MirrorME: implementation of an IoT based smart mirror through facial recognition and personalized information recommendation algorithm

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Abstract We are living in the era of the fourth industrial revolution, which also treated as 4IR or Industry 4.0. Generally, 4IR considered as the mixture of robotics, artificial intelligence (AI), quantum computing, the Internet of Things (IoT) and other frontier technologies. It is obvious that nowadays a plethora of smart devices is providing services to make the daily life of humans easier. However, in the morning most people around the globe use a traditional mirror while preparing themselves for daily tasks. The aim is to build a low-cost intelligent mirror system that can display a variety of details based on user recommendations. Therefore, in this article, Internet of Things (IoT) and AI-based smart mirror is introduced that will support the users to receive the necessary daily update of weather information, date, time, calendar, to-do list, updated news headlines, traffic updates, COVID-19 cases

status and so on. Moreover, a face detection method also implemented with the smart mirror to construct the architecture more secure. Our proposed *MirrorME* application provides a success rate of nearly 87% in interacting with the features of face recognition and voice input. The mirror is capable of delivering multimedia facilities while maintaining high levels of security within the device.

Keywords 4IR · IoT · Artificial intelligence · Smart mirror · Face detection · Authentication

1 Introduction

Nowadays in this world, technologies are advancing day by day. For this reason, maximum devices need to be updated with smart technology. The smart systems are organized by artificial intelligence (AI) and build smart equipment that makes the devices more interactive with the user. However, the smart device has the capability to easily sense, process and analyze the captured information. In modern days, working professionals are highly busy with their daily work and thus it is quite difficult for them to check daily necessary information including the latest news, To-do list, daily stock market update, social media newsfeed, traffic jam update, weather forecast and so on. This research proposed an IoT based smart mirror that helps the users to receive all this information. In addition, an AI-based face detection method also introduced that ensures a specific level of security for the proposed architecture. Besides, this system will also offer the opportunity for users to check their daily e-mails, helps them by playing preferred audio and video songs with the features of voice input. Currently, significant research works have been conducted in the domain of developing an interactive smart mirror for

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personal use. Rabben et al. [1] developed a smart mirror-based solution allowing pupils to wash their hands without the assistance of teachers or adults. This technique was created for the students in kindergartens and schools who require the assistance of a teacher to wash their hands in order to keep them hygienic. Despite the fact that this method gives feedback and instructions, it is quite popular among general pupils. Besides, by presenting the basic information of the users, Akshaya et al. [2] have developed a two-button supported smart mirror, one for the website and another for the map. The key feature of this research is to access the smart mirror from several areas with an assistance of a user-friendly interface. Purohit et al. [3] used facial recognition to construct a virtual assistance-based smart mirror solution for home automation. This suggested device may be utilized as a regular mirror as well as a smart mirror to obtain the user's daily information. The Raspberry Pi is employed to control and power the equipment in this system. However, in other work, D'souza et al. [4] have built a smart mirror that allows users to manage their home appliances using speech recognition approach. This application is primarily designed to reduce users' energy use while also displaying some essential functions such as time, traffic, Google Calendar, weather, cryptocurrency, and so on. In another recent work, Halaby et al. [5] presented a smart medical mirror that would display the user's vital signals such as SPO2, heart rate, BMI, and body temperature. Surprisingly, the proposed system is time-consuming, it takes more than 5 s for initializing, measuring and displaying the result. However, for those who are having difficulty getting medical check-ups due to laziness or busyness, this method may be able to aid them in obtaining their basic vital signs, which can help them spot deadly illnesses and medical problems at an early stage. Similarly, Nadaf et al. [6] and Njaka et al. [7] also developed a smart mirror for ensuring home security along with some basic features. A biometric authentication-based user recognition model has developed by the authors [7, 8] to ensure sufficient security in accessing the smart mirror. To detect an intruder through a smart mirror in a room, Jin et al. [8] have proposed an alarm-based interactive application. This article focuses on storing images of users in a dataset and the designed system sends notifications to the authenticated user when the model does not identify someone. With an 80% accuracy, in detecting user's faces Mohamed et al. [9] have designed an artificial intelligence-based smart mirror. For recognizing existing users, they also proposed a registration method with the support of the facial recognition method. In recent times, Hollen et al. [10] have designed a facial recognition-based smart mirror to detect the user's mood in real-time. The authors employed the concept of the user's face and out-bound movement detection to recognize the face and

identify the mood in the system. In this article, the design and implementation of an IoT based smart mirror with the support of personalized information recommendation and face recognition approach is proposed. Following Table 1 highlights the available features for both categories of users (general and authenticated). This research has focused on the design and development of an interactive smart mirror; the development of a voice-controlled input; and to ensure the accurate detection of user's faces to access the features.

