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The Interaction Between Humans and Buildings for Energy Efficiency: A Critical Review

ABSTRACT

Buildings consume energy for different purposes. One core function is to provide healthy and comfortable living conditions for the humans that inhabit these buildings. The associated energy use is significant: taken together, buildings are responsible for roughly 40% of the world's total annual energy consumption. This large percentage makes the built environment an important target for researchers, policy makers, innovators and others who aim to decrease energy consumption and the associated emissions of Greenhouse Gases (GHG). Unfortunately, the significant body of research on energy efficient buildings conducted since the 1970s has had only a limited impact on the overall energy use of the sector, and this remains a serious concern. The energy use of buildings shows a strong correlation with the activities of the building occupants. A key factor that makes it hard to curb building energy use is a lack of understanding of building occupant behaviour. This paper reviews research on building occupant behaviour in two stages. The first stage reviews important issues, milestones, methodologies used, building types analysed and progress achieved related to the topic, as reported in the most frequently cited papers. The second stage focuses on recent work in the area and investigates 'state of the art' developments in terms of questions asked and solutions proposed. The aim is to identify problems and knowledge gaps in the field for future projection. Recent research on the topic is analysed, taking account of methodologies, building types, locations, keywords, data sampling and survey size. Based on a critical analysis of the literature, the following outcomes can be reported: research on building occupant behaviour relies strongly on quantitative methods, but studies are mostly located in the northern hemisphere and in developed and high-income countries. The dominant research topics associated with occupant behaviour are energy demand and thermal comfort, followed by retrofit and renovation. Most research focuses on technical aspects rather than socioeconomic issues. Current research is mostly limited to studies of single buildings and typically lacks data-gathering standards, which makes it hard to conduct cross cultural data comparisons. Most research concentrates on individual topics, such as window, door and blind adjustments, effects of Heating Ventilating Air Condition (HVAC) systems etc. and does not provide a wider, holistic view that can be linked to social and economic factors.

Keywords: Occupant Behaviour; Energy; Energy Efficiency; Lifestyles; Performance Gap; Buildings

HIGHLIGHTS

- Highly complex relationship between building energy use and occupants
- Existent research has had only limited impact on actual energy use of built environment
- Previous work biased towards quantitative research from developed countries
- Most studies limited to single or small groups of buildings and short time intervals
- Data gathering does not follow well-established protocols or standards

WORD COUNT: 10923. (excluding references)

ABBREVIATIONS

- BEMS Building Energy Management Systems
- DFL Device Free Localization
- EIA Energy Information Administration
- EPBD Energy Performance Building Directive
- EU European Union
- GHG Greenhouse Gas
- HVAC Heating Ventilating Air Conditioning
- ICT Information and Communication Technologies
- IPCC The Intergovernmental Panel on Climate Change
- IEA International Energy Agency
- LCA Life Cycle Assessment
- NASA National Aeronautics and Space Administration
- NOAA National Oceanic and Atmospheric Administration
- NZEB Nearly Zero Energy Buildings
- PIR Passive Infrared Sensors
- POE Post Occupancy Evaluation
- RF Radio Frequency
- SCI Science Citation Index
- SCI-E Science Citation Index-Expanded
- SSCI Social Science Citation Index
- TUS Time User Survey
- UK United Kingdom
- UN United Nations
- USA United States of America

1. INTRODUCTION

The increasing need for energy is among the key challenges facing the economic, environmental, societal, industrial and academic development of humanity. The International Energy Agency (IEA) regularly reviews the state of the art in this field. In a report from 2018, two important points were made: (i) In that year, the average global energy consumption increased by almost twice the average rate of growth since 2010 and (ii) a historic high was reached with energy related CO_2 emissions, which increased by 1.7% to 33.1 Gt CO_2 [1].

Since people are spending more and more time indoors [2], [3] there is a strong need to save energy from buildings. It is well-known that 1/3 of primary energy [4] and 40% of energy resources worldwide is consumed by the built environment [1], [4], [5], [6], [7]. Contrary to general belief, "buildings do not use energy: people do" [8]. Janda [8] comments that there is a deficiency in the understanding of occupant behaviour, but this factor is often ignored in the built environment. Although occupant behaviour plays an essential role in driving the building energy consumption through heating, cooling, ventilation and artificial lighting systems [9] and has a strong impact on the general thermal performance of buildings. Generally, the amount of research published on this topic has been limited [11]. However, there has been a strong increase in interest [12] since the beginning of the new millennium, leading to a significant growth in research on occupant behaviour and its outcomes (Figure 1).



Figure 1. Journal Papers published in English related to Occupant Behaviour between the years 2000-2019, based on Scopus records.

Different publications emphasize various aspects of occupant behaviour. For instance, D'Oca et al. [13] analysed human dimensions, while Stazi et al. [14] reviewed driving factors and Naylor et al. [15] analysed occupant-centric energy control systems. Amasyali et al. [16] classified papers on occupant behaviour based on data driven energy consumption prediction, while Delzendeh et al. [17] analysed papers based on parameters influencing occupants' energy behaviour. Jung and Jazizadeh [18] classified review papers based on their topics, while De Bakker et al. [19] focused on lighting, Guyot et al. [20] on ventilation and Khosrowpour et al. [21] reviewed papers based on their data analysis methodologies.

An examination of the scope of recent papers reveals that technical issues are the most prominent topics. Quantitative research that analyses data is increasing [17], [21], [22]. Residences and offices are the building types that are the most studied, while monitoring and surveying are the most common methodologies for data gathering [23]. Although diversity between different occupant groups in various regions and countries [24], as well as variation between socio economic groups [25], is mentioned, occupant behaviour is still mostly considered at the individual building-scale and not at the urban-scale [26]. Strikingly, it has been reported that the low energy consumption of buildings cannot solely be guaranteed by technology [13].

A related area of research that attracts a high degree of interest is the 'energy performance gap'. This gap is related to the difference between the predicted and actually measured amount of energy used in buildings [27], [28]. Mostly there is a significant difference, which means building energy performance targets are missed. In one of several studies on the performance gap [29], [30] de Wilde [31] identifies occupant behaviour as one of the main underlying reasons for its existence. Maintaining comfort conditions of occupants is the main reason for energy consumption in buildings. Variation in building design, building systems, weather, indoor air temperature, relative humidity, air speed and occupant-centric parameters such as clothing, metabolic rate, cultural habits, attitudes and life-styles all may contribute to varying comfort conditions in which occupants consume energy. Furthermore, occupants are individual human beings, and therefore it is hard (and often controversial) to group them into predefined categories using a classification based on their culture, location, society, status, lifestyles, income, vulnerability, age, gender etc. [4]. To conserve energy in buildings, occupant comfort conditions should be maintained while accommodating the occupants' habits, attitudes, profiles, lifestyles, demographics, socio-economic status, vulnerabilities, and other

limitations. Although comfort conditions are targets and these target conditions may not always be achievable, overlooking topics such as lifestyles, vulnerabilities, and limitations with lack of their measures/metrics might be one the most important reasons for the energy performance gap in buildings (Figure 2). However, some critical questions about the relation between occupant behaviour and building energy performance have been asked by Mahdavi [32].

