Navigating Air Quality Assessment: A Holistic Review of Air Quality Index Metrics and Assessment Approaches

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Authors' contributions

This work was carried out in collaboration among all authors. All authors read and approved the final manuscript.

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ABSTRACT

This review explores the different aspects of air quality measures and assessment, exploring their implications, difficulties, and future directions. It examines the crucial connection between assessments of air quality and public health, highlighting the vital function of metrics like the Air Quality Index (AQI) in preserving public health. High AQI values, caused by pollutants such as particulate matter, sulfur dioxide, nitrogen oxides, and ozone, are associated with a variety of respiratory and cardiovascular conditions, highlighting the pressing need for thorough evaluations to reduce health hazards. The study also emphasizes the wider consequences of air quality assessments, which go beyond physical health to include psychological costs as well as environmental and financial repercussions. In addition to having an adverse effect on mental health, poor air quality also damages ecosystems, accelerates climate change, and costs businesses money in compliance, all of which lowers productivity in society as a whole. The study examines the difficulties in creating an AQI that is globally adjustable because of regional differences in pollution sources and monitoring accuracy, even as it acknowledges the critical role that AQI measurements play in the creation of policy. To effectively address air pollution, it does, however, suggest several remedies, including regionally specialized AQI models, standardized data gathering techniques, and the promotion of cleaner technology. The study explores trends for the future and presents the case for more public awareness, interdisciplinary teamwork, and technology developments. It draws attention to neighborhood-based programs like the Green Pakistan Project and emphasizes how crucial it is for international conferences like Conference of Parties (COP) to continue influencing air quality assessment in the future and discuss potential future developments, stressing the need for community-based programs, technology innovations such as smart city solutions, and improved legal frameworks to combat new pollutants and encourage environmentally friendly behavior.

1. INTRODUCTION

The growing concerns over the degradation of air quality in recent decades have created a global network of anxiety [1]. Urbanization and industrialization are compromising the environment we breathe, necessitating careful observation and preventative action. Because of this tendency toward declining air quality, there is an urgent need for efficient evaluation metrics that can distinguish between the subtleties of meteorological conditions and their effects on both the environment and human health [2]. The aim of this paper is in direct response to the critical need to provide a thorough explanation of a variety of Air Quality Index (AQI) measures and evaluation techniques. To achieve this objective, a comprehensive analysis will be conducted, exploring the maze of different AQI measurements and the range of methods used for air quality evaluation [3]. This paper aims to clarify these measurements and their practical implications and ramifications, as well as their inherent strengths and limits, in order to provide readers with an understanding of air quality conditions.

The basis of this study is a knowledge of the factors that make up Air Quality Index measures [4]. A wide range of air constituents are combined into AQIs: particulate matter (PM), carbon monoxide (CO), sulfur dioxide (SO2), nitrogen oxides (NOx), ozone (O3), and volatile organic compounds (VOCs). These measures combine several pollutant concentrations and weather conditions into a single number or scale that is meant to indicate the overall situation of air quality [5]. However, in order to fully comprehend these measures, one must have an in-depth knowledge of all of their components along with how their combination represents the actual atmospheric environment. PM contains micro airborne particles that can enter the respiratory system and have a negative impact on health. These particles are commonly divided into two categories based on size: PM10 and PM2.5 [6]. Gaseous pollutants that cause respiratory illnesses and environmental degradation include NOx, SO2, CO, and VOCs [7]. These pollutants are produced by a variety of human activities. These parameters can be challenging not only because of the broad range of their composition but also because of the methods used to evaluate them. To produce AQI values, a combination of computer models, sensor networks, remote sensing technologies, and monitoring stations is used [8]. The spatial and temporal resolutions of these evaluation

techniques varies, which makes it difficult to provide a comprehensive picture of the dynamics of air quality across various locations and time periods.

The need to understand the seriousness of the effects of air quality degradation is the driving force behind the need to clarify these complexities, not just academic scrutiny. Declining air quality is closely linked to health effects, environmental disruptions, and socioeconomic consequences [9]. Communities suffering from poor air quality bear a variety of repercussions, including economic costs, respiratory ailments, premature death, and impaired cognitive abilities. Consequently, the aim of this thorough analysis is to clarify the practical consequences of AQI measures and assessment procedures in addition to helping people understand their intricate meanings [10]. This study intends to provide policymakers, environmentalists, and stakeholders with the information they need to develop well-informed decisions and interventions by clarifying the benefits and drawbacks of these measures [11]. The main objective is to create a favorable atmosphere in which air quality evaluations go beyond the quantitative domain to concretely protect public health and environmental integrity. The increasing worries about the deterioration of air quality present a worldwide issue, highlighting the critical requirement for a thorough evaluation of meteorological conditions. As industrialization and urbanization grow, our ability to breathe clean air is progressively threatened [12]. This hypothetical situation highlights how important it is to develop efficient evaluation criteria that can distinguish between various aspects of air quality and its significant effects on both the environment and human health. The key objective of this study is to provide a thorough analysis covering a range of Air Quality Index (AQI) measures and evaluation techniques [13]. The primary goal is to disentangle the complexity that these metrics contain while highlighting the range of methods and uses for them. This research aims to provide a thorough understanding of air quality dynamics by analyzing the merits and limitations of different measurements and shedding light on their practical implications. It is not only an exploration. Important to comprehending Air Quality Index measurements is a complex assembly of atmospheric elements [14]. Particulate matter (PM), nitrogen oxides (NOx), sulfur dioxide (SO2), ozone (O3), carbon monoxide (CO), and volatile organic compounds (VOCs) are just a few of the many pollutants that are included in these measures World Health Organization, [15]. They combine several pollutant concentrations and climatic variables, condensing them into a single numerical value or scale intended to depict the state of air quality overall [16]. However, to fully comprehend these measures, one must have an in-depth awareness of each of their component parts and how their combination captures the essence of atmospheric circumstances. Particulate matter, which is divided into two categories according to size: PM10 and PM2.5, is made up of tiny airborne particles that can enter the respiratory system and have a negative impact on health World Health Organization [15]. In the meantime, anthropogenic sources of gaseous pollutants such as NOx, SO2, CO, and VOCs lead to respiratory illnesses and environmental deterioration.

