

Crop Yield Prediction based on Indian Agriculture using Machine Learning

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Abstract — India is an agricultural country with a thriving economy. Agriculture directly employs 70% of the Indian population. The most common issue among young Indian farmers is selecting the appropriate crop depending on soil requirements. They are consequently seeing a marked decline in productivity. Our work offers to assist farmers in determining soil quality by analyzing its many factors and recommending crops based on the results obtained using a data mining approach. To boost the efficiency of the Crop Recommendation System, the system employs the Random Forest Classification algorithm. The technology correlates soil and crop data to forecast a list of crops suitable for the soil as well as details on the nutrients in the soil that are insufficient for the particular crop. The choice of the crop to be sown is therefore left to the user. As a result, the method contributes to the education of inexperienced

farmers. The dataset for our crop prediction experiment was obtained from kaggle.com. Crop forecast criteria include location, temperature, humidity, ph, rainfall, N, P, K, and so on. These criteria are now taken into account while producing a given crop on a specific type of soil. To choose the optimum type of crop to be grown, a crop recommender system takes into account the numerous soil factors. This particular recommender system model will take temperature, humidity, and soil moisture content into account.

Keywords— crop prediction, soil parameters, crop price prediction, crop yield, effects of climate changes on agriculture, agriculture land grading, efficient use of fertilizers model etc.

I. INTRODUCTION

In terms of agricultural output, India is among the world's leaders. Despite being a significant producer of agricultural products, India's agricultural productivity remains low. Farmers earn extremely little money due to low farm yield. Productivity must grow in order for farmers to earn more money. To maximize productivity, farmers should understand which crop would be suitable for the particular piece of land. If the correct type of crop is grown on that plot of land, the crop's yield will immediately increase. As a result, crop suggestion systems can be quite valuable to farmers. The growth of crops is impacted by many different things. Temperature, humidity, pH, rainfall, potassium, nitrogen, and phosphorus levels in the soil are all elements that influence yield. Many farmers have no notion which crops should be cultivated in certain areas to maximize production and profit. As a result, in this study, we will demonstrate how machine learning algorithms can be used to estimate agricultural yield and pricing.

Agriculture is India's backbone. As we all know, food is the most basic essential for living; therefore, the agriculture sector should be prioritized in development. The Indian agriculture sector contributes for 18 percent of the country's agriculture gross domestic product (GDP) and employs 50% of the workforce. The primary reason for examining the Agriculture sector is that it is critical to the development of the country's economy. Crop Selection is the area of research for the suggested system since it is the first and most essential phase in the process of agricultural development, and its success assures the outcome of production. Agriculture development provides crop growers with aid through the use of diverse agricultural resources. As a result, it offers high productivity while consuming few resources.

II. LITERATURE REVIEW

1)

Project Title : Crop Yield Prediction and Efficient use of Fertilizers

Author Name : S.Bhanumathi, M.Vineeth and N.Rohit

Year of Publish : 2019

Abstract :

Because India is an agricultural country, its economy is heavily reliant on agricultural yield increases and agroindustry products. Data mining is a new area of study in crop production analysis. In agriculture, yield prediction is a critical issue. Any farmer would like to know how much harvest he may expect. Analyze the different associated attributes such as location, pH value, and alkalinity of the soil. It is utilized in conjunction with third-party apps such as APIs for weather and temperature, kind of soil, nutrient value of the soil in that region, amount of rainfall in that region, and soil composition. All of the data properties will be examined, and the data will be trained using multiple machine learning methods to create a model. The system includes a model that is exact and accurate in predicting crop production and provides the end user with suitable suggestions about required fertilizer ratios based on atmospheric and soil parameters of the land, hence increasing crop yield and farmer revenue.

2)

Project Title : Crop Cultivation Information System on Mobile

Devices

Author Name : Vikas Kumar_, Vishal Dave_, Rohan Nagrani_, Sanjay Chaudhary

Year of Publish : 2017

Abstract :

People utilize mobile devices widely for communication, music, entertainment, the Internet, and social networking. There is a scarcity

of software that can help professionals boost their working capabilities. People in rural areas use mobile phones, yet there are few useful applications to help them enhance their productivity. We proposed and implemented an information system for farmers that can be accessed via mobile phones in this research. To process spatial data and knowledge base, the system is built with Service Oriented Architecture (SOA). Ontologies are used to preserve the knowledge base. The system is an attempt to bridge the knowledge gap between farmers and agricultural professionals. A farmer can give agricultural inputs as well as location-specific information to receive precise ideas, alerts, and recommendations to boost productivity. The knowledge base will be used to generate it. When a farmer notices unusual crop or weather behavior, the system can offer recommendations based on the inputs provided. As part of ongoing work, we have handled some of the queries, and the findings are displayed on Android-based mobile devices for system demonstration.

