## MACHINE LEARNING APPROACHESIN AGRICULTURE: A TABULAR STUDY

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### ABSTRACT

Agriculture satisfies people's fundamental requirements, additionally considered as wellspring of work around the world. Agriculture is the supporting pillar of India from proving employment to sustaining economy and contributes in the Gross domestic product of India. Artificial Intelligence (AI) has helped further developing of horticulture activities in India. Machine Learning is a subset of AI that serving in limiting the Loss in the cultivating by giving rich suggestions and insight about the crop yields. Machine Learning (ML) techniques like big data, deep learning, and IoT-enabled devices have led to improve the yield and maximize the profit amount. This paper explains different types of agriculture domain where machine learning play a significant role. And presents the tabular study of machine learning applications in agriculture.

Keywords: Machine Learning, Soil Management, Water Management, Yield Prediction, Disease Detection.

### **INTRODUCTION**

With the surge in global demand for food supplies, a great deal of strain has been put on the farmlands and the farmers around the world and keeping up with the rising demand of the world is proving to be a major challenge for agriculture. Climate change and growing population requires need to develop new approach to maintain the rate of food production and the robustness of the crop in these changing times. Machine Learning is not a new approach but recently its advances in past years have increased drastically as more and more people adapt to machine learning like in cars, smart homes, and robots and also it has shown its effectiveness in agriculture as well. The sudden advancement in Machine learning in recent years has been made possible by the amount of labeled training data as well as the advancement in the computation hardware improvement. With the advancement in the Machine Learning field it can be implemented in agriculture to increase productivity to maintain the demand of the population and reduce the amount of loss in the crop yield by the farmers. A Machine learning terminology is derived by the process of learning from experience for evaluating required work. Machine learning is a subset of Artificial Intelligent that gives machines the capability to study from past experience [1].



Figure 1: flow of machine learning

The experience is described as set of features or variables based on which the machine evaluates the result. In Figure 1, Training data is the data which is treated as the input to the machine learning algorithm. The training data can be labeled or non-labeled. Machine learning approaches or algorithms check and train the data. After that ML rules governs the appropriate model. Test data is use for input in this model and according to new models rules predict the outputs. On the basis of these input categories the learning system is classified into either supervised or unsupervised learning. Supervised Learning in this the input along with the correct output is given to fed into the algorithm as input and then the algorithm tries to find the optimal path in order to come to the output that was fed as an input. Unsupervised Learning in this no label are provided, hence the machine learning algorithm has to generate features based on its input. Deep learning a part of machine learning have more advantage in image processing like Convolution neural network can be used to identify the quality of crop and disease with high accuracy. Many research and study have been done using image processing to count the number of saplings and variety of crop yield can be monitored fractional of cost of manually counting and maintain.

## International Journal of Early Childhood Special Education (INT-JECSE) DOI:10.9756/INTJECSE/V14I5.404 ISSN: 1308-5581 Vol 14, Issue 05 2022

### Machine Learning in Agriculture

Machine Learning plays a significant role in different fields of agriculture like management of soil, water, prediction of yield, disease and weed detection, and crop quality and species identification. Soil management is important aspect of agricultural activity which gives the best production. Production is directly depending on proper management of soil. Soil as a diverse natural resource, composite processes having information about the temperature of the soil can give us insight about the effect climate change can have on the crop field. Machine Learning algorithms are used to study the effect of evaporation, the amount of moisture content in the soil which help researchers decide the dissipation processes, soil dampness and temperature to grasp the elements of ecosystem [3].



Figure 2 shows the different domain of agriculture where ML play important role in agriculture, Water management has a deep impact including aspects such as climate change, Water utilization, and agricultural ecosystembalance. Machine learning applications allows more effective use of irrigation system and help in predicting day to day dew point temperatures, which lends hand in identifying expected weather phenomenon and also estimating evaporation. Agricultural land also requires a vast amount of water for irrigation purpose so there is dependability on water availability. Along with depletion of aquifers at higher rate than they can recharge required water management mechanism that can conserve as well sustain crop yield. With the help of geo-informatics system and remote sensing can provide a base for solving the problem by monitoring various parameters that led to growth of crop and water management. Yield Prediction is the field of precision agriculture as it clearly states estimation and yield mapping, aligning of crop supply with the demand, and also crop management. Now a day's Computer vision technologies to provide accurate data, analysis of weather, crops, and economic conditions to increase yield for farmers [4].Crop Quality is important parameters. While comparing with the human experts, machines can in turn make good use of raw data and find some new qualities which will play pivotal role in enhancing overall quality of the crops. If crops are of higher quality more price can be demanded for that which in turn can benefit farmers in increasing their earnings. The differentiating factor between higher and normal quality product is determined the time at which it was harvested. Henceforth having a mechanism that can precisely determine the phase when the harvesting needs to be done can help farmers. This indirectly also deal with the food waste hence modern machine learning can cope with the problem with waste management as well. Disease detection is another important part for agricultural system that detects and diagnoses the crop disease. Machine learning is now used as a part of the agriculture management, in which we can spray those agrochemicals with respect to time, place and affected that too with high precision. An automation process is used in this condition which detects the infected plant using machine learning and image processing, so now the use of pesticide can be limited to just the plant that are infected and not whole filed in general. Similar strategy has been used by the researchers in identifying the deficiency of nutrients in plants by observing their colour and physical appearance, thus giving the best case use of fertilizers and fungicides as required by the plant. Weeds are in-fact more difficult to detect and discriminate from original crops. With the help of Computer vision and ML algorithms one can improve the ability of detecting and discriminating weeds from other crops and that too at very low cost and with no environment side effects.