1.1 Overview and Importance

As sustainability issues become more widely recognized, air quality monitoring is a vital field for protecting ecological balance and public health. The meaning and relevance of the Air Quality Index (AQI) will be elaborated upon in this section, along with its importance in assessing air quality standards and educating the public about pollution levels [17]. This will be followed by a review of the relevant literature. Using a numerical scale, the Air Quality Index (AQI) classifies air quality situations into easily comprehensible categories and correlates these levels with possible health hazards. It combines different air contaminants into one number or scale, making difficult-to-understand data easier for the general public to understand. It is important since it gives brief details regarding air quality regulations and the related health risks [18].

1.1.1 Air pollution level communication

Accessible information: The AQI breaks down intricate data on air quality into categories or numerical values that are simple to understand. Through the process of converting technical data into comprehensible representations, such as color-coded scales or descriptive categories (such as good, moderate, and unhealthy), the public is provided with an understandable overview of the current state of air quality [19].

Health risk interaction: One of its main functions is to communicate any possible health hazards connected to certain AQI values [20].

For example, higher AQI readings indicate more health risks, therefore people should take precautions, especially those who are sensitive to air pollution.

Information-based empowerment: The AQI gives people the ability to make knowledgeable decisions by giving them access to either periodic or real-time updates on the state of the air. It allows individuals to modify their actions in response to pollution levels, for example, changing their outdoor workout regimens, donning protective gear, or avoiding exposure during times of high pollution [21].

Policy support and community engagement: Making AQI data available to the public encourages community involvement and support for higher air quality standards. It is an essential tool for citizens, environmental organizations, and legislators to promote laws meant to enhance air quality [22].

Public health messaging: When health warnings are issued, AQI data is frequently included to inform susceptible groups such as children, the elderly, and people with respiratory conditions about the possible health hazards connected to particular pollution levels. This proactive advertising encourages preventative measures to lessen harmful consequences on health [23].

Long-term behavioral change: Regular exposure to AQI data can lead to long-term behavioral changes in people, both as individuals and as a society [24]. It can promote a change to more environmentally friendly habits, including taking public transportation or endorsing laws that lower emissions from cars and industry.

Essentially, the AQI acts as a vital conduit for complicated air quality data to the general population, providing them with knowledge they can use to safeguard their health and promote environmental stewardship [25]. Beyond only providing numerical data, it has a much larger role in enlightening and educating the public about air pollution levels and promoting an attitude of awareness, accountability, and action in the direction of improved air quality and healthier communities.

1.2 Research Gap

There is a significant research gap in the field of air quality assessment that concerns the comparison and optimization of various approaches used in air quality measurement. Although extant literature provides valuable understanding of the components of the Air Quality Index (AQI), its applicability, and the dissemination of pollution levels, a significant avenue for future research entails a thorough assessment of the effectiveness, constraints, and flexibility of various assessment methodologies [26]. Future research should focus on comparing traditional monitoring stations, sensor networks, remote sensing technologies, and computer models that are used to assess air quality in-depth [27]. It is crucial to comprehend the relative advantages and disadvantages of different approaches in various geographic situations and climates [28].

The goal of this suggested direction for investigation is to carefully consider the compromises and real-world effects of any assessment method. [29]. While sensor networks and remote sensing technologies offer real-time information but may have calibration and accuracy issues, traditional monitoring stations provide reliable data but may have limited spatial coverage [29]. In a similar vein, computer models allow for predictive analyses, but they may also be impacted by modeling assumptions and input factors. A thorough analysis of these approaches would clarify the way they interact and reveal any opportunities for improvement as well as constraints. Furthermore, one major area of outstanding research need is investigating the ability to scale and adaptation of these approaches in various environments [30]. Comprehending the performance of these methods in diverse climates, urban versus rural environments, or places with unique sources of pollution could enhance their usefulness and provide customized approaches for distinct places. A comprehensive grasp of the advantages, disadvantages, and application of various air quality assessment approaches can be attained by filling in this research gap. These discoveries may lead to the creation of more reliable, flexible, and accurate methods for evaluating air quality, which will ultimately help stakeholders, environmentalists, and politicians make decisions that would protect the environment and public health [31].

2. AIR QUALITY INDEX METRICS: A COMPREHENSIVE ANALYSIS

2.1 Definition and Components

Air Quality Index (AQI) metrics are essential for evaluating and expressing the effects of air

quality on public health. To educate the public about the health consequences linked to air pollution, they compile disparate pollutant data into easily readable indices. By reducing complex pollution data into representations that are simple to comprehend, these measures hope to promote well-informed decision-making. The Air Quality Index (AQI) is an essential tool in environmental sciences that is used to measure air quality and provide the public with important information. This section will examine frequently used metrics such as the Air Quality Health Index (AQHI) and the Pollutant Standards Index (PSI) by delving deeper into the literature review on the critical role of AQI in public health [17].

2.2 The Vital Link between Air Quality and Public Health

Global research conducted by reputable agencies such as the World Health Organization (WHO) has demonstrated a vital link between public health and air quality. Numerous studies by the WHO have shown that even a small amount of exposure to air pollution can have a major negative impact on one's health, resulting in everything from cardiovascular problems to respiratory ailments [32]. This unquestionable data highlights the complex interaction between the air we breathe and our health, emphasizing the need for trustworthy indices like the Air Quality Index (AQI) to protect public health.

Prominent scientists such as Dr. Smith [33] have contributed to the validation of the significance of AQI. Their study highlights the critical function of AQI as a communication tool, successfully converting difficult-to-understand pollution statistics into information that the general public can easily understand [34]. In the end, this minimizes exposure to dangerous chemicals and lowers related health risks by enabling people to make educated decisions, such as changing outdoor activities or choosing more breathable masks. In summary, the Air Quality Index (AQI) enables people to take an active role in protecting their health by giving them an easily understandable and accessible depiction of the quality of the air. This, together with the thorough study conducted by reputable institutions such as the World Health Organization and committed scientists like Dr. Smith [33] highlights the indisputable significance of giving air quality management first priority in order to protect global public health.