3)

Project Title : Crop Yield Forecasting
Methods
Author Name : 1R.K. Singh, 2T.R. Singh and 2U. Kaushal
Year of Publish : 2019
Abstract :

Increasing the accuracy of agricultural forecasts through the use of earth observation. According to the review study, the capacity to correctly forecast crop output and quality is vital for economic planning and commodity forecasting, as well as guaranteeing global food security. This paper discusses studies on an overview of existing crop yield forecasting methods, including strategies to apply crop yield forecasting methodologies to improve agriculture production forecasting.

4)

Project Title : Crop Prediction
Author Name : Mayank Champaneri, Chaitanya Chandvidkar
Year of Publish : 2020
Abstract :

The influence of climate change in India has had a negative impact on the performance of most agricultural products over the previous two decades. Predicting crop yields ahead of harvest would assist policymakers and farmers in taking proper marketing and storage measures. This research will assist farmers in determining the yield of their crop prior to cultivating on the agricultural field, allowing them to make informed decisions. It makes an attempt to answer the problem by creating a prototype of an interactive prediction system. The machine learning algorithm and an easy-to-use web-based graphic user interface will be implemented in such a system. The farmer will be informed of the outcome of the prediction. Thus, there are various strategies or algorithms for such types of data analytics in crop prediction, and with the help of those algorithms, we may predict crop production. The random forest method is employed.

There is no correct method or technology to overcome the predicament we confront after studying all of these challenges and problems such as weather, temperature, humidity, rainfall, and moisture. There are numerous approaches in India to boost economic growth in the agricultural sector. Data mining can also be used to forecast crop yield production. In general, data mining is the process of examining data from diverse perspectives and distilling it into useful information. Random forest is the most popular and powerful supervised machine learning algorithm, capable of performing both classification and regression tasks. It works by constructing a large number of decision trees during training time and generating class output that is the mode of the classes (classification) or

mean prediction (regression) of the individual trees.

5)

Project Title : Crop yield predictions - high resolution statistical model for intra-season forecasts applied to corn in the US

Author Name : Yiqing Cai, Kristen Moore, Adam Pellegrini, Aymn Elhaddad

Year of Publish : 2017

Abstract :

Accurate crop yield forecasting has far-reaching ramifications for economic trading, food production monitoring, and global food security. The range of environmental variables over time and geography, on the other hand, provides obstacles and limits the precision of yield models. Using data from the United States from 2001 to 2016, we construct a machine-learning-based model for estimating end-of-season, or final, maize yields. To obtain high precision in our intra-season projections, we mix many algorithms in a multi-level model and leverage understanding of physiological processes in temporal feature selection.

6)

Project Title : Applying data mining techniques to predict annual yield of major crops and recommend planting different crops in different districts in Bangladesh

Author Name : A.T.M Shakil Ahamed, Navid Tanzeem Mahmood, Nazmul Hossain

Year of Publish : 2015

Abstract :

Agricultural crop production is influenced by a variety of elements including biology, climate, economy, and geography. A variety of factors have varying effects on agriculture, which can be assessed using suitable statistical approaches. Using such procedures and techniques on

historical crop yields, farmers and government organizations can acquire information or knowledge that can assist them make better decisions and policies that lead to improved production. The focus of this study is on the use of data mining techniques to extract knowledge from agricultural data in order to estimate crop production for key cereal crops in major districts of Bangladesh.