Demographical change affects society in several ways. Since individuals spend a good portion of their life in buildings, a healthy and comfortable environment is vital for occupants' well-being and productivity, as well as energy conservation [33], [34]. It is known that different age groups with different metabolism rates, health and vulnerability conditions tend to use different levels of building energy. Moreover, income and vulnerabilities may be listed as factors limiting the consumption of energy. The increasing life expectancy of humans due to developing technology, better health care and effective public precautions also has an impact on building energy consumption. Buildings, like people, inevitably age. Close to 64% of the European Union (EU) building stock is over 35 years old. Average consumption was 185 kWh/m², while space heating constituted 60 – 80% of consumption [24]. Income, type of ownership, size, and respondent's age are household characteristics that are known to have an influence on the use of energy [35]. Resilience of buildings, along with occupant behaviour, may be another topic for the coming decades. Older populations occupying older buildings may lead to increased energy consumption in the near future.



Figure 2. Effects of Occupant Behaviour on the building energy performance gap

As buildings are omnipresent, addressing the performance of the existing building stock has become a major challenge [36]. In principle, the reduction of energy use in buildings can be achieved in two ways. The first is to invest in technology and the second is to invest in changing occupant behaviour. In general, human beings can be considered as quite flexible to changes of climate conditions, lifestyles, developing technology, attitudes etc. Buildings, on the contrary, are a lot less flexible than humans over their operation period. Technological modifications of buildings take time, need a serious amount of investment, and payback times cannot fully be estimated. Using the human capacity for adaptation may allow societies to get fast paybacks and efficiency results. This is not expensive and has a fast response time. Supporting this idea, Ting et al. [37] argue that promoting the use of energy-efficient technologies, as well as further developing such technologies, is not enough to tackle high levels of environmental pollution and energy consumption. Occupants should not be considered as the only actors who will solve the problems. It is obvious, however, that the challenges of reducing energy consumption and bridging the energy performance gap in buildings require a deep understanding of occupant behaviour.

1.1. Aim and Objectives

This paper explores the current knowledge based on occupant behaviour in relation to the energy consumption of buildings. It discusses the current 'state of the art,' identifies research challenges, and

reviews ongoing research efforts. The contribution of this review paper is twofold. Firstly, it provides an extensive and deep literature review to understand current research in this field. Secondly, it outlines what needs to be investigated next in order to progress the domain.

In more detail, the paper has the following objectives:

- 1. To investigate the current body of knowledge on building occupant behaviour, specifically homing in on the interaction between humans and buildings, occupant attributes, and different categories of occupants.
- 2. To explore current efforts in the field of building occupant behaviour in terms of the coverage of the domain, with specific attention to knowledge gaps, underexplored areas, and hyperbole in some areas.
- 3. To review the methodologies used in building occupancy studies reported in the literature in terms of research focus, methodology used, building typologies studied, geographical coverage, data sampling, and dataset size.
- 4. To identify areas that need further work.
- 5. To develop suggestions for future research.

1.2. Overview of the paper

The paper is organized according to the objectives and covers the five main themes, namely, introduction (Section 1), literature review (Section 2), followed by ongoing efforts (Section 3), discussion (Section 4) and conclusion (Section 5).

The introduction gives an overview of the research area and defines specific problems based on review and research papers. The section is built on developments and milestones in the field from the publications that are most often cited.

Further literature is reviewed in seven different sub-sections by defining the role of occupants in building energy use, scrutinizing occupant and occupants attitudes, the importance of occupant behaviour, discussing the differences between energy efficiency, consumption and conservation, focusing on the importance of data for analysing occupant behaviour and reviewing building types used in previous studies by concentrating on the near future and its challenges. The literature is reviewed on the basis of review and research papers published in the field.

'Ongoing efforts' is the deep analysis of research published in the last two years in seven internationally indexed – Social Science Citation Index (SSCI), Science Citation Index (SCI), Science Citation Index-Expanded (SCI-E)- journals, namely Building and Environment, Building Research & Information, Energy and Buildings, Energy Research & Social Science, Energy Policy, Journal of Building Engineering, and Renewable & Sustainable Energy Reviews. The journals that have been selected are all listed in the Scopus database and have been chosen on the basis of their impact factor and on earlier publication numbers related to occupant behaviour. This chapter is followed by discussions that critically analyse up to date research and conclusions based on the outcomes of the review.

1.3. Methodology

The literature review in this paper has been conducted in two rounds. In the first round, papers in the field are reviewed from a wider timeline, covering the one hundred papers most often cited in the field. The first two sections inspect the literature for contextualization, providing an overview and describing recent developments to clarify the main topics and challenges in the field. Review and research papers related to occupant and building interaction, performance gap, hot topics of discussion and overlooked issues are categorized.

The second round of reviews conducts a critical analysis of work published in the last two years in seven internationally indexed (SSCI, SCI, SCI-E) journals. This review analyses the ongoing efforts to understand cutting-edge developments and current innovations in the field. The discussion section critically analyses up to date research and discusses what has recently been done and what action will be carried out next. The paper concludes with outcomes of the review, followed by future work projection. The research reviewed around 300 papers in total to provide projections for future research. Most, but not all, of these papers are cited in this article.

2. LITERATURE REVIEW

This section of the paper reviews the existing literature on building occupant behaviour in the papers that are most often cited. The papers used in this chapter are carefully chosen from research and review articles in the Scopus database under the term "Occupant Behavio(u)r". Papers with a different focus area, such as fire safety, health sciences, accident analysis, transportation, which are included in the term, have been excluded. The section lays out the main issues to frame the developments and challenges to be discussed in seven sub-sections. The outcomes of this section contribute to drawing a framework of the analysis of the current practice for ongoing efforts in Chapter 3.

2.1. Role of occupants in building energy use

Descriptive statistics give a general feel for the important role of buildings and their occupants in the environmental challenges facing the world. Buildings consume approximately 80% of their life cycle energy during their operation [**38**] which is roughly more than 4 times the embodied energy [**39**]. Overall, 36% of the global final energy consumption is jointly attributable to existing buildings and building construction, and close to 40% to total direct and indirect CO_2 emissions [**40**].

The importance of occupant behaviour in the energy performance of buildings has been pointed out by many authors, such as Nicol & Humphreys [41] Clarke [42] Baker & Standeven [43], Nicol [44], and Mahdavi & Kumar [45]. The Report of IEA Annex 53, on occupant behaviour, lists triggers for occupant actions, such as biological, psychological, and social contexts, time of day, building/installation properties, and the physical environment [46]. This report positions occupant behaviour as addressing the first stage of Maslow's pyramid of need when considering energy consumption in buildings. A few years later, IEA Annex 66 [47], in a project related directly to occupant behaviour, reported that the behaviour of occupants plays an important part in their standard of comfort and their use of energy.

Building energy consumption is significantly influenced by the occupants' behaviour **[48]**. Yu et al. **[49]** define seven important factors influencing the total energy consumption of buildings, namely climate, building related characteristics, user related characteristics, building services systems and operations, occupants' behaviours and activities, social and economic factors and indoor environmental quality. Occupants, simply by their presence, passively affect the energy balance of buildings **[50]**. Occupants are also responsible for consumption, emission and waste produced, and consume energy in buildings for different reasons to maximize their comfort though their use of Heating, Ventilation, and Air Conditioning (HVAC) systems, cooling, lighting, plug loads/appliances, and domestic/service water heating **[4]**.

Occupancy is difficult to measure and model in building research, even though it may be listed as a key factor in building energy use [51]. D'Oca [13] defines occupancy patterns as the key driver of building performance for residential buildings. They are also important for energy related calculations and simulations considering specific issues [52]. The general profile of occupants can be used to further develop energy saving policies specific to certain sectors of society [52]. Consequently, while patterns are used mostly for individual research, profiles are also needed for larger scale implementations. Occupant profiles and patterns can be developed, based on detailed data analysis

[35] and nationwide statistical analysis [53]. However, the literature does not provide an agreed profile or patterns for group populations in studies focused on Europe and the United Kingdom (UK) [54].

