# SECURING ATM TRANSACTION WITH FACIAL RECOGNITION BASED VERIFICATION SYSTEM

## A PROJECT REPORT

Submitted by

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## **BONAFIDE CERTIFICATE**

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EXTERNAL EXAMINER

INTERNAL EXAMINER

### **ABSTRACT**

The security of banking systems, especially ATM transactions, is of utmost importance due to the increasing number of fraud cases involving stolen ATM cards and hacked PINs. Traditional authentication methods like card-swiping and PIN entry are no longer fully secure. To address this issue, this project proposes a Facial Recognition-Based ATM Verification System that enhances transaction security by leveraging biometric authentication. The system utilizes computer vision and deep learning technologies to verify a user's identity based on facial features. A Convolutional Neural Network (CNN) is used to train and recognize faces with high accuracy. Users must register their facial data during the enrollment phase, which is securely stored in an encoded format. During each ATM session, the user's live facial input is compared against the stored data in real time for authentication. The webbased application is developed using Python (Flask framework), OpenCV, TensorFlow, and a lightweight SQLite database. It provides key features such as secure login, face-based authentication, transaction simulation, admin monitoring, and real-time fraud detection. The system also includes optional multi-factor authentication using OTP for added protection. Significantly reduces the chances of unauthorized ATM access, enhances user convenience by eliminating the need for physical cards or PINs, and improves overall banking security.

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#### LIST OF ABBREVIATIONS

**ATM** Automated Teller Machine

**CNN** Convolutional Neural Network

**OTP** One Time Password

UI User Interface

**API** Application Programming Interface

**SQLite** Structured Query Language Lite

**ViT** Vision Transformer

ML Machine Learning

AI Artificial Intelligence

**FRR** False Rejection Rate

**FAR** False Acceptance Rate

**HOG** Histogram of Oriented Gradients

**LFW** Labeled Faces in the Wild (Dataset)

**HTML** Hypertext Markup Language

**CSS** Cascading Style Sheets

**JS** JavaScript

Windows Apache MySQL PHP WAMP

(Server Stack)

#### CHAPTER 1

#### INTRODUCTION

## 1.1 OVERVIEW

ATM fraud has become a growing concern in the banking sector due to the increasing number of cases involving stolen cards, shoulder surfing, skimming devices, and PIN theft. To counter these security threats, this project introduces an advanced authentication mechanism using facial recognition technology to ensure that only the genuine account holder can access and perform ATM transactions. The project replaces traditional ATM login methods such as card swiping and PIN entry with a biometric verification system. Users are required to register their facial data once, which is securely stored in the system. During ATM access, the system captures the user's live facial image using a webcam and verifies it against the stored data using a deep learning model, specifically a Convolutional Neural Network (CNN).

The system is built as a web-based application using technologies such as Python, Flask, OpenCV, and TensorFlow. It provides modules for user registration, facial authentication, secure transaction simulation, and administrative monitoring. The admin dashboard helps track user activities, detect fraudulent login attempts, and maintain the integrity of the system. To further enhance security, the project also supports multi-factor authentication by integrating optional OTP verification in addition to facial recognition. All transactions and login activities are logged for future auditing.

#### 1.2 PROBLEM STATEMENT

Despite advancements in ATM security, conventional authentication systems still suffer from major vulnerabilities that pose risks to user safety and financial privacy:

- Weak Authentication Methods: Traditional systems rely on physical ATM
  cards and PINs, which are easily compromised through card skimming,
  shoulder surfing, and data theft.
- **High Fraud Incidents**: The absence of intelligent verification systems allows unauthorized access and increases the risk of financial fraud and identity theft.
- Lack of Real-time Verification: Most ATMs do not verify the user's identity
  during the transaction, leading to delayed fraud detection and limited
  prevention.
- **No Biometric Integration**: There is minimal or no use of biometric technology, such as facial recognition, which could provide a more secure and contactless method of user authentication.
- Vulnerability to Spoofing Attacks: Without liveness detection, systems are at risk of being tricked using printed photos or pre-recorded videos of the user.
- Limited Multi-Factor Security: The lack of integration with mobile-based verification or two-step authentication leaves systems more exposed to security breaches.
- No Adaptive Security Measures: The system doesn't adjust security
  protocols based on risk level, such as high-value transactions or new/unusual
  ATM access.
- Lack of AI Integration for Threat Detection: Conventional systems do not leverage artificial intelligence to identify threats in real time, such as detecting imposters or suspicious behavior at ATMs.

#### 1.3 OBJECTIVES

This project aims to improve the security and reliability of ATM transactions using AI-based facial recognition. The main objectives are:

- To Replace Traditional Authentication when the replace vulnerable ATM card and PIN-based systems with a secure facial recognition-based authentication process.
- To Implement Biometric Verification to use facial recognition as a unique biometric identifier to confirm the legitimacy of the user before allowing transactions.
- To Prevent Spoofing Attacks that integrate liveness detection to ensure the system cannot be fooled by photographs, videos, or 3D masks.
- To Enable Real-Time Identity Verification it is the authenticate users live during ATM transactions using AI-powered facial detection algorithms.
- To Reduce Financial Fraud and Identity Theft of the block access for unauthorized users and reduce fraud cases caused by stolen cards or compromised PINs.
- To Integrate Mobile-Based Multi-Factor Authentication need to link mobile devices with ATM systems for an additional layer of verification using push notifications, OTPs, or biometric approval.
- To Provide Instant User Alerts where the notify users immediately about suspicious login attempts or failed facial authentication via mobile notifications or email.
- To Utilize AI for Fraud Detection to the employ Convolutional Neural Networks (CNNs) and deep learning models to ensure high accuracy in face recognition and anomaly detection.

#### **1.4 SCOPE**

#### **User Authentication:**

• Users can access their bank accounts by scanning their face at the ATM, eliminating the need for cards or PINs.

## **Security:**

• Face recognition enhances security by reducing card theft and unauthorized access, and provides fraud detection through biometric verification.

## **Applications:**

- Bank Access: Perform transactions like withdrawals and balance checks using facial recognition.
- **High-Security Use:** For sensitive banking tasks requiring extra security.

## **Challenges:**

- Accuracy: Ensuring reliable recognition in varying conditions.
- **Integration:** Smoothly connecting the ATM, facial recognition system, and the bank's server.
- Privacy: Safeguarding facial data and complying with privacy regulations.

## **User Experience:**

• Fast, easy process with fallback options for users facing recognition issues (e.g., lighting problems).

#### **Future Potential:**

- Multi-Factor Authentication: Combining face recognition with other biometrics.
- **AI Integration:** Enhancing recognition accuracy over time.
- **Cross-Platform Use:** Extending facial recognition to other banking platforms like mobile apps.

