

# Predictive Analysis of Ambient Environment for Urban Cultivation using IoT based Hydroponic System

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**Abstract:** This paper tells about the best and optimum conditions in which one can grow crops using Hydroponic farming. For this work, we are growing coriander plant in a controlled environment with constant monitoring, the controlled environment being restricted water supply I,e Hydroponic farming. Various parameters like Soil pH, Moisture levels etc. are recorded on daily basis and made into a data set. This data set, then with the help of Supervised Machine Learning algorithms we are going to Co-Relate the data collected via IOT by the help of Regression Models ,find the trends within the taken parameters and give an idea as to which conditions give a better yield.

**Keywords:** Supervised Machine Learning Algorithms, Regression Models, Controlled Environment, Hydroponic

## 1 Introduction

In a rapidly developing country like India, which has the world's highest growing GDP Urbanization is being seen in every nook and corner of the country. The difference between the population density of the cities and rural areas are very high. The population of the cities are growing exponentially every year, because of which the agricultural farms in and around the cities are being converted into residential sky scrapers. The need and demand for crops and food is growing up but the area to grow is going down. Due to this alarming scenario, hydroponic agriculture has risen in popularity and practice. It is a form of agriculture in which the plants are grown with restricted water supply.

| No. | City      | Corporation | Population<br>(In Lakhs) | Area<br>(sqkm) | Density<br>(pph) | Core Area<br>Density (pph) | Core Area<br>(In sq.km) |
|-----|-----------|-------------|--------------------------|----------------|------------------|----------------------------|-------------------------|
| 1   | Mumbai    | MCGM        | 124.78                   | 437            | 286              | 460                        | 67.7*                   |
| 2   | Kolkata   | KMC         | 44.96                    | 205            | 219              | 219                        | 205                     |
| 3   | Chennai   | GCC         | 67.27                    | 426            | 157              | 270                        | 176**                   |
| 4   | Bengaluru | BBMP        | 84.25                    | 712            | 118              | 214                        | 216***                  |
| 5   | Delhi     | MCD         | 164.19                   | 1397           | 118              | 391                        | 22.74****               |
| 6   | Hyderabad | GHMC        | 67.31                    | 650            | 104              | 232                        | 172.6*****              |

Figure 1:Population Density of Indian Metropolitan Cities

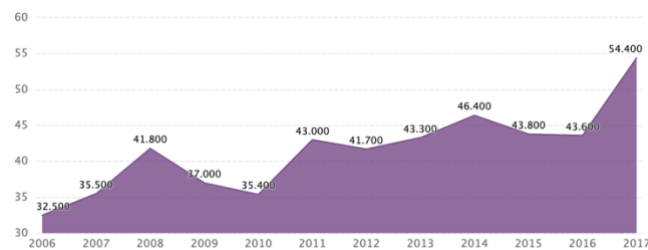


Figure 2:Per Capita Net Availability: Food grains: Pulses

Agriculture is India's principal employment and the backbone of the Indian economy. Agriculture, in addition to supplying food, gives job possibilities to rural people on a big scale in impoverished and emerging countries. It is the process of producing food, fibre and many other desired products by the cultivation and raising of domestic animals. Agriculture is a primary source of income for more than 58 percent of India's population.

As the population of the city grows significantly the need to feed the city heavily lays on the need of agricultural land. As most of the agriculture lands are dried up due to lack of water the need for starvation increases. Hence cities have to start cultivating crops and the need for automated farming in cities becomes crucial.

Climate changes will have a significant impact on agriculture by increasing water demand and limiting crop productivity in areas where irrigation is most needed. Some of the strategies established to create better crops that may not use water effectively include irrigation systems, rain fed agriculture, and groundwater irrigation. A smart

system is intended to use water effectively.. In the system farmers need not make the water flow into fields manually, but the system automatically does that efficiently.

People's traditional practises of water conservation may result in massive water waste. As a result, the notion of robotized farming with a combination of IoT has emerged. Technological developments began to significantly boost manufacturing efficiency, resulting in a dependable system. The understanding of soil qualities causes the water supply to be driven in an intelligent manner. Agriculture practised wisely aids in the acquisition of understanding about soil and

## **2 Existing Concepts and Background Work**

Hydroponic farming is heavily dependent upon the water retention. The limited amount of water available will be retained with the help of a special soil mixture provided whose key role is to maintain the water level without losing the soil moisture.

A lot of work has already been done on the aspect of hydroponic farming. We have gone through various papers and found the following drawbacks and concepts.

Feature Selection has not yet been used in the creation of the machine learning model in this study. As a result, the outcome was less than satisfactory. The lettuce was standing straight one day and swaying to the side the next due to the blowing wind. Other errors were influenced by the amount of sunlight and temperature on that particular day. A lot of sunlight causes the plant to wither and unfold. When measured on a day with less sunlight and temperature, the width is smaller than when measured on a day with more sunlight and temperature. Finally, these flaws caused the model to fail to produce a good learning result.

This work focuses on a model which maintains soil moisture level which is optimum for the crop growth.

This level of soil moisture will be maintained constantly for the next 24 hours with no impact and consideration of the weather condition. This work also talks about smart irrigation system which helps in apt water management and provides ideal crop suggestions based on historic soil data.

This work also provides the type and quantity of various minerals needed. This work does not talk about the plant diseases, this can further be extended so as to detect diseases and automated dispersal of pesticides and insecticides.

This work emphasizes on the importance of IoT based technologies in agriculture. This paper works on the use of Low-Power Wide-Area Network(LPWAN) to reduce the power consumption and increasing the wireless range by eliminating the unnecessary dependency of third party and backhaul networks. It also describes the comparisons between Coverage Range, Quality of Service, Battery Life, Latency, Scalability, Payload Length and Development model between LPWAN technologies. The only major drawback of the paper is the maintenance the LPWAN requires to keep it running as the technology used won't have the ideal conditions to run in an agricultural setup even though the batter life and power consumption are ideal.

Multi-Level IOT framework, which uses Application Layer, Internet Layer, Sensor and Actuator Framework along with Distribution middleware and follows MQTT protocol. In the output, the End User Experiences VPS interaction in one aspect and in the other aspect, it uses VPS and Local Server Interaction. This works falls back in implementing limiting factors such as nitrate, nitrate and ammonia via the electronic sensors. Automated data collection can be implemented into this work so that the system can function with better efficiency and maybe it could send alerts to the sender if there is any change or drastic changes in the parameters.

The paper focuses on five main concepts, namely Hydroponics, Need for Automation Control, Climate Statistics, Data Analytics and Cloud, Proposed System.

The sensors record analog Data through Hydroponic system with the help of MCP 3008 ADC. This work acts as an eye mainly to farmers but this technology can sometimes act more of an ban than a boon for the farmers. This work is done solely done on the famer end so, it can be implemented in other factors as well.

### **3 System Architecture**

#### **3.1 Creation of Meta data**

In the present fast pace world, the form of hydroponic farming is taking over. The ongoing research paved new ways and paths for a better and substantial way of farming. Noticing the ways and researching the present trends, mainly followed in metropolitan cities and technologically advanced countries makes lives a lot easier in terms of hydroponic farming.

The work done by us addresses the key issues of automation and IoT integration into the way of sustainable farming in constraints such as limited water supply and space.

#### **3.2 Necessity for Automation**

The work being done needs constant monitoring as various sensors are used in an confined and controlled environment. As pre-processing homo sapiens , we tend to make unavoidable errors in our work. To avoid such mistakes that in other ways cannot be avoided, automation is the way.

With the help of Arduino , ESp 8266 and aurd Spread Sheet the reading from the sensors are directly stored into the spreads sheet with almost no error. The readings are recorded once every 10 minutes which without automation requires a immense amount of man power which intern may lead to loss or errors in recorded results.

#### **3.3 Climate Maintained**

Farming mainly depends on ambient climatic conditions but the city environment is not suitable for the growth of crops in the traditional way.

For our work as we targeted the metropolitan cities we made sure that the temperature range varied from 28 degree Celsius to 36 degree Celsius. In hydroponic farming, the crops are not exposed to sunlight throughout. Rather than exposing them to sunlight throughout, we made sure that an adequate sunlight was available which in the day reaches approximately 240 candela and in the night for the integrity of the results, we made sure no light from any source was available which resulted in 0 candela.