7)

Project Title : Recommendation System for Crop Identification and Pest Control Technique in Agriculture

Author Name : Avinash Kumar, Sobhangi Sarkar and Chittaranjan Pradhan

Year of Publish : 2019

Abstract :

Most crops are lost in agriculture as a result of incorrect crop selection for a certain land holding. Farmers are frequently unaware of the crop's needs, such as minerals, soil moisture, and other soil requirements. Farmers may experience mental and financial distress as a result of this. Another issue that farmers commonly face is pests and illnesses that can impact the crops they raise and that they are generally ignorant of at an early stage. This farmer dilemma is addressed in our research, and we attempted to solve it using a Recommendation System. We use our model to estimate the optimum crop for the farmer, detect pests that may impact the crop, and provide pest control strategies. In this paper, we used the SVM classification algorithm, the Decision Tree algorithm, and the Logistic Regression algorithm, and we discovered that the SVM classification model outperforms the other algorithms in terms of accuracy.

8)

Project Title : Soil Classification using Machine Learning Methods and Crop Suggestion Based on Soil Series

Author Name : Sk Al Zaminur Rahman, Kaushik Chandra Mitra, S.M. Mohidul Islam

Year of Publish : 2018

Abstract :

Soil is an essential component of agriculture. There are various types of soil. Distinct types of soil have different characteristics, and different types of crops grow on different types of soils. To understand which crops grow best in which soil types, we need to grasp the traits and characteristics of distinct soil types. In this scenario, machine learning approaches may be useful. It has made significant progress in recent years. In agricultural data analysis, machine learning is still an emerging and hard study subject. In this research, we created a model that can predict soil series based on land type and then recommend suitable crops based on the prediction. Soil categorization employs a variety of machine learning methods, including weighted k-Nearest Neighbor (k-NN), Bagged Trees, and Gaussian kernel based Support Vector Machines (SVM). The experimental results reveal that the suggested SVM-based strategy outperforms numerous other methods.

9)

Project Title : Soil Health in Cropping Systems

Author Name : Subhadip Paul, Neha Chatterjee, J. S. Bohra, S. P. Singh

Year of Publish : 2019

Abstract :

Soil health has existed as an integrative feature that indicates the soil's ability to respond to agricultural interference in such a way that it persistently supports both agricultural production and the provision of other ecosystem services. The main conflict in sustainable soil management is to

protect ecosystem services while optimizing agricultural production. Soil health is expected to be dependent on the preservation of four primary functions: carbon changes, biogeochemistry-mediated nutrient cycles, soil structure maintenance, and pest and disease control via cropping systems. Each of these activities is identified as a combination of several biological processes carried out by numerous interdependent soil organisms, all of which are governed by the abiotic soil environment, which governs the assessment and maintenance of soil health.

10)

Project Title : Soil Quality for Sustainable Agriculture

Author Name : Duraisamy Vasu, Pramod Tiwary, Padikkal Chandran

Year of Publish : 2020

Abstract :

Being integral to all functions of terrestrial ecosystem, soil is intended to produce food or feeding the growing population of the world. However, food security is facing threat from soil degradation occurring worldwide. Soils degrade due to the exerting pressure from various sectors of the society including urbanization and industrialization. The major driving forces of soil degradation are deforestation, change in land use, soil erosion, uncontrolled grazing, waste disposal, and unscientific land management. Globally, 24% (350 lakh km²) of the land has degraded which is increasing at the rate of 50–100 lakh ha a year⁻¹ and poses threat to the livelihood of more than 1500 million people. In this scenario, sustaining soil quality (SQ) is the major challenge to meet the increasing food demand. Hence, evaluating and monitoring SQ is crucial to sustain agricultural production and to overcome the vagaries of climate change on soil functions. However, soil quality per se is complex and site-specific because of the larger variety of soil

usage, and its evaluation is difficult due to the subjectivity. Nonetheless, soil quality can be quantified in the form of an index or temporal and spatial comparison of various land use and management systems. In this chapter, we discuss the concept and importance of Soil Quality (SQ), indicators of SQ, minimum data set (MDS) for evaluating SQ, methods of MDS selection, and indexing of the soil quality. It will bring out the effect of soil and crop management practices such as tillage, cropping systems, cover crops, and nutrient management on soil quality and crop production focusing in tropical environments. We conclude that principal component analysis is an effective method to select MDS from a large set of soil properties and weighted index method of quantifying SQ proved to be efficient in predicting changes in SQ under various crop production systems. Conservation tillage methods coupled with integrated nutrient management sustains or upgrades the soil quality in different agroecosystems.

