

Empathetic AI for Preventive Healthcare in Smart Air Quality Monitoring

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ABSTRACT

Air pollution has become one of the most critical global public health challenges, contributing to respiratory diseases, cardiovascular conditions, mental stress, and reduced quality of life, particularly in urban regions. Conventional air quality monitoring systems primarily focus on technical measurements and pollutant indicators while often neglecting emotional, behavioral, and social dimensions of environmental healthcare communication. This study proposes a human-centered framework integrating Empathetic Artificial Intelligence (EAI) into Smart Air Quality Monitoring Systems (Smart AQMS) to enhance preventive healthcare and sustainable community wellbeing. The novelty lies in combining IoT-based environmental sensing, AI-driven predictive analytics, and empathy-oriented communication mechanisms within a unified environmental healthcare ecosystem aligned with Orange Technology principles. Using a qualitative conceptual methodology through interdisciplinary literature synthesis, the study explores relationships among environmental health monitoring, empathetic computing, healthcare informatics, and human-computer interaction. The proposed framework includes real-time pollutant detection, cloud-based decision support systems, personalized healthcare recommendations, and emotionally intelligent communication interfaces to improve health awareness and preventive behavioral responses. The study proposes that an empathetic Smart AQMS may strengthen public trust in digital healthcare systems, enhance environmental health literacy, reduce psychological distress during pollution events, and support vulnerable populations through culturally sensitive communication. Furthermore, the framework contributes to Sustainable Development Goals (SDGs 3, 9, 11, and 13) by promoting inclusive and sustainable healthcare innovation. This study provides theoretical contributions to empathetic AI research and offers implications for policymakers, healthcare institutions, and smart city developers in designing compassionate environmental healthcare systems.

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1. INTRODUCTION

The rapid advancement of urbanization, industrialization, and transportation systems has significantly increased environmental pollution levels worldwide [1]. Among various environmental challenges, air pollution remains one of the leading contributors to global health risks, causing millions of premature deaths annually. Exposure to particulate matter (PM_{2.5} and PM₁₀), nitrogen dioxide (NO₂), sulfur dioxide (SO₂), ozone (O₃), and carbon monoxide (CO) has been associated with respiratory infections, asthma, chronic obstructive pulmonary disease (COPD), cardiovascular complications, and mental health disturbances [2]. In densely populated urban environments, prolonged exposure to polluted air can also contribute to anxiety, stress, decreased cognitive performance, and reduced overall wellbeing.

Traditional air quality monitoring approaches have primarily focused on pollutant measurement accuracy and environmental reporting. Although these systems are valuable for environmental management, many existing solutions fail to address how air quality information is communicated to communities, especially vulnerable populations such as children, elderly individuals, pregnant women, and people with chronic diseases [3]. Most current monitoring systems provide numerical data without contextual health interpretation, emotional support, or personalized recommendations. As a result, public engagement with environmental health information often remains limited.

In recent years, Artificial Intelligence (AI) technologies have transformed healthcare systems through predictive analytics, intelligent diagnostics, remote monitoring, and decision support systems [4]. However, the increasing reliance on automation in healthcare has also raised concerns regarding the loss of empathy, emotional understanding, and human-centered communication. This issue has become particularly important within digital health ecosystems, where patients may interact more frequently with intelligent systems than with healthcare professionals [5].

The emergence of Empathetic Artificial Intelligence (EAI) offers a promising solution to bridge technological efficiency and emotional intelligence [6]. EAI refers to AI systems capable of recognizing emotional states, understanding human contexts, and delivering responses that consider psychological and emotional wellbeing. Rather than replacing healthcare professionals, empathetic AI seeks to enhance patient support, improve communication quality, and foster trust between humans and intelligent systems [7]. Simultaneously, Smart Air Quality Monitoring Systems (Smart AQMS) have evolved through the integration of Internet of Things (IoT) technologies, wireless sensor networks, cloud computing, and machine learning algorithms. These technologies enable real time monitoring, predictive analytics, and automated environmental management. Despite these advancements, the integration of empathy oriented AI into environmental health systems remains under-explored [8].

This paper proposes a conceptual framework that integrates empathetic AI into Smart AQMS for preventive community healthcare. The study argues that environmental health systems should not only provide technical environmental measurements but also deliver emotionally aware, culturally sensitive, and health oriented recommendations that empower communities to make informed decisions [9]. By integrating empathetic communication mechanisms into environmental monitoring systems, communities can better understand health risks, adopt preventive behaviors, and maintain psychological wellbeing during environmental crises. Through this study, the paper contributes to the growing discourse surrounding compassionate AI systems capable of supporting both physical and emotional dimensions of public health [10].