Speaking about the soil moisture, for better understating of the impact of moisture retention of the soil we grew the crops in early summer because of which there is humidity in the air than normal. The humidity varied from 40 percent to 80 percent which is the normal range in a coastal city.

| PARAMETER          | MAX   | MIN  |
|--------------------|-------|------|
| PH                 | 27.13 | 6.68 |
| LUMINOUS INTENSITY | 226   | 0    |
| HUMIDITY           | 82.5  | 47.8 |
| TEMPERATURE        | 38.6  | 25.7 |
| SOIL MOISTURE      | 687   | 579  |
| WATER LEVEL        | 731   | 153  |

*Table 1:Range of Parameters Full Phase of crop growth*

| PARAMETER          | MAX   | MIN  |
|--------------------|-------|------|
| PH                 | 27.13 | 6.68 |
| LUMINOUS INTENSITY | 226   | 0    |
| HUMIDITY           | 82.5  | 47.8 |
| TEMPERATURE        | 38.6  | 25.7 |
| SOIL MOISTURE      | 687   | 579  |
| WATER LEVEL        | 731   | 153  |

*Table 2:Range of Parameters Initial Phase of crop growth*

| PARAMETER          | MAX   | MIN  |
|--------------------|-------|------|
| PH                 | 12.59 | 0    |
| LUMINOUS INTENSITY | 220   | 0    |
| HUMIDITY           | 72.7  | 43.6 |
| TEMPERATURE        | 36.3  | 27.7 |
| SOIL MOISTURE      | 685   | 676  |
| WATER LEVEL        | 661   | 272  |

*Table 3:Range of Parameters Growing Phase of crop growth*

| PARAMETER          | MAX   | MIN  |
|--------------------|-------|------|
| PH                 | 27.13 | 6.68 |
| LUMINOUS INTENSITY | 226   | 0    |
| HUMIDITY           | 82.5  | 47.8 |
| TEMPERATURE        | 38.6  | 25.7 |
| SOIL MOISTURE      | 687   | 579  |
| WATER LEVEL        | 731   | 153  |

*Table 4:Range of Parameters Harvesting Phase of crop growth*

### 3.4 Data Analysis

All the information collected from the sensors is stored in the personal systems directly rather than cloud as cloud is heavily dependent upon an uninterrupted internet connection which sometimes may not be possible.

The data collected is stored and processed with the help of python to create results which help in better understanding of the data.

### 3.5 Proposed System

An innovative form of hydroponic farming is used. A coco pit is used as an soil replacement as the water retention capacity is much higher in this compared to general soil. The coco pit is connected to water supply which is regulated. Six different sensors are connected to the system. The sensors being, pH sensor which monitors the pH of the water in the coco pit. The water in coco pit pH initially at the time of laying it down was 6.5. The second sensor used is Luminous Intensity Sensor. This sensor monitors the amount of luminescence around the setup. The third sensor is Humidity sensor, this sensor monitors the humidity in the surroundings of the setup. Next sensor used was temperature sensor, this sensor monitors the temperature of the surroundings. The fifth sensor used was soil moisture sensor, this sensor measured the amount of moisture in coco pit throughout the experiment. The final sensor used is water level sensor, this sensor measures the amount of water provided to the system daily. The seeds used were coriander seeds as they take less time to grow which afforded us a chance to cross verify the results by repeating the experiment.

## 4 Experimental Process

According to the proposed system, the experiment is designed in such a way that it is a prototypical implementation. The design procedures are explained with a block Diagram.

### 4.1 Block Diagram

In the following proposed system, the analogue and digital sensors collect information from the hydroponic setup. With the help of Arduino Mega 2560 data is send to

spreadsheet in a very smooth and effective manner. The data is collected and saved in database using a wifi module. The block figure is represented for the proposed system.

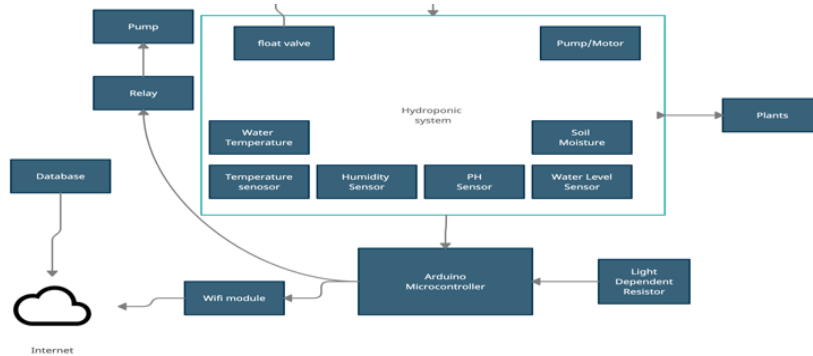


Figure 3: Block diagram of proposed Hydroponic system

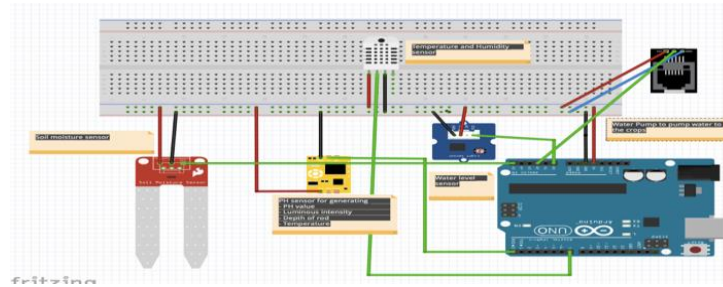
Major Steps explained in proposed system is mentioned as flow chart.

#### 4.2 Circuit Diagram and components

According The proposed circuit is created in such a way that the cost of components is economical and also the quality the components is not comparamised and also the performance of the components are very good.

The Major components involved in proposed system are:

1. Arduino Mega 2560
2. Temperature sensor (DHT-22)
3. Humidity Sensor (DHT-22)
4. Water Level Sensor
5. Soil Moisture Sensor
6. PH Sensor
7. Luminous Intensity Sensor
8. WIFI module (ESP 8266)
9. Breadboard
10. Jumper wires
11. Pump
12. Water Tube
13. 5V motor
14. 5V power supply



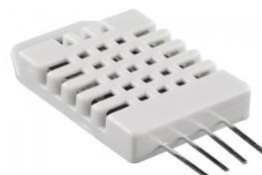
*Figure 4: Circuit diagram of proposed Hydroponic System*

The main component of the automated system is Arduino Uno Mega 2560 which is a very stable model which provides proper power supply and also helps in uploading large bundle of code.



*Figure 5:Economic PH sensor with Luminous intensity sensor*

PH Sensor - In both soil and hydroponics gardening, optimal pH levels are crucial for healthy plants and excellent harvests. Maintaining those ideal values necessitates frequent, reliable pH testing, especially in soilless growth systems. A plant's nutrient uptake is maximised at ideal pH values. The vigour and productivity of a plant are increased as a result of these nutrients. Luminous Intensity Sensor helps to capture the amount of sunlight hitting the product



*Figure 6:DHT-22 Humidity and Temperature Sensor*

DHT22 Temperature/Humidity Sensor - The DHT22 is a Temperature and Humidity sensor with digital interface temperature. The sensor is made in such a way that it can get proper calibrated value of humidity and temperature.





*Figure 7:Image of soil moisture Sensor*

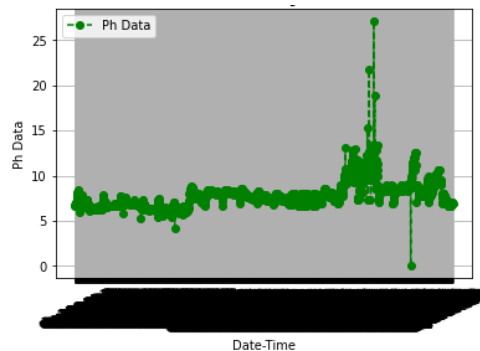
Soil Moisture Sensor - This soil moisture sensor can be used to detect soil moisture or evaluate if there is water around the sensor. It also tells you if the plants in the mesh pot need to be watered.



*Figure 8: Image of Water Level Sensor*

Water-Level Sensor - A water-level sensor is a device that detects the level of water in a container. Maintaining the water level allows the roots to absorb the proper amount of water and prevents the plant from being spoilt.

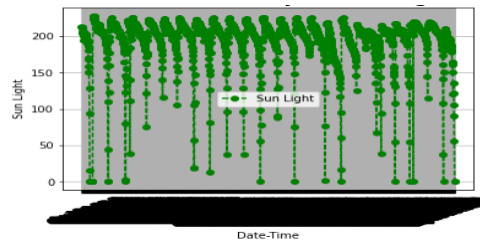
## 5 Dataset Analysis



*Figure 9:Time series Analysis of PH*

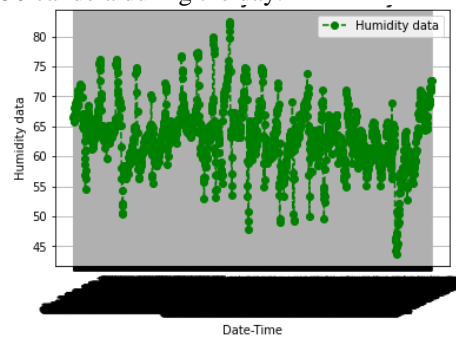
Fig: 9 shows the pH values of the water through the experiment. The minimum value recorded is 5.5 on the ph scale and this was recorded during the Initial phase of the

experiment. The maximum recorded is 13 and it was recorded during the growth phase due to the addition of mineral water to the water supply, it became more basic. After the growth phase we supplied general water again so, the pH dropped gradually making it more neutral.