III. METHODOLOGY

Dilettante farmers today find it challenging to comprehend crop types, cultivation methods, climatic change, etc. The backbone of every country's economy is agriculture. Dilettante farmers are crucial to the future of agriculture. However, young farmers lack experience, therefore machine learning assists in resolving their issues. The current technique uses soil factors to forecast crop yield and uses machine learning to provide fertilizer. It helps end users choose the crop to be sowed by providing them with information about crop yield. As a result, novice farmers are unable to understand the system.

A specific Tamil Nadu district's major crop production was forecasted using the method. The client must create an account when they first log in to the flask-created Web application. The

SQLite database contains the login information. Once a user logs in, they have full access to the system and can anticipate crop production by using inputs like location, nitrogen, phosphorus, potassium, and pH values, which rely on the land's developing environment. By providing the input as the crop name, we can also determine the main nutrients in the soil. The controller receives the various inputs and utilizes Random Forest to classify the data. We recommend to the former how much fertilizer is required in ratio based on soil parameters and the crop price using machine learning techniques.

Module Description:

- Dataset collection
- Implementation
- Prediction

Dataset Collection:

The data for our crop prediction study was obtained from kaggle.com. Following the acquisition of numerous records, data is preprocessed. The dataset includes a greater number of records, some of which have missing values. The dataset has been cleaned up of those missing records, and pre-processing is done on the remaining records. Following the acquisition of numerous records, data is preprocessed. There are 103 records in the dataset overall, 6 of which have some missing values. The remaining 101 records are used for pre-processing after those 6 records were eliminated from the dataset.

Applying machine learning algorithm:

Classification and clustering algorithms are needed by the recommendation system in order to map datasets. Random Forest Algorithm is the suggested system for performing machine learning. Based on an investigation of several algorithms, it was discovered that the Random Forest provided the maximum efficiency and

precision in comparison to Decision tree, Random Forest, etc. As a result, the suggested system uses the Random Forest algorithm to identify the appropriate crop list.

Listing the suitable crops for the soil provided as input:

The technology makes more accurate and effective crop recommendations using a supervised machine learning algorithm. The system provides a list of suitable crops based on the soil, but it is up to the farmers to choose which crop to seed.

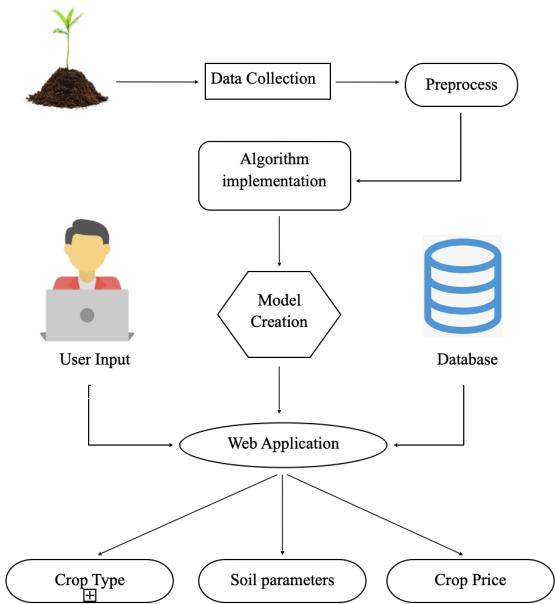
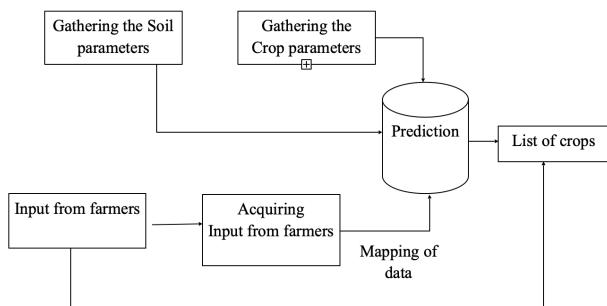
Prediction:

The user's input is added to the training dataset once preprocessed data have been trained. The predicted value is output on a web application after prediction (Flask Framework).

