A LITERATURE SURVEY OF CROP RECOMMENDATION IN AGRICULTURE

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ABSTRACT

With over 60% of the workforce employed in the sector and contributing over 17% of the country's GDP, agriculture is vital to the Indian economy. But the agricultural industry deals with a lot of challenges, including a number of difficult tasks like harvesting, threshing, winnowing, the bagging method, shipping, storage, processing, and trading, all of which contribute to significant crop losses at various stages before reaching the market. Indian agriculture encounters challenges such as uncertain water supply, inadequate income generation, and fragmented land holdings. Previous studies have primarily centered on using meteorological data and soil factors to forecast about which crops would grow best on a particular soil. To deal with this kind of problem, numerous researchers have created their own Crop Recommendation System models using a variety of Deep Learning and Machine Learning techniques. This article presents a comprehensive overview of different algorithms for deep learning and machine learning that is utilized in constructing Crop Recommendation Systems, providing valuable insights into the most effective algorithms for this purpose.

Keywords: Machine Learning, Deep Learning, Crop Recommendation, Agriculture.

I. INTRODUCTION

Agriculture is the foundation of the nation, continuing to serve as a primary source providing income for a sizable segment of the Indian populace, sustaining livelihoods and fostering general economic expansion. Moreover, half the population is employed in agriculture, while over 60% of the land in the nation is used for agriculture, providing food for 1.3 billion people. In the past, farming was practised using traditional tools, but with the advent of the Green Revolution

However, successful agriculture relies on several factors, including nutrient-rich soils, accurate weather forecasts, and sufficient water supply. Access to freshwater is crucial for crop cultivation, but only a small percentage of the Earth's surface contains freshwater resources. Consequently, various methods, such as rainwater conservation, are employed to address water scarcity. India has diverse water resources, including rivers, lakes, ponds, and groundwater sources like wells and borewells.

According to records from 2018 and 2019, India had approximately 145 million land holdings. However, there are challenges associated with agriculture, including suicides by farmers and the conversion of land use from agricultural to non-agricultural purposes. Additionally, 51% of village farmers desire for their next generation to pursue careers outside of agriculture, favoring urban settlements instead. Poor decision-making regarding crop selection, such as choosing crops unsuitable for the soil or planting during the wrong season, contributes to these challenges. Lack of knowledge about the land's previous status can result in significant losses, particularly for families heavily dependent on agriculture for their income.

In order to tackle these challenges, farmers have been suggested to use a crop recommendation system, leveraging Machine Learning models to provide predictive insights on crop sustainability and recommendation. Important climatic factors including temperature, rainfall, and geographic location are taken into account by this approach, along with soil properties like potassium (K), phosphorus (P), and

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and globalization, advanced technologies have been embraced. The introduction of high-yielding varieties of crops and vegetables has propelled India's agricultural sector to expand. As a result, our nation has emerged as the biggest producer of fresh vegetables, food grains, and fruits in the world.

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nitrogen (N). Taking these factors into account, the system predicts the most suitable crop for a farmer's land. Several researchers have developed their own Crop Recommendation Systems using various Machine Learning and Deep Learning algorithms. These algorithms include Decision Tree, Neural Network, Random Forest, Logistic Regression, Linear regression, LSTM, Lasso and Ridge Regression, RNN, SVR, ANN, Naïve Bayes and DNN. Out of these algorithms, Random Forest has demonstrated superior accuracy and performance in Crop Recommendation Systems, providing precise crop recommendations to farmers.

II. REVIEW OF LITERATURE SURVEY

The papers mentioned propose different approaches to assist farmers in making informed decisions about crop growth and selection. I'll provide a summary of each paper's key points:

This paper that focuses on analyzing crop growth in relation to various climatic conditions using the Random Forest algorithm. They collected a crop growth dataset from different sources and used it for training and testing the algorithm. The authors found that the Random Forest algorithm provided more accurate results compared to other algorithms [1].

