Review of multi-domain approaches to indoor environmental perception and behaviour

- 3 Marcel Schweiker¹⁾, Eleni Ampatzi²⁾, Maedot S. Andargie³⁾, Rune Korsholm Andersen⁴⁾, Elie
- 4 Azar⁵⁾, Verena M. Barthelmes⁶⁾, Christiane Berger⁷⁾, Leonidas Bourikas⁸⁾, Salvatore
- 5 Carlucci^{9), 10)}, Giorgia Chinazzo¹¹⁾, Lakshmi Prabha Edappilly^{12), 1)}, Matteo Favero¹⁰⁾,
- 6 Stephanie Gauthier¹³⁾, Anja Jamrozik¹⁴⁾, Michael Kane¹⁵⁾, Ardeshir Mahdavi⁷⁾, Cristina
- 7 Piselli¹⁶, Anna Laura Pisello¹⁶, Astrid Roetzel¹⁷, Adam Rysanek¹⁸, Kunind Sharma¹⁵,
- 8 Shengbo Zhang¹⁹⁾
- 9 1) Building Science Group, Karlsruhe Institute of Technology, Karlsruhe, Germany;
- 10 2) Welsh School of Architecture, Cardiff University, Cardiff, UK;
- 11 3) Department of Civil and Mineral Engineering, University of Toronto, Toronto, Canada;
- 4) International Centre for Indoor Environment and Energy, Technical University of Denmark, Kgs. Lyngby,
- 13 Denmark;
- 14 5) Department of Industrial and Systems Engineering, Khalifa University, Abu Dhabi, UAE;
- 15 6) Thermal Engineering for the Built Environment Laboratory, École polytechnique fédérale de Lausanne, Lausanne,
- 16 Switzerland;
- 17 7) Department of Building Physics and Building Ecology, TU Wien, Vienna, Austria;
- 8) Lancaster Institute for the Contemporary Arts, Lancaster University, UK;
- 19 9) Energy, Environment, and Water Research Center, The Cyprus Institute, Nicosia, Cyprus;
- 20 10) Department of Civil and Environmental Engineering, Norwegian University of Science and Technology,
- 21 Trondheim, Norway;
- 22 11) Department of Civil and Environmental Engineering, Northwestern University, Evanston, USA;
- 23 12) Department of Civil Engineering, Building Technology and Construction Management, Indian Institute of
- Technology Madras, India;
- 25 13) Faculty of Engineering & Physical Sciences, University of Southampton, Southampton, UK;
- 26 14) Breather Products Inc., Montreal, Canada;
- 27 15) Department of Civil and Environmental Engineering, Northeastern University, Boston, MA, USA;
- 28 16) Department of Engineering, University of Perugia, Perugia, Italy;
- 29 17) School of Architecture and Built Environment, Deakin University, Geelong, Australia;
- 30 18) School of Architecture and Landscape Architecture, the University of British Columbia, Vancouver, BC, Canada;
- 31 19) Department of Mechanical and Industrial Engineering, University of Toronto, Toronto, ON, Canada
- 32 Abstract
- 33 Building occupants are continuously exposed to multiple indoor environmental stimuli,
- including thermal, visual, acoustic, and air quality related factors. Moreover, personal and
- 35 contextual aspects can be regarded as additional domains influencing occupants'
- 36 perception and behaviour. The scientific literature in this area typically deals with these
- 37 multiple stimuli in isolation. In contrast to single-domain research, multi-domain research
- analyses at least two different domains, for example, visual and thermal. The relatively few
- 39 literature reviews that have considered multi-domain approaches to indoor-environmental
- 40 perception and behaviour covered only a few dozen articles each. The present contribution
- 41 addresses this paucity by reviewing 219 scientific papers on interactions and cross-domain
- 42 effects that influence occupants' indoor environmental perception and behaviour. The
- objective of the present review is to highlight motivational backgrounds, key
- 44 methodologies, and major findings of multi-domain investigations of human perception and
- behaviour in indoor environments. The in-depth review of these papers provides not only

- an overview of the state of the art, but also contributes to the identification of existing
- 2 knowledge gaps in this area and the corresponding need for future research. In particular,
- 3 many studies use "convenience" variables and samples, there is often a lack of theoretical
- 4 foundation to studies, and there is little research linking perception to action.

Key words

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- 6 Human perception; comfort; occupant behaviour; multi-physical; multi-perceptual;
- 7 contextual; personal; multi-domain

1. Introduction

1.1. Background and state-of-the-art

- 10 Inhabitants of industrialized areas spend most of their time (85-96%) inside buildings [1;
- 2]. Meanwhile, the human sensory system receives information regarding multiple indoor
- 12 environmental exposures. Building energy consumption is significantly influenced by
- occupant perception and behaviour; that is, occupants' evaluation of thermal, visual,
- acoustic, and air quality stimuli and their reactions to any resulting discomfort [3]. As such,
- these four principal categories of environmental stimuli are integral to building design
- standards [4]. Not all interactions of occupants with their built environment result from
- dissatisfaction, but a close link between perception and behaviour exists [5].
- While environmental stimuli occur simultaneously, the majority of scientific literature
- considers environmental influences on human perception and occupant behaviour in
- isolation. Literature reviews related to single-domain perceptions cover thermal [6-8],
- visual [9-12], indoor air quality (IAQ) [13], or acoustic [14-16] perception, as well as single-
- domain influences on occupants' actions [5; 17-19]. An understanding of multi-domain
- 23 environmental effects is lacking. ASHRAE [4] states "current knowledge on interactions"
- between and among factors that most affect occupants of indoor environments is limited".
- Addressing this knowledge gap, Torresin et al. [20] proposed a multi-domain research
- 26 framework that identifies interactions and crossed effects between domains. Interactions
- are combined effects of two or more distinct domains (e.g., thermal and visual), on a third
- domain (e.g., overall environmental satisfaction). In contrast, crossed effects involve a main
- effect of one domain (e.g., thermal stimuli) on another domain (e.g., visual perception).
- 30 Literature reviews on multi-domain approaches are less numerous. Recently, Torresin et
- al. [20] identified 45 laboratory studies published after 1990 dealing with the effects of two
- 32 or more environmental domains on perception and performance. Earlier reviews were
- based on smaller numbers of studies [21-23]. Frontczak et al. [23] reviewed nine studies
- focusing on the influence of individual domains on overall satisfaction. Candas et al. [21]
- discussed neurophysiological and behavioural findings on multisensory influences on
- 36 thermal perception based on 25 publications. Centnerová et al. [22] reviewed eight papers
- 37 with the same topic. The authors of this review could not identify earlier reviews
- addressing multi-domain approaches related to occupant behaviour.

In addition to the four principal indoor environmental domains, contextual and personal variables influence occupants' perception and behaviour and are summarized in Figure 1 and 2. Schweiker et al. [5] reviewed drivers of occupant behaviour, including contextual and personal factors. However, they did not examine interactions between these factors. Frontczak et al. [23] reviewed personal and contextual influences on overall satisfaction with the indoor environment. Schweiker et al. [8] included personal (psychological) and contextual factors in their review on individual differences in thermal perception. O'Brien et al. [24] concluded that most approaches analysed aggregated average models and diversity is captured through statistical approaches, without extracting personal or contextual factors.

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geographic location _ climate region season sun path cultural background, country (energy) policies building design building envelope efficiency (U-value) facade design orientation window size and height facade obstractions (shading / acoustics) safety issues spatial characteristics office type / floor layout prospect and refuge floor level distance of task plane from window location of workplace within floor plan interior design furniture materiality indoor visual aspects acoustic environment system design building conditioning system type operation mode / state of controls controls availability accessibility convenience task related equipment activity / task occupant density socio-demographics time of day weekday

 $Fig.\ 1.\ Contextual\ variables\ and\ their\ categorization.$

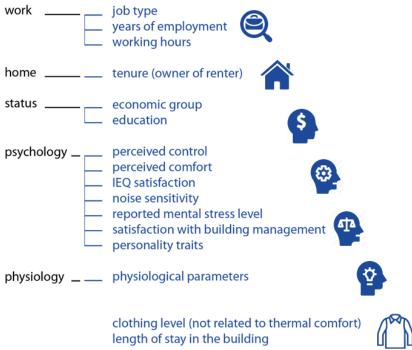


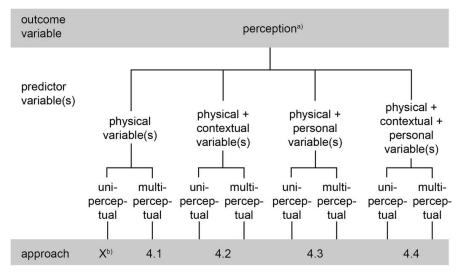
Fig. 2. Personal variables and their categorization.

- 3 This brief overview reveals a lack of reviews that considered multi-domain influences on
- 4 occupants' perception and behaviour. The current review aims to fill this gap as described
- 5 in the following.

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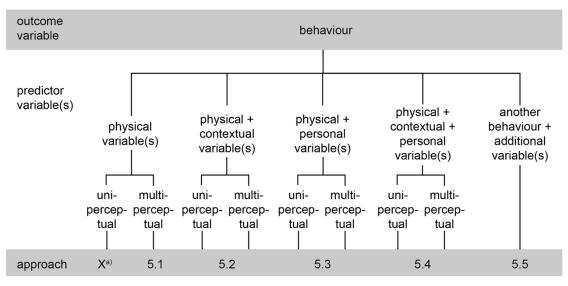
1.2 Objective, research questions, and scope

- 7 The primary objective is to examine multi-domain approaches with a much broader scope
- 8 compared to previous reviews in order to enter into a new phase of conceptual
- 9 developments in the field. This review aimed to identify motivations, key methods, findings,
- and gaps in the field of multi-domain approaches to human perception and behaviour in
- 11 indoor environments.
- 12 The main research questions were (1) Why did researchers choose the domains and
- 13 questions they considered?, (2) How did they approach multi-domain investigations?, (3)
- What were the key results?, and (4) What are limitations and gaps of their approaches?
- 15 The scope of this review covers studies applying a *multi-domain* approach to people's
- 16 perception of the indoor environment and their resulting behavioural outcomes. The first
- categorization level made is between "perception" and "behaviour", as shown in Figures 3
- and 4, respectively. Studies without any physical predictors or with performance or health-
- 19 related outcomes are beyond the scope.



a) overall perception and/or domain specific perception

Fig. 3. Schema of multi-variable approaches with perception as the outcome variable.



a) not considered as multi-variable approach and not included in this review

Fig. 4. Schema of multi-variable approaches with behaviour as outcome variable. Note that the approach numbers at the bottom of this figure refer to the corresponding subsection numbers within this review.

Physical-perceptual independent variables cover measurable physical properties of the indoor and outdoor environment, e.g. indoor and outdoor air temperature for the thermal environment. All the physical properties of the thermal, visual, acoustic, and air quality environment are considered. *Physical multi-perceptual* approaches are defined as those

b) not considered as multi-variable approach and not included in this review

- 1 covering variables from more than one domain of perception (e.g., thermal and visual
- 2 perception). Studies dealing with multiple variables covering one domain only (e.g., solely
- 3 air temperature and relative humidity, which are both from the thermal domain, on thermal
- 4 perception) are not considered unless they included either contextual or personal variables.
- 5 All contextual and personal variables shown in Figure 1 and 2 are considered, except
- 6 personal variables related to demographic factors (e.g. age, sex), or clothing if dealing with
- 7 thermal perception.
- 8 Other behaviour and additional variables are included to cover studies that consider the
- 9 status of one behaviour in the analysis of another behaviour. For example, window opening
- behaviour as dependent and the status of the heating system as independent variable.
- 11 This review covers laboratory studies, field studies, and questionnaire surveys. Studies
- related to perception or behaviour within the outdoor environment, virtual reality studies,
- or research based on simulations are out of scope. As such, this review provides a
- 14 comprehensive overview of multi-domain approaches to understanding human perception
- and occupant behaviour indoors.

2. Methods

- 17 This review's approach is visualized in Figure 5. The visualization is based on the "Preferred
- Reporting Items for Systematic Reviews and Meta-Analyses" (PRISMA) schema [25].
- 19 However, in contrast to a systematic review, first, we collected and reviewed known
- 20 research, which returned 153 articles. This initial step included searches in author's
- 21 individual reference databases as well as in bibliographic search engines (Table 1). Second,
- 22 the more than 1,000 articles citing these 153 articles or being cited by this initial collection
- 23 were assessed. Together with their evaluation, we categorize our work as critical review
- 24 [26].

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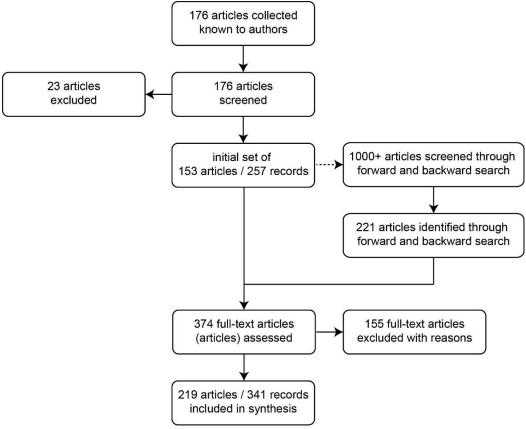


Fig. 5. Schema of the review process.

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Table 1. Literature searches performed during the first phase of this review.

Database/search engine	Search terms (combinations of)						
Web of Science	"thermal", "visual", "acoustic", "comfort", "satisfaction", "perception", "behaviour"						
Scopus	"thermal", "visual", "acoustic", "personal", "contextual", "multi-domain", "comfort"						
Science Direct	"occupant behaviour", "multi-domain", "model", "combined effects"						
Google Scholar	"thermal", "visual", "acoustic", "comfort", "satisfaction", "perception", "behaviour"						
Google Scholar	"indoor factors", "interaction", "combination"						
Google Scholar	"Occupant", "thermal", "comfort", "satisfaction", "visual", "behaviour"						
Google scholar	"occupant behaviour", "multi-domain", "model", "combined effects"						
Deakin University library (linked to several databases)	"thermal comfort", "visual comfort", "acoustics"						

2.1 Selection process

- 6 The units of analysis were the articles and their records. A record is defined as a dependent
- 7 variable analysed within an article. As such, one article presenting analysis for two or more
- 8 dependent variables (e.g. analyses of thermal and visual perception as dependent variable)
- 9 has an equivalent number of records.
- 10 The exclusion criteria were: (1) out of scope; (2) other than English language; (3) full text
- unavailable, and (4) not peer-reviewed. In addition, (5) duplicates such as conference and

- 1 journal articles presenting the same research were considered once; and (6) review papers
- 2 without additional analyses such as meta-analysis were not considered.

3 **2.2 Records' structure**

- 4 The following data were extracted: dependent and independent variables; number (N) of
- 5 participants, offices, and/or buildings; sex and age distributions; number of votes obtained
- 6 or length of study; type of study (e.g. field or laboratory); type of building (e.g. residential or
- office); type of conditioning (e.g. naturally-ventilated (NV) or air-conditioned (AC)); region
- 8 in which the study was conducted; data collected; statistical approach applied, and key
- 9 findings.
- 10 In addition, introduction and discussion sections were scanned for the study's motivation
- and gaps/future research needs mentioned.

12 3. Comparison between perceptual and behavioural multi-domain

13 approaches

- Multi-domain approaches with perception as a dependent variable (244 records/163)
- articles) are three times more frequent than behavioural multi-domain studies (97
- records/64 articles). Note that eight articles report results from perceptual and behavioural
- dependent variables (see the complete review
- 18 table: https://osf.io/gnvp2/?view only=00b08233881f471795d1d8dee79e9828). The
- most frequent approach in perceptual and behavioural studies was a combination of one or
- 20 more physical factors with contextual variables (Figure 6).

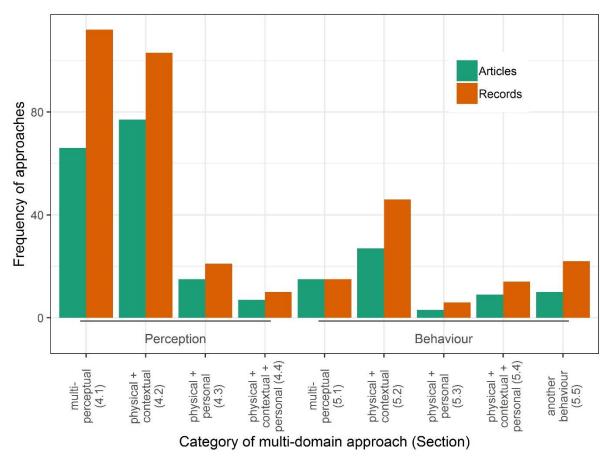


Fig. 6. Frequency of studies reviewed per approach.

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In both research areas, perception and behaviour, field studies are the most frequent methods used (Figure 7). Laboratory studies only dominate in studies, which examined multi-perceptual effects without contextual or personal variables.

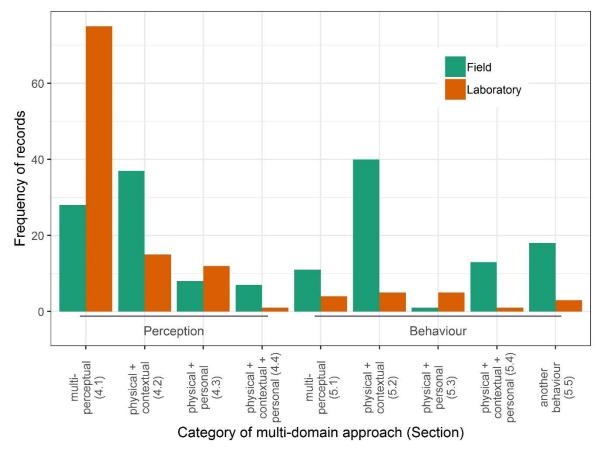


Fig. 7. Frequency of records separated by type of study.

The sample size varies according to the type of sample analysed, i.e. whether authors reported buildings, rooms, or participants (Table 2). The number of participants in laboratory studies ranged from 5 to 199 with nearly half of the studies with less than 30 (mean 45.6, SD 42.2, median 30). In field studies, the largest number of participants (N= 52,980 and N = 29,632) were observed in two studies combining physical and contextual variables (subsection 4.2) using existing databases of online surveys [27; 28] (mean of all field studies 824.1, SD 3178, median 138). Sample sizes below 10 participants were observed in several subsections. Arguments were for example an integral research approach triangulating between four qualitative and quantitative methods [29] or in-depth insights by gathering detailed information through interviews and discussions [30]. The number of buildings varies from 1 [31] to 351 [27].

Table 2. Number of participants, offices, or buildings by category. N = number of records, Min = minimum, SD = standard deviation, Med = median, Max = maximum.

Section	Participants					Rooms/offices						Bu	Buildings/households					
	N I	Min	Mean	SD	Med	Max	N	Mir	ıMean	SD	Med	lMax	N l	Mir	ıMeaı	ı SD	Med	lMax
4 Perception																		
4.1 Physical multi-perceptual	109	6	99.3	186.6	35	990	0						3	1	2	1	2	3
4.2 Physical + contextual	82	7	1525.9	6674.6	168	52980	10	1	6.3	5.3	4	18	34	2	38.6	84.2	14.5	351
4.3 Physical + personal	16	20	557.9	1852.4	93	7500	8	6	56.5	51.9	46	120	6	2	4.3	3.8	2	11
4.4 Phys. + cont. + pers.	9	35	295.4	206.3	400	482	0						1	8	8		8	8

5 Behaviour																		
5.1 Physical multi-perceptual	9	5	42.2	44.8	20	128	4	1	3.5	3.1	2.5	8	4	9	17.8	6.1	19.5	23
5.2 Physical + contextual	11	17	504.9	891.3	36	2787	18	3	83.6	159.2	14	555	20	1	30.5	28.9	16.5	70
5.3 Physical + personal	4	65	65	0	65	65	2	6	63	80.6	63	120	1	2	2		2	2
5.4 Physical + cont. + pers.	6	32	1091.8	905.3	933	2787	2	4	4.5	0.7	4.5	5	4	13	35	14.7	42	43
5.5 Physical + multi-behavioural	11	8	18.5	9.3	21	40	6	3	8.5	3.6	8	14	4	1	1	0	1	1

- 1 The geographic distribution is presented in Table 3. Studies were predominantly conducted
- 2 in Central Europe, North America, and Eastern Asia.

3 Table 3. Geographic distribution of records

Section	Africa	Asia	Europe	North-America	Oceania	South-America
4 Perception						
4.1 Physical multi-perceptual	1	44	38	9	0	0
4.2 Physical + contextual variables	0	22	34	28	2	1
4.3 Physical + personal variables	0	3	10	6	0	0
4.4 Physical + contextual + personal variables	0	2	2	0	1	0
5 Behaviour						
5.1 Physical multi-perceptual	0	8	1	2	0	0
5.2 Physical + contextual	0	3	13	3	0	0
5.3 Physical + personal	0	0	5	1	0	0
5.4 Physical + contextual + personal	0	3	2	0	2	0
5.5 Physical + multi-behavioural	0	0	16	2	1	0

4. Perceptual studies

- 5 This section is divided into four subsections: physical; physical and contextual; physical and
- 6 personal; and physical, personal, and contextual. In each subsection, we reflect on the
- 7 motivational background, the methods employed for data collection and analysis, and some
- 8 of the key findings. We conclude each subsection with thoughts on the current state of the
- 9 art, prevailing knowledge gaps, and future research needs.
- 10 Figure 8 summarises the findings on crossed main effects on thermal, visual, IAQ, and
- acoustic perception referred to in the following.

