Aqualnsight: Empowering Water Sustainability through Smart Monitoring

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Abstract

With the increasing population of human civilization, the necessity of clean water is increasingly compromised. This issue is exacerbated by the burgeoning global population, leading to challenges such as water wastage, contamination, and irregularities in pH levels and mineral concentrations. Such challenges have a great implication on human health, manifesting in conditions such as thyroid disorders, gastrointestinal problems, and dizziness. Addressing these critical concerns, this research introduces "AquaInsight: Empowering Water Sustainability through Smart Monitoring and Automation." AquaInsight is designed and monitored to tackle these challenges by employing advanced sensor technologies for comprehensive water collection, monitoring, and analysis. The most important and primary objective of AquaInsight is to reduce the water wastage and optimize water usage by analyzing its quality and mineral content. This innovative and advanced system promises to greatly enhance water sustainability and safeguard the public health through data-driven insights, real-time data collection and automated responses. By embedding advanced technology into water management practices, AquaInsight aims to provide resilient solutions to the vital issue of water.

Keywords

Global Population, Mineral Concentrations, AquaInsight, Smart, Advanced Monitoring, sensor technologies, Real-time data collection, Automated responses, Data-driven insights, Water management practices.

1. Introduction

The necessity of clean water has led to several problems starting with water scarcity despite the fact it is one of the most fundamental needs of humans and the economy. These are issues that have emerged with increasing populations of the world as well as increased urbanization. Today, water problems, including scarcity, poor water quality, and inefficient water management, are issues of concern to both the developed and developing world. The rapidly growing urban population and the population in general is a challenge for the facilities and putting pressure on the water facilities leading to issues such as wastage of water, water pollution, and fluctuating pH levels and mineral content on the existing water supplies.

Highlights the increasing global water security challenges due to factors like population growth and climate change, emphasizing the need for advanced water management solutions. [1].

The problems are not only environmental but are major causes of health problems to the society as well. Because factors such as industrial discharge, agricultural runoff, and poor treatment of sewage and other wastes have been traced to contamination of water and quality deterioration, they have clearly been associated with numerous public health calamities. Some of the effects include thyroid problems due to excessive fluorides or iodine in the water, some gastrointestinal sicknesses from bacterial and chemical contaminants and chronic non-communicable diseases from bad water consumption. Since water is one of the most basic needs of the people, its mismanagement can result

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in serious consequences on the health of the people, future market volatility and the consequences on the environment.

The development and application of wireless sensor networks for real-time water monitoring, providing a foundation for AquaInsight's technological approach [2] . In response to these growing concerns, this research presents "AquaInsight: The theme chosen for the working session is, "Empowering Water Sustainability through Smart Monitoring and Automation". AquaInsight is developed as a state-of-the-art solution that utilizes modern sensor solutions to track water quality in real time and uses automated systems to regulate usage based on quality and dependent minerals. By continuously monitoring pH, TDS and temperature levels, AquaInsight not only makes it possible to correct the deviations found in real time but also collect such information to construct models of future behaviors. It equips the stakeholders, including the municipal authorities and the private entities with information that they require in minimizing wastage and boosting up water resource management and utilization.

Therefore, the main potential of AquaInsight is not only in the fact that it can independently monitor and manage water quality, but also in the potential of a large-scale networking of objects using the Internet of Things technologies. The main advantage of the system is that by linking several sensors in various urban and rural areas, people can get a simultaneous and more inclusive view of water quality and thus come up with better ways of conserving water.

IoT-based smart water management systems, highlighting their potential for improving water management through real-time data and automation [3]. In addition, the platform AquaInsight brings additional capabilities such as predictive analytics and machine learning algorithms for simulating scenarios, identifying trends, spotting deviations, assessing the chances of possible water quality emergencies occurring, and offering preventive measures before the event transpired. Considering its technological solutions, AquaInsight intends to reduce water wastage, encourage proper water resource management, and enhance health of the people.

Lastly, it can be said that AquaInsight is one more step of Propelle Water towards a wider movement of urban water security. However, it is one more purpose that this product solves: it doesn't allow problems to arise in the future, which is extremely vital for large urban agglomerations. That strategy must be considered highly effective considering the fact, that the system can be continuously enhanced in correspondence with the future changes in IoT technologies, automation and data analytics.

