

Enhancing Energy Efficiency in HVAC Systems through Intelligent Control Strategies

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Abstract:

Their operation is importance to provide comfort in indoor environment in residential and industrial buildings through Heating, Ventilation, and Air Conditioning (HVAC). Nonetheless, HVAC systems remain one of the most energy-consuming elements of buildings, contributing to more than 40 percent of a buildings energy usage. In this paper, the various intelligent control approaches deployed to improve the energy management of HVAC systems are discussed. Precise data acquisition in real time, machine learning algorithm, predictive control, as well as technology that contemplates demand response, help intelligent HVAC systems to decrease energy use while keeping proper indoor climate. The paper describes the contemporary technologies, their possibilities, and barriers for the developing more sustainable HVAC systems operation.

Keywords: Energy Efficiency, HVAC Systems, Intelligent Control Strategies.

1.Introduction

Thus, the global demands for energy efficiency grows along with the overall utility requests for the enhancement of energy use across the industries [1]. HVAC is a major consumer in each building, and consume irregularly across the world, contributing to about 40% of total energy consumption in buildings of the world especially in the urban built environment. Indoor environmental quality in buildings is partly determined by HVAC systems and their proper use but poor energy use may lead to high energy utilization and thus high operating costs. Therefore, enhancing the efficiency of HVAC systems has been seen as the need today given the need to conserve energy.

The main drawback of the conventional HVAC control systems is that they are largely based on time-sequential control and constant parameters including constant temperature set points, rather than the variation in outside conditions, number of people in the building and the way the building is being

used [2]. Thus, these systems run not very effectively; typically, they consume more energy than needed to condition the indoor environment. To this end, researchers and engineers have been incorporating intelligent control strategies into HVAC systems that include but not limited to; machine learning, AI, and IoT towards enhancing energy use.

Thus, the present paper sets the goal to investigate the application of intelligent control approaches for improving energy intake by HVAC systems [3]. Some of these techniques are the Model Predictive Control (MPC), Fuzzy logic, machine learning and demand response which are effective in real time control of system performances. Advanced and autonomic systems capable of sensing ambient conditions enable intelligent control of heating, ventilation and air conditioning and can minimize energy use while producing or enhancing the quality of a building's internal environment.

The emergence of intelligent controls as the means of temperature control is not the new trend of dealing with HVAC anomalies, but a way to present the proper forecast and thus to achieve a more efficient energy consumption rate without affecting the audience comfort [4]. The present paper will therefore assess the current progress of intelligent HVAC systems, the technologies behind the advancements, the advantages and the limitations of using the systems and eventually deduce further development of the research area and its prospects.

2.Traditional HVAC Control Systems

Conventional HVAC control systems are the basic means of managing indoor climates in buildings [5]. They control temperature, humidity and air quality hence making climate comfortable for occupant. However, although prevalent in the industry, some of these systems suffer from inefficiencies and inflexibilities hence cause huge energy losses. In this section, we will discuss how conventional HVAC systems work, looking at their challenges that make them inefficient in efficient use of energy [6].

2.1 Introduction on Ordinary Control Systems

Traditional HVAC systems are known to run on simple control like thermostats, time switches and contactors. These systems operate based on set temperatures and the time schedule for operation that is set by the user. The two most common control strategies employed in traditional HVAC systems are [7]:

On/Off Control: This is the most basic type of control in which the HVAC starts when the temperature inside the building deviates from a certain band and stops when the preferred temperature has been achieved. Although this approach successfully maintains fundamental comfort, it produces a lot of cycling and overworks the system and devices, besides being energy wasteful.

Proportional-Integral-Derivative (PID) Control: PID control systems offer a further improved control variation ability by continuously varying HVAC system outputs whenever there is a temperature change. PID controllers attempt to reduce the error between current temperature and the desired temperature by comparing the change rate to the desired rate and manipulating the activities of the system accordingly. When compared to simple on/off controls, PID controllers are much more efficient, however, they only change process state based on static setpoints and are not as efficient when environment changes rapidly.

2.2 Disadvantages of Conventional HVAC Systems

While conventional control systems have served the HVAC industry for decades, they have several inherent limitations that hinder energy efficiency [8]:

Lack of Real-Time Adaptation: Conventional HVAC depends on basic schedules;therefore, it cannot detect changes in the occupancy, weather condition or the building load factor. For example,

with outdoor weather changes such as a warm day, or when a particular room is empty, the system remains active and thus wasteful of energy.

Fixed Setpoints and Schedules: Traditional systems involve the use of fixed temperature set points and time programs that are not sensitive to the changing use rates. Apart from that, during the time that nobody occupies a building, like during the night-time, or during weekends – these systems could continue heating or cooling the space, which is counterproductive. Likewise, systems may also overcool or overheat areas with a varying occupancy level throughout the day, if changes to occupancy are not considered.

Limited Feedback and Monitoring: The fundamental control systems fail to capture the information processing capacity for real-time evaluation of HVAC systems. Some of the distinctions are: In traditional system there are no feedback mechanism to initiate the system to self-correct according to actual conditions as well as the system cannot self-optimize or improve the performance by utilizing energy demand and comfort level.

Inefficient Energy Consumption: It is found out that traditional HVAC systems are not effective in adjusting their energy consumption to provide comfort; thus, they use more energy as is required. It gets worse in big commercial buildings or areas with variable climate since the system is often fixed to regulate the temperatures in the various areas, meaning they will need to be adjusted frequently.

No Predictive Capabilities: The greatest of limitation of conventional HVAC systems is that they are either unable to adapt to changes and predict conditions in advance or they cannot foresee energy requirements. They respond to temperatures only after they have risen or dropped, thus serving the house occupants with inconveniences such as extremely high or low indoor temperatures and unnecessarily high-power consumption.

2.3 Energy and Cost Concerns

Nonetheless, the major downside of conventional HVAC systems is that they are non-responsive, which affects energy expenditure. Heating and cooling systems in stores and offices, for example, may work when people are not in the buildings or when the workload may be adjusted to outside or inside circumstances. For example [9]:

In the commercial buildings, HVAC systems could be operating at full strength during off-hours during the night or on the weekends and drawing nearly as much power as when the construction is open. In residential buildings, occupants program the thermostat to a single temperature for the whole building regardless of the outside temperature, people presence or time of the day.

