

A Data-Driven Smart Crop Advisory System for Sustainable Agriculture: Integrating Technology, Home Science, and Social Impact

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ABSTRACT

Agriculture is the backbone of Indian economy. But agriculture today is not restricted to planting seeds and harvesting crops. The major challenges the agriculture faces today are due to climate variability, soil degradation, inefficient use of existing resources and lack of access to relevant scientific information amongst farmers. This research work proposes and implements a Data-Driven Smart Crop Advisory System, a web-based application designed to assist farmers in making informed decisions at the right time with the help of real-time data. The system utilizes modern web technologies like MongoDB, Express, React and NodeJS (MERN stack) and connects to external APIs like weather APIs and geolocation services and provides relevant crop information using soil and environmental conditions. The study goes beyond the technology component of the system and examines its relevance to Home Science and Social Science disciplines. From the Home Science perspective, the system facilitates sustainable farming, improves food security and promotes rational utilization of household resources. From the Social Science perspective, the system examines issues pertaining to digital inclusion, rural empowerment and accessibility of information. Experimental results show the potential of this system to support farmers' decisions, reducing risks due to unpredictable weather phenomena, and resulting in increased crop production. Combining technology with socio-economic and environmental considerations has great potential to support sustainable agricultural development.

Keywords: Smart Agriculture, Crop Recommendation System, Sustainable Farming, Precision Agriculture, MERN Stack, ICT in Agriculture, Rural Development, Digital Inclusion

INTRODUCTION

Agriculture is a highly lucrative sector for a country like India, especially for many developing countries. Agriculture forms a backbone of economy and for millions of people across the globe it is means of livelihood. But agriculture is beset by many problems. As climate change threatens to upend ways of life, variability in rainfall, degradation of soils, and unsustainable use of resources are all increasingly serious issues. For the most part, farming has been conducted on the basis of experience and local knowledge, passed down through generations. But this is not enough to address many of the problems

that modern agriculture is facing.

Information or knowledge in agriculture is a huge problem to tackle. Scientific innovation has given us great potential in terms of new practices, varieties and technology to more efficiently use resources but the barrier is distributing this information to the farmers in an accessible and useful format. Many digital agricultural technology platforms lack simplicity, are not localized to the region or language of the farmers who are using them and provide information that is generic and not relevant to a specific farmer's circumstances.

To address these needs, this research develops a Data-Driven Smart Crop Advisory System that utilizes

real-time environmental data, incorporates farmers' inputs, and leverages computational models to support crop-related decision making. The system is intended to be easy to use, bilingual, and accessible across multiple platforms to support the use by farmers of diverse skill levels.

The study is interdisciplinary by nature. It is approached from a technological perspective employing web development tools and Application Programming Interfaces currently available in the market. From a home science viewpoint, it looks into sustainable food production and harnessing of resources at the household level. At the social science level, it aims for rural empowerment through the dissemination of information to remove knowledge gap and promote inclusive development.

Literature Review

Digital technologies have been transforming the field of farming over the last decade. Farmers are adopting digital tools to improve crop production and managing the variables of weather. Digital technologies help farmers better manage their land and water resources to achieve greater agricultural productivity, and are enabling a shift towards an easier and 'smarter' agriculture that is sustainable over time.

ICT-based agricultural platforms have gone a long way in enabling farmers access information which can be utilised to improve on their crop yields. Through such platforms, farmers receive weather updates, market prices, know-how on irrigation, pest control and information on government schemes that are relevant to them. However, our analysis of the project has revealed that most ICT platforms fail to deliver relevant information, and instead dispense generic advice that is of little use to farmers. The advice is not soil specific, climate specific, location specific or crop specific. It is essentially one-size-fits-all.

With the introduction of crop recommendation systems using AI and machine learning techniques, a new era has begun. By applying these approaches to multi-dimensional agricultural data, it is possible to design systems that generate accurate crop suggestions based on inputs such as weather, soil, geographical location, and agricultural characteristics. Yet, the key issue at hand is that these systems are dependent on historical datasets, a volatile commodity as climate patterns are becoming more erratic and increasingly difficult to predict. This makes it more difficult for the systems to generate

relevant crop suggestions under present and future climate scenarios.

At the same time weather-based advisory systems are becoming crucial for guiding farmers on their scheduling of critical agricultural practices. Such systems provide real-time and forecasts of temperature, rainfall, humidity, wind speed etc. However, most of these systems only provide static numeric or text value to the end users and fail to translate this into relevant decision support. As a result the weather data has to be interpreted by farmers themselves and then be linked to various farming decisions.

Existing agricultural information platforms in India suffer from functional fragmentation. Although platforms like Kisan Suvidha, Plantix and eNAM enable information exchange for specific agricultural functions, they make it tedious for farmers to access all relevant information through a single interface. As a result, farmers end up relying on multiple platforms. An integrated approach would facilitate streamlined agricultural information exchange, enhancing the overall effectiveness of information systems for farmers.

