

Kumbh Connect: AI-Powered Solutions for Kumbh Mela

Tejas Rajendra Moule, Kunal Sanjay Patekar,
Abhay Ramesh Mishra, Assistant Professor Ganesh Keshav Gaikwad
Department of Artificial Intelligence and Data Science
MET Institute of Engineering, Nashik, Maharashtra, India

Abstract — The Kumbh Mela, one of the largest human congregations on Earth, presents significant challenges in crowd management, health response, and transportation logistics. Traditional management systems[1] often rely on manual surveillance and limited communication mechanisms, which are insufficient for real-time risk detection and decision-making. Kumbh Connect proposes a comprehensive AI-powered framework that integrates computer vision, predictive analytics, Internet of Things (IoT) sensors, and natural language processing to ensure safety, efficiency, and improved pilgrim experience. This paper surveys current research and technologies relevant to large-scale event management, identifies key challenges, and outlines potential directions for future development toward a more intelligent, connected, and secure Kumbh Mela environment.

Keywords— Kumbh Mela, Artificial Intelligence, Crowd Management, Traffic Optimization, Health & Emergency Response, Pilgrim Guidance, Computer Vision, Predictive Analytics, IoT, Chatbots Introduction (Heading 1).

I. INTRODUCTION

The Kumbh Mela, recognized by UNESCO as an Intangible Cultural Heritage of Humanity, is considered the largest religious congregation in the world. Held periodically at four locations in India—Prayagraj, Haridwar, Ujjain, and Nashik—the event attracts tens of millions of pilgrims, devotees, and tourists within a few weeks. Managing such an unprecedented influx of people in a confined geographical space poses significant challenges related to crowd control, public safety, health services, transportation, and communication infrastructure. Historically, the Kumbh Mela has faced several critical management issues, including overcrowding, stampedes, traffic congestion, and delayed emergency response. Despite extensive preparations by authorities, traditional management systems rely heavily on manual observation, static surveillance cameras, physical barricading, and human intervention, which are inadequate to handle the dynamic and unpredictable nature of crowd behavior. These traditional systems lack real-time data integration, automated alerts, and predictive decision making capabilities, resulting in delayed responses to critical situations such as sudden surges in crowd density or medical emergencies. In the era of digital transformation, the application of Artificial Intelligence (AI) and the Internet of Things (IoT) presents a groundbreaking opportunity to revolutionize event management and public safety mechanisms. AI-powered technologies can analyze large volumes of real-time data from multiple sources—such as CCTV footage, drones, GPS trackers, and environmental

sensors—to generate actionable insights that help authorities monitor, predict, and respond effectively to emerging risks. This transformation marks a shift from reactive management[8] to a proactive and intelligent decision-making model. Kumbh Connect is envisioned as a comprehensive AI-powered event management platform tailored specifically for large-scale gatherings like the Kumbh Mela. It aims to address critical management concerns through an integrated technological framework that combines multiple intelligent modules. These include: • AI-based Computer Vision: Real-time crowd monitoring using advanced deep learning models such as YOLOv8 [5] and OpenCV for people detection, density estimation, and anomaly detection in surveillance video streams. • Predictive Analytics: Machine learning algorithms including LSTM [9] and Isolation Forests are employed to forecast congestion hotspots, potential stampede zones, and medical risk areas based on historical and real-time data. • IoT Integration: Smart sensors and drones [6],[16] collect continuous environmental and location-based data (e.g., air quality, temperature, and crowd flow), ensuring better situational awareness and emergency coordination. • Multilingual Chatbot System: A voice-enabled chatbot powered by natural language processing (NLP) provides real-time assistance [12] to pilgrims in multiple languages such as Hindi, Marathi, and English, helping with navigation, ritual timings, and emergency reporting. • Centralized Command Dashboard: A unified control center visualizes live data from all modules, allowing authorities to take informed and data-driven decisions quickly and efficiently. The integration of these technologies enables real-time decision-making, faster

