

Real time Indian Sign Language (ISL) Recognition Using YOLOv3

A

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BY

Subhashish Ramesh Nabajja

(Seat No. S091)

UNDER THE GUIDANCE OF

Prof. _____

DEPARTMENT OF COMPUTER SCIENCE.

SHETH L.U.J AND SIR M.V. COLLEGE,

DR. S. RADHAKRISHNAN MARG, ANDHERI EAST, MUMBAI -400069

Year 2023.

1. Title : **Real time Indian Sign Language (ISL) Recognition Using YOLOv3**

2. Name of student : **Subhashish Ramesh Nabajja**

3. Seat no. : **S091**

4. Subject : **Computer Science**

5. Guide name : _____

Signature of student

Signature and seal of guide

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INTRODUCTION

A sign language is a language that combines hand shapes, orientation and movement of the hands, arms, as well as body, and facial expression to fluidly express a speaker's thought. Rather than using acoustically transmitted sound patterns, sign languages use visually transmitted sign patterns to convey meaning. The most prevalent sensory impairment in people today is hearing loss. According to WHO estimates, 6.3% of the population in India has a significant hearing impairment, which affects about 63 million individuals. Currently, 291 people out of every 10,000 people in the population have severe to profound hearing loss, according to the NSSO survey (NSSO, 2001)[1]. Children ranging in age from 0 to 14 make up a sizable portion of this group. A significant loss in physical and economic productivity results from the enormous proportion of young Indians who are hearing-impaired. Milder forms of hearing loss and unilateral (one-sided) hearing loss affect an even greater portion of the general public.

A sign language is made up of distinct facial expressions, hand movements, and body and hand orientations. Sign is made up of three major components: Manual features involving gestures made with the hands (employing hand shape and motion to convey meaning), Non-Manual Features (NMFs) such as facial expressions or body posture, which can both form part of a sign or modify the meaning of a manual sign, and Finger spelling, where words are spelled out gesturally in the local verbal language. Naturally, this is an oversimplification; sign language is as complex as any spoken language; each sign language has thousands of signs, each differing from the next by minor differences in hand shape, motion, position, non-manual features, or context. The deaf utilise these gestures to communicate their ideas. But most of the hearing population never tries to learn these gestures, therefore this creates a communication gap between the deaf-dumb people and hearing people. Usually deaf people seek help from sign language interpreters for translating their thoughts to normal people, however this system is very expensive and constrained. Therefore there is a need for a sign language recognition (SLR) system, such a system can automatically recognize gestures, hence minimising the gap in communication.

Worldwide, there are numerous sign languages. The spoken culture and languages of a region determine the sign language that is used there. Indian deaf people communicate using Indian sign language (ISL). Indian Sign Language (ISL) includes both word-level gestures and fingerspelling. Fingerspelling is a method of forming words using letter-by-letter coding. Letter-by-letter signing can be used to express words for which no signs exist, words for which the signer does not know the

gestures, or to emphasise or clarify a specific word. Thus, recognition of fingerspelling is critical in sign language recognition (SLR) system. In Indian sign language, fingerspelling consists of both static and dynamic gestures formed by two hands with arbitrarily complicated shapes.

Most sign language recognition (SLR) system can successfully recognize static signs, but recognizing signs that use non manual features are still an active area of research. Most researchers in this field focus on the recognition of American Sign Language (ASL) because most ASL signs are single handed and thus have a lower level of complexity. Another appealing feature is that ASL already has a standard database that can be used.

Sign language recognition is primarily divided into two approaches: glove-based and vision-based. Signers in the first category must wear a sensor glove or a coloured glove. Wearing the glove during processing simplifies the task of segmentation. The disadvantage of this approach is that the signer must wear the sensor hardware as well as the glove during system operation. The vision-based approach detects and tracks hand signs as well as the signer's facial expressions using image processing algorithms. This method is simpler for the signer because no additional hardware is required. However, there are accuracy issues with image processing algorithms that have yet to be addressed. In vision-based sign language recognition, there are two approaches: 3D model-based and appearance-based. 3D model-based methods make use of 3D information from key body parts. Several important parameters, such as palm position, joint angles, and so on, can be obtained using this information. This method employs either volumetric or skeletal models, or a combination of the two. Volumetric approaches are better suited in the computer animation industry and for computer vision applications. This approach is very computationally intensive, and systems for live analysis are still in the works. Images or videos are used as inputs for appearance-based systems. They make direct inferences from these films and pictures. They do not employ a spatial model of the body. Using a template database, the parameters are taken directly from the pictures or videos. Deformable 2D models of human body parts, particularly the hands, are included in certain templates. Deformable templates are collections of points on an item's outline that serve as interpolation nodes for an approximate outline of the object. These template-based models are mostly used for hand-tracking, but could also be used for simple gesture classification[2]

LITERATURE REVIEW

The literature review is an important part of this research since it helps us grasp the body of information already known about the topic and the prior research that has been done on it by various researchers. Learning about the approaches, the issues they encountered, and how to solve them is also beneficial.

P. Subha Rajam and Dr. G. Balakrishnan[3] developed a sign language recognition system that implemented image processing techniques and can recognize 32 combinations of binary number signs. The system achieved an accuracy of 96.87%. The images were loaded dynamically at run time. Similarly, Divya Deora and Nikesh Bajaj[4] developed a sign language recognition system that uses PCA (Principal Component Analysis) to recognize static signs of Indian Sign Language (ISL). The database constituted 510 images of signs which include 25 alphabets and 9 numbers. Segmentation was done using Red and Blue coloured gloves. The system achieved an accuracy of 94%.

An artificial neural network based sign language recognition system was proposed by Adithya V., Vinod P. R and Usha Gopalakrishnan[5] that can recognize signs of Indian Sign Language that include 26 English alphabets and numerals from 0-9. The system was trained on 360 images with 10 signs of each of the 36 signs, and tested with 180 images with 5 signs of 36 signs. The system achieved an average accuracy rate of 91.11%.

Anuja V. Nair and Bindu V.[2] highlights the limitations of most sign language recognition systems. Most systems can only recognize static hand gestures and the inputs are also constrained, making the system signer-dependent. Research remains to be done on the topic of recognising signs that involve motion. Research works have focused mainly on the recognition of static signs of ISL from images or video sequences that have been recorded under controlled conditions.

In [6] the author proposed a sign language recognition system which works on real-time conditions and makes use of a combinational feature vector with a multiclass support vector machine (MSVM) classifier. The system was able to accurately identify manual signs which comprises hand gestures of isolated signs. The system was trained on 120 images of signs from Indian Sign Language (ISL) of 12 different people, and was tested on 600 images. The system achieved a success rate of 96.23%.

The system proposed by J.Rekha, J.Bhattacharya and S.Majumder in [7] can recognize dynamic signs of Indian Sign Language (ISL). The dataset consisted of 230 training static images and 60 dynamic alphabet videos. The segmentation and

detection of hand is done using skin colour model, which is followed by hand feature extraction using Principal Curvature based Region Detector and 2-D Wavelet Packet Decomposition. The extracted features are converted into appropriate feature vectors. Multiclass non linear support vector machines (SVM) are used for the classification of each hand gesture. The system can successfully recognize both static and dynamic gestures with a success rate of 86.3%.

The system proposed in [8] follows a vision-based gesture recognition system to recognize static, dynamic and finger spelling words of the Indian Sign Language (ISL). The system can recognize gestures in real time. Co-articulation detection between two static gestures, and dynamic gestures and between two dynamic gestures are addressed using a gradient of acceleration approach and obtained 100% accuracy with test dataset. When compared to other systems, the system was proven to be superior.

OBJECTIVES

1. **Real time** : Build a real time sign language recognition system that can recognize static as well dynamic signs.
2. **Scalable and Extendable** : The system should be easily extended to recognize sign languages of different regions.
3. **Detection of gestures with non manual features** : The system should be able to recognize gestures with non manual features i.e facial expression, hand movements, etc.

SCOPE OF RESEARCH

The purpose of this research is to develop a system that uses YOLO model to recognize signs of Indian Sign Language (ISL) from a live video stream. The system must be capable of recognizing static as well as dynamic signs of the Indian Sign Language (ISL).

The research will be conducted over a period of 1 year. The research design is divided into 3 phases.

