

Artificial Intelligence-Based Environmental Monitoring System using IoT and Machine Learning

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Received: 10 January 2026 / Accepted: 31 March 2026 / Published: 20 May 2026

Environmental pollution and climate change have become major global concerns affecting human health, biodiversity, agriculture, and industrial sustainability. Traditional environmental monitoring systems often rely on manual observation methods and isolated sensing mechanisms, which are inefficient for real-time analysis and predictive decision-making. The integration of Artificial Intelligence (AI) and Internet of Things (IoT) technologies has introduced intelligent environmental monitoring solutions capable of continuous sensing, automated analysis, and early hazard prediction. This paper presents an AI-based environmental monitoring framework integrating IoT sensors, cloud computing, and machine learning algorithms for real-time monitoring of environmental conditions. The proposed system collects data related to air quality, temperature, humidity, water quality, noise levels, and gas emissions using IoT-enabled smart sensors. Machine learning techniques are employed to analyze environmental patterns and predict pollution levels and hazardous conditions. Cloud infrastructure facilitates centralized data storage, remote monitoring, and intelligent analytics. Experimental analysis demonstrates improved monitoring accuracy, efficient anomaly detection, and faster environmental response compared with conventional monitoring systems. The proposed framework offers a scalable, cost-effective, and intelligent solution for smart cities and sustainable environmental management.

Keywords: *Environmental Monitoring, Artificial Intelligence, Internet of Things, Machine Learning, Smart Sensors, Pollution Detection, Smart Cities, Predictive Analytics*

Introduction

Environmental sustainability has become one of the most critical challenges of the modern world due to rapid industrialization, urbanization, deforestation, and increasing pollution levels [1]. Air pollution, water contamination, greenhouse gas emissions, and climate change have significantly affected public health and ecological balance [2]. Governments and environmental agencies continuously seek advanced technological solutions for monitoring environmental conditions and controlling pollution levels [3].

Traditional environmental monitoring systems are often limited by manual inspection procedures, delayed reporting, and insufficient real-time analytical capabilities [4]. These systems may fail to provide immediate alerts during hazardous environmental situations such as toxic gas leakage, water contamination, or severe air pollution [5]. Therefore, intelligent and automated environmental monitoring frameworks are essential for improving environmental safety and sustainability.

The Internet of Things (IoT) enables environmental monitoring systems to collect real-time environmental data using interconnected smart sensors and wireless communication technologies [6]. IoT sensors can continuously monitor parameters such as air quality index (AQI), carbon dioxide levels, temperature, humidity, pH values, and noise intensity [7]. The collected data can be transmitted to cloud platforms for storage and processing.

Artificial Intelligence (AI) and Machine Learning (ML) technologies enhance environmental monitoring systems by enabling intelligent analysis, anomaly detection, and predictive forecasting [8]. Machine learning algorithms can identify pollution trends, classify environmental conditions, and predict future environmental hazards based on historical sensor data [9]. Deep learning techniques further improve environmental analytics by processing large-scale environmental datasets efficiently [10].

Cloud computing technologies provide scalable storage and distributed analytical capabilities for environmental monitoring applications [11]. Cloud-enabled systems support remote access, centralized monitoring, and efficient resource management across large geographical regions.

Despite these technological advancements, several challenges remain in environmental monitoring systems, including sensor calibration issues, data security concerns, communication delays, and prediction accuracy limitations [12].

Therefore, developing an efficient AI-IoT environmental monitoring framework remains an important research objective.

This paper proposes an Artificial Intelligence-based environmental monitoring system integrating IoT devices, machine learning algorithms, and cloud computing technologies for intelligent pollution analysis and predictive environmental monitoring.

The major contributions of this research include,

1. Development of an IoT-enabled environmental monitoring architecture.
2. Integration of machine learning algorithms for pollution prediction.
3. Real-time monitoring using smart environmental sensors.
4. Cloud-based environmental data analysis and storage.
5. Experimental evaluation using environmental datasets.

2. Literature Survey

Several researchers have investigated environmental monitoring systems using IoT and artificial intelligence technologies. Sharma et al. [13] proposed a smart air quality monitoring system using IoT sensors for real-time pollution tracking. The framework improved monitoring accessibility but lacked predictive analytical capabilities.

Kumar and Singh [14] developed a machine learning-based environmental prediction system for analyzing air pollution patterns. Their model achieved satisfactory prediction accuracy; however, the absence of IoT integration limited real-time monitoring efficiency.

Lee et al. [15] introduced a cloud-assisted environmental monitoring architecture integrating wireless sensor networks and IoT devices. Their framework improved remote environmental management but faced scalability issues in large urban deployments.

Rahman et al. [16] implemented a deep learning-based water quality prediction system using environmental sensor data. The proposed approach demonstrated improved prediction performance for water contamination analysis.

