

Application Of Artificial Intelligence Approach For Carbon Reduction Through RES In Buildings

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Abstract

Artificial Intelligence (AI) for carbon reduction through Renewable Energy Systems (RES) in buildings can offer several significant benefits, which contribute to both environmental sustainability and operational efficiency. Through efficient energy management, predictive analytics, and optimized integration of renewable energy sources, AI can reduce energy costs in buildings. AI allows buildings to scale their renewable energy and carbon-reducing initiatives. As more buildings or districts adopt AI-integrated RES, the system can scale efficiently without needing significant redesigns or new infrastructure. Additionally, AI systems are adaptable, meaning that they can evolve and adjust to new technologies, renewable energy sources, and carbon reduction strategies. By optimizing energy use, facilitating better integration of renewable resources, and ensuring continuous performance monitoring, AI can significantly contribute to making buildings more sustainable and carbon-neutral.

Keyword: Artificial Intelligence, Renewable Energy Systems, Building integrated systems, energy management.

1. INTRODUCTION

The introduction of artificial intelligence (AI) in reducing carbon emissions through renewable energy sources (RES) in buildings represents a transformative approach to sustainable construction. AI technologies enhance energy efficiency, optimize resource utilization, and facilitate the integration of renewable energy systems, thereby significantly lowering carbon footprints. The following sections outline key aspects of this integration [Lal and Choudhary 2024].

Talat et al (2024) assessed AI-driven innovations in Building Energy Management Systems, highlighting potential applications and energy savings. AI models for HVAC control and optimization in offices can achieve up to 37% energy savings, while residential and educational buildings may save up to 23% and 21%, respectively. AI utilizes machine learning algorithms to forecast energy demands and optimize consumption patterns, particularly in HVAC systems [Ajayi et al 2024, Stem 2024]. AI systems enable continuous monitoring of energy usage, allowing for dynamic adjustments based on occupancy and environmental conditions [Ajayi et al 2024, Manuel et al 2024]. AI optimizes the performance of RES, such as solar and wind, by predicting energy production and managing storage effectively [Manuel et al 2024, Li et al 2024]. AI-driven solutions facilitate the seamless integration of RES into building energy management systems, promoting sustainability and reducing reliance on fossil fuels [Ding et al 2024].

The smart buildings and sustainable design leveraging AI for energy optimization in the built environment optimize energy efficiency through AI-powered systems, IoT, and advanced algorithms [Iluyomade and Okwandu 2024]. O'Neill and Wen (2022) proposed a data-driven method for automatic fault detection and diagnosis (AFDD) using reinforcement learning (RL) in smart buildings, which can be applied in future smart grid infrastructures. A real-time energy management system is proposed by Rizvi (2022) to overcome the deficiency of energy consumption and improve energy efficiency in buildings by using Artificial Intelligence (AI) to identify the factors involved in optimizing energy consumption.

Liu and He (2024) developed an AI-based energy management system for energy-saving buildings, utilizing neural networks, deep learning, and reinforcement learning to optimize energy consumption and improve efficiency, resulting in significant energy savings and enhanced sustainability. Giglio et al (2023) developed a methodology for the energy management, combining photovoltaic and storage systems, considering as the main case study a multi-story building characterized by a high density of households, used to generate data which allow feasibility foresights.

Chen and He (2023) determined the functionality of artificial intelligence technologies and ways of their application in green construction and present the standards of green construction existing in the world, which can serve as a guide when choosing information models and is of practical value in the development of green buildings.

Mocerino (2020) studied with the objectives of a new integrated building management, intended as an increase in energy efficiency and an efficient digitalized connection with users and smart grids, through control platforms, IoT, security throughout the building's life cycle and use of AI (artificial intelligence) devices and materials.

Amulek and Piero (2023) implemented the intelligent edification improves energy efficiency and reduces CO₂ emissions by using clean and renewable energies and implementing smart building technologies. Raman et al (2024) studied to integrates the AI into renewable energy and sustainability to achieve SDGs 7, 9, and 13, identifying AI-driven solutions for wind speed forecasts, energy management, and solar irradiance prediction, and highlighting academia-industry collaborations for sustainable-energy transitions. Meng et al (2023) proposed a three-step carbon reduction strategy for the construction industry through innovative design, intelligent construction, and secondary utilization, demonstrating a scientifically feasible approach to reducing carbon emissions in building life cycles.

While AI presents significant opportunities for carbon reduction, challenges such as data privacy, high implementation costs, and the need for regulatory frameworks must be addressed to ensure effective deployment. Balancing these challenges with the potential benefits is crucial for advancing sustainable building practices.

2. CARBON REDUCTION TECHNIQUES FOR ACHIEVING SUSTAINABILITY IN BUILDINGS

Carbon reduction in buildings is crucial for achieving sustainability and addressing climate change. Buildings are responsible for a significant portion of global greenhouse gas emissions, primarily through the energy used for heating, cooling, lighting, and appliances. There are several techniques and strategies that can be applied to reduce carbon emissions in buildings, both during construction and throughout the building's operational life.

2.1 Energy Efficiency Improvements

Improving energy efficiency is one of the most effective ways to reduce carbon emissions in buildings. Figure 1 shows the possibility of energy efficiency improvements through suggested five smart applications addition in buildings, these are as follows:

- **Improved Insulation:** Enhancing wall, roof, and floor insulation reduces the need for heating and cooling, which in turn reduces energy consumption.

