regression

Support Vector Machines (SVM) are commonly employed in machine learning for categorization challenges.

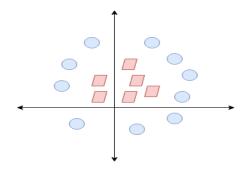
So, what is a Support Vector Machine (SVM) and how does it work? Let's start with a basic understanding of SVM. Assume we have a plot with two label classes, as illustrated in the diagram:



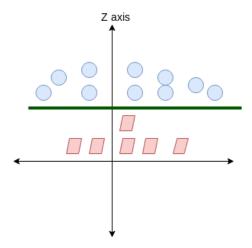
Can you decide where the dividing line will be drawn? You could have thought of this:



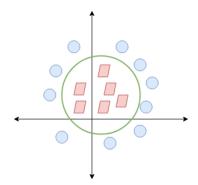
The line effectively divides the classes. Simple class separation is essentially what SVM accomplishes. Now, here's what the data looked like:



There isn't a straightforward line separating these two classes in this case. As a result, we'll expand our dimension and add a new dimension to the z-axis. These two classes can now be distinguished:



This line maps to the circular boundary when we transfer it back to the original plane, as shown here:



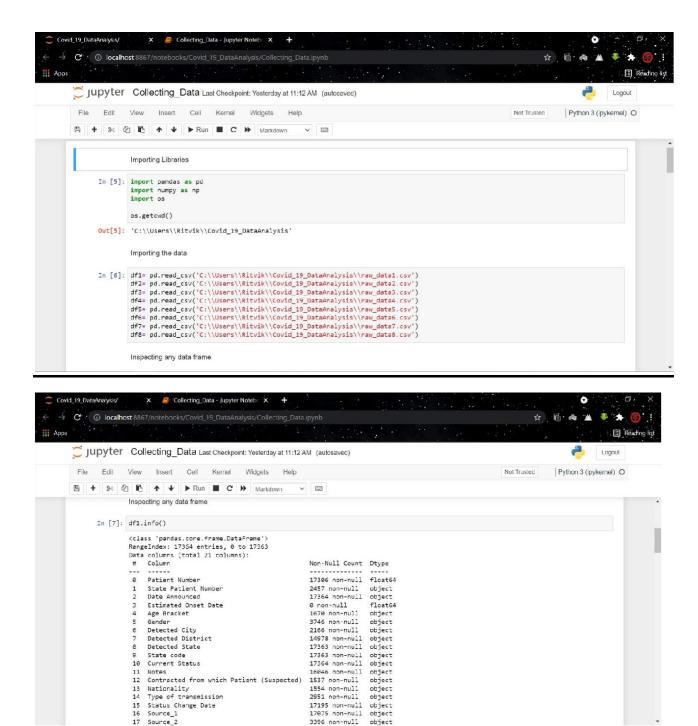
This is precisely what SVM accomplishes! It looks for a line or hyperplane (in multidimensional space) that divides these two classes. The new point is then classified based on whether it is on the positive or negative side of the hyperplane, as determined by the classes to be predicted.

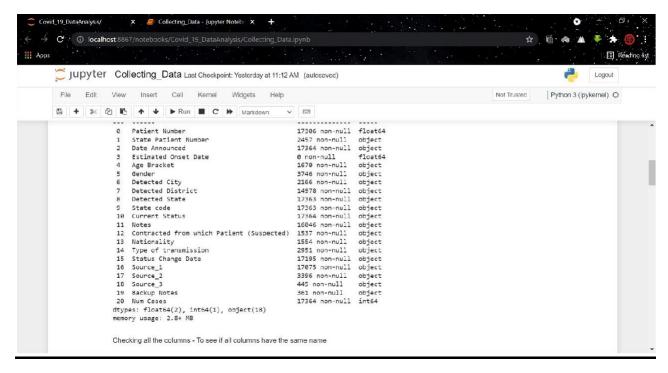
Support Vector Regression (SVR) is a regression technique that uses the same principles as SVM. Let's take a few moments to grasp the concept of SVR. On the basis of a training sample, the aim of regression is to identify a function that approximates mapping from an input domain to real numbers. So let's take a closer look at how SVR truly works and by applying this algorithm we get a accuracy of 98 percent.

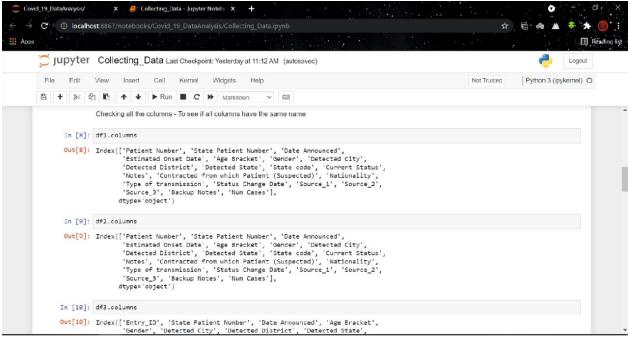
Merits of Proposed system:

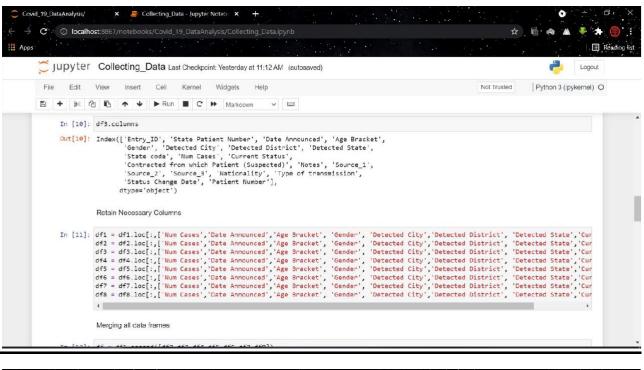
- Forecast of growth in cases in future.
- Help in Better Prevention of upcoming situation.
- Getting the exact idea of current scenario using different representations (pie charts, graphs).
- Understanding the overall spread in India and the world by latitude and longitude.