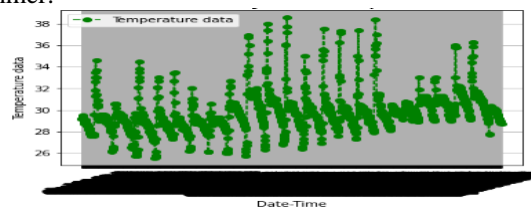
*Figure 10:Time series Analysis of Luminous Intensity/ Sunlight for plant*

As Fig: 10 depicts the Luminous intensity on candle scale over the whole duration of the experiment. The least recorded is Zero as during the night, it is made sure that the experimental setup is not exposed to any form of light energy. The highest value recorded is around 250 candela during the day.



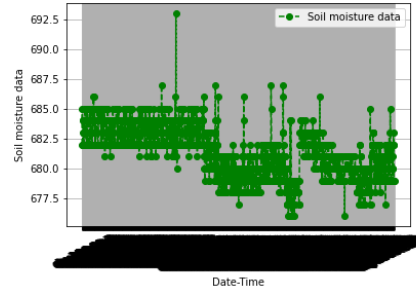
*Figure 11:Time series Analysis of Humidity*

Fig 11: shows the humidity in the surroundings of the setup. As the experiment setup was in a coastal city, the humidity is relatively high but is under the normal humidity levels for the city. The lowest recorded is 45% and the highest is around 80%. To make sure that the humidity level doesn't go overboard, we conducted the experiment during early summer.



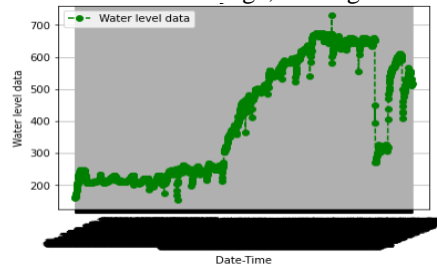
*Figure 12:Time series Analysis of Temperature*

Fig 12: represents the Temperature of the surroundings throughout the experiment. The temperature kept on raising during the experiment gradually. The lowest recorded temperature was 26degree Celsius and highest was 36degree Celsius. The lowest average temperature



*Figure 13:Time series Analysis of Soil Moisture*

Fig: 13 shows the moisture in the coco pit during the experiment timeline. During the initial phase the moisture level was between 682-686. The moisture level was highest during the growth phase which ranges between 680-692. The moisture level during the harvest phase is lowest in terms of average, its range varies from 676-680.



*Figure 14:Time series Analysis of Water Level*

Fig: 14 depicts the water level in the experiment. The water level gradually increases till the growth phase and decreases there on. The water level during the initial phase was between 160 and 240ml, during growth phase it is between 200ml and 650ml. During the harvest phase, the water level required is low , it ranges from 200-500ml.

## 6 Result And Discussion

The main objective of the result is to corelate the various parameters of the experiments with the help of four evaluation parameters, namely

- Mean Absolute Error (MAE)
- Root Mean Square Error (MASE)
- Root Mean Square Log Error (RMSE)
- R Squared(R2)

The lower the value of MAE, the more the parameters are corelated. The R2 specifies the error in the calculations I,e the lesser the value of R2, the better the correlation is.

## 6.1 Predictive Analysis of parameters using Linear Regression

| PARAMETER VS PARAMETER | PH  | SUNLIGHT   | HUMIDITY  | TEMPERATURE   | SOILMOISTURE   | WATER LEVEL  |
|------------------------|---|--|---|---|--|--|
| PH                     | X   | MAE=26.54<br>MASE=1702.59<br>RMSE=41.26<br>R2=-0.00288 | MAE=3.13<br>MASE=17.055<br>RMSE=4.1298<br>R2=0.03718  | MAE=0.9522<br>MASE=2.0584<br>RMSE=1.43474<br>R2=-0.003785 | MAE=0.9161<br>MASE=1.1950<br>RMSE=1.0931<br>R2=-0.011836 | MAE=11.9423<br>MASE=233.031<br>RMSE=15.265<br>R2=-0.0039 |
| SUNLIGHT               | MAE=0.3905<br>MASE=0.2885<br>RMSE=0.5371<br>R2=-0.00707 | X  | MAE=2.9133<br>MASE=16.551<br>RMSE=4.0683<br>R2=0.0650 | MAE=0.7492<br>MASE=1.268<br>RMSE=1.126<br>R2=0.145        | MAE=0.902<br>MASE=1.160<br>RMSE=1.077<br>R2=-0.0417      | MAE=1.0388<br>MASE=1.521<br>RMSE=1.233<br>R2=0.078       |
| HUMIDITY               | MAE=0.3817<br>MASE=0.253<br>RMSE=0.503<br>R2=-0.0074    | MAE=21.29<br>MASE=1630.14<br>RMSE=40.375<br>R2=0.157   | X   | MAE=0.831<br>MASE=1.205<br>RMSE=1.097<br>R2=0.517         | MAE=0.875<br>MASE=1.06<br>RMSE=1.033<br>R2=-0.0056       | MAE=9.843<br>MASE=174.68<br>RMSE=13.21<br>R2=0.0941      |
| TEMPERATURE            | MAE=0.409<br>MASE=0.316<br>RMSE=0.562<br>R2=0.0032      | MAE=22.06<br>MASE=1529.58<br>RMSE=39.109<br>R2=0.216   | MAE=2.64<br>MASE=10.3<br>RMSE=3.214<br>R2=0.505       | X   | MAE=0.9160<br>MASE=1.190<br>RMSE=1.090<br>R2=-0.012      | MAE=9.714<br>MASE=168.86<br>RMSE=12.99<br>R2=0.087       |
| SOILMOISTURE           | MAE=0.389<br>MASE=0.278<br>RMSE=0.527<br>R2=-0.0094     | MAE=24.12<br>MASE=1462.23<br>RMSE=38.23<br>R2=0.0032   | MAE=0.933<br>MASE=2.1119<br>RMSE=1.453<br>R2=-0.0231  | MAE=2.890<br>MASE=15.77<br>RMSE=3.97<br>R2=-0.018         | X  | MAE=11.212<br>MASE=229.93<br>RMSE=15.16<br>R2=-0.0049    |
| WATER LEVEL            | MAE=0.339<br>MASE=0.232<br>RMSE=0.4819<br>R2=0.0221     | MAE=22.450<br>MASE=1350.67<br>RMSE=36.75<br>R2=0.190   | MAE=3.35<br>MASE=2.043<br>RMSE=1.4296<br>R2=0.0010    | MAE=3.356<br>MASE=18.41<br>RMSE=4.29<br>R2=0.039          | MAE=0.797<br>MASE=1.540<br>RMSE=1.240<br>R2=0.0032       | X  |

Table 5: Linear Regression Between Parameters for Initial Phase of Coriander Plant Growth

From Table 5, it can be inferred that water level and pH are the most correlated parameters in the initial phase of the experiment as MAE=0.339. This means, with a given Water Level, we can predict the value of pH required for a good yield. The parameters that cannot be correlated are pH and Sunlight as the MAE=26.54, this means that the value of Luminous intensity cannot be predicted with the pH level.

| PARAMETER VS PARAMETER | PH   | SUNLIGHT   | HUMIDITY   | TEMPERATURE  | SOILMOISTURE   | WATER LEVEL  |
|------------------------|--|--|--|--|--|--|
| PH                     | X  | MAE=21.157<br>MASE=1228.42<br>RMSE=35.04<br>R2=-0.0048 | MAE=3.400<br>MASE=21.329<br>RMSE=4.618<br>R2=-0.0108 | MAE=1.155<br>MASE=3.1804<br>RMSE=1.783<br>R2=-0.0061 | MAE=1.6315<br>MASE=3.9975<br>RMSE=1.999<br>R2=0.0096 | MAE=136.46<br>MASE=23789.17<br>RMSE=154.2<br>R2=0.1199   |
| SUNLIGHT               | MAE=0.944<br>MASE=2.5054<br>RMSE=1.582<br>R2=0.0000523 | X  | MAE=3.309<br>MASE=20.457<br>RMSE=4.522<br>R2=0.194   | MAE=1.010<br>MASE=2.544<br>RMSE=1.595<br>R2=0.1704   | MAE=1.556<br>MASE=3.836<br>RMSE=1.958<br>R2=0.0247   | MAE=1.562<br>MASE=3.678<br>RMSE=1.917<br>R2=0.033        |
| HUMIDITY               | MAE=0.9677<br>MASE=2.328<br>RMSE=1.525<br>R2=0.00814   | MAE=19.44<br>MASE=1072.59<br>RMSE=32.750<br>R2=0.1304  | X  | MAE=0.943<br>MASE=1.686<br>RMSE=1.298<br>R2=0.5603   | MAE=1.6009<br>MASE=3.845<br>RMSE=1.96<br>R2=0.00245  | MAE=134.715<br>MASE=24155.87<br>RMSE=155.42<br>R2=0.1037 |

