

## Application of Neuroscience Tools in Building Construction – An Interdisciplinary Analysis

Mengmeng Wang<sup>1,2</sup>, Xiaodan Liu<sup>1,2</sup>, Yu Lai<sup>1</sup>, Wenna Cao<sup>1,2</sup>, Zhiyong Wu<sup>1,2</sup> and Xiaotong Guo<sup>1,2\*</sup>

<sup>1</sup> School of Management, Xi'an University of Architecture and Technology, Xi'an, China, <sup>2</sup> Laboratory of Neuromanagement in Engineering, Xi'an University of Architecture and Technology, Xi'an, China

Interdisciplinary integration is a new driving force in development of science and technology. Neuroscience, a powerful tool for studying human physiology and psychology that is greatly interconnected with the field of building construction, has attracted numerous research attention. In this paper, we systematically review the interdisciplinary applications of neuroscience tools using bibliometric methods. We report that the built environment, construction safety, architectural design, and occupational health are the main areas of research attention, while thermal comfort, air quality, hazard recognition, safety training, aesthetic design, and biophilic design, among others, comprise the most frequently studied topics with regards to application of neuroscience tools. Currently, eye tracking and the electroencephalogram are the most commonly used tools in the field of building construction, while functional near-infrared spectroscopy, functional magnetic resonance imaging and trigeminal nerve stimulation are still at their initial stage of application.

## OPEN ACCESS

## Edited by:

Gui Ye, Chongqing University, China

#### Reviewed by:

Adam Charles Roberts, ETH Center, Singapore Yibin Ao, Chengdu University of Technology, China

> \*Correspondence: Xiaotong Guo guoxiaotong@xauat.edu.cn

#### Specialty section:

This article was submitted to Decision Neuroscience, a section of the journal Frontiers in Neuroscience

Received: 14 March 2022 Accepted: 23 May 2022 Published: 21 June 2022

#### Citation:

Wang M, Liu X, Lai Y, Cao W, Wu Z and Guo X (2022) Application of Neuroscience Tools in Building Construction – An Interdisciplinary Analysis. Front. Neurosci. 16:895666. doi: 10.3389/fnins.2022.895666 Keywords: building construction, neuroscience tools, bibliometric, physiological tools, neurophysiological tools

## INTRODUCTION

With the global education movement flourishing in the 21st century, cultivation of interdisciplinary thinking in institutions of higher learning has received widespread attention worldwide (Aliyeva, 2022). For example, China established the 14th interdisciplinary subject in January 2021 to vigorously promote the country's interdisciplinary development. Interdisciplinary is seen as the key to addressing complex societal challenges, with the integration of knowledge across multiple disciplines playing a crucial role in generation of effective solutions because of the increasing complexity and cross-disciplinarily of current challenges across industries (O'Donovan et al., 2021). Therefore, in the Era of Big Science, new scientific knowledge and discoveries are often generated by the intersection among different disciplines (Cockburn, 2021). Moreover, scientific research and technological advancement are increasingly dependent on such cross-disciplines. For instance, Sun et al. (2021) believed that the interpenetration, interaction, and integration of knowledge between different disciplines generate innovative new knowledge and technologies. Consequently, interdisciplinary research has not only become an important growth point for knowledge innovation and development, but also an important driving force for determining national science and technology innovation capacity. In addition, it is a current mainstream form

of research, as evidenced by various disciplines that have attempted to apply knowledge from other disciplines, such as theories, methods and tools, to solve complex problems within themselves.

Neuroscience is a frontier discipline that applies biological mechanisms to explore human cognitive functions and mental activities. Its technical tools have received numerous attention from various disciplines, such as economics, marketing, and education, among others (Alvino et al., 2020). Consequently, neuroscience tools have become an excellent choice for interdisciplinary research, due to their ability to capture data directly from the human body to complement existing data sources. For example, these tools allow researchers to measure human response data directly as people are engaged in various activities (e.g., decision making) or in response to various stimuli (Dimoka et al., 2012), a phenomenon that has now been extended to the field of architecture. The concepts, methods and tools of architecture, a traditional industry, have remained unchanged for quite some time. However, the field of building has increasingly focused on human issues, owing to the increase in building standards and usage requirements (Wang et al., 2021), such as safety cognition and mental workload of workers during construction (Chen et al., 2016) as well as environmental perception of indoor personnel during usage (Kühn et al., 2021). Since these issues cannot be solved by the knowledge of building science alone, there is need for interdisciplinary integration between architecture and neuroscience, with support from architecture, neuroscience tools and psychology-related knowledge (Eberhard, 2009).

Neuroscience tools can not only measure stimuli-induced physiological signals, but also real-time activity signals of the brain. Boz et al. (2017) and Stasi et al. (2018) broadly classified neuroscience tools into two categories, namely physiological and neurophysiological tools. Particularly, physiological tools allows one to measure both voluntary and involuntary reflexes, such as fixating and tracking visual stimuli, whereas neurophysiological tools can record and analyze brain activity thereby allowing researchers to study human psychology and behavior, such as electroencephalogram (EEG). Currently, scholars have reviewed the interdisciplinary application of neuroscience tools in the field of building construction. For example, Zhang et al. (2019) and Saedi et al. (2022) summarized the application of EEG in the field of building construction safety, and analyzed the frequency bands of EEG as well as the channels used to detect the electrical activity of the brain. On the other hand, Cheng et al. (2022a) reviewed the application of eye tracking techniques in construction safety, and described the different index used to study human mental performance in visual, cognitive and attention aspects. Moreover, Hu and Shealy (2019) explored the application of functional nearinfrared spectroscopy (fNIRS) in engineering decision making and design cognition, by exploiting the relationship between brain and behavior in engineering settings.

Although neuroscience tools have gradually been applied in building construction, and review articles highlighted the application of specific tools such as EEG and eye tracking, only a handful of studies have comprehensively reviewed the applications of neuroscience tools in building construction from a general standpoint. Moreover, little is known regarding the structure of interdisciplinary integration between neuroscience tools and building construction. In view of the interdisciplinary field of neuroscience tools applied to building construction research, this paper adopts the basic statistical methods in bibliometric to analyze the trend in development of this interdisciplinary field. Particularly, we first explored the most influential countries, institutions, scholars and journals in this field, trying to reveal the whole picture of the knowledge development of neuroscience tools in building construction domain from a macro perspective. Next, we applied the coword analysis method in bibliometric, and established the cooccurrence network of keywords in this interdisciplinary field as well as cluster distribution of keywords based on the cooccurrence relationship, with the aim of generating knowledge on this interdisciplinary field from a micro perspective. Overall, this paper provides a comprehensive and objective panorama of knowledge development for scholars who seek to understand this interdisciplinary field, to provide latest research information and hot and emerging frontier knowledge topics. Moreover, we provide a valuable literature reference for scholars in the fields of environmental science, public health, sustainability, and neuroscience related to building construction.

## MATERIALS AND METHODS

## **Data Retrieval**

We first determined search terms for literature retrieval. To this end, we divided neuroscience tools into two main categories, namely physiological and neurophysiological tools. When discussing application of neuroscience tools in the field of marketing and information systems, Dimoka et al. (2012) and Alvino et al. (2020) reported the use of various physiological tools, including electrocardiography (ECG), electromyography (EMG), electrodermal activity (EDA), eye tracking (ET), and voice pitch analysis (VPA), among others, as well as neurophysiological tools such as electroencephalogram (EEG), functional magnetic resonance imaging (fMRI), functional nearinfrared spectroscopy (fNIRs), magnetoencephalogaphy (MEG), transcranial magnetic stimulation (TMS), and transcranial direct current stimulation (tDCS), among others. Numerous measurement tools are currently applied in neuroscience. However, searching these tools in the database and limiting them to the field of building construction, after searching one by one, revealed that only a handful of them have actually been used for research in the field of building construction. Only nine neuroscience tools have been so far used in this field (Table 1). The search terms used in this study are also outlined in Table 1.

After identifying the search terms for each neuroscience tool, we searched the Web of Science Core Collection, Scopus, and PubMed databases for articles in the field of building construction, which applied neuroscience tools. Among them, Web of Science and Scopus cover literature in the fields of natural sciences, social sciences and other scientific fields, while PubMed focuses on literature in the medical field. We focused on these three commonly used databases to collect complete literature

TABLE 1	Search terms	for neuroscience	tools used in	building	construction.
---------	--------------	------------------	---------------	----------	---------------

Tool classification	Search terms
Physiological tools	Electrocardiogram (ECG)
	Electromyography; electromyogram (EMG)
	Electrodermal activity (EDA); galvanic skin response (GSR); Skin conductance responses (SCR); skin conductance level (SCL)
	eye tracking; eye tracker (ET)
Neurophysiological tools	Electroencephalogram; electroencephalography; electro-encephalography (EEG)
	functional near-infrared spectroscopy (fNIRS)
	functional magnetic resonance imaging (fMRI) Trigeminal nerve stimulation (TNS)

in this interdisciplinary field. The specific search information is shown in **Supplementary Table 1**. We also screened the bibliographies in the initially downloaded articles, as shown in **Figure 1**, to identify further literature. Then, we adopted the method by Zhang et al. (2019) to remove duplicate and merging documents across the three databases. To this end, two manual screenings were used to identify relevant and eligible articles. Finally, a total of 307 articles were included in the study. Details from the articles, including the title, author, abstract, keywords, source publication, country, institution, publication year, references, and citation frequency, were retrieved.