2. LITERATURE REVIEW

2.1. Air Pollution and Public Health

Air pollution is widely recognized as a critical environmental determinant of human health. According to global environmental health studies, long term exposure to polluted air contributes significantly to respiratory illnesses, cardiovascular diseases, lung cancer, and neurological disorders. Fine particulate matter (PM_{2.5}) is particularly dangerous because its microscopic particles can penetrate deep into the lungs and bloodstream [11]. Urban populations are especially vulnerable due to increasing traffic density, industrial activities, and limited green infrastructure. Environmental pollution has also been linked to mental health outcomes, including anxiety, depression, and emotional distress. During periods of severe air pollution, communities may experience fear and uncertainty regarding outdoor activities, school attendance, and long term health consequences [12]. Preventive healthcare approaches emphasize the importance of early detection, continuous monitoring, and proactive public awareness. Therefore, integrating environmental monitoring into healthcare ecosystems

can improve public health preparedness and reduce disease burden.

2.2. Smart Air Quality Monitoring Systems (Smart AQMS)

Smart AQMS represent intelligent environmental monitoring platforms that integrate Internet of Things (IoT) devices, wireless communication technologies, cloud computing infrastructures, and AI based analytics to measure, analyze, and interpret air quality conditions in real time [13]. Compared to traditional air monitoring stations, Smart AQMS offers more flexible, scalable, and responsive environmental monitoring capabilities through continuous data collection and automated information processing. These systems enable real time environmental observation, remote accessibility through mobile and web based applications, interactive data visualization, and predictive analytics for pollution forecasting. In addition, the utilization of low-cost sensors allows broader deployment across urban and rural regions, making environmental monitoring more accessible and cost efficient [14].

The integration of Smart AQMS within smart city ecosystems also supports data driven environmental governance and sustainable urban management. Modern Smart AQMS platforms increasingly employ machine learning algorithms for pollutant prediction, anomaly detection, and environmental pattern recognition [15]. AI driven forecasting models enable authorities and healthcare institutions to anticipate hazardous pollution levels before they reach critical conditions, thereby supporting preventive healthcare interventions and early warning systems. Despite these technological advancements, many existing Smart AQMS implementations remain highly technical and data oriented.

Environmental information is frequently presented in numerical or graphical formats without translating pollution risks into actionable, emotionally understandable, and user centered health guidance [16]. Consequently, users may struggle to interpret environmental threats or fail to adopt appropriate preventive behaviors. This limitation highlights the urgent need for more human centered environmental healthcare systems that combine technical intelligence with empathetic communication approaches.

2.3. Empathetic Artificial Intelligence

EAI represents an emerging branch of AI research focused on enabling intelligent systems to recognize emotions, interpret contextual human behaviors, and provide emotionally sensitive interactions [17]. Unlike conventional AI systems that primarily emphasize efficiency, automation, and computational accuracy, empathetic AI prioritizes emotional wellbeing, trust, and compassionate communication within human-machine interactions. The primary objective of empathetic AI is not to replace human empathy, but rather to support more meaningful, responsive, and psychologically aware digital experiences.

The application of empathetic AI has expanded across multiple sectors, including healthcare, mental health support, elderly care, education, and customer service [18]. Within healthcare environments, empathetic AI systems can identify emotional distress through language patterns, behavioral indicators, and interaction contexts, enabling the delivery of more personalized and supportive healthcare recommendations. Furthermore, empathetic AI may improve patient engagement, strengthen communication between healthcare providers and patients, and support mental wellbeing through adaptive and emotionally aware interactions. Technologies such as Natural Language Processing (NLP), sentiment analysis, affective computing, and behavioral analytics serve as foundational components for developing emotionally intelligent AI systems capable of understanding both verbal and nonverbal human responses.

The concept of machine empathy has gained increasing attention as healthcare organizations recognize the importance of emotional intelligence in digital healthcare ecosystems [19]. Empathy oriented systems may improve adherence to healthcare recommendations by presenting information in supportive, understandable, and psychologically comforting ways. In environmental healthcare contexts, empathetic AI can transform technical pollution alerts into compassionate health guidance that encourages preventive action without creating unnecessary fear or anxiety among users.

2.4. Orange Technology and Human-Centered Innovation

Orange Technology represents a human-centered innovation paradigm that emphasizes emotional wellbeing, social care, cultural sensitivity, and sustainable happiness within technological development. Unlike conventional technological approaches that focus primarily on efficiency, automation, and productivity enhancement, Orange Technology seeks to create systems that nurture psychological comfort, social harmony, and community resilience [20].

This paradigm highlights the importance of designing technologies that not only solve technical problems but also improve emotional and social quality of life. Within healthcare environments, Orange Technology promotes the development of emotionally intelligent healthcare systems capable of delivering compassionate digital interactions, supporting mental wellbeing, and improving inclusive healthcare accessibility. Furthermore, Orange Technology strongly emphasizes ethical technology design to ensure that intelligent systems remain socially responsible, culturally adaptive, and psychologically supportive [21].

The integration of empathetic AI into Smart AQMS aligns closely with Orange Technology principles because environmental healthcare communication requires emotional sensitivity, particularly during pollution emergencies, climate related crises, and public health disruptions. By combining intelligent environmental monitoring with emotionally supportive communication, empathetic Smart AQMS can contribute to healthier, more resilient, and socially connected communities [22].