|              |  |  |   |  |   |   |
|--------------|--|--|---|--|---|---|
| TEMPERATURE  | MAE=0.8932<br>MASE=1.6079<br>RMSE=1.268<br>R2=-0.0076        | MAE=18.107<br>MASE=888.58<br>RMSE=29.80<br>R2=0.165            | MAE=2.487<br>MASE=10.05<br>RMSE=3.171<br>R2=0.563       | X  | MAE=1.780<br>MASE=4.511<br>RMSE=2.123<br>R2=-0.0042 | MAE=142.16<br>MASE=25289.25<br>RMSE=159.02<br>R2=0.0057     |
| SOILMOISTURE | MAE= 0.959<br>MASE= 2.385<br>RMSE= 1.544<br>R2= =<br>0.01081 | MAE=19.289<br>MASE=<br>834.443<br>RMSE= 28.88<br>R2=0.0037     | MAE= 1.0317<br>MASE=2.1168<br>RMSE=1.454<br>R2= -0.0373 | MAE=3.3324<br>MASE=21.27<br>RMSE= 4.612<br>R2=-0.00273 | X   | MAE=130.00<br>MASE=23137.316<br>RMSE= 152.109<br>R2= 0.0110 |
| WATER LEVEL  | MAE= 0.886<br>MASE=2.728<br>RMSE=1.65<br>R2=0.1177           | MAE= 20.0011<br>MASE=<br>1183.82<br>RMSE= 34.406<br>R2= 0.0038 | MAE= 1.563<br>MASE=3.701<br>RMSE= 1.923<br>R2=0.0199    | MAE=3.494<br>MASE=20.4542<br>RMSE=4.5226<br>R2=0.073   | MAE=1.173<br>MASE=2.624<br>RMSE= 1.62<br>R2= 0.0017 | X   |

*Table 6: Linear Regression Between Parameters for Growing Phase of Coriander Plant Growth*

From Table 6, it can be inferred that temperature and pH are the most correlated parameters in the growth phase of the experiment as MAE=0.8932. This means, with a given temperature, we can predict the value of pH required for a good yield. The parameters that cannot be correlated are temperature and water level as the MAE=142.16, this means that the value of Water level cannot be predicted with a given temperature.

| PARAMETER VS PARAMETER | PH   | SUNLIGHT   | HUMIDITY   | TEMPERATURE   | SOILMOISTURE  | WATER LEVEL   |
|------------------------|--|--|--|---|---|---|
| PH                     | X  | MAE=22.685<br>MASE=1027.818<br>RMSE=32.059<br>R2=-0.020  | MAE=4.589<br>MASE=33.367<br>RMSE=5.77<br>R2= -0.154    | MAE=0.906<br>MASE=1.836<br>RMSE=1.35<br>R2=0.0653       | MAE=1.1328<br>MASE=1.821<br>RMSE=1.349<br>R2=0.032    | MAE= 100.54<br>MASE=15723.309<br>RMSE= 125.392<br>R2=-0.05177 |
| SUNLIGHT               | MAE=0.9731<br>MASE=1.421<br>RMSE=1.192<br>R2= -0.0967  | X  | MAE= 3.446<br>MASE=20.575<br>RMSE= 4.535<br>R2= 0.1587 | MAE= 0.7630<br>MASE=1.6451<br>RMSE= 1.282<br>R2= 0.2184 | MAE=0.945<br>MASE=1.470<br>RMSE= 1.212<br>R2=-0.0047  | MAE=1.0651<br>MASE=1.972<br>RMSE= 1.404<br>R2=0.00676         |
| HUMIDITY               | MAE=0.8707<br>MASE=1.2903<br>RMSE=1.1359<br>R2=0.153   | MAE=19.1465<br>MASE=1114.27<br>RMSE=33.38<br>R2=0.205    | X  | MAE=0.725<br>MASE= 1.277<br>RMSE= 1.130<br>R2= 0.290    | MAE=1.008<br>MASE=1.796<br>RMSE=1.340<br>R2= 0.01474  | MAE=108.25<br>MASE=14820.36<br>RMSE=121.738<br>R2=0.207       |
| TEMPERATURE            | MAE=0.9607<br>MASE=1.441<br>RMSE=1.2004<br>R2=0.075    | MAE=20.242<br>MASE=1750.404<br>RMSE=41.837<br>R2=0.2634  | MAE=3.8819<br>MASE=25.495<br>RMSE=5.049<br>R2=0.3559   | X   | MAE=1.130<br>MASE=2.060<br>RMSE=1.435<br>R2=0.00103   | MAE=111.24<br>MASE=16898.54<br>RMSE=129.99<br>R2=0.026065     |
| SOILMOISTURE           | MAE=0.9433<br>MASE=2.2974<br>RMSE=1.515<br>R2= -0.0189 | MAE=23.149<br>MASE=1434.32<br>RMSE=37.87<br>R2=-0.00766  | MAE=1.0291<br>MASE=1.813<br>RMSE=1.346<br>R2= -0.1067  | MAE=4.599<br>MASE=33.304<br>RMSE= 5.770<br>R2=-0.0732   | X   | MAE=105.00<br>MASE=16357.032<br>RMSE=127.894<br>R2= -0.004    |
| WATER LEVEL            | MAE=0.9163<br>MASE=1.311<br>RMSE=1.145<br>R2=0.0459    | MAE=28.312<br>MASE=2365.95<br>RMSE=48.641<br>R2=0.000481 | MAE=1.055<br>MASE=1.63225<br>RMSE=1.2775<br>RE=0.0771  | MAE=4.03624<br>MASE= 25.24<br>RMSE=5.024<br>R2=0.16178  | MAE=0.9096<br>MASE=1.342<br>RMSE= 1.158<br>R2= 0.0436 | X   |

*Table 7: Linear Regression Between Parameters for Harvesting Phase of Coriander Plant Growth*

From Table 7, it can be inferred that humidity and temperature are the most corelated parameters in the harvesting phase of the experiment as MAE=0.723. This means, with a given humidity level, we can predict the temperature required for a good yield. The parameters that cannot be corelated are temperature and water level as the MAE=111.24, this means that the value of Water level cannot be predicted with a given temperature.

| PARAMETER VS PARAMETER | PH   | SUNLIGHT  | HUMIDITY   | TEMPERATURE   | SOILMOISTURE   | WATER LEVEL   |
|------------------------|--|---|--|---|--|---|
| PH                     | X  | MAE=23.313<br>MASE=1591.03<br>RMSE=39.88<br>R2=0.00118    | MAE=3.9601<br>MASE=27.939<br>RMSE=5.285<br>R2=0.00598  | MAE=1.210<br>MASE=3.0650<br>RMSE=1.750<br>R2=0.0599   | MAE=1.8210<br>MASE=4.899<br>RMSE=2.213<br>R2=0.0378  | MAE= 137.684<br>MASE= 22732.459<br>RMSE= 150.772<br>R2=0.2893 |
| SUNLIGHT               | MAE=1.0360<br>MASE= 2.128<br>RMSE= 1.459<br>R2= - 0.000246 | X   | MAE= 3.419<br>MASE= 21.26<br>RMSE= 4.61<br>R2= 0.157   | MAE= 1.147<br>MASE= 2.604<br>RMSE= 1.613<br>R2= 0.185 | MAE=1.921<br>MASE=5.188<br>RMSE= 2.277<br>R2=-0.0118 | MAE=1.8404<br>MASE= 4.6457<br>RMSE=2.155<br>R2=-0.0026        |
| HUMIDITY               | MAE=0.9411<br>MASE=1.633<br>RMSE= 1.278<br>R2=0.0245       | MAE=20.003<br>MASE= 1241.13<br>RMSE= 35.22<br>R2= 0.1857  | X  | MAE= 0.929<br>MASE= 1.478<br>RMSE= 1.216<br>R2= 0.375 | MAE=1.811<br>MASE=4.672<br>RMSE=2.161<br>R2= 0.023   | MAE=165.664<br>MASE=31591.99<br>RMSE=31591.99<br>R2=0.02649   |
| TEMPERATURE            | MAE=0.9259<br>MASE=2.554<br>RMSE= 1.598<br>R2=0.0676       | MAE=20.468<br>MASE=1358.52<br>RMSE=36.85<br>R2=0.176      | MAE=3.1046<br>MASE=16.046<br>RMSE=4.005<br>R2=0.4775   | X   | MAE=1.658<br>MASE=4.024<br>RMSE=2.006<br>R2=0.0590   | MAE=166.6700<br>MASE=31745.512<br>RMSE=178.172<br>R2=0.0422   |
| SOILMOISTURE           | MAE= 0.936<br>MASE= 1.618<br>RMSE= 1.27<br>R2= -0.113      | MAE=22.930<br>MASE= 1473.35<br>RMSE= 38.23<br>R2=-0.0140  | MAE=1.185<br>MASE=3.058<br>RMSE= 1.748<br>R2= 0.0505   | MAE=3.6435<br>MASE=24.41<br>RMSE= 4.94<br>R2=0.0159   | X  | MAE=125.65<br>MASE=22858.07<br>RMSE= 151.18<br>R2= 0.288      |
| WATER LEVEL            | MAE= 0.850<br>MASE=1.518<br>RMSE=1.23<br>R2=0.2719         | MAE= 23.489<br>MASE= 1536.91<br>RMSE= 39.20<br>R2= 0.0056 | MAE= 3.864<br>MASE= 28.33<br>RMSE= 5.322<br>R2= 0.0316 | MAE=1.185<br>MASE=2.916<br>RMSE=1.707<br>R2=0.0823    | MAE=1.451<br>MASE=3.329<br>RMSE= 1.824<br>R2= 0.3089 | X   |