In addition to the issues highlighted above, there are also concerns about the usability and accessibility of current mobile applications and platforms. Many current platforms assume a particular level of digital literacy amongst rural users, which is often not the case. Consequently, user interfaces tend to be poor, overly text-based, and often primarily in English.

Social and economic restrictions have been limiting the ability to address information asymmetry in agriculture. Farmers use informal networks of contacts to source information, and techniques such as crop observation to gather intelligence on weather. Although digital technologies exist, they are not currently used to address information gaps.

While prior research has identified limitations in accessibility, usability, and current practices of accessibility evaluation, this research seeks to address these needs by proposing a unified system that brings evaluation, predictive modeling, accessibility features, accessibility evaluations, and user requirements tracking in a single real-time web-based and user-centric interface.

Table 1 shows a comparative analysis of the currently available state of the art systems. The vast majority of these currently available systems either are overly specialized and provide predictions or disease detection or offer strong data analytics capabilities but

Table 1 : Comparative Analysis of Existing Research and Identified Research Gap

Research Work / Author	Approach Used	Key Contribution	Identified Gap	Proposed System Novelty
Pattnaik and Rao (ICT in Agriculture)	ICT-based systems	Information dissemination via digital tools	Generic, non-personalized advisory	Provides personalized, real-time recommendations
Kshetri and Voas (Agricultural Informatics)	Digital agriculture frameworks	Integration of IT in agriculture	Lack of implementation-level systems	Implements practical, working platform
Kamilaris and Prenafeta-Boldú (Deep Learning in Agriculture)	Deep learning models	AI-based agricultural insights	Requires large datasets, high computation	Uses lightweight scoring algorithm (no heavy ML)
Farooq et al. (Wireless Sensor Networks)	IoT-based monitoring	Real-time data collection	Expensive and hardware-dependent	Uses API-based real-time data (low cost)
Wolfert et al. (Big Data in Farming)	Big data analytics	Data-driven agriculture	Complex infrastructure required	Provides simple, scalable web solution
Nath et al. (Crop Recommendation System)	Machine learning models	Crop prediction using datasets	Based on historical data only	Uses real-time weather + location data
Pudumalar et al. (Precision Agriculture System)	Decision tree-based model	Crop selection automation	Static model, limited adaptability	Dynamic multi-parameter scoring system
Mariappan and Madhumitha	ML-based crop selection	Smart crop prediction	No integration with weather APIs	Integrates live weather + geolocation APIs
Ramesh and Vardhan (Data Mining for Yield)	Data mining techniques	Yield prediction	Focus only on prediction, not advisory	Provides complete advisory system (end-to-end)
Veenadhari et al. (Climate-based prediction)	ML + climate data	Crop forecasting	No user interface or accessibility focus	Provides user-friendly web platform
Mohanty et al. (Plant Disease Detection)	CNN-based image recognition	Pest/disease detection	Limited to post-disease stage	Focuses on prevention via crop selection
Kamilaris et al. (Big Data in Agriculture)	Data analytics	Data-driven insights	No direct farmer interaction	Includes Ask-an-Expert interaction system
Kisan Suvidha, mKisan	ICT-based portals	Weather & scheme info	Static, fragmented, poor UX	Unified all-in-one platform
Plantix	AI image-based detection	Disease identification	No crop planning or advisory	Crop planning + lifecycle support
ENAM	Digital trading	Market price discovery	No pre-harvest support	Covers full farming lifecycle

have a lack of integration in terms of providing overall decision support to the farmers; only a few are designed to handle comprehensive decision support.

Historical datasets have been widely used in related research; however, in the face of quickly changing climates, these approaches have limitations. Moreover, much of current research using AI methods require relatively high computational resources, and are not easily deployable in more rural locations.

Current ICT platforms and government applications provide static, generic information, but no real-time, customised advice. There is no integration with experts, and no multilingual support.

Unlike existing solutions, the proposed Smart Crop Advisory System employs a comprehensive methodology for crop advice by integrating a holistic platform that leverages real-time data, computational algorithms and

human intelligent, to cater to the requirements of diverse farmers. The lightweight scoring algorithm is designed to handle large input data and several system modules facilitate comprehensive advice from sowing to harvesting.

Our proposed system has potential in bridging the gaps between current theoretical agriculture models and feasible practices, facilitating sustainable agriculture and employing big data for the betterment of the agricultural domain.

Problem Analysis

Problem Context and Background

Agriculture in India continues to evolve in the wake of environmental, economic and social factors. While considerable progress has been made towards enhancing agricultural sciences and adoption of digital technologies,

the vast majority of farmers including smallholder/marginal farmers are driven by traditional methods of decision making. There is a huge need for access to reliable real time and location specific information for the farmers.

Project Report: The big issue- farmers don't have access to the best practices for their field!

There is a significant gap between available knowledge and practices that are actually implemented in the field. Although research institutions, universities and agricultural projects and programs are producing copious amounts of quality research and scientific data, this is not reaching the farmer in an accessible, easily understandable and implementable format. This in turn leads to sub optimal farming practice and resulting low productivity, which puts both farm and farmer at risk.