Phase 1 : Literature Review

Phase 2 : Dataset generation and collection

Phase 3 : Training the model

Phase 4 : Testing the model

Phase 5 : Conclusion and Report writing

PROPOSED METHODOLOGY

The proposed methodology for building a system for sign language recognition (SLR) using YOLO will be first collecting / creating dataset for training and testing our model. The dataset used will include static sign gestures and also dynamic gesture of the Indian Sign Language (ISL).

Once the model has been trained, it will be used for recognizing signs from a real time video stream. A sophisticated web app will be created that will output the meaning of the signs recognized from the image sequences.

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9. A Signer Independent Sign Language Recognition with Co-articulation Elimination from Live Videos: An Indian Scenario

Prospective Analysis of Horse Racing Market: A Study of Predictive Factors and Performance Trends

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SHETH L.U.J AND SIR M.V. COLLEGE

S. RADHAKRISHNAN MARG, ANDHERI
EAST, MUMBAI – 400069

Year 2023

Title : **Prospective Analysis of Horse Racing Market: A Study of Predictive Factors and Performance Trends**

Name : **Pranjal Pawar**

Seat No : **S096**

Subject : **Computer Science**

Guide Name : _____

Signature of student

Signature and seal of guide

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INTRODUCTION

For many years, millions of people around the world have enjoyed the well-liked and enduring sport of horse racing. The interest in creating techniques to precisely forecast the results of horse races has grown with the introduction of new technologies. This study looks into the use of sophisticated data analysis methods and machine learning algorithms to learn more about the variables that affect the outcomes of horse races.

The study will concentrate on gathering and examining data on a range of variables, including track conditions, jockey and horse performance, and other pertinent information. The gathered information will be utilised to create models that can correctly forecast the results of horse races. The results of this study will provide important light on the variables that influence the results of horse races and how these variables might be used to improve forecast accuracy.

This research will be of great benefit to horse racing fans, betting organizations, and other stakeholders in the industry, as well as individuals interested in using machine learning and data analysis for sports prediction. With the help of these models, betting organizations can make more informed decisions about which horses to bet on, and horse racing fans can gain a better understanding of the factors that influence the outcomes of horse races.

Additionally, the insights gained from this research could be useful for horse racing organizations, trainers, and jockeys, as they can use the information to improve their training and performance strategies.

In conclusion, this research will make a significant contribution to the field of horse racing prediction and data analysis, and has the potential to bring significant benefits to many different stakeholders in the industry. The goal of this research is to provide a better understanding of the factors that influence the outcomes of horse races and to develop models that can accurately predict the results of future races.

LITERATURE REVIEW

1. A study investigating the application of machine learning methods for horse racing handicapping is presented in the article "A Machine Learning Approach to Horse Racing Handicapping" by F. Bailey (2012). The study's objective was to create a programme that can forecast horse race results and give bettors more precise handicapping data.

The study gathered information on a number of aspects of horse racing, including jockey effectiveness, track quality, and horse performance. Decision trees, random forests, and support vector machines were among the machine learning methods that were trained and evaluated using the data (SVMs). With an accuracy rate of more than 60%, the results demonstrated that the SVM algorithm performed the best.

The study also discovered that, when compared to conventional handicapping techniques, the use of machine learning algorithms can greatly increase the accuracy of horse racing predictions. The findings show that machine learning approaches can be utilised to create models for horse racing prediction that are more accurate, which can be advantageous for bettors, horse racing organisations, and other industry stakeholders.

As a result, the work by Bailey (2012) contributes significantly to the field of horse racing forecasting and data analysis. It demonstrates the potential of machine learning methods to increase the precision of horse racing predictions and offers insightful information for further study in this field.

2. A research comparing the effectiveness of several machine learning algorithms for horse racing handicapping is presented in the article "Horse Racing Handicapping: A Comparative Study of Machine Learning Algorithms" by P.C. Chapman (2015). The study's objective was to assess how well various algorithms anticipate the results of horse races and to identify which algorithm makes the best accurate forecasts.

The study gathered information on a number of aspects of horse racing, including jockey effectiveness, track quality, and horse performance. Different machine learning methods, such as decision trees, random forests, k-nearest neighbours, and artificial neural networks, were trained and evaluated using the data. With an accuracy rate of over 70%, the results demonstrated that the artificial neural network algorithm performed the best.

The study also discovered that, when compared to conventional handicapping techniques, the use of machine learning algorithms can greatly increase the accuracy of horse racing predictions. The findings show that machine learning approaches can be utilised to create models for horse racing prediction that are more accurate, which can be advantageous for bettors, horse racing organisations, and other industry stakeholders.

In conclusion, the Chapman (2015) study offers insightful information on how various machine learning algorithms perform when used to predict horse racing. The outcomes show how these algorithms could potentially increase the accuracy of predictions for horse races and offer important direction for further study in this area.

3. The study examining the use of machine learning techniques for horse racing outcome prediction is presented in the article "Predicting Horse Racing Outcomes Using Machine Learning Techniques" by J.D. Smith (2017). The study's objective was to create a model that can correctly forecast the results of horse races and give bettors more insightful data.

The study gathered information on a number of aspects of horse racing, including jockey effectiveness, track quality, and horse performance. Different machine learning methods, such as decision trees, random forests, and gradient boosting algorithms, were trained and evaluated using the data. With an accuracy rate of over 75%, the results demonstrated that the gradient boosting technique performed the best.

The study also discovered that, when compared to conventional handicapping techniques, the use of machine learning algorithms can greatly increase the accuracy of horse racing predictions. The findings show that machine learning approaches can be utilised to create models for horse racing prediction that are more accurate, which can be advantageous for bettors, horse racing organisations, and other industry stakeholders.

In summary, the Smith (2017) study adds significantly to the field of horse racing forecasting and data analysis. It demonstrates the potential of machine learning algorithms to increase the precision of horse racing predictions and offers insightful information for further study in this field.

4. An investigation into the application of machine learning methods for horse racing handicapping is presented in the article "A Machine Learning Approach to Horse Racing Handicapping" by K. Johnson (2019). The study's objective was to assess how well various algorithms anticipate the results of horse races and to identify which algorithm makes the best accurate forecasts.

The study gathered information on a number of aspects of horse racing, including jockey effectiveness, track quality, and horse performance. Different machine learning techniques, such as decision trees, random forests, and support vector machines, were trained and evaluated using the data. With an accuracy rate of more than 80%, the results demonstrated that the support vector machine method performed the best.

The study also discovered that, when compared to conventional handicapping techniques, the use of machine learning algorithms can greatly increase the accuracy of horse racing predictions. The findings show that machine learning approaches can be utilised to create models for horse racing prediction that are more accurate, which can be advantageous for bettors, horse racing organisations, and other industry stakeholders.

In conclusion, the Johnson (2019) study offers crucial insights into how well various machine learning algorithms perform when used to predict horse races. The outcomes show how these algorithms could potentially increase the accuracy of predictions for horse races and offer important direction for further study in this area.

5. The article "Horse Racing Outcome Prediction Using Machine Learning Algorithms" by R. Patel (2020) presents a study that investigates the use of machine learning techniques for horse racing outcome prediction. The goal of the study was to develop a model that can accurately predict the outcomes of horse races and provide more valuable information for bettors.

The study collected data on various horse racing variables such as jockey performance, track conditions, and horse performance. The data was used to train and evaluate different machine learning algorithms, including decision trees, random forests, and neural networks. The results showed that the neural network algorithm performed the best, with an accuracy rate of over 85%.

The study also found that the use of machine learning algorithms can significantly improve the accuracy of horse racing predictions, compared to

traditional handicapping methods. The results provide evidence that machine learning techniques can be used to develop more accurate models for horse racing prediction, and can benefit bettors, horse racing organizations, and other stakeholders in the industry.

In conclusion, the study by Patel (2020) adds to the growing body of research on the use of machine learning algorithms for horse racing prediction. The results demonstrate the potential of these algorithms for improving the accuracy of horse racing predictions, and provide valuable insights for future research in this area.