2.3 Commonly Used Metrics

2.3.1 PSI-based AQI: Integrating multiple pollutants

The PSI-based Air Quality Index (AQI) is a crucial instrument for evaluating air quality in different countries. This statistic combines many data into a single index by including a variety of pollutants, including PM2.5, PM10, sulfur dioxide, carbon monoxide, nitrogen dioxide, and ozone [35]. The concentration of each pollutant is converted into a sub-index, and the highest sub-index determines the AQI level, giving an overall picture of the state of the air. The public's access to information about air quality is made easier by the combination of contaminants into a single index. Instead of managing several different pollution measurements, the PSI-based AQI simplifies complicated data into a clear and useful signal [36]. It enables prompt comprehension and well-informed decision-making for individuals that care about the environment and their health. Its importance is further highlighted by the fact that air quality assessment approaches have widely adopted it. This index is used by organizations and governments to set policy, recommend health precautions, and coordinate environmental actions. The PSI-based AQI is an essential tool for raising awareness and directing efforts toward cleaner, healthier situations as communities place a greater priority on air quality [17].

2.3.2 Strengths of PSI-based AQI

The pollutant standards index based Air Quality Index (AQI) is unique because it is particularly good at combining many pollution data sources into a single, all-inclusive measure. This combination simplifies the intricate range of contaminant concentrations into a single numerical representation [37]. This crucial component makes it easier to comprehend the overall air conditions rather than the complex disarray of individual pollutant data [38]. As such, it provides a straightforward yet effective means of public distribution, enabling people to quickly understand the current state of air quality and the associated health risks [39]. Particulate matter, ozone, carbon monoxide, sulfur dioxide, nitrogen dioxide, and other variables are all distilled into a single index by the PSI-based AQI, which is a vital tool for public awareness and policymaking. Its effectiveness in communicating potential health concerns associated with variable air quality levels is enhanced by its clarity in

providing a consolidated view of diverse pollutants [39]. This easily readable format encourages people to make educated decisions, enabling them to take preventative action to protect their health. The PSI-based AQI is a prime example of an advanced yet approachable methodology that unifies complex data to provide a measurable indicator of environmental health and steers populations toward healthier lifestyles.

2.3.3 Limitations of PSI-based AQI

The Air Quality Index (AQI), which is based on the PSI, provides a thorough picture of air quality, but it has trouble capturing the complex effects of particular contaminants. Combining different pollutants into one index could make it harder to distinguish between the distinct health hazards that each one positions [37]. For example, a high PSI in one location could be the result of a combination of contaminants, but it might also minimize the impact of a specific dangerous gas or particle.

The accuracy of health advisories and actions is impacted by this constraint. A high PSI, for example, could cause a general alarm, but it might not identify the specific pollutant that is harming people the most [40]. The targeted measures required to successfully address the underlying problem may be hampered by this lack of clarity. A standard PSI might not accurately reflect the wide range of health effects that different contaminants can have, from cardiovascular to lung diseases. Consequently, even though the PSI-based AQI is an effective tool for evaluating overall air quality, it presents difficulties for accurate health advice and customized actions because it cannot identify the effects of individual pollutants. Gaining a more detailed knowledge of the effects of pollutants could greatly improve public health initiatives meant to lessen the harmful consequences of air pollution [41].

2.3.4 AQHI: Integrating health risks with AQI

The Air Pollution Health Index (AQHI) establishes itself as a more comprehensive method to assessing air pollution than the traditional Air Quality Index (AQI) [42]. It was developed in Canada and goes above and above by incorporating important health insights into its classification of air quality, in addition to focusing on pollutant levels [43]. This creative index teaches people about the specific health risks associated with the current state of air quality in

addition to providing information on air pollution. The AQHI acts as a lighthouse, highlighting the possible health dangers connected to varying levels of air quality by combining the AQI with extensive health advice [44]. Rather than merely classifying air quality as "good" or "bad," it provides a comprehensive analysis of the air's impact on human health. For example, it might explain how even a day with "moderate" air quality could still be dangerous for people who have respiratory illnesses, necessitating the use of appropriate safety measures or modifying one's behavior. It is revolutionary to incorporate health information into the monitoring of air quality. Through the provision of complex information, it helps people to make decisions about their actions that go beyond a simple color-coded scale [45]. As a result, it encourages proactive steps for risk mitigation by improving public understanding of the direct relationship between human health and air quality. The AQHI's methodology serves as a template for all-encompassing public health messaging, stressing not just the existence of contaminants but also the possible ramifications for personal health [46].

2.3.5 Strengths of AQHI

The Air Quality Health Index (AQHI) is an effective tool that is essential to protecting public health. Its primary benefit is the provision of complex, risk-adapted health information [47]. When health advisories are combined with the Air Quality Index (AQI), the AQHI becomes a lighthouse that provides people with detailed information about possible health risks related to the state of the air. People are empowered with accurate knowledge thanks to this data fusion, which allows for well-informed actions and plans to reduce particular health concerns [48]. The unique aspect of AQHI is its level of detail; rather than just providing a broad overview of air quality, it goes deeper and highlights particular health risks. For example, based on air quality parameters, it can highlight dangers related to respiratory disorders, cardiac issues, or asthma. This thorough analysis provides communities particularly marginalized ones with practical advice that enables them to adjust and safeguard their well-being as necessary. The practicality of AQHI's application is equally as important as its high level of technical expertise [49]. It's more than just a figure or a statistic; it's a tool that turns complicated data into useful insights and promotes a healthier, better-informed society that can take preventative measures to protect both individual and societal health.