## Methodology

Bibliometric is a discipline that uses mathematical methods to count the results of scientific research, describe the structure of science, analyze the inner workings of scientific systems, and explore the quantitative laws of scientific activity as a whole (Wang et al., 2022). In this study, we explored the application of neuroscience tools in building construction from an interdisciplinary standpoint, mainly using basic statistical and co-word analysis methods in bibliometric. Co-word analysis, which combines bibliometric and text mining techniques, is a content analysis method that mines the deep semantic relationships between terms. Since it uses co-occurrence patterns of words and phrases in a corpus, it can establish relationships between ideas and concepts in the subject domain thereby presenting them in the corpus. Specifically, if two or more keywords co-occur in a literature, these keywords are considered to have a co-occurrence relationship with each other. Co-word analysis identifies the strength of co-occurrence between terms and creates a set of lexical maps that effectively illustrate the



strongest associations between individual terms. In the current Information Age, co-word analysis has made it easier for researchers to extract knowledge from texts, including research and conference papers, as well as newspaper articles and book chapters, thus allowing them to identify the degree of semantic closeness between each other *via* frequency of occurrence between specific keywords in the text.

The research framework of this paper is shown in Figure 2. Based on the literature data in this interdisciplinary field, we applied the bibliometric method targeting two aspects of research. The first involved the use basic statistics to analyze the distribution of numbers and citations in literatures to mine the law of change in this field. This method was also used to analyze the affiliation distribution of literatures, mine the most influential countries and institutions, as well as the most authoritative scholars and journals in this field, in order to generate the whole picture of the development of the field. The second aspect entailed the use keywords as the carrier of knowledge content. Since the same meaning of keywords may have different variants, expressions or abbreviations, after cleaning the keyword data, a standard keyword set is constructed. Then, the co-occurrence function in Vosviewer software was used to cluster the keywords, identify the knowledge structure of this interdisciplinary field from the perspective of content analysis, and further mine the core knowledge topics in the application research of each neuroscience tools in the field of building construction, according to co-occurrence frequency of the keywords.

## OVERVIEW OF APPLICATION OF NEUROSCIENCE TOOLS IN BUILDING CONSTRUCTION

## Yearly Distribution of Publications

Literature in this interdisciplinary field were subjected to quantitative statistics and results presented in a graph shown in Figure 3A. Summarily, the first article in this field appeared in 1996. The number of studies has been rapidly rising since 2010, reaching a peak of 76 articles in 2021. The overall trend is close to an exponential growth pattern, in line with the natural law of scientific knowledge growth discovered by Price (1975). Analysis of citations over the years revealed that the overall citations have also grown steadily, albeit with small fluctuations. The highest number of citations was 820 in 2019, followed by 704 in 2017, and indicated that neuroscience has been getting more and more attention from scholars in the field of building construction. Distribution of the number of literatures in the application research of a single neuroscience tool over the years is depicted using a heat map in Figure 3B. Notably, the red dotted box represents the time when each tool was first applied in the field of building construction. Summarily, ECG had cross-applications with the building construction field as early as 1996, while fNIRS and TNS were applied in this field at the latest in 2019. According to literature trends in the heat map, the two neuroscience tools, ET and EEG, had the most application, which rose steadily each year. Therefore, ET and EEG are the mainstream neuroscience tools used in the current research process of related issues in the field of building construction.

## Affiliation Analysis of Publications

The distribution profiles of retrieved articles across countries, institutions, journals, and authors are shown in Figure 4. Figure 4A shows the top eleven countries with 8 or more articles, among which the highest number of articles were from China and the United States, followed by the United Kingdom and South Korea. This indicated that these countries have the most extensive research with regards to application of neuroscience tools. Meanwhile, analytical results of research institutions from which these articles were published are presented in Figure 4B. Summarily, Tsinghua University in China had the highest number of articles, followed by Shanghai Jiao Tong University. Notably, 4 of the eleven institutions with the highest number of articles were from China, with 5 of them from the United States, further affirming that these two countries are the main research sites for the application of neuroscience tools in building construction. Profiles of the most influential scholars are presented in Figure 4C. Summarily, Jebelli Houtan from University of Michigan, United States, has the highest number of publications, while Lian Zhiwei from Shanghai Jiao Tong University has the highest average citation and H-index. It is worth noting that the difference between the H-index and the number of publications of scholars Lian Zhiwei, Fotios S, and Chen Jiayu was only within 1, indicating these scholars' articles are generally of high quality. Distribution of core journals to which these articles belong is illustrated in Figure 4D. From the data, it is evident that Building and Environment has the highest number of publications, while Automation in Construction has the highest average citation. The impact factor of these journals ranged between 2.5 and 8, which indicates that the application of neuroscience tools has gained numerous attention and recognition across the mainstream academic community in the field of building construction.

## KNOWLEDGE FUSION OF NEUROSCIENCE TOOLS IN BUILDING CONSTRUCTION

# Structure Analysis in the Application of Neuroscience Tools

Keyword collection of literatures published in a field can reveal the content characteristics of the research. Therefore, by counting the frequency of keywords in a certain field, we can understand the research focus of the field to a certain extent. Co-word analysis can be used to reveal the co-occurrence relationship between keywords. Notably, appearance of two keywords in the same article reveals that there is a co-occurrence relationship between the two keywords, a phenomenon that reflects the content correlation between keywords. A stronger co-occurrence relationship implies a higher knowledge correlation between the content reflected by the keywords. Vosviewer is a commonly used co-word analysis software, which can establish a co-word





network based on the co-occurrence relationship of keywords. Since a stronger co-occurrence denotes a closer distance between keywords, different clusters can be formed according to the distance, thereby reflecting different knowledge content. Based on this, we employed Vosviewer to mine the knowledge structure of this interdisciplinary field. Firstly, we imported the standardized keyword data into the software and selected Co-occurrence analysis, then selected keywords with a frequency of six or more. Finally, we generated a co-word network as shown in **Figure 5**.

According to the figure, the size and color of the nodes represents the frequency of an average year of keywords, respectively, while the distance between nodes indicates the cooccurrence relationship among keywords. It is worth noting that nodes with high co-occurrence frequency are closer to each other. Therefore, safety, environment, and thermal comfort, among others, are the key knowledge topics for the application of neuroscience tools in the field of building construction. On the other hand, hazard recognition, wayfinding, and cognitive load, among others are the emerging topics in the field of building construction that have applied neuroscience tools in recent years. Analysis of the clustering formed by the co-occurrence relationship indicated that application of neuroscience tools to the building construction field is concentrated around four subdomains, as follows:

#### **Built Environment**

Urban dwellers spend 80–90% of their time indoors, a phenomenon that exacerbates the impact of the built environment on the human body. Indoor built environment generates a microclimate that creates a certain temperature, humidity, light and other conditions, integrating various



physical phenomena interacting with the space, while the human body has a dynamically physiological and psychological stress response to changes in the indoor environment, affecting the comfort perception and satisfaction with the indoor environment. Previous studies have reported application of current neuroscience tools to various aspects of building indoor environment research, including exploration of thermal comfort, sleep quality, and cognitive performance under different indoor conditions of temperature, humidity, and airflow (Pan et al., 2012; Lan et al., 2019; Lang et al., 2022). These tools have also been employed to uncover the effects of high concentrations of ozone, carbon dioxide, aerosols, particulate matter and other air pollution on human physiology, neurophysiology as well as other physical and mental health aspects (Huang et al., 2019; Snow et al., 2019). Moreover, the tools have been instrumental in identifying the effects of different light conditions, light sources, and lighting tools on human visual comfort, sleep, attention, alertness, and mood, among others (Lin and Westland, 2020). Furthermore, studies have described the use of these tools to successfully identify the effects of different types and levels

of noise on human physiological and psychological responses (Lan et al., 2021). In addition, neuroscience tools have also been applied in research on indoor and outdoor plants. For example, scholars explored the effects of indoor plants on human comfort, mental stress, happiness as well as other physiological and psychological effects (Hassan et al., 2020; Elsadek and Liu, 2021), and the effects of different plants and colors in outdoor green spaces and the layout of green landscape on mental health (Huang et al., 2021).

#### **Construction Safety**

The high number of injuries and accidents in the construction industry has been attributed to long-term exposure of construction workers to risks coupled with little sensitivity to hazards. Previous studies have shown that accurate and timely identification of accident hazards is imperative to effective reduction of accidents at construction site and maintenance of construction safety (Wang et al., 2017). Traditional safety assessment methods, such as interviews and questionnaires, have been previously used. In recent years, neuroscience tools



have been gradually applied as a more immediate and objective method. Construction hazard recognition is the most frequently applied topic. EEG can be applied to measure the level of physical and mental fatigue among construction workers and assess the safety hazards, such as trips, falls, and impacts, caused by workers' mental and emotional state including depression, and stress, thereby improving health and productivity (Hasanzadeh et al., 2018; Tehrani et al., 2021). Scholars have also employed eye tracking to explore the visual search and attention allocation patterns of workers with different personality traits, knowledge levels, and experience levels (Fu et al., 2022). This approach has enabled effectively identification of on-site hazards, and analysis of the probability of hazards caused by search defects (Hasanzadeh et al., 2017). Accordingly, risk perception is a key part of workers' safety decision making. Therefore, active safety training for construction workers is imperative to improving their risk alertness, attention levels and risk perception (Choi et al., 2019). Neuroscience tools, targeting neuroscience measurement, are also commonly used to study workers' attitudes and willingness to train safely, assess the degree of improvement in safety hazard recognition ability under different training modes, and establish post-training safety warning as well as job performance assessment systems (Comu et al., 2021).

