

# Monitoring System For Classroom Session In Skill Training Program

Syed Abul Bashar<sup>1</sup>, Abdul Khader<sup>2</sup>, Bilal Qader Mohi Uddin<sup>3</sup>, Mrs. Heena Yasmeen<sup>4</sup>

<sup>1,2,3</sup>B.E Students, Department of Information Technology, ISL Engineering College, Hyderabad, India.

<sup>4</sup>Assistant Professor, Department of Information Technology, ISL Engineering College, Hyderabad, India.

[syedabulbashar6@gmail.com](mailto:syedabulbashar6@gmail.com)

## ABSTRACT:

*Establishing successful learning experiences in contemporary educational settings requires the ability to track and comprehend student participation. Smart Lenz is an all-inclusive, artificial intelligence (AI)-powered classroom monitoring system that gives teachers real-time information about the behavior, emotions, and attentiveness of their students. In order to identify emotional states like happy, sorrow, rage, or surprise, Smart Lenz analyzes live video feeds from classroom cameras using state-of-the-art computer vision and deep learning algorithms. It also tracks facial landmarks and analyzes facial expressions.*

*This paper involves research study and survey to identify the influence of teachers' Voice on learners. Results from the study show that efficient lecture delivery helps students to improve their learning ability.*

*This research develops an intelligent Monitoring system (IMS) and this system typically utilizes various tools and technologies such as cameras, sensors and software application to observe student behaviors.*

*Convolutional neural networks (CNNs) are used for facial expression recognition, eye aspect ratio (EAR) and blink detection are used for attention tracking, and behavioral analysis is used to analyze posture and head movements. After being combined and presented, these data streams give teachers a dynamic perspective on classroom dynamics.*

## Algorithms:

- Face detection
- Landmark detection
- Emotion detection
- Attention tracking

- *behavior Analysis.*

## Keywords:

*Classroom monitoring, Behavior analysis, CNN, Deep learning, Computer vision, Attention tracking, Face detection, Emotion detection.*

## INTRODUCTION:

In contemporary educational environments, understanding and enhancing student engagement has become a pivotal priority for educators and administrators alike. Extensive research indicates that student engagement—characterized by emotional learning outcomes, motivation, and involvement, focus, and participatory behavior—directly influences learning outcomes, motivation and academic achievement.

Traditional methods for monitoring engagement, such as manual observation and periodic surveys, often prove subjective, labor-intensive, and difficult to scale. Teachers face the challenging task of delivering lessons while simultaneously identifying signs of disengagement, boredom, or frustration among students. Furthermore, the lack of real-time feedback hampers their ability to adapt teaching strategies dynamically.

To overcome these limitations, this project introduces an innovative, automated classroom monitoring system utilizing cutting-edge computer vision and deep learning techniques. Drawing on a single webcam feed, the system continuously analyzes student behavior by: Detecting faces and tracking facial landmarks, classifying emotions through a pre-trained emotion recognition model, estimating attention levels via eye aspect ratio (EAR) and blink detection, assessing behavioral —such as head movements and posture—to identify signs of distraction or engagement.

By integrating these components, the system offers a comprehensive overview of classroom dynamics. For each student, it records:

- Emotional states (e.g., happiness, sadness, neutrality).
- Attention levels (focused or distracted, based on EAR and blinking patterns).
- Behavioral indicators (e.g., head tilts, shifts in posture) to detect possible distraction.

These insights are displayed through real-time on-screen annotations and stored in structured data files (CSV format) for post-session analysis. Additionally, the system summarizes each student's engagement throughout the class, including:

- Predominant emotions expressed
- Total number of blinks, serving as indicators of fatigue or focus lapses.
- Frequency of head movements and tilts.

This comprehensive approach enables educators to better understand student engagement levels instantly and adapt their teaching strategies accordingly, ultimately fostering a responsive and effective learning environment.