- **High-Performance Windows:** Installing energy-efficient windows, such as double or triple-glazed windows with low-emissivity (Low-E) coatings, helps reduce heat loss and gain, improving temperature regulation inside.
- **Smart Thermostats:** These devices optimize heating and cooling systems by adjusting temperatures based on occupancy and time of day.
- **Energy-Efficient Appliances:** Use of energy-efficient appliances and LED lighting reduces electricity consumption, cutting down the associated carbon emissions.
- **Air Sealing:** Sealing air leaks around doors, windows, and ducts ensures that conditioned air stays inside, reducing the need for excessive heating or cooling.

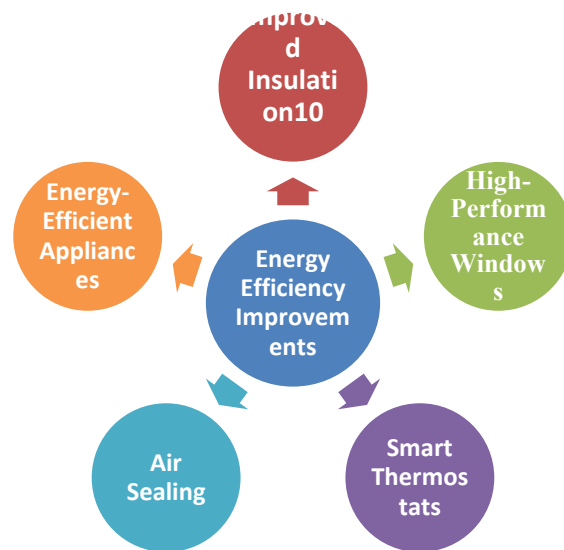


Figure 1: Energy Efficiency Improvements Techniques

2.2 Use of Renewable Energy

Shifting to renewable energy sources reduces reliance on fossil fuels for electricity and heating for which the use of renewable energy options for building integrations is shown in figure 2 and their applications are discussed here as follows:

- **Solar Panels (Photovoltaic):** Installing solar panels on rooftops or facades generates clean, renewable electricity, reducing the demand for grid electricity and lowering carbon emissions.
- **Solar Chimney** for ventilation heating and cooling of buildings
- **Solar Water Heating:** Solar thermal systems can be used for hot water generation, replacing conventional electric or gas-powered water heaters.
- **Wind Turbines:** Small-scale wind turbines can be integrated into buildings, especially in areas with consistent wind, to generate renewable power.
- **Geothermal Heating and Cooling:** Geothermal heat pumps use the earth's stable temperature to heat and cool buildings efficiently. This can drastically reduce energy consumption compared to conventional systems.
- **Biomass:** Biomass heating systems can replace conventional gas or oil heating systems, using organic materials such as wood pellets or agricultural waste.

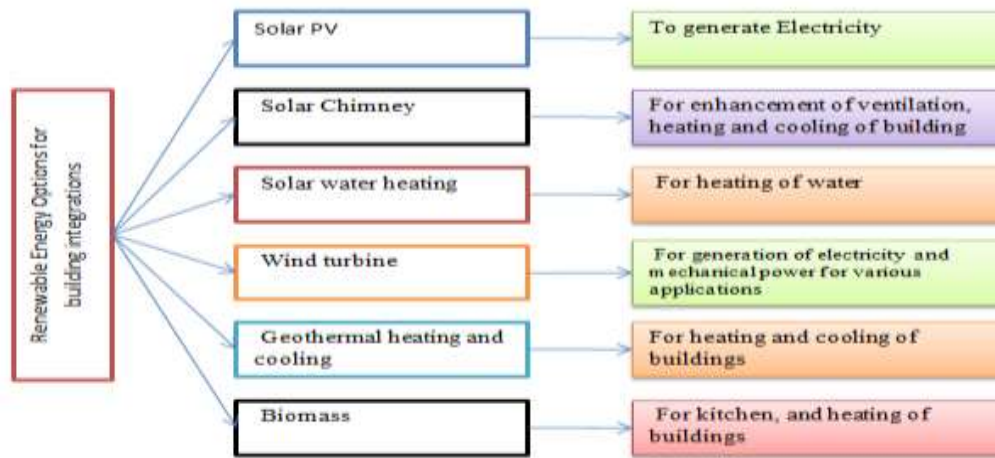


Figure 2: Use of renewable options for building integration

2.3 Low-Carbon Building Materials

Choosing low-carbon, sustainable building materials during construction or renovation can significantly reduce a building's embodied carbon (the carbon emissions associated with the extraction, manufacturing, transportation, and installation of materials). The low carbon materials specified in to four groups which is shown in figure 3.

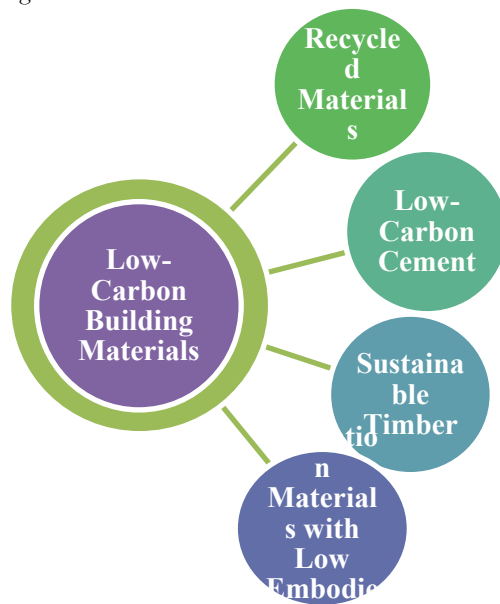


Figure 3: Low carbon building materials

- **Low-Carbon Cement:** Traditional Portland cement is highly carbon-intensive. Alternatives like fly ash-based or geopolymers cements, or using carbon capture technology in cement production, can reduce emissions.
- **Recycled Materials:** Using recycled or repurposed materials (such as steel, concrete, or wood) helps lower the environmental footprint of construction. This reduces the need for new materials and minimizes waste.