emergency response, and improved coordination between event organizers, law enforcement, medical teams, and transport authorities. Unlike traditional surveillance and manual communication systems, Kumbh Connect focuses on automation, scalability, and intelligence, ensuring that even minor anomalies are detected early and resolved before escalating into critical incidents. The proposed system is designed not only to improve the operational efficiency of Kumbh Mela management but also to enhance the overall experience of pilgrims by providing personalized digital assistance, seamless navigation, and safer mobility. Furthermore, the insights derived from Kumbh Connect can contribute to policy-level decisions, such as designing better infrastructure layouts, optimizing resource allocation, and planning future large-scale religious or cultural events. This paper presents a systematic overview of AI driven approaches applicable to large-scale event management, emphasizing how technologies like computer vision, predictive analytics, and IoT can be effectively leveraged for the Kumbh Mela. The remainder of the paper is structured as follows: Section II provides a detailed literature survey highlighting recent advancements and related works in AI based crowd management and smart event systems; Section III discusses key challenges associated with implementing such technologies; Section IV outlines future directions and research opportunities; and Section V concludes with insights on the societal impact and scalability of the proposed Kumbh Connect framework.

II. LITERATURE SURVEY

The evolution of smart event management has been driven by advancements in artificial intelligence, deep learning, and sensor integration. The literature in this domain can be broadly classified into four areas: crowd monitoring, predictive analytics, emergency response, and user guidance systems.

Crowd Monitoring and Computer Vision

Traditional crowd control systems rely heavily on manual observation using static CCTV cameras. However, the advent of deep learning models such as YOLO (You Only Look Once) and Faster R-CNN has revolutionized real-time object detection and people counting in dense environments. Studies such as [1] demonstrate AI-driven surveillance for large gatherings, achieving high accuracy in detecting anomalies and predicting crowd flow patterns. Recent implementations utilize YOLOv8 with OpenCV for live video analysis, providing authorities with heatmaps of crowd density and identifying regions of potential congestion. Some models also integrate optical flow tracking and semantic segmentation for finer movement prediction. Despite these advances, computational

efficiency and deployment on edge devices remain ongoing challenges.[15]

Predictive Analytics and Risk Forecasting

Predictive modeling is essential for forecasting congestion and preventing stampedes or blockages. Studies have used Long Short-Term Memory (LSTM) networks to analyze time-series data of crowd movement and predict high-risk zones before critical thresholds are reached. Other methods employ Isolation Forest algorithms for anomaly detection to identify unusual crowd behaviors that might indicate panic or over accumulation. In addition, data from IoT devices—such as temperature, air quality, and vibration sensors—are used to supplement visual inputs, providing a multi-modal framework for risk analysis. These predictive mechanisms have proven effective in reducing response times during emergencies.[9]

Emergency Response and IoT Integration

AI-powered health and safety monitoring systems are gaining traction in event management. Research [3] emphasizes the integration of wearable IoT sensors, drones, and real-time data dashboards for quick response to accidents or medical emergencies. The use of drones for aerial surveillance and sensor-equipped ambulances for dynamic routing are notable innovations that align closely with Kumbh Connect's objectives.

Pilgrim Guidance and Chatbot Systems

User experience enhancement through digital assistance is another growing area. Multilingual chatbots developed using Dialogflow and RASA frameworks provide navigation, ritual information, and emergency assistance. Integration of Transformer-based NLP models enables context-aware, voice-enabled communication that supports languages like Hindi, Marathi, and English, improving accessibility and inclusivity for diverse pilgrims.[12]

Challenges and mitigations

Despite rapid progress in the development of AI-based and IoT-enabled event management systems, several significant challenges remain in achieving reliable, efficient, and secure implementation at the scale of the Kumbh Mela. These challenges stem from technical, infrastructural, ethical, and socioeconomic factors that affect system performance and adoption. This section categorizes the major challenges and outlines corresponding mitigation strategies proposed within the scope of the Kumbh Connect framework.