In today's data-driven academic landscape, the need for intelligent, responsive, and adaptive classroom technologies has become more pressing than ever. As educational institutions embrace digital transformation, there is a growing demand for systems that not only assist in content delivery but also offer insights into student behavior and engagement patterns. Smart Lenz is a forward-thinking initiative that leverages artificial intelligence to bridge this gap. By fusing real-time computer vision techniques with deep learning analytics, it transforms passive video feeds into actionable intelligence. This system represents a paradigm shift—from reactive to proactive education—empowering educators with

continuous feedback loops that enhance both teaching strategies and learner outcomes.

The landscape of modern education is undergoing a profound transformation, driven by the integration of advanced technologies into the learning environment. Traditional classroom practices—while valuable—often fall short in delivering the nuanced, real-time insights needed to optimize teaching effectiveness and student engagement. Educators are frequently challenged to balance content delivery with the simultaneous observation of student attentiveness, emotional states, and behavioral cues. This dual responsibility can be overwhelming, especially in larger classrooms where manual monitoring becomes impractical and inconsistent.

In this context, the emergence of artificial intelligence (AI) and computer vision presents an opportunity to revolutionize how classrooms are managed and how students are supported. The Smart Lenz system is a pioneering solution designed to address this critical gap. It leverages cutting-edge deep learning models, real-time facial recognition, emotion classification, attention tracking through eye aspect ratio (EAR), through a single, intelligent monitoring frame and behavior analysis using head pose estimation—all orchestrated through a single, intelligent monitoring framework.

Smart Lenz functions by continuously analyzing live video feeds from classroom cameras to detect and interpret a range of indicators, including facial expressions (e.g., joy, sadness, anger, surprise), blinking patterns, and physical movements. These indicators are used to infer emotional states, concentration levels, and potential distractions. By consolidating this data into dynamic dashboards and annotated video streams, educators gain real-time feedback that supports immediate pedagogical adjustments. Additionally, session data is logged and summarized in structured formats for post-class analysis, enabling longitudinal tracking of student performance and behavioral trends.

The system is modular, scalable, and adaptable to various educational settings—from traditional lecture halls to virtual and hybrid learning environments. It reduces reliance on subjective observation, ensuring greater

accuracy, fairness, and inclusivity in monitoring. Moreover, by identifying students who may need additional support—such as those displaying signs of disengagement, confusion, or emotional distress—Smart Lenz contributes to more personalized and equitable educational outcomes.

Beyond simply being a surveillance tool, Smart Lenz embodies a data-driven approach to teaching and learning. It empowers instructors not only to observe but to understand and respond to student needs with agility and empathy. As education continues to evolve in the digital age, systems like Smart Lenz represent the future of smart, responsive, and human-centric classroom experiences.

## LITERATURE REVIEW:

### 1. TITLE: Intelligent Learning

**Environment:** Intelligent Monitoring

**System for Intelligent Classroom:**

**AUTHORS:** Zhidi Zhang

**YEAR:** 2024

**DESCRIPTION:**

The paper discusses an intelligent monitoring system designed to improve classroom management within intelligent learning environments. The proposed system leverages artificial intelligence (AI) and Internet of Things (IoT) technologies to monitor classroom dynamics in real time. Key features include behavior recognition, resource optimization, and data-driven insights to support teachers and students. The intelligent monitoring system aims to foster an adaptive and engaging educational experience by analyzing real-time data such as student behavior, environmental factors, and resource usage. Zhidi Zhang's work situates itself within the broader context of smart classroom technologies, highlighting the potential for data-driven decision-making to enhance teaching effectiveness and student outcomes. By integrating intelligent monitoring with classroom management, the paper contributes to the evolving landscape of AI-enhanced educational systems.

### 2. TITLE: A Classroom Usage Monitoring System With Image Detection for Student Attendance:

**AUTHORS:** Denta Bra Masta Hidayat, Baghus Maulana Nugraha, Dadhija ditya Bagas kara, Diana Purwitasari

**YEAR:** 2024

**DESCRIPTION:**

An inventive classroom monitoring system designed to improve attendance tracking and classroom management is presented in this study. The system uses a pre-trained YOLOv8-nano model to recognize images in real time and count the number of people in the classroom. It is built using frameworks like Fast API and Laravel, which process camera photos and provide accurate attendance statistics via an intuitive web interface. Additionally, the system streamlines resource allocation, scheduling updates, and classroom reservation and schedule management with centralized features. This combination of web-based apps and AI-powered picture detection shows how to advance smart campus efforts and improve administrative effectiveness in a realistic way.