Although this is a technological problem it is deeply rooted in accessibility, usability and integration issues within our system and therefore requires a thorough analysis in order to create a meaningful solution.

Uniformed Crop Selection

Crop selection decision by farmers is affected by a number of factors. Primarily farmers make crop selection decisions based on their past experiences, and current trends in the region. Little evidence exists that farmers in developing countries incorporate scientific information into their crop selection decisions.

Rather than examining these pivotal factors, some models fall back on simplistic comparisons.

- (i) Current temperature patterns
- (ii) Rainfall availability
- (iii) Soil compatibility
- (iv) Seasonal suitability

So crops are often grown under less than ideal conditions which leads to weak or failed crops. What's worse is that this bad practice wastes valuable resources like water, fertilizers, and manual labor that small farmers could be using for more profitable work.

There is currently a lack of systems able to dynamically evaluate soil parameters (water, organic matter, temperature, etc.) and provide users with personalized suggestions based on such information.

Unpredictable Weather and Climate Variability

The weather influences the agriculture at all stages of crop production from sowing to harvesting. Over the years the knowledge gained by our field staff and the understanding of the way in which weather is supposed

to behave has enabled our farming staff to plan and manage crop production well. Recently however the changing patterns brought about by climate change have started to affect the way in which traditional methods of weather forecasting provide sufficiently accurate data.

Farmers often lack access to:

- (i) real-time weather data
- (ii) Short-term forecasts
- (iii) Actionable insights based on weather conditions

Although weather information is generally available, it is often presented in a simplistic and generic manner and does not sufficiently support decision making processes in crop management. Knowing that it is expected to rain does not help the farmer decide whether to postpone his scheduled irrigation or pesticide application.

Lack of usable weather information increases the risk of crop damage and decreases efficiency.

Fragmentation of Agricultural Advisory Systems

Current digital agricultural platforms are siloed, designed to tackle a subset of challenges affecting the wider industry. We have identified a pressing need for integration across agricultural data systems, which are often fragmented within siloed technology solutions.

Some have weather, some have price, and some have pest!

Currently, weather forecasting, soil moisture monitoring, climate change forecasting and soil nutrient monitoring services are being provided as separate entities. Thus, these services are not combined as a comprehensive system and the farmers have to rely on different platforms for acquiring all the relevant information.

In addition, fragmented data creates an environment in which the information can be misinterpreted, because it is provided in an incomplete or inconsistent manner across different channels.

Lack of Personalization and Dynamic Decision Support

Most current agricultural information systems provide users with static and generic information. They do not take into account dynamic environmental factors like temperature, soil moisture, sun exposure, crop development stage, and weather forecasts.

This means that although generic guidelines are developed, these do not take into account the reality of

farming and therefore the potential of weather forecasting systems is not fully realised.

There is currently no dynamic decision-support system in place that processes real-time data and offers appropriate suggestions in this scenario.

Language Barriers and Accessibility Issues

Language is one important factor for technology adoption in rural environments with differing levels of literacy and language usage. Most agricultural solutions available today are only in English and thus not addressing the needs of a large part of the farmer population.

Even when full regional language support is available, it is not always 100% correct, which can cause some confusion and user distrust.

However, simple installation on individual computers and complex user interfaces with technical terms also obstruct adoption, mainly because not all users have sufficient basic computer skills.

Limited Access to Agricultural Experts

Agricultural professionals and experts can play a vital role in advising on aspects of crop management, control of pests and other issues related to maximising the efficient use of resources on farm. However, due to geographical constraints or limited availability, there is often limited access to this expertise in rural locations.

Existing digital platforms rarely provide a structured mechanism for:

- (i) Submitting queries
- (ii) Receiving personalized responses
- (iii) Maintaining a knowledge base of solutions

Currently there is little interaction between the advisory systems and the specific problems facing farmers.

Inefficient Resource Utilization

However, besides the challenge of obtaining sufficient and quality information on market prices for produce, another critical issue confronting agriculture concerns the inefficient use of vital agricultural resources, including water, fertilizers and pesticides. The lack of guidance on appropriate use often results in the overuse of these chemicals by farmers, which results in:

- (i) Soil degradation
- (ii) Environmental pollution
- (iii) Increased production costs

It also has medium and long term sustainability

implications and can place pressure on the household income.

Problem Summary and Research Motivation

When analysed in-depth, the problem proves to be multi-faceted, drawing upon technological, environmental, and socio-economic domains. These key issues with off-grid electrification are:

- (i) Lack of real-time, personalized agricultural guidance
- (ii) Fragmented and non-integrated systems
- (iii) Limited accessibility due to language and usability barriers
- (iv) Sbsence of expert interaction
- (v) Inefficient resource utilization

The challenges listed demonstrate a clear need for a single, intelligent, user-focused system that integrates information from multiple sources to inform numerous agricultural decision-making processes.