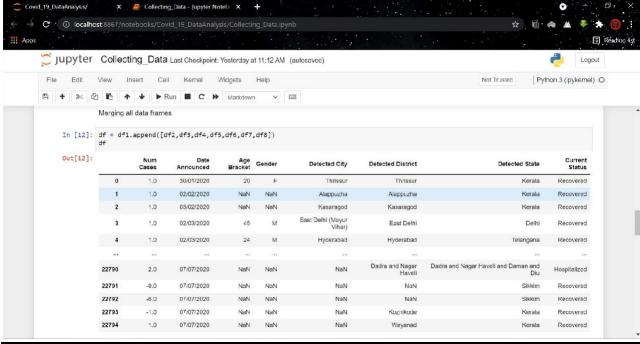
Implementation and Testing

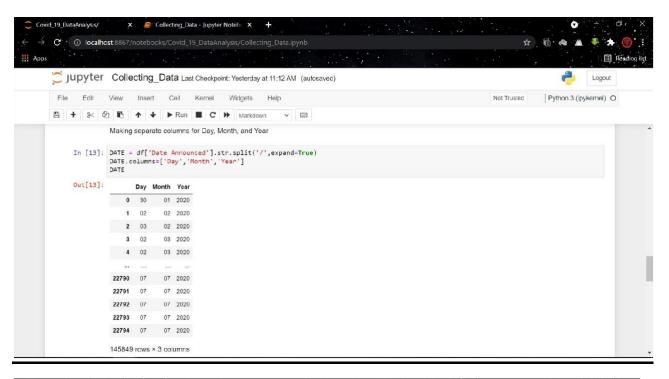


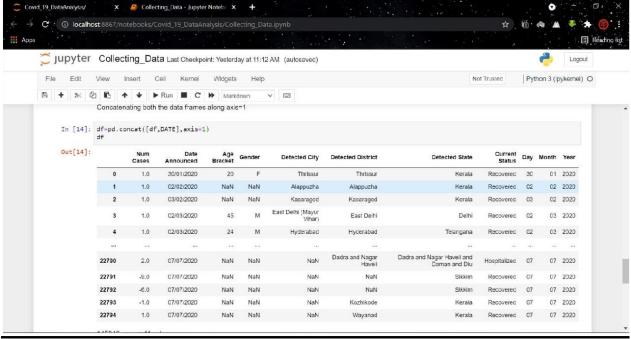


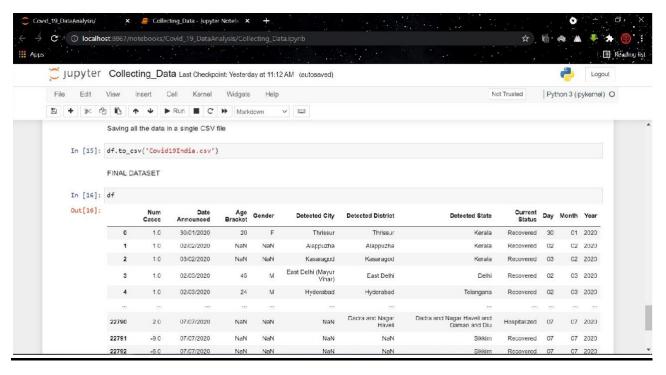


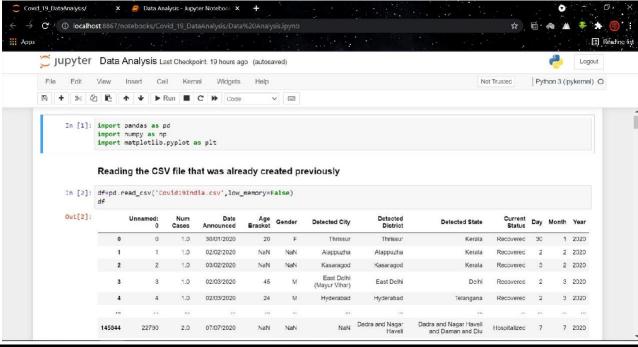


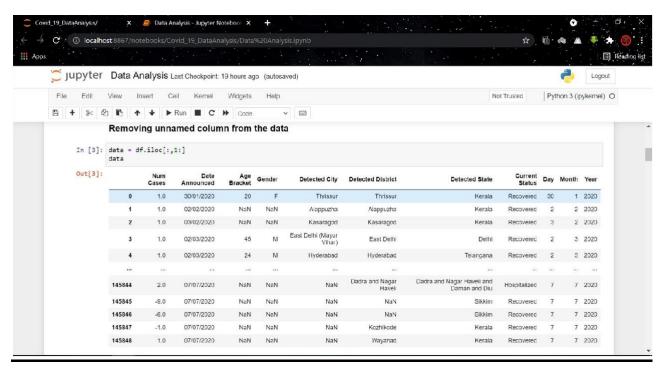


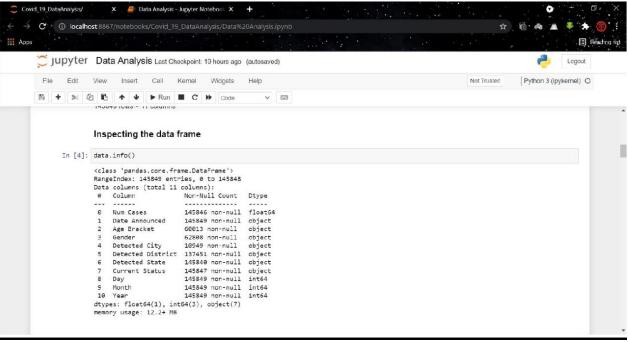


