

A Survey On Leaf Vein Morphometrics: A Deep Learning Approach to Plant Classification

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ARTICLE INFO

Article History:

Accepted: 10 Oct 2023

Published: 30 Oct 2023

Publication Issue

Volume 9, Issue 10

September-October -2023

Page Number

144-152

ABSTRACT

Deep Learning techniques for plant species classification using leaf vein morphometric features. The significance of this project lies in its potential to revolutionize the field of plant species classification. By automating the identification process and reducing dependency on human expertise, the proposed approach accelerates research efforts, supports biodiversity conservation initiatives, and offers educational opportunities. As an interdisciplinary endeavor bridging Deep Learning technology and botanical research, this project contributes to scientific advancement and technological innovation.

Keywords--Leaf Morphology, Convolutional Neural Networks (CNN), Species Differentiation, Transfer Learning for Plant Classification, Deep Learning, Machine Learning Algorithms for Classification, Plant dataset

I. INTRODUCTION

The field of plant classification has been of paramount importance in various domains, from agriculture and ecology to biology and environmental science. Accurate plant classification serves as the foundation for numerous applications, including species conservation, crop management, and ecological research. [1] Traditionally, plant classification heavily relied on taxonomic expertise and morphological characteristics, such as leaf shape, size, and colour. However, these methods have inherent limitations, often requiring specialized knowledge and being susceptible to human bias and errors. [2] Plant species identification is important because it gives information about plant health, productivity and biodiversity. Traditionally, identification of plant species is done manually. But with the help of modern technology, plant species can be easily identified based on plant leaf shape colour and other characteristics using machine learning technology. In recent years, the advent of computer vision and deep learning techniques has revolutionized the field of plant classification. This transformation is driven by the ability of deep learning models to automatically extract intricate features from plant images, providing a data-driven approach that can surpass the limitations of traditional methods. Among the various aspects of plants that can be leveraged for classification, leaf vein morphometric stands out as a promising avenue. [3] In this project

we have created a plant species recognition model using machine learning techniques based on photographs of plant leaves. With the help of this project, scientists, agriculturists and citizens will be able to quickly identify plant species. Farmers and citizens will be able to quickly identify plant species. [4] Deep learning is a meta-learning process that improves a machine's performance as it learns as much data as it has. Plant species can be identified by taking pictures of plant leaf surfaces. [5] The main strategy of plant taxonomy is to develop new formalisms for plant classification. [6] Learning leaf artery features using deep learning and building species recognition models. The plant classification process is done using CNN algorithm. Different image structures are identified in the CNN model Different image structures are identified in the CNN model. It characterizes the images as a matrix of thought known as liars. The generated model has to be trained on the data set to identify the plant species. After evaluating the performance of the model, it can be checked on unknown images.

II. LITERATURE SURVEY

Sr. No.	Paper title	Author Name	Year of Publication	Problem solved in this paper : Existing Problem Statement	Technique used to solve problem : Existing Problem Solution	What will be future work : Future Scope
1.	IDENTIFICATION OF PLANT SPECIES THROUGH LEAF VEIN MORPHOMETRIC AND DEEP LEARNING	ANEEQ ATIQUE 1, SAIRA KARIM 1, SAMAN SHAHID 2*, ZAREEN ALAMGIR 1	2022	The existing problem statement revolves around the need for a more accurate, efficient, and automated method of identifying plant species through leaf vein morphometric analysis, and the paper aims to propose a solution that leverages deep learning techniques to address these challenges.	The existing problem solution involves a multi-step process that integrates image processing, feature extraction, and deep learning techniques. By combining morphometric information extracted from leaf vein patterns with the power of deep neural networks, the solution aims to provide an automated and accurate method for identifying plant species based on their unique leaf characteristics.	Applications spanning research, technology, education, and conservation.
2.	Feature Extraction of Plant Leaf	Muhammad Umair Ahmad,	2022	Feature extraction plays a critical role in various image analysis tasks,	The technique used to solve the problem of feature extraction of plant leaves using deep	Extensive, with opportunities for innovation, interdisciplinary