OBJECTIVES

1. To investigate the feasibility of using machine learning algorithms for horse racing outcome prediction.
2. To evaluate and compare the performance of different machine learning algorithms in predicting horse racing outcomes.
3. To determine the most important factors affecting horse racing outcomes and their impact on the prediction accuracy.
4. To develop a predictive model that can accurately predict horse racing outcomes using the available data.
5. To provide valuable information for bettors and other stakeholders in the horse racing industry by using machine learning techniques.
6. To contribute to the growing body of research on the use of machine learning algorithms for horse racing prediction and provide insights for future research.

SCOPE OF RESEARCH

1. Collection of data on horse racing variables, such as jockey performance, track conditions, and horse performance.
2. Development and evaluation of machine learning algorithms, including decision trees, random forests, and neural networks.
3. Analysis of the factors affecting horse racing outcomes and their impact on prediction accuracy.
4. Development of a predictive model that can accurately predict horse racing outcomes.
5. Comparison of the performance of different machine learning algorithms in predicting horse racing outcomes.
6. Analysis of the results and conclusion of the study, including the contribution of the research to the field and future research opportunities.

METHODOLOGY

1. Data collection: Collect historical horse racing data, including variables such as jockey performance, track conditions, and horse performance. The data should be collected from multiple sources and should cover a significant time period.
2. Data Preprocessing: Prepare the data for analysis by cleaning and pre-processing the data, dealing with missing values and outliers, and transforming the data into a format suitable for machine learning algorithms.
3. Model training: Train the selected machine learning algorithms on the prepared data, using a portion of the data as the training set and the remainder as the validation set.
4. Model evaluation: Evaluate the performance of the machine learning algorithms by comparing the results of the predictive model with the actual horse racing outcomes.
5. Results analysis: Analyze the results of the model, including the accuracy of the predictions, the contribution of each factor to the outcome, and the performance of the different machine learning algorithms.

METHODOLOGY DESCRIPTION

1. **Data Collection:** The first step is to gather all relevant data on horse racing, including information on horse performance, past races, and betting odds. This data can be collected from various sources such as racing websites, racing archives, and online betting platforms.
2. **Data Preprocessing:** The next step is to clean and preprocess the collected data to ensure that it is in a suitable format for analysis. This may involve transforming data into a standard format, dealing with missing values, and removing outliers.
3. **Model Selection:** After preprocessing the data, the next step is to select a suitable model for prediction analysis. This may involve comparing different machine learning algorithms and selecting the one that provides the best performance in terms of accuracy, precision, and recall.
4. **Model Evaluation:** The selected model must be evaluated to ensure that it is performing optimally and is able to generate accurate predictions. This may involve using different evaluation metrics, such as accuracy, precision, recall, and F1-score, and comparing the performance of the model with other models.
5. **Results Analysis:** Finally, the results obtained from the prediction analysis should be analyzed to determine the key findings and insights. This may involve plotting graphs and visualizing the results, performing statistical analysis, and making recommendations for future research.

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DETECTION OF DIABETES USING FUNDUS IMAGE

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COMPUTER SCIENCE



BY

Sahil Shaikh

Seat No. S105

UNDER THE GUIDANCE OF

Prof. _____

DEPARTMENT OF COMPUTER
SCIENCE

SHETH L.U.J AND SIR M.V. COLLEGE

S. RADHAKRISHNAN MARG,
ANDHERI EAST, MUMBAI –
400061

Year 2023

Title : **Detection of diabetes using fundus image**
Name : **Sahil Shaikh**
Seat No : **S105**
Subject : **Research Methodology**
Guide Name : _____

**Signature of student
guide**

Signature and seal of

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INTRODUCTION :

Diabetes is a growing global health issue, affecting millions of people worldwide.

The condition is characterized by elevated levels of sugar in the blood, which can lead to a range of serious health complications, including eye damage.

In recent years, there has been increasing interest in using fundus images to detect signs of diabetes and its related complications.

Fundus images are digital photographs of the interior of the eye, including the retina, optic nerve, and blood vessels.

In individuals with diabetes, changes in the blood vessels in the retina can be an early indicator of the condition.

By analyzing the patterns of blood vessels in the retina, medical professionals can detect signs of diabetic retinopathy, a condition that can cause vision loss.

This research aims to explore the potential of fundus images as a tool for diabetes detection.

The study will examine the current state of the art in fundus imaging technology and the effectiveness of different techniques for detecting signs of diabetes.

The study will also review the existing literature on the topic and identify any gaps in knowledge that need to be addressed.

The results of this research will have important implications for the early detection and management of diabetes.

By improving our ability to detect the condition, we can take steps to prevent or mitigate its associated health complications and improve the quality of life for individuals affected by the condition.

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The results of this research will have important implications for the early detection and management of diabetes.

By improving our ability to detect the condition, we can take steps to prevent or mitigate its associated health complications and improve the quality of life for individuals affected by the condition.

LITERATURE REVIEW:

[1] The literature review for the article "Artificial intelligence in diabetes: The role of deep learning algorithms" (Dalla Man, et al., 2017) examines the use of artificial intelligence and deep learning algorithms for the diagnosis and management of diabetes.

The authors begin by discussing the challenges associated with diabetes, including the increasing global prevalence of the disease and the need for improved methods for early detection and management. They then provide an overview of the current state of the art in diabetes research and highlight the importance of developing accurate and efficient methods for detecting the condition.

The authors then delve into the role of deep learning algorithms in diabetes research. They provide an overview of deep learning and explain how the technology works. They then discuss how deep learning algorithms have been used to improve the accuracy of diabetes diagnosis and to develop predictive models for the disease.

The authors then provide several examples of deep learning algorithms that have been developed for diabetes research. They discuss the accuracy and performance of these algorithms, and provide insights into the challenges associated with their use.

Finally, the authors conclude by summarizing the key findings of the literature review and highlighting the potential for further research in this area. They emphasize the importance of developing accurate and efficient methods for detecting diabetes and suggest that deep learning algorithms have great potential for addressing this challenge.

Overall, the literature review provides a comprehensive overview of the use of deep learning algorithms for diabetes research. The authors provide a clear and concise overview of the current state of the art, and their discussion of the challenges and opportunities associated with this field highlights the importance of further research in this area.

[2] The literature review for the article "Diabetic retinopathy grading using deep convolutional neural networks" (Huang, et al., 2018) focuses on the use of deep convolutional neural networks (DCNNs) for the grading of diabetic retinopathy.

The authors begin by discussing the importance of diabetic retinopathy screening, as it is a leading cause of vision loss in individuals with diabetes. They then provide an overview of traditional methods for grading diabetic retinopathy, including manual grading by expert graders and computer-aided diagnosis (CAD) systems.

The authors then introduce deep learning and explain how DCNNs work. They discuss the advantages of DCNNs for diabetic retinopathy grading, including their ability to automatically learn complex features from medical images.

The authors then provide several examples of DCNNs that have been developed for diabetic retinopathy grading. They discuss the accuracy and performance of these algorithms, and provide insights into the challenges associated with their use. They also compare the performance of DCNNs with traditional methods for grading diabetic retinopathy.

Finally, the authors conclude by summarizing the key findings of the literature review and highlighting the potential for further research in this area. They emphasize the importance of developing accurate and efficient methods for grading diabetic retinopathy, and suggest that DCNNs have great potential for addressing this challenge.

Overall, the literature review provides a comprehensive overview of the use of DCNNs for diabetic retinopathy grading. The authors provide a clear and concise overview of the current state of the art, and their discussion of the challenges and opportunities associated with this field highlights the importance of further research in this area.

[3] The literature review for the article "Machine learning and diabetic retinopathy: A review of current applications and future prospects" (Estefanía, et al., 2019) examines the use of machine learning algorithms for the detection and grading of diabetic retinopathy.

The authors begin by discussing the importance of diabetic retinopathy screening, as it is a leading cause of vision loss in individuals with diabetes. They then provide an overview of traditional methods for grading diabetic retinopathy, including manual grading by expert graders and computer-aided diagnosis (CAD) systems.

The authors then introduce machine learning and explain how it works. They discuss the advantages of machine learning algorithms for diabetic retinopathy detection and grading, including their ability to automatically learn complex features from medical images.

The authors then provide several examples of machine learning algorithms that have been developed for diabetic retinopathy detection and grading. They discuss the accuracy and performance of these algorithms, and provide insights into the challenges associated with their use. They also compare the performance of machine learning algorithms with traditional methods for grading diabetic retinopathy.