#### Architectural Design

Architectural designs should consider both the aesthetic and functional requirements of the building. Currently, neuroscience tools are frequently used in architectural design, mainly with regards to developing architectural aesthetic, environmental and interior navigation designs. Architectural appearance greatly impacts the aesthetic experience of the observer, while the judgment of beauty and unattractiveness are closely related to personal expertise as well as subjective feelings. Therefore, architects usually use eye tracking technology to not only determine the aesthetic effect of architectural elements but also explore the relationship between the observer's gaze pattern with the formal properties of architectural elements under different design parameters (Jam et al., 2021). Previous studies have also reported the use of ERP and fMRI in analysis of key psychological dimensions sensitive to specific design parameters and the neural features evoked (Ma et al., 2015; Coburn et al., 2020). For interior environment design, a combination of virtual reality (VR) with EEG/ERP, ET has been used to effectively measure neurophysiological information related to human subjective feelings as well as cognitive functions across different interior environments. These include the proportion of interior functional areas, lighting designs, room color schemes, furniture color and other spatial environment designs, with respect to human emotions, security and comfort (Tuszynska-Bogucka et al., 2020). In terms of navigation design, since indoor wayfinding is a daily and complex activity, current researches have also applied high-resolution, immersive virtual reality (VR) technology, in combination with EEG and ET, to mine human way finding data. Consequently, these data have enabled effective understanding of the working memory and cognitive workload during execution of navigation tasks by designing different route parameters in the virtual platform, and finally propose the optimal route plan for interior design (Vecchiato et al., 2015).

## Occupational Health

The construction industry is one of the most labor-intensive industries. Notably, workers in this sector are faced with

#### TABLE 2 | Physiological parameters measured by ECG.

Parameter		Implication
Time-domain analysis parameters	SDNN	Sensitive indicators for assessing sympathetic nerve function
	RMSSD	Sensitive indicators for assessing parasympathetic function.
	pNN50	Reflects the tension level of the parasympathetic or vagal nerve
Frequency domain analysis parameters	HF	Reflects parasympathetic or vagal activity
	LF	Reflect sympathetic nerve activity
	LF/HF	Reflects the balanced control of the autonomic nervous system

demanding physical tasks almost every day, which take a toll on their health, as evidenced by prevalence of various conditions such as musculoskeletal disorders. For example, Umer et al. (2017) reported that steelworkers suffer from low

#### **TABLE 3** | Research summary of ET applications in building construction.

while Anton et al. (2013) demonstrated that porters suffer from shoulder pain and other bodily pain when carrying various types of loads. These tasks expose workers to musculoskeletal disorders caused by a variety of ergonomic risks. Current EMG techniques in neuroscience have been applied in analysis of occupational health hazards among construction workers, such as in identification of the degree of chronic muscle fatigue, an important cause of musculoskeletal disorders (Seo et al., 2016). Particularly, this has been achieved by continuously monitoring biomechanical variables, including trunk muscle activity and trunk kinematics through surface electromyography and motion sensing (Umer et al., 2017), thereby determining which tasks cause excessive physical strain on construction workers. To reduce the risk of musculoskeletal disorders among the workers, construction managers need to better understand the physical and biomechanical requirements of various construction tasks. This will allow them to not only effectively implement appropriate preventive measures and improve occupational health in the construction industry, but also increase productivity of the construction workers.

back pain caused by prolonged static or awkward postures,

Торіс	Subtopic	Index	Eye tracker	References
Built environment	Light environment	Mean Pupil Diameter (PD), Pupillary Unrest Index (PUI), Blink Rate (BR), Blink Amplitude (BA), eye Fixation Rate (FR), and Eye Convergence (EC)	Tobii Pro Glasses 2	Garreton et al., 2015; Hamedani et al., 2020; Liu et al., 2021
Construction safety	Hazard recognition	Fixation count, fixation duration, time to first fixation, pupil size, fixation heat map, scan paths, intersection coefficient	Tobii Pro Glasses 2, Tobii T60 XL	Sun and Liao, 2019; Xu et al., 2019; Han et al., 2020; Cheng et al., 2021; Chong et al., 2021; Wang et al., 2021
	Attention	Fixation time, fixation count, run count, dwell time, run count, dwell percentage, and first fixation time, Pupil dilation, Saccadic velocity, Saccadic duration	Tobii Pro Glasses 2, EyeLink II, Tobii Glasses II	Hasanzadeh et al., 2017; Hasanzadeh et al., 2018
	Mental fatigue	Blink rate/count, blink duration, pupil diameter, percent change in pupil diameter (PCPD), fixation duration, fixation count, gaze point position	Pupil Labs	Li et al., 2019; Li et al., 2020; Cheng et al., 2022a
	Safety Training	Dwell Time, Fixation Counts (FC), Fixation Time (FT), Mean Fixation Duration (MFD), Visual Attention Index (VAI), Ratio of On-Target: All-target Fixation Time (ROAFT), Time to First Fixation	Tobii Glasses 2, Tobii Pro X2-30 Hz, SMI iView XTM HED	Jeelani et al., 2018; Wang et al., 2018; Comu et al., 2021
Architectural design	Aesthetic design	Fixation Duration	Tobii Pro Glasses 2, Evel ink	Azemati et al., 2020; Jam et al., 2021
	Architectural perception	Mean fixation duration, fixation count, Pupil Diameter, time to first fixation, number of fixations during observation, average number of fixations, total duration of all fixations, number of visits during observation, average number of visits per person	Tobii TX300, Pupil Labs ET, Tobii X2-30	Tuszynska-Bogucka et al., 2020; Shemesh et al., 2021
	Indoor Navigation	Relative number of fixations, fixation counts, fixation time	Tobii Pro Glasses 2	Schrom-Feiertag et al., 2017
	Biophilic design	Total Fixation Duration, fixation time	Tobii Glasses 2, Tobii Pro VB Integration	Yin et al., 2019; Lei et al., 2021

## Topic Analysis in the Application of Physiological Tools

## Electrocardiogram

The electrocardiogram (ECG) is a non-invasive technique for measuring the electrical activity and electrophysiological response of the heart. Its simplicity, portability, and good temporal resolution make it ideal for clinical use. Heart rate variability (HRV) is a physiological measure of the variability of the human heart rate cycle and contains information on the regulation of the cardiovascular system by neurohumoral factors, reflecting the tension and balance of cardiac sympathetic and parasympathetic activity and their effect on cardiovascular system activity. HRV level is considered to be an indicator of physiological stress or arousal, increasing with low HRV and decreasing with high HRV. Therefore, changes in HRV can be used to analyze information about human thoughts, emotions, and behaviors, revealing individuals' psychological responses to different environments or stimuli, such as emotional, fatigue, stress, and other psychological states. Table 2 details the most commonly used ECG analysis indexes in the field of building construction. By recording various HRV indexes, information on the autonomic nervous system and stress state can be acquired to provide clues and a basis for the study of human factors in this field.

**Figure 6** shows the co-word network of ECG used in the field of building construction. As illustrated in the figure, ECG is mainly used in research topics related to the indoor environment. Among the thermal comfort topics, research has revealed that cold indoor temperatures have a negative effect on cardiovascular health (Umishio et al., 2021), whereas human

thermoregulation is related to thermal comfort and is regulated by the autonomic nervous system. HRV is sensitive to changes in ambient temperature and human thermal sensation and may be utilized as a potential physiological indicator of human thermal comfort (Liu et al., 2008). When thermal sensation is neutral or slightly significant, sympathetic and parasympathetic nerves are in relative equilibrium. When thermal sensation is significant or thermal discomfort is present, sympathetic nerves are in a more active state and can trigger emotions such as stress and anxiety (Yang et al., 2021). Within the context of air pollution, studies have demonstrated that higher levels of indoor exposure to carbon monoxide (Riojas-Rodriguez et al., 2006), carbon dioxide (Zhang et al., 2021), and ozone (Huang et al., 2019) result in elevated HRV, as reflected by decreased parasympathetic regulation (RMSSD, HF, pNN50) and increased sympathetic drive (SDNN, LF, LF/HF), while increased exposure to indoor particle pollutants, especially PM2.5, causes HRV levels to decrease (Cavallari et al., 2007), thus increasing cardiovascular risk (Jia et al., 2012). Within the context of indoor plants, it is demonstrated that the LF/HF ratio of viewing plants of different colors is significantly negatively correlated to human satisfaction, demonstrating that HRV is a valid physiological parameter for assessing the comfort provided by indoor plants (Qin et al., 2014).

## Electromyogram

Electromyography (EMG) is a technique that utilizes surface electrodes to acquire bioelectrical signals generated during neuromuscular system activity. EMG signal analysis focuses on both time-domain analysis and frequency domain analysis. The





purpose of this study is to investigate the possible causes of EMG changes and reflected muscle activity and function by correlating the time domain and frequency domain characteristics of EMG and muscle structure, as well as muscle activity and functional status. In recent years, EMG has also been gradually used in the construction field. Researchers typically connect EMG sensors to the upper arm, cervical spine, thoracic spine, lumbar spine, and back of workers to monitor their muscular status during heavy lifting, repetitive weight lifting, awkward kneeling, or squatting postures, and prolonged knee and neck flexion, etc. The most often used metrics for analyzing the EMG signals include, root mean square normalization, mean absolute value, median frequency, etc. (Ahn et al., 2019).