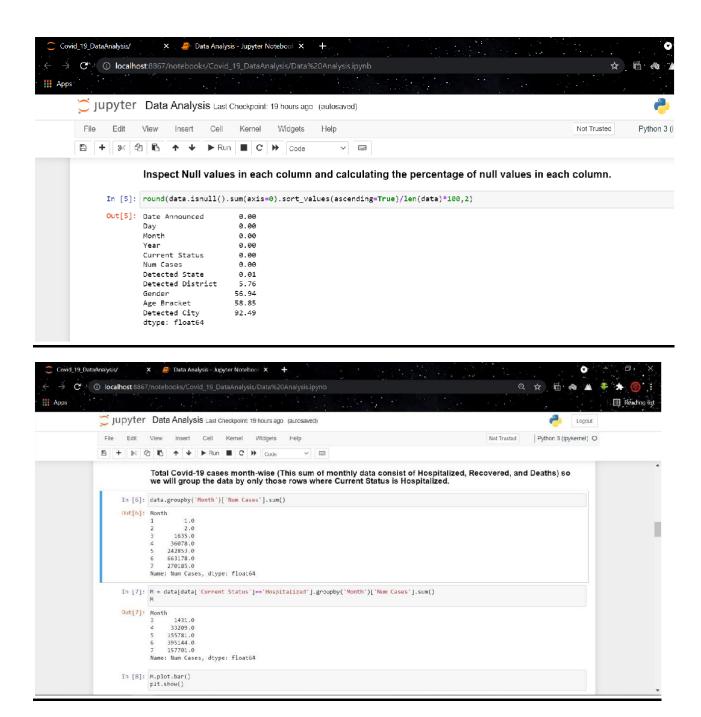


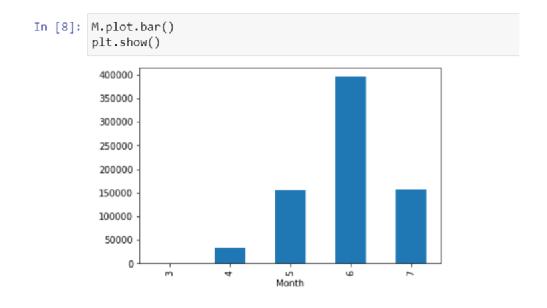


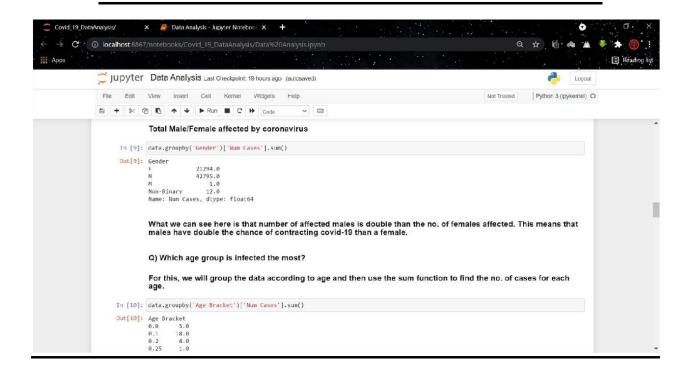


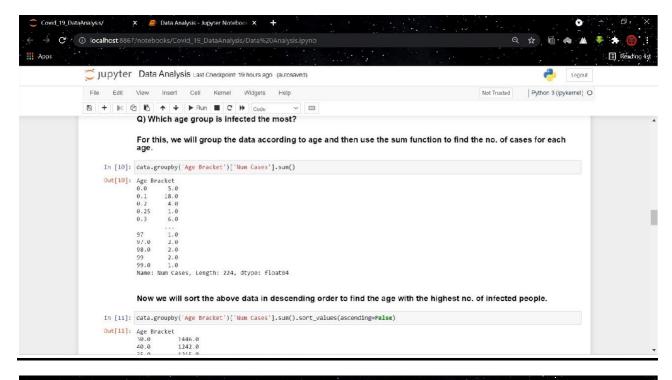


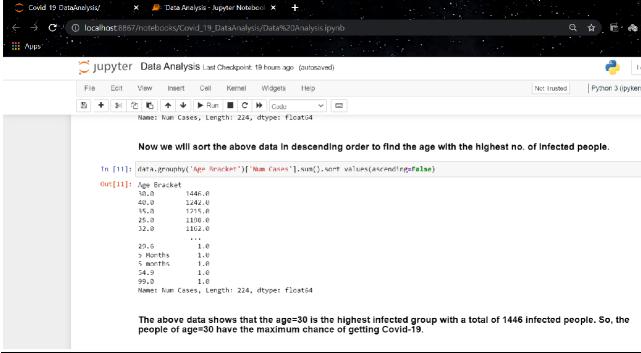


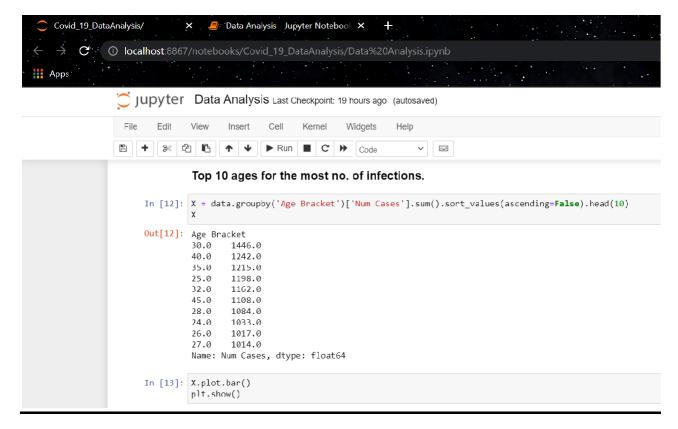


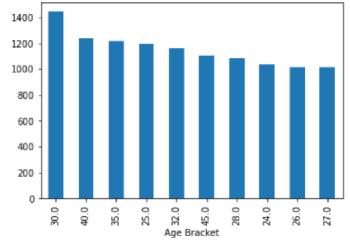


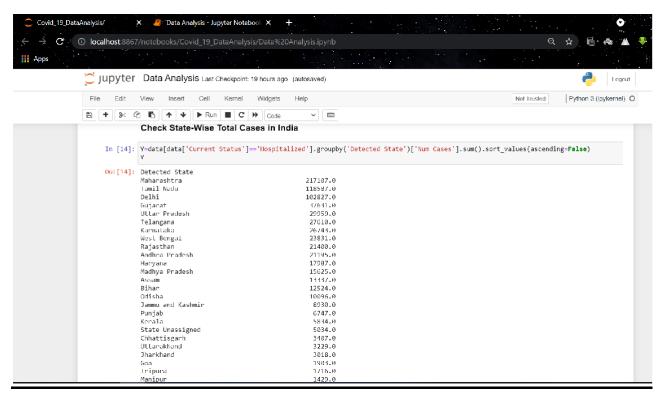


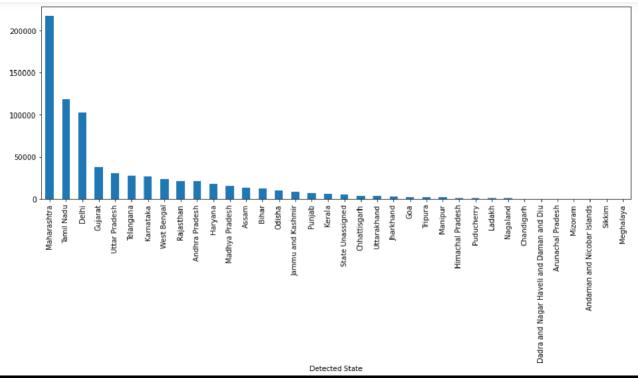