Table 8: Linear Regression Between Parameters for Full Phase of Coriander Plant Growth

From Table 8, it can be inferred that water level and pH are the most corelated parameters in the full phase analysis of the experiment as MAE=0.850. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be corelated are temperature and water level as the MAE=166.67, this means that the value of Water level cannot be predicted with a given temperature.

## 6.2 Predictive Analysis of parameters using Support Vector Regression

| PARAMETER VS PARAMETER | PH | SUNLIGHT   | HUMIDITY  | TEMPERATURE   | SOILMOISTURE  | WATER LEVEL   |
|------------------------|----|--|---|---|---|---|
| PH                     | X  | MAE=22.102<br>MASE=2351.64<br>RMSE=48.49<br>R2=-0.0852 | MAE=2.9432<br>MASE=15.363<br>RMSE=3.919<br>R2= 0.2227 | MAE=0.82803<br>MASE=1.598<br>RMSE=1.2642<br>R2=0.0446 | MAE=0.8812<br>MASE=1.423<br>RMSE=1.193<br>R2=-0.174 | MAE= 10.6116<br>MASE= 218.732<br>RMSE= 14.789<br>R2=-0.0377 |

|                          |  |   |  |   |  |   |
|--------------------------|--|---|--|---|--|---|
| <b>SUNLIGHT</b>          | MAE=0.346<br>0 MASE=<br>0.227<br>RMSE=<br>0.4766<br>R2= -0.0458  | X   | MAE= 2.836<br>MASE=13.77<br>0 RMSE=<br>3.710 R2=<br>0.264  | MAE= 0.518<br>MASE= 0.871<br>RMSE= 0.933<br>R2= 0.450     | MAE=0.8686<br>MASE=1.362<br>RMSE= 1.167<br>R2=-0.120         | MAE=0.989<br>MASE= 1.627<br>RMSE= 1.275<br>R2=-0.225              |
| <b>HUMIDITY</b>          | MAE=0.310<br>MASE=0.17<br>4 RMSE=<br>0.417<br>R2=0.275           | MAE=17.27<br>MASE=<br>1259.407<br>RMSE= 35.48<br>R2= 0.0078           | X  | MAE= 0.683<br>MASE= 0.825<br>RMSE=0.908<br>R2= 0.3423     | MAE=0.833<br>MASE=1.378<br>RMSE=1.174<br>R2= -0.057          | MAE=9.329<br>MASE=169.08<br>1 RMSE=13.003<br>1 R2=0.0302          |
| <b>TEMPERATU<br/>RE</b>  | MAE=0.396<br>MASE=0.31<br>7 RMSE=<br>0.563<br>R2=0.00755         | MAE=13.68<br>MASE=1172.<br>59 RMSE=34.24<br>R2=0.2142                 | MAE=2.742<br>MASE=11.73<br>7 RMSE=3.425<br>R2=0.466        | X   | MAE=0.842<br>MASE=1.325<br>RMSE=1.151<br>R2=-0.1810          | MAE=7.9547<br>MASE=137.19<br>9 RMSE=11.713<br>R2=0.25006          |
| <b>SOILMOISTU<br/>RE</b> | MAE= 0.348<br>MASE=<br>0.199<br>RMSE=<br>0.4461 R2=<br>= -0.0110 | MAE=20.962<br>MASE=<br>2052.051<br>RMSE=<br>45.299 R2=-<br>0.0695     | MAE=3.7415<br>MASE=23.29<br>7 RMSE=4.826<br>R2= -0.0293    | MAE=0.896<br>MASE=1.852<br>RMSE=<br>1.3611 R2=-<br>0.1329 | X  | MAE=8.9695<br>MASE=161.80<br>12 RMSE=<br>12.7201 R2= -<br>0.00836 |
| <b>WATER<br/>LEVEL</b>   | MAE= 0.359<br>MASE=0.26<br>67 RMSE=0.51<br>65 R2=-<br>0.0788     | MAE=<br>23.2524<br>MASE=<br>2417.059<br>RMSE=<br>49.1636<br>R2=0.0059 | MAE= 2.9750<br>MASE=16.44<br>0 RMSE=4.054<br>65 R2=0.02438 | MAE=1.00006<br>MASE=2.7029<br>4 RMSE=1.6440<br>R2=0.1164  | MAE=0.7492<br>MASE=1.0809<br>RMSE=<br>1.0396 R2= -<br>0.1662 | X   |

*Table 9: Support Vector Regression Between Parameters for Initial Phase of Coriander Plant Growth*

From Table 9, it can be inferred that humidity and pH are the most corelated parameters in the initial phase of the experiment as MAE=0.310. This means, with a given humidity level, we can predict the pH required for a good yield. The parameters that cannot be corelated are water level and sunlight as the MAE=23.025, this means that the value of Water level cannot be predicted with a given luminous intensity.

| PARAMETER<br>VS<br>PARAMETER | PH   | SUNLIGHT   | HUMIDITY   | TEMPERATU<br>RE                                      | SOILMOISTU<br>RE                                     | WATER<br>LEVEL   |
|------------------------------|--|--|--|--|--|--|
| PH                           | X  | MAE=17.013<br>MASE=1014.<br>28 RMSE=31.84<br>R2=-0.0743          | MAE=3.8003<br>MASE=25.3<br>6 RMSE=5.03<br>61 R2=<br>0.0470     | MAE=0.995<br>MASE=2.330<br>RMSE=1.526<br>R2=0.1112   | MAE=1.638<br>MASE=4.429<br>RMSE=2.104<br>R2=0.0109   | MAE= 120.94.<br>MASE=<br>24176.55<br>RMSE=<br>155.48<br>R2=0.026 |
| SUNLIGHT                     | MAE=1.005<br>MASE=<br>4.719<br>RMSE=<br>2.172 R2= -<br>0.0719    | X  | MAE= 3.602<br>MASE=23.9<br>74 RMSE=4.89<br>6 R2= 0.1506        | MAE= 0.802<br>MASE=1.444<br>RMSE=1.2019<br>R2=0.430  | MAE=1.6199<br>MASE=4.0536<br>RMSE=2.013<br>R2=0.0220 | MAE=139.698<br>MASE=29287.<br>10 RMSE=171.13<br>4 R2=-0.1414     |
| HUMIDITY                     | MAE=0.822<br>MASE=1.87<br>9 RMSE=<br>1.370 R2=-<br>0.0892        | MAE=17.210<br>MASE=1090.<br>04 RMSE=33.01<br>5 R2= 0.0421        | X  | MAE=0.745<br>MASE=0.958<br>RMSE=0.979<br>R2= 0.7400  | MAE=1.749<br>MASE=4.602<br>RMSE=2.1453<br>R2=0.0295  | MAE=134.739<br>MASE=<br>24557.95<br>RMSE=156.70<br>9 R2=-0.0675  |
| TEMPERATU<br>RE              | MAE=0.839<br>MASE=1.93<br>4 RMSE=1.3<br>91 R2=-<br>0.0447        | MAE=18.473<br>MASE=1451.<br>83 RMSE=38.10<br>2 R2=0.1318         | MAE=2.618<br>MASE=11.7<br>8 RMSE=3.43<br>R2=0.572              | X  | MAE=1.564<br>MASE=3.69<br>RMSE=1.922<br>R2=0.0255    | MAE=139.68<br>MASE=26889.<br>48 RMSE=163.98<br>0 R2=-0.00359     |
| SOILMOISTU<br>RE             | MAE=<br>0.886<br>MASE=<br>2.831<br>RMSE=1.6<br>82 R2= -<br>0.037 | MAE=18.183<br>MASE=<br>1149.82<br>RMSE=<br>33.909 R2=-<br>0.0549 | MAE=<br>4.1329<br>MASE=30.3<br>2 RMSE=<br>5.5065 R2=<br>0.0070 | MAE=1.1566<br>MASE=3.419<br>RMSE= 1.84<br>R2=-0.0083 | X  | MAE=136.775<br>MASE=24782.<br>89 RMSE=157.42<br>R2=0.0698        |

|             |   |  |   |   |  |   |
|-------------|---|--|---|---|--|---|
| WATER LEVEL | MAE=0.586<br>8<br>MASE=1.54<br>2<br>RMSE=1.2<br>41<br>R2=0.3133 | MAE=17.654<br>MASE=1008.<br>07<br>RMSE=31.75<br>0<br>R2=-<br>0.04008 | MAE=3.581<br>MASE=24.3<br>07<br>RMSE=4.93<br>0<br>R2=0.1196 | MAE=1.176<br>MASE=3.361<br>RMSE=1.83<br>R2=0.0380 | MAE=1.2847<br>MASE=2.611<br>RMSE=1.616<br>R2=0.368 | X |
|-------------|---|--|---|---|--|---|