Figure 7 shows the co-word network of EMG used in the field of building construction. As can be observed, the use of EMG in the building construction field is mostly focused on the identification of muscle fatigue and the analysis of construction workers' muscle ergonomics. In the area of muscle fatigue recognition, the amplitude of the EMG increases with the degree of fatigue during the process of muscle isometric contraction to fatigue, and studies have shown that the fatigue rate of the lumbar muscles of steelworkers is significantly higher than other parts of the body (Antwi-Afari et al., 2017) and that the EMG activity of lumbar muscles decreases significantly when bending over to assemble rebar (Umer et al., 2018). When construction workers are working on the roof, the slope of the roof and their kneeling posture have a significant effect on the peak activation of knee muscles (Dutta et al., 2020). Additionally, EMG can also detect the development of muscle strength and fatigue of construction workers in performing repetitive manual tasks and can predict the degree of muscle fatigue by analyzing the root mean square normalized amplitude of EMG (Li et al., 2017). Muscle ergonomics analysis demonstrates that the use of passive exoskeleton systems significantly reduces lumbar

vertical spine muscle activity and that the reduction is even greater when weight lifting loads (Antwi-Afari et al., 2021). Meanwhile, EMG measurements of upper body muscle load between painters of different sexes reveal that female house painter have a higher relative muscle load than their male counterparts (Meyland et al., 2014).

## **Electrodermal Activity**

Electrodermal activity (EDA) is a physiological technique for determining the conductivity of human skin by applying a small but constant voltage to the skin and measuring changes in electrical currents caused by sweat secretion (Mansi et al., 2021), including skin conductance level (SCL) and skin conductance response (SCR), where SCL indicates sympathetic activity induced by chronic stress and SCR can explain the correlation



FIGURE 8 | Keywords co-occurrence network of EDA in building construction.

between specific stimulus events and levels of emotional arousal. Because sweat glands are innervated by the sympathetic nervous system, EDA is an ideal measure of sympathetic activation, which is influenced by the hypothalamus and limbic system (brain regions associated with emotion), making EDA a good indicator of an individual's mood, arousal, stress, attention, and risk perception levels (Mansi et al., 2021). EDA is currently the most effective and sensitive physiological parameter for detecting changes in individual sympathetic arousal due to its high stability, ease of measurement, and high sensitivity (Mansi et al., 2021).

Figure 8 shows the co-word network of EDA used in the field of building construction. At the moment, EDA is primarily used in the built environment, where excessively high or excessively low indoor temperature (Chou et al., 2016; Sepehri et al., 2021), and a cold white lighting environment (Basso, 2001) can increase EDA, thereby increasing work stress for indoor workers. When people spend an extended period in a noisy environment, their respiration rate drops sharply and their EDA levels significantly increase (Park et al., 2018). Indoor placement of plants and artificial windows reduces people's SCL levels, demonstrating that natural elements can be effective in relieving stress and reducing arousal (Kim et al., 2018), and similarly installing green walls indoors helps alleviate negative emotions (Yin et al., 2018). Wearable biosensors with integrated EDA capabilities are used in construction safety studies to obtain physiological signals from workers to assess their stress levels and the physical demands required for different jobs (Jebelli et al., 2019). For example, studies have found that workers with loads produce higher EDA values than those without loads (Anwer et al., 2021), and EDA can also be used to predict concentration levels by monitoring workers' biosignals (Kim et al., 2021). EDA is often used in conjunction with VR in architectural design research to investigate the perception of human experience and emotional responses in architectural spaces and built environments (Ergan et al., 2019). For example, SCR may be used to measure and quantify the effect of geometric manipulation of building spaces on human emotional responses (Shemesh et al., 2021), as well as the effect of irregular exterior window shapes and sunlight exposure conditions on occupant pleasantness in the interior (Chamilothori et al., 2019).

## Eye-Tracking

Eye-tracking (ET) is a technique that measures the properties of human eye movements as they process perspective information and is commonly used in studies on attention, visual perception, etc. Eye movement is closely related to visual attention, which is typically associated with cognitive processing, which determines human behavior. Consequently, human behavior can be efficiently analyzed by monitoring eye movement trajectories. The primary measures used in ET research include gaze and saccade, as well as a variety of derived metrics based on basic measurements such as gaze, scan path, pupil size, blink rate, etc. Similarly, ET can also define areas of interest (AOI) based on the scene and measure eye fixation and saccade between AOIs, including the number of fixations and running counts within the AOI. Increased fixation time and count of fixations to a specific area indicate increased interest in the target. With the evolution of ET technology, eye trackers are becoming increasingly prevalent in building construction, where two distinct types of eye tracker systems are commonly used. One is a stationary eye tracker system that requires the subject to sit in front of a monitor for visual tasks, while the other is a mobile eye tracker that uses an eyeglass-like sensor to record eye movement data as well as changes in head position (Hasanzadeh et al., 2018).

Figure 9 illustrates an ET co-word network used for research in the field of building construction. Since ET is widely used in construction, this section further details research on the core knowledge topics listed in Table 3. ET is mostly used in the built environment to study the light environment, where glare is a significant factor affecting the visual comfort of indoor personnel. PUI, BA, FR, and other indicators can indicate visual discomfort caused by glare, but increasing ambient luminance contrast can improve efficiency in a non-glare environment (Liu et al., 2021). In construction safety, it is discovered that the visual search patterns of workers who correctly identify hazards differ from those who do not, with attention deficit and mental fatigue being the primary reasons for workers' decreased ability to detect hazards. The decrease is related to a change in the distribution of fixation and gaze points, and the use of wearable eye-tracking equipment can help identify construction hazards more accurately. From a safety training perspective, scan paths and fixation heat maps generated by ET technology can effectively reveal focused or personalized feedback to workers, and this feedback communicates to workers defects in the search process, eliciting reflection and thereby facilitating hazard recognition (Jeelani et al., 2018). ET technology has been used in architectural design to assess the aesthetic effect of architectural elements based on the gaze pattern of the eyes and has also been applied to the perception of building interior and exterior decoration and geometric design, reflecting people's emotional response to various architectural spaces through pupil diameter and fixation time. ET is frequently used in conjunction with VR technology in indoor wayfinding studies to examine indoor navigation and signage design using metrics such as fixation time. Additionally, biophilic design elements such as greenery are gaining popularity, and the use of eye movement metrics such as total fixation time can help designers better understand how office design can contribute to occupant's health and performance (Guo et al., 2022).

## Topic Analysis in the Application of Neurophysiological Tools

## Electroencephalogram and Event-Related Potential

The electroencephalogram (EEG) is a technique for recording brain activity using electrophysiological indicators. It records the electrical activity generated by neurons in the cerebral cortex by amplifying microscopic electrical signals in the cerebral cortex. The human brain is made up of tens of thousands of neurons that transmit information that causes the voltage across its membranes to vary in milliseconds, resulting in brain waves of different frequencies. Each rhythm of brain waves is associated with a specific state of the brain, as shown in **Table 4**, and these rhythms are identified by frequency and amplitude. The



Frequency bands	Frequency	Mental state	Research topic
Delta (δ)	0.5–3.5 Hz	Delta appears in deep non-REM sleep and is usually located in the thalamus	sleep disorders, alcoholism
Theta (θ)	4–7 Hz	Theta is associated with difficulties with mental operations (e.g., inattention, distraction, memory difficulties, anxiety, depression, etc.)	Mental load, working memory, cognitive effort, anxious temperament
Alpha (α)	8–12 Hz	Alpha occurs when emotions are stable or relaxed, is associated with relaxed wakefulness, and contributes to mental coordination, calmness, and alertness	physical and mental relaxation
Beta (β)	13–30 Hz	Beta occurs during moments of mental activity, busy or anxious thinking, and is associated with focus, analysis, conscious alertness	Concentration, stress levels, alertness levels
Gamma (γ)	> 30 Hz	Gamma occurs in advanced information processing or complex mental activities such as cognition, memory or associative learning	Cognitive processing, problem solving, learning, facing cognitive challenges

event-related potential (ERP) is a type of brain evoked potential, that is formed by the synchronization of postsynaptic potentials of a large number of neurons induced by a stimulus event, and it reflects neurophysiological changes in the brain during cognitive processes (Hou et al., 2021). EEG and ERP have high temporal resolution and can identify human emotions, cognition, and other psychological conditions. They are being used more widely used in the field of building construction than other methods. **Table 5** shows the building topics analyzed and the EEG indicators involved.

On the basis of the co-word network of EEG in **Figure 10**, **Table 5** further summarizes the research topics and sub-topics of EEG applied to building construction, the commonly used EEG indicators, and EEG channels, the cognitive and emotional states, and the representative references. Thermal perception in the built environment is determined by the arousal and mood