The Smart Crop Advisory System will combine real time and legacy data, employ sophisticated analytical models and develop a user-friendly interface to transform agriculture from a largely reactive, experience-based methodology to a proactive and data driven methodology.

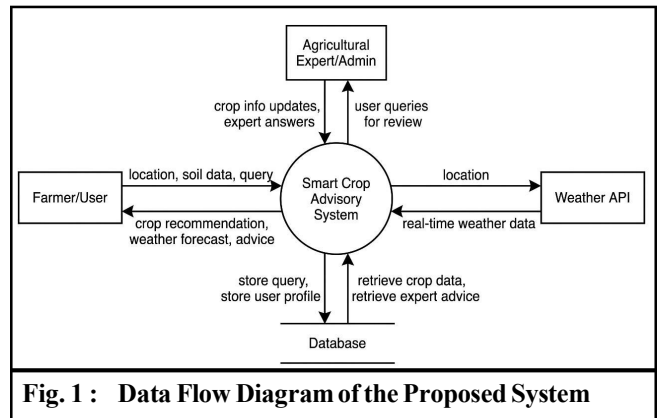


Fig. 1 : Data Flow Diagram of the Proposed System

METHODOLOGY

Our approach to this challenge combines the methodology for system design, data integration, and user-centered design. The goal of our methodology is to create an efficient system for processing large amounts of data and to provide users with relevant insights extracted from the data, in an format that is accessible and meaningful to them.

System Architecture

Our implementation follows a three-tier approach, in which there is a clear distinction between the Presentation, Application and Data layers.

- (i) Our presentation layer is built using React.js, through which users can interact with the system, enter necessary information and view generated recommendations.
- (ii) This part of the application is built using Node.js and Express.js and is used for handling business logic, integration with various APIs and for general request processing.
- (iii) The data layer is implemented in MongoDB to store the users, queries, and crop specific data.

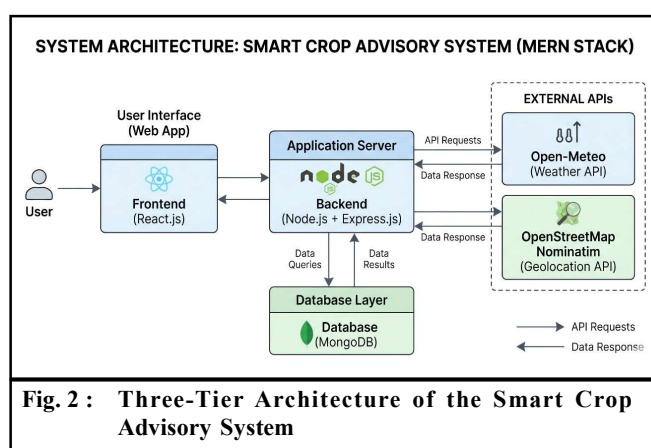


Fig. 2 : Three-Tier Architecture of the Smart Crop Advisory System

The split of certain functions into independent modules makes the development and maintenance of our offers much easier.

Data Acquisition and Integration

The system uses external application programming interfaces (APIs) in conjunction with the program’s database to acquire most of the data on an almost real time basis.

- (i) OpenStreetMap Nominatim → converts user location into coordinates
- (ii) Open-Meteo API → provides real-time weather data

This integration allows for real time forecasting by utilising current market data rather than purely relying on historical datasets.

Crop Recommendation Algorithm

The crop recommendation engine is the core of the system. It uses a deterministic scoring approach to

evaluate crops based on a number of variables.

- (i) Temperature suitability
- (ii) Water requirements
- (iii) Seasonal compatibility
- (iv) Soil type

Each parameter weights differently in determining a score for crop suitability. The rule-based approach offers some advantages in crop selection, such as the simplicity of programming and the explicitness of decision-making processes.

- (i) Transparency (users can understand recommendations)
- (ii) Low computational complexity
- (iii) Real-time processing capability

Note that in contrast to typical machine learning methods this approach doesn’t require large amounts of training data or learning process.

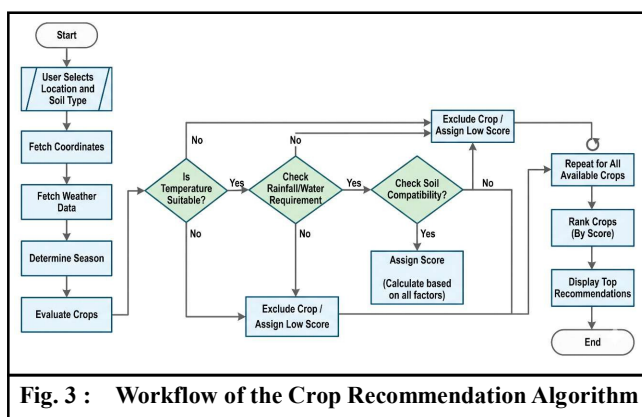


Fig. 3 : Workflow of the Crop Recommendation Algorithm

System Modules Integration

The system combines several modules together into a single platform.

