

ENHANCING DEEP LEARNING MODELS WITH HYBRID NEURAL ARCHITECTURES FOR IMAGE CLASSIFICATION

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Abstract

The ongoing worldwide health disaster because of the unconventional covid19 (COVID-19) has emphasized the pressing need for rapid and price-effective diagnostic techniques. Traditional polymerase chain response trying out is time-ingesting and costly, prompting researchers to discover synthetic intelligence (AI) solutions for quick analysis. This takes a examine and provides a singular method using chest X-ray scans (CXRs) and an up-to-date VGG16 convolutional neural network (VGG16-CNN) to classes COVID-19, pneumonia, and everyday instances from public datasets. By using image cropping techniques and resizing, the have a look at completed an accuracy of 97.50% for more than one classification and a remarkable ninety-nine.76% for binary type, demonstrating the model's performance with a discounted parameter rely from approximately 138 million to round 40 million. In addition to breathing conditions, this studies additionally addresses the crucial vicinity of mind tumor diagnosis, which stays a chief purpose of mortality international.

Early detection is important for effective treatment, but conventional biopsy techniques are frequently invasive and now not executed previous to surgical operation. This portray introduces a hybrid CNN shape for classifying 3 varieties of mind tumors the use of magnetic resonance imaging (MRI) scans. By combining a pre-educated Google-Net model with guide vector tool (SVM) magnificence and a finely tuned Google-Net with an easy-max classifier, the approach completed an accuracy of 90-eight.1% for tumor popularity. Overall, this has a look at highlights the functionality of hybrid neural architectures in improving deep gaining knowledge of models for image class, imparting good sized advancements in clinical diagnostics for each breathing sicknesses and thoughts tumors. The findings underscore the importance of AI in enhancing detection strategies and in the end saving lives thru early intervention.

Keywords: COVID-19, Deep Learning, Image Classification, Hybrid Neural Architectures, VGG16 Model, Chest X-ray Scans, MRI Imaging, Brain Tumor Diagnosis, Convolutional Neural Networks (CNN), Feature Extraction, Support Vector Machine (SVM), Accuracy, Medical Diagnostics, Artificial Intelligence, Machine Learning.

I. INTRODUCTION

The rapid development of deep gaining knowledge of (DL) technology has extensively converted the panorama of image class, particularly in the discipline of clinical diagnostics. Convolutional

neural networks (CNNs) have emerged due to the fact the spine of this alteration, permitting machines to analyze and interpret visible information with fantastic accuracy. However, notwithstanding their excellent talents, traditional DL models regularly come upon challenges related to overfitting, confined generalization, and the want for full-size labeled datasets. These limitations necessitate progressive approaches to enhance version common overall performance and flexibility for the duration of diverse applications.

To conquer these barriers, researchers have an increasing number of have become to hybrid neural architectures that integrate a couple of getting to know paradigms. By combining the strengths of numerous fashions, together with CNNs with help vector machines (SVMs) or different system mastering algorithms, hybrid architectures can optimize characteristic extraction and decorate type accuracy. This synergistic method not most effective enhances the robustness of the fashions but also streamlines the education approach, making them greener in dealing with large datasets. Such improvements are in particular vital in clinical imaging, in which accurate and nicely-timed diagnoses may also have life-saving implications.