#### **Tabular StudyofML Application:**

In this phase we will present the tabular study of different researches with different ML enabled applications in the field of agriculture. In column number first represents the References, Column number second attributes, column number third use for

various ML Approach used by researcher for achieving the goals in their paper and Fourth column is use for remark/output of particular research.

TABLE 1: SOIL MANAGEMENT				
References	Attribute	ML Approach	Remarks	
M.S. Suchithra et.al	Activation functions,	ELM classifier	Accuracy scores for	
[5]	Soil fertility indices,		pH (78.99).	
	Soil pH			
Sk Al	Soil series, Land type, Chemical feature,	weighted K-NN, Gaussian	SVM highest	
ZaminurRahman	Geographical attribute	Kernel based SVM, and Bagged	accuracy	
et.al [6]		Tree.		
VaishaliPandith et.al	parameters namely accuracy, precision,	K-Nearest Neighbor, Naïve	KNN and ANN	
[7]	recall, specificity and f-score	Bayes, multinomial Logistic	predicted best	
		Regression, Artificial Neural	performance.	
		Network, RF Random Forest		
Angurai K at al[8]	The Perameters Moisture, Temperature	Pandom Forast Naïva Bavas	Bast Decommond/	
Aliguraj.K ci.ai[o]	Humidity And Ph. Are Collected	Random Porest, Naive Dayes	accuracy -96 80%	
Kingslov John et al	60 composite soil samples Environmental	Pandom forast Cubist	The DE rendom	
Inigsley John et.al	Covariates by digital elevation model (DEM)	ragression Artificial neural	forest model is best	
[7]	and L and set 8 operational land imager (OLI)	networks. Support vector	Torest model is best.	
	and Landsat 8 operational land imager (OLI)	machine and Multiple linear		
	a thermal infrared sensor (TIRS)	regression		
Saniav Motia et al	Soil parameters Soil Properties for	Study of All MI Technique	SVM and RE are	
[10]	A gricultural Soil Health	Study of All ME Teeninque	best for soil	
[10]	Agricultural Son Health		management	
Ianmeiav Pant et al	data samples taken from soil testing ANN classifier		K-F accuracy –	
[11]	laboratory RhimtalUlttarakhand during the		95 52%	
[11]	vear 2018-19		<i>y3</i> . <i>327</i> <b>0</b> .	
Т.	Chemical Parameters	Decision Tree	Random Forests	
VenkatNaravanaRao	Physical Parameters	Algorithm.Random Forest	best classifier	
[12]	.Biological Parameters	Algorithm		
JanezTrontelj ml	nutrients prediction; soil spectra; soil	LS-SVMLeast-Square Support	For local farm-	
etal [13] analysis: soil category: precision		Vector Machine and ANN	ANN and Global	
farming			soil dataset the best	
	č		strategy is LS-	
			SVM.	

Table 1 shows the contribution of researchers in the field of soil management. In study find the best approaches of machine learning in the field of soil management are (SVM) Support vector machine, (KNN) K-Nearest Neighbor, (ANN) Artificial neural networks, and (RF) random forest.