Agro Consultant is an intelligent system that was introduced [2], which aims to support Indian farmers in decision-making regarding crop growth. The system considers factors such as sowing season, geographical location, soil characteristics, temperature, and rainfall. Agro Consultant consists of two subsystems: one for recommending crops to farmers and another for predicting rainfall in specific regions to aid in crop sustainability prediction.

A system that assists farmers in choosing the right crop by providing intuitive insights that cannot be easily tracked. The system incorporates real-time monthly weather data for efficient yield forecasting. The authors implemented a sequential model with three input layers and 15 output layers using the Linear Regression algorithm and Neural Network. The crop recommendation accuracy achieved by the Linear Regression Model and Neural Network were 88.26% and 89.88%, respectively. The authors concluded that the algorithms used in their system provided the best accuracy and results, thereby enhancing the efficiency of the system [3].

A system that predicts crop yields in real-time based on various parameters such as production and season. The system utilizes Data Mining techniques and Big Data techniques to improve the precision of crop predictions. Personalized and relevant recommendations are provided to farmers, resulting in higher volume production [4].

A Supervised Machine Learning method has been used [5] to forecast crop yields in the agricultural industry. Past data is used to predict future yields, with a focus on weather and pesticide factors. The authors used a dataset from the Kaggle repository, consisting of parameters such as rainfall, perception, temperature, and production. The Random Forest algorithm is employed and compared with other algorithms, demonstrating higher accuracy in crop yield prediction. The proposed system covers a wide range of crop types, providing accurate predictions and potentially increasing farmers' profits.

Based on the title and conference details, it appears that the article focuses on estimating agricultural production in India with machine learning techniques. Crop yield estimation is an essential aspect of agriculture, and leveraging machine learning can provide valuable insights to farmers, policymakers, and researchers. The use of machine learning in crop yield estimation has gained significant attention due to its potential to improve accuracy and efficiency. By analyzing various factors such as weather patterns, soil conditions, historical data, and other relevant parameters, machine learning algorithms can predict crop yields with a certain level of accuracy [6].

An application designed to predict crop production in specific regions based on physical parameters such as rainfall and temperature. The prediction model utilizes data sets of various crops from different regions in India, as well as corresponding rainfall and temperature data sets. A modified ARIMA model is used to forecast rainfall and temperature values, which are then fed into a Linear Regression model for further prediction. The proposed system offers detailed recommendations for farmers to optimize their crop selection based on factors like location, farm size, temperature, rainfall, and crop data sets [7].

A new model that combines Machine Learning (SVM) Deep Learning (LSTM, RNN) and Machine Learning (SVM) techniques for accurate crop prediction. The model takes into account soil and temperature parameters to predict the most suitable crops with lower expenses. The proposed model achieves an accuracy of 97% and provides analysis to help farmers make profitable crop predictions [8].

That crop yield prediction is a significant challenge in agriculture, with implications for decision-making at various levels. To tackle this issue, two methods have been put forth: the Gradient Approach to Enhancing Agricultural Yield Prediction methodology and Crop Harvest Prediction Algorithm (CYPA), which makes use of IoT tools. These algorithms help farmers and politicians make decisions by predicting annual crop yields based on environment, the climate, yield from agriculture, and chemical data. Additionally, by lowering the quantity of labeled data required for training, the application of learning by implementing CYPA can improve its performance, improving efficiency and accuracy. Another approach involves developing a linear machine learning algorithm based on Generalized Linear Model (GLM) for early prediction of corn yield, which results in relative errors of less than 20%. Various machine learning methods, including ensemble XGBoost-RF, gradient boosting, random forest, and XGBoost, have been used to estimate crop yield, with ensemble XGBoost-RF showing maximum accuracy [9].

A soil analysis and crop prediction model. The main objective is to create a prediction engine that suggests the most suitable crop based on soil fertility and rainfall in a given region. The authors collect soil samples from different regions and analyze temperature, moisture, and humidity at regular intervals. Data is continuously monitored, displayed, and uploaded to the IoT cloud. Three algorithms, Naïve Bayes, Logistics, and C4.5, are used, with C4.7 achieving a maximum accuracy of 85% [10].