- **Sustainable Timber:** Wood is a renewable resource that, when harvested sustainably, has a lower carbon footprint than many other building materials. Cross-laminated timber (CLT) is gaining popularity as an alternative to concrete and steel.
- **Insulation Materials with Low Embodied Carbon:** Materials like cellulose, sheep wool, or recycled denim have much lower carbon footprints compared to traditional fiberglass or foam insulations.

2.4 Building Design and Layout

Smart building design can significantly reduce energy use and carbon emissions by taking advantage of natural elements.

- **Passive Design:** This involves designing buildings to take advantage of natural light, heat, and ventilation, which reduces the need for artificial lighting, heating, and cooling. For example:
 - **Orientation:** Positioning the building to optimize sunlight exposure can reduce heating needs in winter.
 - **Shading:** Using overhangs, shading devices, and appropriate landscaping to reduce heat gain in summer.
 - **Natural Ventilation:** Designing for cross-ventilation allows fresh air to circulate, reducing reliance on air conditioning.
- **Green Roofs:** Green roofs, which are covered with vegetation, help insulate buildings, reduce the urban heat island effect, and absorb CO₂. They also promote biodiversity and manage storm-water.
- **Cool Roofs:** These are roofs that reflect more sunlight and absorb less heat, reducing cooling energy consumption in buildings.

2.5 Smart and Automated Systems

Integrating advanced technologies can optimize energy usage and reduce carbon emissions in real-time.

- **Building Energy Management Systems (BEMS):** These systems monitor and control energy consumption by integrating various building systems (lighting, heating, cooling, etc.). They can identify inefficiencies and automate adjustments to reduce energy use.
- **Demand-Response Systems:** These systems allow buildings to reduce their energy consumption during peak times, either by automating adjustments or through real-time feedback from utility companies.
- **Smart Lighting:** Automated lighting systems that turn off or adjust according to occupancy or daylight levels can reduce energy consumption.
- **Occupant Behavior Monitoring:** IoT sensors can track occupancy in different parts of the building and adjust lighting, HVAC, and other systems based on actual usage.

2.6 Water Efficiency and Recycling

Reducing water consumption and reusing water within buildings can lower the energy required for water treatment and distribution, thus indirectly reducing carbon emissions.

- **Low-Flow Fixtures:** Installing low-flow faucets, showers, and toilets reduces the amount of water needed for daily activities, thereby reducing energy use for water heating and distribution.
- **Rainwater Harvesting:** Collecting and using rainwater for non-potable purposes (like irrigation, toilets, or cooling systems) reduces demand on municipal water systems and the energy required to pump, treat, and deliver water.
- **Grey water recycling:** Using treated greywater (from sinks, showers, etc.) for irrigation or flushing toilets reduces the demand on potable water and cuts the energy required for water treatment.

2.7 Carbon Capture and Sequestration (CCS)

In more innovative or experimental building designs, carbon capture technologies could be applied:

- **Carbon-Absorbing Materials:** Some building materials, such as certain types of concrete or green facades, are being developed to absorb and store CO₂ from the air, helping offset emissions.
- **Biological Carbon Sequestration:** Using plants and green walls can help absorb CO₂ from the air, although the impact of this is relatively small compared to other techniques.

2.8 Carbon Offsetting

In some cases, buildings or developers may opt to purchase carbon offsets to compensate for emissions that cannot be eliminated. This could involve investing in reforestation projects or renewable energy initiatives elsewhere.

2.9 Retrofitting Existing Buildings

- **Energy Audits:** Conducting energy audits to identify where energy loss is occurring and implementing improvements to make the building more energy-efficient.
- **Upgrading HVAC and Lighting Systems:** Replacing outdated or inefficient HVAC systems and lighting with more energy-efficient technologies.
- **Retrofitting with Insulation:** Adding external or internal insulation to older buildings to improve thermal efficiency. Passive ventilation and thermal comfort are essential components of sustainable building design, helping to reduce energy consumption, lower carbon emissions, and improve indoor air quality. By optimizing natural resources such as air movement, sunlight, and thermal mass, buildings can maintain comfortable indoor conditions without relying heavily on mechanical systems (such as air conditioning or heating), which often consume large amounts of energy.

3. CARBON REDUCTION TECHNIQUES APPLIED TO PASSIVE VENTILATION AND THERMAL COMFORT:

3.1 Passive Ventilation Techniques

Passive ventilation uses natural forces like wind, temperature differences, and buoyancy to circulate air inside a building without the use of mechanical fans. It reduces the need for energy-intensive HVAC systems.

3.1.1 Cross-Ventilation

Cross-ventilation occurs when air enters a building through windows or openings on one side and exits through openings on the opposite side. This process relies on the wind to create air movement. The cross ventilation can reduce the reliance on air conditioning by naturally cooling the indoor space. It can be generated through application of the following strategies in the building such as: Place windows or vents on opposite walls to encourage airflow; Use high-level vents to allow warm air to exit and low-level vents to let cool air enter.

3.1.2 Stack Ventilation (Thermal Buoyancy)

This relies on the natural buoyancy of warm air, which rises and escapes through vents at higher points in the building, drawing in cooler air from lower levels. Stack ventilation is especially effective in multi-story buildings. The carbon can be reduced through reducing the energy needed for cooling by utilizing natural air circulation. The stack ventilation can be generated through implementing the following strategies in the buildings such as: Tall vertical shafts (vent stacks) at the top of buildings or in stairwells; Openings at different heights (windows, vents) facilitate upward air movement. Lal (2013) studied the experimental and simulation studies of solar chimney. The solar chimney for stack effect is shown in figure 4 and it was evaluated that the ACH can be developed between 2.39 to 7.13. The air gap between glass and absorber plate, glass tilt angle are optimized as 60mm and 5 degree. The air gap to inlet opening ratio is also optimized in the same study by 0.02. It was also recommended that if more ACH required we can add number of Trombe wall type solar chimneys as well or integrate this to the inclined solar chimney.