References	Attribute	ML Approach	Remarks
Ali El Bilali	Berrechid aquifer , Irrigation water quality,	ANN, SVM Random forest,	Adaboost model is
et.al [15]	Sensitivity, Uncertainty, Prediction performance	Adaptive boosting	best
		(adaboost)	
Emmanuel	precision irrigation; water; machine learning;	Supervised, Unsupervised,	Supervised and
A.Abioyeet.al	mobile app; web app; smart	Reinforcement	unsupervised
[16]	agriculture; digitalization		learning best
J.Cardosoet.al	Smart Irrigation	Decision Tree, Support	XGBoost was best
[17]		Vector Machine, XGBoost,	
		Random Forest	
Gumiere SJ et.al	hysics-based model, soil water dynamics,	random forest	ML model
[18]	irrigation management, precision		easy to execute

TABLE 2: WATER MANAGEMENT

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	agriculture		
Ramya, S. et.al	Ensemble, Evapotranspiration, Irrigation	Ensemble,SVR,	Prediction of
[19]	Management		agriculture.
			Parameters.
Anas H. Blasi	Knowledge Discovery in Database (KDD)	Decision Tree (DT)	Proposed Model
et.al [20]	method for data collection.	algorithm	accuracy= 0.98.

Table 2 shows the researchers contribution in water management. In study find the best approaches of machine learning in the field of water management are Adaboost, XGBoost and Decision Tree, Supervised and unsupervised learning.

References	Attribute	ML Approach	Remarks
T. van	Crop yield prediction	Deep learning, Machine learning	Neural Networks widely
Klompenburg, et	Decision support		used.
al. [21]	system		
S.K. Sharma et al.	Crop yield prediction	SVM,	Decision Tree Regression
[22]		K-Nearest Neighbour,	is best for crop prediction
		Decision Tree.	
A.P.S Manideepet	Crop Yield Prediction	Linear Regression, Decision Tree, Random	random forest is more
al. [23]		Forest, Gradient Boosting	accurate
		and Linear SVR	
SonalAgarwal et	Crop Prediction	SVM, LSTMLong-Short Term	Combination of SVM,
al. [24]		Memory, RNNRecurrent Neural Network, DT	LSTM,RNN
		Decision tree, ANN, RF random forest	
M.Champaneri et	Predict crop yield.	Random Forest Classifier	accuracy = 75 %
al. [25]			
Saeed Khaki et al.	crop yield prediction	deep learning, Convolutional neural networks,	CNN-RNN model
[26]		recurrent neural networks	validation accuracy Corn
			=75.04 and Soybean
			=77.84.
M. Suganya et al.	Machine-Learning-	Logistic Regression, K-Nearest Neighbor,	Logistic Regression best
[27]	Classification method	Random Forest, Decision Tree, Support Vector	accuracy=100%
		Machine	

TABLE 3: CROP YIELD PREDICTION

Table 3.shows the researcher's contribution in Crop Yield Prediction. In the study find the best approaches of machine learning are Decision Tree, random forest, Logistic Regression.

TABLE 4: Disease /W	Veed Detection
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References	Attribute	ML Approach	Remarks
NajmehRazfar, Et	WeedDetection	Mobilenetv2 Model, 3, 4, 5 Layer CNN, Resnet 50,	4-Layer-CNNS
Al. [28]			Validation=97.70%
G.S SujawatEt Al.	Disease Detection	Convolutional Neural Network (CNN), Feed	CNN- Best Accuracy
[29]		Forward ANN,	
Abu	Leaf Disease Detection	RBF-SVM, SVM, ID3,Random Forest,K-Means	RBF-SVM
SarwarZamaniEt		Algorithm	Better
Al. [30]			
NahinaIslamEt Al.	Weed Detection	Random Forest, Support Vector Machine, K-	Random Forest (RF),
[31]		Nearest Neighbours (KNN),	Accuracy =96%
MansoorAlamEt	Crop Weed Detection	Random Forest Classifier	Accuracy = 95%
Al. [32]			
UrmashevBEt Al.	Weed Detection	K-Nearest Neighbors, Random Forest And Decision	Best Accuracy
[33]		Tree Algorithms, As Well As Yolov5 Neural	Yolov5 – 92 %.
		Network	
MohitAgarwalEt	Disease Detection	Convolution Neural Network	Accuracy =
Al. [34]			94%

Table 4.shows the researcher's contribution in Disease /Weed Detection. In the study find the best approaches of machine learning are CNN convolution neural network, YOLOv5 and random forest.

### CONCLUSION

This research paper shows that a tabular study of machine learning in Agriculture. Researcher's uses various approaches of machine learning in the field of soil management are (SVM) Support vector machine, (KNN) K-Nearest Neighbor, (ANN) Artificial neural networks, and (RF) random forest. In water management domain machine learning algorithms are Adaboost, XGBoost and Decision Tree, Supervised and unsupervised learning. Work in the field of Crop Yield Prediction of machine learning isDecision Tree, random forest and Logistic Regression. Disease or Weeddetectionfieldmachine learning isconvolution neural network, YOLOv5 and random forest. In Overall perception the Random forest algorithm of Machine learning technique is cover maximum domain of agriculture.

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