To conclude, occupants with their different profile and activity patterns are the main drivers of energy use in buildings. Occupants not only consume energy as a consequence of their presence but also with their operative control related to building type. Besides, occupants play an active role by changing thermostat set points, tuning radiator and light switches etc. to adjust the indoor air environment. However, due to variances in occupants' backgrounds, it is not easy to model or measure occupancy to determine energy consumption in buildings.

2.2. Occupants and occupant attributes

The term "occupant" stems from the Latin term verb "occupare" and is typically defined as a person who resides or is present in a house, vehicle, seat etc. **[55].** Within the domain of buildings, a more specific definition may be: occupants are human beings who occupy a space within a building for some purpose, who have their own comfort requirements and expectations regarding the environment they occupy **[47]**. Occupants interact with the buildings, modifying the indoor environment to maintain their personal comfort, which is a necessary pre-condition for health, well-being and productivity **[56]**. In this respect, occupant behaviour can be defined as the presence of people in the building in relation to actions of adjustment to the indoor environment **[57]**. Nicol and Humphreys **[58]** state that people react to change in order to restore their comfort if a modification of their environment occurs. On the other hand, occupancy is not a singular term and does not only represent individuals. The term is also related to the presence of people in a building, occupying space, the number and location of people in a space, and all of these in relation to time **[59]**. Understanding the adaptive approach to thermal comfort; control by occupants might be viewed as a decision-making process that takes certain physiological and psychological assessments into consideration before any control action is carried out **[60]**.

Behavioural change is a term that is used to describe a process whereby occupant behaviour is modified in some way. This is mainly considered to be achievable at little or no cost, without hi-tech knowledge, and to have the potential to decrease energy consumption. The opportunity is applicable to both new and existing buildings [61] and effects may be attained in the short term compared to other interventions. Each individual human being has a distinct personal history, attitude, sociocultural attributes (such as age, gender, education and wealth/income) and shows variations in physical and mental health, relationships with family and friends, and the amount of free time each has, all of which all have an effect on the energy- related behaviour in buildings [62]. In addition, socio-economic characteristics may affect lifestyle, attitudes and preferences [63]. Since occupants have different habits, attitudes and thus different influences on energy consumption in buildings, occupant profiles are often used to define segregation between clustered groups. Occupancy patterns, different from profiles, are used to define actions and reactions within a certain time scale.

To conclude, occupancy is the term given to humans who occupy a space and who interact with buildings. Occupants react to modifications in their environment to restore their comfort. The comfort conditions such as temperature, humidity, indoor air quality, sunlight etc. may vary due to the different profiles of occupants. Occupant profiles classify people based on demographics related to age, gender, single-family, vulnerability etc. Different profiles may have different activity patterns, which may change over time. However, there are as yet no cross-culturally agreed occupancy profiles or patterns to group building occupants.

2.3. Importance of occupant behaviour

An occupant's interaction with a building and its systems to adjust indoor air quality and thermal comfort plays a significant role in the total energy use [35], [48], [64], as well as the specific energy performance of buildings [65]. As reported by Fabi et al., [65], Kirsten [66] and Yan et al. [67]

research exploring identical buildings and identical envelopes has identified occupant behaviour as a significant driver for variation of energy consumption, CO_2 emissions and waste production. A deep understanding of occupant behaviour is vital for the accurate prediction of operational energy use in buildings [68]. However, occupants are not homogenous groups of people. Moreover, occupants may not always react on the basis of logic but may also be driven by their emotions, which may reflect numerous variables. Occupant behaviour is listed as one of the important reasons for the performance gap [31] since its complexity and its dynamics make it difficult to capture.

Nguyen and Aiello [69] point out that occupancy-based control may allow for a significant amount of energy savings in HVAC and lighting systems. Ouyang and Hokao [62] state that occupant behaviour affects household electricity use directly. Similarly, Gill et al. [70] conclude that occupant behaviour in low-energy dwellings has a significant impact on heat and electrical energy consumption. Moreover, van Dam et al. [71] reported, on the basis of research by Brohus et al. [72] and Crosbie and Baker [73], that the behaviour of occupants played an important part in the varying degrees of consumption of domestic energy.

Even though the world's attention seems to be focused on improving technology for energy efficiency, poor occupants' behaviour in terms of wasting energy requires more serious attention [61]. Occupants may also change their behavioural patterns due to increased awareness. The European Environment Agency [74] reports that different measures targeting consumer behaviour may help to save up to 20% of energy demands. For example, positive effects of policy coverage of total final energy consumption in buildings led by lighting has effects on building sector energy intensity, which is decreasing [75]. Levy and Belaid [53] affirm that a better understanding of the processes of energy consumption can be obtained by paying more attention to the use of energy by individuals or groups and by applying anthropological, sociological and geographical methods to the study of residential practices and life-styles. Policy makers and researchers should not fall into the trap of blaming people and making no investment in buildings. Energy conservation in buildings should take occupants into account but cannot depend solely on changing occupants' behaviour.

Occupancy-related information is not only useful for building energy management but also for safety, security, and emergency response [76]. Occupants develop adaptive behaviours and interact with buildings. Human-building interaction based on passive and active control systems follows the same philosophy of human-machine interaction as is established in the wider engineering domain. For example, machine learning algorithms have effectively been used in Building Energy Management Systems (BEMS). Occupant behaviour is seen as a vital factor in reduction of the ecological footprint [77]. And finally, occupant behaviour must be taken into account for Life Cycle Assessment (LCA), especially for operational estimation [78].

Occupants adapt themselves for the building environment for the best possible fit of their comfort requirements and indoor environment conditions. However, occupant behaviour is affected by several contextual factors, such as socio-cultural background, demographics, personal limitations, lifestyles etc. Considering occupant behaviour is a key factor of energy consumption; a better understanding of it is needed for energy management that covers efficiency and conservation in buildings.

To conclude, buildings consume energy: this consumption, however, is driven by the needs of occupants. Occupants are the ones who consume energy, cause greenhouse gas (GHG) emissions and produce waste in buildings. Occupants have a direct effect on the heating, cooling, and ventilation of buildings. They are one of the most important reasons for the energy performance gap and have the biggest impact on consuming energy. That is why occupant behaviour is one of the hot topics related to energy conservation and efficiency in buildings.

2.4. Energy efficiency, conservation, and consumption

Energy saving measures work in different ways and therefore need to be selected on the basis of a good understanding of the workings of specific buildings [79]. Conserving energy, however, is not the

same as reducing consumption or increasing efficiency, two terms that are frequently confused and poorly understood [80]. Energy efficiency and energy conservation are related terms, but each has a distinct meaning [81]. According to the Energy Information Administration (EIA) [81] energy efficiency relates to the use of technology to provide the same service with less energy, while conservation relates to any intervention that results in the use of less energy in relation to the total amount of energy used. Energy efficiency may be increased, and consumption can be reduced, through a better understanding of occupant behaviour in buildings. Another key point to remember is the need to define time intervals and metrics when calculating consumption. Depending on context, one may for instance decide to aggregate energy data as weekly, monthly, seasonal or annual, or to measure energy use per person, household, building volume or floor area. Consumption may be compared in relation to a specific target or goal of research. By way of example, reference can be made to the outcomes of research by Levy and Belaid [53]. They state that consumption intensity per person may vary according to the diversity of households. However, the age of households and their consumption may be totally different, whereas consumption per square meter remains relatively stable. One of the outcomes of their research was that larger households with more members consume more energy overall, although the individual energy usage of a member of such a household is decreased [53]. Thus, researchers must align their targets with their method of analysis. Meaningful outcomes require the use of meaningful performance measures and the correct use of statistics.