2.5. Human-Computer Interaction in Healthcare

Human-Computer Interaction (HCI) research focuses on improving usability, accessibility, user experience, and behavioral engagement within digital systems. In healthcare environments, HCI principles are particularly important because intelligent technologies must remain understandable, trustworthy, and emotionally supportive for users with diverse backgrounds and health conditions [7]. Effective healthcare interfaces should not only provide accurate information but also encourage positive user engagement and reduce psychological barriers associated with technology adoption.

Poorly designed healthcare interfaces may increase user anxiety, reduce trust in digital systems, and discourage long term adoption of intelligent healthcare technologies. Conversely, empathetic and user friendly interfaces can improve health literacy, strengthen community participation, and encourage preventive healthcare behaviors. In environmental healthcare systems, emotionally supportive communication interfaces may help users better understand pollution related health risks and adopt healthier behavioral responses [23].

Several HCI theories, including the Unified Theory of Acceptance and Use of Technology (UTAUT2) and Technology Readiness (TR), suggest that emotional perception, perceived usefulness, trust, and ease of use significantly influence user acceptance and adoption of intelligent systems. These theoretical perspectives indicate that technological success depends not only on system functionality but also on users emotional and psychological experiences during interaction. Therefore, integrating empathetic HCI principles into Smart AQMS may substantially improve public participation in preventive environmental healthcare while strengthening trust in AI driven healthcare technologies.

To identify existing research gaps and emphasize the novelty of the proposed framework, Table 1 compares previous studies related to Smart AQMS, AI analytics, empathetic AI technologies, preventive healthcare systems, personalized healthcare recommendations, and community-centered environmental healthcare approaches [24].

Table 1. Comparison of Previous Studies and Research Gap Identification

Studies	Smart AQMS	AI Analytics	Empathetic AI	Preventive Healthcare	Personalized Recommendation	Community Engagement
Environmental Monitoring Systems		–	–	–	–	–
AI-Based Pollution Prediction Models			–		–	–
Healthcare Decision Support Systems	–		–			–
Empathetic AI in Digital Healthcare	–					–
Smart City Environmental Platforms			–	–	–	
IoT-Based Preventive Healthcare Systems			–			–
Human-Centered Healthcare Technologies					–	
Proposed Empathetic Smart AQMS Framework						

As presented in Table 1, previous studies have primarily focused on isolated technological components such as environmental sensing, AI based pollution prediction, healthcare recommendation systems, or smart city monitoring infrastructures [25]. Although several studies have explored empathetic AI and preventive healthcare independently, limited research has comprehensively integrated environmental intelligence, emotionally aware communication, personalized healthcare recommendations, and community engagement mechanisms into a unified Smart AQMS framework. Therefore, this study proposes a human centered en-

vironmental healthcare framework that combines intelligent environmental monitoring with empathetic AI to support sustainable preventive community healthcare ecosystems [26].

3. RESEARCH METHODOLOGY

This study adopts a qualitative conceptual research methodology through an interdisciplinary literature synthesis approach. The research integrates theoretical and practical insights from multiple domains, including environmental health, AI, healthcare informatics, smart city development, human computer interaction, and empathetic technology studies [27]. The interdisciplinary nature of this research is important because the integration of empathetic AI into environmental healthcare systems requires a comprehensive understanding of both technological and human centered perspectives. Rather than focusing on experimental testing, this study emphasizes conceptual exploration and theoretical framework development to address emerging challenges within preventive environmental healthcare [28].

3.1. Research Design

The study employs a conceptual framework development approach aimed at constructing a human-centered model for integrating empathetic AI into Smart AQMS. Conceptual research is considered appropriate because the topic represents an emerging interdisciplinary field that still lacks comprehensive theoretical integration [29]. The proposed approach enables the study to synthesize knowledge from diverse academic disciplines and identify relationships among environmental monitoring technologies, empathetic computing, and preventive healthcare systems. Furthermore, this research design supports the exploration of innovative ideas and strategic healthcare solutions that may guide future empirical investigations and practical implementations [30].

3.2. Data Collectiong

The study relies on secondary data collected from various scholarly and professional sources, including peer reviewed journal articles, conference proceedings, healthcare AI reports, environmental health studies, smart city and Internet of Things (IoT) literature, human computer interaction publications, and sustainable development reports [31]. The literature selection process focused on publications discussing AI in healthcare, environmental health monitoring systems, empathetic computing technologies, preventive healthcare frameworks, smart city innovations, and human centered AI models. By reviewing interdisciplinary literature, the study aims to identify current technological developments, conceptual gaps, and emerging opportunities related to empathetic environmental healthcare systems [32].

