

Survey on Optimal Crop Prediction using Soil and Weather Analysis

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Abstract: *This survey paper provides a comprehensive overview of methodologies, technologies, and approaches for analyzing soil environments to optimize crop production. It covers traditional soil sampling, advanced techniques like remote sensing, and real-time monitoring using sensor networks. The integration of sensor data with IoT and machine learning for decision support is explored. Soil health assessment and site-specific management strategies enabled by precision agriculture are emphasized. Challenges such as data integration and sensor accuracy are addressed, along with future research directions including low-cost sensing solutions and improved data analytics. Overall, the paper serves as a valuable resource for optimizing crop production sustainably, contributing to efficient agricultural practices in a changing climate*

Keywords: Crop production optimization, IoT integration, Machine learning, Precision agriculture, Sensor accuracy Low-cost sensing solutions, Efficient practices

I. INTRODUCTION

Optimal crop production is crucial for ensuring food security and meeting the demands of a growing global population. Achieving this goal requires a comprehensive understanding of the soil environment, as it plays a pivotal role in determining crop health and productivity. Soil analysis is a fundamental component of precision agriculture, providing valuable insights into the physical, chemical, and biological properties of the soil. To begin with, a thorough examination of the soil's physical characteristics is essential. Factors such as soil texture, structure, and moisture content significantly influence crop growth. Understanding the soil's water retention capacity helps in efficient irrigation planning, preventing both water scarcity and water logging issues. Additionally, assessing soil structure aids in root development and nutrient absorption, contributing to overall plant health. Chemical analysis of the soil is equally critical. Soil nutrient levels, pH, and organic matter content directly impact crop nutrition. Balanced nutrient availability is essential for optimal plant growth, and soil testing helps determine the need for fertilization. Maintaining an appropriate pH level is vital, as it influences nutrient availability and microbial activity. Furthermore, monitoring organic matter content enhances soil fertility and water-holding capacity. Incorporating biological aspects into soil analysis completes the comprehensive understanding needed for optimal crop production. Assessing microbial activity and biodiversity provides insights into soil health. Beneficial microorganisms contribute to nutrient cycling and disease suppression, fostering a favorable environment for plant growth. Monitoring the presence of harmful pathogens enables timely intervention, minimizing crop losses. The integration of advanced technologies, such as remote sensing and precision agriculture tools, enhances the efficiency of soil environment analysis. Satellite imagery and sensors can provide real-time data on crop health, allowing for immediate adjustments in management practices. These technologies contribute to sustainable farming practices by optimizing resource utilization and reducing environmental impact. In conclusion, optimal crop production hinges on a thorough analysis of the soil environment. By considering physical, chemical, and biological aspects, farmers can make informed decisions to enhance soil fertility, water management, and overall crop health. Embracing technology further empowers farmers to implement precise interventions, ultimately promoting sustainable and resilient agriculture for the future.

II. RELATED WORK

“Crop yield and price prediction system agriculture application”:- This paper addresses the decline in agricultural output due to various factors like climate dependence and reduced subsidies. It proposes a predictive system for crop yield and price using machine learning and data acquisition. The research aims to aid farmers in making better decisions through a user-friendly web interface. Various ML algorithms like SVM, random forest, and XGBoost are employed for crop recommendation and yield prediction, showing promising accuracies. The web application, developed using Flask, provides accessible insights into crop management. Future enhancements include multilingual support and integration with soil test reports for improved usability and effectiveness in agricultural decision-making.

“A Literature Survey on Precision Crop Prediction Using Soil and Environmental Analysis”:- The research explores the integration of machine learning and extensive datasets for precision crop prediction, incorporating soil and environmental analysis. It addresses challenges in traditional soil testing methods, proposing an automatic soil testing system for efficient soil fertility assessment. Various machine learning algorithms are employed for crop outcome prediction, showcasing promising accuracy in recommending suitable crops. The study emphasizes the significance of meticulous data preprocessing and feature selection for optimal performance. It advocates for intensified research in seamlessly integrating machine learning within agriculture to bolster global food security. The proposed holistic strategy utilizes machine learning algorithms to predict suitable crops considering weather and soil conditions, empowering farmers in decision-making. The research explores comprehensive approaches for crop prediction based on agricultural and environmental factors, highlighting the benefits of machine learning in agriculture. Overall, it underscores the importance of accurate soil characterization and crop prediction for enhancing agricultural productivity and resource allocation.