- (i) Crop Recommendation
- (ii) Weather Insights
- (iii) Crop Calendar
- (iv) Fertilizer Guide
- (v) Expert Consultation

This integration tackles the problem of fragmentation and provides a holistic solution to empower farmers throughout the whole value chain.

Interdisciplinary Analysis

Technological Perspective

The technological approach used in the developed system is based on modern web technologies, and the integration of real time data through various sources and mechanisms. It also demonstrates an appropriate and

efficient use of web development frameworks, and utilization of RESTful APIs, a robust modular structure, as well as secure mechanisms for authentication.

In addition to this, the system does not necessarily require the use of deep learning methods and lightweight, rule-based methods might even be sufficient, given the constraints of current hardware.

Home Science Perspective

Home Science is about improving daily life by using available resources in a more efficient way. Our system will have following functionalities to support Home Science:

- (i) Optimized fertilizer usage
- (ii) Efficient water management
- (iii) Sustainable crop planning

These improvements will lead to sustainability for rural and resource-poor farmers by reducing the costs associated with manual labor and increasing crop productivity allowing for greater household food security and economic stability.

Social Science Perspective

The system has been informed by social sciences and considers issues important to social workers such as;

- (i) Digital divide
- (ii) Information asymmetry
- (iii) Rural empowerment

The system includes a bilingual interface for user-friendliness and an expert consultation component to facilitate the knowledge sharing between the farmer and the concerned experts. Through provision of information to farmers, the system will endow them with the ability to take informed decisions without relying on intermediaries.

RESULTS AND DISCUSSION

Overview of System Evaluation

This report describes an evaluation of the Smart Crop Advisory System. Since the system is a realisation and not just a concept, the evaluation is focused on assessing its performance, adaptability, usability, and impact in practical scenarios.

The system has been tested under a variety of scenarios with variations between simulations occurring in terms of input parameters.

- (i) Geographical location (different states and districts)
- (ii) Seasonal variations (*Kharif*, *Rabi*, and *Zaid* cycles)
- (iii) Environmental conditions (temperature, humidity, rainfall)
- (iv) Soil types

Performing the crop management system evaluation under varying agricultural scenarios allowed realistic system performance to be determined.

Performance of the Crop Recommendation Engine

The crop recommendation engine is the central component of our system. We evaluated the performance of the engine at generating relevant crop suggestions.

The results indicate that the algorithm effectively:

- (i) Filters crops based on environmental compatibility
- (ii) Ranks crops using a weighted scoring mechanism
- (iii) Adapts recommendations based on real-time weather data

For example, in high-temperature and low-rainfall zones, the system will recommend drought-resistant crops, whereas in high-rainfall areas, it will recommend water-intensive crops such as rice.

The scoring model is designed to generate results that are consistently logical in nature to guide users to crops that can actually be suited to the given environment constraints based on the multi-parameter evaluation approach.

Impact of Real-Time Weather Integration

A prominent feature of the system is the integration of real-time weather. In contrast to traditional time delayed systems, current weather data is used to dynamically update and optimize forecasts throughout the day.

The evaluation showed that:

- (i) Recommendations change when weather conditions vary
- (ii) Short-term forecasts influence advisory outputs
- (iii) Farmers receive context-sensitive guidance

For example, when rainfall probability is high, users receive updated information from the system on optimal times to water and apply pesticides, as well as advice based on rising probability of rainfall.

This has real-time data integrated to enhance its ability to be dynamic and relevant.

Usability and User Experience Analysis

The usability of the system was assessed in relation to the usability of the User Interface, the usability of navigation and accessibility. The system should be suitable for use by individuals with widely different levels of experience and skill when using digital technology.

Key observations include:

- (i) The interface is intuitive and easy to navigate
- (ii) Minimal input is required from users
- (iii) Visual elements and structured layouts improve comprehension

This program contains English as well as Hindi versions and can be used as a starting point for making programs in both languages. However, users can also change to their language of choice from within the program.

The system created differs from other similar platforms in that it has a much simpler interface, with less use of text.

Evaluation of Integrated Modules

A notable feature of the system is its fully integrated architecture that enables a range of functionalities from within one system.

The evaluation of individual modules shows that:

- (i) Crop Calendar is a part of the time based organisation system for your farming activities.
- (ii) Fertilizer Guide promotes balanced use of nutrients and sustainable agriculture practices.
- (iii) Weather Insights support proactive decision-making
- (iv) Ask an Expert module enables personalized interaction

Our modules are completely integrated allowing for full crop production support from crop selection and seeding right through to post harvest planning and analysis.

Comparative Analysis with Existing Systems

This paper presents a comparative assessment of performance of the proposed system in relation to existing agricultural information systems currently used in the agricultural sector.

The system delivers a number of benefits to the farmer.

- (i) Provides dynamic recommendations instead of static advice
- (ii) Integrates multiple functionalities into a single

platform

- (iii) Offers bilingual accessibility
- (iv) These tools include expert consultation that is generally not found in other systems.