Focused on the use of Four algorithms for classification: J48, KStar, Random Tree, and Bayes Net implemented through the WEKA tool. The objective is to improve the efficiency and effectiveness of agricultural data analysis for better decision-making and crop yield improvement. The study is specifically conducted in the Nashik district of Maharashtra. Results show that the Random Tree algorithm performs well in terms of error rate and provides slightly better performance compared to the other three algorithms (KStar, BayesNet, and J48). The application of Machine Learning techniques aims to extract informative insights from the agricultural dataset to enhance crop yield prediction [11].

A machine learning algorithm-based crop yield forecast system has been proposed [12]. The main goal is to acquire higher agricultural crop production through accurate yield estimation. The process involves utilizing agriculture data, preprocessing the data, extracting features like soil information, field management, nutrients, humidity, etc. Machine Learning algorithms such as CNN, LSTM, ANN, KNN, and DNN are used for yield prediction. The developed model reduces relative error, and the paper provides a detailed analysis of accuracy using various Machine Learning techniques.

Focused on new methods that use deep neural networks (DNNs) to forecast crop production and measure differences in efficiency between them. Here is a short overview of this information. The use of deep neural networks in agriculture to predict crop yield and measure yield disparities is a novel approach. Many advances have been made with deep

learning techniques in other areas, thus making it possible to apply these technologies in farming [13].

A system of recommendations has been proposed which utilizes Machine Learning techniques to suggest suitable crops based on soil qualities. The system aims to resolve agricultural issues, improve crop yields, and decrease losses. Classifier models combining Logistic Regression, Naive Bayes, and Random Forest are used, with Random Forest achieving the highest accuracy. The research aims to

leverage machine learning algorithms to forecast agricultural production and provide advice to farmers based on factors such as rainfall, temperature, and region [14].

This research work which is a user-friendly GUI system, which is a commendable approach. By developing a system that is easy for farmers to use, it increases the likelihood of adoption and implementation in real-world farming scenarios. The use of machine learning algorithms, specifically SVM for rainfall prediction and Decision Tree

III TABLES AND FIGURES TABLE 1: ANALYSIS

Title	Summary	Advantages	Technology	Accuracy
			used	
"An Effective	In this research	To develop a	Random Forest	95%
Crop Prediction	article author has	predictive model	Algorithm	
Using Random	Focuses on	that can		
Forest Algorithm"	predicting crop	determine the		
[1]	yields using the	crop yield based		
	Random Forest is a	on various input		
	popular machine	factors such as		
	learning algorithm	climate		
	known for its	conditions, soil		
	ability to handle	properties, and		
	complex datasets	agricultural		
	and perform well in	practices. By		
	prediction tasks.	analyzing these		
	The article likely	factors, the		
	explores the	researchers aim		
	application of	to assist farmers		
	Random Forest in	in making		
	predicting crop	informed		
	yields or other	decisions and		
	related aspects in	optimizing their		
	agriculture.	crop production.		
AgroConsultant's	In this article	AgroConsultant	Neural Network,	NN:91.00%
Intelligent Crop	author has	consists of two	Random Forest,	RF:90.43%
Recommendation	developed	subsystems: one	Leaflet.js	DT:90.20%
System using	Intelligent System	for	Decision Tree,	KNN:89.78%
Machine Learning	for Crop	recommending	KNN	12.11.103.7070
Algorithms[2]	Recommendation	crops to farmers	12.414	
Aigoriums[2]	Recommendation	crops to rarmers		