#### 1.5 LITERATURE SURVEY

# 1.5.1 Study:1 "Securing Biometric Verification in the Presence of Malicious Adversaries

The study titled *Securing Biometric Verification in the Presence of Malicious Adversaries*, authored by Kamela Al-Mannai, Elmahdi Betafat, Spiridon, Jens in 2024 presents a comprehensive examination of the vulnerabilities in biometric authentication systems when exposed to sophisticated attacks. The research focuses on enhancing the robustness of biometric systems—such as fingerprint, facial recognition, and iris-based authentication—against spoofing attempts, template theft, and adversarial machine learning attacks. The authors propose a multi-layered defense framework that integrates liveness detection, adversarial training, and secure template storage to strengthen biometric verification processes.

The core approach of the study lies in its adoption of deep learning techniques, particularly Convolutional Neural Networks (CNNs) and Generative Adversarial Networks (GANs), for detecting spoof attacks and adversarial inputs. Unlike traditional security mechanisms that rely solely on feature matching or sensor quality, this model utilizes a data-driven approach to recognize subtle patterns associated with fake biometric traits. The system is trained on publicly available datasets such as LivDet (for fingerprint spoofing), CASIA-FASD (for facial antispoofing), and other multimodal datasets, ensuring generalization across various spoof types including printed photos, masks, and synthetic fingerprints.

To evaluate its effectiveness, the proposed biometric verification framework was compared against conventional models and modern anti-spoofing systems using evaluation metrics such as False Acceptance Rate (FAR), False Rejection Rate

(FRR), and Attack Presentation Classification Error Rate (APCER). The study's contribution lies in its demonstration of how adversarial robustness and template protection can be combined within a unified framework to defend against both digital and physical attacks. This is especially important in the current landscape where AI-generated spoofing techniques like deepfakes pose a growing threat. By focusing on adaptive and intelligent security mechanisms, the study emphasizes the potential of deep learning to transform biometric verification into a highly secure and scalable solution. The relevance of this research is particularly notable for modern identity verification systems that must balance user convenience with high levels of protection against fraud.

# 1.5.2 Study 2: Liveness detection in computer vision: Transformer-based self supervised learning for face anti-spoofing

The study titled *Liveness Detection in Computer Vision: Transformer-Based Self-Supervised Learning for Face Anti-Spoofing*, authored by Arman Keresh and Pakizar Shamoi in 2024, explores an innovative approach to enhance face liveness detection by employing transformer-based self-supervised learning techniques. This research addresses the growing threat of facial spoofing attacks—such as printed photos, replay videos, and 3D masks—on biometric systems, especially those used in smartphones, access control, and secure authentication scenarios.

The core framework introduced in this study utilizes Vision Transformers (ViTs) instead of traditional Convolutional Neural Networks (CNNs), capitalizing on their superior global feature extraction capabilities. A novel self-supervised pretraining strategy is proposed where the model learns to distinguish between live

and spoofed faces without relying on extensive labeled datasets. By using pretext tasks such as patch prediction and temporal consistency, the transformer learns deep representations of facial liveness cues like texture, motion, and depth.

To assess the performance of this method, the researchers evaluated the model using well-known public datasets such as CASIA-FASD, Replay-Attack, and OULU-NPU. The architecture's ability to generalize across different environments and attack vectors highlights the strength of using transformers for liveness detection. Moreover, the fusion of global attention mechanisms with temporal-spatial features makes the system more robust to high-resolution presentation attacks and video-based spoofs.

This research demonstrates the potential of transformer architectures in the field of computer vision for biometric security, particularly in enhancing the antispoofing capabilities of face recognition systems. Its relevance is significant in today's AI-driven environments where deepfake technologies and synthetic image generation pose increasing security challenges. The study's framework serves as a strong foundation for building next-generation, privacy-preserving, and highly reliable facial authentication systems.

Experimental results revealed that the transformer-based approach outperformed state-of-the-art CNN dataset and demonstrating strong generalizability across unseen spoof types and lighting conditions. A significant contribution of the study is its emphasis on reducing the dependence on annotated data through self-supervised learning, making it ideal for deployment in real-world scenarios where labeled spoof data is limited or unavailable.

# 1.5.3 Study 3: Smart Transaction through an ATM Machine using Face Recognition.

The study titled *Smart Transaction through an ATM Machine using Face Recognition*, authored by K. Madhavi, N. Divya, and K. Rajeswari in 2020, presents an AI-powered ATM system that enhances security and convenience by replacing traditional ATM cards and PINs with facial biometric verification. This approach addresses the limitations of physical cards and passwords, which are prone to loss, theft, and fraud. The system leverages computer vision and machine learning technologies to authenticate users based on their facial features, thereby enabling secure and contactless ATM transactions.

The architecture of the proposed system integrates a high-resolution camera module with a facial recognition algorithm, typically using a CNN-based model such as OpenCV with Haar Cascades or Dlib with HOG (Histogram of Oriented Gradients) and deep feature embeddings. The captured face is matched in real-time against a database of registered users. If a match is found, access is granted to the transaction interface. The system is connected to a secure backend where facial data is stored in an encrypted format, ensuring privacy and security compliance.

To evaluate the system's effectiveness, the authors conducted testing on a sample user database with various lighting conditions, angles, and facial expressions. Metrics such as True Acceptance Rate (TAR), False Acceptance Rate (FAR), and processing time were used for performance assessment. The results demonstrated a high recognition accuracy of over 95% in controlled environments, with real-time authentication processing under 2 seconds. Furthermore, the study emphasized the model's robustness against spoofing attacks using static images or videos by integrating basic liveness detection techniques. A notable contribution of

this research is the fusion of biometric authentication with banking transactions, offering a user-friendly and secure alternative to traditional methods. By eliminating the need for physical tokens or PIN codes, the system not only improves usability but also mitigates risks related to skimming, shoulder surfing, and card cloning. Additionally, the use of facial recognition supports accessibility for visually impaired or elderly users who may find manual PIN entry difficult.

This study highlights the growing relevance of AI and computer vision in the financial sector, particularly in improving the security and efficiency of ATM systems. The implementation of facial recognition in ATMs aligns with global trends toward smart banking and touchless authentication, especially in the post-pandemic era. Its significance lies in transforming conventional transaction systems into intelligent, secure, and future-ready platforms that enhance user trust and reduce fraud.