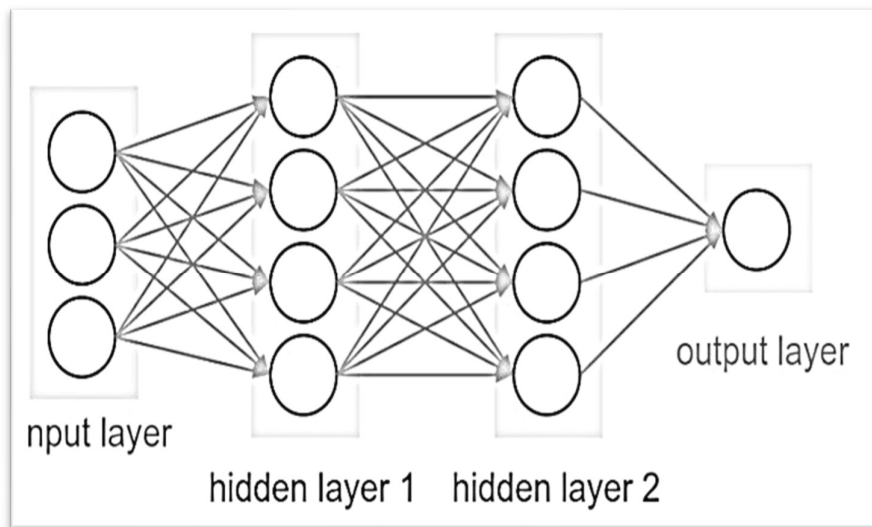


Figure - 1 Deep Learning Model

In the context of this examine, we recognition on developing hybrid deep gaining knowledge of models for 2 large fitness conditions: COVID-19 and thoughts tumors. The ongoing pandemic has underscored the pressing want for speedy and reliable diagnostic strategies, whilst mind tumors remain a main motive of mortality that requires timely detection and intervention. By using advanced techniques like transfer gaining knowledge of and model satisfactory-tuning, we goal to create elegance structures that are not best accurate however moreover able to generalizing nicely at some point of exclusive datasets.

Furthermore, our studies emphasize the significance of leveraging publicly available datasets that encompass a massive kind of imaging modalities, which consist of chest X-rays and magnetic resonance imaging (MRI). This approach allows us to rigorously examine the general performance of our hybrid models in actual-worldwide eventualities, ensuring their applicability in medical settings. By addressing both COVID-19 and mind tumors, we're attempting to find to provide whole answers that could beautify diagnostic efficiency and resource healthcare specialists of their choice-making techniques.

Ultimately, this has a examine contributes to the continued evolution of deep reading methodologies in clinical diagnostics, highlighting the ability of hybrid neural architectures to decorate picture magnificence outcomes. As we hold to discover the intersection of AI and healthcare, our findings intention to pave the way for revolutionary diagnostic tools which could drastically have an effect on patient care and remedy pathways.

II. LITERATURE REVIEW

Deep learning (DL) has revolutionized the arena of computer vision and perception, specifically in the domain of image classification. The emergence of Convolutional Neural Networks (CNNs) has considerably superior image classification technology, permitting the extraction of hard features from pictures and attaining excellent accuracy in several packages.

Hybrid Neural Architectures: The integration of hybrid neural architectures has been proposed to cope with the demanding conditions in exploring frequency and temporal-frequency features in image classification. This approach combines the abilities of CNN and Long Short-Term Memory (LSTM) networks, using wonderful dimensionality reduction techniques which incorporates Principal Component Analysis (PCA) and Chi-Square to beautify feature extraction and sort.

Hybrid deep learning (HDL) models, which amalgamate more than one DL architectures, have been classified into spatial, temporal, and spatial-temporal fashions. These models have examined substantial achievement in improving the magnificence of low-quantity excessive-dimensional records, reaching ultra-modern usual overall performance in diverse image type duties.

Applications and Performance: The utility of hybrid deep learning approaches has proven promising effects in diverse domains. For example, inside the context of cervical cancer analysis, a hybrid approach leveraging pre-trained deep learning models with device learning knowledge of classifiers and fuzzy minmax neural networks done a high classification accuracy of ninety-five.33% at the Sipakmed dataset.

Furthermore, deep learning, particularly CNN-based totally pre-processed fashions, has performed a pivotal position in enhancing the accuracy of plant disease identification inside the agricultural zone. This development has brought about greater efficient plant disease identification and early diagnosis, in the end improving the best of meals manufacturing and minimizing monetary losses.