3.3. Analytical Approach

This research utilizes thematic synthesis to examine relationships among empathetic AI, environmental monitoring technologies, preventive healthcare strategies, and human centered technology design principles. Thematic analysis was conducted to identify recurring concepts, technological patterns, and healthcare communication challenges discussed across the selected literature [33]. Through this process, the study systematically analyzed the technological components of Smart AQMS, the capabilities of empathy driven AI systems, the integration of healthcare communication principles, and the ethical implications associated with intelligent healthcare technologies. The analytical approach also considers sustainability perspectives and the social dimensions of healthcare innovation in order to construct a more comprehensive and human centered conceptual framework [34].

3.4. Conceptual Framework Development

Based on the thematic synthesis findings, this study proposes an integrated conceptual framework that combines IoT based environmental sensing technologies, AI driven predictive analytics, empathetic communication modules, personalized healthcare recommendation systems, community centered digital interfaces, and ethical governance mechanisms related to privacy and data protection. The framework is designed to support preventive healthcare by transforming environmental monitoring systems into emotionally intelligent healthcare support platforms capable of improving health awareness, behavioral responses, and community engagement. In addition, the integration of empathetic AI aims to maintain emotional wellbeing and strengthen public trust in digital healthcare technologies. Through this human centered approach, the proposed framework contributes to the development of sustainable and compassionate environmental healthcare ecosystems.

4. PROPOSED EMPATHETIC SMART AQMS FRAMEWORK

4.1. Framework Overview

The proposed Empathetic Smart AQMS framework introduces an empathy oriented layer into conventional environmental monitoring architectures to create a more human-centered preventive healthcare ecosystem [35]. Unlike traditional air quality monitoring systems that primarily function as technical environmental measurement tools, the proposed framework is designed to operate as an intelligent healthcare companion capable of supporting emotional wellbeing, personalized health communication, and community engagement.

The framework integrates multiple interconnected components consisting of the Environmental Sensing Layer, Data Intelligence Layer, Empathy Recognition Layer, Personalized Health Recommendation Layer, and Community Engagement Layer. These layers work collaboratively to transform environmental data into actionable, emotionally supportive, and health oriented information. Through this integrated approach, the framework not only improves technical monitoring efficiency but also strengthens compassionate healthcare delivery and public trust in digital environmental health technologies.

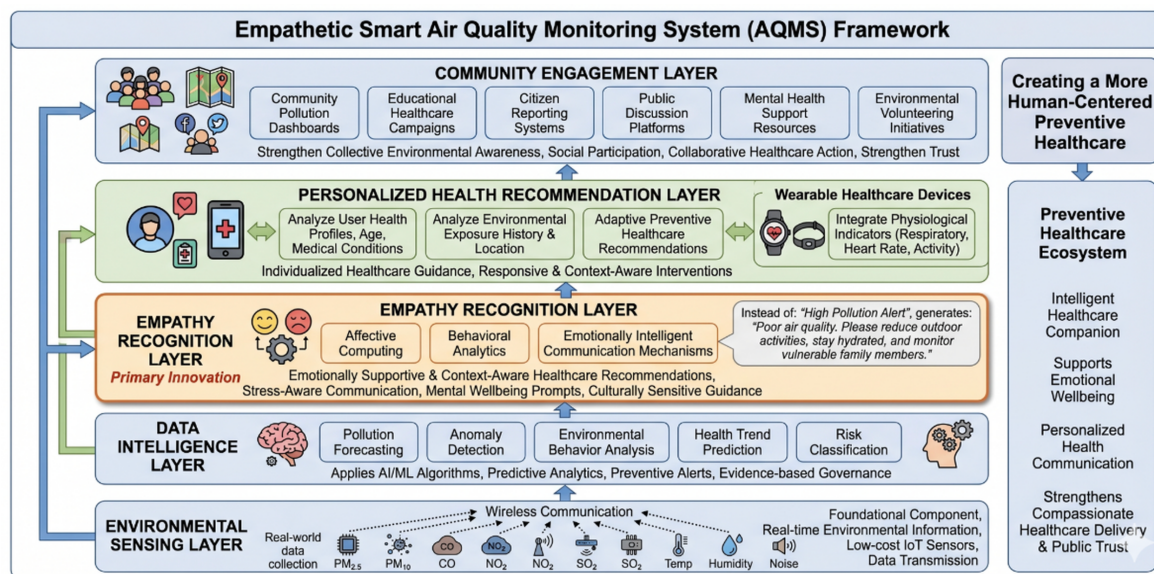


Figure 1. Proposed Empathetic AQMS Framework

4.2. Environmental Sensing Layer

The Environmental Sensing Layer functions as the foundational component of the proposed framework by collecting real time environmental information through Internet of Things (IoT) enabled sensors and wireless communication technologies. This layer continuously measures critical environmental indicators such as PM_{2.5} concentration, PM₁₀ concentration, carbon monoxide levels, nitrogen dioxide levels, sulfur dioxide levels, temperature, humidity, and noise pollution intensity. The collected environmental data are transmitted through wireless sensor networks into cloud based platforms for storage, processing, and further analysis. The utilization of low cost sensor technologies enables broader system deployment across urban and rural regions, particularly in developing countries and underserved communities where conventional large scale monitoring infrastructure may be limited. Consequently, the Environmental Sensing Layer supports wider environmental healthcare accessibility while ensuring continuous environmental surveillance and real time public health awareness.