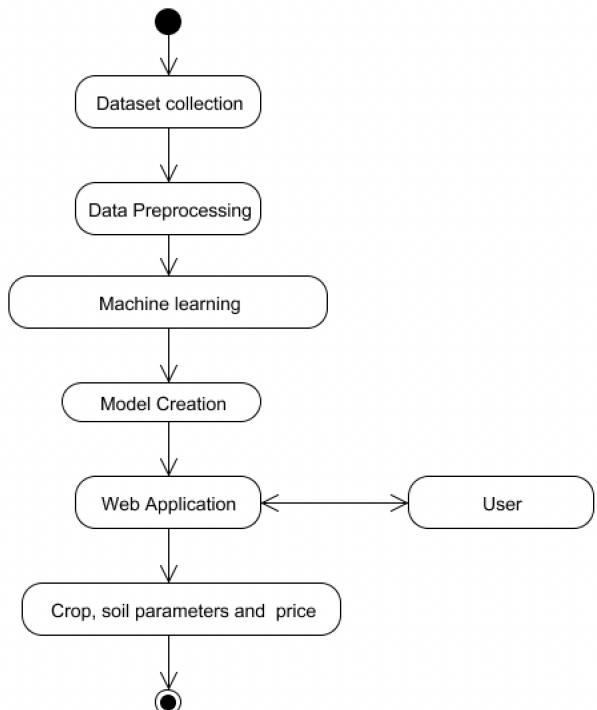
System Feasibility and Requirement Analysis.

1. Operating System : Windows 7 , 8, 10 (64 bit)
2. Software : Python and Anaconda
3. Framework : Flask, HTML
4. Database : SQLite
5. Hard Disk : 500GB and Above
6. RAM : 4GB and Above
7. Processor : I3 and Above