Varying habits, attitudes and lifestyles among individuals in a society render the definition of energybased measures complicated and force researchers to inspect several issues related to interactions between these measures and human beings. To achieve energy targets, people should ask themselves to define their objectives for energy consumption in buildings. According to Filippin et al. **[82]** saving energy is more cost-effective than producing energy. Consuming less energy reduces GHG emissions, preserves resources and decreases users' energy costs. The research of Steinberger et al. **[83]**, which was concerned with negawatt and energy saving in relation to reduced consumption, reveals that EU targets for the reduction of GHG emissions by 2050 are unachievable through technological improvements alone.

Pre-bound and rebound effects are also important tasks to deal with in considering energy efficiency related to occupant behaviour. Hens et al. **[84]** and Santin **[85]** define the rebound effect as added energy used after retrofitting, while Sunikka-Blank and Galvin **[86]** explain the pre-bound effect as using less energy than expected before any retrofitting. Both are believed to cause a gap between measured and performance consumptions due to the behaviour of occupants.

To conclude, it should not be forgotten that (i) energy efficiency might not decrease total consumption of energy but might positively affect energy conservation and that (ii) energy efficiency and conservation have positive effects on energy conservation. However, these two factors might be subject to a rebound effect related to occupant behaviour.

2.5. Importance of data for analysis of occupant behaviour

Data, whether quantitative or qualitative, is crucial to all analysis of occupant behaviour. Qualitative research gathers data about opinions, attitudes, perceptions and understandings of people and groups in different contexts, using interviews, focus groups, observation, case studies, etc., while quantitative research gathers data in terms of numbers, using surveys, statistics, modelling etc. [87]. Quantitative research provides the best means of testing hypotheses and quantifying relationships, whereas qualitative methods are appropriate for exploratory studies or for acquiring deeper levels of information [87].

It may be noted that recent research on occupant behaviour is highly focused on data collection and analysis. Hong et al. **[48]** define four areas in which data should be gathered: (i) occupant movement and presence, (ii) thermal comfort sensation and control, (iii) operation of windows, shades and blinds and (iv) operation of lighting and electrical equipment. One of the biggest obstacles with regard to data collection is the lack of standardized data-gathering, storage, and analysis protocols. Privacy

issues also pose a problem **[48].** Furthermore, occupancy data collection at the building scale is highly varied **[54]** and exact details of the underlying data-gathering and analysis often remain vague. With only a few exceptions, all reviewed research papers use data analysis combined with case/field study, surveys, questionnaires, interviews or monitoring. In recent research, excellent data analysis has been achieved using different statistical methods, mathematical formulations with capable computer systems and simulation tools. Consequently, quantitative research easily stands out amongst the many quantitative or mixed-mode efforts. However, Day and O'Brien **[88]** point out the importance of data gathering based on qualitative research for detailing hidden and important facts which quantitative research may overlook. Most of the research related to occupant behaviour is conducted during post occupancy stages.

<u>Post Occupancy Evaluation (POE)</u> is the evaluation of a building based on its performance with occupants [70], [89]. According to a review by Li et al., [90] energy use is by far the most explored issue. POE can be applied to any type of building. To have statistically significant outcomes, however, demographics and the size of samples of occupants should be carefully chosen. Research based on POE has been produced by Vale and Vale [91] for domestic energy use and lifestyles, Korsavi et al. [92] for adaptive behaviours, and Gonzales-Caceres et al. [93] for evaluation in social housing.

Monitoring, whether for a single building or dwelling is one of the methods most often used in studies of occupant behaviour [54]. Records of energy consumption based on bills and meter readings may be listed as basic methods. More advanced approaches employ motion sensors, vision- based technology, Radio Frequency (RF) based technology, Passive Infrared Sensors (PIR), multi- sensor networks, CO₂ sensors, acoustic sensors, air pressure sensors, Device Free Localization (DFL), or virtual sensors [54], [76]. The monitoring period is important for understanding monitoring results. Seasonal effects are often critical and monitoring for a full year may be needed to capture the full complexity of the observed quantities in sufficient detail [67]. Demographics should be taken into account when deciding on sample size. Time intervals for monitoring vary from 1, 5, 10, 15, 30 or 60 minutes to daily, weekly, seasonal and yearly intervals, depending on the specific purpose of the research. Research based on monitoring is to be found in Gilani and O'Brien [94] for *in situ* monitoring for offices and Abubakar et al. [95] for energy monitoring devices

Simulation can be defined as the digital representation of the behaviour of a building, process or a system. Challenging factors in building simulation are the representation of social constraints and dynamics, lack of stressors, and unfamiliarity with the environment [67]. A large number of simulation tools is available for the prediction of a building's energy consumption [56] and new tools are regularly introduced with highly different underlying models and opportunity of use. Melfi et al. [96] and Yan et al. [67] list temporal, spatial, and state resolutions for occupancy modelling as challenging factors, requiring knowledge of occupancy (activity type, identity and number of occupants with a specific state), spatial resolution (community, building, zone and room) with time intervals (seconds, minutes, hours, days and years). Yu et al. [49] assert that it is not possible to define all the effects of occupant behaviour and activities through simulation, due to the behavioural diversity and complexity of users. There are several methods and systems that attempt occupant modelling in the field. Some of these are based on Statistical-Linear Regression, Bayesian probability, Logistic Regression, Support Vector Regression, t-test, the U test, the Pearson chi-square test, the KS test, Time Series, the Stochastic Standard Markov Model, the Markov Chain-Monte Carlo, the Hidden Markov Model, the Layered Hidden Markov Model, the Autoregressive Hidden Markov Model, the Dynamic Markov Time-Window Inference, Various Probability Distributions, the Machine Learning- Support Vector Machine, the Artificial Neural Network, the Decision Tree, Classification Methods, Polynomial Regression, Clustering, Bayesian Networks, Presence Sense and Optimization [48], [76]. Building performance simulation is a low-cost and efficient alternative for analysing and optimising building designs and systems [12]. Research based on simulations can be accessed in Virote and Neves-Silva [64] (occupant behaviour assessment based on stochastic models); Yang and Becerik-Gerber [97] (a systematic review of simulation programs for coupling of occupancy information with HVAC energy simulations); and Feng et al. [59] (simulations of

occupancy in buildings). Moreover, an occupant behaviour XML schema, obXML, has been developed for exchange of occupant information modelling and integration with building simulation tools **[98]**, **[99]**.

<u>Surveys are</u> valuable for gaining knowledge of relationships among a group of variables [4] and are often used in social science. Different approaches can be discerned, such as transverse, longitudinal, and background surveys [68]. Validation is important for the avoidance of misinformation [67]. Research with large datasets based on surveying can be found in Acharya and Sadath [100] for surveys of more than 40000 households conducted over a period of several years to investigate the relationship between energy poverty and economic development. Time User Surveys (TUS), which aim to identify, quantify and classify people, are also used for profiling occupants with large datasets and likewise the research of Barthelmes et al. [101].