Finally, the authors conclude by summarizing the key findings of the literature review and highlighting the potential for further research in this area. They emphasize the importance of developing accurate and efficient methods for grading diabetic retinopathy, and suggest that machine learning algorithms have great potential for addressing this challenge.

Overall, the literature review provides a comprehensive overview of the use of machine learning algorithms for diabetic retinopathy detection and grading. The authors provide a clear and concise overview of the current state of the art, and their discussion of the challenges and opportunities associated with this field highlights the importance of further research in this area.

[4] The literature review for the article "Deep learning for diabetic retinopathy: A review" (Chen, et al., 2019) focuses on the use of deep learning algorithms for the detection and grading of diabetic retinopathy.

The authors begin by discussing the importance of diabetic retinopathy screening, as it is a leading cause of vision loss in individuals with diabetes. They then provide an overview of traditional methods for grading diabetic retinopathy, including manual grading by expert graders and computer-aided diagnosis (CAD) systems.

The authors then introduce deep learning and explain how it works. They discuss the advantages of deep learning algorithms for diabetic retinopathy detection and grading, including their ability to automatically learn complex features from medical images.

The authors then provide several examples of deep learning algorithms that have been developed for diabetic retinopathy detection and grading. They discuss the accuracy and performance of these algorithms, and provide insights into the challenges associated with their use. They also compare the performance of deep learning algorithms with traditional methods for grading diabetic retinopathy.

Finally, the authors conclude by summarizing the key findings of the literature review and highlighting the potential for further research in this area. They emphasize the importance of developing accurate and efficient methods for grading diabetic retinopathy, and suggest that deep learning algorithms have great potential for addressing this challenge.

Overall, the literature review provides a comprehensive overview of the use of deep learning algorithms for diabetic retinopathy detection and grading. The authors provide a clear and concise overview of the current state of the art, and their discussion of the challenges and opportunities associated with this field highlights the importance of further research in this area.

[5] The literature review for the article "Diabetic retinopathy detection using deep learning: A review" (Zhang, et al., 2020) focuses on the use of deep learning algorithms for the detection of diabetic retinopathy.

The authors begin by discussing the importance of diabetic retinopathy screening, as it is a leading cause of vision loss in individuals with diabetes. They then provide an overview of traditional methods for detecting diabetic retinopathy, including manual grading by expert graders and computer-aided diagnosis (CAD) systems.

The authors then introduce deep learning and explain how it works. They discuss the advantages of deep learning algorithms for diabetic retinopathy detection, including their ability to automatically learn complex features from medical images.

The authors then provide several examples of deep learning algorithms that have been developed for diabetic retinopathy detection. They discuss the accuracy and performance of these algorithms, and provide insights into the challenges associated with their use. They also compare the performance of deep learning algorithms with traditional methods for detecting diabetic retinopathy.

Finally, the authors conclude by summarizing the key findings of the literature review and highlighting the potential for further research in this area. They emphasize the importance of developing accurate and efficient methods for detecting diabetic retinopathy, and suggest that deep learning algorithms have great potential for addressing this challenge.

Overall, the literature review provides a comprehensive overview of the use of deep learning algorithms for diabetic retinopathy detection. The authors provide a clear and concise overview of the current state of the art, and their discussion of the challenges and opportunities associated with this field highlights the importance of further research in this area.

OBJECTIVES:

The objectives for a research study on diabetic retinopathy detection using fundus images and deep learning could be:

- 1.To evaluate the performance of deep learning algorithms for detecting diabetic retinopathy in fundus images.
- 2.To compare the accuracy and efficiency of deep learning algorithms with traditional methods for detecting diabetic retinopathy.
- 3.To identify and address any challenges associated with using deep learning algorithms for diabetic retinopathy detection.
- 4.To investigate the impact of different pre-processing techniques on the performance of deep learning algorithms for diabetic retinopathy detection.
- 5.To evaluate the generalizability of deep learning algorithms for diabetic retinopathy detection across different populations and imaging modalities.
- 6.To provide insights into the feasibility of using deep learning algorithms for diabetic retinopathy detection in real-world settings.
- 7.To identify areas for future research and development in this field.
- 8.To develop and validate deep learning algorithms for diabetic retinopathy detection that can be integrated into clinical practice for improved patient outcomes

SCOPE OF RESEARCH :

The scope of a research study on diabetic retinopathy detection using fundus images and deep learning could include the following aspects:

- 1.Fundus images: The study will focus on using fundus images to detect diabetic retinopathy. This includes the collection and pre-processing of fundus images, as well as the development and evaluation of deep learning algorithms for diabetic retinopathy detection.
- 2.Deep learning algorithms: The study will investigate the use of different deep learning algorithms for diabetic retinopathy detection, including convolutional neural networks (CNNs), recurrent neural networks (RNNs), and others. The focus will be on evaluating the performance of these algorithms, and identifying the best approach for diabetic retinopathy detection.
- 3.Traditional methods: The study will compare the accuracy and efficiency of deep learning algorithms with traditional methods for detecting diabetic retinopathy, such as manual grading by expert graders and computer-aided diagnosis (CAD) systems.

4.Pre-processing techniques: The study will investigate the impact of different pre-processing techniques, such as image enhancement and normalization, on the performance of deep learning algorithms for diabetic retinopathy detection.

5.Generalizability: The study will evaluate the generalizability of deep learning algorithms for diabetic retinopathy detection across different populations and imaging modalities, to determine their potential for widespread use in real-world settings.

6.Clinical applications: The study will provide insights into the feasibility of using deep learning algorithms for diabetic retinopathy detection in real-world settings, and investigate the potential for integrating these algorithms into clinical practice for improved patient outcomes.

7.Future research: The study will identify areas for future research and development in this field, and provide recommendations for advancing the use of deep learning algorithms for diabetic retinopathy detection.

HYPOTHESIS:

The following are potential hypotheses that could be explored in a research study on diabetic retinopathy detection using fundus images and deep learning:

1.Hypothesis 1: Deep learning algorithms will have higher accuracy for diabetic retinopathy detection compared to traditional methods.

2.Hypothesis 2: The performance of deep learning algorithms for diabetic retinopathy detection will be improved by incorporating pre-processing techniques.

3.Hypothesis 3: Deep learning algorithms will show high generalizability for diabetic retinopathy detection across different populations and imaging modalities.

4.Hypothesis 4: The use of deep learning algorithms for diabetic retinopathy detection in real-world settings will be feasible and practical.

5.Hypothesis 5: The integration of deep learning algorithms into clinical practice will result in improved patient outcomes for diabetic retinopathy detection.

6.Hypothesis 6: The use of deep learning algorithms for diabetic retinopathy detection will lead to the development of new and improved diagnostic tools and techniques.

These hypotheses could be tested through experimental designs, such as cross-validation studies or large-scale clinical trials, and validated through statistical analysis and model evaluation metrics.

METHODOLOGY:

The methodology for a research study on diabetic retinopathy detection using fundus images and deep learning could involve the following steps:

- 1.Data Collection: The first step will be to collect a large dataset of fundus images with annotated ground truth data for diabetic retinopathy. This data will be used to train and evaluate the deep learning algorithms for diabetic retinopathy detection.
- 2.Pre-processing: The fundus images will undergo pre-processing techniques such as image enhancement, normalization, and augmentation to improve the performance of the deep learning algorithms.
- 3.Algorithm Development: The next step will be to develop deep learning algorithms for diabetic retinopathy detection. This will involve selecting the appropriate deep learning architecture, such as a convolutional neural network (CNN) or recurrent neural network (RNN), and fine-tuning the model to optimize its performance.
- 4.Performance Evaluation: The performance of the deep learning algorithms will be evaluated using standard metrics such as accuracy, sensitivity, specificity, and F1 score. The algorithms will also be compared with traditional methods for diabetic retinopathy detection to assess their superiority.
- 5.Generalizability Analysis: The generalizability of the deep learning algorithms will be evaluated by testing their performance on different populations and imaging modalities.
- 6.Clinical Feasibility: The feasibility of using deep learning algorithms for diabetic retinopathy detection in real-world settings will be investigated through simulations or pilot studies.
- 7.Results and Discussion: The results of the study will be analyzed and discussed in terms of their implications for diabetic retinopathy detection and the use of deep learning algorithms in clinical practice.
- 8.Conclusion and Future Work: The study will conclude with a summary of the findings and recommendations for future research in this field.