4.3. Data Intelligence Layer

The Data Intelligence Layer applies AI and machine learning algorithms to analyze environmental patterns, classify pollution risks, and predict future air quality conditions. This layer performs several important analytical functions, including pollution forecasting, anomaly detection, environmental behavior analysis, health trend prediction, and risk classification based on real-time environmental data. Through predictive analytics, AI models can identify high risk environmental periods before pollution levels become dangerous, enabling authorities and healthcare institutions to issue preventive alerts and implement early intervention strate-

gies. In addition, the integration of intelligent analytics allows the system to recognize long term environmental patterns associated with public health risks, thereby supporting evidence based environmental governance and preventive healthcare planning. The predictive capabilities of this layer contribute significantly to reducing healthcare burdens by encouraging earlier community responses to environmental threats.

4.4. Empathy Recognition Layer

The Empathy Recognition Layer represents the primary innovation of the proposed framework by integrating affective computing, behavioral analytics, and emotionally intelligent communication mechanisms into environmental healthcare systems. Unlike conventional monitoring systems that present rigid technical alerts, this layer enables the Smart AQMS to deliver emotionally supportive and context aware healthcare recommendations. The system can generate emotion sensitive notifications, adaptive language personalization, stress aware communication, mental wellbeing prompts, and culturally sensitive healthcare guidance based on user conditions and environmental contexts. For instance, instead of displaying a generic pollution warning, the system may provide supportive recommendations such as advising users to reduce outdoor activities, stay hydrated, and monitor vulnerable family members during periods of poor air quality. This empathetic communication approach may reduce public panic, improve emotional resilience, and encourage preventive healthcare behaviors more effectively. By incorporating emotional intelligence into environmental monitoring, the framework promotes a more compassionate and psychologically supportive healthcare experience.

4.5. Personalized Health Recommendation Layer

The Personalized Health Recommendation Layer is responsible for generating individualized healthcare guidance based on environmental exposure data and user specific characteristics. The system analyzes factors such as user health profiles, age groups, existing medical conditions, environmental exposure history, geographic location, and behavioral patterns to provide adaptive preventive healthcare recommendations. Personalized outputs may include asthma prevention alerts, recommended outdoor activity schedules, indoor air purification suggestions, mask usage guidance, hydration reminders, and stress reduction recommendations. Furthermore, the framework may integrate with wearable healthcare devices to monitor physiological indicators such as respiratory rate, heart rate, and physical activity levels. This integration enables more responsive and context aware healthcare interventions that support both physical and emotional wellbeing. Through personalized recommendations, the system enhances user engagement and strengthens preventive healthcare effectiveness within diverse population groups.

4.6. Community Engagement Layer

The Community Engagement Layer focuses on strengthening collective environmental awareness, social participation, and collaborative healthcare action within communities. This layer supports public interaction through features such as community pollution dashboards, educational healthcare campaigns, citizen reporting systems, public discussion platforms, mental health support resources, and environmental volunteering initiatives. By facilitating community participation, the framework encourages greater public understanding of environmental health risks and promotes collaborative responses to pollution-related challenges. In addition, community centered engagement mechanisms help strengthen trust in AI driven healthcare technologies by creating more transparent, inclusive, and socially connected digital ecosystems. The integration of public participation within Smart AQMS also supports sustainable environmental governance and enhances long term community resilience in facing environmental and public health challenges.

5. DISCUSSION

5.1. The Role of Empathy in Preventive Healthcare

Preventive healthcare extends beyond clinical treatment and requires communication strategies capable of encouraging positive behavioral change within communities. Conventional environmental warning systems generally focus on presenting numerical pollution indicators and technical environmental information without considering the emotional and psychological conditions of users. As a result, many individuals may fail to fully understand the health implications of air pollution or may become anxious and overwhelmed when exposed to alarming environmental data. In this context, EAI provides a more human centered approach by transforming complex environmental information into supportive, understandable, and emotionally sensitive recommendations. Rather than delivering rigid warnings, empathetic Smart AQMS can communicate health

risks using compassionate language that promotes calmness, awareness, and preventive action. This approach may improve public health awareness, strengthen behavioral compliance, increase trust in digital healthcare systems, and support emotional resilience during environmental crises. By recognizing the psychological and social dimensions of environmental health, empathetic Smart AQMS can evolve into holistic public health support systems that not only monitor pollution levels but also care for the emotional wellbeing of communities.