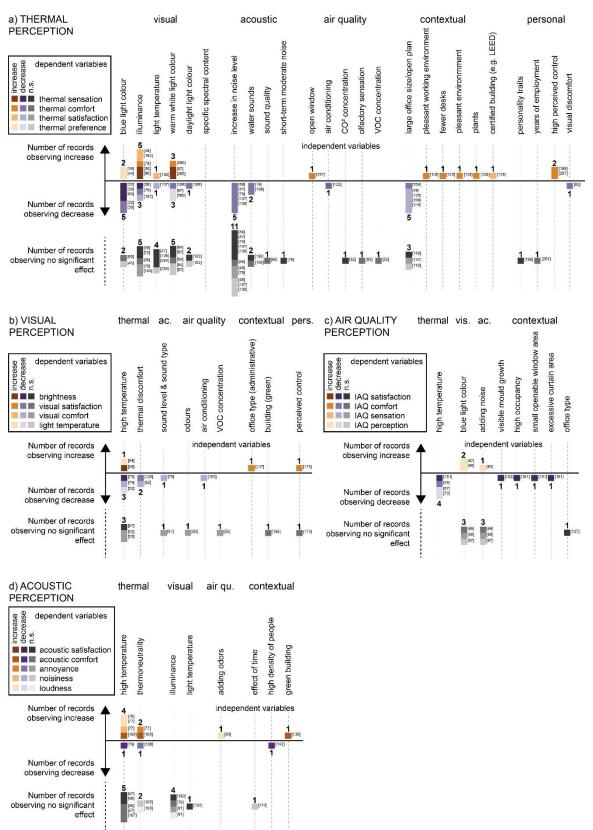


Fig. 8. Overview of crossed main effects related to thermal, visual, air quality and acoustic perception based on studies including significance tests.

1 4.1. Physical multi-perceptual approaches

- 2 A considerable number of studies addressed the effects of multiple environmental factors
- 3 on occupant perception. While not all these studies specifically address the combined
- 4 effects of multiple indoor environmental variables, most acknowledge at least their
- 5 concurrent presence [32-109]. In the following, we focus on a number of these papers and
- 6 their contributions, directly relevant to the topic of multi-domain exposures.

4.1.1 Motivational background

- 8 The majority of the studies cite the need for better understanding of exposure situations
- 9 involving multiple indoor environmental variables. Other studies observed effects of
- multiple environmental variables without a specific intent to examine their
- interactions [53; 62]. Studies considered different combinations of environmental variables,
- most frequently thermal and visual [34; 37-39; 52; 67; 102-104]. A few studies investigated
- other combinations of variables, such as visual and acoustic [45], thermal and acoustic [56;
- 14 57; 66], visual and IAQ [59], acoustic and IAQ [83], visual, thermal, and acoustic [48; 49; 62;
- 15 70], as well as IAQ, thermal, and acoustic [35; 41]. Researchers were mostly interested in
- 16 the effect on dependent variables such as occupants' comfort, sensation, and
- 17 preference [34; 39; 48; 52; 66; 102-104]; and satisfaction [59; 68].

4.1.2 Approaches

- 19 The majority of papers involved short-term laboratory studies in office settings. Only in a
- 20 few studies, participants were given the opportunity to adjust certain factors of their
- 21 immediate surroundings [45; 59] or exercise a choice upon experiencing different
- 22 settings [40].

- 23 Experimental settings typically involved different properties of the physical environments
- such as air temperature (thermal environment), sound type and level (acoustic
- environment), illumination level, glare intensity, light colour (visual environment), and
- 26 airflow rates (thermal and air quality environment). Laboratory studies typically lasted a
- 27 few hours or up to a day. Typically, experiments tested one or more levels of a physical
- variable crossed with one or more levels of another physical variable (e.g., three levels of
- temperature crossed with two levels of illumination, as in Kulve et al. [104]), while holding
- 30 other indoor environmental variables constant.
- 31 The majority of experiments had within-subject designs, that is, all participants experienced
- 32 all experimental conditions, typically counterbalanced by randomising the order of
- 33 conditions. Within-subject experiments are more sensitive to the manipulation of
- independent variables, which is important for studies with smaller sample sizes.
- 35 The occupancy-related implications of environmental factors were queried using
- techniques such as surveys and questionnaires (e.g., [48]), comfort and sensation scales
- 37 (e.g., [66]), and visual observations (e.g., [70]).
- 38 As expected, data analysis involve various well-established formats and techniques from
- 39 descriptive and inferential statistics. The collection of statistical methods commonly
- 40 referred to as ANOVA (Analysis of Variance) is frequently deployed for processing and

- 1 interpretation of measurement results [40; 45; 52; 66; 68; 70], as are mixed-effects
- 2 models [37; 39; 49; 67; 104].
- 3 In the majority of the less frequent field studies, the setting was a university classroom and
- 4 participants were students. However, field studies were also conducted in office, hospital
- 5 (e.g., [34]), and residential settings [50]. Field studies typically lasted several months.
- 6 Environmental physical conditions were monitored and participants were asked to rate
- 7 their perceptions through questionnaires on comfort, sensation and satisfaction (e.g., [53;
- 8 105]). Measurements of environmental conditions were associated with participants'
- 9 subjective ratings, and the subjective ratings with each other, using measures such as
- 10 correlation [105] or ANOVA [106]. Field studies enabled the variation of environmental
- conditions for large samples of subjects (e.g., 331 students in 7 varied classrooms [105]).

4.1.3 Findings

- 13 Studies described in the reviewed papers entail a host of valuable findings (Figure 8). Tiller
- et al. [66] reported a slight effect of acoustical conditions on subjective ratings of thermal
- 15 comfort, but no reverse effect. Nagano and Horikoshi [56] concluded that operative
- temperature has a slight effect on auditory comfort sensation votes and thus that the
- 17 thermal environment must be taken into consideration in acoustical studies. On the other
- hand, they did not observe any effect of noise on reported thermal sensation. On the
- contrary, Pellerin et al. [107] indicated a noise effect on thermal comfort in warm
- 20 conditions, but not of temperature on acoustic sensation, comfort, and preference. Yang et
- al. [108; 109] reported that thermal comfort decreased with increased noise level, and with
- the noise of a fan as compared to that of babble, and that water sounds increased cold
- 23 sensation and decreased thermal comfort. The authors also observed the influence of the
- thermal environment on acoustic comfort and sensation, but with contrasting findings, as
- 25 they report a decrease of annoyance and an increase of acoustic comfort at
- thermoneutrality [108] as well as an increase in acoustic perception and annoyance at
- thermoneutrality [77; 109].
- Nakamura et al. [58] reported that higher colour temperature is preferred in summer and
- vice versa in winter. Fanger et al. [45] observed slight lighting effects on thermal comfort:
- 30 people preferred a slightly lower temperature under red light than under blue light. Similar
- results were reported by Albers et al. [32] and by Winzen et al. [69], with electric light
- 32 colour affecting thermal sensation, comfort and temperature estimation. Chinazzo et al. [39]
- 33 suggested that participants' thermal sensation reports were influenced by the colour of the
- daylight. For instance, as compared to orange daylight exposure, a colder thermal sensation
- 35 was reported in the case of blue daylight, even though the measured temperature remained
- 36 the same. Daylight quantity was also reported to affect thermal perception, with increased
- 37 thermal comfort under dim daylight conditions in a warm environment and under bright
- the mare comfort under unit daylight conditions in a warm environment and under bright
- daylight conditions in a cold environment [103]. However, the authors indicate no effect of
- 39 daylight illuminance levels on thermal sensation [103], similarly to what was reported by
- an earlier study with electric lighting [75]. Meanwhile, Azmoon et al. [34] observed
- 41 improved thermal comfort responses because of increased light intensity.

- 1 Unexpected effects were sometimes found on variables that were not the focus of the
- 2 experimental study. For example, people reported IAO differences across temperature
- 3 settings [67], or across combinations of acoustic, lighting, and temperature settings [49]. In
- 4 some cases, papers noted significant effects only under restricted conditions. For example,
- 5 Geng et al. [47] observed that people were less satisfied with IAQ and lighting under certain
- 6 temperature settings, but not others. In some cases, papers noted statistically non-
- 7 significant interactions between environmental conditions. For example, Pan et al. [83]
- 8 observed that adding noise to odour mitigated the effect of odour on air-quality-related
- 9 measures. However, with a sample sizes of N = 9, small interaction effects are unlikely
- 10 detected.

- 11 Many studies observed no interactions between environmental factors tested (e.g., [37;
- 12 38]), or were not designed in a way to investigate these interactions (field studies).

4.1.4 Identified gaps and future directions

- 14 The review of multi-physical perceptual research shows the extent of valuable knowledge
- generated over the past five decades. However, the yield is less extensive and less
- 16 conclusive if we specifically query for frequent, clear, and consistent instances of cross-
- modal influence. The results are in many instances inconclusive, and in certain cases even
- 18 contradictory. It is thus of paramount importance to reflect upon some of the key
- shortcomings and limitations of past research, which correspond more or less directly to
- 20 requirements for future research efforts.
- 21 Given the difficulties of conducting research including real occupants in realistic settings
- 22 (involving, amongst others practical, ethical, and economic issues), it is not surprising that
- 23 most studies are short-term. Moreover, the participants, often young students, are not
- 24 necessarily representative of pertinent populations, for instance, of office workers. Most
- 25 studies were conducted in offices, yet other building typologies such as residential
- buildings are practically ignored by the literature.
- 27 Researchers frequently try to establish some measure of realism in the experimental
- settings, but this is rarely effectual given the difficulty in concealing the inherent artificiality
- of the available testing facilities. As such, the reviewed studies do not truly succeed in
- 30 addressing the implications of the Hawthorne effect, even though, scholars argue about its
- 31 nature and suitable methods to account for it in research [110; 111].
- 32 Studies often start with some reference to previous research (frequently to authors' own
- previous publications), but there is very little evidence of actual carryover of past studies'
- findings. As such, the majority of the studies appear to practically start from scratch.
- 35 Perhaps consequently, different studies do not deploy standard research designs, data
- 36 collection strategies, metrics, and statistical analysis techniques, making attempts toward
- 37 conducting meta-analyses factually futile.
- 38 There is arguably a paucity of collaborative, multi-institutional, international, and
- 39 interdisciplinary experimental studies. Specifically, few studies seem to have truly
- 40 recognized the critical importance of conceptual and methodological integration of
- 41 engineering and human science methods.

- 1 One fundamental problem with most research efforts is the absence of foundational
- 2 theories that would facilitate the processes of hypothesis formulation and testing. This may
- 3 be of course in part due to the inherent complexity of the subject. However, the chances of
- 4 obtaining scalable and generalizable results remain slim if research designs do not at least
- 5 make an attempt to start from a provisional general theory of the nature of the perceptual
- 6 and behavioural processes involved in multi-domain exposure situations.

4.2. Physical + contextual variables

- 8 This subsection examines studies investigating the combined effects of physical and
- 9 contextual variables on environmental perception. These studies examined how context
- 10 may interplay with single- or multi-sensory domain perceptions by imposing unknown or
- indirect influences on the physical properties of the environment or by shaping the users'
- perceptions and expectations in line with social or cultural experiences [27-29; 42; 112-
- 13 192].

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4.2.1 Motivational background

- 15 The drive for research varies greatly between the studies identified. Some researchers
- challenge the absence of an established single index for holistic comfort [124; 129; 167]. In
- other studies, the combined effects of physical and contextual variables were merely
- incidental rather than an intended outcome [124].
- 19 In four of the identified studies, the inclusion of contextual factors was thought to enrich
- 20 environmental evaluation by factoring subjectivity into assessments typically based on only
- 21 physical criteria [112; 114; 132; 149]. Similarly, some research aimed to improve post-
- occupancy evaluation techniques, from how data is collected or analysed [72; 168], to
- 23 examine the combined influence of suspected co-contributors to satisfaction in a single-
- sensory domain [169].
- We identified three distinct research themes focusing on specific building attributes. One
- 26 addressed the concurrent influence of environmental and spatial factors present in open-
- 27 plan office space configurations [42; 113; 137; 142; 170], a second examined limitations of
- green building design and rating systems [125; 127; 136; 171], and a third concerned the
- impact of the presence of control opportunities [115; 116; 172; 173].

4.2.2 Approaches

- 31 In contrast to the studies reviewed in section 4.1, the interest seems to be more in real
- 32 settings, shown by the majority of studies applying field study approaches. Here, the
- influences of the contextual factors can be examined with limited cost and reduced
- 34 difficulty in the experimental set-up.
- 35 Subjective evaluation through surveys is a common approach for data collection of comfort
- or satisfaction based on the self-reporting of participants [27; 28; 174]. Several studies
- 37 involve measurements of indoor environmental quality metrics related to thermal, acoustic,
- and visual properties alongside with occupants' subjective votes [42; 74; 124; 129; 136;
- 39 137; 142; 144; 145; 169; 170; 175-177].

- 1 The most frequent building typologies were office buildings (e.g. [115; 119; 126; 134; 140;
- 2 143; 147; 178-180]) and educational buildings (e.g. [116; 120; 123; 181-183]), followed by
- 3 residential buildings [122; 153; 175], hostels and student residences [42; 121], restaurants
- 4 and cafés [132; 142], factories [118; 184], a healthcare facility [150], a shopping mall [141]
- 5 and airport terminal [47].
- 6 The length of data collection differed depending on the methodology and the research
- 7 focus. Longitudinal studies ranged from months to years [171; 185]. Studies employing
- 8 structured or semi-structured interviews may span over several seasons [141; 186; 187].
- 9 Short survey or interview studies last usually no more than two months [148; 150; 153],
- 10 but can be as short as a few days [124; 125; 140; 143; 174; 181; 188].
- 11 The most common approach used in almost all studies are summary statistics, including
- mean and variance. In addition, several types of correlational analysis, parametric and non-
- 13 parametric tests are common approaches.
- 14 Overall perception was the most frequently researched dependent variable, followed
- closely by thermal perception and then by visual perception, acoustics, and IAQ. Metrics for
- overall perception ranged from mainstream choices such as overall satisfaction,
- 17 acceptability or comfort (and even 'uncomfortableness') to measures of 'psychic well-
- being", preference for space and affective quality of space. The metrics used for thermal,
- visual, acoustic, and IAQ perceptions were more conventional, with higher variance for the
- visual domain, including satisfaction with lighting, glare perception, eye discomfort and
- 21 appearance of the environment.

22 **4.2.3 Findings**

- 23 The influence of geographic location is not conclusive. With similar climate conditions,
- occupant responses to warm and cold weather tend not to differ greatly across
- countries [28]. Similarly, Sakellaris et al. [157] found minimal differences in multiple types
- of perception between two locations. In contrast, thermal and IAQ perception differed
- between occupants of the same country, especially for those countries with a large north-
- south spread [98].
- 29 The interior design and furniture in office and school settings correlated strongly with
- 30 comfort [135; 133; 143; 151; 157]. Perception of illuminance level strongly depended on
- office layout and furniture type [123; 183; 189]. Furthermore, since daylight levels exhibit
- 32 strong spatial dependence, visual comfort at workplaces varied greatly with proximity to
- 33 the window [27; 151].
- The perceptual aspects of visibility in classrooms [183; 189], privacy in offices [27; 151],
- and available space in offices [27] are additional factors associated with room layout and
- 36 furniture selection, which correlated with visual and overall comfort levels. Few studies
- 37 recommend optimal office layout or furniture selection for comfort. This is likely due to the
- 38 subjective and non-quantifiable nature of these properties.
- 39 One of the most important components of the building envelope is the window [190]. Poor
- 40 thermal comfort (e.g., cold or warm window) [175; 191], daylight glare [191], and poor
- 41 acoustic comfort [191] are reported by participants in large-windowed residential or office

- 1 buildings. Additionally, the design of solar control devices and solar control techniques can
- 2 affect occupant comfort, especially thermal and visual. For instance, Karlsen et al. [192]
- 3 demonstrate that occupants prefer venetian blinds with adjustable slat angles to those with
- 4 only on-off position. These handful of studies are among the few that made conclusions
- 5 from surveys, while the majority of other studies use simulation approaches beyond the
- 6 scope of this review.
- 7 Perception and comfort in green buildings vs. conventional buildings varied greatly among
- 8 studies. Two studies demonstrated that occupants' overall comfort is higher for green
- 9 buildings [127; 144]. In contrast, Gou et al. [128] observed no significant difference in
- overall comfort between these building types. The contrasting results may be due to two
- reasons. First, the overall comfort can be influenced by occupants' attitude towards the
- "green" identity of the building [171]. Second, the term "green" building is not universally
- defined, and used for buildings that are certified by different standards (e.g. LEED [144],
- 14 LEED and GBL [128], BREEAM [171]). These standards differ significantly in their
- assessment criteria. Consequently, the building performance can vary largely.
- 16 NV and passively cooled buildings that allow occupants to control aspects of the indoor
- 17 environment, excited positive thermal comfort perceptions outside the fixed temperature
- limits set in standards [120; 130; 148; 180]. Moreover, controllability strongly increases
- occupants' satisfaction with thermal indoor conditions in winter and summer [28; 120;
- 20 130; 148].

21 4.2.4 Identified gaps and future directions

- The contextual variables discussed in this paper are those mentioned in the literature.
- Further research would be needed to evaluate whether the most researched dependent and
- independent variables are the most influential.
- 25 Among the building related parameters, façade design and interior design are crucial. Few
- studies use a surveying approach to evaluate façade design options. Thus, further field
- 27 surveys are needed to associate occupant multi-domain perception with design decisions.
- 28 Simulations alone cannot substantiate the claims, as they may not truly reflect the actual
- 29 indoor environment. Spatial information is merely described in the text. For future studies,
- 30 publishing this information in a visual format is desirable, e.g., with photos and
- 31 architectural drawings such as floor plans, sections, or elevations, which can convey the
- 32 spatial situation better. Examples of appropriately published spatial architectural
- information exist [29; 125; 142]. In general, further research on spatial characteristics
- 34 would be desirable, because spatial characteristics and typologies also depend on building
- 35 types and the number of studies considering each building type is currently small.
- In most studies, the context was represented by one or a few variables. However, context is
- 37 a complex system of multiple dynamically interacting variables. For example, visual
- 38 perception varies with the location of a workplace within a floor plan [169], but the
- 39 occupants' perception is further influenced by other spatial parameters such as orientation
- and fenestration of the façade [175], climate related parameters such as season, sun
- 41 path/latitude [126], and indoor surface materials [114]. Our review identified no study,
- 42 which investigated the complexity and interplay of multiple contextual variables, which is

- 1 likely due to methodological challenges with required data types and the needed quantity of
- 2 data. New methodological approaches might be needed for future studies to describe and
- 3 understand the complexity and interplay of contextual variables.
- 4 Most papers used statistics for data analysis, and these methodologies tend to require large
- 5 sample sizes for higher validity. If context is evaluated at a high level of resolution, i.e. with
- 6 in-depth analysis of the spatial geometric or architectural design characteristics, it is
- 7 unlikely that large sample sizes exposed to identical characteristics can be obtained for all
- 8 building types. Therefore, a broader variety of approaches and methodologies could expand
- 9 the investigated contexts.

10 **4.3.** Physical + personal variables

- 11 This subsection concerns thirteen studies that combine the impact and mutual influence of
- measured indoor environmental conditions and personal variables on occupants'
- 13 perception [52; 168; 193-203].

4.3.1 Motivational background

- In some studies, the analysis of personal variables is tangential and brief, while in other
- studies, the main purpose and motivation is to understand how personal variables
- influence occupants' perception. The analysis of personal variables is important to
- understand the differences in perception observed among individuals or groups in similar
- 19 environmental conditions [196]. Nevertheless, all experimental studies aimed to
- 20 evaluate the possible correlation between personal variables and the different domains of
- 21 environmental perception.

4.3.2 Approaches

- 23 Studies include one or more dependent variables related to thermal, visual, acoustic, IAQ, or
- 24 overall perception. Other studies considered productivity as a dependent variable together
- with comfort perception [202], which is out of the scope here.
- 26 Almost all studies were conducted in office or educational buildings or in controlled
- chambers that simulate a working environment. Only one study was found concerning a
- 28 non-office commercial building, a shopping centre [193].
- 29 Field studies including physical measurements and questionnaires dominate in this
- 30 subsection. For a higher control and a broader collection of the physical variables, some
- 31 studies used laboratories that reproduce commercial [193], educational [52; 197], or office
- environments [194; 196; 198]. One study is based on questionnaires [168]. Yun [199],
- instead, applied a mixed methodology to evaluate the energy implications of personal
- 34 variables, specifically of perceived control.
- 35 The applied statistical analysis methods largely vary among the studies, ranging from
- 36 ANOVA and MANOVA [197; 198; 203] to regression [196], correlation analysis [52; 168;
- 37 193; 194], and non-parametric analysis [195].

4.3.3 Findings

- 2 Overall, findings showed that personal variables significantly influence multi-domain
- 3 comfort perception positively or negatively.
- 4 Occupants' perceived control and satisfaction with building management are among the key
- 5 analysed personal variables significantly interacting with the overall perception. Robertson
- 6 et al. [195] highlighted that workers' visual comfort and personal wellbeing are influenced
- 7 by perceived control over lighting, especially in non-naturally ventilated buildings.
- 8 Additionally, occupants' reduced perceived control over the indoor environment has a
- 9 significant negative effect on their thermal comfort [199] and general perception of a
- building [168]. On the contrary, the availability of choice over lighting control were
- demonstrated to decrease occupants' perceived importance of lighting in offices [198] and
- their performance [197]. Focusing on the interaction of thermal, acoustic, and visual
- domains, Dang et al. [193] showed that, although thermal and acoustic personal satisfaction
- are not directly correlated with lighting parameters, they interact with personal lighting
- satisfaction. On the other hand, a significant effect of thermal variables and clothing level on
- visual perception was obtained only in artificially illuminated buildings, since in daylight
- the influence of other parameters, e.g. acoustics, becomes relevant [52]. Finally, Schweiker
- at al. [196] demonstrated that personality traits, i.e. neuroticism, extraversion, openness to
- 19 new experiences, are moderating thermal perception. Focusing on physiological
- parameters, Pigliautile et al. [194] highlighted that a multi-domain approach is required to
- 21 understand human comfort thoroughly.