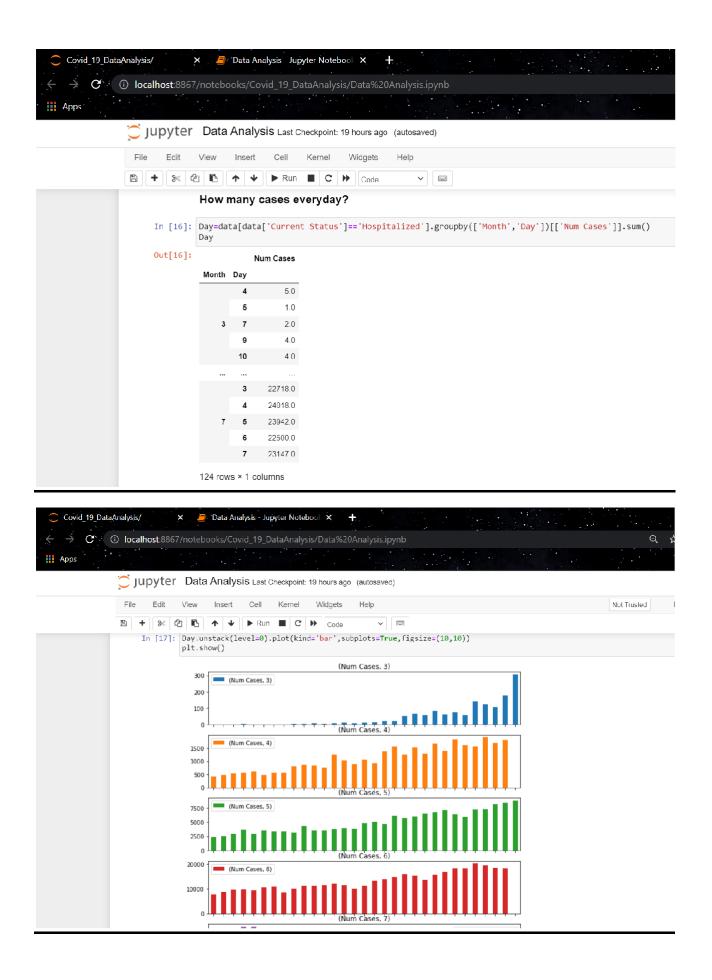


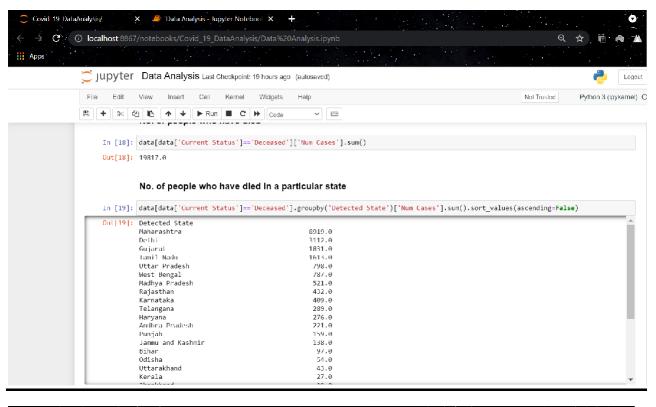


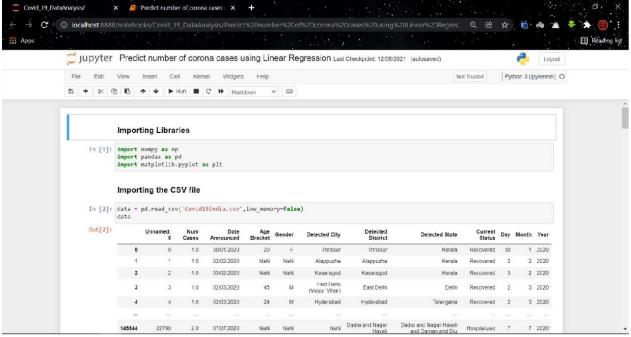


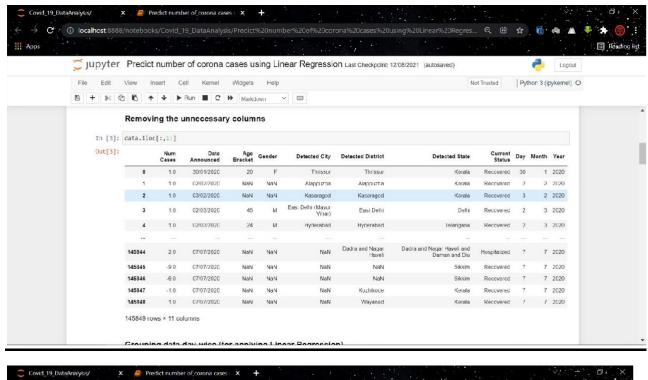


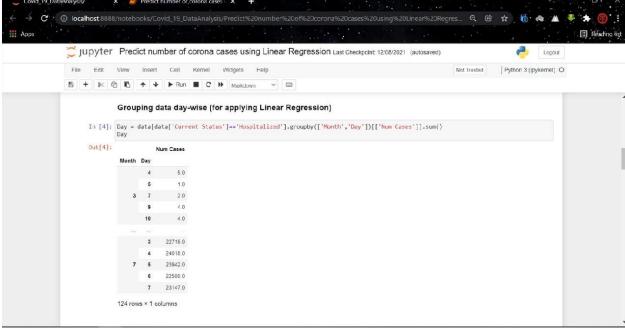


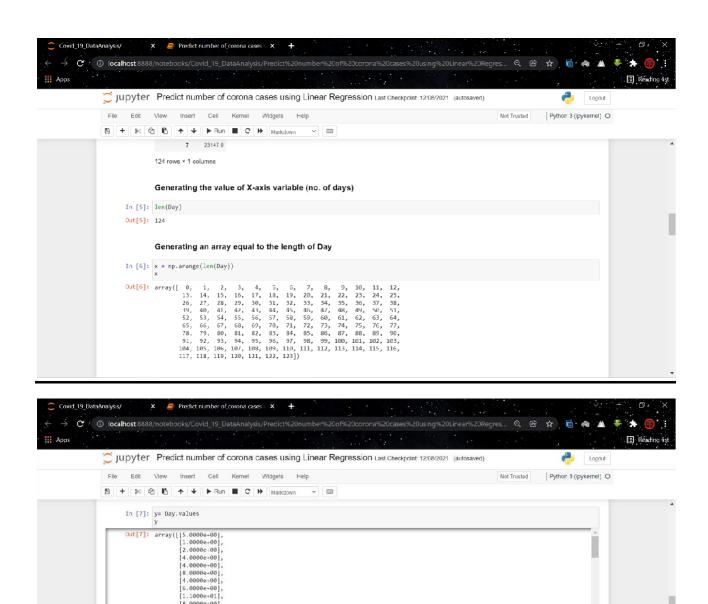








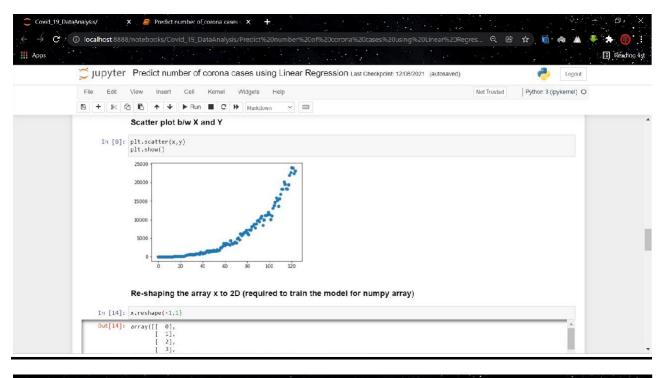


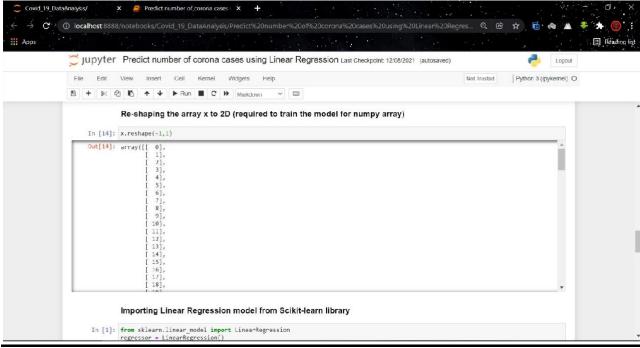