These lead to high electricity bills and poor environmental status since too much energy is used in the processes. The U.S. Department of Energy has estimated that peak HVAC energy could be reduced by about 20 percent or more if desired however conventional systems fail to achieve this goal due to lack of dynamic control.

2.4 Other reasons for developing Intelligent Control Systems

The shortcoming of the current conventional HVAC control systems highlights the importance of incorporating better intelligent solutions that can adapt to differences. With the current trend of advancing building energy codes together with the market demand for sustainability's integration, there has been a growing *raison d'être* for effective control systems that can efficiently maintain the comfort levels of buildings while consuming optimal energy. Evolving from traditional controls HK HVAC systems can overcome the inefficiencies through the incorporation of superior sensors, data analytics and machine learning algorithms. In the next Section, more details of these intelligent

control strategies, such as model predictive control, machine learning, demand response control strategies and their potential to revolutionise the HVAC system operation, will be presented.

3.Intelligent Control Strategies

Management based on advanced control patterns can be regarded as a rather important step in the development of power-supplying smart systems of the HVAC type [10]. These systems make use of superior algorithms, updated information and increased use of automation to enhance the systems that control HVAC to make it energy efficient while at the same time offering comfort conditions indoors. Contrary to conventional control approaches, proven intelligent control techniques can respond to dynamic conditions, including occupancy status, weather system, and the building loads, thus making HVAC systems efficient and sustainable. This section discusses several types of intelligent controls for the improvement of energy management of HVAC systems which comprise Model Predictive Control (MPC), machine learning techniques, fuzzy logic systems, and demand-response frameworks.

3.1 Model Predictive Control (MPC)

MPC is a sophisticated form of control system that was developed to control HVAC systems through the prediction of the systems behavior soon using mathematical models [11]. Indoor conditions such as temperature and humidity are expected by MPC using algorithms and then control of HVAC operations are logically advanced to avoid high energy demands.

3.1.1 How MPC Works

MPC is thus able to constantly track the indoor temperature, the density of people inside the building, the outdoor weather conditions, and the price for energy. Using this data it forecasts the future energy requirements and works out the control actions to be taken, such as altering the speed of fans or altering the set-point. MPC, unlike other control systems, is active, and it makes decisions with reference to predictions of events, not reality.

MPC typically relies on:

This would include, a model of the HVAC system, and a model or characteristic of the environment within the building. Control architectures for determining control actions that will result in effective energy management whilst maintaining comfort levels. Reiteration of d and e where forecasts and regulation processes are updated based on data fed from the operating system.

3.1.2 Benefits of MPC

Energy Savings: MPC can make it possible to control HVAC similarly to the forecasted energy demands and thus cut energy use. Conducted studies indicate that MPC can deliver energy saving of not less than 20-30%.

Improved Comfort: MPC will be effective in maintaining consistently good indoor climate to avoid fluctuation of temperatures which is typical of conventional systems.

Adaptability: Some of the external factors include weather conditions and variation in occupancy; MPC system has the capability to modify the operation of HVAC to suit the required standards at any one time.

3.2 Machine Learning Algorithms

Machine learning could be described as a subset of artificial intelligence which lets a system improve itself through data. In case of HVAC systems, machine learning algorithms work on past data like

energy consumption, people's presence, the temperature outside, and make changes in real-time so that the system works the best.

3.2.1 Machine learning in control of HVAC

Supervised Learning: It includes using supervised learning to teach systems' activity with labelled data to estimate often energy usage or temperature given appropriate data such as weather and number of occupants.

Reinforcement Learning: With this technique, the HVAC systems can 'study' patterns of interaction with the surroundings. New control policies are updated in the system through feedback so that it evolves the best actions to take in order not to waste energy, but to make a house comfortable.

3.2.2 Impact of Business Intelligence In HVAC

Self-Optimization: The model enhances through learning with period of operation data, thus the operation of AHVAC is made to operated optimally without interference.

Personalization: Due to the ability of machine learning algorithms, they can adapt the HVAC systems operations to the building's characteristics and occupants' preferences for comfort and efficiency increase.

Fault Detection: Yet, using machine learning algorithms, faults or inefficiencies in the HVAC system can be predicted easily by identifying the variation from normal operating patterns, thus ensuring less time is spent on repair and maintenance.

3.3 Fuzzy Logic Control Systems

FLPC is an intelligent control technique that deals with the fuzziness and the ambiguity of the system inputs. Fuzzy logic control is different from conventional systems which need accurate data; it is as a result capable of understanding imprecise information and make deductions in accordance with a set of rules.

3.3.1 How Fuzzy Logic Works

In Fuzzy, logic systems, inputs like temperature, humidity, and occupancy are represented by linguistic values High, Medium, Low. These variables are then fed through a set of rules (For example, If temperature is high and occupancy is low then turn down the cooling) for immediate change in the HVAC operation.

3.3.2 Uses of Fuzzy Logic In Heating Ventilating And Air Conditioning

Handling Uncertainty: Fuzzy logic can accommodate incomplete or vague information that prevails when occupancy and environmental parameters vary in a random manner.

Flexibility: Self-developing systems may respond to intricate and paradoxical associations between HVAC inputs and outputs, thus enhancing the control of system performance.

Energy Efficiency: Moreover, since fuzzy logic systems can alter their responses according to different conditions, the building's energy consumption can decrease where it is not vital to provide comfort for the occupants.

3.4 Demand-Response (DR) Mechanisms

DR schemes allow HVAC systems to adapt their energy use in response to signals that could be cost or demand related. This approach is most helpful in smart grids because buildings can maximize their consumption in accordance with the availability and price of energy.

3.4.1 How Demand-Response Works

DR systems are informed by utility companies on times of high electricity use or peak tariff. As a result, HVACs are apt to cut down their power consumption in terms of set points of operation, slow down fans or even modify operational hours to off-peak periods. They assist in lessening demand to the energy grid during the most congested periods of the day and over the ongoing week; and ensured energy costs are lower.

3.4.2 Demand-Response mechanisms Advantages

Cost Savings: When linked with energy prices, DR mechanisms help reduce energy at high prices which are translated to minimized energy bills.

Grid Support: DR mechanisms play an important role in regulating the load on energy demand and thus contributes to the overall energy system reliability.