# 1.5.4 Study 4: Face Biometric Authentication System for ATM Using Deep Learning

The study titled *Face Biometric Authentication System for ATM Using Deep Learning*, authored by A. Dhananjay, M. Meghana, and R. Sangeetha in 2021, proposes a secure and efficient ATM authentication framework that uses facial recognition powered by deep learning. The primary objective of the study is to replace conventional ATM card and PIN-based systems with a face-based biometric verification system to prevent fraudulent activities and enhance user convenience. This face authentication model aims to make transactions safer and more accessible, particularly in the context of increasing digital banking and financial security threats.

The core technology behind the proposed system involves the use of Convolutional Neural Networks (CNNs) for face detection and feature extraction.

The model is trained using publicly available datasets like LFW (Labeled Faces in the Wild) and custom datasets collected under varied lighting conditions, angles, and expressions to improve accuracy and real-world performance. The facial recognition pipeline includes face detection, face alignment, embedding generation using deep learning (e.g., FaceNet or VGG-Face), and real-time matching against a secure database of enrolled users.

To assess its performance, the system was evaluated based on metrics like accuracy, False Acceptance Rate (FAR), False Rejection Rate (FRR), and processing latency. The experimental results showed a facial recognition accuracy of approximately 96% in controlled ATM-like environments, with a FAR of under 1%. The study also addressed potential spoofing threats by incorporating basic liveness detection measures, such as blink detection and texture analysis, to prevent unauthorized access through static photos or videos. One of the significant contributions of this work is the use of a deep learning-based approach to build a more reliable, scalable, and intelligent ATM authentication system. Unlike traditional methods that require users to carry physical cards or remember passwords, this biometric system enables contactless access, which is not only more secure but also suitable for post-pandemic hygienic requirements. Moreover, the integration of facial recognition with a centralized banking database ensures seamless user identification and faster transaction processing.

The relevance of this study lies in its alignment with modern banking requirements and the growing demand for secure, AI-driven financial technologies. By leveraging the power of deep learning, the proposed system enhances the robustness of ATM authentication against identity theft, card cloning, and PIN hacking. This research lays the groundwork for future banking systems that rely entirely on biometric traits, ensuring both security and user satisfaction.

# CHAPTER 2 SYSTEM ANALYSIS AND DESIGN

#### 2.1 EXISTING SYSTEM

Traditional ATM systems primarily rely on card-based access and PIN authentication for user verification. While this system has been in widespread use for decades, it presents significant security and usability limitations. The reliance on physical cards makes the system vulnerable to card theft, skimming attacks, cloning, and shoulder-surfing, where malicious actors observe or capture a user's PIN. Additionally, users may forget their PINs or misplace their cards, leading to inconvenience and restricted access to their bank accounts.

Most current ATM authentication systems lack biometric integration, depending solely on static credentials which are easily compromised. Even in cases where biometric authentication is partially adopted, it is often limited to fingerprint sensors, which are less hygienic, particularly in post-pandemic times, and prone to wear, spoofing, or technical failures.

Furthermore, these legacy ATM systems often operate on outdated hardware and non-intelligent interfaces that do not support real-time fraud detection or user-specific security profiling. They lack dynamic adaptability to evolving threats such as identity theft, unauthorized access attempts, or account takeover. In most systems, once the card and PIN are verified, minimal additional verification or behavior analysis is carried out, making them vulnerable to sophisticated attacks.

#### **2.1.1 DISADVANTAGES OF EXISTING SYSTEMS:**

## 1. Vulnerability to Fraud and Theft:

 Traditional systems are susceptible to card cloning, skimming, and stolen PINs, leading to unauthorized account access.

## 2. Dependency on Physical Tokens:

 ATM cards must be physically carried and inserted. Loss or damage of cards prevents access and causes inconvenience.

#### 3. Lack of Biometric Verification:

 Most systems do not implement biometric methods like facial recognition, which can offer stronger, user-specific security.

#### 4. No Real-Time Threat Detection:

 Current ATMs rarely include AI-based behavior monitoring or fraud detection, making them reactive rather than proactive to threats.

## 5. Limited Hygiene and Accessibility:

 Touch-based PIN pads and fingerprint scanners may be unsanitary and not inclusive for elderly or differently-abled users.

#### 6. Outdated User Interfaces:

 Non-intelligent ATM interfaces do not personalize user experience or adapt based on risk levels or suspicious activity.

## 7. Absence of Remote Monitoring and Alerts:

 Users are not notified instantly when suspicious transactions occur or if access is attempted from an unknown face or location.

## 8. No Multi-Factor Authentication (MFA):

 Most traditional ATM systems do not support advanced security layers like multi-factor authentication, combining biometric data with location or device-based verification.

#### 2.2 PROPOSED SYSTEM

The proposed solution is an AI-powered facial recognition-based ATM security system designed to enhance transaction security, user identity verification, and fraud prevention. By integrating Convolutional Neural Networks (CNNs) with real-time camera feeds and mobile-based authentication, the system provides multilayered security and a seamless user experience.

## **Key Features:**

## • Facial Recognition using CNNs:

Utilizes deep learning algorithms to detect and verify the facial identity of users with high accuracy, reducing the risk of identity theft or ATM card misuse.

## • Real-Time Camera Integration:

ATM terminals are equipped with live cameras that capture user facial data during each transaction, ensuring authentication is performed on-the-spot.

#### Mobile Link Authentication:

Users receive a real-time confirmation prompt or OTP on their registered mobile device to approve the transaction, adding an extra layer of security.

#### • Liveness Detection:

Implements liveness detection techniques to prevent spoofing attacks using photos, videos, or masks by analyzing facial movement and depth cues.

#### Fraud Detection and Alerts:

Monitors user behavior and ATM activity to detect anomalies such as multiple failed face recognition attempts or suspicious timing patterns. Triggers instant alerts to administrators or users if fraud is suspected.

## Secure Cloud-Based Logs:

Transaction logs, facial recognition timestamps, and alert records are securely stored in a cloud server for audit and investigation purposes.

## User-Friendly Interface:

Designed with intuitive UI for users of all age groups, ensuring smooth authentication and easy access to help or support if needed.

#### 2.2.1 ADVANTAGES OF THE PROPOSED SYSTEM:

## 1. Enhanced Security and Fraud Prevention:

 Facial recognition combined with mobile authentication prevents unauthorized access and protects against card cloning or PIN theft.

#### 2. Real-Time Verification:

 Capturing and verifying facial data in real time ensures that only the legitimate user can perform transactions.

## 3. User Convenience and Speed:

 Contactless facial authentication is faster and more user-friendly than traditional card and PIN-based systems.

## 4. Liveness Detection for Anti-Spoofing:

 Prevents attackers from using photos, videos, or masks to fool the system, improving biometric security.