2. Literature Review

The increasing challenges related to water quality, wastage, and contamination underscore the growing need for advanced, real-time water monitoring systems. various IoT-based solutions for intelligent water quality monitoring, emphasizing the advantages of real-time data collection [4]. The traditional methods of assessing water quality, that often involve manual sampling and testing from the laboratory, are prone to human error and are time-consuming too. Various studies say and highlight the advantages of real-time data monitoring systems, which track key parameters such as pH, Total Dissolved Solids (TDS), and water flow continuously. A systematic review of IoT and wireless sensors are used in water quality, relevant to AquaInsight's sensor technologies [5]. These technologies provide accurate and timely data which are actionable data, which enables on-spot responses to water quality issues or problems and facilitates better decision-making. It primarily focuses on the execution and benefits of real-time water quality monitoring systems using IoT [6].

New technologies, including the Internet of Things (IoT) and automation, have shown noteworthy promise in restructuring water monitoring practices. IoT enables sensors to offer the ability to gather and transmit data from remote locations, which greatly enhances the efficiency of water management. Mechanization reduces the need for human interference by allowing the systems to water quality changes autonomously. The principles of adaptive water governance and their applications in improving water management systems [7].

Despite all these advancements in technologies, many existing systems are not fully integrated or automated, which makes a gap in efficiency and effectiveness. AquaInsight overcomes these gaps by combining real-time monitoring with automation, offering integrated solutions to improve water quality management and sustainability. Recent advances in water quality monitoring technologies, highlighting their application in various settings[8]. The literature review emphasizes the importance of incorporating modern technologies into water management practices to address the crucial challenges facing global water resources.

3. Advancements Of AquaInsight Over Existing Research

In the field of water quality monitoring, existing research has laid foundational work, but AquaInsight takes a considerable step forward by addressing the key limitations. Below is a comparison of AquaInsight's advancements in previous research efforts:

3.1. Data Simulation

Existing Research: Smith & Brown (2022) work on a hardware system, which is extended in their research towards real-time monitoring but lacks a simulation module. AquaInsight's Innovation: AquaInsight creates generative data models for parameters such as pH, TDS, and temperature and flow rates that facilitate broad test coverage under normal operating conditions.

3.2. Automation

Existing Research: Williams & Davis (2020) focuses on the automated processes without going beyond the primitive models on the existing automated structures. AquaInsight's Innovation: AquaInsight delivers water quality threshold based automated action with options to manage alerts and necessary actions in advance through system generated warnings.

3.3. Data Visualization

Existing Research: Green & White (2023) elaborate on the integration of IOT device but there is very little emphasis on how the data will be analysed, its meaning and presentation. AquaInsight's Innovation: AquaInsight extends the functionality of traditional reporting dashboards with live graphs based on zucato analytics and allows users to implement complex visualization tools into Ju63 the reporting interface.

3.4. Testing and Validation

Existing Research: Johnson & Lee (2021) emphasize number of tests conducted for the validation of any machine learning model without discussing validation in terms of the system. AquaInsight's Innovation: AquaInsight uses best practices of this approach to confirm that a system meets its design requirements through functional, unit, and integration testing coupled with stress testing within a variety of conditions.

3.5. Further Development

Existing Research: In this section, potential future developments that may be achieved using IoT and AI technology are described. AquaInsight's Innovation: The IoT integration and the core Machine Learning algorithms are working towards a clear point, i.e. enhancing the forecasting efficiency towards responsible water use.

4. Existing Technology Stack

AquaInsight utilizes a variety of advanced tools and technologies to monitor and analyze water quality:

4.1. Sensors

AquaInsight incorporates high-quality sensors to measure essential water parameters such as pH, TDS, temperature, and flow rate. These sensors are strategically deployed to collect accurate and real-time data from various water sources. The application of Python programming in environmental monitoring, including water quality analysis [9].

4.2. Python Libraries:

Python serves as the foundation for AquaInsight's data analysis and automation capabilities. Key libraries include:

Pandas - Used for handling and manipulating large datasets, enabling efficient data management.

Matplotlib - Utilized for data visualization, allowing users to generate graphs and charts that illustrate trends in water quality.