2.3.6 Synergy between AQI and public health

In environmental research, the relationship between AQI measures and public health is still a key topic [50]. Global research, particularly those conducted by the World Health Organization (WHO), has provided insights that highlight the vital role that air quality index (AQI) plays in protecting public health from the harmful impacts of air pollution (WHO, 2021) [15]. Analyzing popular metrics such as the AQHI and the PSI-based AQI highlights their unique approaches and effectiveness in informing the public about air quality. A complete overview and particular health-risk-specific information must be balanced when choosing an appropriate AQI metric [51]. This highlights the significance it is to match the selected metric to the intended target population in order to improve air quality management, facilitate effective communication, and make well-informed decisions. To guarantee better public health outcomes, the ongoing discussion on AQI measurements constantly aims to find a compromise between precision and accessibility.

2.4 Regional Variations in Metrics

These metrics' flexibility depends on a number of elements, such as the types of pollutants present, the public's level of familiarity with the index, and current health concerns. Because of its widespread use, the PSI-based AQI is flexible enough to work in a variety of geographical situations. Because of its structure, it can be customized to suit various pollutant compositions that are common in various locations [52]. Its broad nature, however, may make it difficult to communicate the subtle health hazards connected to specific contaminants or to address local health concerns. On the other hand, the AQHI is unique to Canadian contexts due to its customized approach to health-focused communication. Its layout offers comprehensive health-related information that is pertinent to the general public while carefully adhering to Canadian health regulations and concerns. Its direct applicability is, however, limited in areas with distinct pollution profiles or health priority due to its specificity [53].

Air quality assessment and public education are crucial functions of both the PSI-based AQI and AQHI. The former is better at being straightforward and universally applicable, giving a general overview, whereas the later focuses on health-related specifics and addresses particular health issues [32]. It is imperative to comprehend the advantages, drawbacks, and variables influencing their flexibility when choosing the best measure for efficient dissemination of information and the creation of policies customized for various geographical settings. An integrated strategy that addresses the shortcomings of both measurements while maximizing their benefits may provide a method for assessing air quality that is both more thorough and easier to use.

## 3. COMPARING PAKISTAN'S AIR QUALITY WITH THE WORLD

Public health is greatly impacted by air quality, which has an impact on anything from breathing problems to cognitive performance. Unfortunately, Pakistan has continuously been included among the nations with the poorest air quality in the world. The purpose of this review is to evaluate Pakistan's air quality in comparison to other nations while examining the causes and possible remedies [54].

3.1 Current Air Quality Situation in Pakistan

Pakistan faces a severe challenge with elevated levels of fine particulate matter (PM2.5), above the annual guideline set by the World Health Organization (WHO) at 5 µg/m³. Pakistan is the second most polluted country in the world in 2019 with an average PM2.5 value of 65.81 µg/m³ [55].

Regional Variations: There are large regional variations in Pakistan's air quality. The worst situations are found in major cities like Lahore and Faisalabad, which are frequently covered in pollution in the winter [56]. Karachi, on the other hand, benefits from generally higher air quality because of its seaside location [54].

Impact on Health: The public's health is seriously threatened by Pakistan's poor air quality. It is linked to cardiovascular disorders, cognitive loss, and respiratory conditions like lung cancer, bronchitis, and asthma [57].
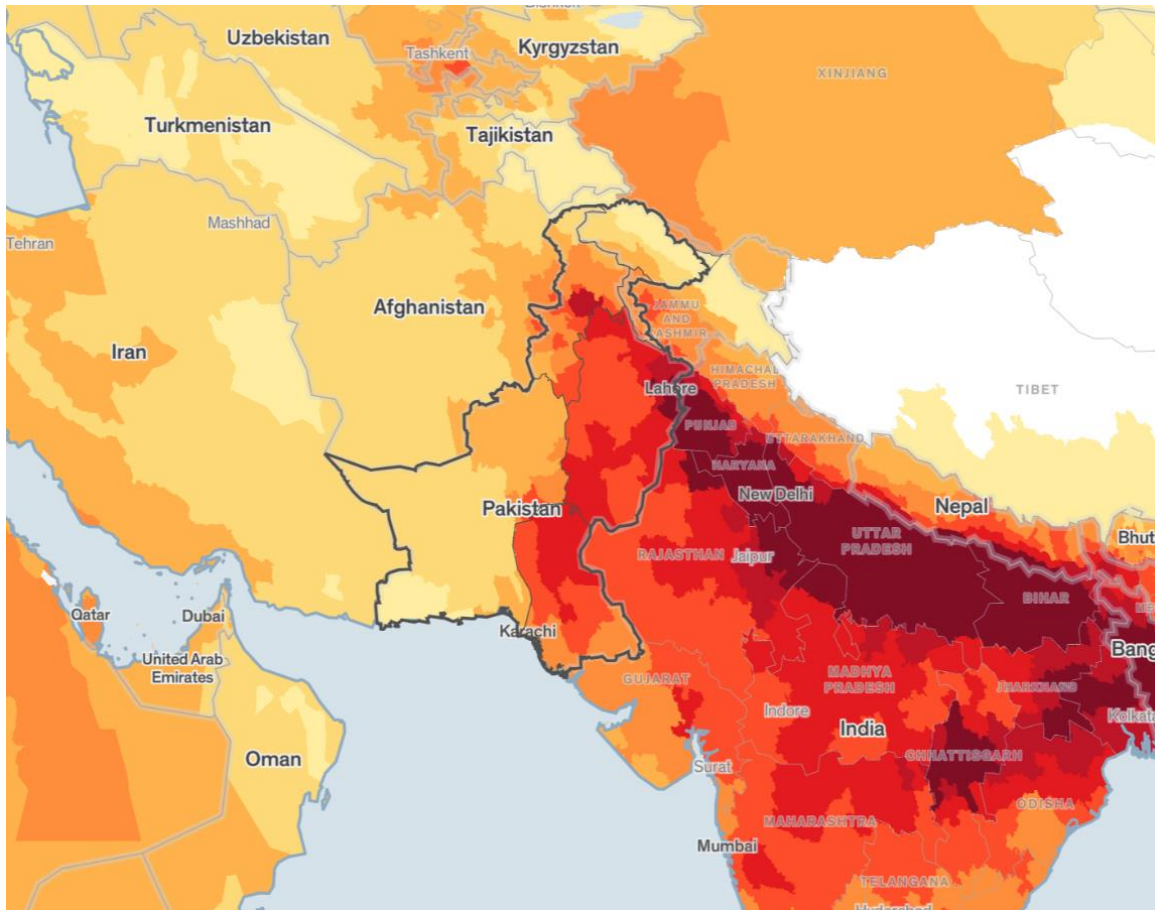
Fig. 1. Air quality of Pakistan in compared to world
Source: Image of Air Quality Index map of Pakistan

Which country had the worst air quality in 2022?