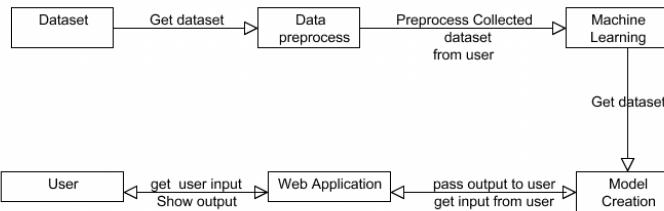
Architectural Diagram



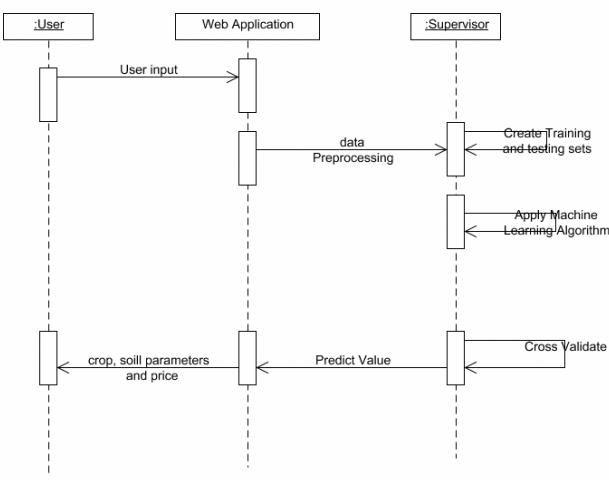
Algorithm



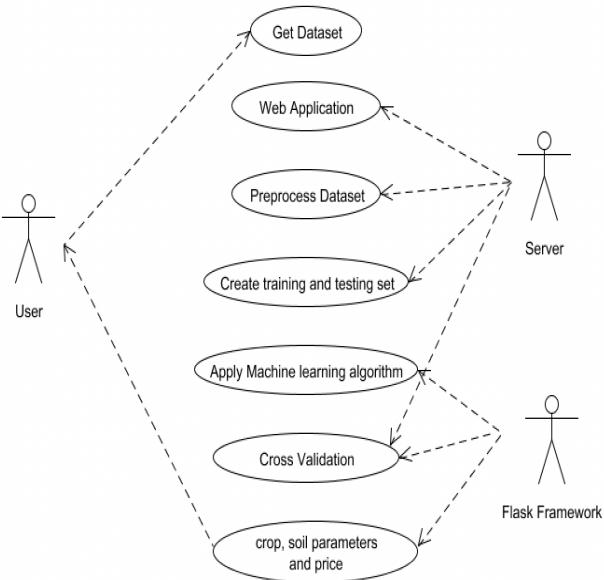
Collaboration



Sequence

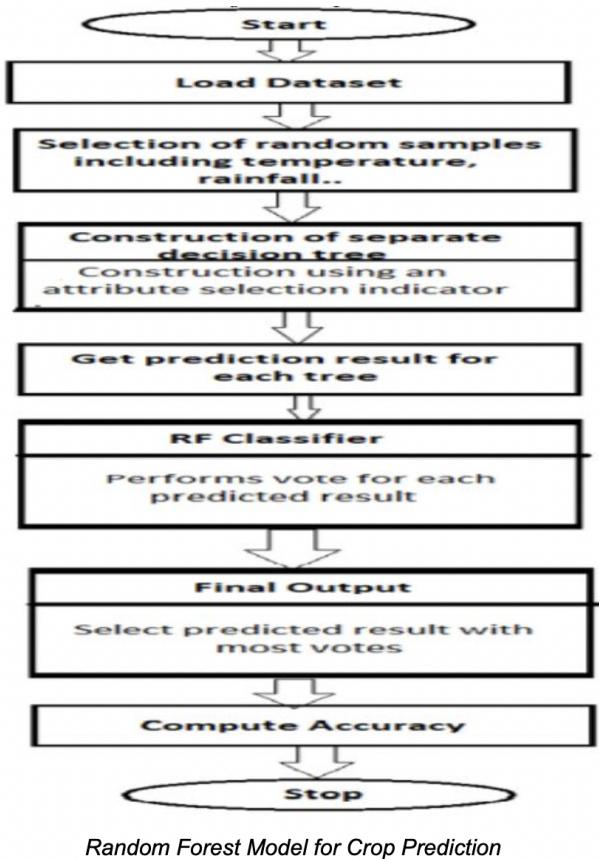


Use Case

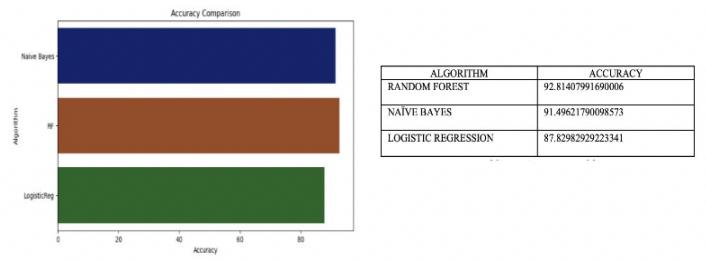


Use of Random Forest Classification

ML-based algorithm for crop prediction. The Because RF incorporates a variety of decision tree algorithms that use the average to improve the forecast in an analysis carried out within various algorithms. the most effective classification algorithms. For the dataset's highest level of accuracy, we are employing Random Forest. As a result, the suggested system uses the RF algorithm to identify the appropriate crop. When compared to Decision trees, it was discovered that Random Forest offered the most efficiency and precision.



Comparison of random forest, naive bayes and logistic regression.



Accuracy Table & comparison of Different Algorithm

IV. FUTURE SCOPE

To collect information about local variety for recommendations: If all the kinds are routinely evaluated at various sites, varieties for which there was no prior data are frequently suggested for those locations. The Attempts to use mixed models (treating some predictors as random variables). Crop illnesses can be found via image processing, and users can upload photos of infected crops to get advice on pesticides. Using a smart irrigation system to automatically adjust watering schedules based on weather and soil conditions, plant water needs, etc.

Here are some additional system features, such as a list of all the new and cutting-edge tools used to grow the predicted best crop and based on location, a list of the various state and federal government policies and programmes that offer financial assistance to farmers, and an examination of how to further develop the system. By utilizing the Internet of Things to connect various farm equipment and sensors to the internet, you may give real-time crop and disease monitoring.

Merits:

1. A deep neural network can reasonably handle some variations in scales due to its deep convolutional layers.
2. It is worth noting that we choose this threshold as smaller than the ImageNet challenge due to the relatively small fruit size with respect to the image resolution

Demerits:

1. If an object size in a testing image is significantly less than that of a training set, it misses the detection.
2. Longer computation time is required.