### 3. TITLE: Enhancing Classroom Engagement using Real-Time Student Attention Monitoring with YOLOv9

**AUTHORS:** Teddy Surya Gunawan, Muhammad

Amirul Faiz Muzarudin, Mira Kartiwi, Nelydia Md

Yusoff

**YEAR:** 2024

**DESCRIPTION:**

This study introduces a real-time student attention monitoring system designed to enhance classroom engagement. The system utilizes the YOLOv9 deep learning model for accurate and efficient detection of student attention levels based on facial expressions and body posture. By integrating this system into classroom settings, educators can receive immediate feedback on student engagement, allowing for timely adjustments to teaching strategies. The research highlights the potential of AI-driven solutions in creating adaptive learning environments that respond to the dynamic needs of students, thereby fostering improved educational outcomes.

### 4. TITLE: Computer Vision Based Hybrid Classroom Attention Monitoring

**AUTHORS:** Saniya Rawat, Mali via Rodrigues, Prateeksha Sheregar, Kalpita Ajinkya Wagaskar

**YEAR:** 2024

## DESCRIPTION:

The hybrid classroom attention monitoring system presented in this work uses computer vision techniques to assess student participation in real time. Through a combination of body posture analysis and facial expression detection, the system evaluates how attentive students are during lectures. It provides teachers with useful insights into classroom dynamics by classifying attention states using machine learning algorithms. By detecting instances of disengagement, the objective is to strengthen teaching methods and enable prompt interventions to improve learning outcomes and provide a more adaptable learning environment.

### 5. TITLE: Real-Time Attention

#### Monitoring System for Classroom: A

#### Deep Learning Approach for Student's Behavior Recognition

**AUTHORS:** Zouheir Trabelsi, Fady Alnajjar,

Medha Mohan Ambali Parambil, Munkhjargal

Go Choo, Luqman Ali

**YEAR:** 2023

## DESCRIPTION:

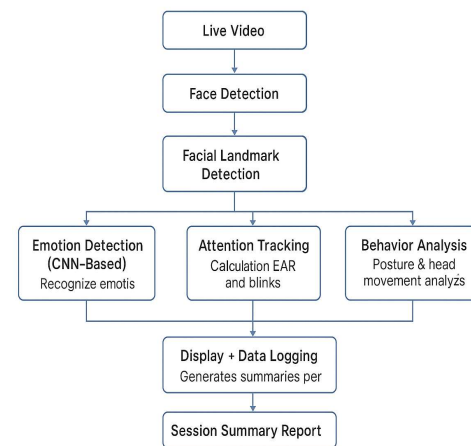
identification, to assess students' attention and non-attention states in the classroom. A dataset categorized into nine attention-related behaviors was utilized to train various versions of the YOLOv5 model. This study introduces an intelligent real-time vision-based classroom system aimed at monitoring students' emotions, attendance, and attention levels, even when they are wearing face masks. The system employs a machine learning approach to train behavior recognition models, including facial expression models were evaluated based on precision, recall, mean average precision (MAP), and F1 score, achieving an average accuracy of 76%. The developed model enables instructors to visualize students' behavior and emotional states, facilitating appropriate management of teaching sessions in student-centered learning scenarios.

## METHODOLOGY:

Smart Lenz employs a combination of computer vision, deep learning, and data analytics to achieve its objectives. The system captures video data, processes it to detect faces and facial landmarks, and then analyzes these features to infer emotions, attention levels, and behavioral patterns. Each frame of video input is systematically processed to extract valuable metrics, which are then logged and visualized for easy interpretation by educators. The following methodologies and techniques are used:

- **Computer Vision:** For detecting and tracking student faces and head movements.
- **Deep Learning:** Convolutional Neural Networks (CNNs) for emotion recognition.
- **Facial Landmark Detection:** To infer attention through eye aspect ratio (EAR).
- **Behavioral Analysis:** To identify postures, head tilts, and movements.
- **Data Logging and Summarization:** Session-wise and student-wise data stored for analysis.