“Crop Prediction for Indian Agriculture using Machine Learning and Deep Learning Classifiers”-This paper significance of crop prediction methodologies driven by deep learning algorithms, aimed at providing farmers and stakeholders with accurate insights for informed decision-making in agricultural management practices. It underscores the multifaceted challenges inherent in crop forecasting, emphasizing the critical need for precise and timely data, thoughtful feature selection, and the development of robust machine learning models tailored to forecasting requirements. The abstract delineates the spectrum of techniques employed in addressing these challenges, ranging from data generation and feature selection to the deployment and evaluation of deep learning models. It emphasizes the integration of diverse datasets, including weather, soil, and crop data, alongside the utilization of sophisticated deep learning methodologies such as multilayer perceptron and convolutional neural networks. Ultimately, the efficacy of crop forecasting hinges upon the system's adeptness in meticulously analyzing data from varied sources to predict crop yields and related metrics with precision. The abstract foresees the potential of crop forecasting in augmenting agricultural productivity and sustainability while fostering advancements in agricultural efficiency and effectiveness.

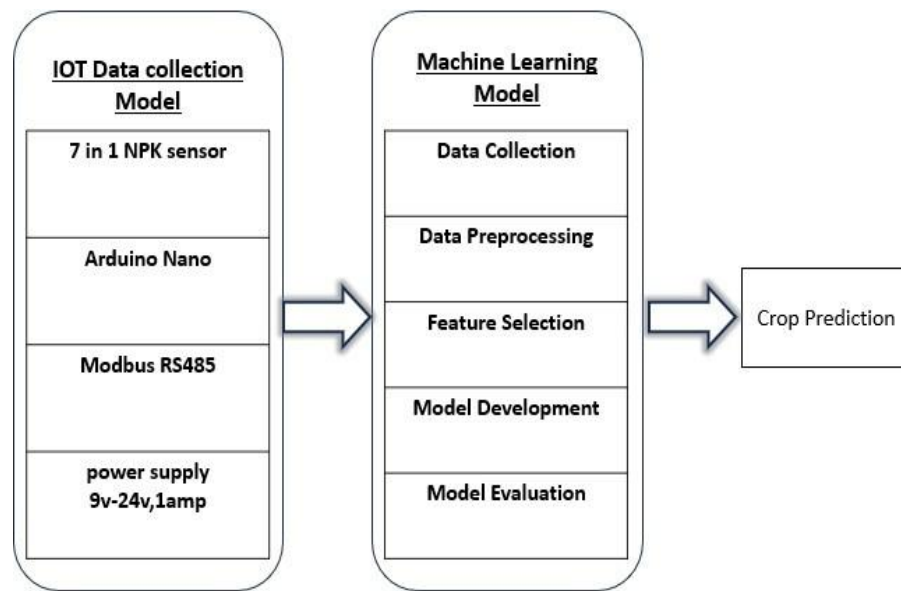
”Crop Yield Prediction And Remedies Recommendation Using Feature Selection Techniques In Machine Learning”:- This paper significance of crop selection in agriculture and the benefits of accurate yield prediction for newcomers. It introduces a novel approach utilizing classification and regression algorithms for crop recommendations and yield estimation, emphasizing the integration of machine learning in decision-making processes. The deployment of supervised machine learning techniques involves comprehensive data analysis, including variable identification and handling missing data. A comparative analysis of machine learning algorithms reveals the superiority of the proposed technique in accuracy metrics like entropy, precision, recall, F1 score, sensitivity, and specificity, promising optimized harvest outcomes.