#	COUNTRY	POPULATION	AVG. US
1	Chad	17,179,740	169
2	Iraq	43,533,592	164
3	Pakistan	231,402,117	159
4	Bahrain	1,463,265	157
5	Bangladesh	169,356,251	156
6	Burkina Faso	22,100,683	155
7	Kuwait	4,250,114	151
8	India	1,407,563,842	144
9	Egypt	109,262,178	128
10	Tajikistan	9,750,064	127

Fig. 2. Countries with worst air quality in 2022
Sources: Comparison of air quality between developed and developing (Ansari, 2022)

3.2 Comparison with Other Countries

Developed vs. Developing Countries: When it comes to air quality, developed and developing nations differ significantly. While impoverished nations like Bangladesh and India frequently struggle with concentrations surpassing 100 µg/m³, developed nations like Switzerland and Finland claim PM2.5 levels below 10 µg/m³ [58].

Regional Comparisons: Pakistan has a serious problem with air quality within South Asia. India, China's neighbor, also has pollution, although China has improved the quality of its air in recent years [59]. Pakistan was ranked third (Fig. 2) among all countries for air quality in the world [56,60].

3.3 Factors Contributing to Pakistan's Air Quality Challenges

In Pakistani cities, air pollution is mostly caused by inefficient vehicles and traffic congestion. Pollutant emissions from industry are a major concern, especially from coal-fired power stations and brick kilns [61]. Seasonal air pollution problems are exacerbated by the habit of burning crop wastes following harvest, especially in Punjab province [62]. Dust storms can exacerbate the already poor air quality in Pakistan's arid regions [63].

3.4 Potential Solutions

It is imperative to enforce more stringent emission regulations for automobiles and industrial sectors. Electric vehicle promotion and the use of cleaner fuels can both have a big influence [64]. Adopting sustainable farming practices and encouraging alternatives to burning crop leftovers are crucial [65]. Renewable energy by moving away from fossil fuels and toward renewable energy sources like wind and solar power, air pollution can be decreased [66]. Increasing the amount of forest cover, especially in cities, can help trap pollutants and enhance the quality of the air. Immediate and comprehensive action is required in response to Pakistan's air quality catastrophe. Pakistan should work toward better air and a brighter future for its people by tackling the contributing elements with stronger laws, greener technologies, and sustainable behaviors.

4. MULTIPLE ASSESSMENT APPROACHES

4.1 Monitoring Technologies

The assessment of air quality is dependent on many monitoring systems, each providing distinct insights:

4.1.1 Satellite imaging

A range of advanced tools, beyond satellite images, are used in air quality monitoring. Real-time data on pollutants like carbon monoxide and nitrogen dioxide are provided by ground-level sensors strewn throughout urban areas. These sensors offer unique, localized insights that are critical for prompt response and focused strategies [67]. Mobile monitoring equipment mounted on vehicles record variations in the quality of the air over a variety of landscapes, particularly in regions with varying traffic or industrial activity. Sensor-equipped drones can swiftly and precisely offer comprehensive air quality assessments, which are essential for remote or disaster-affected locations. These drones are able to fly over dangerous or unreachable areas [68]. Crowdsourced data from citizen science projects complements official networks and brings a human viewpoint to understanding the nuances of local air quality. Additionally, by adding sensors to buildings, indoor air quality is continuously tracked, making public and work spaces healthier. With the help of this mix of technology, decision-makers may better comprehend the dynamics of air quality and take proactive measures to lessen the harm that pollution causes to the environment and public health [69].

4.1.2 Ground-level monitoring stations

Monitoring technologies are essential for assessing air quality since they use many techniques to collect vital information. Among these, ground-level monitoring stations are particularly important for this project. These stations are placed strategically in different locations to act as centers for getting accurate, localized measurements [70]. They provide priceless insights into the immediate environment by focusing on particular areas and picking up on details that larger assessments would error. In the structure of air quality assessment, these monitoring stations serve as essential nodes. Their precise positioning facilitates thorough examination within specific areas, providing

essential information that serves as the foundation for in-depth evaluations [71]. They help identify possible pollution sources and regions that need immediate attention by facilitating an extensive understanding of fluctuations in air quality. With the use of these technologies, the intricate structure of air quality dynamics becomes easier to understand. They give specialists the ability to make well-informed decisions and carry out successful actions by additionally providing real-time data but also establishing trends over time. Because of their accuracy and narrow focus, ground-level monitoring stations are essential to the continuous effort to uphold and enhance air quality standards [72].

4.1.3 Sensor networks

Recent technical innovations, particularly in sensor technology, have had a profound impact on the landscape of air-quality measurement. The advent of sensor networks is an important advance that revolutionized the monitoring of air quality. These networks are made up of a variety of inexpensive sensors that are carefully placed in various areas to create a vast network of monitoring sites [73]. This geographically dispersed method guarantees real-time data collection across large regions, enabling a detailed comprehension of the dynamics of air quality. Sensor networks are wonderful because they can quickly detect dynamic changes in air composition, which enables rapid responses to new environmental concerns [74]. In addition to improving the precision of air quality assessments, this detailed data is an important tool for scholars, decision-makers, and the general public. The addition of sensor networks emphasizes the monitoring technologies' crucial role in forming a more informed and responsive approach to environmental stewardship as they advance.