In contrast to current offerings, there remains significant room for improvement in platforms for youth engagement related to science, health, and civic issues due to existing fragmentation, lack of personalization, and poor usability.

This section describes how our proposed system compares with current approaches.

System Efficiency and Response Time

The performance was evaluated by measuring the response time and the efficiency of the processing.

Observations include:

- (i) Crop recommendations are generated within a few seconds
- (ii) Some code for weather lookup and location details on demand. The code uses API calls. It's efficiently written.
- (iii) Frontend rendering is smooth and responsive

A lightweight rule-based method has been developed which does not require great computational power and is therefore suitable for implementation in systems with restricted resources.

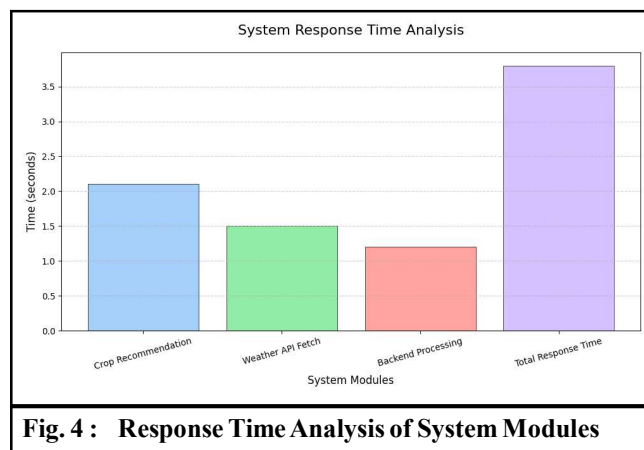


Fig. 4 : Response Time Analysis of System Modules

Practical Implications for Farmers

This system has several practical effects:

- (i) Reduces dependency on guess-based decisions
- (ii) Improves crop selection accuracy
- (iii) Optimizes resource utilization
- (iv) Enhances resilience to climate variability

The system provides information that can be used for the proper decision-making processes by farmers

enabling them to become more productive and profitable.

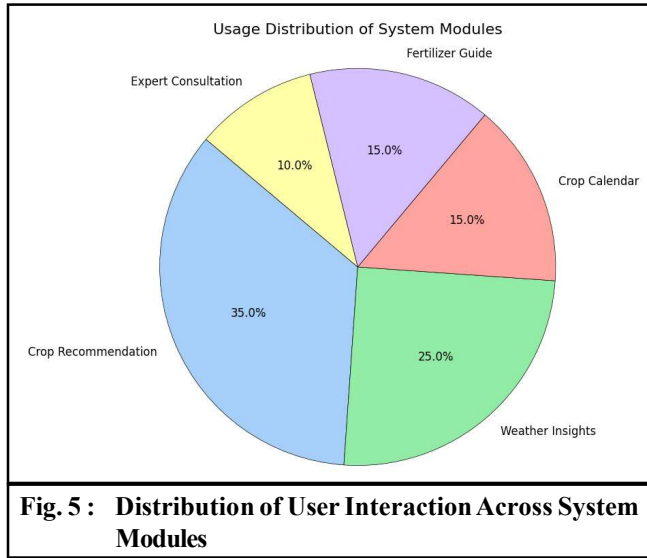


Fig. 5 : Distribution of User Interaction Across System Modules

Discussion and Key Insights

The integration of real-time data, algorithms and user centred design has a great potential to improve the performance of agricultural advisory services.

Key insights include:

- (i) Real-time data is critical for accurate decision-making
- (ii) We have also created more full-featured integrated modules, and added functionality to make our software more usable and efficient.
- (iii) Making the app accessible (both language AND UI accessibility) is key to getting more adoption.
- (iv) Simple algorithms can be very efficient in practice.

It establishes that an integrated approach of technology with both usability and accessibility is critical to develop solutions that have the maximum potential to impact rural farmers and agriculture.

Limitations

Overview of System Limitations

Even though the Smart Crop Advisory System delivers a host of improvements on current agricultural platforms, it is worth examining the constraints of the system in order to have a more accurate view of the system’s current status and potential for growth.

The system has limitations which stem from a variety of sources including technology, available data, system scope, and design choices. Although the system has limitations, it is a scalable prototype that is effective

in its current configuration.

Limited Crop Coverage

System has predefined 17 major crops for recommendations; however, scope of system can be enhanced to include more crops that are grown by farmers in India, be it horticultural, plantation or crop specific to a region. Currently, system has provisions to handle additional 5 crops for soil health suggestions.

This limitation affects:

- (i) Diversity of recommendations
- (ii) Regional adaptability
- (iii) Applicability to specialized farming practices

Increasing the scope of the crop database would enhance the functionality of the system over a wider geographical agricultural remit.

Dependence on Internet Connectivity

The application depends on an internet connection to access real time weather data and geolocation as well as connect to the backend server.