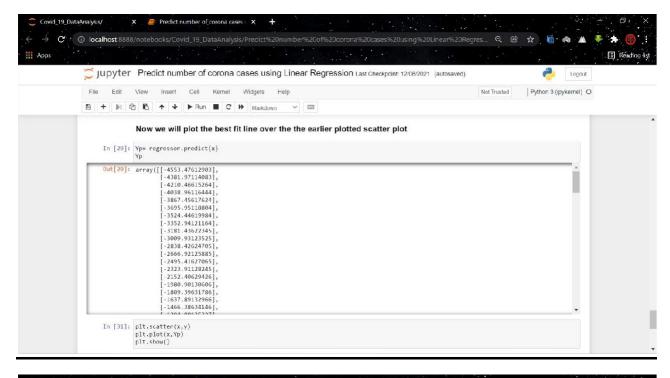
[1.1000e+01], [8.0000e+00], [1.2000e+01], [1.4000e+01], [2.2000e+01], [2.1000e+01], [5.2000e+01], [6.7000e+01], [5.9000e+01], [6.3000e+01],

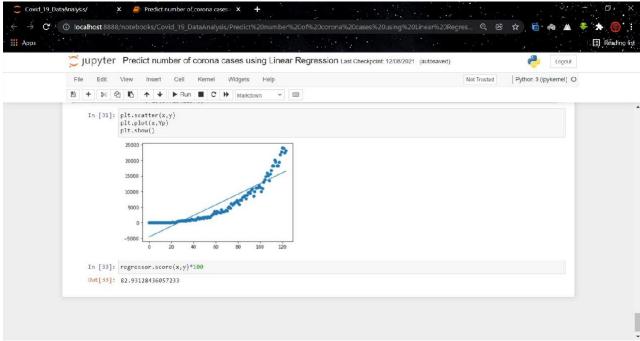
Scatter plot b/w X and Y

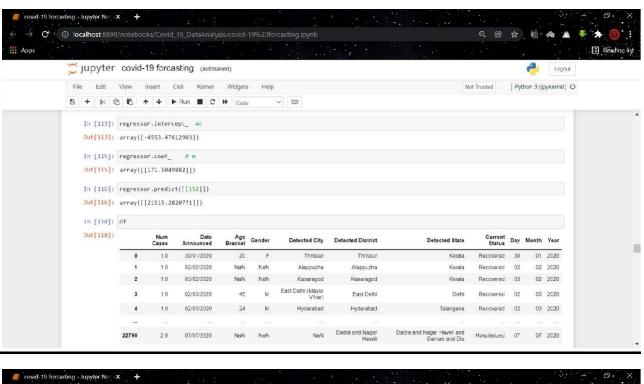
In [8]: plt.scatter(x,y)
plt.show()