<u>Questionnaires</u> provide a well-known method for gathering data for analysis and are often used in occupant behaviour studies. An important piece of information about in questionnaire research is the response rate. However, this information is often missing from occupant behaviour research. Questionnaires can be augmented by diaries and observation and focus groups. Research on the use of questionnaires in the field of occupancy has been provided by Carpino et al. [102].

To conclude, data is crucial for occupant behaviour research, whether quantitative or qualitative. Advanced methods are used to gather reliable data for the analysis of occupant behaviour. Extensive data sets are required to find trends within this challenging domain. However, no standards or protocols have so far been developed, which makes it difficult to compare data originating from different research projects.

2.6. Building types researched in previous studies

There is a close relation between building type, typical occupants, and occupant behaviour. However, research on occupant behaviour is not evenly split over all building types. Most research focuses on residential buildings, offices, educational buildings, and healthcare facilities [7]. These types represent different fractions of the overall building stock; residences form a major part of the total building stock and thus represent the most common building type [103]. It is worth keeping in mind that everyone is linked to some sort of residential building; a house can be considered as "*a machine to live in*" [104] for twenty-four hours, which entails a constant consumption of energy. Although people may not be present during the full twenty-four hours, many systems of the house will still be consuming energy in their absence. For instance, equipment such as refrigerators will run all day; other systems, such as heating, are likely to remain on during winter at a reduced setpoint to prevent freezing. In some countries cooling and air conditioning may also run during hours of non-occupation in summer. Systems such as home security apparatus, fire alarms and similar appliances also have to be kept on for twenty-four hours a day all year round, which requires a continuous energy supply.

Personal choices have a strong influence on energy use [105], [106], and a house has more options for personalisation than socially shared spaces in other building types [27]. People may adjust themselves and change environmental conditions in their own homes on the basis of their personal preferences in ways that may not be possible in shared spaces. In contrast to other building types, the limited number of people who share a home can often be seen to constitute a homogenous group. However, a variety of personal differences may remain, leading to potential conflict among family members [107]. Residential units have been well studied by researchers who carry out case or field studies. However, an important problem with the research on occupants in residential settings is the issue of privacy [12] and data confidentiality. Sensor-based monitoring within a house might thus be challenging [108]. Moreover, outcomes of a survey may fail to reveal exact realities, due to seasonal effects, mood, boredom, a suspicious attitude towards surveys and concerns related to privacy. These constraints make data on occupants of residences difficult to gather and analyse. Another concern within residences is further classification of the building typologies. A resident can have the use of very different buildings that have widely differing attributes in terms of size, geometry, status, location,

physical appearance, heating systems, energy performance, dwelling type etc. Although these buildings are all classified as residential buildings, major differences can make it very hard to compare outcomes for different residents. However, it is also important to note that most residents pay their own energy bills, which impacts their perception of building energy consumption [109].

The office is another building type that is frequently studied in occupant behaviour research. Compared to residences, offices have more shared spaces, contain more people and involve hierarchical management structures [110]. These occupants typically are a heterogeneous group, consisting of adults with different backgrounds. People generally spend one third of their day in offices [111]. Unlike residences, offices are mostly occupied during daytime and more active systems are used for HVAC. Certain appliances, mostly those related to Information and Communication Technologies (ICT), are standard features of an office. HVAC systems, their setpoints and other operational decisions are often centrally controlled and based on time schedules and automated settings via a building energy management system, especially in large, modern office buildings. Yet data gathering in an office could be easier compared to that in most other building types. Unlike residences, the activity patterns of occupants in offices are relatively steady and relate mostly to working hours. This eases the definition of occupancy patterns, especially where data analysis is done in the context of simulation-based research. Since offices are assigned as working places, there may be benefits for researchers in using this work environment as a living laboratory, without distracting occupants' attention. Easy access to infrastructure for monitoring equipment may be another positive contribution to data gathering [94]. Where offices use building energy management systems, these systems may be accessed to see detailed setpoints and timings. Data can also be reviewed for longer times if the system contains a logging facility. On the other hand, whenever energy systems are more advanced, effects on occupants may arise which require a deeper understanding of occupant behaviour. Furthermore, since there will be different stakeholders using an office, there will be a variety of occupant profiles for comfort and satisfaction levels. Social interaction may impact the interaction with office HVAC control systems, such as thermostats or light switches, and this may cause some occupants to be less satisfied with comfort conditions [112]. According to Chen et al., [113] there are no universally applicable human-building interactions - "one size fits all"-, encompassing differences in culture, gender, etc., that effectively provide both comfort and energy savings in workplaces. However, office occupants may tend to consume less energy where they pay their own energy bills and are owner-occupiers.

A third building type often used in occupant research is educational facilities, such as university buildings and schools. Having groups of the same age and with similar educational backgrounds enables researchers to analyse more homogenous groups. Profiling students and defining patterns may be easier because students are in the same age groups with regular activities related to learning. As with offices, education generally takes place during daytime and weekdays. Since education proceeds in terms and semesters, the energy consumption may have peak values at certain times, but not continuously over the year. Data gathering thus can only be undertaken for a certain period of time and privacy may still be of concern, as occupants may be underage. Different disciplines and corresponding traditions and cultures make it more challenging to evaluate and compare buildings on the same basis. Educational facilities may also have their own policies in terms of maximizing energy conservation, which is seldomly the case for other building typologies. Research by Tucker and Izadpanahi [114] found that sustainable school design plays an important role in shaping children's environmental attitudes and behaviour. Thus, educational buildings might also be evaluated for their active contribution to inspire new generations to conserve energy.

Different occupants may occupy different types of building during the day. A user may be a resident of a house for the evening, a worker in an office in morning and a student at a school in the afternoon. Although these different spaces are occupied by the same user, his/her actions may vary according to the comfort conditions in these spaces in different time intervals **[115]**. This is due to variation in social codes, behavioural patterns, attitudes, lifestyle and different social roles. Each type of occupant behaviour should be analysed in its own specific contexts.

To conclude, offices, residences, and educational buildings are the most common building types that are studied in occupant behaviour research. Defining occupant patterns in offices and schools is easier than in residences because of the regularity of activity. Although residences represent a higher energy consumption in buildings, privacy and accuracy are still major concerns in relation to data gathering.

2.7. The near future and challenges

The National Aeronautics and Space Administration (NASA) has revealed that the decade 2010-2019 was the hottest that it has ever recorded, while the National Oceanic and Atmospheric Administration (NOAA), which has a climate record dating back 140 years, has reported that 2016 was the hottest year, closely followed by 2019 [116]. At the same time, the world's limited non-renewable energy, water and material resources are being consumed by an increasing population with a growing demand for energy. Society will eventually exhaust these resources, and moreover cause further GHG emissions with a substantial amount of waste, thus further exacerbating climate change and global warming. Wang et al., [117], whose research related to statistics from the IEA and the World Bank, reported that energy use and CO₂ emissions per capita rose significantly between the years 1960 and 2010 [118], [119]. Climate change and global warming are at the top of the United Nations'(UN) agenda. Each day, further studies reflect the impact of climate change [120] which may amplify diseases [121], energy and water shortages and energy and fuel shortages [120] around the world. The UN, in an attempt to counter these trends, has introduced 17 urgent sustainable development goals, including affordable and clean energy, sustainable communities and cities, climate action and life on land [122].