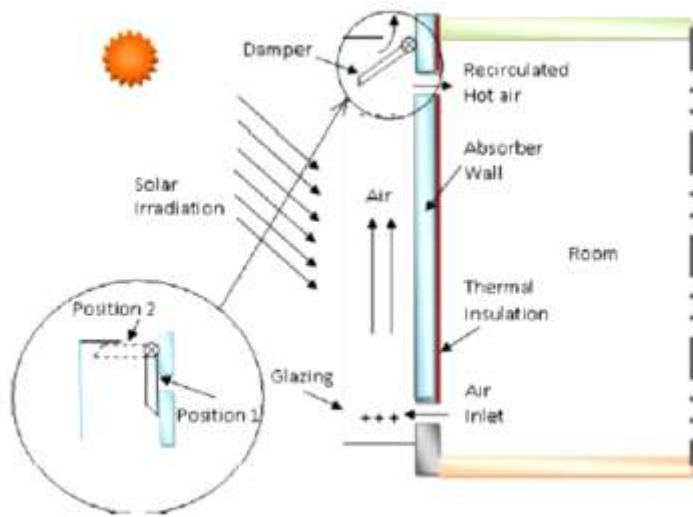


Figure 4: Solar chimney for stack ventilation

3.1.3 Ventilation Shafts and Skylights

Vertical shafts or ducts placed within the building's core that carries hot air up to the roof, where it can be vented. Skylights or roof vents can assist in exhausting warm air. It have reduces the dependence on mechanical exhaust fans by which the carbon pollution can be saved to save the commercial energy. The following strategies can be used in buildings for ventilation shaft and skylights: Use of operable skylights or roof vents that can open automatically with temperature sensors; chimney effect: heat-driven air movement through vertical shafts. The architectural view of a 1800 sqft house shaft is presented in figure 5 and it was evaluated that the 5.7 to 7.7 ACH. It is sufficient for any house [Lal et al 2013, 15, 17, Lal 2014, 18, 22].

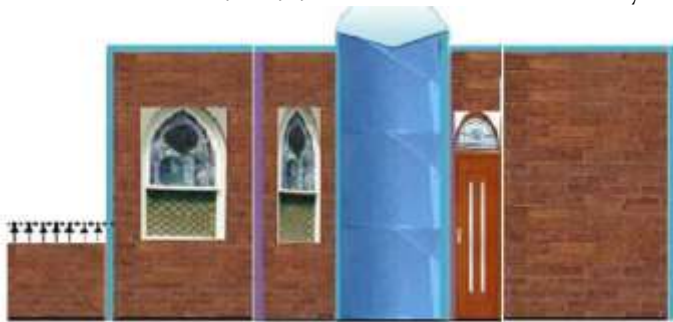


Figure 5: Architectural view of ventilation shaft

3.1.4 Ventilated Facades

- **Description:** This involves creating a ventilated cavity in the facade of the building to allow air to circulate behind the outer cladding. It provides natural cooling and ventilation to the building's envelope.
- **Carbon Reduction:** Minimizes energy use for cooling and heating by improving heat insulation and air circulation.
- **Application:**
 - Double-skin facades or perforated cladding systems.

- Using materials with high thermal mass for heat absorption during the day and gradual release at night.

3.1.5 Breathing Walls and Air Bricks

- **Description:** This technique involves creating walls with small openings (air bricks) or materials that allow air to pass through them naturally, facilitating ventilation.
- **Carbon Reduction:** Avoids the need for powered ventilation systems.
- **Application:**
 - Air bricks in masonry walls or perforated walls made of natural materials like stone or clay.

3.2 Thermal Comfort Techniques

Thermal comfort refers to the temperature and humidity conditions that make the indoor environment comfortable for the occupants, without excessive reliance on active heating or cooling systems. Figure 6 presented the six main techniques for improving thermal comfort in buildings and these are described here as follows:

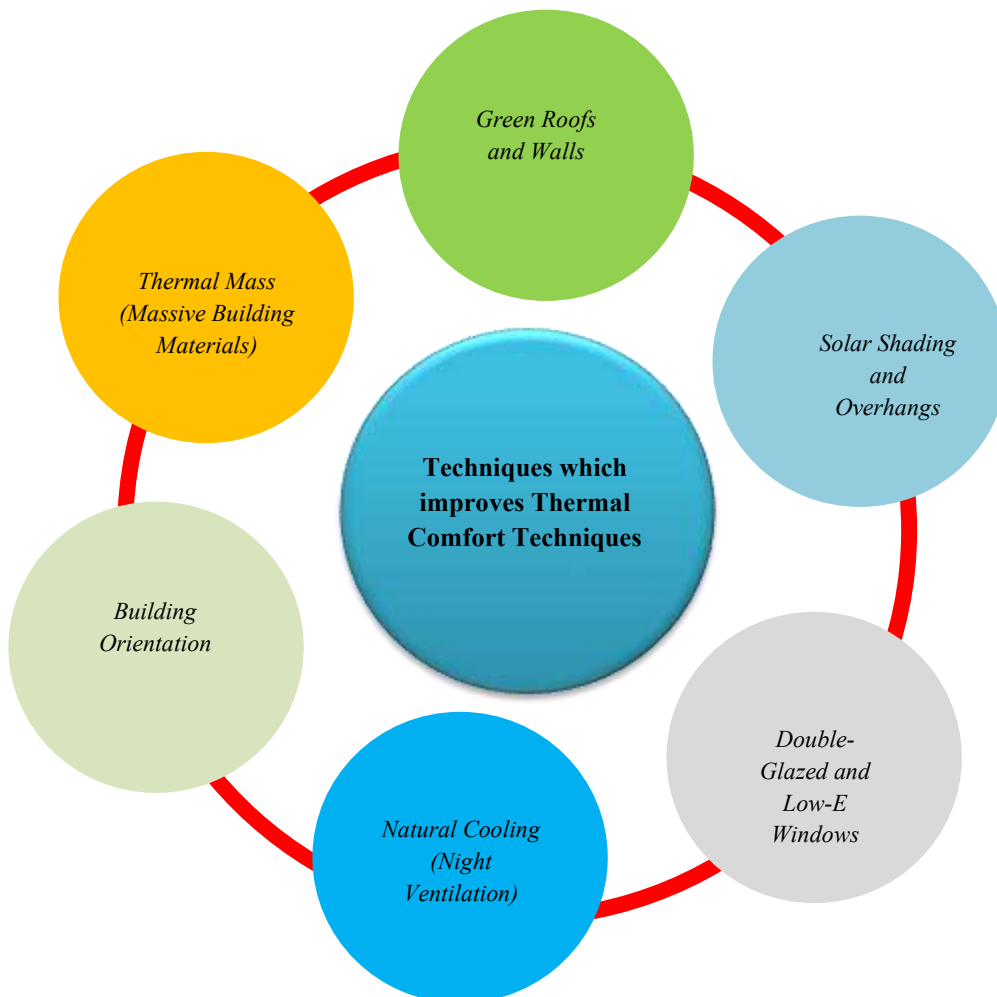


Figure 6: Techniques for improves thermal comfort in buildings

3.2.1 Thermal Mass (Massive Building Materials)

Thermal mass involves using materials that can absorb, store, and later release heat. Materials such as concrete, stone, brick, and water have high thermal mass and can regulate temperature fluctuations. It reduces the need for heating and cooling by naturally stabilizing indoor temperatures which leads to reducing the energy demand and after all reducing the carbon emissions. The main applications of thermal mass are given as follows:

- Incorporating heavy materials such as concrete or brick into floors, walls, and ceilings.
- Exposing concrete or stone floors to sunlight, so they absorb heat during the day and release it during the night.

3.2.2 Solar Shading and Overhangs

Solar shading involves protecting windows and other openings from excessive heat gain from the sun, especially in hot climates. Overhangs, louvers, and shade devices can block direct sunlight, reducing the need for cooling. By minimizes the need for air conditioning and reduces cooling loads by blocking unwanted heat, ultimately reducing the carbon emission. The main applications of solar shading and over hangings are given as follows:

- Horizontal shading devices (e.g., overhangs, louvers) placed above windows.
- Vertical shades (e.g., pergolas, shutters) for east- or west-facing facades.
- Use of dynamic shading, such as motorized blinds or operable louvers.

3.2.3 Building Orientation

The orientation of a building can have a significant impact on its thermal performance. By orienting the building to take advantage of natural light and heat, you can reduce the need for artificial heating and lighting. The building orientation reduces the energy use for lighting, heating, and cooling by optimizing the building's exposure to sunlight and wind, it concluded to reducing the commercial energy applications which leads to reduce the carbon. The main applications of building orientations are given as follows

- Positioning windows and openings on the south side (in the Northern Hemisphere) for maximum solar exposure.
- Minimizing windows on the east and west sides to reduce heat gain during early and late-day sunlight.
- Using landscaping (trees, shrubs) to provide passive shading.

3.2.4 Natural Cooling (Night Ventilation)

At night, when outdoor temperatures drop, cool air can be introduced into the building through ventilation to lower indoor temperatures and flush out accumulated heat. The natural cooling through any active or passive system reduces the need for mechanical air conditioning by cooling the building using ambient outdoor air, which leads to decrease the carbon pollution in environment. The significant applications of natural cooling system are given as follows:

- Open windows or ventilation shafts at night to allow cool air in.
- Use of night-time ventilation strategies in buildings with high thermal mass to cool the building passively overnight.

3.2.5 Green Roofs and Walls

Green roofs or walls consist of vegetation that helps insulate the building, absorb heat, and provide natural cooling. The green roof and walls can increases energy efficiency by reducing the need for cooling and heating, improves thermal comfort, and lowers the urban heat island effect, which is responsible to reduce the commercial electricity demand and ultimately help to reduce the carbon emission. The significant applications of green roof or walls are given as follows

- Installing green roofs with a mix of grasses, plants, or even trees.
- Vertical green walls with climbing plants or modular plant systems.

3.2.6 Double-Glazed and Low-E Windows

Double-glazed windows use two panes of glass with an air gap in between to provide better insulation. Low-emissivity (Low-E) coatings on windows further improve insulation by reflecting heat back into the building in winter and preventing solar heat gain in summer. It helps to reduce the need for heating and cooling by minimizing heat transfer through windows. The important applications of double glazed windows are given as follows:

- Installing double or triple-glazed windows with Low-E coatings.
- Using high-performance windows with insulated frames and gas fills like argon or krypton.

3.3. Integrated Design Strategies for Passive Ventilation and Thermal Comfort

The most effective way to reduce carbon emissions in a building is to integrate passive ventilation and thermal comfort strategies into the overall design. Here are some integrated approaches:

3.3.1 Building Form and Massing

The shape, size, and massing of the building can influence how air flows and how heat is managed. The optimizes natural airflow and heat management without relying on mechanical systems is helps to reduce the energy demand and will leads to reduce the carbon emission. Few of examples of applications for building form and massing are given by:

- Compact building shapes with fewer exterior surfaces to minimize heat gain/loss.
- Orienting the building to take advantage of prevailing winds and sunlight.