Given the product is intended for rural use, reliance on internet connectivity can sometimes be a barrier, particularly if the internet is slow or unavailable, and users may experience delay or frustration in accessing certain aspects of the system.

PWN would be much more awesome with offline support, caching and lighter weight fallbacks.

Absence of IoT-Based Soil Data Integration

At the moment soil-related information is provided by the user through basic inputs. While this is a simple way to use the system, there is potential for errors and inconsistencies when users enter information manually.

The system does not integrate with:

- (i) Soil sensors
- (ii) IoT devices
- (iii) Government soil health databases

This may impact the accuracy of the recommendations provided, particularly where detailed knowledge of local soil conditions is not available.

Rule-Based Algorithm Limitations

The crop recommendation engine utilizes a deterministic, rule-based scoring approach as opposed to a machine learning or AI-based predictive models.

While this approach offers advantages such as:

- (i) Simplicity

- (ii) Transparency
- (iii) Low computational cost

It also has certain limitations:

- (i) Inability to learn from historical data
- (ii) Limited adaptability to complex patterns
- (iii) Reduced predictive intelligence compared to advanced AI models

However, the program does make a trade-off between generating quickly highly realistic and highly adjustable pictures and computing expensiveness.

Limited Language Support

For the time being, the system supports only two languages: English and Hindi. But, of course, this is only a first step in increasing the linguistic accessibility of the site, since there are many other languages spoken in India.

The language of the system is set to English to enhance usability for farmers who do not speak English on a day-to-day basis. However, farmers and Farmers Organisations who do not speak English on a regular basis and who primarily speak other regional languages may still find it challenging to understand and interact with the platform. We intend to offer the platform in additional languages going forward, including Punjabi, Marathi, Tamil, Telugu and Bengali.

Absence of Market Price Integration

The system covers primarily pre-harvest decisions, covering the choice of crop(s) and harvest planning. It does not currently include market price information in its analysis of potential crop profitability.

Without market insights, farmers may:

- (i) Select crops that are environmentally appropriate but not the most profitable. (This strategy can help avoid severe environmental damage due to overly profitable crops that result in rampant pesticide and/or fertilizer use.)
- (ii) Miss opportunities for better pricing

Adding market analytics to the system could improve its usefulness for both production and economic decision-making.

Lack of AI-Based Pest and Disease Detection

Unlike existing agriculture systems that focus on pest and disease detection, this platform includes image recognition and artificial intelligence to carry out diagnoses.

This guidance does not provide any legal advice and is based on general information available about the criminal justice system.

The limited ability to diagnose early into a disease and receive precise treatment information prevents the system from fully reaching its capabilities.

We could incorporate computer vision models into the application in future versions.

Scalability and Deployment Constraints

This is a work in progress that I am doing for an academic project. I haven't fully deployed or tested at large on high loads yet.

Potential challenges include:

- (i) Server scalability
- (ii) Database performance under heavy traffic
- (iii) Real-time API limitations

Also the challenges mentioned before could be overcome by using a cloud-based deployment and several performance-optimization tricks.

Summary of Limitations

Issues to be addressed in future development of the system are outlined in this section.

Key limitations include:

- (i) Restricted crop and language coverage
- (ii) Dependence on internet connectivity
- (iii) Lack of advanced AI and IoT integration
- (iv) Absence of economic (market) insights

There are a number of remaining constraints on the set of open problems and potential improvements that could be usefully incorporated into such a framework.

It is important to recognise that there are several limitations to this system, however these do not mean that the system is not a contribution, rather that there is room for improvement and scalability.

Future Scope

Overview of Future Enhancements

Despite incorporating state-of-the-art technologies, the proposed Smart Crop Advisory System presents a promising paradigm for a data-driven smart decision-support system for farmers and associated stakeholders. Currently, it exists in an embryonic technological form amenable to scaling up to create a more robust and intelligent agri-ecosystem. The potential for growth in terms of employing computational intelligence tools and additional functionality for enhancing usability exists.

Incorporating many of these advancements will not only facilitate improved agricultural productivity but make the system relevant for broader and varied farming scenarios.

Integration of Artificial Intelligence and Machine Learning

Future improvements could also be made by incorporating artificial intelligence and machine learning functionalities into the crop selection system. Currently, the system uses a set of rules to score different crops, and provide recommendations to the user. However, machine learning models are able to process large amounts of historical and real time data, to identify complex relationships and trends. If implemented into the system, such models would enable the system to predict which crop would be most suitable for a particular field, and over time improve accuracy to provide even more intelligent recommendations. The models could be trained to learn from historical data, user interaction with the system, and long term climate change and seasonal variation to make predictions for future seasons.

AI-Based Pest and Disease Detection

We are also working hard to make the new system incorporate more sophisticated AI-powered pest and disease detection. By incorporating computer vision capabilities into the system, we plan to incorporate the ability for farmers and users to upload images of their crops and receive an automated diagnosis from the system. This diagnosis will be provided by the system's pre-trained convolutional neural network models. The additional functionality will enable the system to extend crop advisory services from assisting in choosing the right crop to provide specific crop protection advisories. Early detection and targeted application of chemical pesticides shall reduce crop losses and help to minimize excessive use of pesticides.