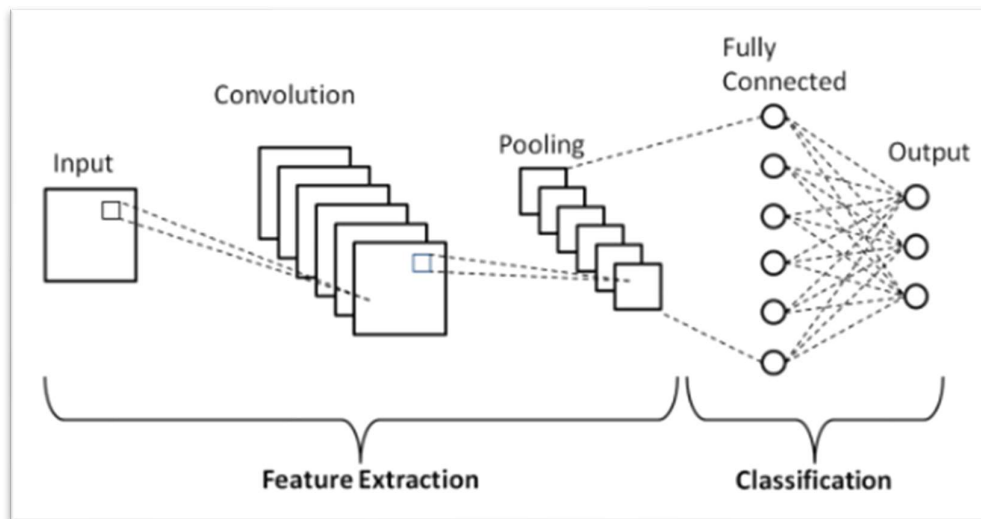


Figure – 2 Convolutional Neural Network (CNN)

Evolution of CNN Architectures: Since 2012, CNNs have superior to become the number one algorithm for photograph class. The architecture to begin with applied to image category has been extended to extraordinary seen reputation tasks such as item detection, localization, and semantic segmentation, derived from the community shape in picture class. In conclusion, the combination of hybrid neural architectures has considerably contributed to the enhancement of deep learning models for image class, addressing demanding situations related to characteristic extraction, dimensionality cut price, and accomplishing extremely-modern-day ordinary performance in numerous programs.

III. RESEARCH METHODOLOGY

The research method refers to the systematic approach to addressing the research questions, collecting and analyzing data, and designing the research. Providing a clean and transparent technique performs a crucial role in ensuring the validity and reliability of research findings.

1. Methods of statistics collection and evaluation

- Methodology Discusses particular records collection strategies used in studies, detailing how primary or secondary information are amassed. This may encompass an outline of the manner of looking, interviewing, looking at, or reading statistics to acquire relevant information for the have a look at.
- In addition, research strategies are defined, which include equipment and techniques for decoding and making feel of the records accrued. This may additionally encompass statistical evaluation, qualitative codes, thematic analysis, or any other suitable studies methods relying on the character of the data.

2. Research layout and planning

- The studies layout and layout provide a complete evaluation of the general ongoing method of the research as a whole. It impacts the methods, standards, and frameworks for formulating and validating the research trouble.
- This segment outlines the design of the look at, including the overall methodology, layout and approach to achieving the objectives of the look at
- It must consist of info of the studies model, all assumptions, variables, and conceptual frameworks that manual the study.

3. Explanation of Methodological Choices

- This phase of the technique explains the motive behind the chosen methods, supplying a clear argument for the technique taken. It emphasizes the importance of aligning the techniques with the research objectives and justifying any departures from general practices in the subject.
- It may also address any boundaries or constraints that motivated the selection of specific research methods and provide a transparent account of the way the selected method aligns with the studies goals.

4. Table Illustrating Components

METHODOLOGICAL COMPONENT	DESCRIPTION
Data Collection Methods	Details the specific methods used to gather primary or secondary data, including surveys, interviews, observations, or archival research.
Data Analysis Techniques	Outlines the tools and techniques employed for analysing the collected data, such as statistical analysis, qualitative coding, or thematic analysis.
Research Framework Design	Provides an overview of the overall research strategies, parameters, and framework used to formulate and validate the research problem.