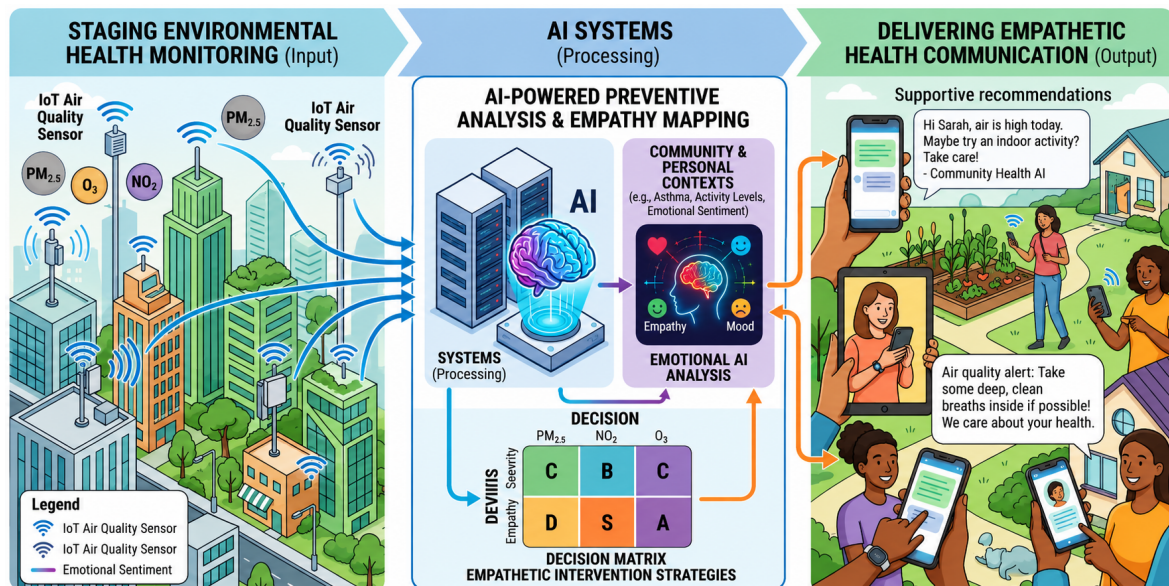


Figure 2. Empathy-Driven Preventive Healthcare Communication Framework

The conceptual framework presented in Figure 2 illustrates the distinct stages of this transformative approach, from the physical collection of data to the final empathetic communication delivery. The process begins with Staging Environmental Health Monitoring (Input), where a distributed network of IoT air quality sensors across a smart city collects real time localized data on pollutants like PM_{2.5}, NO₂, and O₃. These complex data streams are then funneled into the central AI Systems (Processing), which perform two critical, intersecting functions. This intelligence is then materialized in the final stage, Delivering Empathetic Health Communication (Output), where generic, technical warnings are replaced by personalized "Supportive recommendations."

5.2. Integration with Sustainable Smart Cities

The rapid development of smart city ecosystems has accelerated the adoption of digital technologies for environmental governance, healthcare optimization, transportation management, and public safety enhancement. Within this context, integrating empathetic Smart AQMS into smart city infrastructures can contribute significantly to sustainable urban development by combining intelligent environmental monitoring with human-centered healthcare communication. Smart AQMS can provide real-time pollution monitoring, predictive environmental analytics, and early warning systems that support data driven policymaking and proactive healthcare interventions. Furthermore, the integration of empathetic AI allows environmental information to be communicated in a more inclusive and socially responsive manner, thereby strengthening community engagement and public participation in sustainability initiatives.

The proposed framework also contributes to healthcare resource optimization by enabling authorities to identify high risk environmental zones and prioritize preventive healthcare measures more effectively. In addition, empathetic Smart AQMS supports climate adaptation strategies by helping communities respond to environmental risks while maintaining psychological wellbeing. These contributions align closely with several Sustainable Development Goals (SDGs), including SDGs 3 (Good Health and Wellbeing), SDGs 9 (Industry, Innovation, and Infrastructure), SDGs 11 (Sustainable Cities and Communities), and SDGs 13 (Climate Action), highlighting the broader societal value of integrating emotionally intelligent AI into sustainable urban ecosystems.

5.3. Supporting Vulnerable Populations

Air pollution disproportionately impacts vulnerable populations, particularly children, elderly individuals, pregnant women, low income communities, and patients with chronic respiratory conditions. These groups often experience greater exposure risks and possess limited healthcare accessibility, making preventive environmental healthcare increasingly important. Empathetic Smart AQMS can contribute to healthcare equity by providing accessible, personalized, and culturally sensitive health guidance tailored to the needs of different user groups. Through multilingual interfaces, simplified visual communication, and adaptive notification systems, empathetic AI can improve environmental health literacy among populations with varying educational and technological backgrounds.

For example, elderly users may benefit from simplified health alerts with larger visual displays, while children and parents may receive educational recommendations regarding safe outdoor activities during high pollution periods. In underserved regions where healthcare infrastructure and specialist availability remain limited, mobile based environmental healthcare systems can function as alternative preventive healthcare support platforms. Consequently, empathetic Smart AQMS has the potential to reduce environmental health disparities while promoting more inclusive and community-centered healthcare delivery.