*Table 10: Support Vector Regression Between Parameters for Growing Phase of Coriander Plant Growth*

From Table 10, it can be inferred that water level and pH are the most corelated parameters in the growth phase of the experiment as MAE=0.586. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be corelated are temperature and water level as the MAE=139.68, this means that the value of Water level cannot be predicted with a given temperature.

| PARAMETER VS PARAMETER | PH  | SUNLIGHT   | HUMIDITY   | TEMPERATURE  | SOILMOISTURE  | WATER LEVEL   |
|------------------------|---|--|--|--|---|---|
| PH                     | X   | MAE=14.519<br>MASE=1121.4<br>0<br>RMSE=33.487<br>R2=-0.055   | MAE=3.750<br>MASE=23.1<br>79<br>RMSE=4.81<br>4<br>R2=0.2572      | MAE=0.8486<br>MASE=1.7209<br>RMSE=1.311<br>R2=0.0536       | MAE=1.2121<br>MASE=2.518<br>RMSE=1.586<br>R2=0.0438 | MAE= 109.77<br>MASE=<br>21901.17<br>RMSE= 147.99<br>R2=-0.1792  |
| SUNLIGHT               | MAE=0.975<br>MASE=<br>1.782<br>RMSE=<br>1.334<br>R2=<br>0.0502  | X  | MAE= 3.642<br>MASE=<br>23.84<br>RMSE=<br>4.883<br>R2=<br>0.2922  | MAE= 0.5587<br>MASE=<br>0.9602<br>RMSE= 0.979<br>R2= 0.537 | MAE=1.033<br>MASE=1.731<br>RMSE= 1.315<br>R2=-0.109 | MAE=110.02<br>MASE=21459.3<br>7<br>RMSE= 146.49<br>R2=0.334     |
| HUMIDITY               | MAE=0.733<br>MASE=1.09<br>97<br>RMSE=1.04<br>87<br>R2=0.1170    | MAE=15.693<br>MASE=<br>1416.608<br>RMSE=37.637<br>R2=0.1004  | X  | MAE=0.6907<br>MASE=1.549<br>RMSE=1.244<br>R2=0.144         | MAE=1.197<br>MASE=2.227<br>RMSE=1.492<br>R2= -0.087 | MAE=112.208<br>MASE=21545.4<br>1<br>RMSE=146.783<br>R2=-0.1230  |
| TEMPERATURE            | MAE=0.848<br>MASE=1.30<br>7<br>RMSE=<br>1.143<br>R2=-<br>0.0404 | MAE=7.830<br>MASE=209.74<br>RMSE=14.482<br>R2=0.491          | MAE=2.654<br>MASE=13.0<br>2<br>RMSE=3.60<br>9<br>R2=0.3560       | X  | MAE=0.9160<br>MASE=1.190<br>RMSE=1.090<br>R2=-0.012 | MAE=103.405<br>MASE=18617.3<br>95<br>RMSE=136.445<br>R2=-0.0513 |
| SOILMOISTURE           | MAE=0.908<br>MASE=1.57<br>6<br>RMSE=1.25<br>5<br>R2=0.0711      | MAE=14.502<br>MASE=1074.9<br>06<br>RMSE=32.785<br>R2=-0.0437 | MAE=4.892<br>MASE=38.3<br>07<br>RMSE=6.18<br>9<br>R2=<br>0.0917  | MAE=1.027<br>MASE=2.190<br>RMSE=1.480<br>R2=-0.0648        | X   | MAE=117.428<br>MASE=22258.2<br>8<br>RMSE=149.192<br>R2= 0.1749  |
| WATER LEVEL            | MAE=0.868<br>MASE=2.47<br>9<br>RMSE=1.57<br>4<br>R2=0.069       | MAE=13.670<br>MASE=525.30<br>1<br>RMSE=22.919<br>R2= -0.1050 | MAE=<br>3.9546<br>MASE=25.5<br>71<br>RMSE=5.05<br>6<br>R2=0.3047 | MAE=0.785<br>MASE=1.084<br>RMSE=1.041<br>R2=-0.011         | MAE=0.9191<br>MASE=1.329<br>RMSE= 1.152<br>R2=0.298 | X   |

*Table 11: Support Vector Regression Between Parameters for Harvesting Phase of Coriander Plant Growth*

From Table 11, it can be inferred that sunlight and temperature are the most corelated parameters in the harvesting phase of the experiment as MAE=0.558. This means, with a given luminous intensity, we can predict the temperature required for a good yield. The parameters that cannot be corelated are soil moisture and water level as the MAE=117.428, this means that the value of Water level cannot be predicted with a soil moisture.



| PARAMETER VS PARAMETER | PH  | SUNLIGHT  | HUMIDITY  | TEMPERATURE  | SOILMOISTURE  | WATER LEVEL   |
|------------------------|---|---|---|--|---|---|
| PH                     | X   | MAE=18.38<br>MASE=1347.984<br>RMSE=36.71<br>R2=-0.0432    | MAE=3.538<br>MASE=22.984<br>RMSE=4.794<br>R2=0.0380     | MAE=1.002<br>MASE=2.368<br>RMSE=1.539<br>R2=0.189    | MAE=1.506<br>MASE=3.971<br>RMSE=1.992<br>R2=0.1733    | MAE= 127.77.<br>MASE=22839.3<br>RMSE=151.12<br>R2=0.288   |
| SUNLIGHT               | MAE=0.9430<br>MASE=2.927<br>RMSE=1.711<br>R2=-0.00975 | X   | MAE= 3.621<br>MASE=23.651<br>RMSE=4.8632<br>R2=0.21463  | MAE= 1.111<br>MASE=2.539<br>RMSE=1.593<br>R2= 0.3130 | MAE=1.9406<br>MASE=5.305<br>RMSE=2.3033<br>R2=-0.0322 | MAE=162.013<br>MASE=31499.0<br>RMSE=177.479<br>R2=0.0218  |
| HUMIDITY               | MAE=0.9039<br>MASE=1.6860<br>RMSE=1.298<br>R2=-0.0062 | MAE=18.2066<br>MASE=1258.105<br>RMSE=35.469<br>R2= 0.0738 | X   | MAE= 0.974<br>MASE= 1.814<br>RMSE=1.3470<br>R2=0.486 | MAE=1.715<br>MASE=4.422<br>RMSE=2.102<br>R2= 0.0019   | MAE=161.61<br>MASE=30181.06<br>RMSE=173.72<br>R2=0.057    |
| TEMPERATURE            | MAE=0.8985<br>MASE=2.781<br>RMSE=1.668<br>R2=0.0656   | MAE=18.518<br>MASE=1583.68<br>RMSE=39.109<br>R2=0.115     | MAE=2.86<br>MASE=13.61<br>RMSE=3.689<br>R2=0.4670       | X  | MAE=1.609<br>MASE=4.139<br>RMSE=2.034<br>R2=0.0995    | MAE=136.567<br>MASE=26169.03<br>RMSE=161.76<br>R2=0.148   |
| SOILMOISTURE           | MAE=0.8068<br>MASE=1.744<br>RMSE=1.320<br>R2=0.0942   | MAE=20.280<br>MASE=1555.81<br>RMSE=39.443<br>R2=-0.055    | MAE= 3.8521<br>MASE=27.5794<br>RMSE=5.251<br>R2=0.0213  | MAE=1.179<br>MASE=3.128<br>RMSE= 1.768<br>R2=0.0436  | X   | MAE=110.411<br>MASE=21951.64<br>RMSE=148.160<br>R2= 0.312 |
| WATER LEVEL            | MAE= 0.682<br>MASE=1.331<br>RMSE=1.153<br>R2=0.388    | MAE= 19.253<br>MASE=1462.55<br>RMSE=38.243<br>R2= -0.0474 | MAE= 3.608<br>MASE=25.069<br>RMSE=5.0069<br>R2=-0.00369 | MAE=1.0911<br>MASE=2.591<br>RMSE=1.609<br>R2=0.1359  | MAE=1.237<br>MASE=2.696<br>RMSE= 1.642<br>R2= 0.4985  | X   |

*Table 12: Support Vector Regression Between Parameters for Full Phase of Coriander Plant Growth*

From Table 12, it can be inferred that water level and pH are the most correlated parameters in the full phase analysis of the experiment as MAE=0.682. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be correlated are sunlight and water level as the MAE=162.013, this means that the value of Water level cannot be predicted with a given luminous intensity. From Table 12, it can be inferred that water level and pH are the most correlated parameters in the full phase analysis of the experiment as MAE=0.682. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be correlated are sunlight and water level as the MAE=162.013, this means that the value of Water level cannot be predicted with a given luminous intensity.