Technical Challenges

One of the foremost challenges in deploying AI-powered systems for crowd management is achieving real-time

performance under hardware constraints. Deep learning models such as YOLOv8, Faster R-CNN, and LSTM [5], [7] require high computational power, which is often limited on low-cost embedded systems like Raspberry Pi or Jetson Nano. The high volume of video data generated by multiple cameras further increases latency and processing overhead. Mitigation: To address this, model optimization techniques such as quantization, pruning, and knowledge distillation can be employed to reduce computational complexity without significantly compromising accuracy. Lightweight model architectures like MobileNetV3 or Efficient Det can be utilized for edge inference. Additionally, hybrid processing architectures combining edge computing for real-time inference and cloud computing for long-term analytics can balance performance and scalability.

Infrastructure and Connectivity Constraints

The Kumbh Mela typically spans vast and semi-urban areas where internet connectivity and network reliability fluctuate significantly. Real-time synchronization between edge devices, drones, and the centralized command dashboard depends heavily on stable communication networks. Network failures or bandwidth congestion can interrupt live video streams and delay automated alerts during emergencies. Mitigation: Deploying a multi-tier network infrastructure can significantly improve reliability. Local mesh networks and 5G edge nodes can be used for short-range, high-speed communication between IoT devices. Data caching and buffering mechanisms should be integrated to ensure temporary storage during transmission delays. Furthermore, offline fail-safe modes can allow critical components like SOS detection or density monitoring to continue functioning independently even in case of network interruptions. [8]

Data Privacy, Ethics and Security

AI-driven event management systems rely on large-scale video surveillance and sensor data collection, raising critical concerns regarding privacy, consent, and data misuse. Continuous monitoring may involve capturing identifiable features such as faces or vehicle numbers, posing ethical challenges and potential violations of personal data rights. Mitigation: Privacy preservation can be ensured through data anonymization techniques such as face blurring, selective masking, and encryption of sensitive information. Secure communication protocols like SSL/TLS and blockchain-based audit trails can be implemented to maintain data integrity and prevent unauthorized access. Moreover, following government data policies and global standards such as GDPR ensures ethical compliance. Clear communication with the public about the purpose and scope of monitoring will help build transparency and trust. [12]

Cost, Scalability, and Maintenance

Deploying AI cameras, IoT sensors, and drones across large areas like the Kumbh Mela grounds can be cost-intensive. Regular maintenance and calibration of hardware devices are also essential for consistent accuracy. Additionally, as the number of data sources increases, scaling the system while maintaining performance becomes a major challenge. Mitigation: The use of open-source software frameworks such as TensorFlow, PyTorch, and OpenCV can reduce licensing costs. Leveraging existing infrastructure, such as municipal CCTV systems and government servers, can minimize additional investment. Cloud-based deployment models using “pay-as-you-use” services also make scaling economically viable. Periodic system diagnostics and automated hardware health monitoring tools can ensure long-term reliability and reduce manual maintenance effort. [8]

Social, Operational, and Human-Centric Challenges

AI-driven automation can sometimes face resistance from event staff, local authorities, and citizens unfamiliar with advanced technologies. Dependence on digital systems may also be viewed skeptically due to perceived risks of failure or bias in AI decision-making. Furthermore, language barriers, low digital literacy, and lack of trained operators may limit effective system utilization. Mitigation: Conducting training and awareness programs for officials and volunteers can enhance familiarity with AI systems and their benefits. The integration of Explainable AI (XAI) methods can increase transparency by providing interpretable outputs that justify automated decisions. Multilingual interfaces and voice-based chatbots ensure accessibility for non-technical users. Collaborations between government agencies, academic institutions, and private technology firms can also promote smoother deployment and adoption through a unified operational model.