4.3.4 Identified gaps and future directions

- Generally, very few studies were identified that deal with the interaction of multi-domain
- 24 perception and personal variables beyond demographics. Moreover, many of these studies
- 25 concern the impact of perceived control on environmental conditions and less focus is given
- to other personal variables. In addition, many studies simply report the differences
- 27 observed among occupants with different personal variables without attempting to
- 28 understand its motivation, which limits their contribution to the factual understanding of
- 29 the influence of personal variables. Another important gap is the small sample size and the
- 30 lack of diversity of the samples. Although gender balance is generally fulfilled, many of the
- 31 studies selected university students for their experiments. Finally, none of the reviewed
- 32 papers include a study focused on residential environments. While certain personal
- variables, such as perceived control and privacy, might be less significant in residential
- spaces compared to office buildings, other variables, such as the expectation of building
- 35 performance and energy/money saving might be significant, and thus worthy of
- 36 exploration.

37

22

4.4. Physical + contextual + personal variables

- While some of the studies discussed in the previous subsections explored physical,
- 39 contextual, and personal predictors of perceptions, none aimed to understand the
- 40 interactions of these independent variables. The current subsection covers eleven research

- 1 efforts that addressed this gap by simultaneously examining at least one predictor variable
- 2 from each category [30; 72; 125; 204-211].

3 **4.4.1 Motivational background**

- 4 All studies promote a multi-domain approach to perceptual evaluation. For instance, Jin et
- 5 al. [211] highlight the need to study physical (i.e., objective) and non-physical (i.e.,
- 6 subjective) drivers of occupants' perceptions with their indoor environment. Pivac et
- 7 al. [204] state the importance of physiological and social factors in the evaluation of
- 8 perceptions. Indraganti et al. [209] focus on the role of occupants' demographic and
- 9 personal characteristics while assessing thermal comfort. Hitchings et al. [30] highlight the
- 10 need to study cultural, geographic, and seasonal adaptation effects. Other studies aimed to
- understand overall environmental satisfaction levels [72; 125]. Overall, a unified and
- 12 explicit goal of proving that physical, contextual, and personal variables combine to explain
- 13 perceptions is lacking.

4.4.2 Approaches

- 15 Ten of the reviewed articles are field studies conducted in non-controlled building
- environments, while one [206] took place in a laboratory controlled office setting. The
- studied environments were office [125; 204-208], residential [30; 72; 209; 210], and retail
- buildings [211]. Dependent variables considered included domain-specific comfort metrics
- such as thermal comfort [30; 204; 209], neutral temperature [206], visual comfort [211;
- 20 205], and acoustic comfort [210]. Two studies [72; 125] considered domain-specific
- 21 comfort metrics and overall perceived comfort levels of the respondents.
- 22 Data collection was carried out through environmental sensing devices, questionnaires,
- 23 walkthroughs, inspections, interviews, and diaries. The data collection duration varies from
- one-time surveys (e.g., [210]) to data collected over an extended period of time (e.g., 40
- 25 days in Sadeghi et al. [205]).
- 26 The data analysis approaches include qualitative and quantitative assessments. Starting
- with the former, Hitchings et al. [30] used a qualitative analysis of the collected data. The
- other studies mostly applied statistical analysis methods to derive relationships between,
- on the one hand, the environmental, contextual, and personal data that were collected, and
- 30 on the other, the respondents' perceptions of comfort. The statistical methods include
- 31 ANOVA [125; 210], X²-tests [72], Mann-Whitney U-test and the Kruskal-Wallis
- 32 test [204], correlations [72; 205; 210; 211], and linear regression [205; 206; 209-211; 125].

33 **4.4.3 Findings**

- While this subsection covers a broader scope of predictor categories than previous sections,
- 35 the results are not more diverse. The results do not explicitly confirm that physical,
- 36 contextual, and personal predictors collectively drive the reported perceptions. The
- 37 findings of the articles are mostly identifying single or dual types of interacting perception
- drivers, which is in line with the observations of previous subsections.

- 1 Starting with thermal perception, Pivac et al. [204] found that environmental metrics, office
- 2 type, and job type have a significant influence on the perceived thermal comfort. Indraganti
- 3 and Rao [209] observed a strong correlation between the respondents' economic group and
- 4 their reported comfort levels, and weaker relationship with the other considered variables
- 5 such as season and tenure. Schweiker and Wagner [206], on the other hand, highlight a
- 6 significant influence of perceived control on neutral temperature, while office type affected
- 7 perceived control.
- 8 Related to visual perception, Jin et al. [211] found that the measured illuminance level is the
- 9 dominant driver of visual comfort, while the existence of daylighting plays an essential role
- in subjective satisfaction. Sadeghi et al. [205] found a strong relationship between the
- occupants' perception of control and their acceptability of a broader range of visual
- 12 conditions.
- 13 In Park et al. [210], the authors studied potential drivers of subjective responses to floor
- impact noise in residential buildings. They highlight a significant impact of noise sensitivity
- and floor slab thickness on the reported acoustic comfort levels.
- 16 The main observation by Xue et al. [72] and Freihoefer et al. [125] is a significant difference
- in the reported overall comfort levels between workspace types (open and closed). Xue et
- al. [72] found that the combined effect of thermal comfort and IAQ significantly influences
- 19 visual comfort, while the abundance of daylight hours and illuminance levels showed strong
- 20 positive correlations with reported visual perceptions. More interestingly, the authors
- 21 confirm strong dependencies between pairs of variables such as IAQ/thermal comfort and
- room orientation, adaptive behaviours of shading/lighting and visual comfort, and finally,
- 23 mental stress and acoustic comfort.

24 4.4.4 Identified gaps and future directions

- 25 The findings presented above do not provide a clear understanding of the interactions nor
- 26 fundamentals of the combined effect of physical, contextual, and personal predictors of
- 27 perception. The findings cannot be generalized given the small sample of studies that met
- 28 the criterion used for inclusion in this subsection. Furthermore, the data analysis methods
- 29 applied were mostly constraint to studying relationships between a limited number of
- 30 variables (in many cases two variables), falling short of providing a comprehensive
- 31 understanding of the influence of multi-variable predictors and their interactions. More
- 32 extensive diversity of predictors and complexity of analysis tools (e.g., Principal Component
- 33 Analysis and Artificial Neural Networks) can be considered in future research to draw more
- 34 diverse and comprehensive conclusions on the drivers of occupant perceptions. Finally,
- except for Schweiker and Wagner [206], none of the studies were conducted in controlled
- 36 environments, which is another potential avenue for exploring multi-domain predictors of
- 37 perception.

38

5. Behaviour

- 39 This section summarizes studies considering the relationship between measurable
- 40 conditions of indoor environmental quality and occupant behaviour.

Figures 9 to 12 show the crossed main effects of multiple independent variables on different types of behaviour, which will be discussed in the following subsections.

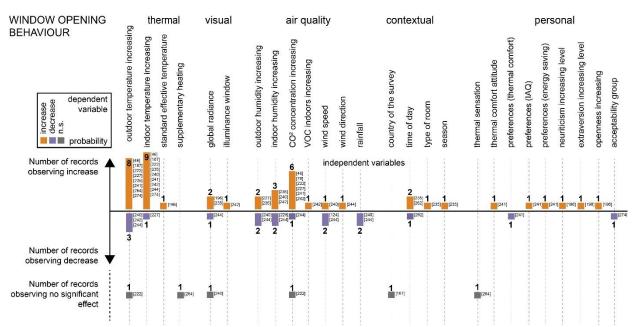


Fig. 9. Effects of physical, contextual and personal variables on window opening behaviour

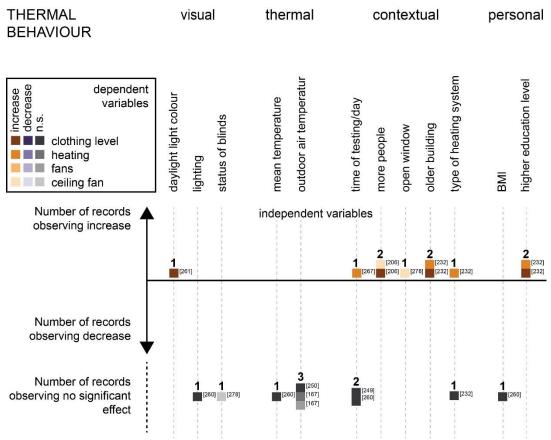


Fig. 10. Effects of physical, contextual and personal variables on different types of thermal behaviours.

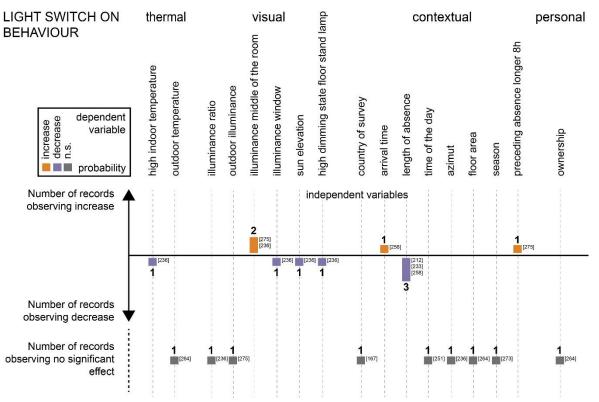


Fig. 11. Effects of physical, contextual and personal variables on light switch on behaviour.

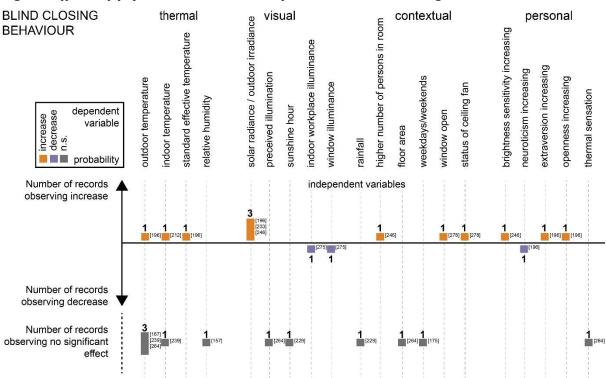


Fig. 12. Effects of physical, contextual and personal variables on blind closing behaviour.

1 5.1. Physical multi-perceptual approaches

- 2 The nineteen studies analysed in this subsection attempt to relate occupant behaviour to
- 3 multi-perceptual physical environmental conditions [46; 212-229].

4 5.1.1 Motivational background

- 5 The motivation behind the majority of these studies was to evaluate the drivers of occupant
- 6 behaviour in the context of multiple domains of occupant comfort. In general, all of the
- 7 studies aimed at a better forecasting and simulation of occupant behaviour under multiple
- 8 indoor environmental performance criteria. Specifically, all but few studies were concerned
- 9 with the effect of indoor and outdoor climatic conditions on occupant control of windows,
- blinds, and/or lighting, as well as the derivative effect of such control on perceived thermal
- comfort, lighting comfort, and/or building energy use.
- 12 The underlying objective was the characterization of the relationship between measurable
- physical parameters, and occupant behaviour. Specific objectives include the evaluation of
- 14 the effect of solar insolation on perceived thermal comfort, lighting comfort, and occupant
- controls of window blinds [215] and the development of a data-driven personalized
- 16 thermal comfort model and minimum daylight requirement model to be used for model-
- 17 predictive control of window blinds [213].

18 5.1.2 Approaches

- 19 All reviewed papers relied to some extent on physical monitoring of indoor environmental
- 20 conditions and direct monitoring or measurement of occupant control decisions (e.g.,
- 21 window opening behaviour). Most studies undertook some form of occupant comfort
- 22 evaluations via questionnaires, and several papers undertook monitoring of outdoor
- climatic conditions (e.g., outdoor air temperature, and air pollution concentrations).
- 24 All but few papers described *field* studies of offices or dwellings. The exceptions
- were *laboratory* studies [214; 218; 219]. All field studies took place in regions where there
- are discernible heating and cooling seasons, and no studies were undertaken in climatic
- 27 regions such as the Tropics or Sub-Tropics.
- 28 The duration of behavioural studies followed one of three trends: they undertook either a
- short duration of measurements in a manner of days [214; 219], a medium-term
- measurement across a single climate season [212; 221; 227], or a much longer-term study
- 31 across several seasons up to an entire year or more [46; 213; 215; 216; 222; 224-226; 228;
- 32 229]. The shortest measurements had the controlled laboratory studies. A notable example
- is Daum et al. [213], who collected over 6,800 individual survey responses over a period of
- 34 3 years.
- 35 The studies' methods of data analysis were, for example, correlations between the
- probability of an action and environmental variables. For example, Inkarojit [215]
- evaluated the correlation of the probability of occupants' opening or closing windows
- against received solar radiation on window surfaces. Similarly, Daum et al. [213] used their
- analysis to correlate the probability of window blinds opening/closing actions against
- 40 indoor air temperature. Various forms of regression methods, such as linear regression,

- 1 multiple linear regression, univariate and multivariate logistic regression, were used by all
- 2 studies.

3 **5.1.3 Findings**

- 4 Given an underlying, often implied understanding across all studies that occupant
- 5 behaviour is inherently stochastic, the main format of illustrated findings were probability
- 6 density functions of occupant behaviour against one or more parameters.
- 7 The findings from these papers defended widely understood principles of thermal and
- 8 visual comfort in the built environment, as opposed to revolutionising them or putting them
- 9 into question. For example, the studies which evaluated the extent to which window
- open/close behaviour would be driven by outdoor climatic conditions, IAQ, or other
- parameters, broadly concluded that indoor and outdoor air temperature, coupled with IAQ
- and/or solar radiation, are the primary drivers of window control by occupants [46; 216;
- 217; 221; 222; 226; 228]. Outdoor air quality was identified as a moderate parameter of
- influence, particularly when it is considerably poor [226]. While solar radiation should be
- deemed a quasi-thermal parameter with a direct effect on indoor and outdoor air
- 16 temperature and indoor heat gains, IAQ is related to a different domain, so that window
- open/close behaviour can be understood as a multi-domain problem.
- All studies that evaluated the physical drivers and indicators of window blind and lighting
- operation [212; 213; 215; 225; 229] observed the effect of multiple environmental
- 20 conditions on blind and lighting controls, but still found parameters of solar insolation to be
- 21 the primary driving force of control decisions. While window blinds are a form of solar and
- thermal control, and electric lighting is needed in the absence of daylight, it is surprising,
- that all studies suggested that blind and lighting control are univariate problems
- 24 determined by solar insolation alone.

5.1.4 Identified gaps and future directions

- Overall, meteorological conditions were not usually measured adjacent to the buildings or
- 27 sites under analysis, or at least were not indicated to have been done so. Differences in
- 28 microclimatic conditions, from what is experienced directly outside a building envelope to
- 29 what is measured from a central weather station, is non-negligible and is a potential
- 30 limitation of correlations made between weather and human behaviour [226].
- 31 Of the studies examining window opening/closing behaviour, works such as Jeong et
- 32 al. [216] indicate that caution must be taken when data from only one or two seasons are
- used. In other words, drivers of behaviour in winter may not apply in summer conditions,
- and studies in either season may not apply to conditions under Autumn and Spring. The
- and studies in claim season may not apply to conditions under recent and spring. The
- 35 effort to observe occupant behaviour across multiple seasons was, if not a norm across the
- 36 long-term works, an identified research gap across several of the medium-term studies. As
- observed by Naspi et al. [222], this view may be the main research gap of studies in this
- 38 subsection.

- 39 Despite prior evidence that circadian lighting affects occupants' perception, only the
- 40 experimental studies evaluated the association of circadian lighting conditions on occupant

- 1 behaviour. The study of circadian lighting, both natural and artificial, and its effect on
- 2 human physiology and psychology warrants further attention by field studies. None of the
- 3 evaluated field studies explored whether light colours, or other indicators of circadian
- 4 lighting, affected occupant behaviour. We also observed that noise levels were not
- 5 frequently measured across studies that evaluated window open/close behaviour, even
- though the relationship between noise and window operation is not trivial [230]. 6

7 5.2. Physical + contextual variables

- 8 This section provides insights into thirty-one studies aimed at predicting or explaining
- 9 behaviours that include at least one type of physical and one type of contextual predictor
- 10 variable.

11 5.2.1 Motivational background

- 12 Similar to the studies identified in subsection 5.1, one of the key objectives behind the
- 13 majority of papers is to account for behaviour-related uncertainty in building energy
- 14 simulation and to develop models, which are hence developed to help bridge the gap
- 15 between measured and predicted energy consumption [31; 167; 203; 229; 231-243]. Some
- 16 of the studies stated that their contribution was based on the need to develop models for
- 17 specific geographic contexts or building types (e.g., hospital wards) [244]. Linked to this
- 18 objective is the investigation of cause-effect relationships between the operation of the
- 19 building by occupants and different technologies installed [245].
- 20 Other studies investigated control interaction for providing enhanced input for building
- 21 automation control [246] or the optimization of peak electricity loads [175]. Furthermore,
- 22 researchers stated that the key objectives were to gain better insights into occupants'
- 23 choices of adaptive opportunities for thermal comfort enhancement in specific
- 24 climatic contexts [140; 247-250], or into the effect of occupancy on perceived control and
- 25 behavioural patterns [206]. Other papers modelled occupant interaction with certain
- 26 controls to gain a better understanding on other environmental factors [251].

27 5.2.2 Approaches

- 28 The majority of papers addressed window control (N=16), next to window blinds control
- 29 (7), thermal adjustments (e.g. thermostat adjustment, switching on space heating and/or
- 30 cooling systems)(7), lighting control (7), and adjustment of fan speed (2). Multi-domain
- 31 independent variables were related to the thermal environment (36), the visual
- 32 environment (17), and IAQ (13). Only one record included information on acoustic
- 33 variables [248]. Amongst these independent variables, the most common for window
- 34 control behaviour models were related to indoor and outdoor temperatures [18; 167; 203;
- 35 206; 231; 233; 235-238; 240; 241; 244; 248; 252] and IAQ [18; 231; 235-237; 241; 244;
- 36 248; 252]. Blinds behaviour models mostly included thermal variables [167; 175; 206; 229;
- 37 233; 239; 253]; and visual variables [206; 229; 233; 239; 253]. The papers investigating
- 38 thermal adjustments only included thermal environmental variables in combination with
- 39 contextual variables [167; 206; 232; 238; 245; 249; 250].

- 1 The contextual factors included the time of day or arriving/leaving times [31: 203: 231:
- 2 233; 236; 237; 239; 240; 242; 246], the previous control state [203], geographical
- 3 location [238; 167], ventilation type [203; 238; 140], building system and envelope
- 4 characteristics (e.g., installed technologies, building envelope efficiency, window opening
- 5 size) [244; 245], facade orientation [251; 175], dress code [249], season or cloud
- 6 cover [175], socio-economics [232], and occupancy levels [206].
- 7 Most of the 26 field studies used physical measurements (24) and 11 of them also surveys.
- 8 Two studies used a combination of measurements, surveys, and observations, and one field
- 9 study used only observations. The duration of the data collection varied from a few days
- 10 (laboratory studies such as [206]) up to several years [239].
- 11 Some of the studies combined field measurements with a questionnaire-based
- investigation [140; 246; 167], or used questionnaires [232] or interview techniques [245]
- independently. Most records refer to office environments (22), next to residential buildings
- 14 (9), and hospital environments (1).
- The statistical methods used were logistic regression [236; 237; 240; 242; 244], probit
- analysis [203; 238; 167], neural networks [231], Markov processes [239], data mining
- approaches [237], and Bayesian networks [31; 241]. Other statistical analysis included
- Generalized Estimation Equations [246], ANOVA analysis [115], weighted and linear trend
- 19 lines [140].

5.2.3 Findings

- 21 A wide range of studies found a strong dependency between the time of day and window
- control patterns in offices [236; 237; 203] and residential buildings [31; 235; 240; 252].
- Hansen et al. [232] found that window operation in Danish households was correlated
- 24 with building characteristics, such as technical installations and energy efficiency of the
- building envelope, while it was not correlated with the building age. Shi et al. [244] found
- 26 that windows with large adjustable opening sizes are more likely in ajar state and the
- 27 interaction frequency is much higher. Based on questionnaires, the indoor temperature at
- 28 which a substantial proportion of occupants start to open windows for ventilation was
- observed similar in all climates, but window use was more common in Europe than in
- Pakistan [167; 238]. Rainfall was also found to have a significant effect on opening a
- window, along with the location of the office (and its relation to safety) [254].
- 32 In line with section 5.1.3, studies including physical and contextual variables found
- 33 correlations between window operation and IAQ indicators (e.g. CO₂ and VOC
- 34 concentrations) [31; 231; 235; 236; 252]. Stazi et al.'s review [18] found that window
- opening was mostly linked to CO₂ concentration in residential buildings. According to Fabi
- et al. [255], all papers that measured IAQ indicators found correlations with window
- 37 operation.
- 38 Several studies found a strong relationship between window blind control operation and
- 39 the time of day [233; 239; 246], while others did not [251]. Another important contextual
- 40 factor influencing window blinds operation is the facade orientation [233; 246; 251]. Time

- of day and/or arrival/leaving times play an important role also for light switch
- 2 behaviour [233; 242].