5.4. Human-AI Collaboration in Healthcare

The proposed empathetic Smart AQMS framework is not intended to replace healthcare professionals but rather to strengthen human centered healthcare practices through intelligent technological assistance. Human-AI collaboration is essential because healthcare decision making requires both analytical accuracy and emotional understanding. Within environmental healthcare contexts, empathetic AI can support healthcare providers by delivering real time environmental insights, pollution forecasting data, and personalized community risk assessments. These capabilities enable healthcare institutions and public health agencies to plan preventive interventions more efficiently and develop targeted environmental health campaigns.

In addition, AI generated environmental insights may assist healthcare professionals in monitoring community wellbeing and identifying pollution related mental health concerns, such as anxiety and stress caused by prolonged environmental exposure. Nevertheless, maintaining ethical responsibility and emotional authenticity remains critical. Healthcare professionals continue to play an irreplaceable role in interpreting medical conditions, providing emotional reassurance, and ensuring that AI generated recommendations remain contextually appropriate and ethically responsible. Therefore, empathetic AI should be viewed as a collaborative healthcare partner that enhances, rather than substitutes, compassionate human care.

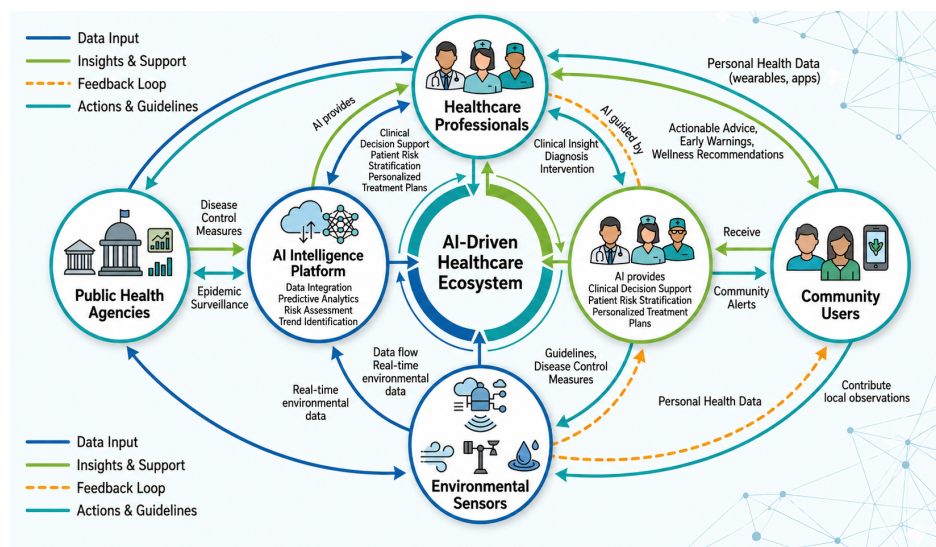


Figure 3. Human-AI Collaboration Model in Environmental Healthcare

As illustrated in Figure 3, the dynamic interaction within the ecosystem establishes a closed-loop feedback mechanism among public health agencies, healthcare professionals, AI intelligence platforms, environmental sensors, and community users. The bidirectional data flows demonstrate how real time environmen-

tal data and personal health data from wearables are ingested by the AI platform to generate clinical decision support and personalized risk stratification. Concurrently, healthcare professionals leverage these AI driven predictive insights to deliver contextually adaptive guidelines, early warnings, and emotionally supportive recommendations back to community users. This collaborative architecture underscores that the empathy layer does not operate in isolation; instead, it bridges the gap between raw environmental intelligence and human centric medical expertise, ensuring that technological interventions ultimately foster public trust, enhance community resilience, and support sustainable environmental healthcare governance.

5.5. Ethical and Privacy Challenges

Despite the significant potential benefits of empathetic AI-driven Smart AQMS, several ethical and privacy related challenges must be carefully addressed to ensure responsible implementation. Environmental healthcare systems often collect sensitive user information, including health conditions, behavioral patterns, emotional responses, and location-based environmental exposure data. Without appropriate governance mechanisms, such information may be vulnerable to misuse, unauthorized access, or privacy violations. Therefore, strong data governance frameworks, encryption mechanisms, and transparent data management policies are essential for protecting user confidentiality and maintaining public trust.

Another critical concern involves algorithmic bias, where AI models trained on limited or unrepresentative datasets may generate recommendations that disadvantage certain populations or fail to accommodate cultural and socioeconomic diversity. Inclusive datasets, transparent AI development processes, and continuous fairness evaluations are necessary to support equitable healthcare delivery. Additionally, empathy oriented systems must avoid manipulative communication strategies that exploit emotional vulnerabilities or induce unnecessary fear. Ethical guidelines should ensure that empathetic AI remains supportive, transparent, and user centered rather than emotionally coercive.