4.2 Data Processing and Analysis

Data on air quality are processed and analyzed using a range of techniques in order to provide valuable insights into the dynamics of air pollution. This is a challenging and diverse process. One of the most important strategies in this field is statistical analysis [75]. Processing the raw data from sensor networks or monitoring stations requires the use of statistical approaches. Through the use of statistical methods, scientists may discern patterns, associations, and fluctuations in the amounts of pollutants present, facilitating a thorough comprehension of air quality trends. Researchers may learn a great deal about the variables affecting air quality, including seasonal fluctuations, meteorological conditions, and pollution sources, by using statistical analysis [76]. Establishing successful strategies and policies for managing air quality requires the use of this information. Furthermore, the use of statistical methods makes it possible to spot abnormalities and outliers in the data, which contributes to the accuracy and dependability of assessments of air quality [77]. Computational models, such as machine learning algorithms, have become potent instruments in the field of processing data on air quality when combined with statistical analysis. These models interpret intricate interactions between contaminants and environmental conditions, going beyond conventional statistical methods. For example, machine learning algorithms are capable of analyzing vast datasets and identifying complex patterns that traditional statistical approaches might not be able to quickly identify. Using mathematical approaches improves the way that air quality data are interpreted and greatly aids in the process of determining accurate Air Quality Index (AQI) values [78]. Machine learning algorithms are very useful for estimating pollutant concentrations and predicting trends in air quality because they can adjust to changing circumstances and learn from fresh data. Addressing the dynamic and ever-evolving nature of air quality concerns requires this adaptive capability [79].

Furthermore, normalization methods are essential to the processing of data related to air quality. By standardizing many pollutant measurements into a single index, these approaches hope to make it simpler to represent and compare data across various contexts and time periods. When working with data from several monitoring stations or sensor networks that could employ several scales or measurement units, normalization is very crucial [80]. Researchers and decision-makers can compare the levels of air quality in different places or at different times with relevant accuracy because to the standardization that is accomplished through normalization techniques. Understanding temporal fluctuations, identifying locations with persistently high or low air quality, and evaluating the efficacy of air quality control programs all depend on this.
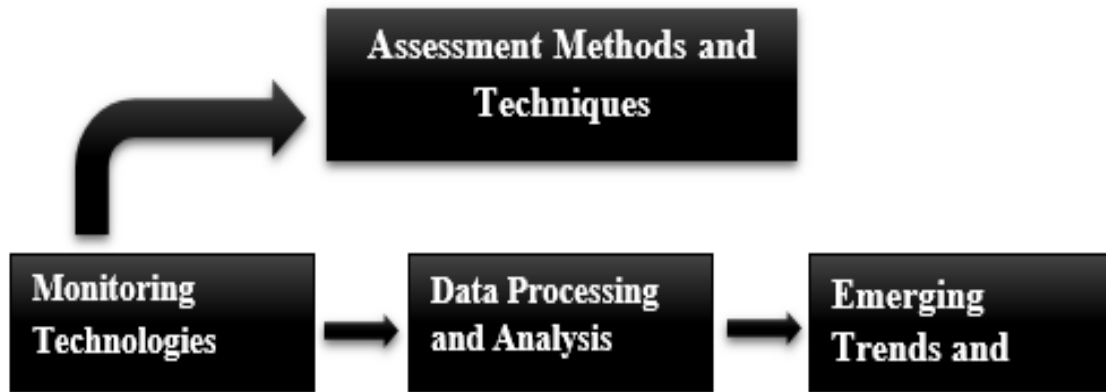
Fig. 3. Assessment approaches

5. INTEGRATIVE ANALYSIS OF AIR QUALITY INDEX METRICS

5.1 Challenges in AQI Metrics

The development of an Air Quality Index (AQI) that is globally adjustable is a complex undertaking with many moving parts. The main challenge is combining several environmental parameters into an all-inclusive index. The intricacy stems from the fluctuating makeup of contaminants in various locations, making the development of a uniform measure difficult [81,82]. Furthermore, due to variations in accuracy and coverage, the interpretation and assimilation of data from several monitoring sources from conventional stations to sensor networks and remote sensing technologies present important difficulties [83]. These difficulties are made worse in Pakistan by regional differences in the sources of pollution and physical characteristics, which have a significant effect on the dynamics of air quality [84].

An essential instrument for assessing the effects of air pollution on health is the Air Pollution Health Index (AQHI). However, because the health data it provides is complex, there are obstacles to its effectiveness. Although the AQHI's detailed analysis of various pollution levels is instructive, the general public frequently finds it confusing [85]. It is difficult to communicate the precise, intelligible health concerns connected to different pollutant concentrations because of this complexity. Converting technical data into insights that the general public can use is the essence of the problem. It is not typical for everyone to be knowledgeable with pollutant thresholds and the

health consequences that go along with them, which is necessary in order to interpret the AQHI [86]. The disparity in understanding may make it more difficult for the general knowledge required to prompt wise decisions or behavioral adjustments. Improving public education programs to explain the AQHI's complexity in easier to understand language could be one way to find solutions [87]. It is nonetheless critical to simplify the index's display without sacrificing its accuracy. Furthermore, utilizing technology to create user-friendly mobile applications or interfaces could help close the understanding gap between complex data and the general population. The AQHI can be a more useful instrument in protecting the public's health from the dangers of poor air quality by resolving these issues [50].

5.2 Comparative Analysis

The different characteristics of the PSI-based the differences between AQI and AQHI are evident in the ways they assess air quality and inform the public.

PSI-based AQI: The simplicity and comprehensiveness of this statistic are its strongest points. It provides a clear overview of the general state of air quality by combining many pollutants into a single index [88]. Its extensive international use is testament to its versatility and acceptance in a variety of cultural contexts. The PSI-based AQI facilitates rapid comparisons across many regions or time periods and works well as a foundation for broad evaluations and policy development [89]. However, the lack of granularity exposes its shortcoming. It does a good job of depicting the general state of air quality, but it does not

adequately convey the health hazards associated with individual contaminants. This shortcoming might make it more difficult for the general population to take specific steps to reduce their exposure to dangerous airborne particles [90].