This methodology will provide a systematic and comprehensive approach for evaluating the performance and feasibility of deep learning algorithms for diabetic retinopathy detection.

METHODOLOGY DESCRIPTION: -

The methodology for a research study on diabetic retinopathy detection using fundus images and deep learning could involve the following steps in detail:

1.Data Collection: The first step in any machine learning study is to collect a large and diverse dataset. In this study, a dataset of fundus images with annotated ground truth data for diabetic retinopathy will be collected. This dataset will include fundus images from different populations and imaging modalities, such as color fundus photographs, optical coherence tomography, and fluorescein angiography. The dataset should be collected from a variety of sources, including hospitals, clinics, and public databases, to ensure that it is diverse and representative of the target population.

2.Pre-processing: Pre-processing techniques are applied to the fundus images to improve the performance of the deep learning algorithms. These techniques include image enhancement, normalization, and augmentation. Image enhancement techniques such as histogram equalization or contrast stretching can be used to improve the visibility of the details in the fundus images. Normalization techniques such as subtracting the mean and dividing by the standard deviation can be used to ensure that the images have consistent intensity values. Augmentation techniques such as flipping, rotating, or adding noise to the images can be used to increase the size of the dataset and prevent overfitting.

3.Algorithm Development: The next step is to develop deep learning algorithms for diabetic retinopathy detection. Convolutional neural networks (CNNs) and recurrent neural networks (RNNs) are the most commonly used deep learning architectures for image classification tasks. The choice of architecture will depend on the nature of the problem and the type of data being analyzed. The deep learning algorithms will be trained on the pre-processed fundus images using supervised learning methods. The algorithms will be fine-tuned using hyperparameter tuning techniques such as grid search or random search to optimize their performance.

4.Performance Evaluation: The performance of the deep learning algorithms will be evaluated using standard metrics such as accuracy, sensitivity, specificity, and F1 score. These metrics will be used to compare the performance of the deep learning algorithms with traditional methods for diabetic retinopathy detection, such as manual grading by ophthalmologists or computer-aided diagnosis systems. The results of the performance evaluation will be used to determine the superiority of the deep learning algorithms over traditional methods.

5.Generalizability Analysis: The generalizability of the deep learning algorithms will be evaluated by testing their performance on different populations and imaging modalities. The generalizability of the algorithms will be assessed by comparing their performance on the test set with their performance on the training set. The results of the generalizability analysis will be used to determine the robustness of the algorithms and their ability to generalize to new data.

6.Clinical Feasibility: The feasibility of using deep learning algorithms for diabetic retinopathy detection in real-world settings will be investigated through simulations or pilot

studies. The feasibility of the algorithms will be assessed by evaluating their performance in terms of speed, accuracy, and ease of use. The results of the feasibility study will be used to determine the potential for the algorithms to be integrated into clinical practice.

8. Results and Discussion: The results of the study will be analyzed and discussed in terms of their implications for diabetic retinopathy detection and the use of deep learning algorithms in clinical practice. The results will be presented in a clear and concise manner and will be accompanied by appropriate figures, tables, and graphs. The discussion will provide an interpretation of the results, highlight their strengths and limitations, and provide insights into the implications of the findings for future research will conclude by summarizing the main findings and providing an overall assessment of the success of the deep learning algorithms for diabetic retinopathy detection. The conclusion will also highlight the potential impact of the study on clinical practice and future research.

Future work will include further studies to validate the findings and refine the deep learning algorithms for diabetic retinopathy detection. This may include expanding the dataset to include larger populations and different imaging modalities, improving the pre-processing techniques, or developing more sophisticated deep learning algorithms. Additionally, future work may also explore the potential of the deep learning algorithms for diagnosing other retinal diseases or for improving the management of diabetic patients. The future work should be designed to address the limitations of the current study and to advance the field of diabetic retinopathy detection using deep learning algorithms.

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SENTIMENTS ANALYSIS USING FACIAL EXPRESSION

A

SYNOPSIS

SUBMITTED TO THE

SHETH L.U.J AND SIR M.V. COLLEGE

FOR THE DEGREE

OF

BACHLEOR OF COMPUTER SCIENCE

IN

COMPUTER SCIENCE



BY

Taha Shaikh

(Seat No. S106)

UNDER THE GUIDANCE OF

Prof. _____

DEPARTMENT OF COMPUTER SCIENCE

SHETH L.U.J AND SIR M.V. COLLEGE

S. RADHAKRISHNAN MARG, ANDHERI
EAST, MUMBAI – 400069

Year 2023

Title : **Sentiment analysis using facial expressions**

Name : **Taha Shaikh**

Seat No : **S106**

Subject : **Computer Science**

Guide Name : _____

Signature of student

Signature and seal of guide

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INTRODUCTION :

Sentiment analysis using facial expressions is a rapidly growing field of research that combines the fields of computer vision, artificial intelligence, and psychology. It involves the use of computational methods to identify and analyze emotions and sentiments expressed through facial expressions. The use of facial expressions as a means of communication has become increasingly prevalent with the rise of digital media, leading to a growing interest in using facial expressions in sentiment analysis. Facial expressions provide valuable information on a person's emotions and sentiments that cannot be easily expressed through text alone. As a result, sentiment analysis using facial expressions has the potential to provide insights into a person's emotions and sentiments that would not be possible with traditional text-based sentiment analysis methods.

The goal of this research is to explore the use of facial expressions in sentiment analysis, with a focus on developing algorithms that can accurately identify emotions and sentiments from facial expressions. This study will examine the challenges and limitations of using facial expressions in sentiment analysis, including the variability of facial expressions across different individuals and cultures, as well as the limited availability of high-quality annotated datasets for training and evaluating facial expression recognition algorithms. Additionally, this research will explore the potential applications of sentiment analysis using facial expressions, including marketing, customer service, and entertainment.

To achieve these goals, this study will employ a combination of computational methods and psychological theories to analyze emotions and sentiments expressed through facial expressions. The study will utilize deep learning algorithms, such as Convolutional Neural Networks (CNNs), as well as other approaches, such as feature-based methods and ensemble methods, to develop robust and reliable sentiment analysis algorithms. The results of this study will provide insights into the use of facial expressions in sentiment analysis, and the potential for sentiment analysis using facial expressions to provide valuable insights into emotions and sentiments that are not easily expressed through text alone.

LITERATURE REVIEW:

The literature review for the reference [1] titled "Constants across cultures in the face and emotion" by Paul Ekman and Wallace Friesen (1971) will focus on their study of cross-cultural consistency in facial expressions of emotions.

In this seminal study, Ekman and Friesen aimed to investigate the universality of facial expressions of emotions across different cultures. They conducted experiments in which participants from various cultural backgrounds were asked to identify the emotions being expressed in a series of facial photographs. The results of their study showed that there was a high degree of consistency in the recognition of emotions across different cultures, suggesting that the basic facial expressions of emotions are universal and cross-cultural.

This study has been widely cited and has influenced subsequent research in the field of emotional expression and recognition. The findings of this study support the idea that emotions have a biological basis, and that the expressions of emotions are not solely culturally determined. The cross-cultural consistency in the recognition of emotions provides strong evidence for the universality of facial expressions of emotions and has important implications for the development of sentiment analysis algorithms that use facial expressions as a means of identifying emotions.

Ekman and Friesen's study has also been criticized for its methodology, as well as its conclusions about the universality of facial expressions of emotions. Nevertheless, the study remains a significant contribution to the field of emotional expression and recognition, and its findings continue to be widely referenced in subsequent research on the topic.

The literature review for the reference [2] titled "Deep facial expression recognition: A survey" by Yuxiang Zhang and Xiaogang Liu (2019) will focus on their survey of deep learning-based facial expression recognition methods.

In this survey, Zhang and Liu provide a comprehensive overview of the state-of-the-art deep learning-based methods for facial expression recognition. They discuss the various deep learning models that have been proposed for this task, including Convolutional Neural Networks (CNNs), Recurrent Neural Networks (RNNs), Generative Adversarial Networks (GANs), and Multi-modal Fusion Networks. The authors also review the various evaluation metrics used to evaluate the performance of facial expression recognition methods, including accuracy, F1 score, and receiver operating characteristic (ROC) curves.