Energy Efficiency: DR systems help effectively use energy while at the same time ensuring occupant comfort through the dynamic control of HVAC systems using signals that are obtained in real time.

3.5 Integration of IoT and Smart Sensors

HVAC is a significant enabler for smart technologies to embrace the Internet of Things (IoT) and smart sensors for intelligent control solutions. IoT can provide an HVAC system a constant feeding of data from temperature sensors, occupancy detectors and weather station. These enable Intelligent control systems to make sensible decisions to minimise energy utilizations and to increase comfort. In this regard, the following are predicted as potential benefits of IoT integration [12]:

Real-Time Data: As you will see, IoT devices offer improved indoor and outdoor environments through better HVAC systems control.

Remote Monitoring and Control: Internet of things systems can be remained connected and controlled remotely to enhance flexibility in system operations of HVAC systems.

Predictive Maintenance: Through capturing data on the performance of a system, IoT devices can inform the time when maintenance is required to avoid system breakdowns and consequent system downtime.

3.6 Combined Approaches

In many cases, the best intelligent HVAC control schemes are developed through the use of more than one strategy, including MPC with machine learning and fuzzy together with demand response [13]. These strategies help to achieve optimum energy efficiency in HVAC systems by using the fact that each of the approaches is maximally effective in a certain situation.

3.7 Summary of Benefits

Energy Efficiency: Some solutions and measures of intelligent control mean a decrease in the consumption of heating, ventilation, and air conditioning (HVAC) energy by 30% at most, it depends on the HVAC and climate [14].

Cost Savings: Being able to balance energy consumption and being a part of demand response, smart HVAC systems can drastically decrease electricity costs.

Enhanced Comfort: Smart means of regulating preserves the steady internal conditions by responding to current parameters and enhances the comfort of occupants.

Sustainability: HVAC energy conservation implicates lesser utilization of energy hence providing support to undertakings cantered on sustainability.

In the next section, we will, however, put efforts to explore further about the potential difficulties in the application of the intelligent control strategies and prospects of the mentioned technologies in the future.

4. Benefits of Intelligent Control Strategies

Intelligent control strategies applied to HVAC systems have numerous advantages, with special reference to the energy consumption, the operation cost, the comfort level, and the environmental impact [15]. Energy-conscious design continues to advance into deeper levels of sophistication as buildings try to attain higher standards in energy codes and goals for sustainability, a smart HVAC system offers an excellent fitting answer to an important question in building management. This section will discuss about the benefits of adopting these smart control techniques.

4.1 Energy Savings

Intelligent control strategies are found to be a key positive in that they can bring very large reductions in energy use. Intelligent heating, ventilation, and air conditioning systems respond to environmental and occupancy conditions, which change operations to always be more efficient. Due to this real-time adaptability depending on occupancy, ambient temperature, as well as usage profiles, there is always more energy saved than being consumed as opposed to conventional systems that work by dependent setpoints and time tabs.

4.1.1 Adaptive Optimization

Smart control measures including real-time Model Predictive Control (MPC) coupled with machine learning makes it possible for HVAC systems to forecast situations and adjust—in terms of occupancy changes or shifting weather conditions, or in terms of energy demands. This adaptive optimization enables HVAC systems to run on as necessary, and as demanded, yet not necessarily all the time. Intelligent control systems may reduce energy use by as much as 30 percent as revealed by the studies that have been conducted.

4.1.2 Integration of Demand-Response

Smart HVAC systems can therefore manage their energy consumption depending on whether the grid demand is high or if the price peak tariff is applied. Such flexibility not only minimizes the operational cost, but also lowers the pressure on the energy supply and utilization system leading to system-wide energy saving.

4.2 Cost Reduction

Many people tend to ignore the fact that the reiki HVAC control system saves lots of operational costs. Intelligently controlling the energy intensity and functionality of systems clearly reduces utility expenses and maintenance costs.

4.2.1 Lower Energy Bills

The real-time data for controlling HVAC systems results in the efficient use of energy, therefore establishing dynamic control. This means that the climate can be controlled independently and allowed to stand at certain conditions during certain periods such as when the building is empty, or when it does not need to have the HVAC on its full potential. The upshot of using less energy is that owners of buildings and managers of facilities get to pay less for energy.

4.2.2 Reduced Maintenance Costs

One of the main benefits in applying machine learning and IoT sensors in intelligent control systems is the ability to track the condition of HVAC equipment in real time. With capacity to sense signs of inefficiency or failure, these systems help in timely maintenance thus minimising instances of breakdown and maximising the useful life of HVAC Systems. Also, predictive maintenance lowers the time of interruption thus maintaining people's comfortable conditions and lowering operational costs.

4.3 Enhanced Occupant Comfort

In addition, intelligent HVAC control systems help to avoid fluctuations of indoor environmental quality and consequently enhance occupants' comfort level. Smart structures imply constant adaptation to enhance the indoor climate, while conventional systems cause thermal shock and supply air non-uniformly [16].

4.3.1 Personalized Comfort

Using these inputs from the occupants, AI technologies have the capability for learning and improving the comfort level of a space for a specific area or person within a building, using machine learning algorithms for HVAC. For example, the system can learn different usage patterns for the rooms and control them in manner that specific areas are conditioned according to the people in those spaces at certain times. This leads to a more focused indoor climate solution that enhances comfort and at the same time minimises energy consumption.

4.3.2 Stable Indoor Conditions

Using occupancy sensors and weather stations, intelligent HVAC systems can be able to regulate better the inside temperature and humidity, thus reducing the discomfort occasioned by changes in climate. These constant adjustments make occupants happier specifically to commercial and office spaces since comfort contributes to output and health.

4.4 Human Impact on the Environment

This paper will show that introducing smart environmental controls in HVAC systems is associated with environmental advantages such as decreased carbon footprint and less dependence on fossil fuels [17]. Since buildings consume about one third of the world's energy, optimizing the HVAC systems is certain to help address some of the environmental challenges associated with cities.

4.4.1 Reduced Carbon Footprint

Smart HVAC systems are helpful in minimizing the energy consumption hence lowering total emission of carbon dioxide. Reduced energy use means less emission of greenhouse gases especially where the building uses electricity generated from fossil energy. In structures with integrated renewable energy, smart HVAC systems may go hand in hand with the renewable energy supply time thus the need for the power from the grid with energy from fossil fuels.