	Using Deep Learning	1 Sidra Ashiq,2 Gran Badshah ,3 Ali Haider Khan ,1 and Muzammil Hussain 1		including plant species identification and classification. Traditional methods of feature extraction often involve hand-crafted features that require domain expertise and may not capture the full complexity of the data. This can lead to suboptimal performance, especially when dealing with diverse plant species and variations in leaf appearances.	learning involves the utilization of convolutional neural networks (CNNs) or similar deep architectures.	collaboration, and application across various domains related to plant sciences and environmental monitoring.
3.	Classification of Plant Leaves Using New Compact Convolutional Neural Network Models	Shivali Amit Wagle 1, R. Harikrishnan 1,* , Sawal Hamid Md Ali 2,* and Mohammad Faseehuddin 1	2021	Plant species classification based on leaf images is a significant task in fields such as botany, agriculture, and ecology. Traditional methods often rely on manual inspection and handcrafted features, which can be time-consuming, labor-intensive, and may not capture the full complexity of leaf patterns. Moreover,	The technique used to solve the problem of classifying plant leaves using new compact convolutional neural network (CNN) models involves the development and implementation of novel CNN architectures that are designed to be both efficient and accurate for plant leaf classification.	Explore advanced hyperparameter optimization techniques to fine-tune model parameters for optimal performance, including learning rates, batch sizes. Investigate the use of transfer learning by fine-tuning compact CNN models on using pre-trained models to boost

				as the dataset of plant species grows, the computational complexity of traditional methods becomes a bottleneck.		classification accuracy.
4.	Recognizing Plant species using Digitized leaves- A comparative study	Sumedh Patil , Baba Patra, Neha Goyal, Dr. Kapil Gupta	2021	The paper addresses the challenge of automating the recognition of plant species using digitized images of leaves. The diversity of plant species and their distinct leaf characteristics pose a significant challenge to manual identification, which can be time-consuming and error-prone. The objective is to explore and compare various methods to create an accurate and efficient automated system for recognizing plant species based on their digitized leaves.	The comparative study, highlighting the most effective methodologies for recognizing plant species using digitized leaves. Reflect on the implications of the findings for practical applications and future research directions.	Investigate advanced feature extraction methods, including more sophisticated texture analysis, shape descriptors, and spatial patterns to capture intricate leaf characteristics. Explore the effectiveness of transfer learning by fine-tuning pre-trained models on a large botanical dataset and adapting them for plant species recognition.
5.	Deep Learning for Plant Species Classification	Jing Wei Tan, Siow-Wee Chang, Sameem Abdul-	2020	The paper addresses the challenge of automating the classification of plant species based	Gather a diverse dataset containing images of leaves from different plant species, along with	Investigate advanced transfer learning strategies that leverage pre-trained models on

	n using Leaf Vein Morphometric	Kareem, Hwa Jen Yap, Kien-Thai Yong		on leaf vein morphometric features using deep learning techniques. Leaf vein patterns are known to contain valuable information that distinguishes different plant species. The goal is to develop an accurate and efficient deep learning-based system capable of recognizing and classifying plant species solely based on the morphometric characteristics of their leaf veins.	corresponding vein annotations. Use deep learning techniques to extract relevant features from the leaf images and vein annotations.	botanical or related datasets. Focus on improving the interpretability of the deep learning model's decisions.
6.	Plant Species Recognition using Morphological Features and Adaptive Boosting Methodolog	Munish Kumar ¹ , Surbhi Gupta ² , Xiao-Zhi Gao ³ , and Amitoj Singh ⁴	2019	Develop a robust plant species recognition system that utilizes morphological features extracted from leaf images and employs the Adaptive Boosting (AdaBoost) algorithm to achieve accurate and efficient classification of plant species.	Use image processing techniques to segment leaves from backgrounds and normalize lighting conditions. Divide the dataset into training, validation, and testing sets, maintaining a balanced distribution of plant species.	Discuss potential avenues for enhancing the system, such as integrating color or texture information, experimenting with advanced machine learning techniques, or exploring the adoption of deep learning architectures.
7.	Real-Time Identification	Sivaranjani.C, Lekshmi	2019	Design and develop a real-time	Curate a diverse dataset of medicinal plant	Extend the system to offer real-time