3 **5.2.4** Identified gaps and future directions

- 4 Although all studies included at least one contextual variable, further work needs to create
- 5 a comprehensive approach including a more extensive set of contextual and potentially
- 6 personal factors.
- 7 Regarding contextual physical environmental factors, further attention should be paid to
- 8 the ease and convenience of using building system interfaces, the state of other devices (or
- 9 controls) and the influence of building automation routines on behavioural patterns.
- 10 Furthermore, contextual factors such as interior design and furniture layout, or the relation
- between the indoor and outdoor environments (e.g., view to the outside) need to be further
- 12 investigated. Even various social factors, such as social constraints, group interactions,
- the presence of multiple occupants on occupant behaviour in open space versus private
- office [206], and control behaviour due to safety reasons need to be further investigated.
- 15 Although some studies compared a few different geographical locations, a more
- 16 comprehensive approach is needed to understand the variability of occupant behaviour in
- different climatic zones and/or cultural backgrounds.
- 18 Related to the research method, relationships between indoor variables and window
- transitions, based purely on survey responses (e.g. [238; 167]), must be treated with
- caution. Since the window state affects indoor variables [235; 255], conditions just prior to
- an event are needed.

22 **5.3. Physical + personal variables**

- 23 This subsection reviewed six studies looking at physical and personal predictors, which
- could explain some of the differences amongst adaptive behaviours. The personal
- 25 predictors include clothing habits, socio-cultural expectations, personality traits, and
- 26 occupancy preferences.

27 **5.3.1 Motivational background**

- Most studies investigating physical and personal variables concurrently aimed to develop
- 29 occupants' behaviour models to control building systems.

5.3.2 Approaches

- 31 The studies consider thermal systems [256; 257], lighting systems [198; 258], or thermal
- and lighting systems [196]. These systems were generally operating in non-stressful
- 33 conditions (i.e. acceptable environmental conditions). One common dimension considered
- in study designs is their longitudinal aspect, with studies lasting from a day to many
- 35 months.
- 36 Research exploring physical and personal variables as predictors to behaviour analysed
- 37 these two predictors independently or jointly. Indraganti et al. [256] applied descriptive
- and inferential analysis to explore the relationships between occupant's behaviours (14

- 1 control actions) and personal variables (dress habits); in parallel, the relationship between
- 2 occupant's behaviours (air-conditioning and fan usage) and physical variable (outdoor daily
- 3 mean temperature) was explored through logistic regression. Schweiker et al. [196] applied
- 4 mixed effect regression analysis to explore the effect of physical (thermal and visual) and
- 5 personal (personality traits) variables on occupant's behaviours (clothing adjustments,
- 6 window opening, blind closing, and ceiling fan usage). Gunay et al. [258] applied discrete-
- 7 time Markov logistic regression to explore the effect of physical (ceiling illuminance) and
- 8 personal (occupant's presence) variables on occupant's behaviours (light switching and
- 9 window blind actions).

10 **5.3.3 Findings**

- 11 Most studies highlight that occupants respond to environmental discomfort, but fail to
- revert the state once discomfort disappears. Gunay et al. [258] observed that occupants
- 13 closed blinds upon glare and switched-on lights upon low daylight; but they often failed to
- open the blinds and to switch-off the lights. Occupants' locus of control is not a concern in
- non-stressful/acceptably good conditions [198]. Furthermore, occupants' interactions with
- building environmental systems may be linked to daily routine and habits [257] and
- differences in behavioural patterns between sub-populations based on personality traits
- are considerable high [196].

19 5.3.4 Identified gaps and future directions

- 20 Most studies highlighted a lack of the contextual dimension, including climate, seasonal
- 21 effects, building types, building orientations, complexity of controls, interior layout,
- single/shared spaces, and organisational policies [198; 196; 257; 258]. In addition, multi-
- 23 domain physical predictors are missing except for one study including IAQ [196]. Finally,
- studies should consider the Hawthorne effect already discussed in section 4.1.4 and by
- 25 Schweiker et al. [196]. In general, very few studies have systematically assessed the effect of
- 26 personal variables other than age and gender on behaviour.

27 **5.4.** Physical + contextual + personal variables

- 28 This subsection summarizes eleven studies looking at the influence of physical
- 29 environmental conditions and their interactions with contextual and personal factors on
- 30 occupant behaviour [256; 259-268].

31 **5.4.1 Motivational background**

- 32 As in previous subsections, modelling of occupants' behaviour for use in building
- 33 performance simulations for office buildings is the main motivation common in studies
- 34 across the world. Thereby, the main research focus is on window control behaviour, and its
- impact on the energy consumption.

5.4.2 Approaches

- 37 The majority of the publications were field studies, often based on or involving
- 38 questionnaire surveys [256; 257; 262; 264]. Almost all the studies used logistic regressions

- 1 to evaluate the cross-main effects of environmental and non-environmental factors on the
- 2 occupants' behaviour. The analysis of the interactions between different predictors has not
- 3 been established yet, but there is a growing body of literature with results that point out its
- 4 importance [267; 268].
- 5 The four commonly studied behaviours are interactions with windows, use of heating
- 6 controls, electric lighting use, and interaction with shades.
- 7 The physical variables were the internal and outdoor air temperature, globe temperature
- 8 and air velocity. Some studies collected additional measurements of carbon dioxide
- 9 concentration, particulate matter [266], and solar radiation [267]. Contextual factors
- included building features and maintenance, the orientation of windows, floor level
- 11 (security), the type of office, and socio-cultural aspects such as habits and dress code.
- 12 Personal factors included perceived control.
- 13 The number of residential and office building studies was similar, but residential
- longitudinal studies usually have a longer duration. Office studies benefit mainly from a
- large number of respondents albeit often being cross-sectional surveys for shorter periods.

5.4.3 Findings

- While all studies observed physical, contextual, and personal variables, window use was
- mainly analysed as a function of outdoor temperature [256; 264], indoor temperature, and
- 19 IAQ [268]. Often, the probability of an opened window is positively correlated with outdoor
- temperature, but Kim et al. [262] showed a bell-shaped relationship were above a certain
- 21 ambient temperature this positive correlation is reversed and the number of closed
- windows increases again. This effect was observed in previous single-domain studies [269]
- and shows the importance of local context in the interpretation of the observed behaviours.
- In an office building in the hot and humid climate region of India, window use was mostly
- defined by contextual factors such as the time of day; meanwhile, the occupants did not
- interact with other building controls [256]. A study in China [266] concluded that the
- 27 window used in the studied offices was a combination of physical and contextual factors
- such as the sunshine hours. Wei et al. [265] revealed a seasonal effect and a significant
- influence of the location of the window (ground floor or not) and personal preference
- 30 (habitual or not) on the "end-of-day" window state. Absence in subsequent days and
- 31 contextual factors such as daylight saving time and façade orientation did not have a
- 32 significant effect. Seasonal effects were also evident in a South Korean study [268]. In
- 33 spring, window use was affected by the CO₂-concentration, whereas in summer the indoor
- 34 temperature was a significant driver. In winter, indoor temperature and CO₂-concentration
- did not have a statistically significant effect. Yun et al. [257] showed a significant
- 36 relationship between comfort and perceived control over temperature in NV buildings and
- 37 highlighted that a change of the windows' state is more likely with high compared to low
- 38 perceived control [257].
- 39 The lighting behaviour in households was found to be influenced by the solar radiation,
- 40 perceived illumination, outdoor temperature, thermal sensation and IAQ [264] showing the
- 41 complexity of the interrelationships between multiple physical and personal variables.

- 1 The interaction of household occupants with the radiator thermostat set-points showed
- 2 that the occupants could be classified into different behaviour categories according to the
- 3 number of interactions with the heating controls [267]. The set-point changes were
- 4 significantly influenced by the indoor relative humidity, outdoor ambient temperature,
- 5 solar radiation, wind speed and time of day.

5.4.4 Identified gaps and future directions

- 7 Above findings show the importance of contextual factors and how these non-physical
- 8 factors affect occupants' perception and behaviour. They emphasize the need for systematic
- 9 analysis of the contextual factors and study their interactions with the physical and
- personal variables. However, there is a lack of research into the relationships and
- interactions amongst multi-perceptual, contextual, and personal factors and their combined
- influence on occupant behaviours. While there seems to be a consensus on the physical
- variables measured, there are still differences in the selection of contextual and personal
- variables and their reporting. The type of building system varied with the particularities of
- 15 the location (e.g. climate, prevailing architecture and construction typologies) and seemed
- biased by what the sites permitted and the studies' aims. The main reason could be that
- these parameters are often "fixed", defined by the building and location and not directly
- 18 controlled by the researchers.
- 19 Contextual factors are mainly referred to in generic context without systematically
- 20 assessing their interactions and impact on other predictors. Missing relationships, for
- 21 example, are different climatic and cultural background factors on window use
- 22 behaviour [257].
- 23 In relation to lighting studies, research is required to assess the effect of light on
- 24 psychological factors and investigate the duration of the effects on comfort [260].

25 **5.5.** Physical + multi-behavioural approaches

- The focus of the 13 studies in this subsection is on the interrelations between the indoor
- 27 environmental conditions with a combination of different behavioural responses [212; 225;
- 28 254; 258; 270-278].

29 **5.5.1 Motivational background**

- 30 The aim of these studies is related again to energy savings through more realistic modelling
- of occupancy behaviour in simulations. The underlying objective was to characterise the
- 32 relationship between physical environmental parameters and occupant behaviour
- including the assessment of the interactions and combined effect of multiple behaviours.

5.5.2 Approaches

- 35 Similarly to the previous subsection, the behaviours investigated were interactions with
- 36 windows, heating and lighting controls including electric lights and shading.
- 37 In contrast to the previous subsection, the research in this field is focused on office
- 38 buildings. Window use remains the most prominent behaviour and is studied in

- 1 combination with personal adaptation behaviours (e.g. physiological responses [278],
- 2 clothing adjustments, and interactions with the heating and cooling systems [274]).
- 3 Responses to changes in visual conditions are discussed in light of interactions with shades
- 4 and electric lighting [212].
- 5 The physical variables commonly considered were the indoor and outdoor air temperature,
- 6 relative humidity, wind speed, illuminance, and the level of CO₂-concentration as an
- 7 indicator of IAQ. The non-physical variables differed again with the building characteristics
- 8 and the researchers' objectives and included season, period of day, type of room and
- 9 current state of controls. However, the analysis of the significance and impact of different
- variables followed mostly again a cross-main effects approach.
- Data collection occurred through surveys with concurrent field measurements, except for
- one study in a controlled office-like environment [278].

13 **5.5.3 Findings**

- 14 Despite the influence of indoor and outdoor physical variables confirming observations of
- previous subsections, the occupancy state (arrival/departure) was the most often studied
- other behaviours. Langevin et al. [274] found a significant influence of indoor/outdoor
- temperature and arrival time on clothing, fan, heater, and window use behaviours. While
- 18 the occupancy state interacted with window opening [236], the previous or next absence
- 19 for more than 8 hours did not have a significant effect on the opening behaviour during
- departure or the closing behaviour upon arrival [275]. In contrast, the closing behaviour
- during departure and the opening behaviour during arrival were influenced by the absence
- duration. Fabi's review of the physical predictors that influence light switching behaviour
- 23 identified the key drivers absence duration and daylight [273]. Season, light sensor control,
- 24 and time spent with the light off were not significant. Similarly, lighting use is a function of
- 25 the daylight availability and the duration of absence before switching the lights on or after
- 26 switching the lights off [212]. In the intermediate period, the only significant variable is the
- 27 worktop daylight illuminance level. The same study concluded that the majority of shade
- adjustments take place during the first arrival or last departure of the day.
- 29 Schweiker et al.'s analysis of the interactions between behaviours indicates a significant
- 30 impact of the fan operation and clothing level on the window behaviour but no significant
- effect of sun shading [278]. In addition, the window state affects significantly fan and sun
- 32 shading use. Sanati et al. [271] found no significant effect between sunlight availability,
- 33 window occlusion, and electric light usage in a single university building.

5.5.4 Identified gaps and future directions

- 35 The low number of studies in this subsection showed that the influence amongst the
- 36 studied behaviours themselves is seldom thoroughly assessed. Fabi et al. [236] suggested
- 37 that there is a need to investigate the correlation of behaviour responses to multiple,
- 38 instantaneous factors.

1 6. Discussion and conclusion

- 2 Overall, this review reveals the diversity of approaches and findings of multi-domain
- 3 analysis. This section compares and discusses the findings and identified gaps from
- 4 individual subsections above.

5 **6.1 Motivational background**

- 6 In perceptual studies, the main motivation is a better understanding of the phenomena
- 7 involved. In behavioural studies, the aim is mostly model development for predictive
- 8 purposes. This does not mean that perceptual studies do not involve any aspects of
- 9 prediction, but, the authors stated to focus on understanding, rather than modelling.

6.2. Approaches

- 11 A variety of methodological approaches for research design and assessment are presented
- in the literature. Whereas laboratory studies are the most frequent type of perceptual
- multi-physical studies (subsection 4.1), field studies dominate in all other categories. New
- 14 approaches using virtual environment (e.g. [272]) published promising results, but still lack
- sufficient evidence that they permit the reproduction of effects observed in reality.
- 16 Geographical contexts are mainly from developed
- 17 countries (https://www.un.org/en/development/desa/policy/wesp/wesp current/2014w
- 18 esp country classification.pdf), which likely represents the availability of research funding,
- rather than the contextual diversity or the population size in a particular context.
- 20 Therefore, the findings presented are not necessarily representative of buildings, lifestyles,
- 21 climate zones or cultural regions in developing countries.
- 22 Context is more likely considered in studies on human behaviour than perception. This may
- 23 be due to the advantages of laboratory studies to control multi-physical influences on
- 24 perception without contextual considerations. For example, the experimental design by
- Kulve et al. [104] enabled to avoid natural correlations among environmental variables and
- to causally test the effect of variables on outcomes of interest. In addition, it allowed testing
- 27 if cross-modal effects occurred at a specific level of one variable (e.g., only in comfortable
- thermal conditions) or were independent of the level of the other variable (i.e. the same
- cross-modal effect occurred at all the levels of the other variable).
- 30 Few studies considered personal variables beyond demographics despite their inclusion by
- 31 means of questionnaires being an easy extension in laboratory studies. Participants in
- 32 laboratory studies are not otherwise distracted from their work or leisure activities as it
- would be the case in field studies. Still, the application of findings relating to personal
- factors in the building design process with generally unknown user profiles is less clear, but
- 35 potentially beneficial for specific buildings (e.g. retirement homes) or individualized
- 36 operation strategies.
- 37 Contextual influences and occupant behaviour are more difficult to study in an artificial
- 38 setting of a laboratory environment. The low frequency of interactions (i.e., 1 to 4 actions
- 39 per day) would require very long and expensive study periods uncommon in laboratory

- 1 settings. Still, more attempts would be beneficial to reveal true causalities, because field
- 2 studies also have drawbacks. The lack of experimental control over environmental
- 3 conditions means that the conditions cannot be causally related to human outcomes, and
- 4 that environmental conditions are likely to naturally co-occur in predictable ways (e.g., a
- 5 position near a window in the summer is likely warmer and brighter than one on the
- 6 interior of a room).
- 7 The question of causality is also relevant to several papers addressing contextual factors,
- 8 such as green vs. conventional buildings or NV vs. AC buildings in field studies with a
- 9 limited number of buildings. These studies assign observed differences in perception or
- behavioural patterns to the type of building, while neglecting the multitude of other
- potential influences (e.g., non-documented contextual or personal differences). Without
- 12 addressing, discussing, or eliminating potential confounding variables, assigned causalities
- 13 could be mistaken. For potential meta-analyses and other comparisons, well documented
- 14 contextual elements of the environment under investigation are crucial. Unfortunately,
- 15 contextual elements and spatial characteristics such as relative position to control devices
- are often poorly documented- if at all in the text. Therefore, we recommend using the
- categories presented in Figure 1 together with aspects mentioned in previously published
- ontologies [279] to describe the contextual aspects.
- 19 The assessment of the dependent variables varies largely. While there are meaningful
- differences in behavioural studies, the perceptual studies vary in the dimension assessed
- 21 (e.g., thermal sensation, preference, or acceptability), and the type of scale (e.g., categorical,
- 22 continuous). There is a tendency to ignore previous approaches and develop one's own
- 23 instruments, without benchmarking them against existing ones (see also subsection 4.1.4).
- As discussed earlier [20], this variety impedes comparing results across studies, and
- 25 understanding whether differences between outcomes of two studies are a result of the
- 26 instrument or differences in (unreported) contextual or personal aspects.
- 27 In addition to the diversity in data collection approaches, the analysis approaches taken are
- 28 at different levels. Studies, most likely in laboratories, exist, which apply multi-domain
- 29 approaches from study design to analysis. At the same time, the number of field studies
- reporting the collection of multi-perceptual data is increasing. However, their potential is
- 31 poorly utilized, because the datas' multi-perceptual nature is not considered during
- analysis. The reasons for such omission can be manifold. First, limits in word counts in
- combination with the complexity of describing multi-physical data and their analysis might
- lessen the potential to report multi-domain analysis approaches first, but cannot be an
- argument for missing subsequent publications. Second, multi-domain interaction or cross-
- over statistical analyses might have been conducted, but not reported due to non-significant
- 37 results; a common issue leading to scientific bias as reported earlier [5]. Third, a lack of
- 38 statistical skills might have impeded the integration of interaction terms in statistical
- 39 analysis.
- 40 To overcome these shortcomings, all researchers, reviewers, and editors are encouraged to
- demand extensive descriptions and analysis methods for multi-domain studies until there is
- 42 a substantial body of evidence that certain aspects are not relevant for a specific perception
- 43 or behaviour.

- 1 Further research shortcomings in all categories are small sample sizes, low diversity in
- 2 participants, representativeness of samples, and environment. In contrast to previous
- 3 reviews' discussions [20], which emphasize the general need for larger sample sizes, we
- 4 argue that the actual number of cases is not the main problem. Examples exist throughout
- 5 scientific literature in a variety of disciplines, which show the benefits of studies with small
- 6 sample sizes that still increase the existing knowledge (see Flyvbjerg [280] for an extended
- 7 discussion). Small sample sizes are to be criticized when lacking a clear strategy for sample
- 8 selection and being based on so-called convenience samples, i.e. those at hand of the
- 9 researcher. In contrast, Flyvbjerg [280] discusses information-oriented sampling strategies
- including the selection of critical cases or maximum variation cases, which enable the
- extraction of new knowledge even with small sample sizes. At the same time, he emphasizes
- 12 that small sample sizes are very suitable for falsification of theories sometimes a single
- 13 case is sufficient –, but less for generalizing.

14 **6.3 Findings**

- 15 Overall, results are often inconclusive and in part contradictory (see Figures 8 to 12). Few
- observations are repeatedly shown: significant effects of visual properties on thermal
- perception exist, though they are partially contradictory and a comparable amount of
- studies found no significant interactions. A general statement seems not possible due to
- 19 explainable effects, that warm light colours are perceived as satisfactory in cold
- 20 environments and vice-versa. Thermal properties have been shown to influence acoustic
- 21 perception, while the number of non-significant findings is again in the same magnitude.
- Related to occupant behaviour, the largest evidence was observed for thermal and IAO
- related variables interacting on the window opening behaviour. Such finding is not
- 24 surprising given that windows enable to control IAQ and thermal conditions except for
- reasons of outdoor conditions such as high air pollution. Contradictory results are apparent
- in all categories of multi-domain studies. While such observation can be assigned to the low
- 27 number of studies in subsections 4.4 and 5.4 and 5.5, it is more surprising for
- subsections 4.1, 4.2, 5.1, and 5.2, which are based on a much larger number of items.
- 29 Despite the large variety of independent variables assessed, there is a need to clarify
- 30 whether those variables are the most influential ones explaining variances observed in
- 31 perception or behaviour, or solely the most accessible ones. This necessity is linked to the
- 32 next gap in the reviewed literature: missing theoretical foundation. One could assume that
- many, if not all studies, are based on underlying theories of human physiology and
- 34 perception. However, very few articles mention theories when describing their study
- design or discussing their findings. Not all studies need to be designed to falsify an existing
- 36 theory; case studies, especially very detailed ones looking at individual cases, are also very
- 37 suitable to develop new theories inductively. Nevertheless, a theoretical foundation is
- 38 meaningful to link and explain potentially diverse findings and to justify the selection or
- 39 exclusion of specific physical, contextual, or personal variables. Theories relevant for multi-
- domain approaches may originate from disciplines like psychology, sociology, but also from
- 41 neurology or physiology. One of the few research items mentioning theoretical foundations
- 42 is Candas et al. [21], who mention neurophysiological aspects related to multisensory
- integration in their introduction. However, they do not relate their review findings to such
- 44 approaches. The literature on multisensory integration [281-283] outlines first

- 1 explanations to what extend interactions can be additive, antagonistic, or synergetic. For
- 2 example, Talsma et al. [283] propose a framework that shows the interaction between
- 3 multi-physical perception and attention.
- 4 There are few studies linking perception and action. In behavioural studies, physical
- 5 quantities are assessed which relate to perceptual domains. For example, the assessed
- 6 indoor air temperature can be related to thermal perception. As such, the perception of
- 7 such physical indoor environmental qualities is an assumed prerequisite for the action.
- 8 Given the low observed correlations between observed physical variables and behavioural
- 9 actions (R² are frequently below .2), it might be necessary to include additional variables or
- 10 to consider different approaches to understand occupant behaviour. Thereby, several
- aspects are to be considered. First, perceptual studies show a large variance between and
- within individuals in the perception of the same physical stimuli. Second, theories in the
- 13 field of psychology together with empirical findings suggest a difference between the
- intention to perform an action and the action itself [284-286]. Not surprisingly, previous
- research has revealed a multitude of factors influencing occupant behaviour [5], which
- potentially affect the relationship between intention and action (e.g., the level of perceived
- 17 control, the distance to means of control, or other work tasks that require full attention).
- 18 Therefore, we recommend looking further at the relationship between perception and
- 19 action and evaluating whether those contextual and personal factors affecting behaviour
- 20 effect perception and vice versa.