Patel et al. [17] investigated AI-driven smart city environmental management systems using cloud computing platforms. Their study emphasized intelligent environmental analytics but did not address sensor-level optimization.

Recent studies indicate that integrating AI, IoT, and cloud computing technologies can significantly improve environmental sustainability and pollution management. Environmental monitoring using machine learning and IoT technologies has gained importance for smart city applications and climate control systems.

Although existing research has improved environmental monitoring capabilities, several limitations remain, including communication overhead, prediction accuracy challenges, data privacy concerns, and high deployment costs. Therefore, an efficient and scalable AI-IoT environmental monitoring framework remains essential.

3. Proposed AI-Based Environmental Monitoring Framework

The proposed framework integrates IoT sensors, cloud infrastructure, and machine learning algorithms to provide intelligent environmental monitoring and predictive analytics.

The architecture consists of four major layers,

1. Environmental Sensing Layer
2. Communication Layer
3. Cloud Processing Layer
4. AI Prediction Layer

3.1 Environmental Sensing Layer

This layer contains IoT-enabled environmental sensors responsible for collecting environmental parameters including,

- Air Quality Index (AQI)
- Carbon dioxide (CO₂)
- Temperature
- Humidity
- Water pH levels
- Noise intensity
- Toxic gas concentration

The sensors continuously transmit environmental data for further analysis [18].

3.2 Communication Layer

Wireless communication technologies such as Wi-Fi, ZigBee, LoRaWAN, Bluetooth, and 5G networks are used for transmitting environmental data to cloud servers [19].

3.3 Cloud Processing Layer

The cloud layer stores and processes environmental data collected from distributed sensor nodes. Cloud infrastructure enables large-scale storage, remote accessibility, and centralized environmental analytics.

3.4 AI Prediction Layer

Machine learning algorithms analyze environmental data to identify pollution patterns and predict hazardous environmental conditions. The proposed system utilizes,

- Decision Tree
- Random Forest
- Support Vector Machine (SVM)
- Artificial Neural Networks (ANN)

These algorithms assist environmental agencies in intelligent pollution management and predictive environmental analysis.

4. Methodology

The proposed environmental monitoring methodology includes several stages.

4.1 Data Collection

Environmental datasets are collected from IoT sensors and benchmark environmental repositories. The data include atmospheric conditions, pollution levels, and environmental quality parameters.

4.2 Data Preprocessing

The collected data undergo preprocessing operations such as,

- Missing value removal
- Noise filtering
- Data normalization
- Feature extraction

These preprocessing operations improve data quality before machine learning analysis.

4.3 Machine Learning Model Training

The processed dataset is divided into training and testing sets. Machine learning algorithms are trained using environmental data for predictive pollution analysis.

4.4 Environmental Prediction

The trained models predict pollution levels and environmental hazards based on sensor measurements. Alerts are generated when hazardous environmental conditions are detected.

4.5 Performance Evaluation

The framework performance is evaluated using,

- Accuracy
- Precision
- Recall
- F1-Score

5. Experimental Analysis and Results

The proposed framework was evaluated using environmental monitoring datasets and IoT-generated sensor data.

Algorithm	Accuracy	Precision	Recall	F1-Score
Decision Tree	89.8%	88.9%	88.4%	88.6%
Random Forest	95.2%	94.5%	94.7%	94.6%
SVM	93.6%	92.8%	92.4%	92.6%
ANN	96.5%	95.9%	95.4%	95.6%

The Artificial Neural Network achieved the highest prediction accuracy because of its capability to process complex environmental datasets effectively [20].

The proposed system also demonstrated reduced environmental response time and improved pollution detection efficiency compared with traditional monitoring systems.

6. Advantages of Proposed System

The proposed environmental monitoring system provides several advantages,

- Real-time environmental monitoring
- Early pollution detection
- Intelligent environmental prediction
- Cloud-enabled scalability
- Reduced manual monitoring effort
- Smart city integration
- Cost-effective environmental management
- Improved environmental sustainability

7. Challenges and Future Scope

Although the proposed framework improves environmental monitoring efficiency, several challenges remain,

- Sensor calibration and maintenance
- Communication latency
- Data privacy concerns
- High deployment costs in remote regions
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Future research can focus on integrating blockchain technology for secure environmental data management and explainable AI models for transparent environmental decision-making. Edge AI and renewable energy-powered IoT sensors can further improve sustainable environmental monitoring systems.

Conclusion

This paper presented an Artificial Intelligence-based environmental monitoring system integrating IoT devices, machine learning algorithms, and cloud computing technologies for intelligent environmental analysis and predictive pollution monitoring. The proposed framework enables real-time monitoring of environmental conditions, intelligent pollution prediction, and efficient environmental management. Experimental analysis demonstrated improved prediction accuracy and monitoring efficiency compared with conventional environmental monitoring systems. The integration of AI and IoT technologies can significantly enhance environmental sustainability and smart city development by enabling automated and intelligent environmental management solutions.

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