Trust and transparency also represent fundamental components of responsible AI adoption within healthcare ecosystems. Users should clearly understand how AI systems process personal information, generate recommendations, and evaluate environmental risks. Explainable AI mechanisms can improve accountability by allowing users and healthcare professionals to interpret AI driven decisions more transparently. Ultimately, ethical governance, fairness, and trustworthiness are essential for ensuring that empathetic Smart AQMS contributes positively to sustainable and compassionate digital healthcare systems.

6. MANAGERIAL IMPLICATIONS

The findings of this study provide important managerial implications for healthcare institutions and public health administrators in developing more human centered environmental healthcare systems. Healthcare managers can utilize empathetic Smart AQMS as strategic tools to strengthen preventive healthcare services through real time environmental monitoring and personalized health communication. By integrating empathetic AI into healthcare operations, institutions can improve patient engagement, enhance public awareness regarding pollution related health risks, and support vulnerable populations such as elderly individuals, children, and patients with respiratory diseases. In addition, healthcare organizations may optimize community outreach programs by delivering emotionally supportive notifications and culturally sensitive recommendations that encourage preventive behavioral changes while reducing public anxiety during periods of severe air pollution.

From a governmental and policymaking perspective, the proposed framework offers strategic guidance for sustainable smart city and public health management. Policymakers can integrate empathetic Smart AQMS into urban environmental governance, climate adaptation strategies, and digital healthcare transformation initiatives to improve community resilience and healthcare accessibility. The implementation of AI driven environmental healthcare systems may support data driven policy formulation, early pollution risk mitigation, and equitable healthcare distribution in underserved regions. Furthermore, government agencies should establish clear regulatory standards concerning ethical AI governance, health data privacy, transparency, and algorithmic fairness to ensure that intelligent healthcare technologies remain trustworthy, inclusive, and socially responsible.

For technology developers and educational institutions, this study emphasizes the importance of designing AI systems that prioritize emotional intelligence, accessibility, and human centered interaction rather than focusing solely on technical performance. Technology managers and AI developers should incorporate empathy oriented design principles into Smart AQMS platforms to improve usability, trust, and long-term user

adoption. Simultaneously, universities and training institutions can support the development of future interdisciplinary professionals by integrating empathetic AI, healthcare informatics, environmental monitoring, and human computer interaction into academic curricula and innovation programs. Such collaboration between academia, healthcare sectors, and technology industries is essential for building sustainable digital healthcare ecosystems that are both technologically advanced and socially compassionate.

7. CONCLUSION

The increasing severity of environmental pollution requires innovative healthcare approaches that address both physical and emotional dimensions of public wellbeing. Conventional environmental monitoring systems often prioritize technical accuracy while overlooking compassionate communication and human-centered engagement. This limitation highlights the need for a more holistic approach that integrates environmental intelligence with empathetic healthcare communication.

This paper proposes an empathetic AI-driven Smart Air Quality Monitoring System (Smart AQMS) framework designed to support preventive community healthcare through emotionally intelligent environmental monitoring. By integrating IoT sensors, machine learning analytics, empathy recognition mechanisms, personalized healthcare recommendations, and community engagement features, the proposed framework extends Smart AQMS beyond environmental data collection toward a more holistic public health support system. The study suggests that such integration can enhance environmental healthcare communication by improving health awareness, encouraging preventive behaviors, reducing psychological distress, and strengthening trust in intelligent healthcare systems. Furthermore, the framework aligns with Orange Technology principles and Sustainable Development Goals by promoting inclusive, sustainable, and emotionally supportive healthcare innovation.

Despite its conceptual strengths, several aspects require further investigation in future research. Subsequent studies may focus on prototype development of the empathetic Smart AQMS, followed by community-based user testing to evaluate usability and acceptance. Expert validation from healthcare, AI, and environmental science domains is also essential to ensure system robustness. In addition, privacy risk assessment and ethical evaluation of emotion-aware data processing should be conducted to address concerns related to transparency and data protection. Future work may also include pilot implementation in real urban healthcare environments to assess practical feasibility and policy impact. Ultimately, integrating emotional intelligence into environmental health technologies may redefine how communities interact with AI-driven healthcare systems, emphasizing not only computational intelligence but also compassion, sustainability, and human dignity.

8. DECLARATIONS

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8.2. Author Contributions

Conceptualization: AA; Methodology: MH; Software: OS; Validation: AA and MH; Formal Analysis: AA, MH and OS; Investigation: AA; Resources: MH; Data Curation: MH; Writing – Original Draft Preparation: AA and MH; Writing – Review & Editing: AA, MH and OS; Visualization: MH; All authors, AA, MH, and OS, have read and agreed to the published version of the manuscript.

8.3. Data Availability Statement

The data presented in this study are available on request from the corresponding author.

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8.5. Declaration of Conflicting Interest

The authors declare that they have no conflicts of interest, known competing financial interests, or personal relationships that could have influenced the work reported in this paper.

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