2 Methodology

In this section, the design methodology of this proposed framework has been discussed. The proposed architecture is suitable for the essential functionality of any smart home. On the other hand, this will timely remind the user for a specific task based on the user's preference. Different features of the proposed *MirrorME* application are illustrated in Fig. 1. *MirrorME* is designed dedicatedly for two different categories of users; one is general users and other is authenticated users. The authentication process is developed with the support of HOG-SVM based face recognition approach. Regarding the access of different features, there are some personal information recommendation features for any existing users whereas the general users only have the access of some specific basic features. However, the authenticated users also access some of the premium features of the smart mirrors by using the voice recognition features. Functional and access diagram of general user and authenticated user of *MirrorME* application is shown in Fig. 2.

As we have already discussed, in this exploration, face recognition is required to detect the authentic user for accessing the smart mirror. Face recognition has been employed in this research using the architecture of histograms of oriented gradients (HOG) features and the linear support vector machine (SVM). The proposed feature extraction algorithm by Dalal et al. [11] known as Histograms of Oriented Gradients (HOG). In HOG, initially, the image is divided into small cells and then the gradient or edge direction histogram is collected in each cell unite, and finally, these histograms are combined to form a HOG descriptor. While doing feature extraction, HOG generally creates 3780 features of the image.

A gradient in the horizontal and vertical directions is obtained first to extract the feature in HOG. The template of horizontal direction is $K = [-1, 0, 1]$ and to filter image, its transposition can be used, that is why it is possible to calculate the horizontal and vertical gradients, easily. The expression Eqs. (1) and (2) is given as follows.

Table 1 User wise features availability of *MirrorME* architecture

	General users	Authenticated users
Features category	Time, weather, calendar, alarm, news update, COVID-19 update, YouTube, music, and traffic update	Gmail, stock market update, To-do list, phone notification, YouTube channel, and all the available features of the general user

Fig. 1 Various features of the proposed *MirrorME* application **Fig. 2** Functional and access diagram of general user and authenticated user of *MirrorME* application

$$g_x = I(x+1, y) - I(x-1, y) \quad (1)$$

$$g_y = I(x, y+1) - I(x, y-1) \quad (2)$$

Here, the direction gradient of x is represented by g_x and the direction gradient of y is represented by g_y , the pixel value of (x, y) is denoted by $I(x, y)$. The gradient magnitude of (x, y) is denoted by $\Delta g(x, y)$ and calculated Eq. (3) by

$$\Delta g(x, y) = \sqrt{g_x^2 + g_y^2} \quad (3)$$

And, the gradient direction (θ) of (x, y) is calculated Eq. (4) by

$$\theta = \arctan(g_y/g_x) \quad (4)$$

In machine learning, support vector machine (SVM) [12] used as a binary classifier. Classes separated with the largest gap between the support vectors. Here, the borderline instances in a class known as support vectors. In addition, we have extended the SVM with the support of kernel. Kernels transform data from input space to feature space. The kernel is a mathematical function that takes two arguments and returns the dot product of their value. Let two data points x_1 and x_2 mapping is denoted by φ then the kernel K will be Eq. (5).

$$K(x_1, x_2) = \varphi(x_1)T\varphi(x_2) \quad (5)$$

When input space and feature space are equal then it is known as linear kernel and this linear kernel is used in linear SVM. Mathematically, the equation of linear kernel can be expressed as Eq. (6).

$$K(x_1, x_2) = x_1Tx_2 \Rightarrow \varphi(x) = x \quad (6)$$

Due to its capability of faster application training therefore, it is highly efficient in high-dimensional data applications. The proposed workflow is consisted of detecting faces using HOG and linear SVM, computing embedding and comparing the vector to the database via a voting method. The basic flow of the HOG feature extraction algorithm and the face detection technique of the proposed application is illustrated in Fig. 3.

3 Design and implementation

In this segment, the design and implementation approach has discussed with the architectural view of hardware and software. The hardware of the proposed framework consists of various components including two-way mirror, raspberry pi 3B+, camera, microphone, wood frame, display screen, speaker and some others. Following Fig. 4 depicts the IoT based hardware configuration diagram of the proposed *MirrorME* application.

3.1 Raspberry pi

The Raspberry pi [13] is a small and powerful computer that uses its own OS known as Raspberry pi OS and this operating system is Debian-based. Importantly, this device is the core component of our designed smart mirror.

3.2 Camera

For the purpose of face recognition, this work needed to use a camera and our proposed algorithm is incorporated with the camera to identify an existing user for accessing the *MirrorME* application.