#### **TABLE 5** | Research summary of EEG applications in building construction.

Торіс	Subtopic	Index	Channels	Mental State	References
Thermal environment	Thermal comfort	α power, β power, γ power, power density spectra (PDS), Mental workload index	Cz, C3, C4, Fz, F3, F4, P3, POz, AF3, AF4, T7, T8, Pz	Sleep quality, cognitive load, mental workload, working memory, perception, reaction, attention	Yao et al., 2009; Zhang et al., 2017; Choi et al., 2019; Wang et al., 2019
	Thermal pleasure	Relative $\beta$ power, relative $\theta$ power	P3, P4, Cz, C3, C4, Fz, F3	Emotion, pleasant, satisfaction, relaxation	Son and Chun, 2018; Han and Chun, 2021
Acoustic environment	Noise	$\theta/\beta$ power, Asymmetry index (ASI) of $\alpha$ power	AF3, AF4, F3, F4, F7, F8, FC5, FC6, C3, C4	Attention, stress, mental workload	Ke et al., 2021; Lan et al., 2021
Lighting environment	Illuminance, color temperature	$\beta$ power, frontal asymmetry index (FAI), $\alpha\text{-band}$ percentage	FP1, FP2, C3, C4, O1, O2, F3, F4	Sleep, relaxation, work engagement	Kakitsuba, 2016; Deng et al., 2021
Air quality	Air pollution	$\alpha$ relative power, $\beta$ relative power, High- $\delta$ power, $\theta$ relative power	C3, Cz, C4, P3, P4, P7, P8, Pz, T7, T8, O1, O2, FC6, F8	Executive function, reaction time, working memory, attention, cognitive flexibility	Shan et al., 2019; Snow et al., 2019; Zhang et al., 2021
Plant environment	Indoor plant	Relative EEG power	C3, CZ, F3, FZ	Comfort, attention, memory	Qin et al., 2014; Elsadek and Liu, 2021; Llinares et al., 2021
Construction safty	Mental Workload	Power spectral densities (PSD), EEG-engagement index (EN)	TP9, FP1, FP2, TP10	mental workload, inattentional blindness	Chen et al., 2016, 2017, 2022
	Hazard Recognition	PSD, average value of amplitude	14 channels	Hazard perceptions	Jeon and Cai, 2021; Noghabaei et al., 2021
	Fatigue Monitoring	$(\theta + \alpha)/\beta$ , $(\theta + \alpha)/(\alpha + \beta)$ , $\alpha/\beta$ , $\theta/\beta$	14 channels	Drowsiness, mental fatigue	Aryal et al., 2017; Li et al., 2019; Xing et al., 2020
	Attention and vigilance	$\alpha$ power, PSD, relative EEG power	14 channels	Attention, vigilance, distraction	Ke et al., 2021; Wang et al., 2017, 2019; Cheng et al., 2022b
	Stress recognition	$\alpha,\beta,\theta,\delta$ mean power, Median frequency, PSD	AF3, AF4, F3, F4, FC5, FC6, F7, F8, P7, P8, O1, O2	Stress	Jebelli et al., 2018; Chae et al., 2021
	Emotional state	PSD	14 Channel	Emotion	Hwang et al., 2018; Xing et al., 2019
Architectural design	Space design	Ratio of $\alpha$ to $\beta$ waves (RAB), power spectrum, event-related spectral perturbations (ERSPs)	F4, P3, F7, CP2, FC6, P3	Emotion, stress and anxiety, relaxation, arousal	Banaei et al., 2017; Ergan et al., 2019
	Environmental design	PSD, Individual $\alpha$ frequency (IAF)	F3, P7, Pz, P4, P8, O1, O2, FP2, F8	Novelty, comfort, pleasantness, arousal	Vecchiato et al., 2015

of the indoor thermal environment, and temperature changes affect brain rhythms and the power spectral densities (PSD) of brain electricity, which affects thermal comfort and thermal pleasure. Construction noise, as well as prolonged indoor noise in the building sound environment, can affect people's minds and bodies. The alpha band which is excited by varying degrees of illumination and color temperatures in the lighting environment can reflect people's mental states. When indoor air quality is poor and pollution levels are high, theta and beta powers of the human brain increase and can result in bad moods, whereas the alpha waves of the human brain are more active when viewing indoor plants and can significantly relieve personal stress. When workers are subjected to different stressors during construction, different brain wave patterns are generated, reflecting their emotional state, attention level, mental workload, and other mental activities. Monitoring and identification of worker fatigue using EEG can significantly reduce construction hazards, while lowfrequency gamma waves can also reflect workers' vigilance and attention levels. According to research, theta waves in the anterior cingulate cortex are associated with the emotional perception of specific geometric landscapes. EEG can help improve the architectural design and create environments that meet human needs by better understanding the impact of architectural design on human perception and subjective experience. Furthermore, when summarizing the existing literature in the field of building construction applied EEG, the analysis of data extracted by EEG primarily uses machine learning methods such as artificial neural network (ANN), support vector machine (SVM), random forest (RF), and hidden Markov models (HMM).

#### **Functional Magnetic Resonance Imaging**

Functional magnetic resonance imaging (fMRI) is a noninvasive imaging technique commonly used to study brain function. Its basic principle is to use magnetic resonance imaging to measure the hemodynamic changes induced by neuronal activity. While fMRI offers some advantages such as noninvasiveness, reproducibility, high spatial resolution, etc., its temporal resolution is low compared with neurophysiological tools such as EEG and fNIRs. Therefore, fMRI can dynamically track the changes of signals in various brain regions, such as those induced by thinking activities and cognitive experiences. Additionally, the high-resolution brain imaging images generated by fMRI are better visualized, making the technique more accessible to non-expert audiences. However, fMRI also has limitations in terms of motion restrictions and higher costs, mainly due to the cost of maintaining the equipment and hiring technicians to operate the scanner.

The co-word network in **Figure 11** shows the application research for fMRI in the field of building construction. As illustrated in the figure, fMRI is mainly used in studies on architectural design. Because architecture's aesthetic quality affects people's well-being, the aesthetic response to architecture can be explained in terms of psychological dimensions associated with specific neural features of the brain (Coburn et al., 2020). Scholars have discovered that the prefrontal and hippocampal brain areas are involved in the evaluation of architectural aesthetics, with the primary factor affecting the activation of the

parahippocampus place area being the openness of the space, which is typically regarded as more beautiful (Chatterjee et al., 2021). By studying the effect of ceiling height on aesthetic judgments in architectural design, researchers discovered that visuospatial processing activates the left anterior cuneiform and left middle frontal gyrus of the brain (Vartanian et al., 2015). Specific architectural styles can also induce contemplative states; for example, certain contemplative buildings (e.g., museums, churches, libraries, etc.) cause significant activation of the left posterior central gyrus and left inferior parietal phase, eliciting contemplative experiences (Bermudez et al., 2017). Additionally, construction noise has been studied using fMRI, and it was discovered that persistent noise exposure may alter the limbic gyrus (particularly the cingulate and parahippocampal gyrus), as well as adhesion locations, including the anterior cuneus and posterior lobe of the cerebellum (Dai and Lian, 2018).

## Functional Near-Infrared Spectroscopy

Functional near-infrared spectroscopy (fNIRS) is a wearable spectroscopy system that measures blood oxygen concentration to detect neurocognitive activation. fNIRS works by emitting near-infrared light in the 700-900 nm spectrum into the human cortex, and detecting the unabsorbed reflected light based on the sensitivity of blood oxygen to the wavelength and the light attenuation of the wavelength; thus elevated oxygenated hemoglobin concentrations can be used as a proxy for brain activation. In the field of cognitive neuroscience, the application of fNIRS has grown rapidly in recent decades, mainly due to its advantages over other neuroimaging modalities (fMRI, EEG) in terms of non-invasiveness, convenience, high spatial resolution, high temporal resolution, insensitivity to body movements and flexible application to a variety of experimental scenarios (inside and outside the laboratory) (Pinti et al., 2020). fNIRS is now being used not only in the fields of medicine and psychology but also in the humanities, social sciences, engineering, and other fields.

Figure 12 shows the co-word network of fNIRs used in building construction research. This tool is not extensively used at the moment, and it is mainly used for the research on hazard identification in construction safety. Hazard recognition is a visual search and cognitive processing process, fNIRS recordings of workers' prefrontal cortex (PFC) activity reveal a negative association between PFC activity and hazard recognition ability (Zhang et al., 2021). During hazard recognition, different cortical regions of the PFC are differentially and continuously activated, with the left PFC being more involved, the dorsolateral PFC is used for electrical and shock-related hazard recognition, and the ventral PFC being used for stab-related hazard recognition (Zhou et al., 2021). However, when compared to other hazards such as electrical and fire hazards, fall hazards activate the brain more and use significant cognitive resources (Liao et al., 2021). Additionally, some researchers have also developed an HRA index to measure workers' ability to identify hazards using PFC activation data obtained via fNIRS (Sun and Liao, 2019). Meanwhile, fNIRs are being employed in indoor wayfinding research, where they are used to assist in the design of adaptive wayfinding systems by monitoring and classifying real-time cognitive load (Zhu et al., 2021).





## CONCLUSION

Over the last two decades, neuroscience tools, have expanded beyond medical and psychological applications to include humanities, social sciences, engineering, and other disciplines, resulting in the cross-fertilization of interdisciplinary knowledge with human-related research fields in these disciplines. The discipline of building construction is a perfect example of the interdisciplinary application of neuroscience tools. Given that the construction industry involves human physiological and psychological states, both for practitioners and building users, the application of neuroscience tools can significantly aid research in the field of building construction, ultimately achieving the overall goal of improving building safety, comfort, and health. Thus, this paper uses bibliometric approaches to examine the general knowledge overview and the specific knowledge structure and knowledge topics of neuroscience tools used in the field of building construction to determine how these tools advance scientific research in the field of building. In general, the main conclusions are as follows:

Knowledge overview: In the last decade, neuroscience tools have gained increasing attention from scholars in the field of building construction, and the number of related research literature has grown exponentially. ET and EEG are the most frequently used tools, primarily because ET can discover workers' and indoor personnel's visual search patterns, and EEG can monitor the mental power and cognitive status of workers and indoor personnel in realtime. Both of these tools may be mounted on wearable sensing devices, making them more suitable for non-laboratory research in the field of building construction. China and the United States currently have the strongest research capacities in this interdisciplinary field. Simultaneously, the majority of scientific research institutions and scholars who have made significant contributions to this field are from these two countries, indicating that these institutions and scholars are setting the future development trend for this interdisciplinary field. Additionally, the overwhelming majority of literature in this interdisciplinary field is published in journals with an impact factor of 2.5 and 8, demonstrating that the use of neuroscience tools to study building construction issues has been recognized by the mainstream academic community.

Knowledge structure: Using co-word analysis methods, the knowledge structure division of research on the application of neuroscience tools in the building construction field reveals that the research is mainly clustered into four directions, namely, built environment, construction safety, architectural design, and occupational health. In terms of specific neuroscience tools, ECG is mainly used to study the built environment; EMG is mainly used to study occupational health; fMRI is mainly used to study architectural design, and TNS currently includes only one article on the study of construction safety. EDA, ET, EEG, and fNIRs are used in the first three research directions, with ET and EEG being the most commonly used in the field of building construction and involved in research on topics such as thermal environment, acoustic environment, light environment, and air quality in the built environment. There is also research on topics such as hazard identification, mental fatigue, safety training, attention and alertness, stress levels in construction safety, aesthetic design, spatial design, and biophilic design in architectural design.