	n of Medicinal Plants using Machine Learning Techniques	Kalinathan, Amutha.R , Ruba Soundar Kathavarayan, Jegadish Kumar.K.J		identification system capable of recognizing medicinal plant species from images using \ machine learning techniques. The system should provide fast and accurate species identification to aid researchers, healthcare professionals, and the general public.	images, ensuring representation of different species and variations. Extract meaningful features from images, including color histograms, texture descriptors (e.g., Haralick features), and shape attributes (e.g., contour-based features).	monitoring of plant growth and changes. Develop more advanced techniques for visualizing and explaining the model's decisions.
8.	The Analysis of Plants Image Recognition Based on Deep Learning and Artificial Neural Network	JIANG HUIXIAN	2020	Conduct a comprehensive analysis of plant image recognition using deep learning and artificial neural networks. Explore the performance, limitations, and optimization strategies for accurate and efficient plant species identification.	Curate a diverse dataset of plant images covering various species, growth stages, and environmental conditions. Implement different deep learning architectures suitable for plant image recognition, such as Convolutional Neural Networks (CNNs) and Recurrent Neural Networks (RNNs).	Investigate methods that recognize plant species from different angles or viewpoints. Conduct studies that analyze how plants' visual features change over time due to growth, climate, or disease.
9.	AI Based Indigenous Medicinal Plant Identification	Anu Paulson, Ravishankar S	2020	Develop an AI-based system that can accurately identify indigenous medicinal plants from images, bridging the gap between traditional knowledge and	Collaborate with local communities, ethnobotanists, and herbalists to gather a diverse and culturally relevant dataset of indigenous medicinal plant images. Develop a database of	Allow users to contribute images, descriptions, and uses of indigenous medicinal plants. Implement blockchain technology to

				modern technology. The system should respect cultural sensitivities and support sustainable practices.	indigenous plant names and their meanings in various languages and dialects.	ensure the authenticity and integrity of the information provided by indigenous communities and users.
10.	Estimation of Abundance and Distribution of Salt Marsh Plants from Images Using Deep Learning	J. Parashar ¹ S. M. Bhandarkar ^{1,2} J. Simon ³ B. M. Hopkinson ³ , S. C. Pennings	2021	Develop a deep learning-based system to estimate the abundance and distribution of salt marsh plant species from images. The system should accurately identify plant species, quantify their abundance, and provide spatial distribution information.	Curate a diverse dataset of high-resolution images capturing different salt marsh areas, plant species, and environmental conditions. Develop a deep learning model based on convolutional neural networks (CNNs) for species identification and semantic segmentation.	Explore the possibility of using drones or remote sensing technologies to capture real-time images of salt marshes, enabling continuous monitoring and timely data updates.

III. LIMITATIONS OF EXISTING WORK

Data Dependency-

Deep learning models require large datasets for training. A limited dataset can hamper their performance. Not having enough leaf vein images for each species might hinder the model’s accuracy. The model’s effectiveness is tied to the size and diversity of the training data.

Generalization Concerns-

The model might not perform well on unseen data or leaf types not present in the training set. There could be issues with overfitting if not regulated properly, causing poor performance on new leaf samples. Generalizing across diverse plant species might prove challenging.

Processing Power and Time-

Training deep learning models requires significant computational resources. The model’s training can be time-consuming and might necessitate specialized hardware. Without powerful GPUs or TPUs, the training time could be a bottleneck.

Environmental Variability-

Leaf vein patterns can be influenced by environmental conditions, which the model might not account for. Differences in lighting, seasons, or leaf health can affect vein visibility and hence the model's predictions. External factors like pests, diseases, or mechanical damage can alter leaf vein patterns.

Image Quality and Pre-processing-

The model's performance might degrade if the image quality is inconsistent. Variabilities in image acquisition, such as camera angles, zoom, or focus, can impact the model's predictions. Extensive pre-processing might be required to make the images suitable for the model.

Inter-species Variability-

Some plant species might have very similar leaf vein patterns, making them hard to distinguish. The model could struggle with closely-related species or those with subtle vein differences. Distinguishing between species with overlapping characteristics might pose challenges.

IV. CONCLUSION

Through this project we have shown that using machine learning techniques based on photographs of plant leaves. The potential of this technology for species identification is evident from the dimensions of model training and evaluation.

We have highlighted the potential of leaf vein morphometric as a valuable source of botanical information for plant classification, offering a data-driven alternative to traditional methods. Our examination of deep learning techniques, particularly Convolutional Neural Networks (CNNs), has demonstrated their effectiveness in automating the plant classification process based on leaf vein patterns. Our survey paper underscores the potential of leaf vein morphometric and deep learning as a transformative approach to plant classification. By automating and enhancing the accuracy of plant species identification, this methodology has the potential to revolutionize various fields reliant on plant classification. However, it is imperative that researchers in this domain collaborate to overcome existing challenges and ensure the responsible application of these technologies.

Our research has significant implications for the field of plant biology and classification. The integration of deep learning with leaf vein morphometric not only enhances classification accuracy but also allows for the automated analysis of large-scale plant datasets, reducing the burden of manual identification and enabling broader ecological research.

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