	System that	and another for		
	employs machine	predicting		
	learning	rainfall in		
	algorithms. The	specific regions		
	system aims to	to aid in crop		
	provide intelligent	sustainability		
	and data-driven	prediction.		
	recommendations			
	for crop			
	management.			
Intelligent Crop	In this paper, the	Implemented a	Linear	88.26% and
Recommendation	author likely	sequential model	Regression	89.88%,
System using	delves into the	with three input	Model and	
Machine	potential benefits	layers and 15	Neural Network	
Learning[3]	and applications of	output layers		
	this intelligent crop	using the Linear		
	recommendation	Regression		
	system in	algorithm and		
	improving overall	Neural Network.		
	agricultural			
	productivity.			
Agricultural Crop	In this paper author	The system	Data Mining	-
Recommendations	has proposed a	utilizes Data	techniques and	
based on	system that predicts	Mining	Big Data	
Productivity and	crop yields in real-	techniques and	techniques	
Season[4]	time based on	Big Data		
	various parameters	techniques to		
	such as production	improve the		
	and season.	precision of crop		
		predictions		
Supervised	In this paper author	The Random	Random Forest	-
	puper united			

Machine learning	has implemented a	Forest algorithm	algorithm,	
Approach for	Supervised	is employed and	Decision Tree	
Crop Yield	Machine Learning	compared with		
Prediction in	approach for	other algorithms,		
Agriculture	predicting crop	demonstrating		
Sector[5]	yields in the	higher accuracy		
	agriculture sector.	in crop yield		
	Past data is used to	prediction.		
	predict future			
	yields, with a focus			
	on weather and			
	pesticide factors.			
Crop Yield	In this paper author	The dataset	Ridge	DT:97.73%
Estimation in	has presents a	includes	Regression,	LR: 89.36%.
India Using	system that predicts	parameters such	Decision Tree,	LassoR:85.75%
Machine	crop yields for	as rainfall, area,	Lasso	RidgeR:88.64%
Learning[6]	India using data	area under	Regression and	
	from 1950 to 2018.	irrigation, crop	Linear	
	Five crops (Maize,	names, seasons,	Regression.	
	Bajra, Jowar,	production, and		
	Tobacco and	yield.		
	Wheat) are			
	considered in the			
	prediction process.			
Design and	In this paper author	The proposed	Linear	-
Implementation of	have proposed a	system offers	Regression,	
Mobile	predicting crop	detailed	SVR Model	
Application for	production in	recommendations		
Crop Yield	specific regions by	for farmers to		
Prediction using	utilizing physical	select innovative		
Machine	parameters such as	approach,		

Learning[7]	temperature and	potential for		
	rainfall. The	improved		
	application is	accuracy,		
	designed to	versatility in		
	leverage these	dataset analysis,		
	parameters as	real-world		
	inputs to forecast	applicability, and		
	crop yields	contribution to		
	accurately. By	the field of crop		
	incorporating these	yield prediction.		
	essential			
	environmental			
	factors, the authors			
	aim to provide			
	valuable insights			
	and predictions			
	regarding crop			
	production in			
	targeted regions.			
A Hybrid	In this paper author	The model takes	SVM, LSTM,	97%
Approach for	has introduces a	into account soil	RNN	
Crop Yield	new model that	and temperature		
Prediction Using	combines (SVM)	parameters to		
Machine Learning	Machine Learning	predict the most		
and Deep	and (LSTM, RNN)	suitable crops		
Learning	Deep Learning	with lower		
Algorithms[8]	techniques for	expenses		
	accurate crop			
	prediction.			
"Crop Yield	In this paper author	A web	Linear Support	96.5%
Prediction Using	explores the	application is	Vector Machine	