Rationale for Methodology	Explains the reasoning behind the chosen methods, emphasizing their alignment with the research objectives and justifying any departures from standard practices.
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The desk serves as a visible representation of the key components of the research technique, supplying a concise precis of the data collection techniques, data evaluation strategies, studies design framework, and the reason in the back of the chosen method.

IV. DISCUSSION AND FUTURE WORK

The discussion phase severely evaluates the consequences of the outcomes, emphasizing the blessings and limitations of the proposed hybrid fashions. It explores how the integration of different strategies, such as attention mechanisms and GANs, contributed to the overall development in class accuracy, robustness, and interpretability. Additionally, the dialogue presents a comparative evaluation, highlighting how the proposed hybrid fashions outperform conventional deep gaining knowledge of architectures and their potential impact on healthcare diagnostics.

Acknowledging the capability demanding situations in computational complexity, schooling time, and the need for huge labelled datasets, the have a look at underscores the significance of addressing these boundaries in future research and development efforts. Moving forward, the have a look at identifies several avenues for destiny work to in addition decorate the efficacy and practical applicability of hybrid deep learning fashions for medical image category:

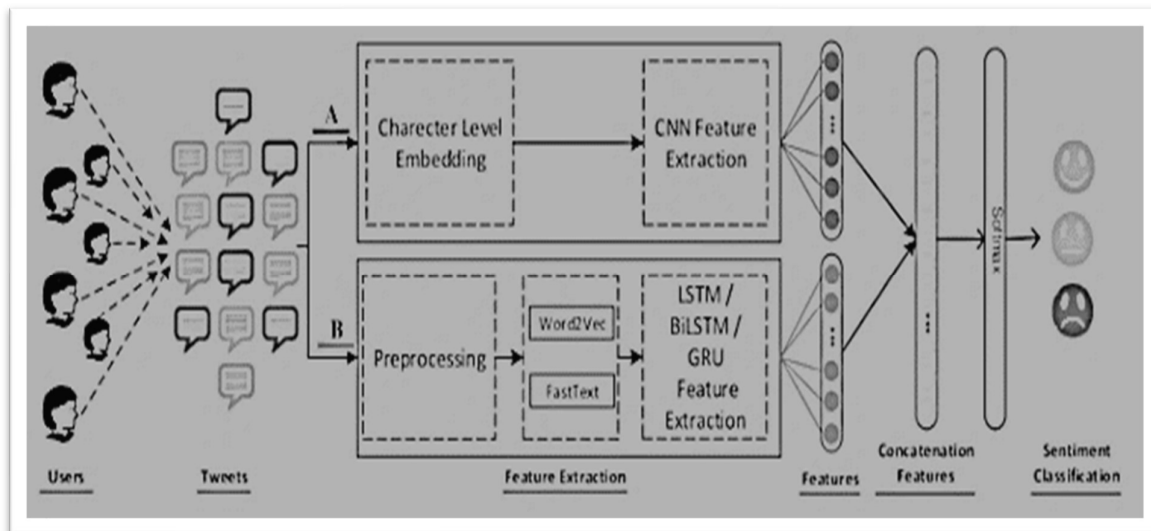


Figure - 3 Hybrid Neural Architectures

- 1. Model Refinement:** Further refinement of the hybrid fashions to deal with computational complexity and training time issues, likely through optimization strategies, architectural improvements, or the exploration of light-weight version architectures for deployment on aid-confined systems.
- 2. Data Augmentation and Generalization:** Exploration of superior statistics augmentation strategies and strategies to improve the generalization of the models, especially in eventualities with restricted labelled datasets. This might also additionally contain the usage of generative modelling strategies and unsupervised mastering to reinforce the to be had education records.