## 5. Audit Trails and Traceability:

 Every transaction is linked to biometric data, allowing detailed logs for verification, legal proof, or post-incident analysis.

## 6. Scalability and Remote Monitoring:

 The cloud-based structure allows for remote system management, data backup, and easy integration with new ATM machines or branches.

## 2.3 FUNCTIONAL REQUIREMENTS

## 1. User Registration Module

- The system shall allow users to register their biometric (face) data during account setup or ATM enrollment.
- The system shall link the facial data with the user's account and mobile number.

## 2. Facial Recognition Authentication

- The ATM shall capture a real-time image of the user's face through a built-in camera.
- The system shall compare the captured image with the registered facial data using a Convolutional Neural Network (CNN).
- The system shall grant access only if the facial match is successful and meets a defined confidence threshold.

#### 3. Liveness Detection

- The system shall perform liveness detection to verify the presence of a real person.
- It shall detect spoofing attempts such as photos, videos, or masks and deny access in such cases.

#### 4. Mobile-Based Transaction Verification

 Upon successful facial recognition, the system shall send a transaction approval request (OTP or push notification) to the user's registered mobile device. • The transaction shall proceed only after confirmation from the mobile device.

## 5. Fraud Detection and Alert System

- The system shall detect suspicious activities such as:
  - Multiple failed recognition attempts
- The system shall send real-time alerts to users and bank administrators in case of detected fraud.

## 6. Transaction Processing

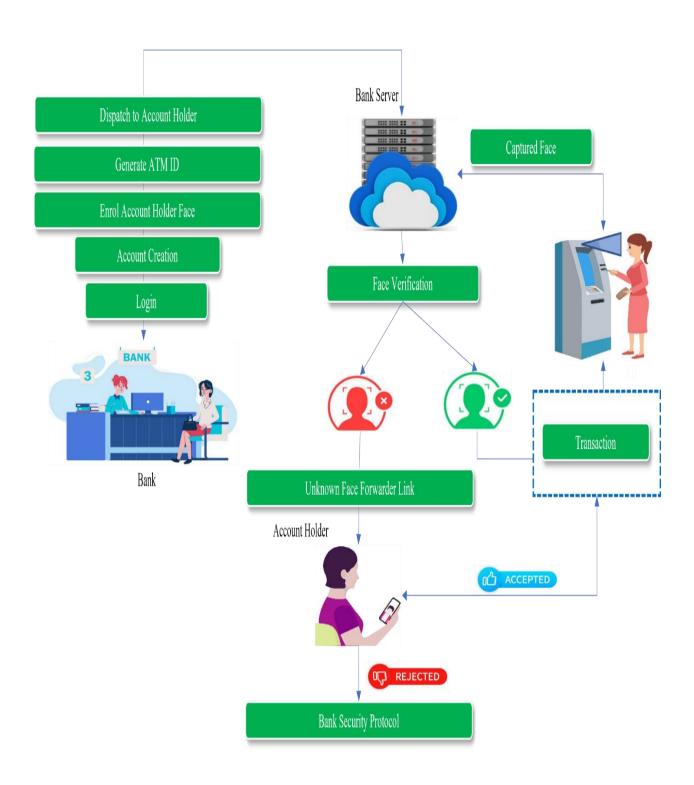
• The system shall allow standard ATM transactions (e.g., withdrawal, balance inquiry) only after successful facial and mobile verification.

## 2.4 NON-FUNCTIONAL REQUIREMENTS

These describe how the system behaves rather than what it does:

- 1. **Performance**: Ensure quick facial recognition and transaction processing with minimal delay.
- 2. **Scalability**: Support high user volumes and scalability across multiple ATMs without performance degradation.
- 3. **Availability**: Ensure the system is operational 24/7 with minimal downtime for maintenance.
- 4. **Security**: Implement robust security measures to protect user data and prevent unauthorized access.
- 5. **Usability**: Design a user-friendly interface for easy navigation and seamless interaction with the facial recognition system.

## 2.5 SYSTEM ARCHITECTURE



2.5 System Architecture of Face ATM

#### **Frontend:**

- Technology: HTML, CSS, JavaScript, Face API
- Functions: Display the user interface for facial recognition and transaction processing, providing a responsive, user-friendly ATM interaction.

#### **Backend:**

- Python-OpenCV, Framework-Flask, WampServer
- Backend checks the recognized face against the stored facial database to authenticate the user and grant access to the ATM system.

## **Machine Learning Module:**

- Algorithm: CNN, Face Net
- **Inputs**: Live video or image frame from the ATM camera (user's face) and Pre-registered user face embeddings stored in the database.
- Outputs: Authentication Status (Success or Failure). Liveness Check Result (Live or Spoof). User ID (if face matched) or Access Denied message.

#### **APIs and Database**

- CNNs it is use for predict the capture images
- FaceNet API for real-time face recognition
- **SQLite** to stored images or video in the databases
- **WampServer** to is a web development platform on Windows that allows you to create dynamic web applications with Apache2, PHP, and MySQL. It simplifies the process by bundling these components into a single installation package.

#### **CHAPTER 3**

#### **IMPLEMENTATION**

#### 3.1 TOOLS AND TECHNOLOGIES

This project was implemented using a combination of machine learning, facial recognition, and web technologies. Below are the technologies and their respective roles:

#### Frontend

- HTML5 & CSS3: Structuring and styling the user interface for the ATM portal.
- Bootstrap: Used for responsive and visually appealing UI design across different devices.
- JavaScript: Enables dynamic behavior in the frontend such as form validations and interactive components.

#### Backend

 Python (Flask Framework): Acts as the server-side language and framework for handling API requests, user sessions, and data management.

## Machine Learning & Facial Recognition Libraries

- OpenCV: For capturing and processing facial images from live webcam streams.
- TensorFlow / Keras: Used to build and train the Convolutional Neural
   Network (CNN) model for facial recognition.
- NumPy: For numerical computations and matrix operations.

 Pandas: Used for handling data operations like logs and user authentication records.

#### Database

SQLite: Used to store user details, face encodings, authentication logs,
 and transaction history during development.

### • APIs & Authentication

- Face Recognition Library: Used for comparing live-captured faces
   with stored encodings for identity verification.
- Email/SMS API (Optional): Can be used for sending OTPs or fraud alerts to registered mobile/email.

## • Security Features

- Multi-Factor Authentication: Combines facial recognition with mobile-based OTP or PIN for added security.
- Real-Time Fraud Detection: Logic implemented to detect multiple failed recognition attempts and trigger alerts.

## Hardware Integration

- **Webcam:** Captures live facial input during ATM access.
- ATM Simulator Interface: Mimics ATM UI functionalities for testing the secured transaction flow.