3.3 Two-way mirror

Basically, a mirror is a smooth polished surface where the image is created by the reflection. In this work, a two-way mirror is used in which one side is transparent and the other side shows its reflection. The concept of using a two-way mirror is similar to using a usual mirror and that same mirror also acts as a functional object.

3.4 Display monitor

In order to present the basic information including date/time, weather update, alarm, news headlines, traffic update and so on, a display monitor is essential in this model. Therefore, in the development of the model, LG 14-inch monitor is connected to the Raspberry pi module using HDMA interfacing.

3.5 Microphone and speaker

To utilize the features of the voice-based activity, a microphone is needed in the designed model. A single Bluetooth speaker is also attached to the system to receive feedback. However, all the output results can be received through the speaker.

Based on the above discussion, the complete model of the architectural diagram and framework design approach of the proposed system shown in Fig. 5.

To avoid unnecessary access to personal features for specific users, this model has also designed a multi-phase user recognition system. For recognizing the valid and existing users, HOG (histogram of oriented gradients) and linear SVM (support vector machine) based face recognition model have been employed. The detailed working procedure of the proposed system highlighted in Fig. 6. In addition, a stepwise description of the working procedure presented in Table 2.

Following Fig. 7 illustrates both the software view and implantation process of *MirrorME* application. In Fig. 7A,

Fig. 3 Workflow diagram of feature extraction algorithm and face detection procedure using histogram of oriented gradients (HOG) and support vector machine (SVM)

Fig. 4 IoT based hardware configuration diagram of the proposed *MirrorME* application

all the available activity is properly labelled with appropriate features. Apart from designing the hardware architecture, this research also developed a dedicated software view for a better understanding of this application. On the other hand, in the implemented view Fig. 7B–D depicts the process of using home interface, road traffic update, and YouTube videos respectively.

4 Results and discussion

This section has discussed testing results based on experiments. In order to test our designed model, we have conducted a result analysis based on the experience users observed during the assessment of this application. This research work has been carried out in the machine intelligence lab (MINTEL) of the Dhaka International University. Ten (10) participants have chosen to participate in this experiment based on previous experience in interacting with smart devices. All the participants were chosen aged

Fig. 5 Architectural diagram and framework design approach of the proposed system

Fig. 6 A complete flowchart of *MirrorME* application working procedure with the features of different user interactions

between 22 and 25 years. In order to achieve higher accuracy in the task of face recognition, we have chosen a frame rate of 50 and a resolution of 480×360 . The resolution 480×360 has been taken because a high-resolution frame takes a higher time to process and a low-resolution frame normally does not provide high accuracy. Among the Ten (10) percipients, there were Four (4) female participants (FP) and Six (6) male participants (MP)

to interact with the *MirrorME* system. For each participant, exactly Ten (10) responses have been recorded for the features of face recognition and others. The success rate for each individual is shown in Table 3. However, during the testing phase, the face recognition feature shows $\sim 100\%$ accuracy for the fourth male participant (MP4). On the other hand, it shows an accuracy of $\sim 60\%$ for the first female participant (FP1).

Table 2 Working procedure of *MirrorME* application based on user activity

Order	Task	Description
STEP 1	Performing the face detection	Initially, the designed system will activate based on internet connectivity. It will continuously check for an internet connection to perform the face detection and to check whether the user is an existing user or a general user
STEP 2	User authentication check	Through this step, designed systems will be able to distinguish between general user and existing user
STEP 3	Showing basic features for general user using voice input	For a new user, this application will only offer some of the basic features including date/time, weather information, calendar, holiday and other information
STEP 4	Check existing users through face recognition and voice input	In this step, after successful detection of existing user, designed application will provide access to all the premium features
STEP 5	Authenticated users have the privilege to access all the features of the application	Besides, for the authenticated users, the system will also provide the user interaction features to check their regular email, stock exchange update, and SMS notification

Fig. 7 Software view and implemented view of *MirrorME* application

After the testing phase of face recognition, the same ten (10) participants again interacted with the mirror with the voice input. Each of the participants provides ten (10) voice input to interact with the individual features

including YouTube, Alarm, Traffic, and daily schedule. Table 4 presents the testing results of the voice input. However, due to the network connectivity issue, sometimes the voice input took a longer time to function properly.

Table 3 Analyzing the accuracy/success rate of face recognition feature based on the participations of (n = 10) individuals

Face recognition	Number of terms	Success rate (%)
Response form male participant		
MP1	10	90
MP2	10	70
MP3	10	80
MP4	10	100
MP5	10	90
MP6	10	80
Response form female participant		
FP1	10	60
FP2	10	70
FP3	10	80
FP4	10	90

For each participant, we have recorded exactly (10 × 10) responses for both face recognition and voice input features. After the result analysis, we observed the average success rate of ~ 86.75% during the time of interaction with the *MirrorME*. Table 5 shows the average success rate for each individual based on the data of Tables 3 and 4. In addition, we also highlighted the three highest average success rates for the second male participant (~ 97%), fourth male participant (~ 92%) and third female participant (~ 90%).