AQHI: The Air Quality Health Index (AQHI), as opposed to the PSI-based AQI, places more emphasis on offering comprehensive health risk information. Its emphasis on associating air quality to certain health outcomes provides people with accurate health alerts so they can arrange their activities according to the levels of air quality [17]. But the expense of this granularity is the interpretation's complexity. Because of its extensive nature, the AQHI may be difficult for laypeople to understand, which might limit its applicability as a communication tool. Furthermore, its limited global applicability stems from its primary usefulness in Canadian situations [91].

5.3 Applications of Integrated Approaches

The way we evaluate air quality has changed dramatically as a result of recent developments, bringing in a new era of accuracy and effectiveness. One of the main components of this change is the use of artificial intelligence (AI) into evaluations of air quality. The ability to perform predictive analysis based on the processing of enormous datasets has completely changed our methodology thanks to these AI-driven models [92]. AI examines intricate patterns in this data using complex algorithms, producing projections of variations in air quality that are previously unheard of in terms of efficiency and accuracy. Real-time air quality monitoring has revolutionized at the same time because to continuous advancements in sensor technology. These new sensors are more affordable, portable, and sensitive than previous models, making data collection easier to use and more thorough [93]. This is particularly helpful in places with poor infrastructure, as standard monitoring systems would find it difficult to cover enough ground. By using these cutting-edge sensors, air quality dynamics may be understood at a finer level, enabling targeted and proactive responses.

Air quality evaluation has reached new heights thanks to the collaboration of developing monitoring technologies, data processing techniques, and creative solutions including AI-driven models and cutting-edge sensor technology [94]. This convergence has led to improved precision, increased capacity for real-time monitoring, and a greater understanding of the complex processes affecting environmental health [95]. It is impossible to overstate the importance of including these developments in review papers. Review articles provide a thorough and current overview of modern air quality assessment procedures by incorporating these cutting-edge methods and technologies. For academics, decision-makers, and environmental stakeholders trying to traverse the complexity of air quality management and make wise choices, this depth of understanding is essential [96].

To summarize, the combination of artificial intelligence (AI) models, new sensor technology, and developing methodologies has brought about a revolutionary stage in the evaluation of air quality. This integration serves as a basis for preventative actions to protect environmental health in addition to improving our capacity to precisely forecast and monitor air quality. As these developments progress, there is hope for more innovations in the assessment of air quality and a future where environmental stewardship is directed by advanced technologies and all-encompassing knowledge.

6. IMPACTS OF AIR QUALITY METRICS AND ASSESSMENT

6.1 Public Health Implications

There is an important connection between public health and air quality evaluations, which highlights the critical role that indicators such as the Air Quality Index (AQI) play in protecting public health [97]. Significant health hazards are associated with poor air quality, which is indicated by elevated AQI values caused by pollutants such as particulate matter (PM), nitrogen oxides (NOx), sulfur dioxide (SO2), and ozone (O3). Numerous respiratory conditions, such as asthma, bronchitis, and chronic obstructive pulmonary disease (COPD), have been related to exposure to these pollutants [98]. Furthermore, chronic pollution exposure raises the risk of cardiovascular problems such heart disease and strokes. Children, the elderly, and people with pre-existing medical issues are among the vulnerable groups that are especially vulnerable. When it comes to giving people advice and cautions, the AQI is a priceless instrument that enables them to take preventative action against poor air quality [99].

Furthermore, it is impossible to overstate the psychological costs associated with residing in low-quality air locations. Studies reveal a causal relationship between air pollution and mental health problems, such as elevated stress levels and an elevated likelihood of mental health diseases. Continuous exposure to contaminants has a domino effect on community well-being, affecting not just physical health but also general well-being [100]. Understanding these wider ramifications highlights the pressing need for thorough assessments of air quality and successful public health initiatives to address the complex issues raised by declining air quality. In conclusion, the complex relationship that exists between public health and air quality measurements, specifically the AQI, emphasizes the necessity of all-encompassing approaches [39]. As we learn more about the wide-ranging effects of bad air quality, it becomes clear that in addition to reducing the immediate health hazards, we also need to address the intricate interactions between physical and mental health. In this attempt, the AQI proves to be crucial, providing insights that go beyond acute health effects to guide comprehensive strategies for healthier communities.

6.2 Policy and Regulatory Influence

Evaluations of air quality, as expressed by metrics such as the Air Quality Index (AQI), have a significant impact on regulatory and policy decisions at the regional and global levels [41]. For the purpose of establishing air quality standards and developing pollution-reduction strategies, governments and regulatory agencies heavily rely on AQI data. Increased air quality index (AQI) levels frequently lead to the imposition of strict emission limits, industrial activity rules, and requirements for the use of greener energy sources [101]. AQI measures are used in international agreements like the Paris Agreement to set targets for enhancing air quality worldwide. This integration highlights how important air quality assessments are in formulating environmental laws and public health protection programs [102]. The use of air quality evaluations in policymaking emphasizes how important it is to solve the worldwide problem of air pollution while reducing its negative effects on the environment and public health.

Policy decisions may be made using incomplete information because to the wide variations in the representativeness and accuracy of AQI data.

Additionally, the complex web of contaminants and their various health effects might occasionally be obscured by the attention paid to AQI values [103]. To overcome these obstacles, air quality monitoring methods must be improved over time, and a sophisticated knowledge of the interactions between different contaminants and how they affect human health is also necessary. Prospectively, the constant drama surrounding COP conferences complicates the relationship between air quality and policy even further. During the historic COP 27, which took place in November 2022 in Sharm El-Sheikh, Egypt, a loss and damage fund was established to address the effects of climate change, particularly air pollution. This historic ruling is a reflection of the increasing understanding of how closely related air quality and global environmental issues [104]. Similar to this, COP 28, which is taking place in Dubai, United Arab Emirates, aims to expedite the implementation of the Paris Agreement by emphasizing pollution reduction plans and air quality targets [105].