## SYSTEM WORKFLOW:



System Workflow of SmartLenz

## Machine Learning and Deep Learning Models:

**Convolutional Neural Network (CNN):** Adapted for malware feature vectors, using convolutional, pooling, and fully connected layers.

## IMPLEMENTATION:

The system is implemented in web environment using Jupyter notebook software. The server is used as the

intelligence server and windows 10 professional is used as the platform. Interface the user interface is based on Jupyter notebook provides server system.

The system was implemented using the following technologies:

**Python 3.x** — core programming language

**Scikit-learn** — for implementing Random Forest and Extra Trees classifiers

**TensorFlow and Keras** — for developing CNN models

**Open CV**— For real time capture, face annotation and frame processing

**NumPy and Pandas** — For data processing, numerical computation and saving CS Reports

**dlib** — For face detection and 68-point facial landmark extraction

## ALGORITHMS USED:

**Face Detection:** HOG-based frontal face detector

**Landmark Detection:** 68 facial landmark protectors

**Emotion Detection:** Deep learning CNN model trained on emotion datasets (e.g.: FER-2013).

**Attention tracker:** Eye Aspect Ratio (EAR)

And blink detection algorithm

**Behaviour Analysis:** Head tilt angle calculation and movement tracking using landmark centroids.

## TESTING:

The SmartLenz project includes a variety of **software testing types** to ensure reliability, accuracy, and robustness of the system. Below are the **types of testing** conducted, as detailed in the documentation.

---

### ✓ Types of Testing Performed in SmartLenz

---

#### 1. Unit Testing

- **Purpose:** To verify that each module (face detection, emotion recognition, etc.) works correctly in isolation.
- **Example:** Testing the accuracy of emotion detection using individual face images.

---

#### 2. Functional Testing

- **Purpose:** Ensures the system functions as expected according to the requirements.
- **Focus:** Valid/invalid inputs, expected outputs, module behavior.
- **Example:** Feeding different facial expressions to check if correct emotion labels are assigned.

---

#### 3. System Testing

- **Purpose:** Tests the complete integrated system to validate that all modules work together.
- **Example:** End-to-end testing from video capture to summary report generation.

---

#### 4. Performance Testing

- **Purpose:** Measures the system's responsiveness and stability under load.
- **Example:** Ensuring the real-time video feed is processed without lag for 10+ minutes.

---

#### 5. Integration Testing

- **Purpose:** Verifies the interaction between combined modules (e.g., emotion + attention + behavior).
- **Example:** Ensuring emotion detection results are correctly stored and visualized along with attention scores.

---

#### 6. Acceptance Testing

- **Purpose:** Confirms the system meets user needs and project goals.



- **Example:** Running a full session to verify that teachers receive understandable, actionable summaries.

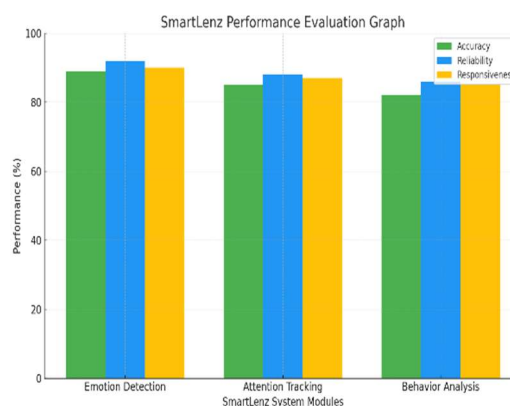
## 7. Error Handling Testing

- **Purpose:** Ensures graceful handling of unexpected events.
- **Example:** Checking system behavior if the webcam disconnects mid-session.