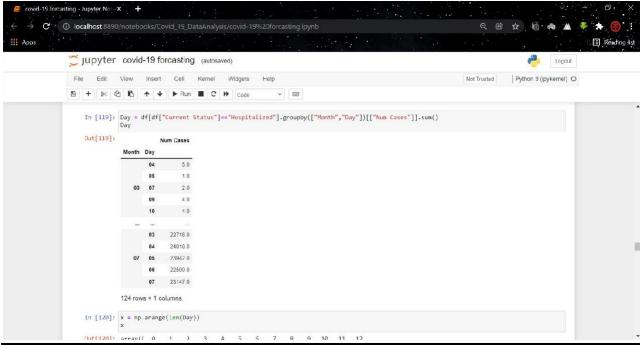


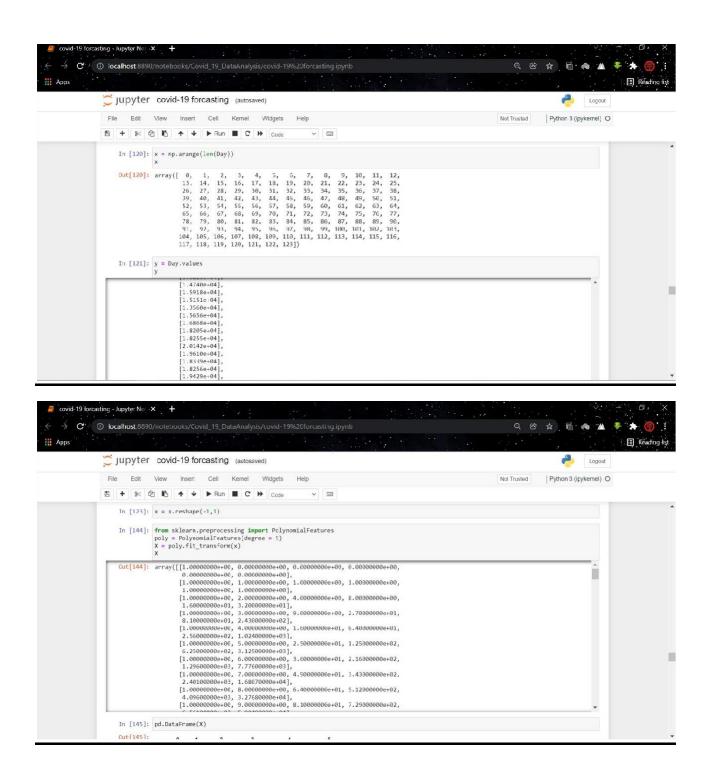


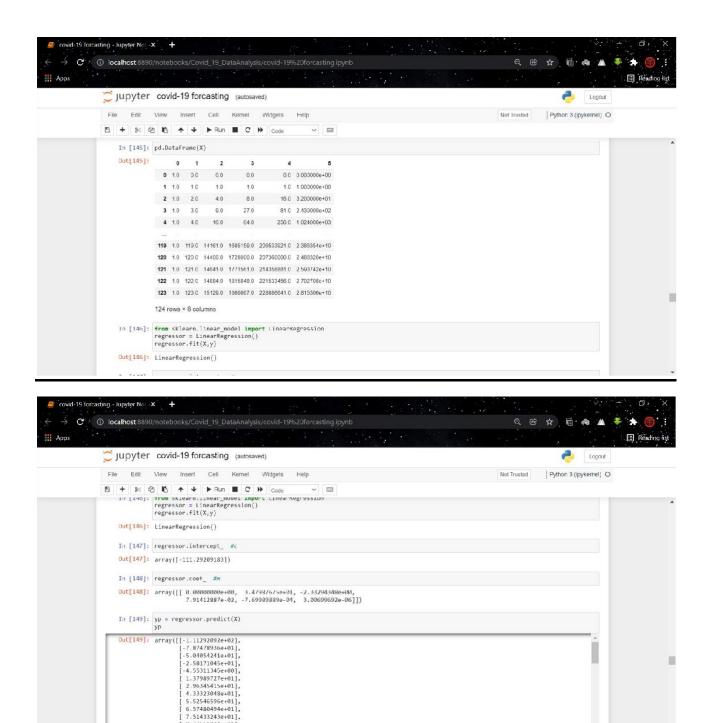




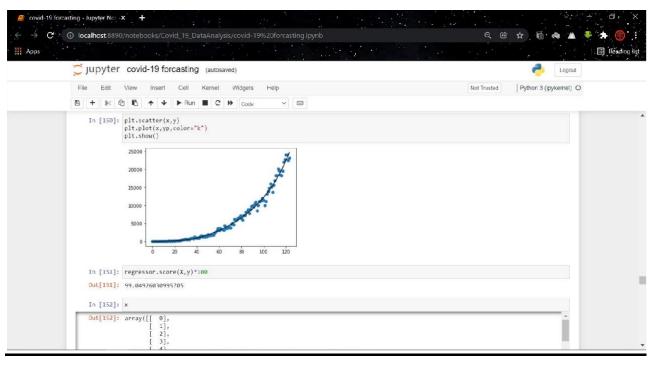


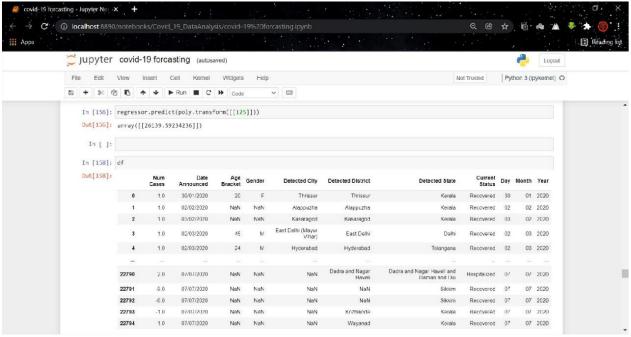


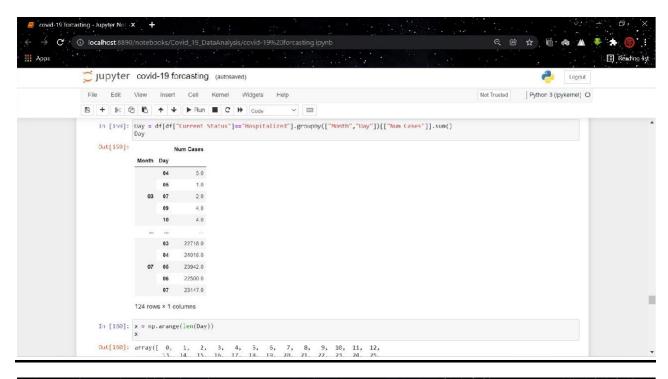


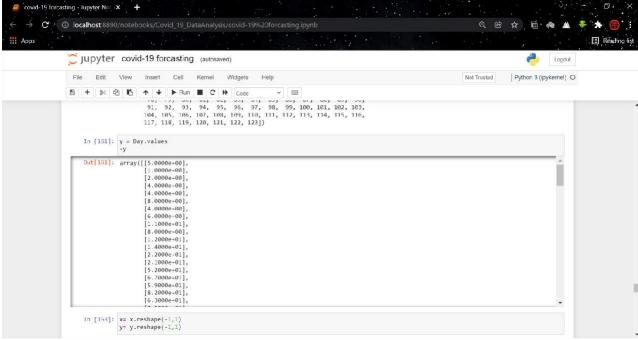


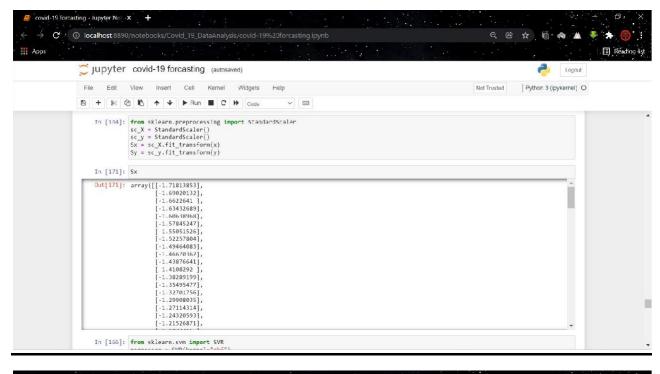
8.3/561024e+01], 9.18871302e+01],

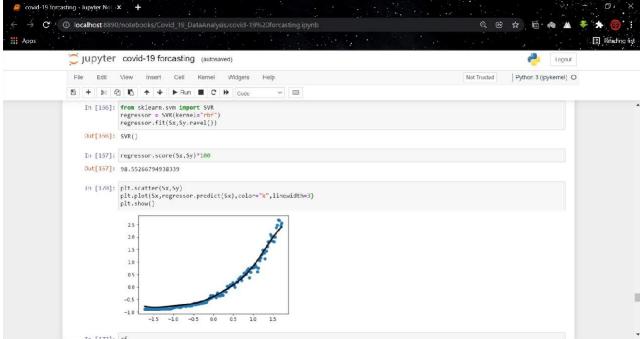


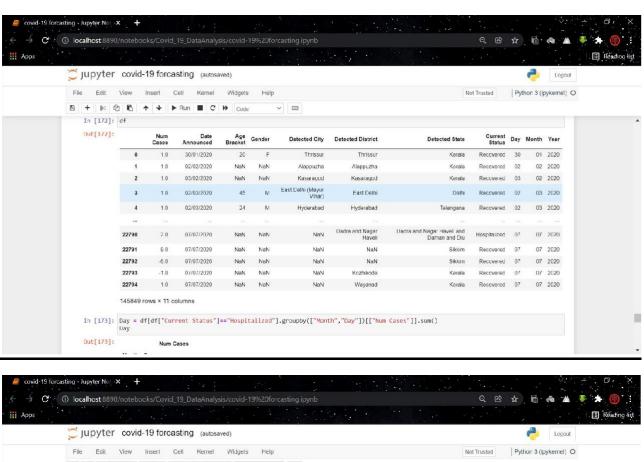


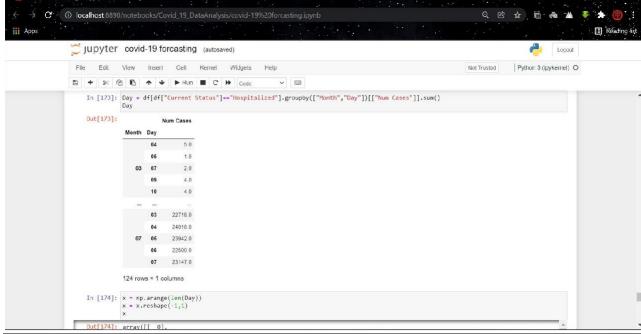


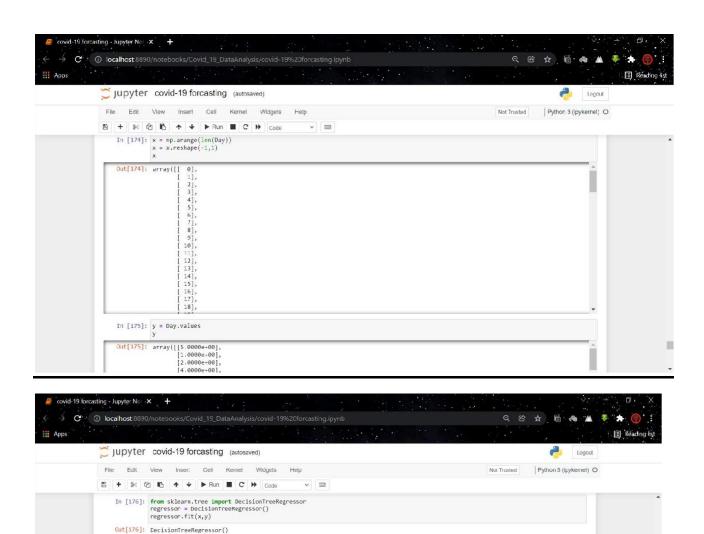








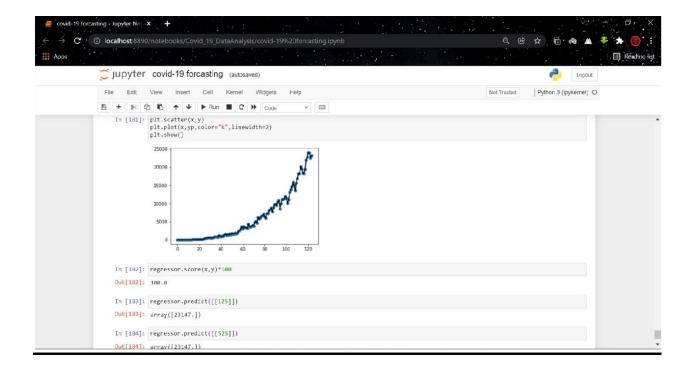




In [178]: # here we don't have any coeff and intercept because its not a line

Ut[179]: array([5.0000e+00, 1.0000e+00, 2.0000e+00, 4.0000e+00, 4.0000e+00, 4.0000e+00, 4.0000e+00, 4.0000e+00, 4.0000e+00, 4.0000e+00, 1.1000e+01, 8.0000e+00, 1.2000e+01, 1.4000e+01, 2.2000e+01, 2.1000e+01, 5.2000e+01, 6.0000e+01, 2.2000e+01, 2.1000e+01, 5.2000e+01, 5.0000e+01, 1.2000e+01, 1.2000e+01, 1.0000e+01, 1.2000e+02, 1.10000e+02, 3.0000e+02, 4.2300e+02, 4.8500e+02, 5.5000e+02, 5.7600e+02, 3.000e+02, 4.2300e+02, 4.8500e+02, 5.5000e+02, 5.7600e+02, 8.300e+02, 4.2500e+02, 7.5800e+02, 1.2430e+03, 5.7000e+02, 8.300e+02, 7.5800e+02, 1.2430e+03, 1.0310e+03, 3.8400e+02, 1.6010e+03, 7.5800e+02, 1.2430e+03, 1.0310e+03, 3.1300e+03, 1.3570e+03, 1.2900e+03, 1.7500e+03, 1.75

In [179]: yp = regressor.predict(x)
vp



Limitations

"Data is not reality it only tries to approximate reality."

- Every COVID cases may not be reported, checked and confirmed.
- Lag due to reporting or data entry.
- Actual v/s predicted plot may not be linear.(underestimate or overestimate)

Covid-19 data limitations are a challenging factor in predicting time series data.