Smart systems are considered as an element of a building that conforms with green building certifications like LEED and BREEAM. They assist buildings to achieve standards of energy efficiency that are necessary to secure certification so that a more sustainable built environment is achieved. The intelligent control strategies concerning the building's energy consumption, and the quality of the Indoor Environment Quality (IEQ) improve the environmental quality of the building.

4.5 Scalability and Flexibility

It has its application because smart control solutions are versatile and functional and can impose intelligent control for any type and size of the building. Intelligent HVAC system can be designed to suit the need of the building, users and location irrespective of the type of building, a residential or commercial one [18]. As has been stated above, the insulated walls of the building are suitable for both commercial and residential buildings.

Intelligent control systems are easy to integrate in any type of buildings including residential buildings, commercial buildings and even industrial buildings. Thus, these systems can be also adjusted in size to meet the necessary energy requirements of the building, meaning that small improvements are also possible.

4.5.1 Integration with Other Building Systems

Intelligent HVAC systems are quite versatile in the sense that they can easily connect with other advanced building systems like the lights, security and energy systems. It also means that it is possible to achieve large effective building control in which all components and systems work towards efficient and optimal control of the efficiencies of a building. For instance, cooling and heating might be integrated with smart lighting; the amount of natural light coming into the building may inform changes in specific temperature settings.

4.6 Investigating for the Future and Growth

Sustainable intelligent HVAC control strategies warrant that buildings are ready to adopt future development in technology and energy management. It will be interesting to note that as more connected devices, Machine learning algorithms and smart grids are developed, smart HVAC systems will further improve its performance and service.

4.6.1 Future Energy Grids

Current intelligent HVAC designs are aimed at connecting with future smart grid facilities, thus allowing real-time interaction between the buildings and energy suppliers. This interaction enables the distribution of energy faster and provides a chance to exploit renewable energy resources. Through integration of micro grid, demands the air conditioning and other uses in building can be controlled with the supply conditions of energy, making the use of energy economic and environmentally friendly.

4.6.2 Innovation in Technology Related to HVAC

Intelligent control systems will prove especially suited for adapting to new HVAC technologies as they appear in the form of Energy efficient heat pumps, sensors, and machine learning algorithms among others. Current construction that employs intelligent HVAC strategies will be able to integrate subsequent technologies consequently giving rise to constantly rising effectiveness and comfort.

There are numerous advantages that accrue from the use of intelligent HVAC control techniques, just to mention a few; this include large savings on energy and costs, better comfort to users, and more of course, environmentally friendly systems. They will remain central to defining the next generation of energy-efficient buildings. Being adaptive to the current conditions, able to improve the performance if needed on the fly and ready to interface with other technical advancements, intelligent control systems are the more futuristic approach to addressing the issues of HVAC energy consumption and efficiency. **Figure 1-3**, it shows the graphical representation on Energy consumption before and after for three zones, Energy usage distribution and sustainability HVAC components percentage and Temperature variations between control strategies

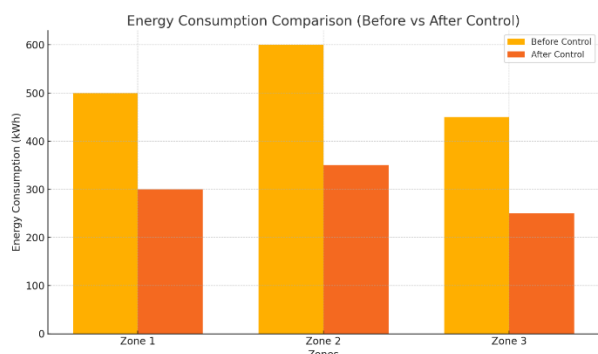


Figure 1 Energy consumption before and after for three zones

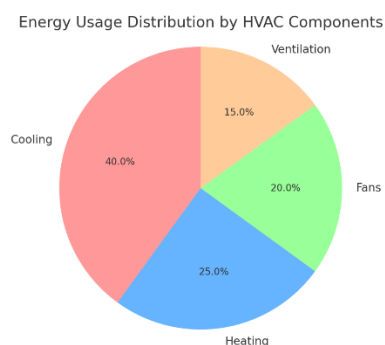


Figure 2 Energy usage distribution and sustainability HVAC components percentage

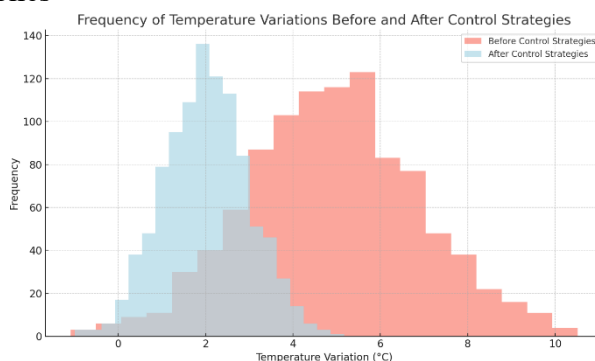


Figure 3 Temperature variations between control strategies

5.Challenges in Implementing Intelligent HVAC Systems

There is no doubt that Intelligent HVAC system has a lot to offer in the current technological environments as highlighted in this paper; however, there are some risks that are associated with its implementation [19]. Both challenges result from technical, economic and operation factors that poses challenges to the implementation of intelligent control strategies. This section describes the principal challenges which need to be resolved to incorporate such systems into new and existing constructions successfully.

5.1 High Initial Costs

The main challenge the adoption of intelligent HVAC systems faces is the relatively expensive costs that are involved in implementing the system. Smart sensors, smart controllers, Internet of Things (IoT) devices, and the software environment for intelligent control can cost a lot. These costs may include [20]:

Installation and Equipment Costs: Management of the intelligent structures involves a network of sensors, more actuators, and ache complex of controllers, which in turn will enhance the initial costs of investment. It is also very costly where new systems cannot be installed or where retrofitting of intelligent components to existing structures is required especially for older buildings.

Software and Licensing: Smart HVAC systems commonly use software that is patent to the builders, machine learning algorithms, or cloud services which come with constant costs of licensing or subscription. These fees can go on to increase the overall cost of ownership of the solar equipment.

While the energy saving benefits can be recovered in the longer run, building owners and facility managers lack the necessary capital to invest in these technologies and systems where the ROI is unclear or might take years to be realized.