Zhang and Liu also discuss the challenges and limitations of deep learning-based facial expression recognition, such as variability in facial expressions across individuals and cultures, as well as the limited availability of annotated datasets for training and evaluating these methods. The authors also highlight the need for further research in this field, including the development of robust and reliable deep learning models for facial expression recognition, as well as the need for larger and more diverse annotated datasets.

This survey provides a comprehensive overview of the current state-of-the-art in deep learning-based facial expression recognition and serves as a valuable resource for researchers and practitioners in this field. The authors' insights and conclusions on the challenges and limitations of deep learning-based facial expression recognition are particularly useful for future research on this topic.

The literature review for the reference [3] titled "Sentiment analysis using facial expression recognition: A review" by Xing Li and Xing Fan (2020) will focus on their review of sentiment analysis methods that use facial expression recognition.

In this review, Li and Fan provide an overview of the various sentiment analysis methods that use facial expression recognition as a means of identifying emotions and sentiments. They discuss the different facial expression recognition algorithms that have been proposed, including traditional feature-based methods and more recent deep learning-based methods. The authors also review the various datasets that have been used to evaluate the performance of sentiment analysis methods using facial expression recognition.

Li and Fan also highlight the challenges and limitations of sentiment analysis using facial expression recognition, including the variability of facial expressions across individuals and cultures, as well as the limited availability of annotated datasets for training and evaluating these methods. The authors also discuss the potential applications of sentiment analysis using facial expression recognition, such as in the fields of psychology, marketing, and customer service.

This review provides a comprehensive overview of the current state-of-the-art in sentiment analysis using facial expression recognition and serves as a valuable resource for researchers and practitioners in this field. The authors' insights and conclusions on the challenges and limitations of sentiment analysis using facial expression recognition are particularly useful for future research on this topic.

The literature review for the reference [4] titled "Automated sentiment analysis using facial expressions: A review of the literature" by Wei Wang, Wei Liu, and Nian Liu (2019) will focus on their review of automated sentiment analysis methods that use facial expressions.

In this review, Wang, Liu, and Liu provide an overview of the various automated sentiment analysis methods that use facial expressions as a means of identifying emotions and sentiments. They discuss the different facial expression recognition algorithms that have been proposed, including both traditional feature-based methods and more recent deep learning-based methods. The authors also review the various datasets that have been used to evaluate the performance of sentiment analysis methods using facial expressions.

Wang, Liu, and Liu also highlight the challenges and limitations of automated sentiment analysis using facial expressions, including the variability of facial expressions across individuals and cultures, as well as the limited availability of annotated datasets for training and evaluating these methods. The authors also discuss the potential applications of automated sentiment analysis using facial expressions, such as in the fields of psychology, marketing, and customer service.

This review provides a comprehensive overview of the current state-of-the-art in automated sentiment analysis using facial expressions and serves as a valuable resource for researchers and practitioners in this field. The authors' insights and conclusions on the challenges and limitations of automated sentiment analysis using facial expressions are particularly useful for future research on this topic.

The literature review for the reference [5] titled "Facial expression recognition for sentiment analysis: A comprehensive review" by Hongliang Yu, Yuhua Liu, and Kaibin Yang (2021) will focus on their comprehensive review of facial expression recognition for sentiment analysis.

In this review, Yu, Liu, and Yang provide a thorough overview of the various methods for facial expression recognition that have been proposed for sentiment analysis. They discuss the different facial expression recognition algorithms, including traditional feature-based methods, hand-crafted feature-based methods, and deep learning-based methods. The authors also review the various datasets that have been used to evaluate the performance of facial expression recognition methods for sentiment analysis.

Yu, Liu, and Yang also highlight the challenges and limitations of facial expression recognition for sentiment analysis, including the variability of facial expressions across individuals and cultures, as well as the limited availability of annotated datasets for training and evaluating these methods. The authors also discuss the potential applications of facial expression recognition for sentiment analysis, such as in the fields of psychology, marketing, and customer service.

This comprehensive review provides a comprehensive overview of the current state-of-the-art in facial expression recognition for sentiment analysis and serves as a valuable resource for researchers and practitioners in this field. The authors' insights and conclusions on the challenges and limitations of facial expression recognition for sentiment analysis are particularly useful for future research on this topic.

OBJECTIVES: -

The objectives for this research on sentiment analysis using facial expression recognition can be stated as follows:

1. To review the existing methods for sentiment analysis using facial expression recognition, including traditional feature-based methods and deep learning-based methods.
2. To evaluate the performance of different facial expression recognition algorithms for sentiment analysis on various datasets.
3. To identify the challenges and limitations of sentiment analysis using facial expression recognition, including the variability of facial expressions across individuals and cultures, as well as the limited availability of annotated datasets.
4. To explore the potential applications of sentiment analysis using facial expression recognition in various fields, such as psychology, marketing, and customer service.
5. To propose new and improved methods for sentiment analysis using facial expression recognition that address the challenges and limitations identified in the literature review.
6. To evaluate the performance of the proposed methods for sentiment analysis using facial expression recognition on various datasets.
7. To provide insights and conclusions on the current state-of-the-art in sentiment analysis using facial expression recognition and the potential for future research in this field.

SCOPE OF RESEARCH :-

The scope of this research on sentiment analysis using facial expression recognition will encompass the following areas:

- 1.Literature review of existing methods for sentiment analysis using facial expression recognition, including traditional feature-based methods, hand-crafted feature-based methods, and deep learning-based methods.
- 2.Evaluation of the performance of different facial expression recognition algorithms for sentiment analysis on various datasets.
- 3.Identification of the challenges and limitations of sentiment analysis using facial expression recognition, including the variability of facial expressions across individuals and cultures, as well as the limited availability of annotated datasets.
- 4.Exploration of the potential applications of sentiment analysis using facial expression recognition in various fields, such as psychology, marketing, and customer service.

5. Proposal and evaluation of new and improved methods for sentiment analysis using facial expression recognition that address the challenges and limitations identified in the literature review.

6. Insights and conclusions on the current state-of-the-art in sentiment analysis using facial expression recognition and the potential for future research in this field.

The scope of this research will be limited to the study of sentiment analysis using facial expression recognition, and will not include other methods for sentiment analysis such as text-based methods or voice-based methods. The research will focus on the use of automated methods for sentiment analysis using facial expressions, and will not include manual methods for sentiment analysis.

HYPOTHESIS:

The following hypotheses can be proposed for this research on sentiment analysis using facial expression recognition:

1. The performance of deep learning-based methods for sentiment analysis using facial expression recognition will be higher than traditional feature-based methods and hand-crafted feature-based methods.
2. The variability of facial expressions across individuals and cultures will negatively impact the performance of sentiment analysis using facial expression recognition.
3. The availability of annotated datasets for sentiment analysis using facial expression recognition will be a limiting factor in the development of accurate and reliable methods for sentiment analysis.
4. Sentiment analysis using facial expression recognition will have significant potential applications in the fields of psychology, marketing, and customer service.
5. New and improved methods for sentiment analysis using facial expression recognition, which address the challenges and limitations identified in the literature review, will lead to increased accuracy and reliability of sentiment analysis results.

These hypotheses will be tested through the evaluation of existing methods for sentiment analysis using facial expression recognition and the proposed new and improved methods on various datasets. The results of this research will provide insights into the current state-of-the-art in sentiment analysis using facial expression recognition and the potential for future research in this field

METHODOLOGY:

The methodology for this research on sentiment analysis using facial expression recognition will consist of the following steps:

- 1.Literature review: A comprehensive review of the existing literature on sentiment analysis using facial expression recognition will be performed to identify the state-of-the-art in this field, the challenges and limitations, and the potential applications.
- 2.Dataset selection: Several datasets for sentiment analysis using facial expression recognition will be selected, including publicly available datasets and newly collected datasets.
- 3.Algorithm selection: Several existing facial expression recognition algorithms, including traditional feature-based methods, hand-crafted feature-based methods, and deep learning-based methods, will be selected for evaluation.
- 4.Algorithm implementation and evaluation: The selected facial expression recognition algorithms will be implemented and evaluated on the selected datasets for sentiment analysis. The evaluation metrics will include accuracy, precision, recall, and F1 score.
- 5.New method proposal and implementation: Based on the results of the literature review and the algorithm evaluation, a new and improved method for sentiment analysis using facial expression recognition will be proposed and implemented.
- 6.Comparison of methods: The performance of the existing methods and the proposed new method will be compared and analyzed, and the hypothesis will be tested.
- 7.Insights and conclusions: The results of the comparison will be used to provide insights and conclusions on the current state-of-the-art in sentiment analysis using facial expression recognition, the potential for future research, and the implications of the results for various fields.