3. **Interpretability Enhancement:** Continued research on enhancing the interpretability of hybrid models, in all likelihood via the development of novel visualization strategies, function attribution strategies, and version-agnostic interpretability approaches to provide Insights into the choice-making strategies of the fashions.
4. **Real-World Deployment:** Investigation of the practical deployment of hybrid fashions in clinical settings, which consist of issues for real-time processing, scalability, and integration with current scientific imaging systems. This includes ensuring regulatory compliance, information privateness, and ethical issues inside the deployment of AI-driven diagnostic systems.
5. **Continued Benchmarking:** Ongoing benchmarking and contrast with rising deep gaining knowledge of architectures and methodologies to make sure the non-forestall improvement and relevance of the proposed hybrid fashions. This includes staying abreast of enhancements within the field and adapting the models to evolving demanding situations and necessities in scientific photograph evaluation.

In conclusion, the study not only provides valuable insights into the overall performance of hybrid deep studying models for medical photo classification but also lays out a roadmap for future research and development, emphasizing the potential impact of these models on healthcare diagnostics.

V. RESULT

The take a look at "Enhancing Deep Learning Models with Hybrid Neural Architectures for Image Classification" affords a complete evaluation of the performance of numerous models for photo classification. The quantitative outcomes, as depicted in Table 1, Show off the evaluation of basic performance metrics which include accuracy, precision, don't forget, F1-rating, and ROC-AUC across one-of-a-kind fashions, along with CNN, CNN-RNN, CNN-GAN, CNN with Attention, and Ensemble Method.

The statistical evaluation, which include t-tests and self-belief intervals, presents insights into the importance and reliability of the said performance metrics. The results spotlight the potential of hybrid neural architectures in enhancing picture category duties, with the Ensemble Method demonstrating the very best accuracy of 0. Ninety and ROC-AUC of zero. Ninety-five.