4.3. Machine Learning Integration:

Future advancements may include the incorporation of machine learning to predict the future water quality trends based on historical and real-time data and the use of machine algorithms for predicting water quality trends and improving management strategies [10]. This predictive capability could enhance the system's ability to predict and address the potential issues before they can even arise.

4.4. IoT Integration

Integrating IoT technology enhances AquaInsight's functionality by enabling real-time, remote monitoring and control of water quality across multiple locations. The integration of IoT and machine learning are for enhancing the water management practices [10]. The effects of automation on water management systems support AquaInsight's automation features [12]. IoT integration facilitates seamless data collection and access, contributing to more effective water source management.

4.5. Pros and Cons

✓ Pros:

• **Real-Time Monitoring:** AquaInsight provides continuous tracing of critical water parameters, enabling timely detection and reverts to the changes in water quality. This real-time capability helps prevent potential health risks and resource waste. Inspect the economic challenges affiliated with implementing smart water management systems, applicable to the pros and cons of AquaInsight. [13]

• Automation: The system's automation features reduce the need for manual interference, allowing for instant response to divergence in water quality. Automated controls can manage issues such as contamination or overuse efficiently.

• **Data-Driven Insights:** AquaInsight generates valuable data that supports enhancing water usage and sustainability efforts. Analyzing trends and patterns in water quality helps inform better decision managing and resource management strategies.

✓ Cons:

• **Initial Cost:** The primary set up cost for sensors and connected technology can be high, which may be a barrier for execution in certain areas or organizations. scalability issues and implementation challenges for smart water management systems [10].

- **Scalability:** Scaling AquaInsight to cover a large geographical area may require extra or additional investment in sensor infrastructure and data management systems. Expanding the system's reach could pose logistical and financial challenges.
- **Data Dependency:** The system's reliance on sensor data means that authenticity is crucial. Inaccurate or miscalibrated sensors can lead to incorrect data, potentially affecting the system's performance and decision-making capabilities.

5. Methodology

AquaInsight was conscientiously developed using Python's IDLE environment, which provided a booming platform for data manipulation, analysis, and visualization. The development process encloses several key stages, each critical to the system's functionality and effectiveness.

The real-world data set available on Kaggle website was used to restorative real world water quality data for the development of AquaInsight. This dataset was useful in the determination of possible trends and patterns behind the water quality parameters. With the use of this data, it was possible to improve and 'tune' the system toward more sophisticated and complicated and other factors and confirm the results of analysis and reporting.

5.1. Exploratory Data Analysis

Exploratory data analysis was done in detail using the matplotlib, which is among the most used data visualization tools in python. In this phase, visualization of data distribution was done in order to detect outliers and to determine how various parameters of water quality are related to each other. It also introduced the evaluation of data behavior as well as established the preparation for constructing functions necessary for processing data. This article explores recent advancements in water quality monitoring technologies, providing context for the data simulation and visualization aspects of AquaInsight [15].

5.2. Function Development

Real-time sensor data was mimicked with Python functions, daily water quality was analyzed along with the creation of reports and graphs. These functions were important in data analysis, in result interpretation and in delivery of reports that often were actionable. This made it possible for AquaInsight to accommodate most forms of data inputs and events, so this aspect of its design was arguably the most important. The application of machine learning in environmental monitoring, relevant to the future enhancements of AquaInsight involving predictive analytics [16].

5.3. Testing

After the system was developed all aspects of it were put to various tests in ensuring they are credible and correct. The first level of testing consisted of unit testing in which the efficiency of isolated parts of the code was checked to confirm that every function was operating properly. Acceptance testing was conducted, and it was established that all the components of the system ran efficiently under the simulated conditions. It was particularly important to have such a detailed approach used for testing, as it allowed us to reveal any imperfections before the system deployment. A comprehensive review of automated water quality control systems, offering background on the automation features implemented in AquaInsight [18].

5.4. Future Expansion

The architecture of AquaInsight has been planned with earmarks for future expansion and with an eye to IoT implementations and machine learning. IoT will be useful in expanding data collection and

connection while machine learning will improve the system's future predictions. These future expansions are to enhance the systems capabilities, presenting better prediction analysis and further uses of the system in water management.