21 **6.4 Future directions**

- 22 Based on the results and discussion presented in this review, we propose the following
- points to be considered by authors and reviewers of future multi-domain approaches.
- 24 The first point is easily applicable and pointing to a limitation of this review: keywords for
- 25 multi-domain studies. Commonly, an *a priori* defined set of search terms is used for a
- 26 systematic review. However, an initial review of keywords used by a selection of relevant
- 27 multi-domain articles revealed that the keywords for the individual domains investigated
- are used, but no specific keyword to clarify the multi-domain approach. Therefore, a
- 29 systematic search through a set of keywords would have required searching for all possible
- 30 combinations of individual domain keywords. Given the number of authors involved and
- 31 their diverse backgrounds from different domains, we decided to start with the collection of
- 32 articles known to us in combination with a backward and forward search of cited or citing
- 33 articles. This strategy might have failed to find all relevant research items. However,
- 34 articles, which have not been cited or do not cite any of the 200+ articles considered for this
- review might be of minor relevance and likely not adding much to our general conclusions.
- 36 Still, we suggest future studies to use a unique keyword such as "multi-domain" or
- 37 "combined effects" in order to facilitate future review efforts.
- 38 Second, researchers should clarify whether their research is intended to explore new
- influences, i.e. supporting the development of new theories or the extension of existing
- 40 ones, or test an existing theory. In addition, researchers should clearly state the limitations
- of their studies, especially when dealing with small samples, discuss the applicability and
- 42 comparability of results in the context of existing knowledge, and be careful with false
- causalities arising from unobserved confounding factors. Thereby, generalization is

- 1 relevant to find common patterns. However, addressing individual differences and
- 2 revealing factors leading to such differences, even for single cases, is of high importance in
- 3 order to consider outliers as valuable points of information. The latter assertion is valid
- 4 either because these points are true outliers and explanations available (see e.g. O'Brien et
- 5 al. [287] for a qualitative approach to explain outliers). Or, because they point to
- 6 methodological issues (e.g., the question asked is prone to misinterpretation under specific
- 7 circumstances).
- 8 Third, advanced statistical analysis methods for capturing interactions and their complexity
- 9 are recommended. Aside from the application of multiple regression including interaction
- terms, hierarchical modelling or structural equation modelling, which permit
- understanding of interdependent relationships are appropriate methods for this task.
- 12 Additionally, analysis methods derived from machine learning approaches may be useful to
- detect underlying patterns in large and rich datasets. When reporting statistical results,
- significant levels together with effect sizes are crucial information for later meta-analysis.
- 15 Fourth, missing agreement on classification of contextual and personal variables leads to
- the same terms used for different aspects. Therefore, general classifications (e.g., "green
- buildings") should be avoided in favour of explicit descriptions (e.g., LEED Platinum
- 18 certified buildings).
- 19 Fifth, interactions are complex by nature. Given the large variety of potential interactions
- between physical, contextual and personal variables, collective approaches, which build
- 21 upon the knowledge generated, are necessary. We thus encourage researchers to join or
- 22 establish collaborative activities such as those developed within international research
- 23 groups like the IEA EBC Annex 79 "Occupant-Centric Building Design and Operation"
- 24 (http://annex79.iea-ebc.org/), which is the basis for this review. Moreover, a common
- 25 framework is necessary, which facilitates meta-analysis efforts in the future and allows
- aligning one's own research into the line of previous research. As a start, our review table is
- 27 available as a dynamic open-access document permitting others to add their research
- related to multi-domain approaches
- 29 (https://osf.io/gnvp2/?view only=00b08233881f471795d1d8dee79e9828). We hope that
- 30 this document will serve as a growing knowledge base to increase collectively our
- 31 knowledge related to multi-domain influences on perception and behaviour.
- 32 Sixth is the balance between benefit and risk of increasing the complexity of perceptual or
- 33 behavioural models partly addressed in behavioural studies by means of statistical
- 34 measures such as Akaikes Information Criterion [288]. Future studies need to investigate
- under which circumstances additional factors are meaningful, given issues such as over-
- 36 fitting and error propagation. This question is best answered based on a solid theoretical
- foundation together with a clear description of the potential application of the results.
- 38 Combining all these conclusions necessitates designing studies within a framework of
- 39 occupant perception and behaviour that accounts for the complexity of the physiological-
- 40 perception-cognition-decision-action-automation-building system. First examples for such
- frameworks have been proposed [289; 290] and attempts to challenge them by means of
- 42 field or laboratory studies are highly recommended. In addition, the development of
- 43 guidelines on this topic is an expected future development of this work.

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References

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- [1] N.E. Klepeis, W.C. Nelson, W.R. Ott, J.P. Robinson, A.M. Tsang, P. Switzer, J.V. Behar, S.C.
- Hern, W.H. Engelmann, The National Human Activity Pattern Survey (NHAPS): a resource
- for assessing exposure to environmental pollutants, Journal of Exposure Science &
- 29 Environmental Epidemiology. 11 (2001) 231–252. https://doi.org/10.1038/sj.jea.7500165.
- 30 [2] C. Schweizer, R.D. Edwards, L. Bayer-Oglesby, W.J. Gauderman, V. Ilacqua, M. Juhani
- 31 Jantunen, H.K. Lai, M. Nieuwenhuijsen, N. Künzli, Indoor time-microenvironment-activity
- 32 patterns in seven regions of Europe, Journal of Exposure Science & Environmental
- 33 Epidemiology. 17 (2007) 170–181. https://doi.org/10.1038/sj.jes.7500490.
- 34 [3] Z. Yu, B.C.M. Fung, F. Haghighat, H. Yoshino, E. Morofsky, A systematic procedure to
- 35 study the influence of occupant behavior on building energy consumption, Energy and
- 36 Buildings. 43 (2011) 1409–1417. https://doi.org/10.1016/j.enbuild.2011.02.002.

- 1 [4] ASHRAE, Guideline 10-2016 Interactions Affecting the Achievement of Acceptable
- 2 Indoor Environments, American Society of Heating, Refrigerating and Air-Conditioning
- 3 Engineering, Atlanta, USA. (2016).
- 4 [5] M. Schweiker, S. Carlucci, R.K. Andersen, B. Dong, W. O'Brien, Occupancy and occupants'
- 5 actions, in: Exploring Occupant Behavior in Buildings: Methods and Challenges, Springer
- 6 International Publishing, 2017: pp. 7–38. https://doi.org/10.1007/978-3-319-61464-9_2.
- 7 [6] M.A. Ortiz, S.R. Kurvers, P.M. Bluyssen, A review of comfort, health, and energy use:
- 8 Understanding daily energy use and wellbeing for the development of a new approach to
- 9 study comfort, Energy and Buildings. 152 (2017) 323–335.
- 10 https://doi.org/10.1016/j.enbuild.2017.07.060.
- 11 [7] R.F. Rupp, N.G. Vásquez, R. Lamberts, A review of human thermal comfort in the built
- 12 environment, Energy and Buildings. 105 (2015) 178–205.
- 13 https://doi.org/10.1016/j.enbuild.2015.07.047.
- 14 [8] M. Schweiker, G.M. Huebner, B.R.M. Kingma, R. Kramer, H. Pallubinsky, Drivers of
- diversity in human thermal perception A review for holistic comfort models,
- Temperature. 5 (2018) 308–342. https://doi.org/10.1080/23328940.2018.1534490.
- 17 [9] L. Edwards, P. Torcellini, Literature Review of the Effects of Natural Light on Building
- 18 Occupants, NREL, 2006. https://doi.org/10.2172/15000841.
- 19 [10] A.D. Galasiu, J.A. Veitch, Occupant preferences and satisfaction with the luminous
- 20 environment and control systems in daylit offices: a literature review, Energy and
- 21 Buildings. 38 (2006) 728–742. https://doi.org/10.1016/j.enbuild.2006.03.001.
- 22 [11] C. Pierson, J. Wienold, M. Bodart, Review of Factors Influencing Discomfort Glare
- 23 Perception from Daylight, LEUKOS Journal of Illuminating Engineering Society of North
- 24 America. 14 (2018) 111–148. https://doi.org/10.1080/15502724.2018.1428617.
- 25 [12] K.G. Van Den Wymelenberg, Visual comfort, discomfort glare, and occupant
- 26 fenestration control: Developing a research agenda, LEUKOS Journal of Illuminating
- 27 Engineering Society of North America. 10 (2014) 207–221.
- 28 https://doi.org/10.1080/15502724.2014.939004.
- [13] J.M. Daisey, W.J. Angell, M.G. Apte, Indoor air quality, ventilation and health symptoms
- in schools: an analysis of existing information, Indoor Air. 13 (2003) 53–64.
- 31 [14] N.-G. Vardaxis, D. Bard, K. Persson Waye, Review of acoustic comfort evaluation in
- 32 dwellings—part I: Associations of acoustic field data to subjective responses from building
- 33 surveys, Building Acoustics. 25 (2018) 151–170.
- 34 https://doi.org/10.1177/1351010X18762687.
- 35 [15] N.-G. Vardaxis, D. Bard, Review of acoustic comfort evaluation in dwellings: part II—
- 36 impact sound data associated with subjective responses in laboratory tests, Building
- 37 Acoustics. 25 (2018) 171–192. https://doi.org/10.1177/1351010X18772026.
- 38 [16] K.W. Ma, H.M. Wong, C.M. Mak, A systematic review of human perceptual dimensions of
- 39 sound: Meta-analysis of semantic differential method applications to indoor and outdoor

- 1 sounds, Building and Environment. 133 (2018) 123–150.
- 2 https://doi.org/10.1016/j.buildenv.2018.02.021.
- 3 [17] T. Hong, S.C. Taylor-Lange, S. D'Oca, D. Yan, S.P. Corgnati, Advances in research and
- 4 applications of energy-related occupant behavior in buildings, Energy and Buildings. 116
- 5 (2016) 694–702. https://doi.org/10.1016/j.enbuild.2015.11.052.
- 6 [18] F. Stazi, F. Naspi, M. D'Orazio, A literature review on driving factors and contextual
- 7 events influencing occupants' behaviours in buildings, Building and Environment. 118
- 8 (2017) 40–66. https://doi.org/10.1016/j.buildenv.2017.03.021.
- 9 [19] K. Van Den Wymelenberg, Patterns of occupant interaction with window blinds: A
- 10 literature review, Energy and Buildings. 51 (2012) 165–176.
- 11 https://doi.org/10.1016/j.enbuild.2012.05.008.
- 12 [20] S. Torresin, G. Pernigotto, F. Cappelletti, A. Gasparella, Combined effects of
- environmental factors on human perception and objective performance: A review of
- experimental laboratory works, Indoor Air. 28 (2018) 525–538.
- 15 https://doi.org/10.1111/ina.12457.
- 16 [21] V. Candas, A. Dufour, Thermal Comfort: Multisensory Interactions?, Journal of
- 17 PHYSIOLOGICAL ANTHROPOLOGY and Applied Human Science. 24 (2005) 33–36.
- 18 https://doi.org/10.2114/jpa.24.33.
- 19 [22] L.H. Centnerová, A.C. Boerstra, Comfort is more than just thermal comfort, Adapting to
- 20 Change: New Thinking on Comfort. (2010) 9–11.
- 21 http://nceub.commoncense.info/uploads/26-01-06-Centnerova.pdf.
- 22 [23] M. Frontczak, P. Wargocki, Literature survey on how different factors influence human
- comfort in indoor environments, Building and Environment. 46 (2011) 922–937.
- 24 https://doi.org/10.1016/j.buildenv.2010.10.021.
- 25 [24] W. O'Brien, H.B. Gunay, F. Tahmasebi, A. Mahdavi, A preliminary study of representing
- 26 the inter-occupant diversity in occupant modelling, Journal of Building Performance
- 27 Simulation. 10 (2017) 509–526. https://doi.org/10.1080/19401493.2016.1261943.
- 28 [25] D. Moher, A. Liberati, J. Tetzlaff, D.G. Altman, T.P.R.I.S.M.A. Group, Preferred Reporting
- 29 Items for Systematic Reviews and Meta-Analyses: The PRISMA Statement, PLOS Medicine. 6
- 30 (2009) 1–6. https://doi.org/10.1371/journal.pmed.1000097.
- 31 [26] M.J. Grant, A. Booth, A typology of reviews: an analysis of 14 review types and
- 32 associated methodologies, Health Information & Libraries Journal. 26 (2009) 91–108.
- 33 https://doi.org/10.1111/j.1471-1842.2009.00848.x.
- 34 [27] M. Frontczak, S. Schiavon, J. Goins, E. Arens, H. Zhang, P. Wargocki, Quantitative
- relationships between occupant satisfaction and satisfaction aspects of indoor
- environmental quality and building design., Indoor Air. 22 (2012) 119–31.
- 37 https://doi.org/10.1111/j.1600-0668.2011.00745.x.

- 1 [28] C. Huizenga, S. Abbaszadeh, L. Zagreus, E. Arens, Air Quality and Thermal Comfort in
- 2 Office Buildings: Results of a Large Indoor Environmental Quality Survey, 2006.
- 3 http://cbe.berkeley.edu.
- 4 [29] A. Roetzel, M. DeKay, A. Nakai Kidd, A. Klas, A.-M. Sadick, V. Whittem, L. Zinkiewicz,
- 5 Architectural, Indoor Environmental, Personal And Cultural Influences On Students'
- 6 Selection Of A Preferred Place To Study, Architectural Science Review. (2019).
- 7 https://mc.manuscriptcentral.com/asre.
- 8 [30] R. Hitchings, G. Waitt, K. Roggeveen, C. Chisholm, Winter cold in a summer place:
- 9 Perceived norms of seasonal adaptation and cultures of home heating in Australia, Energy
- 10 Research and Social Science. 8 (2015) 162–172.
- 11 https://doi.org/10.1016/j.erss.2015.05.007.
- 12 [31] V.M. Barthelmes, Y. Heo, V. Fabi, S.P. Corgnati, Exploration of the Bayesian Network
- 13 framework for modelling window control behaviour, Building and Environment. 126
- 14 (2017) 318–330. https://doi.org/10.1016/j.buildenv.2017.10.011.
- 15 [32] F. Albers, J. Maier, C. Marggraf-Micheel, In search of evidence for the hue-heat
- hypothesis in the aircraft cabin, Lighting Research and Technology. 47 (2014) 483–494.
- 17 https://doi.org/10.1177/1477153514546784.
- 18 [33] C.J. Anumba, Y. Abraham, Z. Zhao, S. Asadi, Innovations for Wellbeing Occupant-Related
- 19 Energy Use: a Oatar Office Case Study, in: World Sustainable Built Environment Conference
- 20 2017 Hong Kong, 2017.
- 21 [34] H. Azmoon, H. Dehghan, J. Akbari, S. Souri, The Relationship between Thermal Comfort
- 22 and Light Intensity with Sleep Quality and Eye Tiredness in Shift Work Nurses, Journal of
- 23 Environmental and Public Health. 2013 (2013) 1–5.
- 24 https://doi.org/10.1155/2013/639184.
- 25 [35] I. Balazova, G. Clausen, D.P. Wyon, The influence of exposure to multiple indoor
- 26 environmental parameters on human perception, performance and motivation, Clima 2007
- 27 WellBeing Indoors. (2007).
- 28 [36] R.R. Baniya, E. Tetri, J. Virtanen, L. Halonen, The effect of correlated colour temperature
- of lighting on thermal sensation and thermal comfort in a simulated indoor workplace,
- 30 Indoor and Built Environment. 27 (2018) 308–316.
- 31 https://doi.org/10.1177/1420326X16673214.
- 32 [37] C.A. Bennett, P. Rey, What's So Hot About Red?, Human Factors. 14 (1972) 149–154.
- 33 [38] P.C. Berry, Effect of colored illumination upon perceived temperature 1, 1961.
- 34 [39] G. Chinazzo, J. Wienold, M. Andersen, Combined effects of daylight transmitted through
- 35 coloured glazing and indoor temperature on thermal responses and overall comfort,
- 36 Building and Environment. (2018). https://doi.org/10.1016/j.buildenv.2018.08.045.
- 37 [40] G. Clausen, D.P. Wyon, The Combined Effects of Many Different Indoor Environmental
- 38 Factors on Acceptability and Office Work Performance, HVAC&R Research. 14 (2008) 103-
- 39 113. https://doi.org/10.1080/10789669.2008.10390996.

- 1 [41] G. Clausen, L. Carrick, P.O. Fanger, S.W. Kim, T. Poulsen, J.H. Rindel, A comparative
- 2 study of discomfort caused by indoor air pollution, thermal load and noise, Indoor Air. 3
- 3 (1993) 255–262.
- 4 [42] N.D. Dahlan, Perceptive-cognitive aspects investigation in relation to indoor
- 5 environment satisfaction collected from naturally ventilated multi-storey student
- 6 accommodations in Malaysia, Indoor and Built Environment. 24 (2015) 116–127.
- 7 https://doi.org/10.1177/1420326X13506449.
- 8 [43] V. Fabi, S.P. Corgnati, R.V. Andersen, M. Filippi, B. Olesen, Effect of occupant behaviour
- 9 related influencing factors on final energy end uses in buildings, Journal of Chemical
- 10 Information and Modeling. 53 (2013) 1689–1699.
- 11 https://doi.org/10.1017/CB09781107415324.004.
- 12 [44] L. Fang, G. Clausen, P.O. Fanger, Impact of Temperature and Humidity on Perception of
- 13 Indoor Air Quality During Immediate and Longer Whole-Body Exposures, Indoor Air. 8
- 14 (1998) 276–284. https://doi.org/10.1111/j.1600-0668.1998.00008.x.
- 15 [45] P.O. Fanger, N.O. Breum, E. Jerking, Can colour and noise influence man's thermal
- 16 comfort?, Ergonomics. 20 (1977) 11–18. https://doi.org/10.1080/00140137708931596.
- 17 [46] S. Gauthier, G. Giakoumis, L. Bourikas, G.M. Giakoumis, P. James, Understanding
- window behaviour in a mixed-mode buildings and the impact on energy performance,
- 19 2016.
- 20 [47] Y. Geng, W. Ji, B. Lin, Y. Zhu, The impact of thermal environment on occupant IEQ
- 21 perception and productivity, Building and Environment. 121 (2017) 158–167.
- 22 https://doi.org/10.1016/j.buildenv.2017.05.022.
- 23 [48] L. Huang, Y. Zhu, Q. Ouyang, B. Cao, A study on the effects of thermal, luminous, and
- 24 acoustic environments on indoor environmental comfort in offices, Building and
- 25 Environment. 49 (2012) 304–309.
- 26 https://doi.org/https://doi.org/10.1016/j.buildenv.2011.07.022.
- 27 [49] A. Jamrozik, C. Ramos, J. Zhao, J. Bernau, N. Clements, T. Vetting Wolf, B. Bauer, A novel
- 28 methodology to realistically monitor office occupant reactions and environmental
- conditions using a living lab, Building and Environment. (2018).
- 30 https://doi.org/10.1016/j.buildenv.2017.12.024.
- 31 [50] A.C.K. Lai, K.W. Mui, L.T. Wong, L.Y. Law, An evaluation model for indoor environmental
- 32 quality (IEQ) acceptance in residential buildings, Energy and Buildings. 41 (2009) 930–936.
- 33 https://doi.org/10.1016/j.enbuild.2009.03.016.
- 34 [51] L. Lan, P. Wargocki, D.P. Wyon, Z. Lian, Effects of thermal discomfort in an office on
- 35 perceived air quality, SBS symptoms, physiological responses, and human performance,
- 36 Indoor Air. 21 (2011) 376–390. https://doi.org/10.1111/j.1600-0668.2011.00714.x.
- 37 [52] C. Laurentin, V. Bermtto, M. Fontoynont, Effect of thermal conditions and light source
- type on visual comfort appraisal, Lighting Research & Technology. 32 (2000) 223–233.
- 39 https://doi.org/10.1177/096032710003200406.