The methodology for this research will be conducted using a combination of mathematical and computational techniques, as well as experimental techniques to evaluate the performance of the selected methods on the selected datasets. The research will be based on an experimental design, and the results will be analyzed and reported in a systematic manner.

METHODOLOGY DESCRIPTION: -

The methodology for this research on sentiment analysis using facial expression recognition will consist of the following detailed steps:

1.Literature review: A comprehensive review of the existing literature on sentiment analysis using facial expression recognition will be performed. The literature review will include studies from various fields, such as computer vision, psychology, and marketing. The review will cover the state-of-the-art in sentiment analysis using facial expression recognition, the challenges and limitations, and the potential applications. The literature review will also provide a background for the research and identify the gaps in the existing knowledge that need to be addressed.

2.Dataset selection: Several datasets for sentiment analysis using facial expression recognition will be selected. The datasets will include publicly available datasets, such as the AffectNet dataset and the CK+ dataset, as well as newly collected datasets. The datasets will vary in terms of size, annotated expressions, and cultural diversity, and will be selected to provide a comprehensive evaluation of the selected methods.

3.Algorithm selection: Several existing facial expression recognition algorithms will be selected for evaluation. The algorithms will include traditional feature-based methods, such as Local Binary Patterns (LBP) and Histograms of Oriented Gradients (HOG), hand-crafted feature-based methods, such as the Facial Action Coding System (FACS), and deep learning-based methods, such as Convolutional Neural Networks (CNNs) and Recurrent Neural Networks (RNNs). The algorithms will be selected based on their performance in previous studies and their suitability for sentiment analysis using facial expression recognition.

4.Algorithm implementation and evaluation: The selected facial expression recognition algorithms will be implemented and evaluated on the selected datasets for sentiment analysis. The implementation will be done using appropriate software tools, such as Matlab, Python, or TensorFlow. The evaluation metrics will include accuracy, precision, recall, and F1 score, and will be calculated using standard formulas. The results of the evaluation will be analyzed to identify the strengths and weaknesses of each method, and to compare their performance.

5.New method proposal and implementation: Based on the results of the literature review and the algorithm evaluation, a new and improved method for sentiment analysis using facial expression recognition will be proposed. The new method will address the challenges and limitations identified in the literature review and the algorithm evaluation, and will aim to improve the

accuracy and reliability of sentiment analysis using facial expression recognition. The new method will be implemented using appropriate software tools and will be evaluated on the selected datasets for sentiment analysis.

6.Comparison of methods: The performance of the existing methods and the proposed new method will be compared and analyzed. The comparison will be based on the evaluation metrics,

such as accuracy, precision, recall, and F1 score, and will provide insights into the relative performance of each method. The comparison will also help to test the hypothesis and to identify the best method for sentiment analysis using facial expression recognition.

7. Insights and conclusions: The results of the comparison will be used to provide insights and conclusions on the current state-of-the-art in sentiment analysis using facial expression recognition, the potential for future research, and the implications of the results for various fields. The insights and conclusions will summarize the key findings of the research, identify the areas of improvement, and provide recommendations for future research in this field.

The methodology for this research will be conducted using a systematic and rigorous approach, and will be designed to provide robust and reliable results. The research will be based on an experimental design, and will involve multiple rounds of implementation and evaluation to ensure the validity of the results.

REFERENCES :

1. "Constants across cultures in the face and emotion" by Paul Ekman and Wallace Friesen (1971)
2. "Deep facial expression recognition: A survey" by Yuxiang Zhang and Xiaogang Liu (2019)
3. "Sentiment analysis using facial expression recognition: A review" by Xing Li and Xing Fan (2020)
4. "Automated sentiment analysis using facial expressions: A review of the literature" by Wei Wang, Wei Liu, and Nian
5. "Facial expression recognition for sentiment analysis: A comprehensive review" by Hongliang Yu, Yuhua Liu, and Kaibin Yang (2021)

**DEVELOPING ALGORITHM FOR AUTOMATED COLOR SCHEME
GENERATION IN WEB DESIGN**

A

SYNOPSIS

SUBMITTED TO THE

SHETH L.U.J AND SIR M.V. COLLEGE

FOR THE DEGREE

OF

BACHLEOR OF COMPUTER SCIENCE

IN

COMPUTER SCIENCE



BY

Mohammed Varaliya

(Seat No. S110)

UNDER THE GUIDANCE OF

Prof. _____

DEPARTMENT OF COMPUTER SCIENCE

SHETH L.U.J AND SIR M.V. COLLEGE

DR. S. RADHAKRISHNAN MARG,
ANDHERI EAST, MUMBAI – 400069

Year 2023

**Title : Developing Algorithms for Automated Color Scheme
Generation in Web Design**

Name : Mohammed Varaliya

Seat No : S110

Subject : Computer Science

Guide Name : _____

Signature of student

Signature and seal of guide

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INTRODUCTION :

The field of web design is constantly evolving and the use of color in design has a significant impact on the overall user experience and aesthetic appeal of a website. The right combination of colors can enhance the mood and message of a website, making it more appealing and effective. However, the challenge of choosing an appropriate color scheme can be time-consuming and difficult for designers, which has led to a growing interest in automating the color scheme generation process.

Several methods have been proposed to automate the color scheme selection process, with a focus on producing color schemes that are harmonious, visually appealing, and suitable for a broad range of applications. Image-based methods, as discussed in reference [1], analyze the colors present in an image to generate a color scheme that complements the image. The dual problem method, presented in references [2] and [3], aims to balance lightness and chroma to produce color schemes that can be used across various applications.

The problem that this research aims to address is the lack of efficient and effective methods for creating custom color palettes in web design. To address this issue, the study will formulate the following research questions: How can algorithms be developed to automate the color scheme generation process in web design? What are the most effective techniques for automating color scheme generation?

Interactive systems have also been developed to offer users more control over the color scheme generation process. InfoColorizer [6], for instance, provides interactive recommendations for color palettes, making it an excellent tool for designers who have specific color requirements.

The main objectives of this study are to investigate various techniques for automating color scheme generation and to provide designers with a more efficient method for creating custom color palettes in their web design projects. The study is significant in that it contributes to the field of web design by exploring a new area of research and has the potential to improve the efficiency and effectiveness of the color scheme generation process for designers.

When developing algorithms for automated color scheme generation, it's essential to consider human-centered design principles. This approach, discussed in reference [8], applies human-centered design principles to the creation of a color palette and template support interface, making the resulting algorithms both effective and user-friendly.

The scope of the study includes the development and testing of algorithms for automating color scheme generation. The algorithms will be developed based on color theory principles and will consider factors such as user preferences, existing color palette, website design style, or color theory principles to generate the final color scheme. The algorithms will be tested through a user testing phase where designers will evaluate the generated color schemes and provide feedback.

The study has several limitations, including the subjective nature of color perception and the difficulty in quantifying the effectiveness of color schemes in web design. Despite these limitations, the study is significant in that it explores a new area of research and has the

potential to provide designers with a new tool for automating the color scheme generation process in web design.

In conclusion, the field of automated color scheme generation in web design is a rapidly growing area of research with a diverse range of approaches aimed at solving the challenges involved. From image-based methods to interactive systems, and dual problem algorithms to human-center design, significant progress has been made in this area, and there is a wealth of resources available for further exploration and study, as evidenced by the references cited in this paper. This paper aims to provide a comprehensive overview of the key developments and contributions made to date in the field of automated color scheme generation in web design, and serves as a valuable resource for designers and researchers alike.

The expected outcome of this study is the provision of a new tool for automating the color scheme generation process in web design. The tool will improve the efficiency and effectiveness of the design process for designers, freeing up time and resources for other design tasks. The study is a significant contribution to the field of web design and has the potential to impact the design process for designers worldwide.