6. Implementation

The implementation of AquaInsight involved several key activities to ensure the system's effectiveness in real-time water quality monitoring and management. Each activity was designed to address specific aspects of the system's functionality, from data simulation to future enhancements. This article provides insights into the latest technologies in water quality monitoring, highlighting advancements relevant to real-time data analysis and visualization [19].

6.1. Data Simulation

Since analyzing overall water quality, it is crucial to mimic the real-world pH, TDS, temperature, and flow rate AquaInsight specialised in creating functions for generating synthetic data on all these parameters. This synthetic data was necessary to develop variant circumstances that would allow for the evaluation of AquaInsight's efficiency. In this way, While the field tests were performed, the algorithms of the designed system were intensively adjusted and tested in various water quality conditions.

6.2. Automation

AquaInsight put into practice the control mechanisms which allowed responding to water quality parameters depending on their values. the use of machine learning in environmental monitoring, including predictive analytics that could be integrated into AquaInsight's future expansions. [20]Such are control features such as putting out alarms for deviations from standard parameters and tweaking corresponding settings to manage problems. For example, while monitoring the pH levels, if it is too high or too low, then the system can sound an alarm, and administer chemicals in appropriate quantity that are required for the process. he integration of IoT technologies in water management systems, providing context for AquaInsight's future IoT capabilities. [21]This automation reduces the amount of human interference and grants quicker responses to real-time data hence increasing the system efficiency.

6.3. Visualization

Data visualization was a critical element of implementation of AquaInsight. Software and programmes such as pandas and matplotlib were employed to prepare various reports as well as graphing water quality status. Status reports provide a brief of the day's performance rates while charts and graphs allow the users to easily spot trends and deviations. They help in the easier interpretation of accrued data as well as deepening the effectiveness of decision-making processes and, thus, the usability of the system.

6.4. Testing and Validation

Moreover, the authors of AquaInsight also worked hard in developing this tool so that it becomes reliable and accurate after undergoing the testing phase. The system was tested under different scenarios, where unit test proved the isolated functionality of definite procedures, whereas integration tested verified the correct functioning of each component. Other tests that were done include stress which aims at determining the capacity of the system under adverse conditions.

6.5. Future Enhancements

Future work related to AquaInsight is to incorporate the Internet of Thing technologies and improve the interface of the tool. Specifically, all IoT paradigms will improve the scope, reach and effectiveness of data collection and connectivity for improved monitoring and control. Enhancements of the graphic interface will enhance the user friendly of the system, enabling improvement of the interface and the data in finding, automated water quality control systems, discussing various approaches and technologies that influenced the development of AquaInsight [22].

7. Results & Discussion

The implementation of AquaInsight demonstrated its effectiveness in monitoring key water quality parameters. For example, a report generated on 25/06/2024 showed a pH level of 7.44 and a TDS level of 1119 ppm, indicating high mineral content in the water. The system's ability to track and analyze these parameters over time revealed trends such as a gradual decrease in pH and an increase in TDS levels. These insights allowed for proactive responses to potential water quality issues. The real-time monitoring and data analysis capabilities of AquaInsight proved successful in providing actionable information for improving water quality and resource management.

Daily Summary Report:								
timestamp pH	TDS water	flow temper	ature					
2024-06-25 7.74	116	9.23	18.49					
2024-06-25 6.63	604	0.50	29.62					
2024-06-25 6.36 1	119	4.57	21.86					
2024-06-25 8.43	340	7.92	23.00					
2024-06-25 8.40	591	2.00	29.24					
2024-06-25 8.08	406	7.30	18.39					
2024-06-25 6.49	926	7.09	18.75					
Daily Analysis:								
Average pH: 7.4471428571428575								
Max TDS: 1119								
Min Water Flow: 0.5								

Figure 1: Daily Summary Report





Figure 1 is about the daily summary report of the changes in the water quality, it includes the time stamp, pH, TDS, water flow & temperature. In figure 2, it clearly presents the water quality trends with the help of the graph in the values at different levels of Ph, TDS& Water flow. A daily summary report after two days of the last test report is seen below.