- 1 [53] M.C. Lee, K.W. Mui, L.T. Wong, W.Y. Chan, E.W.M. Lee, C.T. Cheung, Student learning
- 2 performance and indoor environmental quality (IEQ) in air-conditioned university teaching
- 3 rooms., Building and Environment. 49 (2012) 238–244.
- 4 [54] F. Martellotta, A. Simone, S. Della Crociata, M. D'Alba, Global comfort and indoor
- 5 environment quality attributes for workers of a hypermarket in Southern Italy, Building
- 6 and Environment. 95 (2016) 355–364. https://doi.org/10.1016/j.buildenv.2015.09.029.
- 7 [55] L. Mølhave, Z. Liu, A.H. Jørgensen, O.F. Pedersen, S.K. Kjægaard, Sensory And
- 8 Physiological Effects On Humans Of Combined Exposures To Air Temperatures And Volatile
- 9 Organic Compounds, Indoor Air. 3 (1993) 155–169. https://doi.org/10.1111/j.1600-
- 10 0668.1993.t01-1-00002.x.
- 11 [56] K. Nagano, T. Horikoshi, New comfort index during combined conditions of moderate
- low ambient temperature and traffic noise, Energy and Buildings. 37 (2005) 287–294.
- 13 https://doi.org/10.1016/j.enbuild.2004.08.001.
- 14 [57] Nagano K, Horikoshi T, New index of combined effect of temperature and noise on
- 15 human comfort: summer experiments on hot ambient temperature and traffic noise,
- 16 Archives of Complex Environmental Studies, 13 (2001).
- 17 [58] H. Nakamura, M. Oki, Influence of Air Temperature on Preference for Color
- 18 Temperature of General Lighting in the Room, Journal of the Human-Environment System. 4
- 19 (2000) 41–47. https://doi.org/10.1618/jhes.4.41.
- 20 [59] G. Newsham, S. Mancini, J. Veitch, R. Marchand, W. Lei, K. Charles, C. Arsenault, Control
- 21 strategies for lighting and ventilation in offices: Effects on energy and occupants, Intelligent
- 22 Buildings International. 1 (2009) 101–121. https://doi.org/10.3763/inbi.2009.0004.
- 23 [60] P.S. Nimlyat, Indoor environmental quality performance and occupants' satisfaction
- 24 [IEQPOS] as assessment criteria for green healthcare building rating, Building and
- 25 Environment. 144 (2018) 598–610. https://doi.org/10.1016/j.buildenv.2018.09.003.
- 26 [61] N. Pellerin, V. Candas, Effects of steady-state noise and temperature conditions on
- environmental perception and acceptability, Indoor Air. 14 (2004) 129–136.
- 28 https://doi.org/10.1046/j.1600-0668.2003.00221.x.
- 29 [62] P. Ricciardi, C. Buratti, Environmental quality of university classrooms: Subjective and
- 30 objective evaluation of the thermal, acoustic, and lighting comfort conditions, Building and
- 31 Environment. 127 (2018) 23-36.
- 32 [63] M. Te Kulve, L. Schellen, L. Schlangen, A. Frijns, W. Van, M. Lichtenbelt, Light intensity
- and thermal responses, Proceedings of Windsor conference, 2016. http://nceub.org.uk.
- 34 [64] M. Te Kulve, L. Schlangen, W. van Marken Lichtenbelt, Interactions between the
- perception of light and temperature, Indoor Air. 28 (2018) 881–891.
- 36 https://doi.org/10.1111/ina.12500.
- 37 [65] Y. Teramoto, H. Tokura, K. Ohkura, Y. Ohmasa, S. Suho, R. Inoshiri, M. Masuda, Effects of
- 38 different light intensities during the forenoon on the afternoon thermal sensation in mild

- 1 cold, Journal of Thermal Biology. 21 (1996) 339–343. https://doi.org/10.1016/S0306-
- 2 4565(96)00019-8.
- 3 [66] D. Tiller, L.M. Wang, A. Musser, M.J. Radik, Combined Effects of Noise and Temperature
- 4 on Human Comfort and Performance, ASHRAE Transactions. 116 (2010) 522–540.
- 5 [67] J. Toftum, A. Thorseth, J. Markvart, Á. Logadóttir, Occupant response to different
- 6 correlated colour temperatures of white LED lighting, Building and Environment. 143
- 7 (2018) 258–268. https://doi.org/10.1016/j.buildenv.2018.07.013.
- 8 [68] J. Varjo, V. Hongisto, A. Haapakangas, H. Maula, H. Koskela, J. Hyönä, Simultaneous
- 9 effects of irrelevant speech, temperature and ventilation rate on performance and
- satisfaction in open-plan offices, Journal of Environmental Psychology. 44 (2015) 16–33.
- 11 https://doi.org/10.1016/j.jenvp.2015.08.001.
- 12 [69] J. Winzen, F. Albers, C. Marggraf-Micheel, The influence of coloured light in the aircraft
- cabin on passenger thermal comfort, Lighting Research and Technology. 46 (2014) 465–
- 14 475. https://doi.org/10.1177/1477153513484028.
- 15 [70] T. Witterseh, D.P. Wyon, G. Clausen, The effects of moderate heat stress and open-plan
- office noise distraction on SBS symptoms and on the performance of office work, Indoor Air.
- 17 14 (2004) 30-40. https://doi.org/10.1111/j.1600-0668.2004.00305.x.
- 18 [71] L.T. Wong, K.W. Mui, P.S. Hui, A multivariate-logistic model for acceptance of indoor
- environmental quality (IEQ) in offices, Building and Environment. 43 (2008) 1–6.
- 20 [72] P. Xue, C. Mak, Z. Ai, A structured approach to overall environmental satisfaction in
- 21 high-rise residential buildings, Energy and Buildings. 116 (2016) 181–189.
- [73] K. Yamazaki, S. Nomoto, Y. Yokota, T. Murai, The effects of temperature, light, and
- 23 sound on perceived work environment, ASHRAE Transactions. 104 (1998) 711.
- 24 [74] Yang, Moon, Jeon, Comparison of Response Scales as Measures of Indoor
- 25 Environmental Perception in Combined Thermal and Acoustic Conditions, Sustainability. 11
- 26 (2019) 3975. https://doi.org/10.3390/su11143975.
- 27 [75] W. Yang, H.J. Moon, Cross-modal effects of illuminance and room temperature on
- 28 indoor environmental perception, Building and Environment. 146 (2018) 280–288.
- 29 https://doi.org/10.1016/j.buildenv.2018.10.007.
- 30 [76] W. Yang, H.I. Moon, M.I. Kim, Combined effects of short-term noise exposure and
- 31 hygrothermal conditions on indoor environmental perceptions, Indoor and Built
- 32 Environment. 27 (2018) 1119–1133. https://doi.org/10.1177/1420326X17703774.
- 33 [77] W. Yang, M.J. Kim, H.J. Moon, Effects of indoor temperature and background noise on
- 34 floor impact noise perception, Indoor and Built Environment. 28 (2019) 454–469.
- 35 https://doi.org/10.1177/1420326X17753708.
- 36 [78] M.S. Andargie, E. Azar, An applied framework to evaluate the impact of indoor office
- 37 environmental factors on occupants' comfort and working conditions, Sustainable Cities
- 38 and Society. 46 (2019) 101447. https://doi.org/10.1016/j.scs.2019.101447.

- 1 [79] W. Yang, H.J. Moon, Combined effects of acoustic, thermal, and illumination conditions
- 2 on the comfort of discrete senses and overall indoor environment, Building and
- 3 Environment. 148 (2019) 623–633. https://doi.org/10.1016/j.buildenv.2018.11.040.
- 4 [80] S.G. Hodder, K. Parsons, The effects of solar radiation on thermal comfort, International
- 5 Journal of Biometeorology. 51 (2007) 233–250. https://doi.org/10.1007/s00484-006-
- 6 0050-v.
- 7 [81] W. Yang, H.J. Moon, Combined effects of sound and illuminance on indoor
- 8 environmental perception, Applied Acoustics. 141 (2018) 136–143.
- 9 https://doi.org/10.1016/j.apacoust.2018.07.008.
- 10 [82] S. Gauthier, ; B. Liu, ; G. Huebner, ; D. Shipworth, Investigating the effect of CO2
- concentration on reported thermal comfort, in: Proceedings of CISBAT 2015 International
- 12 Conference on Future Buildings and Districts, 2015.
- 13 [83] Z. Pan, S.K. Kjaergaard, L. Mølhave, A chamber-experiment investigation of the
- 14 interaction between perceptions of noise and odor in humans, International Archives of
- Occupational and Environmental Health. 76 (2003) 598–604.
- 16 https://doi.org/10.1007/s00420-003-0464-3.
- 17 [84] E. Siekierski, V. Roussarie, S. Viollon, S. Ségrétain, S. Bojago, What's so hot about
- sound?-influence of HVAC sounds on thermal comfort, in: Proceedings of INTERNOISE
- 19 2005, 2005. https://www.researchgate.net/publication/288628328.
- 20 [85] H. Ma, W. Nie, Influence of visual factors on noise annoyance evaluation caused by road
- 21 traffic noise in indoor environment, in: Inter Noise 2014, Melbourne, Australia, 2014.
- 22 [86] I. Golasi, F. Salata, E.de L. Vollaro, A. Peña-García, Influence of lighting colour
- 23 temperature on indoor thermal perception: A strategy to save energy from the HVAC
- installations, Energy and Buildings. 185 (2019) 112–122.
- 25 https://doi.org/https://doi.org/10.1016/j.enbuild.2018.12.026.
- 26 [87] H. Wang, G. Liu, S. Hu, C. Liu, Experimental investigation about thermal effect of colour
- on thermal sensation and comfort, Energy and Buildings. 173 (2018) 710–718.
- 28 https://doi.org/https://doi.org/10.1016/j.enbuild.2018.06.008.
- 29 [88] H.N. Ho, D. Iwai, Y. Yoshikawa, J. Watanabe, S.Y. Nishida, Combined effects of sound and
- illuminance on indoor environmental perception, Applied Acoustics. 141 (2018) 163–143.
- 31 https://doi.org/10.1016/j.apacoust.2018.07.008.
- 32 [89] N. Matsubara, A. Gassho, Y. Kurazumi, Facilitatory Effects of Environmental Sounds on
- Hue-heat Phenomena, The International Conference on Acoustics. (2004) 1775–1778.
- 34 [90] M. Ziat, C.A. Balcer, A. Shirtz, T. Rolison, A century later, the hue-heat hypothesis: Does
- 35 color truly affect temperature perception?, in: Lecture Notes in Computer Science
- 36 (Including Subseries Lecture Notes in Artificial Intelligence and Lecture Notes in
- 37 Bioinformatics), 2016. https://doi.org/10.1007/978-3-319-42321-0 25.

- 1 [91] H. Tang, Y. Ding, B. Singer, Interactions and comprehensive effect of indoor
- 2 environmental quality factors on occupant satisfaction, Building and Environment. 167
- 3 (2019) 106462. https://doi.org/10.1016/j.buildenv.2019.106462.
- 4 [92] F. Haldi, D. Robinson, On the unification of thermal perception and adaptive actions,
- 5 Building and Environment. 45 (2010) 2440–2457.
- 6 https://doi.org/10.1016/j.buildenv.2010.05.010.
- 7 [93] B. Cao, Q. Ouyang, Y. Zhu, L. Huang, H. Hu, G. Deng, Development of a multivariate
- 8 regression model for overall satisfaction in public buildings based on field studies in Beijing
- 9 and Shanghai, Building and Environment. 47 (2012) 394–399.
- 10 https://doi.org/10.1016/j.buildenv.2011.06.022.
- 11 [94] T. Mihai, V. Iordache, Determining the Indoor Environment Quality for an Educational
- Building, in: Energy Procedia, Elsevier Ltd, 2016: pp. 566–574.
- 13 https://doi.org/10.1016/j.egypro.2015.12.246.
- 14 [95] L. Pronk, The combined effects of temperature, background noise and lighting on the
- non-physical task performance of university students, (2008).
- 16 [96] K. Nagano, T. Horikoshi, Development of Equi-comfort Charts Constituted with
- 17 Temperature and Noise at 150 and 3 lx, Proceedings of Indoor Air. (2014).
- 18 [97] S.C. Sekhar, S.E. Goh, Thermal comfort and IAQ characteristics of
- 19 naturally/mechanically ventilated and air-conditioned bedrooms in a hot and humid
- 20 climate, Building and Environment. 46 (2011) 1905–1916.
- 21 https://doi.org/https://doi.org/10.1016/j.buildenv.2011.03.012.
- 22 [98] C.-M. Chiang, C.-M. Lai, A study on the comprehensive indicator of indoor environment
- assessment for occupants' health in Taiwan, Building and Environment. 37 (2002) 387–
- 24 392. https://doi.org/https://doi.org/10.1016/S0360-1323(01)00034-8.
- 25 [99] M. Ncube, S. Riffat, Developing an indoor environment quality tool for assessment of
- 26 mechanically ventilated office buildings in the UK A preliminary study, Building and
- 27 Environment. 53 (2012) 26–33.
- 28 https://doi.org/https://doi.org/10.1016/j.buildenv.2012.01.003.
- 29 [100] F. Fassio, A. Fanchiotti, R.D.L. Vollaro, Linear, Non-Linear and Alternative Algorithms
- in the Correlation of IEO Factors with Global Comfort: A Case Study, Sustainability. 6 (2014)
- 31 8113-8127.
- 32 [101] A.A. Hettiarachchi, R. Emmanuel, Colour as a psychological agent to manipulate
- 33 perceived indoor thermal environment for effective energy usage; cases implemented in Sri
- 34 Lanka, in: PLEA 2017 Edinburgh, 2017.
- 35 [102] G. Chinazzo, J. Wienold, M. Andersen, Variation in thermal, visual and overall comfort
- 36 evaluation under coloured glazing at different temperature levels, Journal of the
- 37 International Colour Association. (2019) 45–54. http://www.aic-
- colour.org/journal.htm{%}7Chttp://www.aic-color.org/journal.htm.

- 1 [103] G. Chinazzo, J. Wienold, M. Andersen, Daylight affects human thermal perception,
- 2 Scientific Reports. 9 (2019) 13690. https://doi.org/10.1038/s41598-019-48963-y.
- 3 [104] M. te Kulve, L. Schellen, L.J.M. Schlangen, W.D. van Marken Lichtenbelt, The influence
- 4 of light on thermal responses, Acta Physiologica. 216 (2016) 163–185.
- 5 https://doi.org/10.1111/apha.12552.
- 6 [105] C. Buratti, E. Belloni, F. Merli, P. Ricciardi, A new index combining thermal, acoustic,
- 7 and visual comfort of moderate environments in temperate climates, Building and
- 8 Environment. 139 (2018) 27–37. https://doi.org/10.1016/j.buildenv.2018.04.038.
- 9 [106] G. Chinazzo, L. Pastore, J. Wienold, M. Andersen, A field study investigation on the
- influence of light level on subjective thermal perception in different seasons, Windsor
- 11 Conference. Rethinking Comfort. (2018).
- 12 [107] N. Pellerin, V. Candas, Combined effects of temperature and noise on human
- discomfort, Physiology and Behavior. 78 (2003) 99–106.
- 14 [108] W. Yang, H.J. Moon, Cross-modal effects of noise and thermal conditions on indoor
- environmental perception and speech recognition, Applied Acoustics. 141 (2018) 1–8.
- 16 https://doi.org/10.1016/j.apacoust.2018.06.019.
- 17 [109] W. Yang, H.J. Moon, Effects of recorded water sounds on intrusive traffic noise
- perception under three indoor temperatures, Applied Acoustics. 145 (2019) 234–244.
- 19 https://doi.org/10.1016/j.apacoust.2018.10.015.
- 20 [110] G. Diaper, The Hawthorne Effect: a fresh examination, Educational Studies. 16 (1990)
- 21 261–267. https://doi.org/10.1080/0305569900160305.
- 22 [114] H.M. Parsons, What Happened at Hawthorne?, Science. 183 (1974) 922 LP 932.
- 23 https://doi.org/10.1126/science.183.4128.922.
- 24 [112] N. Baker, M. Standeven, A behavioural approach to thermal comfort assessment,
- 25 International Journal of Solar Energy. 19 (1997) 21–35.
- 26 https://doi.org/10.1080/01425919708914329.
- 27 [113] I. Balazova, G. Clausen, J.H. Rindel, T.T. Poulsen, D.P. Wyon, Open-plan office
- 28 environments: A laboratory experiment to examine the effect of office noise and
- temperature on human perception, comfort and office work performance, (2008).
- 30 https://www.semanticscholar.org/paper/Open-plan-office-environments{%}3A-A-
- 31 laboratory-to-the-Balazova-Clausen/10cb448cac558b19a1fa18d052de16cce79141fe.
- 32 [114] D. Blankenberger, K. Van Den Wymelenberg, J. Stenson, Visual effects of wood on
- thermal perception of interior environments, in: ARCC Conference Repository, 2019.
- 34 https://www.arcc-journal.org/index.php/repository/article/view/619.
- 35 [115] P.R. Boyce, N.H. Eklund, S.N. Simpson, Individual lighting control: Task performance,
- mood, and illuminance, Journal of the Illuminating Engineering Society. 29 (2000) 131–142.
- 37 https://doi.org/10.1080/00994480.2000.10748488.

- 1 [116] Z. Brown, R.J. Cole, Influence of occupants' knowledge on comfort expectations and
- behaviour, Building Research & Information. 37 (2009) 227–245.
- 3 https://doi.org/10.1080/09613210902794135.
- 4 [117] V. Butala, S. Muhič, Perception of air quality and the thermal environment in offices,
- 5 Indoor and Built Environment. 16 (2007) 302–310.
- 6 https://doi.org/10.1177/1420326X06079886.
- 7 [118] V.L. Castaldo, I. Pigliautile, F. Rosso, F. Cotana, F. De Giorgio, A.L. Pisello, How
- 8 subjective and non-physical parameters affect occupants' environmental comfort
- 9 perception, Energy and Buildings. 178 (2018) 107–129.
- 10 https://doi.org/10.1016/j.enbuild.2018.08.020.
- 11 [119] J.H. Choi, J. Moon, Impacts of human and spatial factors on user satisfaction in office
- environments, Building and Environment. 114 (2017) 23–35.
- 13 https://doi.org/10.1016/j.buildenv.2016.12.003.
- 14 [120] S.P. Corgnati, M. Filippi, S. Viazzo, Perception of the thermal environment in high
- school and university classrooms: Subjective preferences and thermal comfort, Building
- and Environment. 42 (2007) 951–959. https://doi.org/10.1016/j.buildenv.2005.10.027.
- 17 [121] N.D. Dahlan, P.J. Jones, D.K. Alexander, E. Salleh, J. Alias, Evidence base prioritisation
- of indoor comfort perceptions in Malaysian typical multi-storey hostels, Building and
- 19 Environment. 44 (2009) 2158–2165. https://doi.org/10.1016/j.buildenv.2009.03.010.
- 20 [122] R. de Dear, J. Kim, T. Parkinson, Residential adaptive comfort in a humid subtropical
- climate—Sydney Australia, Energy and Buildings. 158 (2018) 1296–1305.
- 22 https://doi.org/10.1016/j.enbuild.2017.11.028.
- 23 [123] V. De Giuli, R. Zecchin, L. Corain, L. Salmaso, Measurements of indoor environmental
- 24 conditions in Italian classrooms and their impact on childrens comfort, Indoor and Built
- 25 Environment. 24 (2015) 689–712. https://doi.org/10.1177/1420326X14530586.
- 26 [124] S. Dhaka, J. Mathur, A. Wagner, G.D. Agarwal, V. Garg, Evaluation of thermal
- 27 environmental conditions and thermal perception at naturally ventilated hostels of
- undergraduate students in composite climate, Building and Environment. 66 (2013) 42–53.
- 29 https://doi.org/10.1016/J.BUILDENV.2013.04.015.
- 30 [125] K. Freihoefer, D. Guerin, C. Martin, H.Y. Kim, J.K. Brigham, Occupants' satisfaction with,
- and physical readings of, thermal, acoustic, and lighting conditions of sustainable office
- workspaces, Indoor and Built Environment. 24 (2015) 457–472.
- 33 https://doi.org/10.1177/1420326X13514595.
- 34 [126] J.Y. Garretón, R. Rodriguez, A. Pattini, Effects of perceived indoor temperature on
- daylight glare perception, Building Research and Information. 44 (2016) 907–919.
- 36 https://doi.org/10.1080/09613218.2016.1103116.
- 37 [127] Z. Gou, S.S.Y. Lau, Z. Zhang, A comparison of indoor environmental satisfaction
- 38 between two green buildings and a conventional building in China, Journal of Green
- 39 Building. 7 (2012) 89–104. https://doi.org/10.3992/jgb.7.2.89.