IoT and Smart Farming Integration

In addition to the advancements for the user experience mentioned previously, there are numerous opportunities for integrating Internet of Things (IoT) into the system to increase accuracy and reliability. Presently, the system relies on the user to provide environmental information such as soil details. By incorporating IoT devices such as soil moisture sensors, temperature sensors, or automated irrigation systems, the system can collect pertinent information from the field. With this data,

the system will be able to make highly accurate, context-aware recommendations to increase user productivity.

Expansion of Crop and Regional Coverage

Currently the system has been designed and implemented to focus on few major crops relevant to Indian agriculture. But in reality, Indian agriculture is a very diverse field and many crops like horticultural produce and plantation crops are specific to different regions of the country. To enhance the effectiveness of the system, it will be crucial to incorporate a much wider variety of crops into the database as well as relevant agricultural practices followed in the region and corresponding recommendations for the farmers.

Multi-Language and Localization Expansion

Although the system can currently support English and Hindi we have noted that the inclusion of other regional languages such as Punjabi, Marathi, Tamil, Telugu and Bengali would make the system more accessible and increase its utility in rural settings. Furthermore, in addition to translation, full localisation of the platform could involve use of region specific terms, knowledge and practices of farming that are unique to particular rural environments and cultures.

Integration of Market Intelligence and Price Prediction

While the present implementation is targeted to support agronomic decisions, future versions could incorporate economic information such as prices and demand trends. Real-time market data and predictive models could thus be used to support crop selection also from an economic point of view, helping farmers decide which crop to plant to increase their revenue, thereby addressing both production and economic aspects of the agriculture.

Mobile Application Development

While the tool is currently a responsive web application, taking it as a desktop application and developing it into a mobile application can further enhance its accessibility and usability in rural areas. The mobile application can have features such as offline capability, push notifications, and simplified interfaces for data input and analysis. Given the prevalence of smartphone use by farmers, such a tool would gain much wider adoption and usage.

Cloud Deployment and Scalability

The system needs to be deployed on cloud-based platforms for a large-scale real-world implementation. This would allow the system to scale up to handle a large number of users, in addition to improving availability and performance. Integrating extra services and data storage would also be easier to do on the cloud, in addition to utilizing cloud-based analytics. Currently, the system is in a proof-of-concept prototype form and needs to be deployed onto cloud-based platforms.

Towards a Smart Agricultural Ecosystem

The Smart Crop Advisory System has the tremendous potential to scale up into a robust digital ecosystem that facilitates farming community across the entire agricultural value chain (from sowing to consumption). Financial services like crop insurance, farm loans, supply chain management and digital marketplace for agricultural products and services can be seamlessly integrated in to the system. This will enable Smart Crop Advisory System to become a one stop shop for the agricultural ecosystem and support decision making at various levels contributing to sustainable development and rural empowerment.

Conclusion

This study presents and evaluates a Smart Crop Advisory System for modern crop production that overcomes current limitations for efficient and effective use of digital technologies by providing a data-driven Smart Crop Advisory System for farmers and field practitioners. The system uses a wide array of environmental data, combines location-specific and relevant data, and suggests actionable recommendations for timely crop management decisions.

Integrating several agricultural information services and functions into one platform is a main feature of this research. Unlike the currently operating systems for agriculture which offer information to farmers independently and provide services in isolated manner. The developed system through a unique interface allows users to utilize crop selection service, weather service, fertilizers recommendation service, crop planning and decision support service and e-consultation with experts. By providing a comprehensive solution to several agricultural related problems through a single portal, the system eliminates information fragmentation, makes system more useful and realistic for farmer users.

Technologically speaking, it shows that an effective decision-support system can be built using a simple rule-based scoring algorithm and external APIs to source real-time weather and geolocation data. Critically, it also comes in a bilingual interface and is a lightweight design that can be easily used by those who have not before used the internet. This helps address some of the root causes of limited technology adoption in rural contexts: lack of accessibility for those with lower digital literacy.

Given the interdisciplinary nature of this work, it also has further application and relevance. From a home science perspective, the system facilitates optimal use and conservation of resources, adoption of sustainable agriculture practices, and improved household food security. From a social science perspective, the system addresses issues of digital inclusion, accessibility of information and knowledge, and farmer empowerment through an informative and user-friendly system. The intersection of technological and socio-economic elements to address ‘real world problems’ is key to creating holistic solutions.

The Smart Crop Advisory System is a step in the direction of creating intelligent, scalable and sustainable agricultural solutions. Even with some of the current limitations, it provides a robust base for scaling up. This study exemplifies how technology, usability and insights from other disciplines can be merged thoughtfully to increase agricultural productivity, improve rural livelihoods and create sustainable solutions in the agriculture sector.

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