## REFERENCES

- Ahn, C. R., Lee, S., Sun, C. F., Jebelli, H., Yang, K., and Choi, B. (2019). Wearable sensing technology applications in construction safety and health. J. Constr. Eng. Manage. 145:03119007. doi: 10.1061/(ASCE)CO.1943-7862.0001708
- Aliyeva, S. S. (2022). Relationship between interdisciplinarity and transdisciplinarity: an essentially contested concept perspective . J. Soc. Sci. Res. doi: 10.1080/13511610.2021.2023003

This paper attempts to present an exhaustive and systematic assessment of the application of neuroscience tools in the field of building construction, but there are some limitations. First and foremost, this research focuses on the application of neuroscience tools in the construction of buildings. The research literature on civil engineering applications such as bridges, roads, and subways is excluded throughout the process of data screening. In the future, we will be able to thoroughly investigate the application of neuroscience tools in the field of civil engineering. Secondly, only co-word analysis is used in this study to investigate the application of neuroscience tools, but co-citation analysis and main path analysis can be used in the future to uncover the highly cited literature and the citation relationships between the literature in this study. Although there are some limitations, preliminary research in this paper suggests that neuroscience tools used for construction problems are an emerging frontier research direction that provides a powerful methodological tool for human-related research problems across the construction projects' life cycle.

## **AUTHOR CONTRIBUTIONS**

MW designed the study and wrote the manuscript. XL wrote the manuscript. YL, WC, and ZW analyzed the data. XG revised the manuscript. All authors contributed to the article and approved the submitted version.

## FUNDING

This study was supported by the National Natural Science Foundation of China (72104192), the China Postdoctoral Science Foundation (2020M683674XB), Shaanxi Soft Science Foundation (2021KRM161), and Shaanxi Natural Science Foundation (2022JM-429).

## ACKNOWLEDGMENTS

We would like to thank Zhenzhen Wei for her contribution to English editing.

## SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fnins. 2022.895666/full#supplementary-material

- Alvino, L., Pavone, L., Abhishta, A., and Robben, H. (2020). Picking your brains: where and how neuroscience tools can enhance marketing research. *Front. Neurosci.* 14:577666. doi: 10.3389/fnins.2020.577666
- Anton, D., Mizner, R. L., and Hess, J. A. (2013). The effect of lift teams on kinematics and muscle activity of the upper extremity and trunk in bricklayers. *J. Orthop. Sports Phys. Ther.* 43, 232–241. doi: 10.2519/jospt.2013.4249
- Antwi-Afari, M. F., Li, H., Edwards, D. J., Parn, E. A., Seo, J., and Wong, A. Y. L. (2017). Biomechanical analysis of risk factors for work-related musculoskeletal

disorders during repetitive lifting task in construction workers. *Autom. Constr.* 83, 41–47. doi: 10.1016/j.autcon.2017.07.007

- Antwi-Afari, M. F., Li, H., Anwer, S., Li, D. W., Yu, Y., Mi, H. Y., et al. (2021). Assessment of a passive exoskeleton system on spinal biomechanics and subjective responses during manual repetitive handling tasks among construction workers. Saf. Sci. 142:105382 doi: 10.1016/j.ssci.2021.105382
- Anwer, S., Li, H., Antwi-Afari, M. F., Umer, W., Mehmood, I., and Wong, A. Y. L. (2021). Effects of load carrying techniques on gait parameters, dynamic balance, and physiological parameters during a manual material handling task. *Eng. Constr. Archit. Manag. Ahead of Print* doi: 10.1108/ECAM-03-2021-0245
- Aryal, A., Ghahramani, A., and Becerik-Gerber, B. (2017). Monitoring fatigue in construction workers using physiological measurements. *Autom. Constr.* 82, 154–165. doi: 10.1016/j.autcon.2017.03.003
- Azemati, H., Jam, F., Ghorbani, M., Dehmer, M., Ebrahimpour, R., Ghanbaran, A., et al. (2020). The role of symmetry in the aesthetics of residential building facades using cognitive science methods. *Symmetry-Basel* 12:1438 doi: 10.3390/ sym12091438
- Banaei, M., Hatami, J., Yazdanfar, A., and Gramann, K. (2017). Walking through architectural spaces: the impact of interior forms on human brain dynamics. *Front. Hum. Neurosci.* 11:477 doi: 10.3389/fnhum.2017.00477
- Basso, M. R. (2001). Neurobiological relationships between ambient lighting and the startle response to acoustic stress in humans. *Int. J. Neurosci.* 110, 147–157. doi: 10.3109/00207450108986542
- Bermudez, J., Krizaj, D., Lipschitz, D. L., Bueler, C. E., Rogowska, J., Yurgelun-Todd, D., et al. (2017). Externally-induced meditative states: an exploratory fMRI study of architects' responses to contemplative architecture. *Front. Archit. Res.* 6:123–136. doi: 10.1016/j.foar.2017.02.002
- Boz, H., Arslan, A., and Koc, E. (2017). Neuromarketing aspect of tourism pricing psychology. *Tourism Manage. Perspect*, 23, 119–128. doi: 10.1016/j.tmp.2017. 06.002
- Cavallari, J. M., Eisen, E. A., Chen, J. C., Fang, S. C., Dobson, C. B., Schwartz, J., et al. (2007). Night heart rate variability and particulate exposures among boilermaker construction workers. *Environ. Health Perspect.* 1115, 1046–1051. doi: 10.1289/ehp.10019
- Chae, J., Hwang, S., Seo, W., and Kang, Y. (2021). Relationship between rework of engineering drawing tasks and stress level measured from physiological signals. *Autom. Constr.* 124:103560 doi: 10.1016/j.autcon.2021.103560
- Chamilothori, K., Chinazzo, G., Rodrigues, J., Dan-Glauser, E. S., Wienold, J., and Andersen, M. (2019). Subjective and physiological responses to facade and sunlight pattern geometry in virtual reality. *Build. Environ.* 150, 144–155. doi: 10.1016/j.buildenv.2019.01.009
- Chatterjee, A., Coburn, A., and Weinberger, A. (2021). The neuroaesthetics of architectural spaces. *Cogn. Process.* 22, 115–120. doi: 10.1007/s10339-021-01043-4
- Cheng, B., Luo, X., Mei, X., Chen, H., and Huang, J. (2022a). A systematic review of eye-tracking studies of construction safety. *Front. Neurosci.* 16:891725. doi: 10.3389/fnins.2022.891725
- Cheng, B., Fan, C., Fu, H., Huang, J., Chen, H., and Luo, X. (2022b). Measuring and computing cognitive statuses of construction workers based on electroencephalogram: a critical review. *IEEE Transactions on Computational Social Systems* 1-16 doi: 10.1109/TCSS.2022.3158585
- Chen, J. Y., Song, X. Y., and Lin, Z. H. (2016). Revealing the invisible gorilla in construction: estimating construction safety through mental workload assessment. Autom. Constr. 63, 173–183. doi: 10.1016/j.autcon.2015.12.018
- Chen, J. Y., Taylor, J. E., and Comu, S. (2017). Assessing task mental workload in construction projects: a novel electroencephalography approach. J. Constr. Eng. Manage. 143:04017053. doi: 10.1061/(ASCE)CO.1943-7862.0001345
- Cheng, R., Wang, J. M., and Liao, P. C. (2021). Temporal visual patterns of construction hazard recognition strategies. *Int. J. Environ. Res. Public Health* 18:8779 doi: 10.3390/ijerph18168779
- Choi, B., Jebelli, H., and Lee, S. (2019). Feasibility analysis of electrodermal activity (EDA) acquired from wearable sensors to assess construction workers' perceived risk. Saf. Sci. 115, 110–120. doi: 10.1016/j.ssci.2019.01.022
- Chong, H. Y., Liang, M. X., and Liao, P. C. (2021). Normative visual patterns for hazard recognition: a crisp-set qualitative comparative analysis approach. KSCE J. Civ. Eng. 25, 1545–1554. doi: 10.1007/s12205-021-1362-5
- Chou, C. M., Lu, C. C., and Huang, R. Y. (2016). Effects of different ambient environments on human responses and work performance. J. Ambient Intell. Humaniz. Comput. 7, 865–874. doi: 10.1007/s12652-016-0393-0