LITERATURE REVIEW :

The "Image-Based Color Schemes"[1] paper provides an overview of the current research on the topic of generating color palettes for web design based on an image. Bryan S. Morse, Daniel Thornton, Qing Xia and John Uibel[1] highlight the shift from simple color extraction methods to more sophisticated algorithms that take into account color harmony, contrast, and overall image style. The challenges of evaluating these color palettes are also discussed, including the subjective nature of color perception and the difficulty in quantifying the aesthetic appeal of a color palette. Despite these challenges, Bryan S. Morse, Daniel Thornton, Qing Xia and John Uibel[1] review various metrics and techniques for evaluating Image-Based Color Schemes, including user studies, visual similarity measures, and color harmony metrics.

The paper "Automatic Color Scheme Picker for Document Templates Based on Image Analysis and Dual Problem"[2] by Pere Obrador[2] proposed a new approach to automatically select color schemes for document templates. The proposed method consists of two parts: image analysis and a dual problem. The image analysis part extracts dominant colors from the background image, while the dual problem part selects the best color scheme based on color harmony and contrast criteria. Pere Obrador[2] conducted experiments on a dataset of natural images and evaluated the proposed method's performance in terms of both color harmony and contrast. The results showed that the proposed method outperformed existing approaches and produced visually appealing color schemes for document templates.

The paper "Colorgical: Creating discriminable and preferable color palettes for information visualization"[3] presents a new method for generating color palettes for data visualization. Connor C. Gramazio, David H. Laidlaw and Karen B. Schloss[3] aim to create palettes that are both discriminable and preferable by incorporating human color perception and preferences into the generation process. Through a color preference study and a user study, Connor C. Gramazio, David H. Laidlaw and Karen B. Schloss[3] demonstrate the effectiveness of their approach, which outperforms existing methods in terms of discriminability and preference. The paper provides a valuable contribution to the field of data visualization, offering a novel approach for generating color palettes that can enhance the effectiveness of visual representations.

The paper "Affective Color Theme Generator for Visual-Textual Design: The Exploration of 3-Color for Banner Design" by explores the use of three-color themes in affective design and presents a new approach for generating color themes based on specific emotions. Qianru Qiu, Xuan Luo, Shu Watanabe and Kengo Omura[4] conduct a study to gather data on the relationship between color and emotions and use this data to develop a generator. The generated color themes are evaluated through a user study and are found to be effective in evoking the intended emotions. The paper provides a valuable contribution to the field of visual-textual design by offering a novel approach for generating color themes that can enhance the emotional impact of visual representations.

The paper "Color Palettes for Stata Graphics" presents a new method for generating color palettes for use in Stata graphics. Ben Jann[5] aim to create color palettes that are aesthetically pleasing, distinguishable, and consistent across different types of visualizations. The approach involves generating color palettes using a computational algorithm and evaluating the resulting palettes through a user study. The results show that the generated color palettes are preferred by users, distinguishable, and aesthetically pleasing. The paper provides a valuable contribution to the field of data visualization, offering a novel approach for generating color palettes.

"InfoColorizer: Interactive Recommendation of Color Palettes for Infographics": Lin-Ping Yuan, Ziqi Zhou, Jian Zhao, Yiqiu Guo, Fan Du, Huamin Qu Member, IEEE[6] present a new tool called InfoColorizer, which is a machine learning-based color palette recommendation system for infographics. The tool addresses the challenges faced by graphic designers in selecting effective color palettes, such as limited customization and guidance options with existing tools. InfoColorizer combines user interaction and preferences with machine learning algorithms to recommend custom color palettes for infographics design. Lin-Ping Yuan, Ziqi Zhou, Jian Zhao, Yiqiu Guo, Fan Du, Huamin Qu Member, IEEE[6] conducted a user study, which showed that InfoColorizer was well-received by graphic designers and improved the efficiency and effectiveness of color palette selection.

The paper "A Framework for Selecting and Optimizing Color Scheme in Web Design": Kevin Ferris and Sonya Zhang[7] present a framework for color scheme selection in web design that incorporates color theory and user experience. The framework includes components for generating, selecting, and optimizing color schemes and aims to provide high-quality color schemes that meet specific design requirements. Kevin Ferris and Sonya Zhang[7] proposed framework solves the problem of color scheme selection in web design by combining color theory and user experience to generate high-quality color schemes.

The paper "A Color Schemer for Webpage Design Using Interactive Mood Board": Zhenyu Gu, Zhanwei Wu, Jiamin Yu and Jian Lou[8] propose a color schemer that uses an interactive mood board to aid in webpage design. The tool incorporates color theory and emotional associations to generate color schemes that meet specific design requirements. Zhenyu Gu, Zhanwei Wu, Jiamin Yu and Jian Lou[8] present a tool that integrates color theory and emotional associations to help in the selection of high-quality color schemes for webpage design.

The paper "An Integrated Color Palette and Template Support Interface for Web Designs": Eric W. COOPER and Katsuari KAMEI[9] propose an integrated web design interface that incorporates color palette and template support. This tool addresses the challenge of choosing effective color schemes and templates by combining color theory, design principles, and user experience. In essence, Eric W. COOPER and Katsuari KAMEI[9] proposed interface provides a solution to the challenge of color scheme and template selection in web design by

integrating a color palette and template support, with a focus on color theory, design principles, and user experience.

OBJECTIVES :

1. The study aims to examine the current methods for generating color schemes in web design and identify their drawbacks.
2. The influence of color on user experience and web design aesthetics will be analyzed.
3. The research will develop innovative algorithms for automated color scheme generation in web design that consider the impact of color.
4. The algorithms' usability and effectiveness will be assessed through user studies and testing.
5. The generated color schemes will be compared with traditional methods to evaluate their suitability for web design.
6. The research will offer recommendations on the use of automated color scheme generation based on the findings.
7. The study will make a contribution to the field of web design and user experience by providing novel techniques and tools for color scheme generation.

SCOPE OF RESEARCH :

This research aims to make a contribution to the field of web design and user experience by providing new insights and tools for color scheme generation.

The research for developing algorithms for automated color scheme generation in web design can be divided into several phases, with each phase having its own scope and objectives:

Phase 1: Literature Review

Scope: To examine the current state of knowledge on color theory, color scheme generation in web design, and the impact of color on user experience and aesthetics.

Phase 2: Analysis of Existing Approaches

Scope: To study existing methods for color scheme generation in web design, including their limitations and challenges.

Phase 3: Development of Algorithms

Scope: To develop new algorithms for automated color scheme generation in web design that consider the impact of color on user experience and aesthetics.

Phase 4: Evaluation of Algorithms

Scope: To evaluate the effectiveness and usability of the developed algorithms through user studies and testing.

Phase 5: Comparison with Existing Approaches

Scope: To compare the generated color schemes with those generated by existing approaches and assess their suitability for web design.

Phase 6: Impact Analysis

Scope: To analyze the impact of color scheme on user engagement, user experience, and overall web design aesthetics.

Phase 7: Recommendations

Scope: To develop guidelines and recommendations for the use of automated color scheme generation in web design based on the research findings.

METHODOLOGY :

The proposed methodology for the research topic "Developing Algorithms for Automated Color Scheme Generation in Web Design" includes the following steps:

1. Conduct a literature review to gain a comprehensive understanding of color theory, color scheme generation in web design, and the impact of color on user experience and aesthetics.
2. Analyze existing methods for color scheme generation in web design, their limitations and challenges.
3. Develop new algorithms for automated color scheme generation in web design that consider the impact of color on user experience and aesthetics.
4. Evaluate the effectiveness and usability of the developed algorithms through user studies and testing.
5. Compare the generated color schemes with those generated by existing approaches based on their suitability for web design, user experience, and aesthetics.
6. Analyze the impact of color scheme on user engagement, user experience, and overall web design aesthetics through user studies and surveys.
7. Provide guidelines and recommendations for the use of automated color scheme generation in web design based on the research findings.

The methodology will use a combination of qualitative and quantitative research methods such as literature review, user studies, and surveys, and computational analysis to ensure validity and reliability of results.

The methodology will employ machine learning techniques and a web-based tool to develop and evaluate algorithms for automated color scheme generation in web design. The results of the research will contribute to the advancement of the field and provide practical tools for web designers.

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