3.3.2 Climatic Design

Climatic design is the tailoring the design of the building to its local climate and optimizing natural ventilation as well thermal performance for specific environmental conditions. It helps to reduce the carbon emission due to reducing the energy consumption by utilizing local climate conditions (wind, sunlight, etc.) for thermal comfort. The significant applications of climatic design of buildings are given by examples as the buildings in:

- In hot climates, focus on maximizing shading and ventilation.
- In cold climates, emphasize solar gain and airtight construction with thermal mass.

4. AI APPLICATION FOR PASSIVE VENTILATION OF BUILDINGS

Artificial Intelligence (AI) can play a significant role in enhancing passive ventilation strategies in buildings, making them smarter, more adaptive, and efficient. By integrating AI with building systems, designers and engineers can optimize natural ventilation based on real-time data, environmental conditions, and occupancy patterns, reducing the reliance on mechanical ventilation and energy-intensive cooling and heating systems. Here's how AI can be applied to passive ventilation in buildings:

4.1 Predictive Ventilation Control

Using AI algorithms to predict the best times to open or close windows, vents, or skylights for natural ventilation based on real-time weather forecasts, building conditions, and indoor air quality.

AI can collect and analyze data from weather forecasts (temperature, wind speed, humidity) and internal sensors (indoor temperature, CO₂ levels, and humidity) to predict the optimal ventilation patterns. For instance, if the AI detects that external conditions are favorable for cooling (e.g., cool air during the night or low humidity), it can automatically open windows or adjust vents to allow fresh air in and expel hot air.

This reduces energy consumption by minimizing mechanical HVAC usage, enhancing thermal comfort, and maintaining good indoor air quality without human intervention.

4.2 Dynamic and Adaptive Natural Ventilation

Creating a system that automatically adjusts ventilation openings (windows, louvers, vents, etc.) based on indoor temperature, humidity, occupancy, and outdoor conditions.

AI algorithms monitor the building's indoor conditions, such as temperature, CO₂ levels, and occupancy, and adapt the ventilation strategy accordingly. For instance, during periods of high occupancy, the system may open windows wider to allow more airflow or adjust the size of vents based on real-time indoor air quality measurements.

This dynamic control ensures that the building remains comfortable, with adequate airflow while preventing energy wastage by keeping mechanical systems off when natural ventilation can do the job.

4.3 Machine Learning for Climate-Responsive Building Design

Applying machine learning (ML) techniques to analyze historical weather data and building performance data to create optimized designs for passive ventilation systems in different climate conditions.

AI can simulate and analyze building performance in various climate scenarios using historical weather data, such as wind patterns, temperature fluctuations, and solar radiation. It can help architects design building forms, facades, and window placements to maximize natural ventilation based on the site-specific microclimate.

To be ensures that the building's passive ventilation system is maximized for energy savings and comfort. AI models can also provide recommendations for improving building layouts and facades for better natural airflow.

4.4 AI-Based Smart Windows and Shading Systems

AI algorithms integrated with smart windows, shading devices, or electro-chromic glass can optimize natural ventilation by adjusting the amount of solar heat entering the building and balancing it with ventilation needs.

AI can analyze the external temperature, sunlight intensity, and wind patterns, adjusting smart windows or shading systems to allow in natural light while controlling heat gain. AI-driven shading devices (like blinds, curtains, or louvers) can move automatically to block solar heat during peak sunlight hours while still enabling airflow.

Optimizes indoor thermal comfort and reduces cooling demand, which decreases energy consumption and reliance on mechanical systems. It also prevents overheating by dynamically controlling solar heat gain and maximizing natural ventilation.

4.5 Predictive Occupancy-Driven Ventilation

AI can predict occupancy patterns in a building (e.g., rooms, offices, meeting spaces) and adjust natural ventilation systems accordingly.

By analyzing historical data, schedules, and even real-time data from occupancy sensors or motion detectors, AI can predict when specific areas of the building are likely to be occupied. Based on this prediction, the AI system adjusts windows, vents, and airflow patterns in anticipation of increased or decreased demand for ventilation.

This ensures that energy is not wasted by over-ventilating empty rooms while still maintaining optimal indoor air quality and comfort for occupants. Additionally, it helps in managing air exchange rates in specific rooms based on the expected number of occupants.

4.6 Integration with Building Management Systems (BMS)

AI can be integrated with a Building Management System (BMS) to control and optimize the natural ventilation system in conjunction with mechanical HVAC systems, enhancing the overall energy efficiency of the building.

AI-driven BMS can track both mechanical and passive ventilation systems, ensuring that both work together efficiently. For example, when the external temperature drops at night, AI can open windows to allow cool air in, while simultaneously reducing the load on the building's air conditioning system. Similarly, when the outside air quality is poor (high pollution levels), the system can adjust ventilation to limit the intake of polluted air.

By optimizing both passive and active systems, AI ensures that energy-intensive mechanical systems are only used when absolutely necessary, reducing overall energy consumption and operating costs.

4.7 AI for Performance Monitoring and Continuous Optimization

The continuous monitoring and data analysis of ventilation performance help to detect inefficiencies and optimize the system over time.

AI continuously analyzes data from various sensors (e.g., temperature, CO₂, humidity, airflow) and performance feedback from the ventilation systems. The system can learn from patterns over time and make recommendations for system adjustments or maintenance. For instance, if the AI detects that a particular ventilation strategy isn't performing optimally (e.g., certain windows are often open unnecessarily), it can propose or implement changes to improve efficiency.