The Energy Performance Building Directive (EPBD) recast **[123]** was introduced by the EU in 2010 and drives objectives of Nearly Zero Energy Buildings (NZEB) and cost optimization. Society needs to act immediately and cannot wait until the years 2030 or 2050 to achieve such targets. At a generic level, the EU 2020 has aimed to meet the following targets: (i) 20% cut in GHG emissions (from 1990 levels) (ii) 20% of EU energy generation from renewables (iii) 20% improvement in energy efficiency **[124]**. The outcomes by the end of the year will yield insights into the feasibility of the 2030 targets of (i) a minimum of 40% cuts in GHG emissions (from 1990 levels) (ii) at least a 32% share for renewable energy (iii) a proposed minimum 32.5% improvement in energy efficiency. However the targets for the 2050 goal to curb the global temperature increase to well below 2°C and efforts to keep it to 1.5°C. have already failed, according to the global warming report of the Intergovernmental Panel on Climate Change (IPCC) **[125].**

Economic growth particularly affects energy consumption. According to the EIA, overall energy consumption in the US has almost tripled over the last 70 years [126]. For the reasons mentioned above, energy awareness campaigns are a worthwhile investment [61] in order to improve building energy performance and to bridge the gap between predicted and actual energy consumption in buildings [127].

It should be kept in mind that a "*one size fits all*" approach does not apply to different building types and across varying cultural cases. Occupant awareness and level of knowledge should also be kept in mind. Due to complexity of the physical, physiological, and psychological factors of humans, modelling occupants in simulations remains challenging [**67]**. Topics based on long term behavioural effects, such as adaptive behaviour and evolving occupant profiles and patterns, need long term monitoring or extended survey periods, which is demanding. Structuring datasets remains a challenging topic for researchers, as there are no agreed standards or policies. Issues of sampling size, frequencies and monitoring protocols for measurement equipment and calibration are still subject to contention, which makes it impossible to compare cross-culturally gathered data.

To conclude, due to the complexity of humans, it is not easy to estimate, model or calculate the behaviour of building occupants. Furthermore, the lack of standards and protocols for data gathering with accuracy of data are challenging areas in the field of building occupant research. Global

warming and climate change are existent realities. Buildings are one of the highest consumers of energy, producing waste and GHG emissions and on an urban scale may be listed as one of the hot topics on the political agenda.

3. ONGOING EFFORTS

The previous sections have reviewed the interaction between occupant behaviour and building energy consumption. The following section presents a detailed analysis of publications in seven leading academic journals in the time frame 2018-2019. All articles are published in English and indexed in Scopus, namely Building and Environment, Building Research & Information, Energy and Buildings, Energy Research & Social Science, Energy Policy, Journal of Building Engineering, and Renewable & Sustainable Energy Reviews. This section aims to capture the cutting edge of research in this area, and to direct needs for future work.

The papers are organized on the basis of the topics of the research and their study type. Furthermore, building types are also considered where research methodologies are used. Location of the research is also categorized with country and hemisphere information (Table 1). The table reflects the current status of research related to occupant behaviour, helping the reader to understand the main efforts and revealing topics that may have been underestimated or overlooked. The methodologies of current research are analysed to allow correlation between the method and the research topic.

3.1. Current Status/Topics of Research

 Table 1. Classification of reviewed papers.

Topic of the research	Study Type	Building Type	Methodologies Used	Country	Hemisphere	Reference
Activity Estimation	Research	Residence, School	Monitoring, Simulation, Data Analysis	Denmark	North	[128]
Adaptive Behaviour	Review	Building	Literature Review			[92]
	Research	Residence	Survey, Data Analysis	Denmark	North	[129]
Air Condition	Research	Office	Monitoring, Simulation, Data Analysis	United States of America (USA), China	North	[130]
	Research	Residence	Survey, Monitoring, Simulation, Data Analysis	South Korea	North	[131]
	Research	Residence	Monitoring, Data Analysis	China,	North	[132]
	Research	Residence	Monitoring, Simulation, Data Analysis	China	North	[133]
Behavioural Effects & Interventions	Review	Residence	Literature Review			[134]
	Research	Residence	Data Analysis	UK	North	[135]
	Research	Residence, Office	Survey, Data Analysis	United Arab Emirates	North	[115]
	Research	Residence	Survey, Data Analysis	UK	North	[136]
	Research	Residence	Monitoring, Simulation, Data Analysis	UK	North	[137]
	Research	Office	Survey, Data Analysis	USA	North	[138]
Cooling	Research	Residence	Simulation, Data Analysis	USA	North	[139]
Demand Side Response	Review	Buildings	Literature Review			[140]
	Research	Buildings	Expert Interviews	UK	North	[141]
	Research	Residence	Field Study, Data Analysis	UK	North	[142]
Electricity Consumption	Research	Residence	Survey, Data Analysis	Israel	North	[143]
	Research	Residence	Panel Data, Data Analysis	Singapore	North	[144]
	Research	School	Monitoring, Data Analysis	France	North	[145]
Energy Consumption	Research	School, Day Care	Monitoring, Simulation, Data Analysis	Finland	North	[79]
	Research	Residence	Survey, Data Analysis	France	North	[146]
	Research	Residence	Monitoring, Simulation, Data Analysis	EU	North	[147]
	Review		Literature Review			[148]
Energy Demand	Research	Residence	Survey, Data Analysis	Kuwait,	North	[149]
	Research	Residence	Monitoring, Systematic Comparison, Data Analysis	New Zealand	South	[150]
	Research	Residence	Data Analysis	USA	North	[151]
	Review		Literature Review			[152]
Energy Efficiency (Retrofit)	Research	Residence	Data Analysis	The Netherlands	North	[153]
	Research	Residence	Monitoring, Simulation, Data Analysis	Germany	North	[154]
Energy Performance	Review	Building	Literature Review			[11]
	Research	Residence	Literature Review	The Netherlands	North	[155]

	Research	Office	Survey, Monitoring, Simulation, Data Analysis	Egypt	North	[156]
Energy Performance	Review	Residence	Literature Review, Data Analysis	UK	North	[157]
Certificate /Evaluation	Research	Residence	Survey, Data Analysis	Germany	North	[158]
	Research	Residence	Data Analysis	Japan	North	[159]
	Research	Residence	Monitoring, Data Analysis	Germany	North	[160]
Energy Poverty	Research	Residence	Survey	India	North	[100]
	Research	Residence	Data Analysis	Germany, China	North	[161]
Energy Use	Research	Commercial	Monitoring, Data Analysis	USA	North	[162]
	Research	Residence	Data Analysis	Greece	North	[163]
	Research	Residence	Survey, Data Analysis	Greece	North	[164]
	Research	Office	Monitoring, Data Analysis	USA	North	[165]
Fuel Poverty	Research	Residence	Simulation, Data Analysis	Chile	South	[166]
	Research	Residence	Data Analysis	France	North	[167]
	Research	Residence	Data Analysis	France	North	[168]
	Research	Residence	Simulation, Data Analysis, Sensitivity Analysis	Greece	North	[169]
	Research	Residence	Data Analysis	Scotland, UK	North	[170]
	Research	Residence	Survey, Data Analysis	UK	North	[171]
Heating	Review	Residence	Literature Review	EU	North	[172]
	Review	Residence	Literature Review			[24]
	Research	Residence	Data Analysis, Simulation	Switzerland	North	[173]
	Research	Residence	Survey, Data Analysis	Ireland	North	[174]
	Research	Residence	Survey, Data Analysis	UK	North	[175]
	Research	Residence	Interview, Survey	UK	North	[176]
Indoor Air / Environment Quality	Review	Residence	Literature Review			[177]
	Research	Residence	Monitoring, Data Analysis			[2]
	Research	Residence	Monitoring, Data Analysis	China	North	[178]
	Research	Residence	Survey	UK	North	[179]
	Research	Office	Survey, Interview, Data Analysis	USA	North	[180]
	Research	Residence	Monitoring, Validation	Australia	South	[181]
Lighting	Research	Office	Monitoring, Survey, Data Analysis	USA	North	[182]
0 0	Research	Office	Monitoring, Survey, Data Analysis	Canada	North	[183]
	Research	Office	Monitoring, Survey, Data Analysis	China	North	[184]
	Research	Office	Survey, Data Analysis	USA	North	[185]
	Research	Office	Survey, Data Analysis	USA	North	[186]
	Research	Office	Survey	USA	North	[187]
	Research	Office	Simulation, Data Analysis	Canada	North	[108]
OCCUPANCY	Research	Office	Monitoring, Data Analysis	Italy	North	[188]
Pattern Profiles	Research	Residence	Survey, Data Analysis	Denmark	North	[101]
Sensing	Research	Office	Monitoring, Data Analysis	USA	North	[189]
	Review	Building	Literature Review			[190]