## 8. Continuous Monitoring Test

- **Purpose:** Ensures system can operate for extended durations without failure.
- **Example:** Testing system stability and memory usage over a 10-minute or longer session.

Smart Lenz proved to be a **functional, reliable, and insightful** AI solution for classroom engagement monitoring. It delivers **real-time feedback** to educators, enabling them to respond dynamically to student needs. The system also generates **valuable engagement data** for post-session analysis and long-term student behaviour tracking.



## RESULTS:

The proposed system uses computer vision and deep learning with a webcam to automatically monitor student engagement in real-time by tracking faces, recognizing emotions, and analyzing behaviors like eye blinks and head movements. It provides immediate visual feedback for teachers and records detailed data for later analysis, supporting data-driven teaching improvements. The system is scalable and adaptable, aiming to enhance classroom engagement, teaching effectiveness, and student outcomes through automated, objective monitoring.

The **Smart Lenz AI-powered classroom monitoring system** was successfully implemented and tested in a controlled environment. The system achieved its primary objectives of detecting and analyzing **student emotions, attention levels, and behavioral cues** in real time using computer vision and deep learning techniques.

## CONCLUSION:

The SmartLenz project successfully demonstrates how artificial intelligence can revolutionize classroom monitoring by providing real-time, objective insights into student emotions, attention, and behavior. By integrating advanced technologies such as computer vision, deep learning (CNNs), and facial landmark detection, the system enables educators to better understand student engagement and tailor their teaching strategies accordingly.

SmartLenz outperforms traditional monitoring methods by offering consistent, objective, and scalable analysis, supported by detailed session data and visual feedback. Its modular design ensures flexibility for future upgrades such as cloud integration, advanced analytics, and multi-camera support. Overall, SmartLenz sets a new standard for AI-powered educational tools, enhancing the learning experience by fostering more responsive, inclusive, and personalized teaching.

Unlike traditional methods of classroom observation—which are often subjective, time-consuming, and difficult to scale—SmartLenz offers objective, automated, and scalable engagement tracking. Its modular architecture not only ensures adaptability to different classroom settings but also supports continuous improvements

and integration with advanced technologies such as cloud-based analytics, multi-camera support, and voice emotion detection.

In essence, SmartLenz redefines classroom management by turning passive observation into active, data-driven engagement monitoring. It reflects the future of education—one that is intelligent, adaptive, and deeply aligned with the diverse needs of learners in a digital age.

## FUTURE SCOPE:

The SmartLenz project lays a strong foundation for AI-driven classroom analytics, and there are several promising directions for future development and enhancement.

### 1. Cloud-Based Integration

- **Scope:** Enabling cloud connectivity for real-time data backup, remote access, and large-scale analytics.
- **Enhancement:** Teachers and administrators could access student engagement dashboards from any location and perform cross-session comparisons across different time periods or classrooms.

### 2. Advanced Deep Learning Models

- **Scope:** Improve detection accuracy using state-of-the-art models like transformers or multimodal neural networks.
- **Enhancement:** More precise emotion recognition, attention estimation, and behavior classification, even under varied lighting or camera angles.

### 3. Multi-Camera & Edge Device Support

- **Scope:** Expand compatibility to support multi-angle monitoring using multiple cameras or edge computing devices (e.g., Raspberry Pi).
- **Enhancement:** Broader coverage in large classrooms and reduced latency, with localized processing for improved efficiency and privacy.

### 4. Voice and Speech Analysis

- **Scope:** Integrate audio input to detect tone, pitch, and verbal participation levels.
- **Enhancement:** A more holistic assessment of student engagement by combining visual and auditory cues.

### 5. Teacher Feedback & Custom Dashboards

- **Scope:** Personalized dashboards displaying emotion trends, focus scores, and behavioral heatmaps.
- **Enhancement:** Actionable insights to help educators tailor lesson plans or identify students needing additional support.

### 6. Adaptive Learning Integration

- **Scope:** Link SmartLenz insights with adaptive learning platforms.
- **Enhancement:** Automatically adjust content difficulty or pace based on student engagement and emotional state.