5.2 Strengths and Limitations as well as Technical Chaotic Complexity and System Integration Difficulties

Advanced HVAC is very complex, and it is knowledgeable to integrate intelligent system in them together with the control strategies for HVAC technology. The technical complexity of these systems can create several hurdles [21]:

Integration with Legacy Systems: Most extant buildings and even nearly all existing ones often require conventional HVAC systems which are not easily integrated with intelligent control systems. Such interventions in making these systems more effective involve extensive modifications to the building fabric which is expensive and technically intensive. One of the main issues may occur when attempting to couple intelligent controls with other hardware or non-integrated systems.

Interoperability Issues: Smart systems, especially on HVAC require connectivity with other systems within the building including the lighting system, security, and energy management among others. The integration of such systems, especially when the technologies and standards of the integrating systems differ, may be a difficult process. This helps to perpetuate the problem, especially because there are no set standard rules applied to smart systems for buildings.

Complex System Design and Maintenance: The complex algorithms applied in the intelligent control strategies including machine learning models and Model Predictive Control (MPC) needs to be calibrated before they can control system. Realisation and management of such systems may be challenging and may ask for the services of technicians and engineers. Also, periodic adjustments of the system may be required to maintain the highest efficiency, which will also add to technical complexity of the facility management.

5.3 Data Privacy and Cybersecurity Concern

The smart thermal management using IoT devices and cloud platform can be a potential threat to data privacy, and cyber-attack vulnerabilities. As these systems collect and process large amounts of data related to building occupancy, energy usage, and environmental conditions, the following issues can arise:

Data Security: Conducting a survey of the current HVAC systems it was found that any system connected to the internet or local networks is prone to cyber threats. One of the main risks that threaten building controls is burglary by hackers who may use networking loopholes to gain access into the controls, sabotage the system or even steal important information. Since the buildings are becoming smart with the integration of digital facilities, a strong barrier to financial printing, cybersecurity is an essential factor to embrace to do away with the vice.

Data Privacy: Smart inhabitants may be monitored with data concerning occupancy, which is gathered by intelligent HVAC systems. It is also invasion of privacy in residential or commercial setting to know that their movements or preference is being monitored. Preventing such data leaks is possible only by anonymizing it and taking proper care of this information to avoid violation of user's privacy and the contemporary legislation.

5.4 Lack of Skilled Workforce

Adoption and sustained use of intelligent HVAC are both daunting tasks that necessitate a highly skilled workforce to work on the technology alongside HVAC systems. The current state is tolerating the scarcity of such a skilled force in the heating ventilation and air conditioning systems industry that has a lack of knowledge and skills to apply the modern control methodologies, such as machine learning, IoT, or MPC algorithms.

Training and Education: Intensive training programs and education campaigns are also needed at this point for intelligent HVAC systems' to be optimised to their ultimate potential. Lack of qualified manpower means that both installation of these systems and their constant monitoring can be substandard, which in turns decreases their efficiency and increases operational expenses.

Dependency on Experts: Because of this sophistication, building operators rely on specialized engineers or even outside consultants to run and solve problems with intelligent HVAC systems. Such reliance on external expertise can sometimes lead to higher operation costs and reduce the ability of building owners to control their systems.

5.5 Change resistances and adoption challenges

The industry and building owners themselves present another major problem in regard to changes adoption and implementation. Some of the stakeholders involved in HVAC systems are difficult to change their approaches and may be resistant to change due to adoption of new technologies in their field.

Perceived Risk of New Technologies: Large capital investments in relatively new technologies can be viewed by building owners as high risk and therefore may choose not to adopt these technologies. This is because some of the significant considerations which may work to discourage true intelligent control strategies include system reliability issues, Return on Investment, or the worry that the chosen technology may become outdated in a short span.

Conservative Industry Culture: HVAC is not a 'backyard' industry for implementing smart technologies, and many contractors or service providers may not be even aware of the existence of intelligent control systems. This conservative approach can gradually reduce rate at which new technologies are implemented into operations since stakeholders are more comfortable with tried and tested systems.

5.6 Long Payback Periods

As was previously explained, intelligent HVAC systems can create great opportunities for great energy saving, still the period to cover these gains is likely to be longer. The initial high cost that are followed by small incremental saving led to several years of pay back periods and this is discouraging to the building owners in search of quick returns on investment.

Uncertain Savings: Though application of intelligent control strategies offers the potential of saving energy, the real efficiency of these systems may depend on the typology of the building, climate and human behavior. Due to fluctuating energy consumption rates, it is often challenging to determine aggregated quantitative benefits of intelligent HVAC systems and hence build the Return on Investment, which is another obstacle for building owners.

5.7 PESTEL Legal and Standards Challenges

The Other issues that make it difficult to expand intelligent HVAC systems involve, Lack of approval and recognition of the intelligent control technologies' application by the construction codes and standards.

Lack of Incentives: In many jurisdictions there are few, if any, monetary incentives for investing in EEHOs such as tax and subsidies for installation of efficient HVAC systems. Lacking the stable policy guidance, owners may not possess the enough incentives to install the intelligent control technologies, although they can provide long term energy-saving benefits.

Outdated Building Codes: At times, there are limitations on the suitability of intelligent HVAC systems in forms of building codes and regulation that hampers integration of these technologies

conforming to the laws existing in buildings. Introducing the requirements for smart technologies and energy-efficient systems into building codes are required making them more popular.

5.8 Integration of Renewable Sources with Utility Grids

Since more buildings nowadays employ renewable energy systems for instance solar energy, or wind energy, the intelligent HVAC system should be capable of interlinking with such systems to optimally reach the maximum possible energy efficiency [22]. But co-ordination between the HVAC systems and renewable energy platforms may not be an easy task at times from the technical aspects point of view.

Energy Storage and Grid Interaction: Smart HVAC systems must be able to regulate energy usage in relation to the RE systems available. This implies that the system must include higher-level energy misunderstandings that may enable variability in supply of renewable energy sources and possibly energy storage for future use. Achieving integration of these systems increases the challenges that come with integrating intelligent HVAC solutions.