6.3 Environmental and Economic Ramifications

Air quality assessments have implications that go well beyond public health, embracing wider environmental and economic dimensions. The dynamics of the climate, biodiversity, and ecosystems are all greatly impacted by poor air quality (Chen et al., 2021). Acid rain is caused by pollutants like sulfur dioxide (SO_2), carbon monoxide (CO), and nitrogen oxides (NOx), which deteriorate soil, damage flora, and have a negative impact on aquatic life [101]. Furthermore, these pollutants among them, greenhouse gases amplify the effects of climate change, increasing the frequency of extreme weather events and upsetting the delicate ecological balance. The ramifications are complex from a financial point of view. Industries must pay high compliance expenses to meet air quality regulations, which affects their profitability and operational effectiveness [106]. Furthermore, the cost of treating diseases brought on by air pollution places a heavy financial load on society, taxing healthcare systems and lowering general productivity. It will take coordinated action, strong legislation, and international collaboration to address these broader environmental and economic effects in order to protect ecosystems, slow down climate change, and ease the financial burden that air pollution is causing [107].

7. CONCLUSION

In conclusion, the comprehensive review highlights the complex relationship between air quality measurements and their significant effects in several of ways. The crucial role that air quality metrics, particularly the Air Quality Index (AQI), play in protecting public health is underscored by the important relationship that exists between these parameters and health. Poor air quality offers serious hazards, ranging from aggravating respiratory problems to impacting mental health. This highlights the need for thorough assessments and effective public health initiatives. In addition, the fact that air quality assessments have an impact on policies and regulations at the regional and international levels indicates how important they are in creating environmental laws and reducing hazards to public health. But there are still issues with creating AQI measurements that are usually flexible, which calls for improved monitoring methods and area-specific models. To address these issues, cooperative endeavors, more environmentally friendly technology adoption, and increased public involvement are necessary. With that in mind, the trajectory of the future demands increased public awareness, technology developments, and more robust regulatory frameworks. Global cooperation is bolstered by international conferences like COP, while community-driven solutions are established by initiatives like the Green Pakistan Project.

8. FUTURE DIRECTIONS

8.1 Potential Solutions and Recommendations

Many approaches are needed to solve the complicated problem of air pollution. It is essential to implement uniform procedures for data collecting and calibration amongst monitoring devices. By doing this, authorities and organizations in charge of monitoring air quality can make better decisions because the information acquired will be accurate and consistent [108]. Another crucial step is to create customized models of the Air Quality Index (AQI) that are adaptive to particular regions. Diverse regions encounter distinct origins of contaminants, and comprehending these regional disparities is imperative for more precise evaluations. These models can give citizens and politicians more accurate and pertinent information by accounting for geographical variations [41]. An important step forward for

Pakistan is the investment in cleaner technology. Significant reductions in air pollution can be achieved by enacting strict emission laws and encouraging environmentally friendly business and transportation operations. This move to more environmentally friendly methods is in line with international initiatives for environmental preservation and sustainability [109]. Furthermore, it is crucial to promote public knowledge and involvement through policy advocacy and educational initiatives. Educating the public about the negative impacts of air pollution can motivate both individual and group behavior. An all-encompassing strategy to combat air pollution is created by including communities in the advocacy of policy changes and the adoption of environmentally beneficial practices. By combining these approaches, we can create a more sustainable and healthy environment that benefits everyone, not just in Pakistan [110].

8.2 Future Trends

The future of air quality assessment is greatly influenced by public awareness and involvement, interdisciplinary collaborations, and technology improvements. People can be encouraged to take an active role in enhancing air quality by educating their communities about the value of clean air, its effects on health, and the role that individual actions can perform [111]. Initiatives driven by the community, citizen science endeavors, and educational campaigns can cultivate a sense of accountability and group effort.

Moreover, regulatory frameworks must be continuously improved to take into account newly developing contaminants and shifting environmental dynamics. Together, governments and international organizations should set and implement strict guidelines for air quality, encourage the adoption of greener technology, and sanction actions that worsen air pollution [112]. Transportation, industrial, and urban planning practices can all become more sustainable with the implementation of policy interventions grounded in scientific knowledge. As technology advances, integrating smart city solutions like sensor networks and Internet of Things devices can provide real-time data for more thorough air quality monitoring [113]. These developments improve data collection and speed up the process of mitigating pollution sources.

The Green Pakistan Project is a prime example of a community-driven program designed to

address environmental issues, such as air pollution. Provide a brief explanation of its initiatives that help to improve the quality of the air, such as tree planting drives, awareness campaigns, and sustainable land management techniques [114]. Moreover, programs such as the 'Green Pakistan Project' in Pakistan serve as excellent examples of community-based initiatives that actively tackle air pollution. By organizing large-scale tree planting events, promoting sustainable land management techniques, and holding public awareness campaigns, the project gives communities the power to take control of their air quality and make long-term environmental gains [115].

The importance of the COP as a worldwide forum for cooperative action on environmental challenges, such as air pollution, should be emphasized. In relation to the assessment of air quality, you can draw attention to particular decisions made at previous COPs, such as strengthening international collaboration on research and development or establishing more stringent guidelines for air quality [116]. Furthermore, the Conference of Parties (COP) provides an essential forum for international cooperation on matters pertaining to air quality. Aspiring targets for lowering air pollution have been set by recent COP agreements, such the Paris Agreement, which has also encouraged international cooperation in the development of cleaner technology and monitoring methods [117].

In summary, protecting air quality for the benefit of people around the world will require a multidisciplinary approach that incorporates scientific research, technological innovation, public participation, and strong legislative frameworks. In order to address the complex issues raised by air pollution and guarantee a sustainable and healthy environment for future generations, cooperation amongst many stakeholders is essential.

DISCLAIMER (ARTIFICIAL INTELLIGENCE)

Author(s) hereby declare that NO generative AI technologies such as Large Language Models (ChatGPT, COPILOT, etc) and text-to-image generators have been used during writing or editing of manuscripts.

COMPETING INTERESTS

Authors have declared that no competing interests exist.

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