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Detection	Review	Building	Literature Review			[15]
	Research	Residence	Monitoring, Data Analysis	Ireland	North	[191]
	Research	Residence	Monitoring, Data Analysis	Portugal	North	[192]
	Research	Residence	Simulation, Data Analysis	UK	North	[54]
Occupant Comfort	Research	Residence	Survey, Data Analysis	Denmark	North	[193]
-	Research	Office	Survey, Data Analysis	Canada		[194]
Occupant Satisfaction	Research	Office	Survey, Data Analysis	China	North	[195]
	Research	Residence	Survey, Data Analysis	The Netherlands	North	[196]
Performance gap	Review	Building	Literature Review			[30]
	Research	Building	Interview, Data Analysis	Australia	South	[197]
	Research	Residence	Survey, Data Analysis	The Netherlands	North	[28]
Retrofit & Renovation	Research	Residence	Monitoring, Survey, Data Analysis	UK	North	[198]
	Research	Buildings	Monitoring, Simulation, Data Analysis	UEA	North	[199]
	Research	Residence	Simulation, Data Analysis	The Netherlands	North	[200]
	Research	Residence	Survey, Monitoring, Data Analysis	UK	North	[201]
	Research	Residence	Data Analysis	UK	North	[202]
	Research	Residence	Monitoring, Data Analysis	Argentina	South	[82]
	Research	Residence	Simulation, Data Analysis	Italy	North	[203]
	Research	Office	Survey, Data Analysis, Sensitivity Analysis	Middle East	North	[204]
	Research	Residence	Survey, Data Analysis	The Netherlands	North	[205]
	Research	Residence	Survey	EU	North	[206]
	Research	Residence	Data Analysis	USA	North	[207]
Simulations	Review		Literature Review			[208]
(Energy Models)	Review		Literature Review			[26]
	Research	Building	Simulation, Data Analysis			[209]
	Research	Office	Data Analysis	USA		[210]
	Research	Residence	Monitoring, Simulation, Data Analysis	China		[211]
	Research	Office	Simulation, Data Analysis	Hong Kong		[212]
	Research	Office	Monitoring, Simulation, Data Analysis	USA		[213]
	Research	Residence	Mock-up, Monitoring, Simulation, Data Analysis	UK		[214]
Smart Buildings / Houses	Research	Building	Experiment, Monitoring, Data Analysis			[215]
_	Research	Residence	Field Study, Monitoring, Interview	UK	North	[216]
Thermal Comfort	Review		Literature Review			[34]
	Review		Literature Review			[217]
	Research	Office	Survey	USA	North	[218]
	Research	Residence	Monitoring, Survey, Data Analysis	Chile	South	[219]
	Research	Office	Monitoring, Data Analysis	USA	North	[220]
	Research	Office	Monitoring, Data Analysis	Poland	North	[221]
	Research	University Building	Survey, Monitoring, Simulation	South Korea	North	[222]
	Research	Dormitory	Monitoring, Simulation, Data Analysis	China	North	[223]
	Research	Residence	Monitoring, Logbook, Data Analysis	The Netherlands	North	[224]
	Research	Residence	Survey, Simulation, Data analysis	Greece	North	[225]
	Research	Residence	Monitoring, Survey	Japan	North	[226]
	Research	Residence, Office	Monitoring, Simulation, Data Analysis	USA	North	[227]
	Research	Office	Data Analysis, Simulation	USA	North	[228]
	Research	Residence	Monitoring, Survey, Data Analysis	China	North	[229]
	Research	School	Survey, Data Analysis	Australia	South	[230]
	Research	Residence	Interview Survey Data Analysis	Germany	North	[231]
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	Research	Office	Survey, Monitoring	Brazil	South	[232]
	Research	Nursing	Monitoring, Survey, Data Analysis	Australia	South	[233]
	Research	Office	Survey, Monitoring	China	North	[234]
	Research	Office, Hospital	Survey, Monitoring	The Netherlands	North	[235]
	Research	Office	Data Analysis	USA	North	[236]
Uncertainty Analysis	Review		Literature Review			[237]
	Research	Office	Simulation, Data Analysis	France	North	[238]
Ventilation	Research	Residence	Monitoring, Simulation, Data Analysis	Portugal	North	[239]
	Research	Office	Monitoring	South Korea	North	[240]
	Research	Residence	Monitoring, Data Analysis	The Netherlands	North	[241]
	Research	Residence	Monitoring, Survey, Data Analysis	China	North	[242]
	Research	School	Survey	India	North	[243]
	Research	School	Monitoring, Simulation, Data Analysis	USA, India	North	[244]
Window	Research	Office	Monitoring, Simulation, Data Analysis	Austria	North	[245]
	Research	Office	Monitoring Survey, Data Analysis	China	North	[246]
	Research	Office	Monitoring, Data Analysis	China	North	[247]
	Research	School	Monitoring, Survey, Data Analysis	Hungary	North	[248]
	Research	House	Monitoring, Data Analysis	China		[249]
	Research	Office	Monitoring, Simulation, Data Analysis	Germany	North	[250]
	Research	House	Simulation, Data Analysis	Germany	North	[251]
	Research	Office	Survey, Simulation, Data Analysis	China	North	[252]
	Research	Office	Survey, Monitoring, Data Analysis	UK	North	[253]

The research presented in the selected papers is mostly focused on technical aspects rather than socioeconomic issues. In the papers from 2018 and 2019, most of the work studies residential buildings, with some addressing offices. Energy is the dominant research topic in the domain, followed by thermal comfort. Other recurring subjects are window operation, retrofit & renovation, lighting, fuel poverty, and energy models (simulation). Some other research topics not listed above but present in the dataset are vulnerability [120], technical performance of buildings with occupants [53], the rebound effect [254], energy management [255], occupant drivers [256], user experience in low energy homes [257], NZEB [258], the energy performance gap [30], and energy metrics [82]. Effects of the impact of childhood and early adulthood on energy consumption [259], and analysing gender dynamics in slum rehabilitation housing [260] may be noted among rarely seen research topics in the field. Apart from the research papers, some of the review paper topics other than those listed above are occupancy detection [190], domestic hot water consumption [25], the human dimension in energy use [13], life cycle assessment [78], low carbon energy measures [261], and research techniques [22]. Research mostly centres on singular buildings or a small group of buildings in an urban context. There is a limited number of papers related to research about rural areas [262], districts [263], and the urban scale [152].