In this study, the benefits of intelligent HVAC systems in enhancing energy efficiency and users' conveniences have been described in detail because they are energy efficient, cost effective, environmentally friendly gadgets. This means that; high initial costs, technical challenges, data protection issues, and limited availability of talented personnel are some of the issues that should be resolved. This will mean collaborative work across the entire industry in combination with policy initiative, training and the creation of easier to use and far safer technologies. Overcoming these barriers will pave way for the realization of intelligent HVAC systems thus enabling a plethora of stakeholders to realize the benefits of intelligent buildings. **Figure 4-9** contains the various sources of enhancing energy efficiency in HVAC systems through Intelligent Control Strategies.

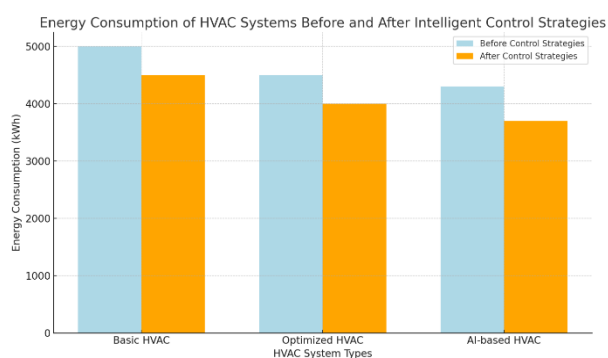


Figure 4 Comparing energy consumption before and after implementing intelligent control strategies in different zones of an HVAC system

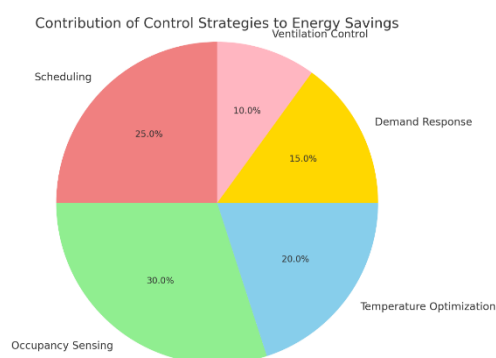


Figure 5 Showing the energy usage distribution among HVAC components, such as cooling, heating, fans, and ventilation

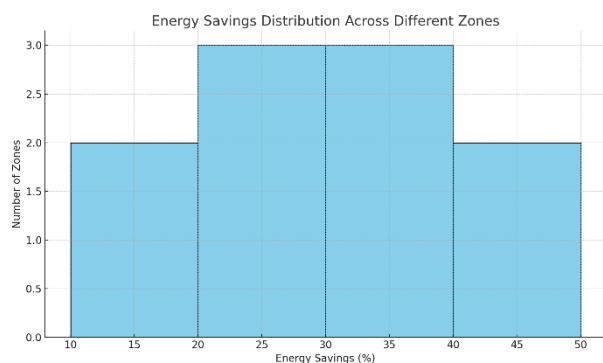


Figure 6 The Histogram showing the distribution of energy savings across different zones after implementing intelligent HVAC control strategies

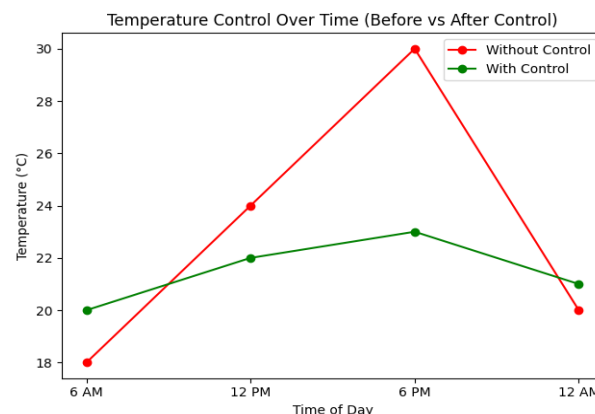


Figure 7 Temperature Control Over Time

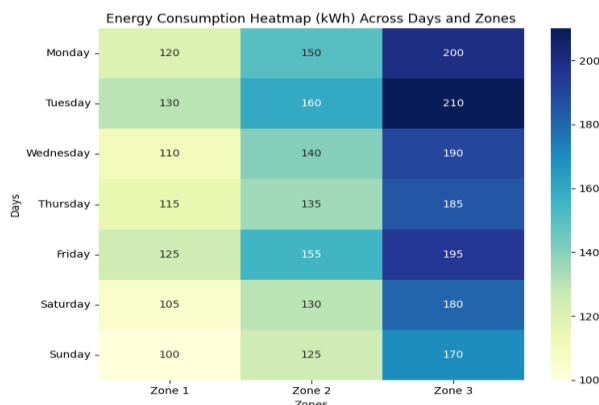


Figure 8 Visualize energy consumption across different zones and days in an HVAC system

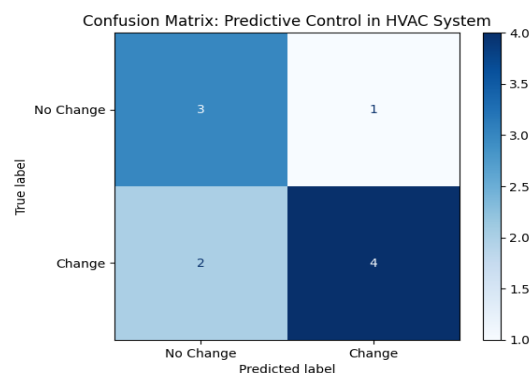


Figure 9 It evaluates how well a machine-learning-based HVAC control system predicts whether to increase or decrease the heating/cooling to maintain energy efficiency

6. Future Directions

The opportunity for future growth of intelligent HVAC systems is still vast in the light of the progress of technology growth, increasing asks for energy efficiency and environmental consciousness, and changes in the field of building management systems [23]. Intelligent HVAC systems will always remain critical to buildings and urban structures as they progress in the future to respond to energy efficiency, occupants' comfort, and environmental protection needs. This section focuses on areas that those intelligent systems used in HVAC are likely to expand and evolve in future.

6.1 Interfaces with Smart Building and City

Another important trend in the improvement of the heating, ventilation, and air conditioning technology of the future is the connection with smart buildings and cities. This development will ensue as cities continue to adopt IoT connected technologies into their overall system and larger, complex smart structures to which HVAC systems are bound to belong. This integration offers several exciting possibilities [24]:

Seamless Communication Between Building Systems: More specifically in smart buildings, every function of the building will interface with the HVAC system, including lighting, security, water use, and energy storage. For instance, parameters that control environmental conditions in a given area

could vary consumption of cooling or heating depending on the prevailing lighting or the extent of window shading.