V. EXPERIMENTAL RESULTS

```
Anaconda Prompt (Anaconda3)
operable program or batch file.

(base) C:\Users\arnav>cd C:\Users\arnav\python\Intelligent Crop Recommendation System\M1
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\M1>python data_preprocess1.py
Cleveland data. Size=(101, 5)
Number of missing values
Crop      0
N        22
P        24
K        10
pH       0
dtype: int64
Concatenated dataset. Size=(101, 5)
Number of missing values
Crop      0
N        0
P        0
K        0
pH       0
dtype: int64
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\M1>
```

Overview of dataset 1

```
Anaconda Prompt (Anaconda3)
operable program or batch file.

(base) C:\Users\arnav>cd C:\Users\arnav\python\Intelligent Crop Recommendation System\M1
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\M1>python data_preprocess1.py
Cleveland data. Size=(101, 5)
Number of missing values
Crop      0
N        22
P        24
K        10
pH       0
dtype: int64
Concatenated dataset. Size=(101, 5)
Number of missing values
Crop      0
N        0
P        0
K        0
pH       0
dtype: int64
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\M1>python data_preprocess2.py
Cleveland data. Size=(235, 7)
Number of missing values
Location    0
y          0
x          0
N         5
P        26
K         5
pH        5
dtype: int64
Concatenated dataset. Size=(235, 7)
Number of missing values
Location    0
y          0
x          0
N         0
P         0
K         0
pH        0
dtype: int64
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\M1>
```

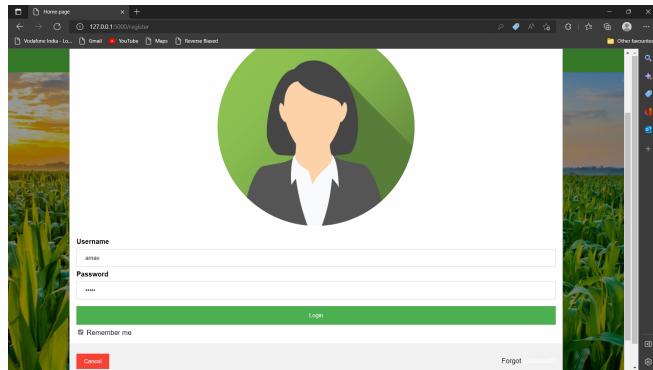
Overview of dataset 2

```

[1]: Anaconda Prompt (Anaconda3) : python crop_web_application.py
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\0>cd C:\Users\arnav\python\Intelligent Crop Recommendation System\0
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\0>python crop_web_application.py
* Serving Flask app "crop_web_application" (lazy loading)
* Environment: production
  WARNING: This is a development server. Do not use it in a production deployment.
  Use a production WSGI server instead.
* Debug mode: on
  Restarting with stat
  Debugger PIN: 223-341-085
* Running on http://127.0.0.1:5000/ (Press CTRL+C to quit)

```

Generating Web Page for further Implementation



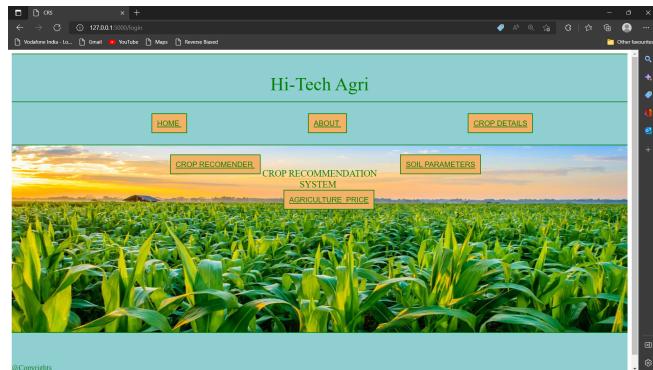
Login Page

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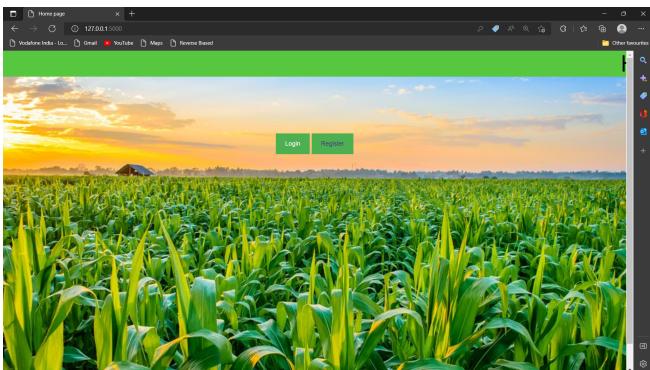
[2]: Select Anaconda Prompt (Anaconda3) : python crop_web_application.py
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\0>cd C:\Users\arnav\python\Intelligent Crop Recommendation System\0
(base) C:\Users\arnav\python\Intelligent Crop Recommendation System\0>python crop_web_application.py
* Serving Flask app "crop_web_application" (lazy loading)
* Environment: production
  WARNING: This is a development server. Do not use it in a production deployment.
  Use a production WSGI server instead.
* Debug mode: on
  Restarting with stat
  Debugger PIN: 223-341-085
* Running on http://127.0.0.1:5000/ (Press CTRL+C to quit)