Extension of Recurrent Neural Network (RNN) as a Short-Term Memory (LSTM) cell and its variants such as Stacked LSTM, Bi-directional LSTM and Convolutional LSTM are used to measure predictions.

Future Scope of the Project

This paperwork can be extended to higher levels in the future.

In the future, we can study the loss of the total economy at the end of Covid-19 in various regions and formulate a reasonable plan to recover it, to help countries recover the economy rate.

And the aerosol transmission of Covid-19 can be verified.

In addition the analysis of future prediction can be extended resulting in more accurate prediction to estimate a more accurate number of total cases in India.

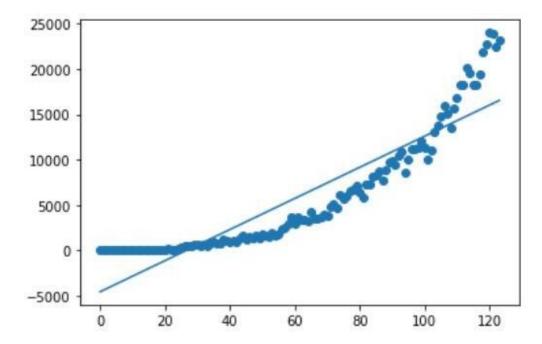
Results and Discussion

The main objective of the Project is to study and analyze COVID-19 prevalence. The spread of the disease in India compared to other countries, state-wise trend of the epidemic to know how it is spreading and to analyze the healthcare sector of India and finally to predict the future of the epidemic in India.

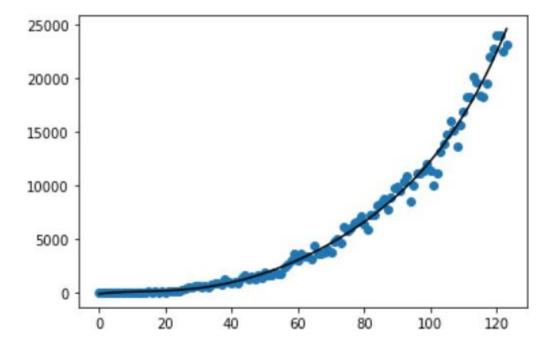
What we can see here is that number of affected males is double than the no. of females affected. This means that males have double the chance of contracting covid-19 than a female.

The data shows that age=30 is the highest infected group with a total of 1446 infected people. So, the people of age=30 have the maximum chance of getting Covid-19.

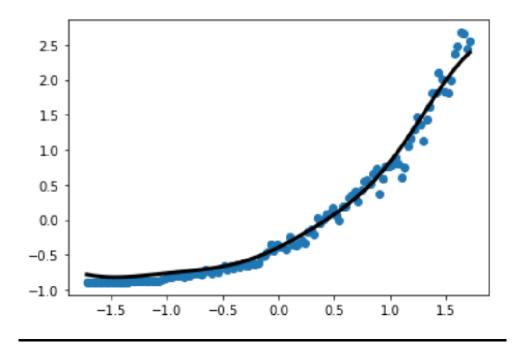
The diagram shows the prediction line using linear regression for cases that was finally presented.



The diagram shows the prediction line using Polynomial regression for cases that was finally presented.



The diagram shows the prediction line using Support Vector regression for cases that was finally presented.



Conclusion

The main objective of the Project is to study and analyze COVID-19 prevalence. The spread of the disease in India compared to other countries, state-wise trend of the epidemic to know how it is spreading and to analyze the healthcare sector of India and finally to predict the future of the epidemic in India.

This study report effectively examined the present global pattern of Covid-19 transmission. Anticipating the spread of Covid-19, also known as Novel Coronavirus, will aid in the implementation of appropriate control measures. The article also gave a complete research of the viral outbreak scenario in India, which will aid in taking the essential actions to control India's massive population. Three Machine Learning models were utilized for this, however in the future, Deep Learning models or a combination of two or more models might be used to anticipate the virus's spread.

For this research, conventional data was employed rather than real-time data since the data validity of conventional data is not heavily dependent on time and its reaction time requirements originate from the external world. Despite the fact that realtime data can be relaxed in a few instances Unlike traditional data, which must meet every situation, real-time data is roughly right, with performance measures determined as the number of transactions missing their deadlines per unit time.

Our investigation demonstrates that when the Linear Regression, Polynomial Regression Algorithm and Support Vector Machine Algorithm are compared with each other it is stated that linear regression gives an accuracy of 82 percent.

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Covid-19 Data Analysis

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