Over time, the system becomes increasingly efficient, learning from the building's conditions and occupancy patterns, resulting in better energy performance and thermal comfort with minimal human intervention.

4.8 Advanced Simulation and Optimization Tools

AI-powered building simulation tools can optimize the passive ventilation design process during the early stages of building development, ensuring that natural ventilation strategies are maximized.

Using AI-based tools, architects and engineers can simulate the behavior of airflow, temperature distribution, and other building dynamics before construction. By applying machine learning to real-world performance data, these tools can optimize the placement of vents, windows, and openings in the design phase, predicting how different configurations will affect airflow and thermal comfort.

This helps designers make data-driven decisions that can reduce energy consumption in the final building, ensuring effective natural ventilation from the outset.

4.9 Air Quality Monitoring and Optimization

AI can monitor indoor air quality (IAQ) and adjust passive ventilation strategies to ensure healthy air without excessive energy use.

AI can collect real-time data from air quality sensors (CO₂, particulate matter, humidity, VOCs) to evaluate the building's ventilation needs. Based on the detected indoor air quality, AI can control windows, skylights, or mechanical systems to ensure optimal air exchange while minimizing energy use.

To be ensures that the building remains comfortable and healthy for occupants while minimizing energy use and carbon emissions associated with HVAC systems.

5. AI FOR PASSIVE VENTILATION OF BUILDINGS: AN OVERVIEW WITH DIAGRAMS AND MATHEMATICAL EQUATIONS

Passive ventilation refers to the use of natural forces—such as wind, temperature differences (thermal buoyancy), and air pressure differences—to move air through a building without the need for mechanical systems. The integration of Artificial Intelligence (AI) can optimize the performance of passive ventilation systems by dynamically adjusting ventilation based on real-time environmental and internal data.

In this section, we'll explore how AI enhances passive ventilation, provide diagrams to visualize these processes, and outline the mathematical equations that govern the dynamics of passive ventilation.

5.1 AI-Powered Dynamic Passive Ventilation System

AI can enhance the passive ventilation by:

- Predicting optimal times to open or close windows or vents.
- Adapting to changes in external conditions like weather and indoor parameters like temperature, CO₂ levels, and humidity.
- Learning from historical data and adjusting the system to the building's unique conditions.

AI uses data from **sensors** (temperature, humidity, CO₂, wind speed) and **predictive models** (weather forecasts) to optimize airflow in real-time.

5.2 Passive Ventilation with AI: Diagram

Here is a basic schematic diagram as shown by figure 7 of how AI enhances passive ventilation in a building:

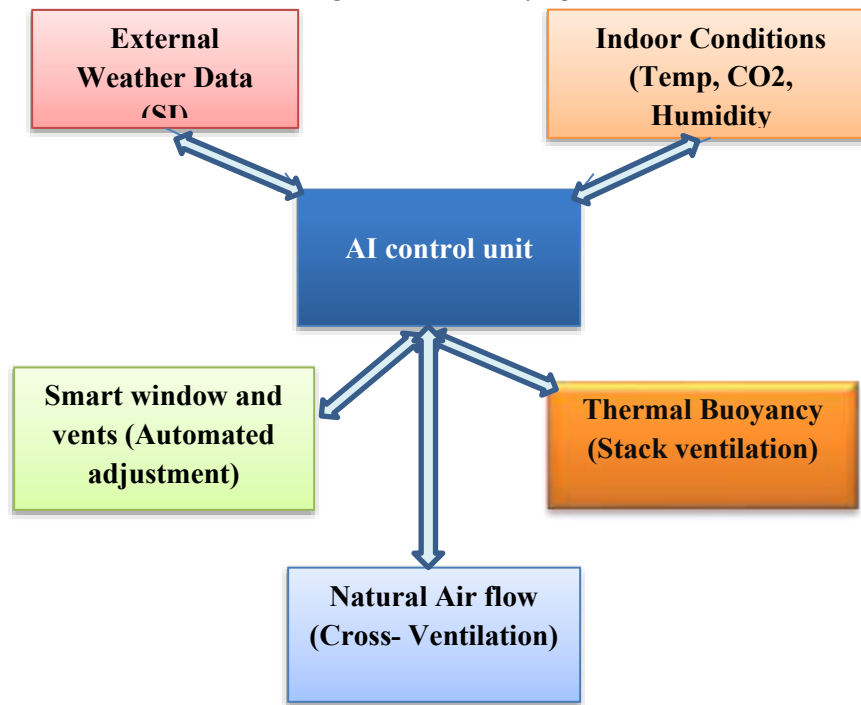


Figure 7: AI control passive ventilation strategies

- **AI Control Unit:** Analyzes weather forecasts and real-time indoor environmental data to predict the best times for passive ventilation.
- **Smart Windows & Vents:** Automatically open or close windows or vents based on AI recommendations.
- **Thermal Buoyancy (Stack Ventilation):** Allows warm air to rise and exit through vents at higher levels, driven by temperature differences.
- **Cross-Ventilation:** Ensures optimal airflow through the building by utilizing wind pressure differences between the exterior and interior.

5.3 Mathematical Equations for Passive Ventilation with AI

AI-driven passive ventilation systems leverage various physical principles, which can be described mathematically. These include airflow dynamics, stack effect, and wind-driven ventilation. Here are the key equations that AI can optimize in a passive ventilation system:

5.3.1. Stack Effect (Thermal Buoyancy)

The stack effect (or thermal buoyancy) occurs when warm air rises due to its lower density compared to cooler air. The pressure difference that drives the upward movement of air is related to the height difference between vents and the temperature difference between the indoor and outdoor air.