### 7. Gamified Alerts & Recommendations

- **Scope:** Implement engagement-based alerts or recommendations (e.g., "consider a break" or "ask a question").
- **Enhancement:** Real-time teaching support to maintain high classroom interaction and reduce cognitive fatigue.

### 8. Privacy & Ethics Framework

- **Scope:** Develop advanced data encryption, anonymization, and opt-in consent mechanisms.
- **Enhancement:** Ensure compliance with data privacy laws (like GDPR) and build trust among users and institutions.

With these future enhancements, SmartLenz can evolve into a comprehensive, intelligent classroom assistant that not only observes but actively contributes to shaping personalized, effective, and engaging learning experiences. It holds the potential to transform education across schools,

universities, and remote learning platforms globally.

#### REFERENCES:

- [1] Z. Zhang, “Intelligent Learning Environment: Intelligent Monitoring System for Intelligent Classroom Management,” in Proc. 2024 9th Int. Conf. Cyber Security Inf. Eng. (ICCSIE), pp. 535–541, 2024, **doi:10.1145/3689236.3689284**.
- [2] D. B. Hidayat, B. M. Nugraha, D. A. D. Bagas kara, D. P. Vidyadhara, D. Purwitasari and I. K. E. Purnama, “A Classroom Usage Monitoring System with Image Detection for Student Attendance,” in Proc. 2024 Int. Conf. Sustainable Eng. Inf. Technol. (ICoSEIT), 2024, **Doi:10.1109/ICoSEIT60086.2024.10497524**.
- [3] T. S. Gunawan, M. A. F. Muza Rudin, M. Karti Wi and N. M. Yusoff, “Enhancing Classroom Engagement using Real-Time Student Attention Monitoring with YOLOv9,” in Proc. 2024 IEEE Conf. Syst., Process Control Instrum. (ICSIMA), 2024, **Doi: 10.1109/ICSIMA62563.2024.10675573**.
- [4] S. Rawat, M. Rodrigues, P. Sheregar and K. A. Wagaskar, “Computer Vision Based Hybrid Classroom Attention Monitoring,” in Proc. 2024 IEEE Int. Conf. Technol., Eng. Indus. Compute. Sci. (ICITEICS), 2024, **Doi: 10.1109/ICITEICS61368.2024.10624965**.
- [5] M. Guitert Catasús, T. Romeu Fontanilla and J. P. Cerro Martínez, “Teacher Empowerment to Optimize Student Monitoring and Assessment: A Holistic Approach to Learning Analytics in Digital Environments,” in Proc. INTED2024, pp. 3242–3248, 2024, **Doi: 10.21125/inted.2024.0792**.
- [6] Z. Trabelsi, F. Alnajjar, M. M. A. P. Par Ambil, M. Go Choo and L. Ali, “Real-Time Attention Monitoring System for Classroom: A Deep Learning Approach for Student’s Behavior Recognition,” Big Data Cog. Compute., vol. 7, no. 1, p. 48, 2023., **Doi:10.3390/bdcc7010048**.
- [7] Mr. Pathan Ahmed Khan, Dr. M.A Bari, : Impact Of Emergence With Robotics At Educational Institution And Emerging Challenges”, International Journal of Multidisciplinary Engineering in Current Research(IJMEC), ISSN: 2456-4265, Volume 6, Issue 12, December 2021,Page 43-46
- [8] Shahanawaj Ahamad, Mohammed Abdul Bari, Big Data Processing Model for Smart City Design: A Systematic Review “, VOL 2021: ISSUE 08 IS SN : 0011-9342 ;Design Engineering (Toronto) Elsevier SCI Oct : 021;Q4 Journal
- [9] M.A.Bari & Shahanawaj Ahamad, “Object Identification for Renovation of Legacy Code”, in International Journal of Research and Reviews in Computer Science (IJRRCS),ISSN:2079-2557,Vol:2,No:3,pp:769-773,Hertfordshire,U.K., June 2011