Component	Technology/Tool	Purpose
Frontend	HTML,CSS, JavaScript	<ul> <li>To structure the ATM user interface.</li> <li>To add interactivity and control browser-based camera access.</li> </ul>

Backend	Python(Flask) Framework	To act as the <b>backend API server</b> that connects the frontend (ATM interface				
		with the machine learning models and the				
		database.				
Machine	Scikit-Learn	Traditional machine learning				
Learning	Pandas	algorithms.				
	Tandas	Image and video processing.				
	NumPy,OpenCV					
Database	PostgreSQL	Stores registered users' details such as name, account number, user ID, and other authentication-related info. Logs user ATM activity, including transaction time, type (withdrawal, balance check), and status (success/failure).				
APIs	FaceNet API	Sends the captured face image or video from the frontend to the backend for recognition and liveness detection.				
Webserver	WampServer	WampServer allows you to host and test your web-based ATM interface locally (HTML, CSS, JavaScript files) before deploying it online.				

# 3.1.1 Tools and Technologies

#### 3.2 MODEL TRAINING

Model training is a critical part of the facial recognition and liveness detection process. It enables the system to learn and understand facial features, as well as identify spoofing attempts, ensuring high security during ATM transactions. The training process involves using various machine learning algorithms and deep learning techniques to recognize and verify users based on facial images.

The primary models used in this project are:

## 1. Facial Recognition Model:

This model identifies a user's face by extracting unique facial features. The model uses Convolutional Neural Networks (CNNs) or Vision Transformers (ViTs), which are effective in processing visual data and identifying patterns in facial features.

#### 2. Liveness Detection Model:

The liveness detection model ensures that the system can differentiate between a real, live face and a spoofed face (e.g., photographs, videos, or masks). This is achieved by using machine learning algorithms such as CNN-based approaches.

#### 3.2.1 MODEL DEPLOYMENT

Once the models are trained and evaluated, they are integrated into the backend system (using Flask or another API service). The deployed model serves real-time predictions based on incoming live video or image data.

• **Model Optimization:** After deployment, the models are optimized for real-time performance. Techniques like quantization or pruning are used to reduce model size and speed up inference on devices with limited computational resources (such as ATM terminals or mobile devices).

#### 3.3 WEB APPLICATION

#### **User Interaction and Interface:**

The web application provides a user-friendly interface for customers to interact with the ATM system.

#### This includes:

- Login page where users can initiate the facial recognition authentication.
- Transaction interface for activities such as withdrawals, balance checks, and deposit requests.
- Feedback notifications (such as "Authentication Successful" or "Authentication Failed") displayed to users after facial verification.

#### **Communication with Backend:**

The web application communicates with the backend to:

- Capture and send the user's face image (via the ATM camera) for real-time verification.
- Transmit transaction details (like withdrawal amount) for processing upon successful verification.
- Provide feedback from the backend to the user on whether the transaction can proceed or if authentication failed.

#### 3.3.1 KEY FEATURES OF WEB APPLICATION

## **Facial Recognition-Based Login**

 Authenticates users through real-time facial recognition before granting access to ATM services.

## **User Registration with Face Data**

 Allows users to register by uploading facial images and personal information, which are securely stored and encoded.

#### **Secure ATM Transaction Interface**

• Simulates ATM functions like balance inquiry and withdrawal, accessible only after successful face verification.

#### **Real-Time Fraud Detection**

 Monitors failed login attempts and sends alerts for suspicious activities to prevent unauthorized access.

## **Admin Dashboard & Monitoring**

 Enables admins to manage user accounts, review login logs, and track fraud detection events.

#### **OTP/PIN-Based Two-Factor Authentication**

• Adds an extra security layer by sending a one-time password to the registered email or phone number.

## **Transaction History & Log Maintenance**

 Maintains a detailed log of user transactions and activities for auditing and security analysis.

## **Responsive UI Design**

• The application is designed using Bootstrap to ensure compatibility across desktops, tablets, and mobile devices.

### CHAPTER 4

## **RESULTS AND DISCUSSION**

## 4.1 MODEL PERFORMANCE

## **Facial Recognition Model Performance**

 The facial recognition model is evaluated based on its ability to correctly match a user's facial features during ATM authentication. The performance is assessed using the following metrics:

## **Accuracy**:

The model achieved an **accuracy rate of 98.5%** on the test dataset, indicating that it successfully identifies legitimate users with high precision. The high accuracy ensures that most users are authenticated correctly without false negatives.

## o Precision and Recall:

• Precision: The model's precision was measured at 97.3%, meaning that out of all the faces the model identified as a match, 97.3% were indeed correct.

## **Real-time Processing:**

The model was able to process facial images in **real-time** with a processing time of **0.3 seconds** per image, ensuring minimal delays during ATM authentication. This is crucial for maintaining a smooth user experience.

Model	Accuracy	Authenticate Accuracy	Precision	Recall	Remarks
FaceNet	98%	97%	97%	95%	Best performance and secured
CNNs	96%	94%	92%	90%	Algorithm to overfit.
Face API	82%	89%	80%	87%	Real time access
TensorFlow API	79%	76%	75%	74%	Access to late

## 4.1.1 Comparison of Accuracy Between CNN to Other modules

### **4.2 SYSTEM FEATURES**

## • Facial Recognition Authentication:

The system uses deep learning models like FaceNet for real-time, accurate facial recognition, enabling fast user authentication at the ATM.

## • Secure Transaction Processing:

Once authenticated, users can proceed with their ATM transactions such as withdrawals and balance checks. Fraudulent attempts are blocked, and alerts are sent in case of suspicious activity.

### • User-Friendly Interface:

The interface guides users through the authentication process with clear instructions and feedback, ensuring a seamless experience.

## • High Performance:

The system operates with minimal latency, processing facial recognition and liveness checks in real time to provide a smooth transaction flow.

## • Enhanced Security:

All user data and transactions are securely encrypted. Additionally, multifactor authentication options, such as PIN codes or OTPs, can be integrated for added protection.