Environmental and Sustainability Concerns

The large-scale use of electronic devices, surveillance systems, and drones can contribute to increased energy consumption and e-waste generation. Outdoor installations are also prone to damage due to extreme weather conditions, dust, and humidity. Mitigation: Incorporating energy-efficient components and solar-powered systems can reduce environmental impact. The use of weatherproof and ruggedized hardware will enhance device longevity. Lifecycle management practices, including equipment recycling and eco-friendly disposal, should be integrated into project planning to ensure environmental sustainability.

III. SYSTEM ARCHITECTURE

The proposed Kumbh Connect system architecture is designed as a scalable, modular, and intelligent framework capable of handling the complexities of large-scale events such as the Kumbh Mela. The architecture integrates Artificial Intelligence (AI), Internet of Things (IoT), computer vision, predictive analytics, and natural language processing into a unified ecosystem that supports real-time monitoring, proactive decision-making, and efficient coordination among authorities. The system follows a layered architecture consisting of five primary layers: the Data Acquisition Layer, Edge Processing Layer, AI Analytics Layer, Application Layer, and Command and Control Layer. This layered design ensures flexibility, fault tolerance, and seamless integration of heterogeneous data sources. [8]

Data Acquisition Layer

The Data Acquisition Layer serves as the foundation of the system and is responsible for collecting real-time data from multiple sources distributed across the Kumbh Mela venue. This layer includes CCTV cameras, drones, IoT sensors, GPS-enabled devices, and user interaction interfaces. High-resolution CCTV cameras and drone-mounted cameras continuously capture video streams to monitor crowd movement, density, and behavioral patterns. IoT sensors deployed at strategic locations collect environmental parameters such as temperature, humidity, air quality, noise levels, and vibration data. Wearable devices and mobile applications generate location-based and health-related data that support emergency detection and response. All collected data are time-stamped and transmitted securely to the Edge Processing Layer for preliminary analysis.

Edge Processing Layer

The Edge Processing Layer is responsible for handling real-time data processing close to the data source. This layer reduces latency, minimizes bandwidth consumption, and enables faster response during critical situations. Edge devices such as NVIDIA Jetson Nano and Raspberry Pi perform lightweight inference tasks, including preliminary crowd detection and anomaly identification using optimized deep learning models. Video streams are preprocessed through frame extraction, noise reduction, and resolution scaling before being forwarded for advanced analysis. By offloading initial computation to the edge, the system ensures uninterrupted operation even during network congestion or partial connectivity failures.

AI Analytics Layer

The AI Analytics Layer forms the intelligence core of the Kumbh Connect system. It processes aggregated data from the

Edge Processing Layer and applies advanced machine learning and deep learning algorithms to extract actionable insights. Computer vision models such as YOLOv8 [5] are used for people detection, crowd density estimation, and anomaly recognition. Predictive analytics modules employ Long Short-Term Memory (LSTM) [9] networks to analyze temporal crowd patterns and forecast congestion hotspots. Isolation Forest algorithms are utilized for detecting abnormal crowd behaviors that may indicate panic or emergency situations. Data fusion techniques combine visual, environmental, and historical data to improve prediction accuracy and reliability. The analytics results are continuously updated and shared with the Application and Command layers.

Application Layer

The Application Layer acts as the interface between the intelligent backend and end users, including pilgrims, volunteers, and authorities. This layer includes mobile applications, multilingual chatbots, and notification systems. A voice-enabled chatbot powered by Natural Language Processing (NLP) [12] provides real-time assistance related to navigation, ritual schedules, emergency reporting, and general information. The chatbot supports multiple languages such as Hindi, Marathi, and English to ensure inclusivity. Push notifications and alert systems deliver real-time warnings, route suggestions, and safety instructions to users based on AI-generated insights. This layer significantly reduces manual workload and improves user experience.

Command and Control Layer

The Command and Control Layer provides a centralized dashboard for authorities to monitor, analyze, and respond to events in real time. This layer visualizes live crowd density maps, congestion predictions, emergency alerts, and system health metrics. Authorities can make informed decisions such as rerouting pedestrian flow, deploying medical teams, or issuing public announcements based on real-time intelligence. Secure communication protocols ensure data privacy and integrity across all system components. The centralized dashboard enables coordination among police departments, medical services, disaster response teams, and event organizers, ensuring synchronized and effective operations.