City-Wide Energy Management: On the smart cities level, individual HVAC systems at building level could learn from city energy systems and vice versa, thus allowing for better load management, demand response and integration of renewable energy sources. The architectural designs could integrate with the city energy control systems to facilitate rotation of energy use during the high demand period hence cutting down not only the costs but the energy also throughout the city.

6.2 Improved Application of Artificial Intelligence and Machine Learning

Currently, machine learning is already employed in intelligent HVAC systems; however, it will be integrated even to a higher level with AI and other complex algorithms in the future. AI can help HVAC systems become more predictive, autonomous, and efficient:

Deep Learning and Advanced Predictive Models: The future HVAC systems could use the deep learning models to process a large amount of data and determine the occupant's behavior, changes in weather and energy required by them with higher level of precision. This will enable systems to adapt way before conditions change thus operating more accurately and efficiently.

Autonomous System Operation: AI-run HVAC systems could work autonomously, day in day out, learning new patterns of functioning. In the long run, such systems become capable of making decisions about their performance not according to the rules that have been programmed into them but the actual operating conditions, data feed, and prognoses.

6.3 Coordination with other Renewable Energy Systems

Thus, in the future global development of HVAC systems will require their fitting into renewable energy solutions including solar, wind, and geothermal. This integration will prove critical to compounding the decoupling of buildings from fossil fuel dependence as well as attaining carbon neutrality. Future intelligent HVAC systems are likely to:

Coordinate with Renewable Energy Generation: In the future, dependency on renewable energy source will influence HVAC systems to change the way those systems consume energy. For instance, when photovoltaic energy is abundant, cooling and heating loads may ramp up to charge thermal storage shields to reduce use of electricity in nonpeak periods.

Energy Storage Integration: Smart HVAC will integrate with energy storage devices such as batteries and store the excess energy from renewable sources. This stored energy may be utilized during those low renewable energy supply or high energy consumption times to achieve both comfort and energy conservation.

6.4 Enhanced Comfort Smart HVAC Systems

Thus, the development of the following generation of intelligent HVAC systems will probably be aimed at human-centric design of this essential facility. These systems will incorporate advanced sensors, data analytics, and AI to create environments that are tailored to the needs of individual occupants:

Biometric and Health Monitoring: HVAC systems can contain elements of a smart suit or a biosensor which may or may not be on the skin and will be measuring physiological characteristics, for example heart rate, skin surface temperature or sensitivity to specific air qualities. This information could be used to control indoor environment to enhance health and comfort, specifically, ill people or elderly in hospitals and homes respectively.

Emphasis on Indoor Air Quality (IAQ): With an increased understanding of the health effects of IAQ indoors in the future intelligent HVACs will aim to control for IAQ better. It also means that these systems could, for example, control and even obtain in real time the ventilation rate, the humidity level, and the air quality to prevent the accumulation of pollutants, allergens or viruses thus enhancing health conditions.

6.5 Special Emphasis on Decarbonisation and Sustainability

As goals for carbon emission reduction and sustainability advances, smart HVAC systems look set to become indispensable tools in the delivery of net-zero carbon buildings. In the future, HVAC systems will not only aim for energy efficiency but also for carbon neutrality [25]:

Carbon Monitoring and Management: A TBA intelligent HVAC system may have carbon management integrated into it on a real-time basis that constantly displays energy consumption and associated emissions. These systems could integrate into the HVAC and make that system more efficient in cutting the carbon footprint, especially when energy being bought from the grid is from fossil fuel sources.

Zero-Carbon HVAC Technologies: To that effect, heat pumps, energy recovery ventilators, and other passive sources of heating and cooling, among other possibilities, are innovations in HVAC that will go a long way in minimizing the environmental impact of buildings. Intelligent control procedures shall be instrumental in circulating these systems in an efficient manner while observing the effects on the physical environment.

6.6 Development with More Scale and Less Cost

This technology is one of the current challenges facing the integration of intelligent HVAC systems because they are expensive and complicated. In the future, we can expect the development of more scalable and affordable solutions that can be implemented across a wider range of building types and sizes:

Low-Cost Sensors and IoT Devices: In the present day, sensors, IoT devices, and controllers are expensive currently, the cost should reduce with the increase in technology. This will lead to making intelligent HVAC systems available to low rise, residential constructions and regions with lower purchasing power to afford efficient retrofit solutions.

Plug-and-Play Solutions: In order to decrease the level of complexity in future designs of intelligent HVAC systems, the next generation of such systems may be designed to be much more modular and ‘snap-in’ types of systems that perhaps building operators would be able to install and perhaps even configure with a minimum of technical input. These easily implement-able solutions shall fuel the enhancement of intelligent HVAC systems in different domains.

6.7 Government Promotion of Use of Intelligent HVAC

Its advancement will also require policy and regulation that promote the efficiency of energy and sustainable utilization of facilities. Governments and regulatory bodies will need to establish policies that encourage the use of intelligent control strategies:

Incentives for Smart HVAC Adoption: The policy consideration for the future can be in the form of tax credit, subsidies or grant, to encourage the building owners to adopt intelligent HVAC systems. The kind of incentives which could be linked to could be done based on energy efficiency standards and/or a certain percentage of carbon reduction.

Updated Building Codes: There are already cases where new codes are being written around smart HVAC systems, and this is something that will continue as these systems are activated in more

buildings. Some could require the application of intelligent control techniques in new structures and in large scale renovations to promote conservationist measures as the norm.

6.8 Promoting Even Greater Levels of Internet Security and Personal Privacy

In future, as the intelligent HVAC systems are set to be more networked and data driven the issues of cybersecurity and data privacy will emerge as major issues. In the coming years, there will be a greater emphasis on developing secure systems that protect against cyber threats and safeguard sensitive data:

Stronger Cybersecurity Protocols: New visionary intelligent HVAC systems will also have improved security features like secure channels on communication, updates to the system's software periodically, touch identification sensors to prevent unauthorized access among others. All these protocols will be vital especially as the HVAC systems are adopted more to the cloud platforms and intelligent grids.