A comparative analysis with feature assessment matrix also designed and shown in Table 6 to compare the features of *MirrorME* application with other research work. This exploration observes that our suggested system

Table 5 Average success rate of each individual participants for both the face recognition and voice input

Participants	Number of terms	Average success rate (%)
MP1	10	85
MP2	10	97.5
MP3	10	85
MP4	10	92.5
MP5	10	80
MP6	10	87.5
FP1	10	80
FP2	10	85
FP3	10	90
FP4	10	85
FP1	10	85

outperforms other recent work in the categories of general information, reminders, social media alerts, voice recognition, voice control, face recognition, email notification, google map, weather update, and YouTube, based on a comparison with other recent work. However, several types of research in the field of voice control and face recognition have been fairly successful, for particular, the authors in [7, 8] integrated voice control and facial recognition to provide security for their recommended smart mirror. After analyzing the results, it is also discovered that combining speech and facial recognition provides a more secure system than other techniques. Similar characteristics of *MirrorME* have been proposed and achieved by the authors earlier in [9, 10, 16], however, the feature assessment matrix demonstrates that their produced application is still lacking in several areas, such as social media notifications,

Table 4 Analyzing the accuracy/success rate of voice input feature based on the participations of (n = 10) individuals

Participants for voice command	Number of terms	Success rate: YouTube (%)	Success rate: alarm (%)	Success rate: traffic (%)	Success rate: daily schedule update (%)
Response form male participant					
MP1	10	80	90	80	90
MP2	10	90	100	100	100
MP3	10	80	90	90	80
MP4	10	90	100	90	90
MP5	10	70	80	80	90
MP6	10	80	90	90	90
Response form female participant					
FP1	10	70	80	80	90
FP2	10	80	90	90	80
FP3	10	90	90	100	80
FP4	10	80	90	80	90

Table 6 A comparative features analysis of designed *MirrorME* application with others research work

Article/features	Basic information	Reminders	Social media notifications	Voice recognition	Voice control	Face recognition	Email notifications	Google map	Weather update
Rabben et al. [1]	✓								✓
Akshaya et al. [2]	✓							✓	
Purohit et al. [3]	✓					✓			✓
D'souza et al. [4]	✓				✓			✓	✓
Halaby et al. [5]	✓								✓
Nadaf et al. [6]	✓				✓	✓			
Njaka et al. [7] and Jin et al. [8]	✓					✓	✓		
Mohamed et al. [9]	✓					✓	✓	✓	
Hollen et al. [10]						✓			✓
Kulovic et al. [14]	✓	✓							✓
Yusri et al. [15]	✓			✓					
Athira et al. [16]	✓	✓	✓	✓					
Hossain et al. [17]	✓					✓			
Our Proposed System (MirrorME)	✓	✓	✓	✓	✓	✓	✓	✓	✓

voice recognition, and voice control. Overall, the originality of this investigation is the design and development of an interactive smart mirror capable of conducting daily tasks while providing the highest level of security in terms of face and voice recognition for end users. Based on the feature assessment matrix, we observed that our proposed system contains every feature that considered as a complete interactive smart mirror and has outperformed other work in the specific category.

The research's next focus will be on the creation of a comprehensive home security gadget. The burglar may be spotted with this smart mirror, and the owner may be notified through email or text message with a real-time image of the intruder.

5 Conclusion

This paper demonstrated a smart mirror device with a user-friendly architecture with many impressive features. Following a service-oriented approach, a stable and easy-to-use architecture was also introduced in this article. However, security issues cannot be overlooked in today's world of interconnected devices. Therefore, this system was designed with a strong authentication framework to ensure the system's end-to-end security. Two different features (face recognition and voice input) set this designed model aside from other similar works. Furthermore, unique features such as information customization for each individual user made this model more convenient and effective. Again, the prototype's advancement has infinite possibilities in the future in the field of medical data analysis

including BMI calculations, temperature check and blood pressure indicator. The most notable aspect of this model is the ability to carry the smart mirror display across the entire house.

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Code availability Not applicable.

Declarations

Conflict of interest All authors declare no competing interest.

Ethics approval All procedures performed in studies involving human participants were in accordance with the ethical standards of the committee of Dhaka International University (DIU) research cell and with the 1964 Helsinki declaration and its later amendments or comparable ethical standards.

Consent to participate Informed consent was obtained from all individual participants included in the study.

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