Mathematically, the stack effect is given by:

$$\Delta P = \rho \cdot g \cdot H \cdot \Delta T$$

Where:

- ΔP = Pressure difference (Pa)
- ρ = Density of air (kg/m^3)

- g = Gravitational acceleration (9.81 m/s^2)
- H = Height difference between air intake and exhaust (m)
- ΔT = Temperature difference between indoor and outdoor air ($^{\circ}\text{C}$)

The **airflow rate** driven by the stack effect can be approximated by the equation:

$$Q = C \cdot A \cdot \text{SQRT}(2gh(\Delta P/\rho))$$

Where:

- Q = Airflow rate (m^3/s)
- C = Discharge coefficient (dependent on the shape of the vent)
- A = Area of the vent (m^2)
- ρ = Air density (kg/m^3)

AI optimizes this by adjusting window opening sizes and positions, ensuring maximum thermal buoyancy when the internal temperature is higher than the outside temperature. The ACH variation with respect to day time and coefficient of discharge is shown in figure 8. The 5.7 to 7.7 ACH was achieved at various coefficient of discharge like 0.55, 0.65 and 0.75.

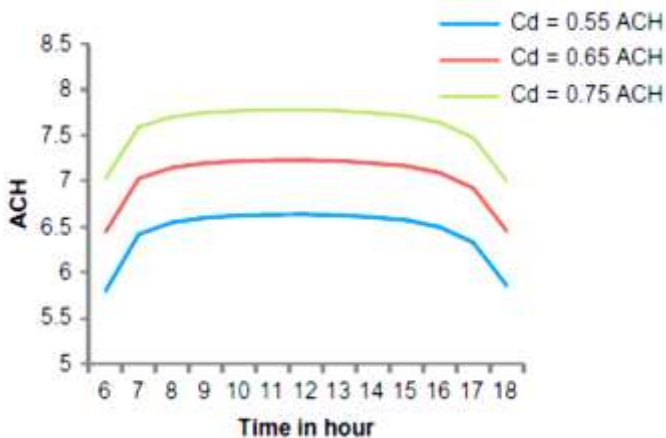


Figure 8: ACH variation with respect to time and coefficient of discharge

5.3.2. Wind-Driven Ventilation (Cross Ventilation)

Wind-driven ventilation depends on the difference in wind pressure between the windward and leeward sides of the building. The airflow rate from cross-ventilation can be estimated using Bernoulli's equation for fluid dynamics:

$$Q = C_w \cdot A_w \cdot \text{SQRT}(2gh(P_w - P_l)/\rho)$$

Where:

- Q = Airflow rate through the building (m^3/s)
- C_w = Wind discharge coefficient (depends on the window's orientation and design)
- A_w = Area of the opening (m^2)
- P_w = Wind pressure on the windward side (Pa)
- P_l = Pressure on the leeward side (Pa)
- ρ = Air density (kg/m^3)

AI uses real-time wind data from sensors or weather forecasts to calculate the ideal window or vent opening size for cross-ventilation, adjusting based on external wind speed and direction.

5.3.3 Combined Thermal and Wind-Driven Ventilation

In real-world applications, both thermal buoyancy (stack effect) and wind-driven ventilation may occur simultaneously, and the AI must optimize the relative contributions of each.

The combined airflow rate Q_{total} can be approximated as:

$$Q_{\text{total}} = Q_{\text{wind}} + Q_{\text{stack}}$$

Where:

- Q_{total} Total airflow rate (m^3/s)
- Q_{wind} Airflow rate from wind-driven ventilation (m^3/s)
- Q_{stack} Airflow rate from thermal buoyancy (m^3/s)

AI uses this combined model to adjust window openings, vents, and other openings based on the external conditions to maximize natural ventilation and maintain thermal comfort.

5.3.4 AI-Based Optimization of Ventilation Systems

The AI system uses machine learning algorithms and predictive modeling to continuously learn from sensor data and optimize the passive ventilation system. The AI system can minimize energy consumption while maximizing thermal comfort by learning the building's specific ventilation needs.

For instance:

- Supervised learning algorithms (like neural networks) can predict the optimal window opening sizes based on historical data (e.g., time of day, weather conditions, occupancy).
- Reinforcement learning can help AI improve over time by receiving feedback on indoor air quality and comfort, continuously adjusting ventilation strategies.

AI can also factor in **occupancy patterns** (number of people, CO_2 concentration) and **time-of-day** variations to adjust the passive ventilation system accordingly.

6. CONCLUSION

Implementing passive ventilation and thermal comfort techniques can significantly reduce the carbon footprint of a building. These strategies are especially effective when integrated into the overall building design and used in combination. By minimizing the need for mechanical systems, buildings can achieve better energy efficiency; lower operating costs, and provide comfortable indoor environments with a reduced environmental impact.

AI can significantly enhance the efficiency and performance of passive ventilation systems in buildings. By leveraging predictive algorithms, real-time monitoring, and smart automation, AI helps buildings adapt to environmental conditions and occupancy needs, reducing reliance on mechanical ventilation and HVAC systems. This results in lower energy consumption, reduced carbon emissions, and a more sustainable approach to maintaining indoor thermal comfort and air quality.

AI plays a transformative role in enhancing passive ventilation systems by continuously adapting to real-time data and optimizing airflow dynamics. By predicting and controlling natural ventilation strategies (wind-driven, thermal buoyancy), AI can significantly reduce energy consumption and improve indoor comfort. The integration of AI with mathematical models like the stack effect, wind-driven ventilation, and combined airflow can help create highly efficient and adaptable passive ventilation systems for sustainable building designs.

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