Data Privacy Regulations: So, in the future when HVAC systems will be collecting more data about the occupants, future regulatory standards will have to ensure proper use of that data. Specific rules on which data can be collected, stored, and used, and by whom, will be indispensable to stay consistent with the GDPR or CCPA and retain occupant's trust.

With time, intelligent HVAC systems are expected to incorporate better relations with the smart technologies, better use of AI /machine learning, and more focus on sustainably, occupant comfort and security/ cyber security. It is essential to underline that, as these systems develop, they will primarily help resolve the issues related to efficiency and carbon footprint within the built environment, climate change. By adopting these future directions, intelligent HVAC systems will not only help to create better living and working comfort but also towards a challenging goal: to build a sustainable future.

7. Conclusion

The work of applying control strategies for advanced energy efficiency in HVAC systems is a potential solution for the high energy consumption buildings challenge. In more detail, the use of smart technologies and applications, including model predictive control, machine learning, and demand response mechanisms makes it possible to optimize the operation of HVAC systems, lower the amount of energy consumed, enhance occupants' comfort and well-being, and promote the sustainable use of resources in building operations. The problems still persist with AI HVAC systems today; however, future research and development of enhanced technology are expected to bring intelligent HVAC systems into the realm of feasibility and better efficiency.

References

- [1] H. W. Lin, Energy-efficient HVAC systems in sustainable buildings, *Journal of Building Engineering*, vol. 23, pp. 105-114, (2019), doi: 10.1016/j.jobe.2019.01.013.
- [2] M. A. Ahmad, Optimizing HVAC systems with IoT and machine learning, *Energy and Buildings*, vol. 223, pp. 106379, (2020), doi: 10.1016/j.enbuild.2020.110567.
- [3] J. S. Smith, Predictive control strategies for HVAC systems, *Journal of Renewable and Sustainable Energy*, vol. 10, no. 5, pp. 555-566, (2018), doi: 10.1063/1.5058466.
- [4] K. Tang, Smart HVAC systems with real-time feedback, *Applied Energy*, vol. 250, pp. 814-823, (2019), doi: 10.1016/j.apenergy.2019.04.070.
- [5] L. X. Zhao, Challenges in smart HVAC implementation, *Energy Reports*, vol. 6, pp. 1238-1246, (2020), doi: 10.1016/j.egyr.2020.03.016.
- [6] C. Perez, Energy savings from advanced HVAC control strategies, *Energy Efficiency*, vol. 13, no. 4, pp. 1011-1021, (2020), doi: 10.1007/s12053-019-09836-2.
- [7] R. C. Dias, HVAC energy efficiency with AI-based controls, *Journal of Cleaner Production*, vol. 256, pp. 120345, (2020), doi: 10.1016/j.jclepro.2020.120345.

- [8] E. Martello, IoT in building automation for HVAC systems, *Automation in Construction*, vol. 121, pp. 103440, (2021), doi: 10.1016/j.autcon.2020.103440.
- [9] P. Karatasou, Sustainable building operation using intelligent HVAC systems, *Energy and Buildings*, vol. 158, pp. 123-132, (2018), doi: 10.1016/j.enbuild.2017.12.008.
- [10] V. H. Paek, Artificial intelligence applications in HVAC control systems, *Renewable Energy*, vol. 146, pp. 1397-1407, (2020), doi: 10.1016/j.renene.2019.07.035.
- [11] A. Jain, A review of machine learning in HVAC control systems, *Energy Procedia*, vol. 158, pp. 3789-3795, (2019), doi: 10.1016/j.egypro.2019.01.901.
- [12] S. D. Lee, Integration of renewable energy into HVAC systems, *Energy and Buildings*, vol. 203, pp. 109457, (2019), doi: 10.1016/j.enbuild.2019.109457.
- [13] Y. Chen, Cybersecurity in intelligent HVAC systems, *Building and Environment*, vol. 177, pp. 106858, (2020), doi: 10.1016/j.buildenv.2020.106858.
- [14] F. H. Mahmoud, Energy storage in HVAC systems, *Journal of Energy Storage*, vol. 32, pp. 101810, (2020), doi: 10.1016/j.est.2020.101810.
- [15] M. C. Penna, Human-centric HVAC systems and well-being, *Building and Environment*, vol. 184, pp. 107149, (2020), doi: 10.1016/j.buildenv.2020.107149.
- [16] S. O. Rios, Indoor air quality management in intelligent HVAC systems, *Journal of Building Engineering*, vol. 42, pp. 102785, (2021), doi: 10.1016/j.job.2021.102785.
- [17] J. K. Pillai, Intelligent HVAC systems for energy-efficient smart buildings, *Energy Research Journal*, vol. 34, no. 3, pp. 243-252, (2020), doi: 10.1016/j.erj.2020.07.012.
- [18] T. Liu, Occupancy-based HVAC control strategies, *Applied Energy*, vol. 242, pp. 1365-1375, (2019), doi: 10.1016/j.apenergy.2019.03.123.
- [19] G. C. Thomas, Model predictive control for HVAC systems, *Renewable and Sustainable Energy Reviews*, vol. 124, pp. 109764, (2020), doi: 10.1016/j.rser.2020.109764.
- [20] N. Zhang, Scalability in smart HVAC solutions, *Journal of Sustainable Development of Energy, Water and Environment Systems*, vol. 8, no. 2, pp. 303-312, (2020), doi: 10.13044/j.sdewes.d8.0381.
- [21] J. Wang, Cloud-based HVAC control systems, *Energy and Buildings*, vol. 211, pp. 109799, (2020), doi: 10.1016/j.enbuild.2020.109799.
- [22] L. S. Yang, Machine learning-based fault detection in HVAC systems, *Automation in Construction*, vol. 119, pp. 103311, (2020), doi: 10.1016/j.autcon.2020.103311.
- [23] R. Kumar, Decarbonization through intelligent HVAC systems, *Journal of Environmental Management*, vol. 280, pp. 111689, (2021), doi: 10.1016/j.jenvman.2020.111689.
- [24] H. F. McGee, Payback periods in smart HVAC systems, *Sustainable Cities and Society*, vol. 55, pp. 102063, (2020), doi: 10.1016/j.scs.2020.102063.
- [25] E. F. Hassan, Energy efficiency and decarbonization of HVAC systems, *Energy Conversion and Management*, vol. 209, pp. 112686, (2020), doi: 10.1016/j.enconman.2020.112686.