System Workflow

The overall system workflow begins with real-time data collection from sensors and cameras. Edge devices perform initial processing and forward relevant data to the AI Analytics Layer. Analytical models generate predictions and alerts, which are then disseminated through the Application Layer and visualized in the Command and Control Layer. Feedback from authorities and users further refines system responses, creating

a closed-loop intelligent management system. The proposed architecture ensures scalability, resilience, and adaptability, making it suitable not only for the Kumbh Mela but also for other large-scale public events.

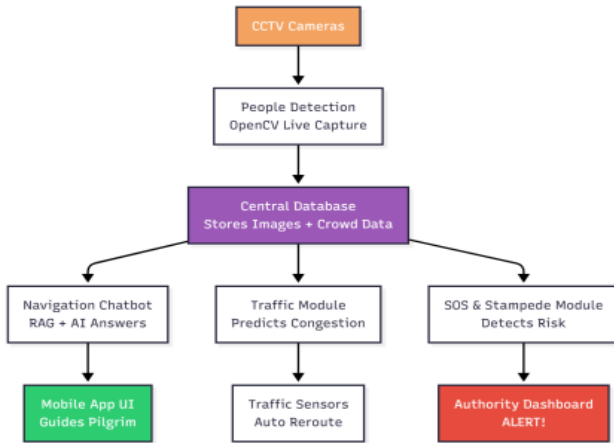


Fig. 1. Process Flow Diagram of the Proposed System.

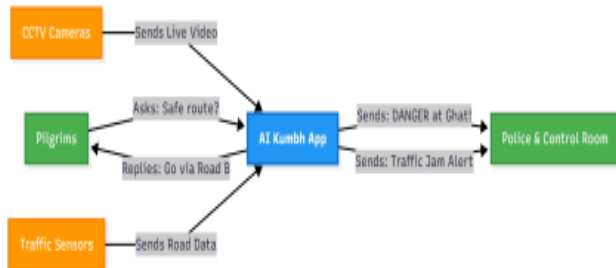


Fig. 2. Data Flow Diagram (DFD) of the Proposed System.

Mathematical Models

To quantify crowd dynamics and risks, the system incorporates several mathematical models. The crowd density is calculated as:

$$\rho = \frac{N}{A} \tag{1}$$

where ρ is the density, N is the number of people, and A is the area. The traffic flow model is given by

$$Q = \rho \times v \tag{2}$$

where Q is the flow and v is the velocity of movement. The predictive risk probability is modeled as:

$$P(R) = f(\rho, v, t) \tag{3}$$

where the risk $P(R)$ depends on density ρ , velocity v , and time

Future Scope

The future development of the Kumbh Connect framework lies in extending its technological capabilities and operational scalability to build a fully autonomous, adaptive, and intelligent event management ecosystem. With continuous advancements in artificial intelligence, edge computing, and sensor technologies, the proposed system can evolve into a resilient platform capable of handling even more complex and dynamic large-scale gatherings.

Edge Computing and Lightweight AI Models

Future enhancements should focus on deploying highly optimized deep learning models capable of running efficiently on low-power edge devices such as Raspberry Pi and NVIDIA Jetson Nano. Techniques such as model quantization, pruning, and knowledge distillation can significantly reduce computational overhead while preserving accuracy. By shifting inference tasks closer to the data source, the system can achieve ultra-low latency responses, reduced bandwidth consumption, and improved reliability during network congestion or connectivity failures. This approach will enable continuous real-time monitoring without excessive dependence on centralized cloud infrastructure.