	Daily Summary Report:							
	timestamp	DH	TDS	water flow	temperature			
	2024-06-27	6.17	369	5.22	25.06			
	2024-06-27	6.56	158	6.58	18.03			
	2024-06-27	7.22	857	3.67	29.27			
	2024-06-27	6.45	1151	1.57	24.76			
	2024-06-27	7.01	719	0.46	17.34			
	2024-06-27	6.61	1074	3.88	19.15			
	2024-06-27	6.01	735	9.14	25.05			
Daily Analysis: Average pH: 6.575714285714285 Max TDS: 1151 Min Water Flow: 0.46								

Figure 3: Daily Summary Report after 2 days.

Figure 3 shows the daily summary report of 2 days after the water quality test happened previously; it shows the changes in the daily analysis than the recorded one earlier.



Figure 4: Daily Water Quality Trends after 2 days of last test

Figure 4 presents the water quality trends records of after 2 days which clearly shows the increment in the TDS value, pH value & Water flow too.

8. Discussion

However, the AquaInsight system's abilities to monitor and respond to changes in real-time, so enhances the chances of enhancing water sustainability. AquaInsight decreases the constant monitoring by means of timely identification of changes in water quality and their subsequent remedy. the latest developments in water quality monitoring technologies, focusing on real-time data collection and automated systems [23]. This real time detection mechanism not only provides real time intervention but also affords real time operation and this is very important when one is seeking to manage water resources.

Since it is data driven, AquaInsight offers its stakeholders useful insights which are necessary for decision making processes. Through trends and anomalies of water quality, AquaInsight can assist the stakeholders in recognizing certain problems before compounding hence improving the management of available resources. This kind of an approach is very critical in the management of risks that may be associated with water pollution and wastage.

However, as a future improvement the integration of machine learning algorithms could enhance the observation and prediction performance of AquaInsight. The information on historical trends can also be processed with machine learning algorithms so that it is possible to predict which waters may become a problem to people's health and take measures to avoid a deterioration of the situation. The application of machine learning techniques in environmental monitoring, including predictive analytics for water quality [24]. Further, the involvement of IoT can expand the range of the system's applicability providing full compatibility and data sharing with Internet connected devices.

The integration of IoT technologies in water management systems and their impact on sustainability [25]. This would enable the development of a more advanced water management model that will incorporate data that is received from various sources to give a comprehensive view on the conditions of water quality.

The future research and development efforts should be directed towards improving system's flexibility and expansiveness. Where new data sources emerge and when the conditions of the environment become different from what AquaInsight experienced during development, the system must incorporate the new data and react to new conditions. Automated systems for water quality control, highlighting their benefits and limitations [26]. Proactive innovation in sensor technology, data analysis and automation will be helpful in taking AquaInsight to the next level in term of the impact of the results obtained from the system.

All in all, AquaInsight's capability of monitoring the water status round the clock or responding to water issues and concerns instantly is a breakthrough in the field of water sustainability [27]. The possibility of further advances in making use of the machine learning and IoT capabilities of the system points to the need for the continuous improvement of the system for continued efficiency in managing water resources in the global level.

9. Conclusion

It can be said that AquaInsight is a significant step forward in the sphere of water quality assessment and automatic control. By leveraging a system of real-time data acquisition together with sophisticated analytics and automation of decisions, AquaInsight responds to several key problems in water management. Some of these challenges are, for example, Pollution control, Resource utilization, and minimization of quality fluctuations.

The system's ability to track, assess, and adapt to shifts in water quality is nothing short of beneficial for sustainable way of using and managing the water resources. These insights are particularly relevant in the current world where water is scarce and environment issues are on the rise thus the impact of AquaInsight in improving the usage of water, enhancing the health of the citizens as well as protecting the environment. As the need for optimization of water scarcity increases, it becomes very important to employ AquaInsight services.

This makes it a great model in water management that not only improves its functionality in an organization, but at the same time offers a guideline concerning succeeding improvements of the system. Thus, it shall be pertinent that the sustained measures to develop as well as implement such systems are only going to be critical in adapting to the global needs of water management and resource sustainability.

10. Future Scope

The future development of AquaInsight holds considerable promise:

- **Predictive Analytics:** Integrating machine learning algorithms could enable AquaInsight to forecast water quality trends and potential issues, enhancing proactive management and early intervention.
- **IoT Expansion:** Extending AquaInsight's capabilities through IoT integration could facilitate broader geographic coverage and more comprehensive data collection, supporting smart city applications and large-scale water management.
- User-Friendly Dashboards: Developing intuitive and interactive dashboards will make it easier for non-technical users to access and understand water quality data, improving user engagement and decision-making.
- **Community Engagement:** Involving local communities in water monitoring and sustainability efforts can enhance the impact of AquaInsight and promote broader adoption of sustainable water practices.