### 6.3 Predictive Analysis of parameters using Decision Tree Regression

| PARAMETER VS PARAMETER | PH                       | SUNLIGHT  | HUMIDITY  | TEMPERATURE  | SOILMOISTURE   | WATER LEVEL   |
|------------------------|--------------------------|---|---|--|--|---|
| PH                     | X                        | MAE=25.117<br>MASE=1570.68<br>RMSE=39.631<br>R2=-0.0493 | MAE=3.4989<br>MASE=21.020<br>RMSE=4.584<br>R2=0.262 | MAE=1.085<br>MASE=2.704<br>RMSE=1.644<br>R2=-0.415 | MAE=0.952<br>MASE=1.3727<br>RMSE=1.171<br>R2=-0.1289 | MAE=11.330<br>MASE=266.11<br>RMSE=16.312<br>R2=-0.303 |
| SUNLIGHT               | MAE=0.4213<br>MASE=0.329 | X   | MAE= 3.117<br>MASE=16.69                            | MAE= 0.637<br>MASE=1.028                           | MAE=1.126<br>MASE=2.266                              | MAE=0.996<br>MASE=1.558                               |

|              |   |  |  |   |   |   |
|--------------|---|--|--|---|---|---|
|              | RMSE=0.573<br>R2=-0.227                             |  | RMSE=4.085<br>R2=0.216                               | RMSE=1.014<br>R2=0.5450                               | RMSE=1.505<br>R2=-0.0655                              | RMSE=1.248<br>R2=-0.3035                                  |
| HUMIDITY     | MAE=0.408<br>MASE=0.292<br>RMSE=0.541<br>R2=-0.365  | MAE=36.44<br>MASE=4653.88<br>RMSE=68.219<br>R2=-0.3042 | X  | MAE=0.9103<br>MASE=1.477<br>RMSE=1.215<br>R2=0.174    | MAE=1.0399<br>MASE=2.304<br>RMSE=1.517<br>R2=-0.2165  | MAE=11.833<br>MASE=332.3<br>1<br>RMSE=18.22<br>R2=-1.0522 |
| TEMPERATURE  | MAE=0.389<br>MASE=0.280<br>RMSE=0.529<br>R2=-0.0033 | MAE=23.802<br>MASE=2150.406<br>RMSE=46.37<br>R2=0.322  | MAE=2.903<br>MASE=11.880<br>RMSE=3.446<br>R2=0.410   | X   | MAE=1.1320<br>MASE=1.858<br>RMSE=1.363<br>R2=-0.433   | MAE=8.271<br>MASE=122.69<br>RMSE=11.07<br>R2=0.303        |
| SOILMOISTURE | MAE=0.406<br>MASE=0.294<br>RMSE=0.542<br>R2=-0.0160 | MAE=28.44<br>MASE=2407.91<br>RMSE=49.070<br>R2=-0.0055 | MAE=3.018<br>MASE=16.75<br>RMSE=4.093<br>R2=-0.020   | MAE=0.7735<br>MASE=1.104<br>RMSE=1.050<br>R2=-0.0059  | X   | MAE=11.341<br>MASE=217.46<br>RMSE=14.74<br>R2=-0.205      |
| WATER LEVEL  | MAE=0.334<br>MASE=0.218<br>RMSE=0.467<br>R2=-0.129  | MAE=21.03<br>MASE=1526.93<br>RMSE=39.075<br>R2=0.2402  | MAE=3.323<br>MASE=18.834<br>RMSE=4.339<br>R2=0.05843 | MAE=0.919<br>MASE=2.70294<br>RMSE=1.5006<br>R2=0.0072 | MAE=1.0835<br>MASE=1.879<br>RMSE=1.3707<br>R2=-0.5531 | X   |

*Table 13: Decision Tree Regression Between Parameters for Initial Phase of Coriander Plant Growth*

From Table 13, it can be inferred that water level and pH are the most corelated parameters in the initial phase of the experiment as MAE=0.334. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be corelated are water level and humidity as the MAE=11.833, this means that the value of Water level cannot be predicted with a given humidity.

| PARAMETER VS PARAMETER | PH   | SUNLIGHT  | HUMIDITY   | TEMPERATURE  | SOILMOISTURE   | WATER LEVEL   |
|------------------------|--|---|--|--|--|---|
| PH                     | X  | MAE=23.487<br>MASE=1556.330<br>RMSE=39.450<br>R2=-0.133 | MAE=4.4440<br>MASE=33.518<br>RMSE=5.789<br>R2=-0.066 | MAE=1.067<br>MASE=2.294<br>RMSE=1.514<br>R2=0.0555   | MAE=1.662<br>MASE=4.845<br>RMSE=2.201<br>R2=0.0173   | MAE=86.23<br>MASE=14214.92<br>RMSE=119.22<br>R2=0.422     |
| SUNLIGHT               | MAE=1.2107<br>MASE=5.287<br>RMSE=2.299<br>R2=-0.220  | X   | MAE=3.764<br>MASE=24.775<br>RMSE=4.977<br>R2=0.1022  | MAE=0.902<br>MASE=2.036<br>RMSE=2.036<br>R2=0.3970   | MAE=1.852<br>MASE=5.100<br>RMSE=2.258<br>R2=-0.126   | MAE=140.63<br>MASE=28070.58<br>RMSE=167.54<br>R2=-0.131   |
| HUMIDITY               | MAE=1.085<br>MASE=2.475<br>RMSE=1.57<br>R2=-0.264    | MAE=19.74<br>MASE=1059.71<br>RMSE=32.55<br>R2=-0.2786   | X  | MAE=0.9107<br>MASE=1.569<br>RMSE=1.252<br>R2=0.438   | MAE=1.816<br>MASE=5.153<br>RMSE=2.270<br>R2=-0.4041  | MAE=142.944<br>MASE=32162.22<br>RMSE=179.338<br>R2=-0.161 |
| TEMPERATURE            | MAE=0.947<br>MASE=1.723<br>RMSE=1.312<br>R2=-0.142   | MAE=15.279<br>MASE=791.16<br>RMSE=28.127<br>R2=0.2953   | MAE=2.512<br>MASE=11.047<br>RMSE=3.323<br>R2=0.475   | X  | MAE=1.775<br>MASE=4.988<br>RMSE=2.233<br>R2=-0.105   | MAE=134.80<br>MASE=25756.83<br>RMSE=160.48<br>R2=-0.010   |
| SOILMOISTURE           | MAE=1.0263<br>MASE=4.360<br>RMSE=2.088<br>R2=-0.0082 | MAE=21.63<br>MASE=1319.71<br>RMSE=36.32<br>R2=-0.0284   | MAE=3.285<br>MASE=19.059<br>RMSE=4.365<br>R2=-0.0023 | MAE=1.063<br>MASE=2.231<br>RMSE=1.493<br>R2=0.0132   | X  | MAE=121.68<br>MASE=22438.58<br>RMSE=149.79<br>R2=0.1508   |
| WATER LEVEL            | MAE=0.6981<br>MASE=1.371<br>RMSE=1.171<br>R2=0.0499  | MAE=22.549<br>MASE=1676.62<br>RMSE=40.94<br>R2=-0.261   | MAE=3.063<br>MASE=20.044<br>RMSE=4.477<br>R2=0.2023  | MAE=1.067<br>MASE=3.0071<br>RMSE=1.734<br>R2=0.09765 | MAE=1.528<br>MASE=3.8184<br>RMSE=1.9540<br>R2=0.0723 | X   |

*Table 14: Decision Tree Regression Between Parameters for Growing Phase of Coriander Plant Growth*

From Table 14, it can be inferred that water level and pH are the most corelated parameters in the growth phase of the experiment as MAE=0.698. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be corelated are water level and humidity as the MAE=142.944, this means that the value of Water level cannot be predicted with a given humidity.