- Coburn, A., Vartanian, O., Kenett, Y. N., Nadal, M., Hartung, F., Hayn-Leichsenring, G., et al. (2020). Psychological and neural responses to architectural interiors. *Cortex* 126, 217–241. doi: 10.1016/j.cortex.2020.01.009
- Cockburn, J. (2021). Knowledge integration in transdisciplinary sustainability science: tools from applied critical realism. *Sust. Dev.* 30, 358–374. doi: 10.1002/ sd.2279
- Comu, S., Kazar, G., and Marwa, Z. (2021). Evaluating the attitudes of different trainee groups towards eye tracking enhanced safety training methods. Adv. Eng. Inform. 49:101353 doi: 10.1016/j.aei.2021.101353
- Dai, C. Z., and Lian, Z. W. (2018). The effects of sound loudness on subjective feeling, sympathovagal balance and brain activity. *Indoor Built Environ*. 27, 1287–1300. doi: 10.1177/1420326X17719490
- Deng, M., Wang, X., and Menassa, C. C. (2021). Measurement and prediction of work engagement under different indoor lighting conditions using physiological sensing. *Build. Environ.* 203:108098 doi: 10.1016/j.buildenv.2021. 108098
- Dimoka, A., Banker, R. D., Benbasat, I., Davis, F. D., Dennis, A. R., Gefen, D., et al. (2012). On the use of neurophysiological tools in is research: developing a research agenda for neurois. *Mis Quart*. 36, 679–702.
- Dutta, A., Breloff, S. P., Dai, F., Sinsel, E. W., Carey, R. E., Warren, C. M., et al. (2020). Fusing imperfect experimental data for risk assessment of musculoskeletal disorders in construction using canonical polyadic decomposition. *Autom. Constr.* 119:103322 doi: 10.1016/j.autcon.2020.103322
- Eberhard, J. P. (2009). Applying neuroscience to architecture. *Neuron.* 62, 753–756. doi: 10.1016/j.neuron.2009.06.001
- Elsadek, M., and Liu, B. Y. (2021). Effects of viewing flowering plants on employees' wellbeing in an office-like environment. *Indoor Built Environ.* 30, 1429–1440. doi: 10.1177/1420326X20942572
- Ergan, S., Radwan, A., Zou, Z. B., Tseng, H. A., and Han, X. (2019). Quantifying human experience in architectural spaces with integrated virtual reality and body sensor networks. *J. Comput. Civil. Eng.* 33:04018062. doi: 10.1061/(ASCE) CP.1943-5487.0000812
- Fu, H. L., Zhu, H., Xue, P. D., Hu, X., Guo, X. T., and Liu, B. S. (2022). Eye-tracking study of public acceptance of 5G base stations in the context of the COVID-19 pandemic. *Eng. Constr. Archit. Manag.* doi: 10.1108/ECAM-10-2021-0946
- Garreton, J. A. Y., Rodriguez, R. G., Ruiz, A., and Pattini, A. E. (2015). Degree of eye opening: a new discomfort glare indicator. *Build. Environ.* 88, 142–150. doi: 10.1016/j.buildenv.2014.11.010
- Guo, X. T., Fan, Z. Y., Zhu, H., Chen, X. Y., Wang, M. M., and Fu, H. L. (2022). Willingness to pay for healthy housing during the COVID-19 pandemic in China: evidence from eye tracking experiment. *Front. Public Health* 10:855671. doi: 10.3389/fpubh.2022.855671
- Hamedani, Z., Solgi, E., Hine, T., and Skates, H. (2020). Revealing the relationships between luminous environment characteristics and physiological, ocular and performance measures: an experimental study. *Build. Environ.* 172:106702 doi: 10.1016/j.buildenv.2020.106702
- Han, J., and Chun, C. (2021). Differences between EEG during thermal discomfort and thermal displeasure. *Build. Environ.* 204:108220 doi: 10.1016/j.buildenv. 2021.108220
- Han, Y., Yin, Z. Z., Zhang, J. J., Jin, R. Y., and Yang, T. (2020). Detertacking experimental study investigating the influence factors of construction safety hazard recognition. J. Constr. Eng. Manage. 146:04020091. doi: 10.1061/(ASCE) CO.1943-7862.0001884
- Hasanzadeh, S., Esmaeili, B., and Dodd, M. D. (2017). Measuring the impacts of safety knowledge on construction workers' attentional allocation and hazard detection using remote eye-tracking technology. *J. Manage. Eng.* 33:04017024. doi: 10.1061/(ASCE)ME.1943-5479.0000526 \*pg,
- Hasanzadeh, S., Esmaeili, B., and Dodd, M. D. (2018). Examining the relationship between construction workers' visual attention and situation awareness under fall and tripping hazard conditions: using mobile eye tracking. *J. Constr. Eng. Manage.* 144:04018060. doi: 10.1061/(ASCE)CO.1943-7862.0001516 \*pg,
- Hassan, A., Chen, Q. B., Liu, Y. G., Tao, J., Li, G., Jiang, M. Y., et al. (2020). Do plants affect brainwaves? effect of indoor plants in work environment on mental stress. *Eur. J. Hortic. Sci.* 85, 279–283. doi: 10.17660/eJHS.2020/85.4.9
- Hou, C. X., Wen, Y., He, Y. Q., Liu, X. J., Wang, M. M., et al. (2021). Public stereotypes of recycled water end uses with different human contact: evidence from event-related potential (ERP). *Resour. Conserv. Recycl.* 2021:168. doi: 10. 1016/j.resconrec.2021.105464

- Hu, M., and Shealy, T. (2019). Application of functional near-infrared spectroscopy to measure engineering decision-making and design cognition: literature review and synthesis of methods. J. Comput. Civil. Eng. 33:04019034. doi: 10.1061/ (ASCE)CP.1943-5487.0000848
- Huang, J., Song, Y., Chu, M. T., Dong, W., Miller, M. R., Loh, M., et al. (2019). Cardiorespiratory responses to low-level ozone exposure: the inDoor Ozone Study in childrEn (DOSE). *Environ. Int.* 131:105021. doi: 10.1016/j.envint.2019. 105021
- Huang, S. P., Qi, J. D., Li, W., Dong, J. W., and van den Bosch, C. K. (2021). The contribution to stress recovery and attention restoration potential of exposure to urban green spaces in low-density residential areas. *Int. J. Environ. Res. Public Health* 18:8713. doi: 10.3390/ijerph18168713
- Hwang, S., Jebelli, H., Choi, B., Choi, M., and Lee, S. (2018). Measuring workers' emotional state during construction tasks using wearable eeG. J. Constr. Eng. Manage. 144. doi: 10.1061/(ASCE)CO.1943-7862.0001506
- Jam, F., Azemati, H. R., Ghanbaran, A., Esmaily, J., and Ebrahimpour, R. (2021). The role of expertise in visual exploration and aesthetic judgment of residential building facades: an eye-tracking study. *Psychol. Aesthet. Creat. Arts.* 16, 148– 163. doi: 10.1037/aca0000377
- Jebelli, H., Hwang, S., and Lee, S. (2018). EEG-based workers' stress recognition at construction sites. *Autom. Constr.* 93, 315–324. doi: 10.1016/j.autcon.2018.05. 027
- Jebelli, H., Choi, B., and Lee, S. (2019). Application of wearable biosensors to construction sites. i: assessing workers' stress. J. Constr. Eng. Manage. 145:04019079. doi: 10.1061/(ASCE)CO.1943-7862.0001729
- Jeelani, I., Han, K., and Albert, A. (2018). Automating and scaling personalized safety training using eye-tracking data. *Autom. Constr.* 93, 63–77. doi: 10.1016/ j.autcon.2018.05.006
- Jeon, J., and Cai, H. B. (2021). Classification of construction hazard-related perceptions using: wearable electroencephalogram and virtual reality. *Autom. Constr.* 132:103975. doi: 10.1016/j.autcon.2021.103975
- Jia, X. F., Song, X. M., Shima, M., Tamura, K., Deng, F. R., and Guo, X. B. (2012). Effects of fine particulate on heart rate variability in Beijing: a panel study of healthy elderly subjects. *Int. Arch. Occup. Environ. Health* 85, 97–107. doi: 10.1007/s00420-011-0646-3
- Kakitsuba, N. (2016). Comfortable indoor lighting conditions evaluated from psychological and physiological responses. *Leukos* 12, 163–172. doi: 10.1080/ 15502724.2015.1061945
- Ke, J. J., Du, J., and Luo, X. W. (2021). The effect of noise content and level on cognitive performance measured by electroencephalography (EEG). Autom. Constr. 130:103836. doi: 10.1016/j.autcon.2021.103836
- Kim, J., Cha, S. H., Koo, C., and Tang, S. K. (2018). The effects of indoor plants and artificial windows in an underground environment. *Build. Environ.* 138, 53–62. doi: 10.1016/j.buildenv.2018.04.029
- Kim, N., Kim, J., and Ahn, C. R. (2021). Predicting workers' inattentiveness to struck-by hazards by monitoring biosignals during a construction task: a virtual reality experiment. Adv. Eng. Inform. 49:101359. doi: 10.1016/j.aei.2021.101359
- Kühn, S., Forlim, C. G., Lender, A., Wirtz, J., and Gallinat, J. (2021). Brain functional connectivity differs when viewing pictures from natural and built environments using fMRI resting state analysis. *Sci. Rep.* 11:4110. doi: 10.1038/ s41598-021-83246-5
- Lan, L., Xia, L. L., Tang, J. Y., Zhang, X. J., Lin, Y. B., and Wang, Z. T. (2019). Elevated airflow can maintain sleep quality and thermal comfort of the elderly in a hot environment. *Indoor Air* 29, 1040–1049. doi: 10.1111/ina.12599
- Lan, L., Sun, Y. X., Wyon, D. P., and Wargocki, P. (2021). Pilot study of the effects of ventilation and ventilation noise on sleep quality in the young and elderly. *Indoor Air* 31, 2226–2238. doi: 10.1111/ina.12861
- Lang, X. Y., Wargocki, P., and Liu, W. W. (2022). Investigating the relation between electroencephalogram, thermal comfort, and cognitive performance in neutral to hot indoor environment. *Indoor Air* 32. doi: 10.1111/ina.12941
- Lei, Q. H., Yuan, C., and Lau, S. S. Y. (2021). A quantitative study for indoor workplace biophilic design to improve health and productivity performance. *J. Clean Prod.* 324:129168. doi: 10.1016/j.jclepro.2021.129168
- Li, X., Komeili, A., Gul, M., and El-Rich, M. (2017). A framework for evaluating muscle activity during repetitive manual material handling in construction manufacturing. *Autom. Constr.* 79, 39–48. doi: 10.1016/j.autcon.2017.01.005
- Li, H., Wang, D., Chen, J. Y., Luo, X. C., Li, J., and Xing, X. J. (2019). Preservice fatigue screening for construction workers through wearable EEG-based

signal spectral analysis. *Autom. Constr.* 106:102851. doi: 10.1016/j.autcon.2019. 102851