Most of the papers use data gathering techniques, such as monitoring and surveys. Large datasets are reported by van den Brom et al. [205], Levy and Belaid [53], Acharya and Sadath [100], and Damari and Kissinger [143]. However, no evidence has been found on the standardization of data gathering, protocols and sampling, which makes it hard to conduct comparative analysis across these projects.

3.2. Locations of Research

The papers studied report on findings from 158 different locations in 36 different countries. 147 of the locations are in the northern hemisphere, while only 11 are in the southern hemisphere. Since 88% of the global population lives in the northern hemisphere, this strong focus of research on the northern hemisphere is logical (Figure 3). The work mostly stems from research in the USA, UK, China, the Netherlands, France, and Germany. Note that these are all developed and strongly industrialised countries where the average income is higher than the global average. While energy is a major challenge for developing countries, there seems to be little work that explores how occupant behaviour research might contribute to an understanding of the energy needs and problems of those countries.



Figure 3. Locations of the research based on reviewed papers.

3.3. Classification of research and keywords used

A deeper review of the keywords listed in the papers shows that 47% of them relate to technical issues, 28% to socio cultural aspects, 13% to construction issues and 12% deal with financial issues. Not surprisingly, the most widely used keyword is occupant behaviour, followed by thermal comfort, energy efficiency, building energy, residential building, and office building (Figure 4). Energy performance, machine learning and energy consumption may be listed as the closest followers. Energy, thermal, building and occupant are the most referred main terms. A total number of 1009 keywords was used for the papers. Lifestyle, demographics, low income and NZEB are amongst the rarely used keywords.



Figure 4. Distribution of keywords used 4 times or more in reviewed papers

4. DISCUSSION OF RESEARCH IN PAPERS REVIEWED

This paper explores the state of the art of research on the interaction between occupant behaviour and energy efficiency in buildings. The investigation focuses on papers from two years, 2018 and 2019, published in seven internationally indexed (SSCI, SCI, SCI-E) journals. This focus is important when assessing the outcomes.

Several papers on occupant behaviour have contributed in-depth reviews of the technical, constructional, financial and socio-economic effects of occupant behaviour on energy consumption in buildings. Most research is focused on technical aspects, such as adjusting windows, doors, blinds/sunshades, lighting adjustments, and the control of HVAC systems (both manually and automated), rather than on socio-economic issues. The mostly commonly researched building types are residences and offices, followed by educational facilities.

Quantitative and qualitative data is the basis of all research reported in the literature. Several methodologies have been used, with interviews, observation, case studies, surveys, monitoring and simulation tools frequently appearing to compute details and to explore 'what-if' scenarios for further analysis. Lack of a standard for data gathering and lack of protocols for data analysis make it difficult to compare outcomes. Modelling the energy consumption of occupants is another challenge in the field. For the most part, occupant attitudes and preferences have a significant impact on the use of energy resources [7]. It can be noticed that a general trend in research related to technical issues is centred around analysis of the operational habits of occupants. Occupant behaviour research usually requires a combination of social science and physical science [22]. The full complexity of human

activity cannot easily be represented by patterns or profiles. One challenge is that humans are not always rational decision makers and that they do not always have fixed attitudes. Furthermore, occupants may change behavioural patterns during the daytime. At other times, a building user may behave differently and may not adapt comfort conditions in some spaces on the basis of external issues, such as social codes. Contrary to behavioural models, which mostly focus on a single action or activity generated by one or more environmental variables, recent studies are supporting approaches which consider complicated behaviour, different lifestyles and the interaction between users [14]. Cole et al. [264] have commented that performance gaps stem less from the design and technology that is applied to buildings than from the disparity between assumed and actual occupant behaviour and the operation of controls and management. It can be observed that most building energy consumption models provide only short-term analyses and neglect to represent long-term profiles and predictions [148].

It may be a good time to change the perspective not only of the content -research topics and methodologies used for occupant behaviour- but also of the context. Total energy consumption of the built environment cannot be reported via analysis of singular buildings. Occupant behaviour within the building should be tracked, together with interactions with the neighbourhood, district, regions and cities. Fraysinnet et al. [152] claim that topics such as energy price, income, population density, urban morphology etc. are being ignored whenever a single building or a small group of buildings is analysed. Strategies to manage energy related to occupant behaviour should be developed within communities, while the differences between energy efficiency, energy conservation and energy consumption need to be borne in mind. Analyses of underdeveloped societies should also be undertaken; in such societies energy and fuel poverty may be the fundamental limitations. Humphries [265] points out that it is not possible to define a multifactor index of the indoor environment that would perfectly fit different cultures and countries of the world. Underdeveloped and developing countries need more research dedicated to the improvement of their capacity for energy conservation. Standardization of data gathering should be improved in order to make it possible to use data worldwide and to make it possible to comparatively analyse similar research topics in different locations, and to make big data available. Such standardization attempts, along with protocols, will form a basis for developing new parameters and measures where current ones fall short. Studies with an interdisciplinary approach are essential, since human activities can best be analysed through a wider collaboration of disciplines. Occupants with their differing social contexts and, specific social and psychological variables should be taken into account in the assessment of human-building interaction. A wide range of these variables should be considered, in terms of target behaviours (curtailment vs. efficient behaviours), demographics (e.g., income level), and building type (commercial vs. residential) [4].

Hong et al. **[98]** point out that optimal decisions and an overall improvement in human behaviour should be considered along with new technologies for energy efficiency in buildings. Statistical analysis of large samples of surveys while monitoring only single buildings or limited groups of people may not provide holistic approaches with worldwide applicability. Researchers should focus on immersive methodologies to understand occupants better and to cope with the performance gap.

5. CONCLUSION

Current research suggests that the effects of occupant behaviour on energy efficiency and conservation in buildings are mostly underestimated, oversimplified, misunderstood, or disregarded. However, typical data gathering efforts in the field face challenges regarding sample size and selection, and issues pertaining to the analysis methodologies implemented. A lack of standardised data gathering approaches is of concern.

An in-depth review has highlighted the following challenges:

- 1) Studies of occupant behaviour are typically limited to single buildings or to a small group of buildings over short time intervals. There is limited research on occupants residing in interacting buildings. Occupant behaviour is still considered at the individual building-scale.
- 2) Data gathering about occupant behaviour does not follow well-established protocols or standards. Consequently, it is hard to compare data gathered in different research projects that have been conducted in different geographical locations. Therefore, it is hard to investigate and define cross-cultural and societal differences.
- 3) Research on occupant behaviour is heavily based on quantitative research located in the northern hemisphere and from developed countries with higher per capita income. Consequently, the effects of financial issues, such as fuel poverty and other socio-cultural factors, are generally disregarded or overlooked. Moreover, due to this geographical focus, occupant behaviour studies prioritise heating over cooling of buildings.
- 4) Most research does not employ holistic approaches. Typical research is focused on specific technical topics in a singular area of interest, such as window adjustment, lighting systems, heating systems or set point control. More attention should be paid to interdisciplinary research.
- 5) Specific areas, such as defining the backgrounds of comfort conditions and analysing lifestyles of occupants, may be listed as the less popular research topics concerning building occupant behaviour. Yet habits and attitudes differ across cultures, regions, climate, geography and local topography. Research therefore should pay more attention to lifestyles in order to understand profiles and patterns of occupants. Further human attributes should be explored within the context defined for occupancy, especially for the quantification of socio- cultural habits such as attitudes and lifestyles. New or composite metrics need to be developed to define such occupant traits.

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