” Crop Prediction Based On Characteristics Of The Agricultural Environment Using Various Feature Selection Techniques And Classifiers”:- This paper signifies of Crop prediction in agriculture is crucial, relying heavily on soil and environmental factors like rainfall and temperature. Machine learning has supplanted traditional methods due to changing environmental conditions. Efficient feature selection is vital for ML models to ensure precision and accuracy in crop yield prediction. Optimal feature selection reduces redundancies, enhancing model accuracy by incorporating only relevant features. Conglomerating all features without relevance assessment complicates the model unnecessarily. Ensemble techniques outperform existing classification methods, offering higher prediction accuracy. This approach minimizes time and space complexity while maximizing the accuracy of model outputs

”Enhancing crop recommendation systems with explainable artificial intelligence: a study on agricultural decision-making”- This paper signifies the XAI-CROP introduces explainable AI principles to enhance transparency in crop recommendation systems, outperforming traditional ML models like GB, DT, RF, GNB, and MNB. Evaluation metrics including MSE, MAE, and R2 affirm XAI-CROP's superior performance, with a remarkably low MSE of 0.9412 and an MAE consistently below 1. Its robust R2 value of 0.94152 underscores its interpretability, explaining 94.15% of data variability and reinforcing its reliability for accurate crop yield predictions.

”Crop Prediction Based on Characteristics of the Agricultural Environment Using Various Feature Selection Techniques and Classifiers”- This paper signifies the Crop prediction in agriculture is increasingly reliant on soil and environmental conditions like rainfall, humidity, and temperature, posing challenges for traditional farming practices. Machine learning techniques have emerged as vital tools for predicting crop yield amid changing environmental dynamics. Efficient feature selection methods are crucial for ensuring precision in machine learning models, optimizing dataset preprocessing for accuracy. Optimal feature selection minimizes redundancies, streamlining the model and enhancing its predictive capability. Conglomerating irrelevant features complicates the model unnecessarily, impacting its accuracy and computational efficiency. Ensemble techniques notably outperform traditional classification methods, offering superior prediction accuracy for crop yield determination.

III. METHODOLOGY



Data Collection: The first step involves the collection of critical soil parameters such as Nitrogen (N), Phosphorus (P), Potassium (K), and pH levels, along with weather data including temperature, humidity, and rainfall. This data can be gathered using a network of sensors deployed across the agricultural field. The collected data is then stored in a centralized database for further processing

Feature Extraction: Once the data is collected, the next step is to extract relevant features that will be used for making predictions. This involves preprocessing steps such as normalization and standardization to make the data suitable for analysis. Feature engineering techniques are also applied to select the most significant features that influence crop suitability.

Model Training: A Random Forest model is trained using the ICAR dataset, which includes historical data on crop yield and soil and weather conditions. The model undergoes hyperparameter tuning to find the optimal set of parameters that yield the best prediction accuracy. Cross-validation techniques are used to ensure that the model generalizes well to new, unseen data.

Prediction: For making predictions, current soil and weather parameters are input into the trained Random Forest model. The model processes the input data and outputs a prediction in the form of a numeric crop label, indicating the most suitable crop for the given conditions.

Crop Recommendation: The numeric crop label predicted by the model is then mapped to an actual crop name using a predefined lookup table. This recommended crop is communicated to the farmer or end-user through a user-friendly interface, which could be a mobile app or a web portal.

IV. CONCLUSION

In conclusion, soil environment analysis stands as a cornerstone of modern agricultural practices, essential for optimizing crop production while ensuring sustainability and environmental stewardship. This survey paper underscores the critical role of soil characterization methodologies, from traditional sampling to advanced sensing technologies, in informing agronomic decisions. Integration of sensor data with emerging technologies like IoT and machine learning facilitates real-time monitoring and predictive modeling for improved crop management. Moreover, the emphasis on soil health assessment highlights the importance of preserving soil fertility and biodiversity for long-term agricultural productivity. By addressing challenges and identifying future research directions, this survey aims to foster the development of innovative solutions for sustainable and efficient crop production in an ever-changing global climate.

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