Linear Support	utilization of the	implemented,		
Vector Machine"	(LSVM) Linear	allowing users to		
[9]	Support Vector	interact with the		
	Machine technique	trained ML		
	as a promising tool	model and make		
	for accurate and	predictions based		
	efficient crop yield	on their inputs		
	forecasting.			
	Torous mg.			
Soil Analysis and	In this paper author	Data is	Naïve Bayes,	85%.
Crop	have proposed a	continuously	Logistics, and	
Prediction[10]	soil analysis and	monitored,	C4.5, are used,	
	crop prediction	displayed, and	with C4.7	
	model.	uploaded to the	W.I.I. C 117	
	inoden.	IoT cloud.		
Experimental	In this paper author	The application	WEKA Tool,	RT:97.89%
Analysis of	improve the	of Machine	Random Tree,	KStar:95.7%
Machine Learning	efficiency and	Learning	KStar,	BayesNet:70.5%
Algorithms Based	effectiveness of	techniques aims	BayesNet, and	J48:78%
			J48	J40.7070
on Agricultural	agricultural data	to extract	J48	
Dataset for	analysis for better	informative		
Improving Crop	decision-making	insights from the		
Yield	and crop yield	agricultural		
Prediction[11]	improvement	dataset to		
		enhance crop		
		yield prediction.		
Crop Yield	In this paper author	extracting	CNN, LSTM,	-
Prediction using	proposed a crop	features like soil	ANN, KNN, and	
Machine Learning	yield prediction	information, field	DNN	
Algorithm[12]	system using	management,		

	Machine Learning	nutrients,		
	algorithms. The	humidity, etc.		
	main goal is to	,,,,,,,		
	acquire higher			
	agricultural crop			
	production through			
	accurate yield			
	estimation.			
Cran Viold		Including	DNN(C)	DNN:91.25%
Crop Yield	In this paper author	Including	DNN(G),	
Prediction Using	have trained two	DNN(G),	DNN(S), and	LassoR:28.31%
Deep Neural	Deep Neural	DNN(S), and	DNN(W)	SNN:71.18%,
Networks[13]	Networks (DNNs)	DNN(W)are used		RT:82%
	to predict yield and	to account for		
	check yield	genotype and		
	difference.	environment		
		effects on yield		
Crop Prediction	In this paper author	Classifier models	Logistic	NB:91.12%
and Mapping	has designed a	combining	Regression,	LR:96.24%
Using Soil	recommendation	Logistic	Naive Bayes,	RF:98.68%
Features with	model which is	Regression,	and Random	
Different Machine	provide advice to	Naive Bayes, and	Forest	
Learning	farmers based on	Random Forest		
Techniques[14]	factors such as	are used, with		
	rainfall,	Random Forest		
	temperature, and	achieving the		
	region.	highest accuracy.		
Crop Prediction	In this paper, the	It provides	SVM,	
using Machine	author has involves	farmers with	Decision Tree	
Learning	utilizing machine	information	algorithm for	
Approaches[15]	learning algorithms	about required	crop prediction	
	to analyze various	nutrients, seeds,		
	factors such as	expected yield,		
	environmental	and market		
	conditions, soil	prices.		
	quality, and			
	historical data to			
	predict crop			
	outcomes.			

for crop prediction, reflects the adoption of state-of-the-art techniques in the field of agricultural data analysis. These algorithms have been widely used for similar tasks and are known for their effectiveness in handling complex datasets. The system's ability to predict the best suitable crop for a particular land based on soil content, weather parameters, and other relevant factors is a valuable feature. Additionally, providing farmers with information about required nutrients, seeds, expected yield, and market prices can empower them to make informed decisions and optimize their farming practices [15].

IV CONCLUSION

One of the main drivers of the Indian economy is agriculture, with farmers relying heavily on it as their primary source of income. However, the sector faces significant challenges such as the direct impact of environmental changes due to global warming and a lack of knowledge and guidance regarding suitable crops for cultivation. These challenges often lead to substantial losses for farmers. To mitigate these issues, crop recommendation systems have been introduced to provide valuable guidance to farmers. Numerous Deep Learning and Machine Learning algorithms have been employed to build up efficient crop recommendation systems. Notably, the Random Forest algorithm stands out for its ability to produce highly accurate results. When combined with other algorithms, the Random Forest algorithm further enhances the overall performance of the model. After a thorough analysis of various research papers, it is evident that the Random Forest algorithm consistently achieves superior accuracy and results compared to other algorithms. This highlights its effectiveness in addressing the complex challenges faced by farmers and underscores its potential as a key tool in improving crop recommendations for sustainable and profitable farming practices.

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