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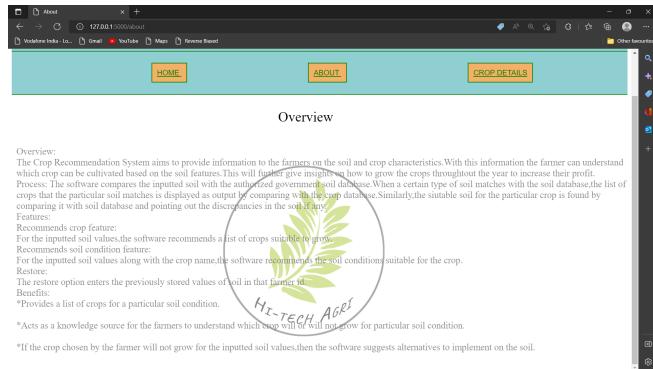
Copying the Website Link Address



Main Homepage



Login/Register Page



About Page Overview

Register Page

The screenshot shows a web browser window titled "Crop Prediction". At the top, there are two tabs: "City Wise" and "Manual N P K pH". Below the tabs, there is a search bar labeled "Vellore". A button labeled "Predict Crop" is present. The main area displays a list of crops found in Vellore, including Bajra(Pearl Millet), Cluster Beans(Gavar), Mung beans, Green Peas, Cumin seeds, Guava, and Amla.

Implementing Crop Prediction by Location Input

The screenshot shows a web browser window titled "Agri Price prediction". At the top, there are two tabs: "Agri" and "Agri price per kg". Below the tabs, there is a search bar labeled "Vellore". A button labeled "Predict Crop & price" is present. The main area displays a list of crops found in Vellore, including "Pigeon Peas", and a price value of "[11]". Above the list, there are input fields for Location (Vellore), date (12-May-11), temp (32), humidity (32), pH (2), and rainfall (200).

Implementing Crop & Price Prediction

The screenshot shows a web browser window titled "Crop Prediction". At the top, there are two tabs: "City Wise" and "Manual N P K pH". Below the tabs, there are four input fields: Nitrogen (40), Phosphorous (40), Potassium (40), and pH (4.0). A button labeled "Predict Crop" is present. The main area displays a list of crops found with these parameters, including Barley(JAV), Black Gram, Curry leaves, Mushroom, Pumpkin, Spinach, Ridgegourd, Ash Gourd, Custard apple, and Amla.

Implementing Crop Prediction by giving manual spoil parameters input

The screenshot shows a web browser window titled "Soil Parameters". At the top, there is a tab labeled "Manual crop_name N P K pH". Below the tab, there are four input fields: crop (rice), Nitrogen (80), Phosphorous (32), and pH (4.5). A button labeled "soil parameters" is present. The main area displays a list of parameters found: Potassium (38) and available soil nutrition level(N,P,K,pH) with values 0.0, 0.0, 2.0, and 1.5 respectively.

Implementing Soil Nutrition Parameters

VI. CONCLUSION

The importance of crop management was extensively addressed in this research. Farmers require modern technologies to help them raise their crops. The features chosen are determined by the dataset's availability and our goal. The developed webpage is user friendly and the accuracy of predictions are above 75 per cent in all the crops and districts selected in the study indicating higher accuracy of prediction. By providing climatic data of that place the user-friendly web page developed for predicting crop yield can be used by any user of their choice of crop. The crop which was predicted by the Random Forest Classifier was mapped to the production of the predicted crop. Then the area entered by the user was divided from the production to get crop yield. Crop name predicted with their respective yield helps farmers to decide the correct time to grow the right crop to yield maximum result.

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