Multi-Modal Sensor Fusion

Integrating data from multiple heterogeneous sensors including CCTV cameras, LiDAR units, GPS trackers, drones, and environmental sensors can substantially enhance situational awareness. Multi-modal sensor fusion enables the system to correlate visual, spatial, and environmental data, leading to more accurate crowd density estimation and anomaly detection. Such integration is particularly beneficial under challenging conditions such as low visibility, adverse weather, or severe crowd occlusion. Future research can explore adaptive fusion strategies that dynamically prioritize sensor inputs based on context and reliability. [9]

Large Language Model Integration

The incorporation of Large Language Models (LLMs) into the chatbot and decision-support components can significantly improve user interaction and system intelligence. Advanced LLM-based frameworks [12] can enable context-aware, conversational, and multilingual communication with pilgrims and officials. These models can also assist authorities by

summarizing live situational data, generating alerts in natural language, and supporting decision-making through automated insights. The deployment of voice-enabled digital kiosks powered by LLMs can further enhance accessibility for elderly pilgrims and users with limited literacy.

Cloud-Edge Hybrid Framework

A cloud-edge hybrid architecture represents a critical direction for future scalability and performance optimization. While edge nodes handle time-sensitive tasks such as crowd detection and anomaly alerts, cloud infrastructure can be utilized for large-scale data aggregation, long-term storage, and advanced analytics. This distributed model supports load balancing during peak event hours and enables the system to process millions of concurrent data streams efficiently. Additionally, cloud-based historical analysis can assist in postevent evaluation and future planning.

Generalization for Other Large-Scale Events

The modular and scalable design of the proposed architecture allows it to be adapted for various large-scale public gatherings beyond the Kumbh Mela. Events such as religious festivals, cultural celebrations, political rallies, and sports tournaments can benefit from the same intelligent monitoring and decision-support mechanisms. By integrating the system with existing smart city infrastructure, the framework can contribute to improved urban safety, traffic management, and emergency response. This generalization supports long-term sustainability and aligns with national initiatives focused on intelligent urban management. System Workflow

Discussion

The proposed Kumbh Connect system demonstrates the potential of integrating Artificial Intelligence, IoT, and predictive analytics for managing large-scale events like the Kumbh Mela. Although the system is conceptual, it highlights how real-time data processing and intelligent monitoring can significantly improve crowd safety, reduce congestion, and enhance emergency response.

The use of computer vision models such as YOLOv8 enables accurate crowd density estimation, while predictive models like LSTM help in identifying high-risk zones in advance. IoT sensors further enhance situational awareness by providing continuous environmental and location-based data. Additionally, the inclusion of a multilingual chatbot improves accessibility and user experience for pilgrims.

However, practical implementation may face challenges such as hardware limitations, network dependency, and data privacy concerns. Despite these limitations, the proposed framework

offers a scalable and efficient solution that can be adapted to other large-scale public events.

IV. CONCLUSION

Kumbh Connect demonstrates the significant potential of AI-powered solutions [8] in managing large-scale public events such as the Kumbh Mela by integrating computer vision, predictive analytics, Internet of Things (IoT) technologies, and natural language processing into a unified and intelligent platform. The proposed framework highlights how realtime data acquisition and automated analysis can transform conventional event management practices from reactive and manual processes into proactive, data-driven decision-making systems. The study emphasizes that advanced deep learning models and sensor-based monitoring systems can effectively address critical challenges related to crowd safety, congestion control, emergency response, and pilgrim assistance. By enabling continuous monitoring, early risk prediction, and rapid information dissemination, the proposed system enhances both operational efficiency and public safety. The integration of multilingual chatbot systems further improves accessibility and user experience by providing real-time guidance and assistance to a diverse population of pilgrims. However, despite the promising capabilities demonstrated by the proposed architecture, several challenges remain, particularly in terms of real-time performance, scalability, data privacy, and ethical deployment of AI technologies. Issues such as network reliability, computational constraints on edge devices, and concerns regarding surveillance and data misuse must be carefully addressed to ensure responsible and sustainable implementation. Future research efforts should focus on the development of lightweight, interpretable, and privacy-preserving AI models capable of operating autonomously under real-world conditions. The adoption of edge computing, [12] federated learning, and explainable AI techniques can further enhance system reliability and public trust. Additionally, large-scale pilot deployments and collaboration between government authorities, academic institutions, and technology providers will be essential for validating system effectiveness in real operational environments. The successful implementation of Kumbh Connect has the potential to serve as a scalable blueprint for intelligent event management systems across various domains, including religious gatherings, cultural festivals, political rallies, and sports events. By leveraging emerging technologies responsibly, such systems can ensure that digital innovation not only improves efficiency but also safeguards human life and enriches the overall experience of millions of participants in large-scale cultural and social events.