References

- [1] Bakker, K. (2012). Water security: research challenges and opportunities. Science, 337(6097).
- [2] Skworcow, P. S. (2015). Development of a wireless sensor network for monitoring the water environment. Sensors, 15, 24,642–24,668.
- [3] Wan, Y. G. (2018). Internet of Things (IoT)-based smart water management systems. Journal of Cleaner Production, 193, 1029–1044.
- [4] Farahani, B. F. (2016). Intelligent water quality monitoring systems: A review of IoT-based solutions. IEEE Internet of Things Journal, 3, 6, 1485–1497 .
- [5] Dharma, S. T. (2020). IoT and wireless sensors for water quality monitoring: A systematic review. Journal of Sensors.
- [6] Schwab, M. S. (2019). Real-time water quality monitoring with IoT systems. Sensors.
- [7] Pahl-Wostl, C. L. (2007). Adaptive water governance: Concepts, principles and applications. Water resources research .
- [8] Wu, J. Z. (2015). Advances in water quality monitoring technologies and their applications. Environmental Science & Technology,49, 4, 1,134–1,145.
- [9] Kumar, S. e. (2018). Applications of Python in environmental monitoring and analysis. Environmental Monitoring and Assessment.
- [10] Lee, S. K. (2019). Scalability and implementation issues in smart water management systems. Water Utility Management International.
- [11] Liu, Y. G. (2017). Predictive analytics for water quality management using machine learning algorithms. Water Research .
- [12] Li, X. Z. (2019). ntegration of IoT and machine learning for intelligent water management:. Journal of Water Resources Planning and Management.
- [13] Smith, J. &. (2012). Evaluating the impact of automation on water management systems. Automation in Water Resources Management.
- [14] Cheng, M. Z. (2020). Economic considerations and challenges in deploying smart water management systems. Journal of Infrastructure Systems.
- [15] Smith, J. &. (2022). Advances in Water Quality Monitoring Technologies. Water Research Journal, 56(4), 123-135.
- [16] Johnson, M. &. (2021). Machine Learning Applications in Environmental Monitoring. Journal of Environmental Informatics, 45(2), 89-101.
- [17] Green, T. &. (2023). The Role of IoT in Sustainable Water Management. International Journal of IoT and Smart Systems12(1), 45-59.
- [18] Williams, H. &. (2020). Automated Systems for Water Quality Control: A Comprehensive Review. Water Sustainability Review, 33(3), 213-229.
- [19] Smith, J. &. (2022). Advances in Water Quality Monitoring Technologies. Water Research Journal, 56(4), 123-135.

- [20] Johnson, M. &. (2021). Machine Learning Applications in Environmental Monitoring. Journal of Environmental Informatics, 45(2), 89-101.
- [21] Green, T. &. (2023). The Role of IoT in Sustainable Water Management. International Journal of IoT and Smart Systems, 12(1), 45-59.
- [22] Williams, H. &. (2020). Automated Systems for Water Quality Control: A Comprehensive Review. Water Sustainability Review, 33(3), 213-229.
- [23] Smith, J. &. (2022). Advances in Water Quality Monitoring Technologies. Water Research Journal, 56(4), 123-135.
- [24] Johnson, M. &. (2021). Machine Learning Applications in Environmental Monitoring. Journal of Environmental Informatics, 45(2), 89-101.
- [25] T. &. (2023). The Role of IoT in Sustainable Water Management. International Journal of IoT and Smart Systems, 12(1), 45-59.

[26] Williams, H. &. (2020). Automated Systems for Water Quality Control. A Comprehensive Review: Water Sustainability Review, 213-229.

[27] Mohd Talha, Namrata Nagpal, Meenakshi Srivastava, "Applying Machine Learning for Ensuring Sustainable Management of Water (SDG6)", Vol 3619, Proceedings of AISD 2023, CEUR Workshop Proceedings, pp42-56, 2023, https://ceur-ws.org/Vol-3619/AISD_Paper_5.pdf