| PARAMETER VS PARAMETER | PH   | SUNLIGHT  | HUMIDITY   | TEMPERATUR E  | SOILMOISTUR E   | WATER LEVEL   |
|------------------------|--|---|--|---|---|---|
| PH                     | X  | MAE=22.732<br>MASE=2045.76<br>RMSE=45.230<br>R2=-0.0708 | MAE=4.569<br>MASE=45.141<br>RMSE=6.718<br>R2=-0.4399 | MAE=0.882<br>MASE=2.502<br>RMSE=1.581<br>R2=-0.225      | MAE=1.471<br>MASE=4.134<br>RMSE=2.0333<br>R2=-0.8793    | MAE= 83.55<br>MASE=18340.29<br>RMSE=135.42<br>R2=-0.069   |
| SUNLIGHT               | MAE=1.146<br>MASE=2.743<br>RMSE=1.656<br>R2= -0.0261 | X   | MAE=3.395<br>MASE=21.554<br>RMSE=4.642<br>R2=0.414   | MAE= 0.6377<br>MASE= 1.307<br>RMSE=1.143<br>R2= 0.498   | MAE=1.5740<br>MASE=3.8384<br>RMSE=1.959<br>R2=-0.453    | MAE=129.51<br>MASE=25884.24<br>RMSE=160.885<br>R2=-0.4367 |
| HUMIDITY               | MAE=1.062<br>MASE=2.186<br>RMSE=1.478<br>R2=-0.724   | MAE=15.92<br>MASE=505.16<br>RMSE=22.47<br>R2=0.59       | X  | MAE=0.841<br>MASE=2.206<br>RMSE=1.485<br>R2= -0.262     | MAE=1.522<br>MASE=3.722<br>RMSE=1.929<br>R2= -0.926     | MAE=87.022<br>MASE=15484.1<br>RMSE=124.43<br>R2=-0.135    |
| TEMPERATUR E           | MAE=0.723<br>MASE=0.985<br>RMSE=0.992<br>R2=0.4802   | MAE=7.183<br>MASE=198.86<br>RMSE=14.102<br>R2=0.787     | MAE=3.359<br>MASE=23.251<br>RMSE=4.822<br>R2=0.342   | X   | MAE=1.123<br>MASE=1.954<br>RMSE=1.397<br>R2=-0.4325     | MAE=93.27<br>MASE=15132.8<br>RMSE=123.01<br>R2=-0.0493    |
| SOILMOISTUR E          | MAE=1.046<br>MASE=1.781<br>RMSE=1.33<br>R2= -0.018   | MAE=28.62<br>MASE=2623.48<br>RMSE=51.220<br>R2=-0.0750  | MAE=4.297<br>MASE=29.772<br>RMSE=5.456<br>R2=-0.190  | MAE=1.060<br>MASE=1.905<br>RMSE=1.380<br>R2=-0.3879     | X   | MAE=117.64<br>MASE=22102.11<br>RMSE=148.66<br>R2=-0.1676  |
| WATER LEVEL            | MAE=0.7400<br>MASE=1.444<br>RMSE=1.201<br>R2=0.158   | MAE=22.803<br>MASE=1843.464<br>RMSE=42.935<br>R2=-0.616 | MAE=4.103<br>MASE=32.056<br>RMSE=5.661<br>R2=0.0454  | MAE=1.00740<br>MASE=2.8656<br>RMSE=1.6928<br>R2=-0.9196 | MAE=1.197<br>MASE=2.6819<br>RMSE=1.6376<br>R2= -0.33059 | X   |

Table 15: Decision Tree Regression Between Parameters for Harvesting Phase of Coriander Plant Growth

From Table 15, it can be inferred that sunlight and temperature are the most corelated parameters in the harvesting phase of the experiment as MAE=0.6377. This means, with a given temperature, we can predict the luminous intensity required for a good yield. The parameters that cannot be corelated are water level and sunlight as the MAE=129.51, this means that the value of Water level cannot be predicted with a given sunlight.

| PARAMETER VS PARAMETER | PH  | SUNLIGHT   | HUMIDITY  | TEMPERATUR E  | SOILMOISTUR E  | WATER LEVEL   |
|------------------------|---|--|---|---|--|---|
| PH                     | X   | MAE=23.667<br>MASE=1574.28<br>RMSE=39.67<br>R2=-0.0871 | MAE=3.77<br>MASE=26.197<br>RMSE=5.118<br>R2= 0.0070 | MAE=1.162<br>MASE=3.1117<br>RMSE=1.764<br>R2=0.0277 | MAE=1.375<br>MASE=3.4744<br>RMSE=1.863<br>R2=0.2968  | MAE= 70.152<br>MASE=13362.83<br>RMSE=115.597<br>R2=-0.589 |
| SUNLIGHT               | MAE=1.0190<br>MASE=2.469<br>RMSE=1.571<br>R2= -0.1476 | X  | MAE=3.674<br>MASE=22.97<br>RMSE=4.793<br>R2=0.171   | MAE=1.0661<br>MASE=2.232<br>RMSE=1.494<br>R2=0.2434 | MAE=1.857<br>MASE=5.101<br>RMSE=2.258<br>R2=-0.155   | MAE=163.11<br>MASE=34396.27<br>RMSE=185.46<br>R2=-0.0659  |
| HUMIDITY               | MAE=1.032<br>MASE=1.956<br>RMSE=1.398<br>R2=-0.219    | MAE=22.217<br>MASE=1540.602                            | X   | MAE=0.961<br>MASE=1.620<br>RMSE=1.272<br>R2=0.3378  | MAE=1.906<br>MASE=5.624<br>RMSE=2.371<br>R2= -0.1596 | MAE=162.59<br>MASE=36533.3<br>RMSE=191.13<br>R2=-0.152    |

|              |  |  |   |   |  |  |
|--------------|--|--|---|---|--|--|
|              |  | RMSE=39.250<br>R2=0.1037                               |   |   |  |  |
| TEMPERATURE  | MAE=0.911<br>MASE=1.703<br>RMSE=1.305<br>R2=0.11710  | MAE=17.664<br>MASE=1005.81<br>RMSE=31.714<br>R2=0.0440 | MAE=3.0675<br>MASE=16.238<br>RMSE=4.0296<br>R2=0.3001 | X   | MAE=1.650<br>MASE=4.224<br>RMSE=2.055<br>R2=0.0587 | MAE=147.269<br>MASE=29019.5<br>RMSE=170.351<br>R2=0.1299 |
| SOILMOISTURE | MAE=0.9751<br>MASE=2.7447<br>RMSE=1.656<br>R2=0.0873 | MAE=20.854<br>MASE=1216.04<br>RMSE=34.87<br>R2=0.00587 | MAE=3.995<br>MASE=28.318<br>RMSE=5.321<br>R2=-0.0553  | MAE=1.0834<br>MASE=2.619<br>RMSE=1.618<br>R2=0.109    | X  | MAE=112.74<br>MASE=20885.92<br>RMSE=144.519<br>R2=0.3583 |
| WATER LEVEL  | MAE=0.706<br>MASE=1.328<br>RMSE=1.152<br>R2=0.210    | MAE=23.019<br>MASE=1913.38<br>RMSE=43.74<br>R2=0.0553  | MAE=3.665<br>MASE=25.972<br>RMSE=5.096<br>R2=0.0735   | MAE=1.1366<br>MASE=3.302<br>RMSE=1.8172<br>R2=-0.2404 | MAE=1.253<br>MASE=2.836<br>RMSE=1.684<br>R2=0.4258 | X  |

*Table 16: Decision Tree Regression Between Parameters for Full Phase of Coriander Plant Growth*

From Table 16, it can be inferred that water level and pH are the most correlated parameters in the full phase analysis of the experiment as MAE=0.706. This means, with a given water level, we can predict the pH required for a good yield. The parameters that cannot be correlated are water level and sunlight as the MAE=163.11, this means that the value of Water level cannot be predicted with a given luminous intensity.

## 7 Conclusions

In conclusion, our whole work can be split into two main part. The first one being the growth of plants and creation of data set, in this we have grown the crops and taken the data with the help of sensors. In this aspect, there is minimal automation. The dataset is then created by taking the data and cleaning it to make sure that the anomalies are removed. With the help of this data set, we then move onto the second phase of the work. The second phase of this work is processing of the data set created and correlating the data to establish the best scenario for plant growth and good yield. With the help of Linear Regression, Support vector regression and Decision Tree Regression, we have established the parameters which are best correlated.

## 8 Future Work

For the work that can be done to further the progress done by us is to fully automate the system. With the correlation achieved by us, the parameters can be used to know the ambient conditions required when a certain parameter is fixed and cannot be altered in any way possible especially in the city environment in countries like India.

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