REFERENCES

1. IEEE Xplore, "AI Surveillance at Kumbh Mela," Available: <https://ieeexplore.ieee.org/document/9137860>
2. IEEE Xplore, "Crowd Detection Survey," Available: <https://ieeexplore.ieee.org/document/4153142>
3. SpringerLink, "AI-Based Solutions in Smart City Crowd Management," *Multimedia Tools and Applications*, 2020.
4. Government of Uttar Pradesh, "Prayagraj Kumbh 2024 – Official Report,"
5. A. R. Mankar and S. Patil, "Real-Time Crowd Density Estimation Using Deep Learning and Edge Computing," *IEEE Access*, vol. 11, pp. 78543–78555, Aug. 2023, doi: 10.1109/ACCESS.2023.3298712.
6. M. A. Khan, H. Ullah, and F. Hussain, "AI-driven IoT Framework for Intelligent Crowd and Traffic Management in Smart Cities," *Array*, vol. 25, p. 100411, Apr. 2024, doi: 10.1016/j.array.2024.100411.
7. R. Singh and P. Garg, "Deep Learning-based Crowd Flow Prediction for Large Gatherings using Spatiotemporal Networks," *Multimedia Tools and Applications*, Springer, 2023, doi: 10.1007/s11042-023-15623-8.
8. J. Anjom, M. Hossain, and R. I. Chowdhury, "A Scalable AI-based System for Smart Event Management Using Edge Intelligence," *IEEE Internet of Things Journal*, vol. 10, no. 5, pp. 4532–4544, May 2024, doi: 10.1109/JIOT.2024.3365129.
9. P. Li, Z. Wang, and L. Zhao, "Predictive Crowd Analytics Using LSTM and Spatial Data Fusion for Public Safety," *Expert Systems with Applications*, vol. 231, p. 120841, Feb. 2024, doi: 10.1016/j.eswa.2023.120841.
10. N. Yalcin and M. Alisawi, "Enhancing Social Interaction for the Visually Impaired: Real-Time Emotion Recognition Using Smart Glasses and Deep Learning," *IEEE Access*, Jun. 2025, doi: 10.1109/ACCESS.2025.3577106.
11. A. Thakur, R. S. Prasad, and V. Jha, "A Drone-based Crowd Monitoring and Alerting System Using Computer Vision," *Journal of Ambient Intelligence and Humanized Computing*, Springer, 2023, doi: 10.1007/s12652-023-04312-y. [
12. S. Mehta and H. Sharma, "Federated Learning-based Crowd Analytics for Privacy-Preserving Smart Event Monitoring," *Information Sciences*, Elsevier, vol. 649, pp. 432–448, 2025, doi: 10.1016/j.ins.2025.02.014.
13. R. I. Chowdhury, J. Anjom, and M. I. A. Hossain, "Edge IntelligenceBased Safer Footpath Navigation Using Computer Vision," *Journal of King Saud University – Computer and Information Sciences*, 2024
14. S. Zhang, L. Qin, and H. Li, "Real-Time Crowd Behavior Analysis Using Deep Neural Networks," *Pattern Recognition Letters*, Elsevier, vol. 158, pp. 12–20, 2022
15. Y. Chen and X. Luo, "Vision-based Crowd Density Estimation for Smart Surveillance Systems," *IEEE Transactions on Intelligent Transportation Systems*, vol. 23, no. 8, pp. 11034–11045, 2022.