- 1 [128] Z. Gou, D. Prasad, S. Siu-Yu Lau, Are green buildings more satisfactory and
- 2 comfortable?, Habitat International. 39 (2013) 156–161.
- 3 https://doi.org/10.1016/j.habitatint.2012.12.007.
- 4 [129] M.A. Humphreys, Quantifying occupant comfort: are combined indices of the indoor
- 5 environment practicable?, Building Research & Information. 33 (2005) 317–325.
- 6 https://doi.org/10.1080/09613210500161950.
- 7 [130] S. Karjalainen, Thermal comfort and use of thermostats in Finnish homes and offices,
- 8 Building and Environment. 44 (2009) 1237–1245.
- 9 https://doi.org/10.1016/j.buildenv.2008.09.002.
- 10 [131] J. Kim, R. De Dear, Impact of different building ventilation modes on occupant
- expectations of the main IEQ factors, Building and Environment. 57 (2012) 184–193.
- 12 https://doi.org/10.1016/j.buildenv.2012.05.003.
- 13 [132] D.H. Kim, K.P. Mansfield, A cross-cultural study on perceived lighting quality and
- occupants' well-being between UK and South Korea, Energy and Buildings. 119 (2016) 211–
- 15 217. https://doi.org/10.1016/j.enbuild.2016.03.033.
- 16 [133] Z. Kong, D.M. Utzinger, K. Freihoefer, T. Steege, The impact of interior design on visual
- discomfort reduction: A field study integrating lighting environments with POE survey,
- 18 Building and Environment. 138 (2018) 135–148.
- 19 https://doi.org/10.1016/j.buildenv.2018.04.025.
- 20 [134] P. Kosmopoulos, D. Galanos, D. Anastaselos, A.M. Papadopoulos, An assessment of the
- 21 overall comfort sensation in workplaces, International Journal of Ventilation. 10 (2012)
- 22 311–322. https://doi.org/10.1080/14733315.2012.11683958.
- 23 [135] Y.S. Lee, D.A. Guerin, Indoor Environmental Quality Related to Occupant Satisfaction
- 24 and Performance in LEED-certified Buildings, Indoor and Built Environment. 18 (2009)
- 25 293-300. https://doi.org/10.1177/1420326X09105455.
- 26 [136] H.H. Liang, C.P. Chen, R.L. Hwang, W.M. Shih, S.C. Lo, H.Y. Liao, Satisfaction of
- occupants toward indoor environment quality of certified green office buildings in Taiwan,
- 28 Building and Environment. 72 (2014) 232–242.
- 29 https://doi.org/10.1016/j.buildenv.2013.11.007.
- 30 [137] H. Lou, D. Ou, A comparative field study of indoor environmental quality in two types
- of open-plan offices: Open-plan administrative offices and open-plan research offices,
- 32 Building and Environment. 148 (2019) 394–404.
- 33 https://doi.org/10.1016/j.buildenv.2018.11.022.
- 34 [138] G. Liu, C. Cen, Q. Zhang, K. Liu, R. Dang, Field study on thermal comfort of passenger at
- 35 high-speed railway station in transition season, Building and Environment. 108 (2016)
- 36 220–229. https://doi.org/10.1016/j.buildenv.2016.09.003.
- 37 [139] G. Mangone, S.R. Kurvers, P.G. Luscuere, Constructing thermal comfort: Investigating
- 38 the effect of vegetation on indoor thermal comfort through a four season thermal comfort

- 1 quasi-experiment, Building and Environment. 81 (2014) 410–426.
- 2 https://doi.org/10.1016/j.buildenv.2014.07.019.
- 3 [140] S. Manu, Y. Shukla, R. Rawal, L.E. Thomas, R. de Dear, Field studies of thermal comfort
- 4 across multiple climate zones for the subcontinent: India Model for Adaptive Comfort
- 5 (IMAC), Building and Environment. 98 (2016) 55–70.
- 6 https://doi.org/10.1016/j.buildenv.2015.12.019.
- 7 [141] Q. Meng, J. Kang, H. Jin, Field study on the influence of spatial and environmental
- 8 characteristics on the evaluation of subjective loudness and acoustic comfort in
- 9 underground shopping streets, Applied Acoustics. 74 (2013) 1001–1009.
- 10 https://doi.org/10.1016/j.apacoust.2013.02.003.
- 11 [142] Q. Meng, S. Zhang, J. Kang, Effects of typical dining styles on conversation behaviours
- and acoustic perception in restaurants in China, Building and Environment. 121 (2017)
- 13 148–157. https://doi.org/10.1016/J.BUILDENV.2017.05.025.
- 14 [143] G. Motalebi, A. Sal Moslehian, E. Hasanzadeh, The most effective indoor
- environmental quality factors related to worker satisfaction and performance: a case of the
- administrative office building at Ferdowsi University of Mashhad, International Journal of
- 17 Occupational Safety and Ergonomics. (2019).
- 18 https://doi.org/10.1080/10803548.2019.1582886.
- 19 [144] G.R. Newsham, B.J. Birt, C. Arsenault, A.J.L. Thompson, J.A. Veitch, S. Mancini, A.D.
- Galasiu, B.N. Gover, I.A. MacDonald, G.J. Burns, Do green buildings have better indoor
- 21 environments? New evidence, Building Research and Information. 41 (2013) 415–434.
- 22 https://doi.org/10.1080/09613218.2013.789951.
- 23 [145] Z. Pei, B. Lin, Y. Liu, Y. Zhu, Comparative study on the indoor environment quality of
- 24 green office buildings in China with a long-term field measurement and investigation,
- 25 Building and Environment. 84 (2015) 80–88.
- 26 https://doi.org/10.1016/j.buildenv.2014.10.015.
- 27 [146] Y. Sakurai, T. Noguchi, G. Horie, N. Matsubara, Quantification of the synthesized
- evaluation of the combined environment, Energy and Buildings. 14 (1990) 169–173.
- 29 https://doi.org/10.1016/0378-7788(90)90037-J.
- 30 [147] E.(L.J. Sander, A. Caza, P.J. Jordan, Psychological perceptions matter: Developing the
- reactions to the physical work environment scale, Building and Environment. 148 (2019)
- 32 338–347. https://doi.org/10.1016/j.buildenv.2018.11.020.
- 33 [148] A. Wagner, E. Gossauer, C. Moosmann, T. Gropp, R. Leonhart, Thermal comfort and
- 34 workplace occupant satisfaction-Results of field studies in German low energy office
- 35 buildings, Energy and Buildings. 39 (2007) 758–769.
- 36 https://doi.org/10.1016/j.enbuild.2007.02.013.
- 37 [149] M. Watchman, A. Potvin, C.M.H. Demers, A post-occupancy evaluation of the influence
- of wood on environmental comfort, BioResources. 12 (2017) 8704–8724.
- 39 https://doi.org/10.15376/biores.12.4.8704-8724.

- 1 [150] X. Xuan, Study of indoor environmental quality and occupant overall comfort and
- 2 productivity in LEED- and non-LEED-certified healthcare settings, Indoor and Built
- 3 Environment. 27 (2018) 544–560. https://doi.org/10.1177/1420326X16684007.
- 4 [151] K. Yildirim, A. Akalin-Baskaya, M. Celebi, The effects of window proximity, partition
- 5 height, and gender on perceptions of open-plan offices, Journal of Environmental
- 6 Psychology. 27 (2007) 154–165. https://doi.org/10.1016/j.jenvp.2007.01.004.
- 7 [152] A. Zalejska-Jonsson, M. Wilhelmsson, Impact of perceived indoor environment quality
- 8 on overall satisfaction in Swedish dwellings, Building and Environment. 63 (2013) 134-
- 9 144. https://doi.org/10.1016/j.buildenv.2013.02.005.
- 10 [153] A. Zalejska-Jonsson, Parameters contributing to occupants' satisfaction: Green and
- conventional residential buildings, Facilities. 32 (2014) 411–437.
- 12 https://doi.org/10.1108/F-03-2013-0021.
- 13 [154] F.H. Rohles, W.V. Wells, Interior design. Comfort and Thermal sensitivity, Journal of
- 14 Interior Design. 2 (1976) 36–44. https://doi.org/10.1111/j.1939-1668.1976.tb00392.x.
- 15 [155] M. Stokkermans, I. Vogels, Y. de Kort, I. Heynderickx, Relation between the perceived
- 16 atmosphere of a lit environment and perceptual attributes of light, Lighting Research and
- 17 Technology. 50 (2018) 1164–1178. https://doi.org/10.1177/1477153517722384.
- 18 [156] R. Kelly, J. Mardaljevic, B. Painter, & K. Irvine, The Long-Term Evaluation of
- 19 Electrochromic Glazing in an Open Plan Office under Normal Use: Project Outline, in:
- 20 Proceedings of Experiencing Light, 2012.
- 21 [157] I.A. Sakellaris, D.E. Saraga, C. Mandin, C. Roda, S. Fossati, Y. De Kluizenaar, P. Carrer, S.
- Dimitroulopoulou, V.G. Mihucz, T. Szigeti, O. Hänninen, E. De Oliveira Fernandes, J.G. Bartzis,
- 23 P.M. Bluyssen, Perceived indoor environment and occupants' comfort in European
- 24 "Modern" office buildings: The OFFICAIR Study, International Journal of Environmental
- 25 Research and Public Health. 13 (2016). https://doi.org/10.3390/ijerph13050444.
- 26 [158] J. Kim, R. de Dear, Nonlinear relationships between individual IEQ factors and overall
- workspace satisfaction, Building and Environment. 49 (2012) 33–40.
- 28 https://doi.org/10.1016/j.buildenv.2011.09.022.
- 29 [159] J.H. Choi, V. Loftness, A. Aziz, Post-occupancy evaluation of 20 office buildings as basis
- for future IEO standards and guidelines, in: Energy and Buildings, 2012: pp. 167–175.
- 31 https://doi.org/10.1016/j.enbuild.2011.08.009.
- 32 [160] S. Kumar, M.K. Singh, V. Loftness, J. Mathur, S. Mathur, Thermal comfort assessment
- 33 and characteristics of occupant's behaviour in naturally ventilated buildings in composite
- 34 climate of India, Energy for Sustainable Development. 33 (2016) 108–121.
- 35 https://doi.org/10.1016/j.esd.2016.06.002.
- 36 [161] I.E. Bennet, W. O'Brien, Field study of thermal comfort and occupant satisfaction in
- 37 Canadian condominiums, Architectural Science Review. 60 (2017) 27–39.
- 38 https://doi.org/10.1080/00038628.2016.1205179.

- 1 [162] A.K. Persily, Evaluating Building IAO and Ventilation with Indoor Carbon Dioxide.
- 2 ASHRAE Transactions. 103 (1997) 1–12.
- 3 [163] K.W. Tham, H.C. Willem, Temperature and Ventilation Effects on Performance and
- 4 Neurobehavioral-Related Symptoms of Tropically Acclimatized Call Center Operators Near
- 5 Thermal Neutrality, ASHRAE Transactions. 111 (2005) 687–698.
- 6 [164] Wilson, M.; Nicol, F., Some Thoughts on Acoustic Comfort: a Look At Adaptive
- 7 Standards for Noise, in: Institute of Acoustics, 2003: pp. 116–124.
- 8 [165] R.W. Marans, X.-ying Yan, LIGHTING QUALITY AND ENVIRONMENTAL
- 9 SATISFACTION IN OPEN AND ENCLOSED OFFICES, Journal of Architectural and Planning
- 10 Research. 6 (1989) 118–131. http://www.jstor.org/stable/43028916.
- 11 [166] A. Astolfi, F. Pellerey, Subjective and objective assessment of acoustical and overall
- 12 environmental quality in secondary school classrooms, The Journal of the Acoustical Society
- of America. 123 (2008) 163–173. https://doi.org/10.1121/1.2816563.
- 14 [167] J.F. Nicol, M.A. Humphreys, A Stochastic Approach to Thermal Comfort–Occupant
- Behavior and Energy Use in Buildings, ASHRAE Transactions. 110 (2004) 554–568.
- 16 [168] G.J. Levermore, D. Meyers, Occupant questionnaire on interior environmental
- 17 conditions: Initial results, Building Services Engineering Research and Technology. 17
- 18 (1996) 29–36. https://doi.org/10.1177/014362449601700105.
- 19 [169] M. Boubekri, Appraisal of the Lighting Conditions in an Office Building: Results of a
- 20 Survey, Indoor Environment. 4 (1995) 162–169.
- 21 https://doi.org/10.1177/1420326X9500400306.
- [170] J.A. Veitch, K.E. Charles, K.M.J. Farley, G.R. Newsham, A model of satisfaction with
- 23 open-plan office conditions: COPE field findings, Journal of Environmental Psychology. 27
- 24 (2007) 177–189. https://doi.org/10.1016/j.jenvp.2007.04.002.
- 25 [171] I.G. Monfared, S. Sharples, Occupants perceptions and expectations of a green office
- building: A longitudinal case study, Architectural Science Review. 54 (2011) 344–355.
- 27 https://doi.org/10.1080/00038628.2011.613636.
- 28 [172] E.M. De Korte, M. Spiekman, L. Hoes-van Oeffelen, B. van der Zande, G. Vissenberg, G.
- Huiskes, L.F.M. Kuijt-Evers, Personal environmental control: Effects of pre-set conditions
- 30 for heating and lighting on personal settings, task performance and comfort experience,
- 31 Building and Environment. 86 (2015) 166–176.
- 32 https://doi.org/10.1016/j.buildenv.2015.01.002.
- 33 [173] T. Moore, D.J. Carter, A. Slater, A study of opinion in offices with and without user
- 34 controlled lighting, Lighting Research and Technology. 36 (2004) 131–146.
- 35 https://doi.org/10.1191/13657828041i109oa.
- 36 [174] E.V. White, B. Gatersleben, Greenery on residential buildings: Does it affect
- 37 preferences and perceptions of beauty?, Journal of Environmental Psychology. 31 (2011)
- 38 89–98. https://doi.org/10.1016/j.jenvp.2010.11.002.

- 1 [175] I. Bennet, W. O'brien, H.B. Gunay, Effect of Window Blind Use in Residential Buildings:
- 2 Observation and Simulation Study, 2014.
- 3 [176] Y. Geng, J. Yu, B. Lin, Z. Wang, Y. Huang, Impact of individual IEQ factors on
- 4 passengers' overall satisfaction in Chinese airport terminals, Building and Environment.
- 5 112 (2017) 241–249. https://doi.org/10.1016/j.buildenv.2016.11.040.
- 6 [177] S. Leder, G.R. Newsham, J.A. Veitch, S. Mancini, K.E. Charles, Effects of office
- 7 environment on employee satisfaction: A new analysis, Building Research and Information.
- 8 44 (2016) 34–50. https://doi.org/10.1080/09613218.2014.1003176.
- 9 [178] J. Kim, T. Hong, J. Jeong, C. Koo, M. Kong, An integrated psychological response score
- of the occupants based on their activities and the indoor environmental quality condition
- changes, Building and Environment. 123 (2017) 66–77.
- 12 https://doi.org/10.1016/j.buildenv.2017.06.046.
- 13 [179] I.A. Raja, J.F. Nicol, K.J. McCartney, M.A. Humphreys, Thermal comfort: Use of controls
- in naturally ventilated buildings, Energy and Buildings. 33 (2001) 235–244.
- 15 https://doi.org/10.1016/S0378-7788(00)00087-6.
- 16 [180] K. Voss, S. Herkel, J. Pfafferott, G. Löhnert, A. Wagner, Energy efficient office buildings
- with passive cooling Results and experiences from a research and demonstration
- 18 programme, Solar Energy. 81 (2007) 424–434.
- 19 https://doi.org/10.1016/j.solener.2006.04.008.
- 20 [181] L. Chatzidiakou, D. Mumovic, A. Summerfield, Is CO2 a good proxy for indoor air
- 21 quality in classrooms? Part 2: Health outcomes and perceived indoor air quality in relation
- 22 to classroom exposure and building characteristics, Building Services Engineering Research
- 23 and Technology. 36 (2015) 162–181. https://doi.org/10.1177/0143624414566245.
- 24 [182] F.H. Rohles, W. Wells, The role of environmental antecedents on subsequent thermal
- comfort, ASHRAE Transactions. 83 (1977) 21–29.
- 26 [183] Z. Yang, B. Becerik-Gerber, L. Mino, A study on student perceptions of higher
- 27 education classrooms: Impact of classroom attributes on student satisfaction and
- performance, Building and Environment. 70 (2013) 171–188.
- 29 https://doi.org/10.1016/J.BUILDENV.2013.08.030.
- 30 [184] S. Ravindu, R. Rameezdeen, J. Zuo, Z. Zhou, R. Chandratilake, Indoor environment
- 31 quality of green buildings: Case study of an LEED platinum certified factory in a warm
- humid tropical climate, Building and Environment. 84 (2015) 105–113.
- 33 https://doi.org/10.1016/j.buildenv.2014.11.001.
- 34 [185] J. Kim, Y. Zhou, S. Schiavon, P. Raftery, G. Brager, Personal comfort models: Predicting
- individuals thermal preference using occupant heating and cooling behavior and machine
- learning, Building and Environment. 129 (2018) 96–106.
- 37 https://doi.org/10.1016/j.buildenv.2017.12.011.
- 38 [186] L. Chatzidiakou, D. Mumovic, A. Summerfield, Is CO2 a good proxy for indoor air
- 39 quality in classrooms? Part 1: The interrelationships between thermal conditions CO2

- 1 levels, ventilation rates and selected indoor pollutants, Building Services Engineering
- 2 Research and Technology. 36 (2015) 129–161.
- 3 https://doi.org/10.1177/0143624414566244.
- 4 [187] C. Vásquez, F.E. Pino, A.P. Hoces, C. Aguirre Nuñez, Thermal and lighting perception in
- 5 four fully glazed office buildings in Santiago, Chile, Journal of Facade Design and
- 6 Engineering. 1 (2013) 31–51. https://doi.org/10.3233/FDE-130007.
- 7 [188] D.K. Serghides, C.K. Chatzinikola, M.C. Katafygiotou, Comparative studies of the
- 8 occupants' behaviour in a university building during winter and summer time, International
- 9 Journal of Sustainable Energy. 34 (2015) 528–551.
- 10 [189] V. De Giuli, R. Zecchin, L. Corain, L. Salmaso, Measured and perceived environmental
- 11 comfort: Field monitoring in an Italian school, Applied Ergonomics. 45 (2014) 1035–1047.
- 12 https://doi.org/10.1016/j.apergo.2014.01.004.
- 13 [190] G.K. Oral, A.K. Yener, N.T. Bayazit, Building envelope design with the objective to
- ensure thermal, visual and acoustic comfort conditions, Building and Environment. 39
- 15 (2004) 281–287. https://doi.org/10.1016/S0360-1323(03)00141-0.
- 16 [191] G.F. Menzies, J.R. Wherrett, Windows in the workplace: Examining issues of
- 17 environmental sustainability and occupant comfort in the selection of multi-glazed
- 18 windows, Energy and Buildings. 37 (2005) 623–630.
- 19 https://doi.org/10.1016/j.enbuild.2004.09.012.
- 20 [192] L. Karlsen, P. Heiselberg, I. Bryn, Occupant satisfaction with two blind control
- 21 strategies: Slats closed and slats in cut-off position, Solar Energy. 115 (2015) 166–179.
- 22 https://doi.org/10.1016/j.solener.2015.02.031.
- 23 [193] R. Dang, L. Wei, Y. Yuan, G. Liu, The impact of physical environments in satisfaction in
- shopping centers, in: 7th International Building Physics Conference, IBPC2018, 2018: pp.
- 25 799–804. https://doi.org/10.14305/ibpc.2018.ie-2.06.
- 26 [194] I. Pigliautile, S. Casaccia, A. Calvaresi, N. Morresi, M. Arnesano, A.L. Pisello, G.M. Revel,
- 27 A comprehensive human comfort assessment protocol based on multidomain
- 28 measurements and surveys, in: 51st AiCARR International Conference The Human
- 29 Dimension of Building Energy Performance, Venice, Italy, 2019: pp. 49–61.
- 30 [195] A.S. Robertson, M. Mcinnes, D. Glass, G. Dalton, P.S. Burge, Building sickness, are
- 31 symptoms related to the office lighting?, Annals of Occupational Hygiene. 33 (1989) 47–59.
- 32 https://doi.org/10.1093/annhyg/33.1.47.
- 33 [196] M. Schweiker, M. Hawighorst, A. Wagner, The influence of personality traits on
- occupant behavioural patterns, Energy and Buildings. 131 (2016) 63–75.
- 35 https://doi.org/10.1016/j.enbuild.2016.09.019.
- 36 [197] J.A. Veitch, R. Gifford, Choice, perceived control, and performance decrements in the
- 37 physical environment, Journal of Environmental Psychology. 16 (1996) 269–276.
- 38 https://doi.org/10.1006/jevp.1996.0022.

- 1 [198] J.A. Veitch, G.R. Newsham, Exercised control, lighting choices, and energy use: An
- office simulation experiment, Journal of Environmental Psychology. 20 (2000) 219–237.
- 3 https://doi.org/10.1006/jevp.1999.0169.
- 4 [199] G.Y. Yun, Influences of perceived control on thermal comfort and energy use in
- 5 buildings, Energy and Buildings. 158 (2018) 822–830.
- 6 https://doi.org/10.1016/j.enbuild.2017.10.044.
- 7 [200] X. Zhang, P. Wargocki, Z. Lian, C. Thyregod, Effects of exposure to carbon dioxide and
- 8 bioeffluents on perceived air quality, self-assessed acute health symptoms, and cognitive
- 9 performance, Indoor Air. 27 (2017) 47–64. https://doi.org/10.1111/ina.12284.
- 10 [201] T.C. Greene, P.A. Bell, Additional considerations concerning the effects of warm and
- 11 cool wall colours on energy conservation, Ergonomics. 23 (1980) 949–954.
- 12 https://doi.org/10.1080/00140138008924804.
- 13 [202] Y. Al Horr, M. Arif, A. Kaushik, A. Mazroei, M. Katafygiotou, E. Elsarrag, Occupant
- 14 productivity and office indoor environment quality: A review of the literature, Building and
- 15 Environment. 105 (2016) 369–389. https://doi.org/10.1016/j.buildenv.2016.06.001.
- 16 [203] G.Y. Yun, K. Steemers, Time-dependent occupant behaviour models of window control
- in summer, Building and Environment. 43 (2008) 1471–1482.
- 18 https://doi.org/10.1016/j.buildenv.2007.08.001.
- 19 [204] N. Pivac, S. Nižetić, V. Zanki, Occupant behavior and thermal comfort field analysis in
- 20 typical educational research institution A case study, Thermal Science. 22 (2018) 785–795.
- 21 https://doi.org/10.2298/TSCI170915013P.
- 22 [205] S.A. Sadeghi, P. Karava, I. Konstantzos, A. Tzempelikos, Occupant interactions with
- 23 shading and lighting systems using different control interfaces: A pilot field study, Building
- 24 and Environment. 97 (2016) 177–195. https://doi.org/10.1016/j.buildenv.2015.12.008.
- 25 [206] M. Schweiker, A. Wagner, The effect of occupancy on perceived control, neutral
- temperature, and behavioral patterns, Energy and Buildings. 117 (2016) 246–259.
- 27 https://doi.org/10.1016/j.enbuild.2015.10.051.
- 28 [207] A. Boerstra, T. Beuker, M. Loomans, J. Hensen, Impact of perceived control on comfort
- and health in European office buildings, in: 10th International Conference on Healthy
- 30 Buildings 2012, 2012: pp. 370–375. http://nceub.org.uk.
- 31 [208] J. Kim, S. Schiavon, G. Brager, Personal comfort models A new paradigm in thermal
- 32 comfort for occupant-centric environmental control, Building and Environment. 132 (2018)
- 33 114–124. https://doi.org/10.1016/j.buildenv.2018.01.023.
- 34 [209] M. Indraganti, K.D. Rao, Effect of age, gender, economic group and tenure on thermal
- 35 comfort: A field study in residential buildings in hot and dry climate with seasonal
- 36 variations, Energy and Buildings. 42 (2010) 273–281.
- 37 https://doi.org/10.1016/j.enbuild.2009.09.003.