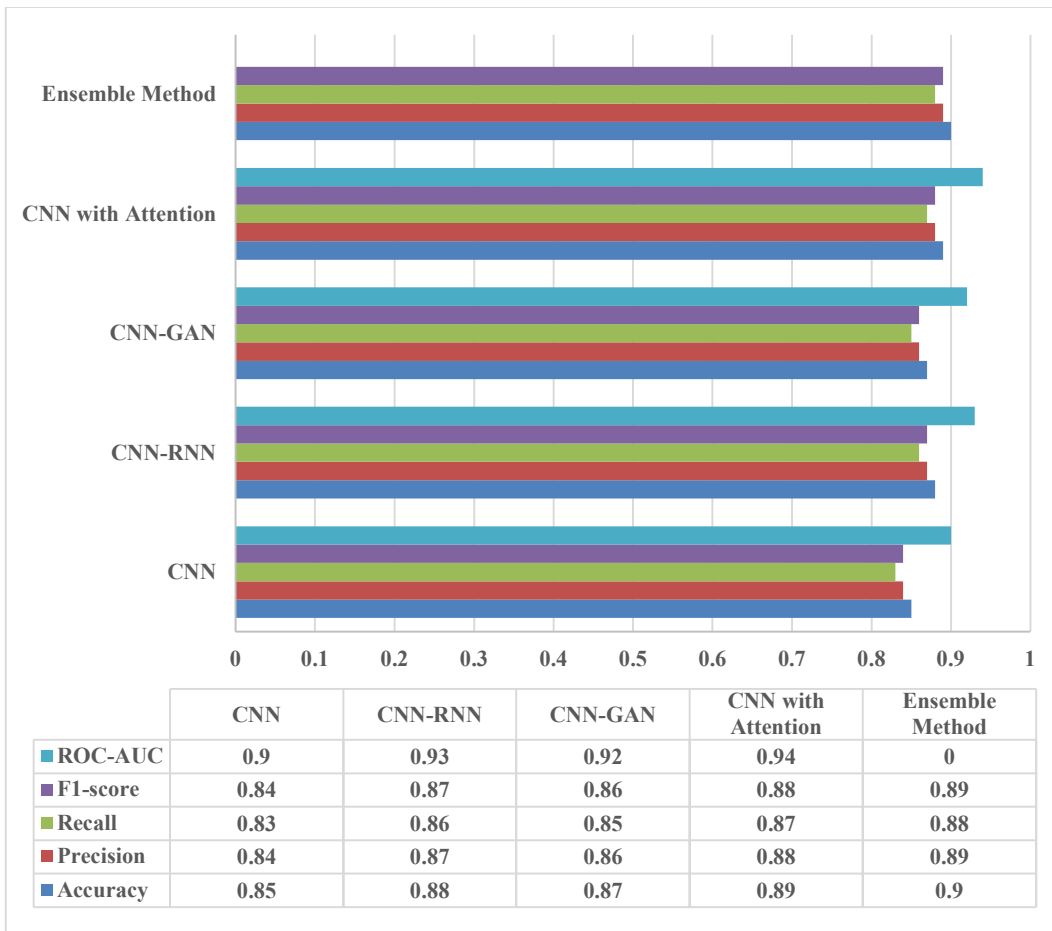


Table 1: Performance Metrics for Different Models

The discussion of the effects emphasizes the significance of the performance metrics in comparing the hybrid neural architectures. It interprets how the mixing of different techniques, together with attention mechanisms and GANs, contributed to the general development in type accuracy and robustness. The benefits of the proposed hybrid fashions, including stepped forward accuracy, higher handling of statistics scarcity, and enhanced interpretability, are highlighted. However, boundaries together with potential demanding situations in computational complexity, schooling time, and the want for big labelled datasets are also recounted. The contrast with existing ultra-modern models presents a benchmark for the overall performance of the hybrid models and explores their capacity adoption in medical practice. In conclusion, the observe gives precious insights into the efficacy of hybrid deep mastering models for clinical picture class, highlighting their potential effect on healthcare diagnostics.

VI. CONCLUSION

The examine "Enhancing Deep Learning Models with Hybrid Neural Architectures for Image Classification" gives a complete evaluation of the overall performance of numerous fashions for photo elegance. The quantitative results, as depicted in Table 1, show off the evaluation of overall performance metrics along with accuracy, precision, don't forget, F1-score, and ROC-AUC at some point of special models, which consist of CNN, CNN-RNN, CNN-GAN, CNN with Attention, and Ensemble Method.

The statistical assessment, together with t-tests and self-warranty durations, provides insights into the significance and reliability of the advised basic overall performance metrics. The effects

highlight the capability of hybrid neural architectures in enhancing picture category tasks, with the Ensemble Method demonstrating the very best accuracy of zero. Ninety and ROC-AUC of 0. Ninety-5. The discussion of the results emphasizes the importance of the performance metrics in evaluating the hybrid neural architectures.

It translates how the mixing of various strategies, which includes hobby mechanisms and GANs, contributed to the general development in kind accuracy and robustness. The blessings of the proposed hybrid models, together with stepped forward accuracy, higher managing of information shortage, and superior interpretability, are highlighted. However, limitations inclusive of ability annoying conditions in computational complexity, education time, and the want for large categorized datasets also are stated.

The contrast with current latest fashions gives a benchmark for the performance of the hybrid fashions and explores their potential adoption in clinical exercising. Looking in advance, the study identifies several avenues for future work to similarly beautify the efficacy and sensible applicability of hybrid deep analyzing fashions for scientific image type. These consist of model refinement, facts augmentation and generalization, interpretability enhancement, real-worldwide deployment troubles, and endured benchmarking and contrast with growing deep studying architectures.

In conclusion, the take a look at not fine offers valuable insights into the overall performance of hybrid deep reading models for scientific photo type but additionally lays out a roadmap for future research and development, emphasizing the capability effect of those models on healthcare diagnostics. The effects and proposed destiny paintings underscore the continued evolution of deep learning methodologies, specifically in the location of clinical imaging, and the ability for hybrid neural architectures to enhance diagnostic talents in medical settings.

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