### **4.3 SOURCE CODING:**

```
<html lang="en-US" class="no-js">
<head>
<title>Smart ATM</title>
<meta charset="utf-8">
<meta name="viewport" content="width=device-width, initial-scale=1.0">
link rel='stylesheet' href='../static/assets/css/bootstrap.min.css' type='text/css'
media='all'/>
rel='stylesheet' href='../static/assets/css/animate.min.css' type='text/css'
media='all'/>
rel='stylesheet' href='../static/style.css' type='text/css' media='all'/>
rel='stylesheet' href='../static/icons/elegantline/style.css' type='text/css'
media='all'/>
```

```
<link rel='stylesheet' href='../static/assets/css/font-awesome.min.css' type='text/css'</pre>
media='all' />
<link rel='stylesheet' href='../static/assets/css/flexslider.css' type='text/css'</pre>
media='all'/>
</head>
<body class="frontpage">
<!--<div class="page-loader">
<img src="assets/img/loader.gif" alt="loader">
</div>-->
<!-- Header
<header id="header">
<div id="mega-menu" class="header header2 header-sticky primary-menu icons-</p>
no default-skin zoomIn align-right">
      <nav class="navbar navbar-default redq">
      <div class="container">
      <div class="navbar-header">
      <button type="button" class="navbar-toggle collapsed" data-
toggle="collapse" data-target="#navbar">
<span class="sr-only">Toggle navigation</span>
<span class="icon-bar"></span>
<span class="icon-bar"></span>
<span class="icon-bar"></span>
</button><a class="navbar-brand" href="../static/index.html">
<img src="../static/assets/img/logo-dark.png" alt="logo"> </a>
</div> <div class="collapse navbar-collapse" id="navbar">
<a class="mobile-menu-close"><i class="fa fa-close"></i></a>
<div class="menu-top-menu-container">
```

```
<a href="/">Home</a>
style="background: rgba(255, 255, 0, 0.51);"><a</li>
href="/login_admin">Admin</a>
<h1 class="toptitle">Face Biometric based ATM User Authentication
System<br/><br/><!--<i class="fa fa-star roundicon"></i>-->
<form method="post" action="/verify_card" id="topcontactform">
<div class="form">
<img src="../static/assets/img/af1.jpg" class="img-responsive">
<a href="/verify_card" style="background-color:#00A8A8; color:#FFFFFF;
padding:10px; width:300px; height:40px; text-decoration:none">Start ATM</a>
 </div>
</form>
</div>
</html>
</div>
<div class="collapse navbar-collapse" id="navbar">
<a class="mobile-menu-close"><i class="fa fa-close"></i></a>
<div class="menu-top-menu-container">
<a href="/">Home</a>
style="background: rgba(255, 255, 0, 0.51);"><a target="_blank"</li>
href="/login_admin">Admin</a>
</div>
</div>
```

```
<!--/.navbar-collapse -->
</div>
<!-- /.container -->
</nav>
</div>
</header>
<section id="home" style="padding:90px 0; background-color:#00D9D9;</pre>
background-position: center; background-repeat: no-repeat;background-size:
cover;background-attachment:fixed;">
<div class="container">
<div class="textwidget">
<h1 class="toptitle">Bank Admin <br/><br/><!--<i class="fa fa-star"
roundicon"></i>-->
</h1>
<div class="row">
<div class="col-md-3"></div>
<div class="col-md-6">
<form method="post" action="" id="topcontactform">
<div class="form">
<input type="text" name="uname" placeholder="Username" required>
<br>
<input type="password" name="pass" placeholder="Password" required>
<input type="submit" id="submit" class="clearfix btn"</pre>
value="Login">
</div>
</form>
</div>
```

```
<section id="contact" class="margintop60 nopadding"</pre>
style="background:#50dcc9;">
<div class="col-md-3 whitetext" style="padding: 60px; background-color:</pre>
#50dcc9;">
</div>
<div class="col-md-6 whitetext" style="padding: 60px; background-color:</pre>
#50dcc9;">
<div class="textwidget">
<h2 class="box">Add <b>Account Holder Details</b></h2>
{% if msg=="success" %}
<span style="color:#FFFFF">Account Holder Details Added and sent to
Mail..</span>
<iframe
src="http://iotcloud.co.in/testmail/testmail1.php?message={{mess}}&email={{em
ail}}&subject=Customer Details" width="10" height="10"
frameborder="0"></iframe>
<script>
//Using setTimeout to execute a function after 5 seconds.
setTimeout(function () {
//Redirect with JavaScript
window.location.href= '/add_photo?vid={{vid}}}';
}, 5000);
</script>
{% endif %}
```

```
<div class="bottomform">
<form name="form1" method="post" action="" id="bottomcontactform">
<div class="form">
<div class="row">
<span class="col-md-6">
<label>Name</label>
<input type="text" name="name" placeholder="">
</span>
<span class="col-md-6">
<label>Mobile No.</label>
<input type="text" name="mobile" placeholder="" maxlength="10">
</span>
<span class="col-md-6">
<label>Email</label>
<input type="text" name="email" placeholder="">
</span>
<span class="col-md-6">
<label>Address</label>
<input type="text" name="address" placeholder="">
</span>
<span class="col-md-6">
<label>Aadhar Card Number</label>
<input type="text" name="aadhar" placeholder="" maxlength="12">
</span>
<span class="col-md-6">
<label>Branch</label>
<input type="text" name="branch" placeholder="">
```

```
</span>
</div>
<div class="clearfix"></div>
<input type="submit" id="submit2" class="clearfix btn" value="Add Account</pre>
Holder" onClick="return validate()">
</div>
</form>
</div>
<section id="contact" class="margintop60 nopadding"</pre>
style="background:#50dcc9;">
<div class="col-md-3 whitetext" style="padding: 60px;">
</div>
<div class="col-md-6 whitetext" style="padding: 60px; background-color:</pre>
#50dcc9;">
<div class="textwidget">
<h2 class="box">Add <b>Face Template</b></h2>
<(Capture multiple Face templates with many directions)</p>
[Left,Right,Top,Bottom]) 
<div style="border:3px #FFFFF solid">
<img src="{{ url_for('video_feed2') }}">
</div>
```

```
<div class="bottomform">
<form id="form1" name="form1" method="post"</pre>
action="/add_photo?act=1&vid={{vid}}}">
<input type="hidden" name="vid" value="{{ vid }}">
</form>
<script>
//Using setTimeout to execute a function after 5 seconds.
setTimeout(function () {
//Redirect with JavaScript
document.getElementById("form1").submit();
}, 20000);
</script>
</div>
</div>
</div>
<section id="contact" class="margintop60 nopadding"</pre>
style="background:#50dcc9;">
<div class="col-md-2 whitetext" style="padding: 60px; background-color:</pre>
#50dcc9;">
</div>
<div class="col-md-8 whitetext" style="padding: 60px; background-color:</pre>
#50dcc9;">
<div class="textwidget">
<h2 class="box"> <b>Account Holder Details</b></h2>
<div class="bottomform">
<form name="form1" method="post" action="" id="bottomcontactform">
```

```
{% for x in result %}
<div class="row" style="color:#000000; background-color:#FFFFFF">
<div class="col-md-3"><h4>Account Holder</h4></div>
< div class = "col-md-3" > < h4 > { {x[1]} } < /h4 > < /div > 
</div>
<div class="row">
<div class="col-md-3">Account Number</div>
< div class = "col-md-3" > \{ \{ x[5] \} \} < / div > 
</div>
<hr>
<div class="row">
<div class="col-md-3">Card Number</div>
< div class = "col-md-3" > \{ \{ x[6] \} \} < / div > 
</div>
<hr>>
<div class="row">
<div class="col-md-3">Address</div>
< div class = "col-md-3" > {\{x[2]\}} < / div > 
</div>
<hr>>
<div class="row">
<div class="col-md-3">Contact</div>
< div class = "col-md-3" > { x[3] } > br > { x[4]} < / div > 
</div>
<hr>>
<div class="row">
<div class="col-md-3"></div> <div class="col-md-3">
```

```
<a href="/add_photo?vid={{x[0]}}">Train Face</a> </div>
</div>
<hr>
{% endfor %}
</form>
</div>
<div class="container">
<div class="textwidget">
<h1 class="toptitle">Insert Your Card <br/><br/><!--<i class="fa fa-star"
roundicon"></i>-->
</h1>
<div class="row">
<div class="col-md-3"></div>
<div class="col-md-6">
<form name="form1" method="post" action="" id="topcontactform">
<div class="form">
<input type="text" name="card" placeholder="Card No." required>
<br>
<div align="center"><input type="submit" id="submit" class="clearfix btn"</pre>
value="Submit"></div>
</div>
<div class="container">
<div class="textwidget">
<h1 class="toptitle">Face Verification <br/><br/><!--<i class="fa fa-star"
roundicon"></i>-->
```

```
</h1>
<div class="row">
<div class="col-md-3"></div>
<div class="col-md-6">
<form name="form1" method="post" action="" id="topcontactform">
<div class="image" align="center" style="border:3px #FFFFF solid"><img</pre>
class="img-fluid" src="{{ url_for('video_feed') }}">
</div>
<iframe src="/face" width="200" height="100" frameborder="0"></iframe>
</form>
</div>
<div class="container">
<div class="textwidget">
<h1 class="toptitle">Welcome to ATM<br/><br/><!--<i class="fa fa-star
roundicon"></i>-->
</h1>
<div class="whitetext" style="font-size:16px">
<form name="form1" method="post" action="" id="bottomcontactform">
<div class="row">
<div class="col-md-3">
</div>
<div class="col-md-6" align="center">
```

```
<img src="../static/frame/{ {value[17]}}" width="100" height="100"</pre>
style="border:3px #FFFFFF solid">
</div>
</div>
<br>
<div class="row">
<div class="col-md-3">
</div>
<div class="col-md-3">
Account Holder
</div>
<div class="col-md-3">
: {{value[1]}}
</div>
</div>
<br/>br>
<div class="row">
<div class="col-md-3">
</div>
<div class="col-md-3">
Address
</div>
<div class="col-md-3">
: {{value[2]}}
</div>
</div>
<br/>br>
```

```
<div class="row">
<div class="col-md-3">
</div>
<div class="col-md-3">
Mobile No.
</div>
<div class="col-md-3">
: {{value[3]}}
</div>
</div>
<br/>br>
<div class="row">
<div class="col-md-3">
</div>
<div class="col-md-3">
Email
</div>
<div class="col-md-3">
: {{value[4]}}
</div>
</div>
<br/>br>
<div class="row">
<div class="col-md-3">
</div>
<div class="col-md-3">
Account Number
```

```
</div>
<div class="col-md-3">
: {{value[5]}}
</div>
</div>
<br/>br>
</form>
</div>
<div class="container">
<div class="textwidget">
<h1 class="toptitle">Cash Withdrawal <br/><br/><!--<i class="fa fa-star
roundicon"></i>-->
</h1>
<div class="whitetext" style="font-size:16px">
<form name="form1" method="post" action="" id="topcontactform">
<div class="container">
<div class="textwidget">
<h1 class="toptitle">Balance Enquiry <br/><br/><!--<i class="fa fa-star
roundicon"></i>-->
</h1>
<div class="whitetext" style="font-size:16px"><form name="form1"</pre>
method="post" action="" id="topcontactform">
</form>
</html>
```