- 1 [210] S.H. Park, P.J. Lee, Reaction to floor impact noise in multi-storey residential buildings:
- 2 The effects of acoustic and non-acoustic factors, Applied Acoustics. 150 (2019) 268–278.
- 3 https://doi.org/10.1016/j.apacoust.2019.02.021.
- 4 [211] H. Jin, X. Li, J. Kang, Z. Kong, An evaluation of the lighting environment in the public
- 5 space of shopping centres, Building and Environment. 115 (2017) 228–235.
- 6 https://doi.org/10.1016/J.BUILDENV.2017.01.008.
- 7 [212] P.C. da Silva, V. Leal, M. Andersen, Occupants interaction with electric lighting and
- 8 shading systems in real single-occupied offices: Results from a monitoring campaign,
- 9 Building and Environment. 64 (2013) 152–168.
- 10 https://doi.org/10.1016/j.buildenv.2013.03.015.
- 11 [213] D. Daum, F. Haldi, N. Morel, A personalized measure of thermal comfort for building
- controls, Building and Environment. 46 (2011) 3–11.
- 13 https://doi.org/10.1016/j.buildenv.2010.06.011.
- 14 [214] H. Eun Kim, H. Tokura, Influence of different light intensities during the daytime on
- evening dressing behavior in the cold, Physiology & Behavior. 58 (1995) 779–783.
- 16 https://doi.org/10.1016/0031-9384(95)00129-7.
- 17 [215] V. Inkarojrit, Monitoring and modelling of manually-controlled venetian blinds in
- private offices: A pilot study, Journal of Building Performance Simulation. 1 (2008) 75–89.
- 19 https://doi.org/10.1080/19401490802021012.
- 20 [216] B. Jeong, J.-W. Jeong, J.S. Park, Occupant behavior regarding the manual control of
- windows in residential buildings, Energy and Buildings. 127 (2016) 206–216.
- 22 https://doi.org/10.1016/j.enbuild.2016.05.097.
- 23 [217] A. Kim, S. Wang, J.E. Kim, D. Reed, Indoor/outdoor environmental parameters and
- 24 window-opening behavior: A structural equation modeling analysis, Buildings. 9 (2019).
- 25 https://doi.org/10.3390/buildings9040094.
- 26 [218] H.-E. Kim, H. Tokura, Influence of Two Different Light Intensities from 16:00 to 20:30
- Hours on Evening Dressing Behavior in the Cold, 2007.
- 28 [219] H.E. Kim, H. Tokura, Influence of Light Intensities on Dressing Behavior in Elderly
- 29 People, 2000.
- 30 [220] E.S. Lee, D.L. DiBartolomeo, S.E. Selkowitz, Thermal and daylighting performance of
- an automated venetian blind and lighting system in a full-scale private office, Energy and
- 32 Buildings. 29 (1998) 47–63. https://doi.org/10.1016/s0378-7788(98)00035-8.
- 33 [221] N. Li, J. Li, R. Fan, H. Jia, Probability of occupant operation of windows during
- transition seasons in office buildings, Renewable Energy. 73 (2015) 84–91.
- 35 https://doi.org/10.1016/j.renene.2014.05.065.
- 36 [222] F. Naspi, M. Arnesano, L. Zampetti, F. Stazi, G.M. Revel, M. D'Orazio, Experimental
- 37 study on occupants' interaction with windows and lights in Mediterranean offices during
- the non-heating season, Building and Environment. 127 (2018) 221–238.
- 39 https://doi.org/10.1016/j.buildenv.2017.11.009.

- 1 [223] G. Ozcelik, B. Becerik-Gerber, R. Chugh, Understanding human-building interactions
- 2 under multimodal discomfort, Building and Environment. 151 (2019) 280–290.
- 3 https://doi.org/10.1016/J.BUILDENV.2018.12.046.
- 4 [224] J. Park, C.-S. Choi, Modeling occupant behavior of the manual control of windows in
- 5 residential buildings, Indoor Air. 29 (2019) 242–251. https://doi.org/10.1111/ina.12522.
- 6 [225] C.F. Reinhart, K. Voss, Monitoring manual control of electric lighting and blinds
- Reinhart, C.F.; Voss, K. NRCC-45701, Lighting Research and Technology. 35 (2003) 243–
- 8 260.
- 9 [226] S. Shi, B. Zhao, Occupants' interactions with windows in 8 residential apartments in
- Beijing and Nanjing, China, Building Simulation. 9 (2016) 221–231.
- 11 https://doi.org/10.1007/s12273-015-0266-z.
- 12 [227] M. Yao, B. Zhao, Window opening behavior of occupants in residential buildings in
- Beijing, Building and Environment. 124 (2017) 441–449.
- 14 https://doi.org/10.1016/j.buildenv.2017.08.035.
- 15 [228] M. Yao, B. Zhao, Factors affecting occupants' interactions with windows in residential
- buildings in Beijing, China, in: W. Cui, P and Liu, J and Zhang (Ed.), 10TH INTERNATIONAL
- 17 SYMPOSIUM ON HEATING, VENTILATION AND AIR CONDITIONING, ISHVAC2017, 2017: pp.
- 18 3428–3434. https://doi.org/10.1016/j.proeng.2017.09.857.
- 19 [229] Y. Zhang, P. Barrett, Factors influencing occupants' blind-control behaviour in a
- 20 naturally ventilated office building, Building and Environment. 54 (2012) 137–147.
- 21 https://doi.org/10.1016/j.buildenv.2012.02.016.
- 22 [230] K. Paunović, B. Jakovljević, G. Belojević, Predictors of noise annoyance in noisy and
- 23 quiet urban streets, Science of the Total Environment. 407 (2009) 3707–3711.
- 24 [231] R. Markovic, E. Grintal, D. Wölki, J. Frisch, C. van Treeck, Window opening model using
- deep learning methods, Building and Environment. 145 (2018) 319–329.
- 26 https://doi.org/10.1016/j.buildenv.2018.09.024.
- 27 [232] A.R. Hansen, K. Gram-Hanssen, H.N. Knudsen, How building design and technologies
- influence heat-related habits, Building Research and Information. 46 (2018) 83–98.
- 29 https://doi.org/10.1080/09613218.2017.1335477.
- 30 [233] A. Mahdavi, A. Mohammadi, E. Kabir, L. Lambeva, Occupants' operation of lighting and
- 31 shading systems in office buildings, Journal of Building Performance Simulation. 1 (2008)
- 32 57-65. https://doi.org/10.1080/19401490801906502.
- 33 [234] J. Kim, F. Bauman, P. Raftery, E. Arens, H. Zhang, G. Fierro, M. Andersen, D. Culler,
- Occupant comfort and behavior: High-resolution data from a 6-month field study of
- 35 personal comfort systems with 37 real office workers, Building and Environment. 148
- 36 (2019) 348–360. https://doi.org/10.1016/j.buildenv.2018.11.012.
- 37 [235] R. Andersen, V. Fabi, J. Toftum, S.P. Corgnati, B.W. Olesen, Window opening behaviour
- 38 modelled from measurements in Danish dwellings, Building and Environment. 69 (2013)
- 39 101–113. https://doi.org/10.1016/j.buildenv.2013.07.005.

- 1 [236] V. Fabi, V. Maggiora, S.P. Corgnati, R.K. Andersen, Occupants' behaviour in office
- 2 buildings: Stochastic models for window opening, in: Proceedings of 8th Windsor
- 3 Conference: Counting the Cost of Comfort in a Changing World Cumberland Lodge, Windsor,
- 4 UK, London, 2014a. https://www.researchgate.net/publication/261794473.
- 5 [237] S. DOca, T. Hong, A data-mining approach to discover patterns of window opening
- 6 and closing behavior in offices, Building and Environment. 82 (2014) 726–739.
- 7 https://doi.org/10.1016/j.buildenv.2014.10.021.
- 8 [238] H.B. Rijal, M.A. Humphreys, J.F. Nicol, Understanding occupant behaviour: the use of
- 9 controls in mixed-mode office buildings, Building Research & Information. 37 (2009) 381–
- 10 396. https://doi.org/10.1080/09613210902904221.
- 11 [239] F. Haldi, D. Robinson, Adaptive actions on shading devices in response to local visual
- stimuli, Journal of Building Performance Simulation. 3 (2010) 135–153.
- 13 https://doi.org/10.1080/19401490903580759.
- 14 [240] R.V. Jones, A. Fuertes, E. Gregori, A. Giretti, Stochastic behavioural models of
- occupants' main bedroom window operation for UK residential buildings, Building and
- 16 Environment. 118 (2017) 144–158. https://doi.org/10.1016/j.buildenv.2017.03.033.
- 17 [241] V.M. Barthelmes, Y. Heo, R.K. Andersen, V. Fabi, S.P. Corgnati, Towards A
- 18 Comprehensive Model Of Window Control Behaviour: A Survey-based Investigation On
- 19 Interdisciplinary Drivers In Danish Dwellings, 2018.
- 20 [242] V. Fabi, V. Camisassi, F. Causone, S.P. Corgnati, R. Andersen, Light switch behaviour:
- occupant behaviour stochastic models in office buildings, in: 8th Windsor Conference:
- Counting the Cost of Comfort in a Changing World, 2014: pp. 10–13.
- 23 [243] A. Roetzel, Spatial considerations in modelling assumptions for manual lighting
- control in offices, in: AIRAH and IBPSA's Australasian Building Simulation 2017, 2017.
- 25 [244] Z. Shi, H. Qian, X. Zheng, Z. Lv, Y. Li, L. Liu, P.V. Nielsen, Seasonal variation of window
- opening behaviors in two naturally ventilated hospital wards, Building and Environment.
- 27 130 (2018) 85–93. https://doi.org/10.1016/j.buildenv.2017.12.019.
- 28 [245] L.V. Madsen, Materialities shape practices and notions of comfort in everyday life,
- 29 Building Research and Information. 46 (2018) 71–82.
- 30 https://doi.org/10.1080/09613218.2017.1326230.
- 31 [246] V. Inkarojrit, Balancing Comfort: Occupants' Control of Window Blinds in Private
- 32 Offices, PhD thesis, University of California, Berkeley, 2005.
- 33 [247] M. Indraganti, R. Ooka, H.B. Rijal, G.S. Brager, Adaptive model of thermal comfort for
- offices in hot and humid climates of India, Building and Environment. 74 (2014) 39–53.
- 35 https://doi.org/10.1016/j.buildenv.2014.01.002.
- 36 [248] H.B. Rijal, P. Tuohy, M.A. Humphreys, F. Nicol, A. Samuel, An algorithm to represent
- occupant use of windows and fans including situation-specific motivations and constraints,
- 38 Building Simulation. 4 (2011) 117–134. https://doi.org/10.1007/s12273-011-0037-4.

- 1 [249] F. Haldi, D. Robinson, Modelling occupants' personal characteristics for thermal
- 2 comfort prediction, International Journal of Biometeorology. 55 (2011) 681–694.
- 3 https://doi.org/10.1007/s00484-010-0383-4.
- 4 [250] M.S. Mustapa, S.A. Zaki, H.B. Rijal, A. Hagishima, M.S.M. Ali, Thermal comfort and
- 5 occupant adaptive behaviour in Japanese university buildings with free running and cooling
- 6 mode offices during summer, Building and Environment. 105 (2016) 332–342.
- 7 https://doi.org/10.1016/j.buildenv.2016.06.014.
- 8 [251] M.S. Rea, Window blind occlusion: a pilot study, Building and Environment. 19 (1984)
- 9 133–137. https://doi.org/10.1016/0360-1323(84)90038-6.
- 10 [252] D. Cali, R.K. Andersen, D. Mueller, B.W. Olesen, Analysis of occupants' behavior related
- to the use of windows in German households, Building and Environment. 103 (2016) 54–
- 12 69. https://doi.org/10.1016/j.buildenv.2016.03.024.
- 13 [253] J. Yao, Determining the energy performance of manually controlled solar shades: A
- stochastic model based co-simulation analysis, Applied Energy. 127 (2014) 64–80.
- 15 https://doi.org/10.1016/j.apenergy.2014.04.046.
- 16 [254] F. Haldi, D. Robinson, Interactions with window openings by office occupants,
- 17 Building and Environment. 44 (2009) 2378–2395.
- 18 https://doi.org/10.1016/j.buildenv.2009.03.025.
- 19 [255] V. Fabi, R.V. Andersen, S. Corgnati, B.W. Olesen, Occupants' window opening
- behaviour: A literature review of factors influencing occupant behaviour and models,
- 21 Building and Environment. 58 (2012) 188–198.
- 22 https://doi.org/10.1016/j.buildenv.2012.07.009.
- 23 [256] M. Indraganti, R. Ooka, H.B. Rijal, G.S. Brager, Drivers and barriers to occupant
- 24 adaptation in offices in India, Architectural Science Review. 58 (2015) 77–86.
- 25 https://doi.org/10.1080/00038628.2014.976539.
- 26 [257] G.Y. Yun, K. Steemers, N. Baker, Natural ventilation in practice: Linking facade design,
- thermal performance, occupant perception and control, Building Research and Information.
- 28 36 (2008) 608-624. https://doi.org/10.1080/09613210802417241.
- 29 [258] H.B. Gunay, W. O'Brien, I. Beausoleil-Morrison, S. Gilani, Development and
- 30 implementation of an adaptive lighting and blinds control algorithm, Building and
- 31 Environment. 113 (2017) 185–199. https://doi.org/10.1016/j.buildenv.2016.08.027.
- 32 [259] J. Langevin, J. Wen, P.L. Gurian, Simulating the human-building interaction:
- 33 Development and validation of an agent-based model of office occupant behaviors, Building
- 34 and Environment. 88 (2015) 27–45. https://doi.org/10.1016/j.buildenv.2014.11.037.
- 35 [260] G.M. Huebner, D.T. Shipworth, S. Gauthier, C. Witzel, P. Raynham, W. Chan, Saving
- 36 energy with light? Experimental studies assessing the impact of colour temperature on
- 37 thermal comfort, Energy Research and Social Science. 15 (2016) 45–57.
- 38 https://doi.org/10.1016/j.erss.2016.02.008.

- 1 [261] B. Gucveter, Evaluating diverse patterns of occupant behavior regarding control-
- 2 based activities in energy performance simulation, Frontiers of Architectural Research. 7
- 3 (2018) 167–179. https://doi.org/10.1016/j.foar.2018.03.002.
- 4 [262] J. Kim, R. de Dear, T. Parkinson, C. Candido, Understanding patterns of adaptive
- 5 comfort behaviour in the Sydney mixed-mode residential context, Energy and Buildings.
- 6 141 (2017) 274–283. https://doi.org/10.1016/j.enbuild.2017.02.061.
- 7 [263] Y. Song, Y. Sun, S. Luo, Z. Tian, J. Hou, J. Kim, T. Parkinson, R. de Dear, Residential
- 8 adaptive comfort in a humid continental climate Tianjin China, Energy and Buildings. 170
- 9 (2018) 115–121. https://doi.org/10.1016/j.enbuild.2018.03.083.
- 10 [264] R.V. Andersen, J. Toftum, K.K. Andersen, B.W. Olesen, Survey of occupant behaviour
- and control of indoor environment in Danish dwellings, Energy and Buildings. 41 (2009)
- 12 11–16. https://doi.org/10.1016/j.enbuild.2008.07.004.
- 13 [265] S. Wei, R. Buswell, D. Loveday, Factors affecting 'end-of-day' window position in a
- non-air-conditioned office building, Energy and Buildings. 62 (2013) 87–96.
- 15 https://doi.org/10.1016/j.enbuild.2013,02.060.
- 16 [266] S. Pan, Y. Xiong, Y. Han, X. Zhang, L. Xia, S. Wei, J. Wu, M. Han, A study on influential
- 17 factors of occupant window-opening behavior in an office building in China, Building and
- 18 Environment. 133 (2018) 41–50. https://doi.org/10.1016/j.buildenv.2018.02.008.
- 19 [267] V. Fabi, R.V. Andersen, S.P. Corgnati, Influence of occupant's heating set-point
- 20 preferences on indoor environmental quality and heating demand in residential buildings,
- 21 HVAC&R Research. 19 (2013) 635–645. https://doi.org/10.1080/10789669.2013.789372.
- 22 [268] G.Y. Yun, H. Kim, J.T. Kim, Thermal and non-thermal stimuli for the use of windows in
- offices, Indoor and Built Environment. 21 (2012) 109–121.
- 24 https://doi.org/10.1177/1420326X11420012.
- 25 [269] M. Schweiker, F. Haldi, M. Shukuya, D. Robinson, Verification of stochastic models of
- 26 window opening behaviour for residential buildings, Journal of Building Performance
- 27 Simulation. 5 (2012) 55–74. https://doi.org/10.1080/19401493.2011.567422.
- 28 [270] S. Wei, R. Jones, P. De Wilde, Driving factors for occupant-controlled space heating in
- residential buildings, Energy and Buildings. 70 (2014) 36–44.
- 30 https://doi.org/10.1016/j.enbuild.2013.11.001.
- 31 [271] L. Sanati, M. Utzinger, The effect of window shading design on occupant use of blinds
- and electric lighting, Building and Environment. 64 (2013) 67–76.
- 33 https://doi.org/10.1016/j.buildenv.2013.02.013.
- 34 [272] A. Heydarian, E. Pantazis, J.P. Carneiro, D. Gerber, B. Becerik-Gerber, Lights, building,
- 35 action: Impact of default lighting settings on occupant behaviour, Journal of Environmental
- 36 Psychology. 48 (2016) 212–223. https://doi.org/10.1016/j.jenvp.2016.11.001.
- 37 [273] V. Fabi, R.K. Andersen, S. Corgnati, Accounting for the Uncertainty Related to Building
- 38 Occupants with Regards to Visual Comfort: A Literature Survey on Drivers and Models,
- 39 Buildings. 6 (2016). https://doi.org/10.3390/buildings6010005.

- 1 [274] J. Langevin, P.L. Gurian, J. Wen, Tracking the human-building interaction: A
- 2 longitudinal field study of occupant behavior in air-conditioned offices, Journal of
- 3 Environmental Psychology. 42 (2015) 94–115.
- 4 https://doi.org/10.1016/j.jenvp.2015.01.007.
- 5 [275] F. Haldi, D. Cali, R.K. Andersen, M. Wesseling, D. Mueller, Modelling diversity in
- 6 building occupant behaviour: a novel statistical approach, Journal of Building Performance
- 7 Simulation. 10 (2017) 527–544. https://doi.org/10.1080/19401493.2016.1269245.
- 8 [276] C. Eon, G.M. Morrison, J. Byrne, The influence of design and everyday practices on
- 9 individual heating and cooling behaviour in residential homes, Energy Efficiency. 11 (2018)
- 10 273–293. https://doi.org/10.1007/s12053-017-9563-y.
- 11 [277] G.Y. Yun, K. Steemers, Night-time naturally ventilated offices: Statistical simulations of
- window-use patterns from field monitoring, Solar Energy. 84 (2010) 1216–1231.
- 13 https://doi.org/10.1016/j.solener.2010.03.029.
- 14 [278] M. Schweiker, S. Brasche, W. Bischof, M. Hawighorst, A. Wagner, Explaining the
- 15 individual processes leading to adaptive comfort: Exploring physiological, behavioural and
- psychological reactions to thermal stimuli, Journal of Building Physics. 36 (2013) 438–463.
- 17 http://jen.sagepub.com/content/36/4/438.short.
- 18 [279] A. Mahdavi, M. Taheri, An ontology for building monitoring, Journal of Building
- 19 Performance Simulation. 10 (2017) 499–508.
- 20 https://doi.org/10.1080/19401493.2016.1243730.
- 21 [280] B. Flyvbjerg, Five Misunderstandings About Case-Study Research, Qualitative Inquiry.
- 22 12 (2006) 219–245. https://doi.org/10.1177/1077800405284363.
- 23 [281] S. Kanaya, Y. Matsushima, K. Yokosawa, Does Seeing Ice Really Feel Cold? Visual-
- 24 Thermal Interaction under an Illusory Body-Ownership, PLOS ONE. 7 (2012) e47293.
- 25 10.1371/journal.pone.0047293.
- 26 [282] B.E. Stein, T.R. Stanford, Multisensory integration: current issues from the perspective
- of the single neuron, Nature Reviews Neuroscience. 9 (2008) 255–266.
- 28 https://doi.org/10.1038/nrn2331.
- 29 [283] D. Talsma, D. Senkowski, S. Soto-Faraco, M.G. Woldorff, The multifaceted interplay
- 30 between attention and multisensory integration, Trends in Cognitive Sciences. 14 (2010)
- 31 400–410. https://doi.org/10.1016/j.tics.2010.06.008.
- 32 [284] I. Ajzen, The theory of planned behavior, Organizational Behavior and Human
- 33 Decision Processes. 50 (1991) 179–211.
- 34 [285] R. Zierler, W. Wehrmeyer, R. Murphy, The energy efficiency behaviour of individuals
- in large organisations: A case study of a major UK infrastructure operator, Energy Policy.
- 36 104 (2017) 38-49. https://doi.org/10.1016/J.ENPOL.2017.01.033.
- 37 [286] Z.H. Ding, Y.Q. Li, C. Zhao, Y. Liu, R. Li, Factors affecting heating energy-saving
- 38 behavior of residents in hot summer and cold winter regions, Natural Hazards. 95 (2019)
- 39 193–206. https://doi.org/10.1007/s11069-018-3489-3.

- 1 [287] W. O'Brien, M. Schweiker, J.K. Day, Get the picture? Lessons learned from a
- 2 smartphone-based post-occupancy evaluation, Energy Research & Social Science. 56 (2019)
- 3 101224. https://doi.org/10.1016/j.erss.2019.101224.
- 4 [288] H. Akaike, Proceedings of the Second International Symposium on Information
- 5 Theory, in: B.N. Petrov (Ed.), 1973: pp. 267–281.
- 6 [289] S. D'Oca, C.-F. Chen, T. Hong, Z. Belafi, Synthesizing building physics with social
- 7 psychology: An interdisciplinary framework for context and occupant behavior in office
- 8 buildings, Energy Research & Social Science. 34 (2017) 240–251.
- 9 https://doi.org/10.1016/j.erss.2017.08.002.
- 10 [290] M.B. Kane, Modeling Human-in-the-Loop Behavior and Interactions with HVAC
- 11 Systems, in: 2018 Annual American Control Conference (ACC), 2018: pp. 4628–4633.
- 12 https://doi.org/10.23919/ACC.2018.8431913.