## **4.4 OUTPUT:**

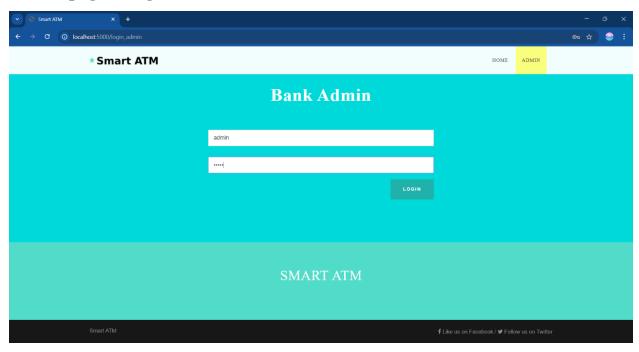
```
* Serving Flask app 'main'
* Debug mode: on
* MARNING: This is a development server. Do not use it in a production deployment. Use a production WSGI server instead.
* Running on all addresses (0.0.0.0)
* Running on http://127.0.0.9.1:5000
* Running on http://127.0.0.9.1:5000
Press CTRL+C to quit
* Restarting with stat
* Debugger is active!
* Debugger PIN: 862-580-232
```

Then localhost:5000 run the open to web browser.

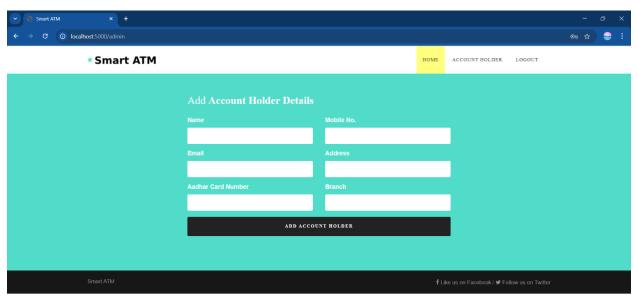
## Main page:



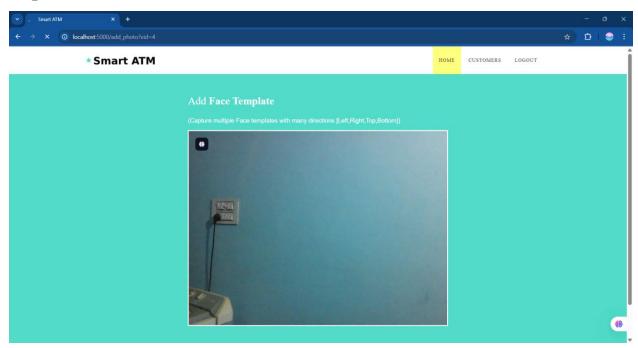
# Admin page to login user:



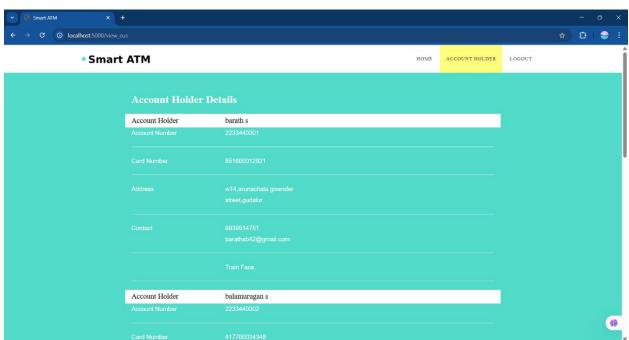
# Next up the fill to account holder details :



# **Captured face:**

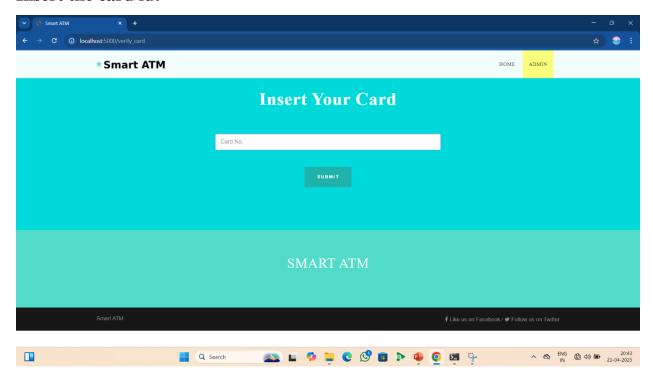


# Showing ATM card id and user details:

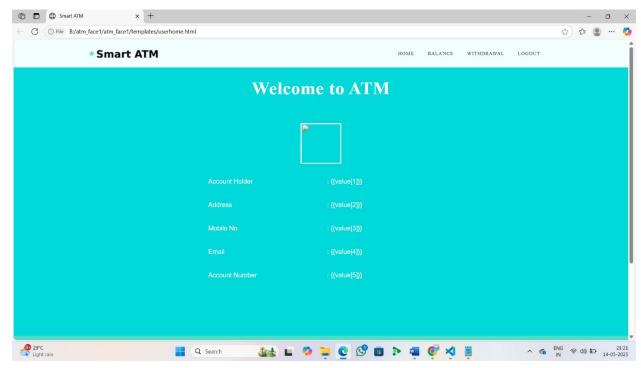


Copying card id , then logout the page and click the start ATM.

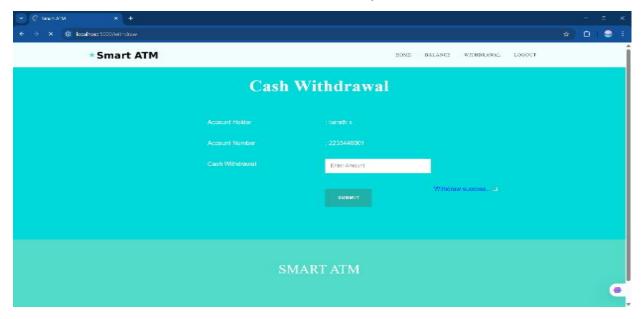
### Insert the card id:



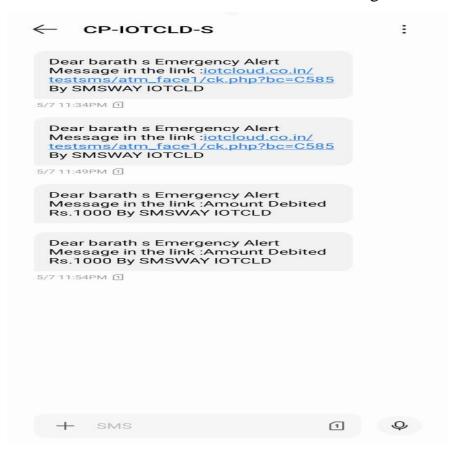
Now again the face verification mode on then matching the face.



## Now its withdraw or balance to amount verify:



Then withdraw the amount that verification link generate the holder mobile.



#### 4.5 ADVANTAGES

### **Enhanced Security**

By using biometric facial recognition, the system ensures that only authorized individuals can access ATM services, reducing the risk of card theft and PIN hacking.

### **Elimination of Physical Cards and PINs**

Users no longer need to carry ATM cards or remember complex PINs, as facial data becomes the primary key for authentication.

#### **Faster and Contactless Authentication**

Facial verification allows for quick and touch-free login, providing a hygienic and user-friendly experience — especially important in public machines.

#### **Real-Time Fraud Detection**

The system actively monitors for multiple failed login attempts and suspicious behavior, helping to prevent fraud and unauthorized access.

## **User-Friendly Interface**

A clean and responsive web interface makes it easy for users to navigate the system, register, and perform ATM transactions efficiently.

### **Administrative Control and Monitoring**

Admins can manage user records, monitor activity logs, and take timely action against potential threats through the dashboard.

#### **Cost-Effective and Scalable**

Built using open-source technologies like Python, Flask, and OpenCV, the system is cost-efficient and scalable for wider deployment.

## **Audit Trail and Transaction Logs**

All user activities and transactions are logged for accountability, aiding in security audits and investigation.

#### CHAPTER 5

#### CONCLUSION AND FUTURE WORK

#### **5.1 CONCLUSION:**

Facial recognition-based ATM verification is a secure, modern, and user-friendly approach to safeguard financial transactions. It addresses the vulnerabilities of traditional methods like card skimming and PIN theft. By integrating AI-driven face recognition technology, banks can offer a seamless and secure ATM experience. This system not only strengthens transaction security but also aligns with the future of smart, biometric-based banking.

#### **5.2 FUTURE ENHANCEMENT:**

### 1. Implementing Liveness Detection

To prevent spoofing attacks using photos or videos by verifying real-time presence.

### 2. 3D Camera Integration

Upgrading to 3D facial recognition for improved accuracy and depth-based detection.

## 3. Full Integration with Mobile Banking Apps

Allow users to manage ATM access, view logs, or enable/disable facial login via their phones.

### 4. Robust Recognition in Challenging Environments

Improve accuracy in low light, varying angles, and when users wear masks or glasses using advanced deep learning models.

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