- Li, J. J., Jin, Y. C., Lu, S., Wu, W., and Wang, P. F. (2020). Built environment information and human perceptual feedback collected through a combined virtual reality (VR) and electroencephalogram (EEG) method. *Energy Build*. 224:110259. doi: 10.1016/j.enbuild.2020.110259
- Liao, P. C., Sun, X. L., and Zhang, D. (2021). A multimodal study to measure the cognitive demands of hazard recognition in construction workplaces. *Saf. Sci.* 133:105010. doi: 10.1016/j.ssci.2020.105010
- Lin, J., and Westland, S. (2020). Effect of long-wavelength light on electroencephalogram and subjective alertness. *Lighting Res. Technol.* 52, 763–774. doi: 10.1177/1477153520902255
- Liu, W. W., Lian, Z. W., and Liu, Y. M. (2008). Heart rate variability at different thermal comfort levels. *Eur. J. Appl. Physiol.* 103, 361–366. doi: 10.1007/s00421-008-0718-6
- Liu, Y. Z., Habibnezhad, M., Shayesteh, S., Jebelli, H., and Lee, S. H. (2021). Paving the way for future eeg studies in construction: dependent component analysis for automatic ocular artifact removal from brainwave signals. *J. Constr. Eng. Manage.* 147:04021087. doi: 10.1061/(ASCE)CO.1943-7862.0002097
- Llinares, C., Higuera-Trujillo, J. L., and Serra, J. (2021). Cold and warm coloured classrooms. effects on students' attention and memory measured through psychological and neurophysiological responses. *Build. Environ.* 196:107726. doi: 10.1016/j.buildenv.2021.107726
- Ma, Q. G., Hu, L. F., and Wang, X. Y. (2015). Emotion and novelty processing in an implicit aesthetic experience of architectures: evidence from an event-related potential study. *Neuroreport* 26, 279–284. doi: 10.1097/WNR. 000000000000344
- Mansi, S. A., Barone, G., Forzano, C., Pigliautile, I., Ferrara, M., Pisello, A. L., et al. (2021). Measuring human physiological indices for thermal comfort assessment through wearable devices: a review. *Measurement* 183:109872. doi: 10.1016/j. measurement.2021.109872
- Meyland, J., Heilskov-Hansen, T., Alkjaer, T., Koblauch, H., Mikkelsen, S., Svendsen, S. W., et al. (2014). Sex differences in muscular load among house painters performing identical work tasks. *Eur. J. Appl. Physiol.* 114, 1901–1911. doi: 10.1007/s00421-014-2918-6
- Noghabaei, M., Han, K., and Albert, A. (2021). Feasibility study to identify brain activity and eye-tracking features for assessing hazard recognition using consumer-grade wearables in an immersive virtual environment. J. Constr. Eng. Manage. 147:04021104. doi: 10.1061/(ASCE)CO.1943-7862.000 2130
- O'Donovan, C., Michalec, A. O., and Moon, J. R. (2021). Capabilities for transdisciplinary research. *Res. Eval.* 31, 145–158. doi: 10.1093/reseval/rvab038
- Pan, L., Lian, Z. W., and Lan, L. (2012). Investigation of gender differences in sleeping comfort at different environmental temperatures. *Indoor Built Environ*. 21, 811–820. doi: 10.1177/1420326X11425967
- Park, S. H., Lee, P. J., and Jeong, J. H. (2018). Effects of noise sensitivity on psychophysiological responses to building noise. *Build. Environ.* 136, 302–311. doi: 10.1016/j.buildenv.2018.03.061
- Pinti, P., Tachtsidis, I., Hamilton, A., Hirsch, J., Aichelburg, C., Gilbert, S., et al. (2020). The present and future use of functional near-infrared spectroscopy (fNIRS) for cognitive neuroscience. *Ann Ny Acad. Sci.* 1464, 5–29. doi: 10.1111/ nyas.13948
- Price, D. J. D. (1975). *Science Since Babylon*. New Haven, USA: Yale University Press.
- Qin, J., Sun, C. J., Zhou, X., Leng, H. B., and Lian, Z. W. (2014). The effect of indoor plants on human comfort. *Indoor Built. Environ.* 23, 709–723. doi: 10.1177/1420326X13481372
- Riojas-Rodriguez, H., Escamilla-Cejudo, J. A., Gonzalez-Hermosillo, J. A., Tellez-Rojo, M. M., Vallejo, M., Santos-Burgoa, C., et al. (2006). Personal PM2. 5 and CO exposures and heart rate variability in subjects with known ischemic heart disease in Mexico City. J. Expo. Sci. Environ. Epidemiol. 16, 131–137. doi: 10.1038/sj.jea.7500453
- Saedi, S., Fini, A. A. F., Khanzadi, M., Wong, J., Sheikhkhoshkar, M., and Banaei, M. (2022). Applications of electroencephalography in construction. *Autom. Constr.* 133:103985. doi: 10.1016/j.autcon.2021.103985
- Schrom-Feiertag, H., Settgast, V., and Seer, S. (2017). Evaluation of indoor guidance systems using eye tracking in an immersive virtual environment. *Spat. Cogn. Comput.* 17, 163–183. doi: 10.1080/13875868.2016.1228654

- Seo, J., Lee, S., and Seo, J. (2016). Simulation-based assessment of workers' muscle fatigue and its impact on construction operations. J. Constr. Eng. Manage. 142:04016063. doi: 10.1061/(ASCE)CO.1943-7862.0001182
- Sepehri, S., Aliabadi, M., Golmohammadi, R., and Babamiri, M. (2021). Human cognitive functions and psycho-physiological responses under low thermal conditions in a simulated office environment. *Work* 69, 197–207. doi: 10.3233/ WOR-213469
- Shan, X., Yang, E. H., Zhou, J., and Chang, V. W. C. (2019). Neural-signal electroencephalogram (EEG) methods to improve human-building interaction under different indoor air quality. *Energy Build*. 197, 188–195. doi: 10.1016/j. enbuild.2019.05.055
- Shemesh, A., Leisman, G., Bar, M., and Grobman, Y. J. (2021). A neurocognitive study of the emotional impact of geometrical criteria of architectural space. *Archit. Sci. Rev.* 64, 394–407. doi: 10.1080/00038628.2021.1940827
- Snow, S., Boyson, A. S., Paas, K. H. W., Gough, H., King, M. F., Barlow, J., et al. (2019). Exploring the physiological, neurophysiological and cognitive performance effects of elevated carbon dioxide concentrations indoors. *Build. Environ.* 156, 243–252. doi: 10.1016/j.buildenv.2019.04.010
- Son, Y. J., and Chun, C. (2018). Research on electroencephalogram to measure thermal pleasure in thermal alliesthesia in temperature step-change environment. *Indoor Air* 28, 916–923. doi: 10.1111/ina.12491
- Stasi, A., Songa, G., Mauri, M., Ciceri, A., Diotallevi, F., Nardone, G., et al. (2018). Neuromarketing empirical approaches and food choice: a systematic review. *Food Res. Int.* 108, 650–664. doi: 10.1016/j.foodres.2017.11.049
- Sun, X. L., and Liao, P. C. (2019). Re-assessing hazard recognition ability in occupational environment with microvascular function in the brain. Saf. Sci. 120, 67–78. doi: 10.1016/j.ssci.2019.06.040
- Sun, Y., Livan, G., Ma, A., and Latora, V. (2021). Interdisciplinary researchers attain better long-term funding performance. *Commun. Phy.* 4:263. doi: 10. 1038/s42005-021-00769-z
- Tehrani, B. M., Wang, J., and Truax, D. (2021). Assessment of mental fatigue using electroencephalography (EEG) and virtual reality (VR) for construction fall hazard prevention. *Eng. Constr. Archit. Manag. Ahead of print* doi: 10.1108/ ECAM-01-2021-0017
- Tuszynska-Bogucka, W., Kwiatkowski, B., Chmielewska, M., Dzienkowski, M., Kocki, W., Pelka, J., et al. (2020). The effects of interior design on wellness - eye tracking analysis in determining emotional experience of architectural space. a survey on a group of volunteers from the Lublin Region, Eastern Poland. *Ann. Agr. Env. Med.* 27, 113–122. doi: 10.26444/aaem/106233
- Umer, W., Li, H., Szeto, G. P. Y., and Wong, A. Y. L. (2017). Identification of biomechanical risk factors for the development of lower-back disorders during manual rebar tying. *J. Constr. Eng. Manage.* 143:04016080. doi: 10.1061/(ASCE) CO.1943-7862.0001208
- Umer, W., Li, H., Szeto, G. P. Y., and Wong, A. Y. L. (2018). Proactive safety measures: quantifying the upright standing stability after sustained rebar tying postures. J. Constr. Eng. Manage. 144. doi: 10.1061/(ASCE)CO.1943-7862. 0001458
- Umishio, W., Ikaga, T., Kario, K., Fujino, Y., Suzuki, M., Ando, S., et al. (2021). Electrocardiogram abnormalities in residents in cold homes: a cross-sectional analysis of the nationwide Smart Wellness Housing survey in Japan. *Environ. Health Prev. Med.* 26:104. doi: 10.1186/s12199-021-01024-1
- Vartanian, O., Navarrete, G., Chatterjee, A., Fich, L. B., Gonzalez-Mora, J. L., Leder, H., et al. (2015). Architectural design and the brain: effects of ceiling height and perceived enclosure on beauty judgments and approach-avoidance decisions. *J. Environ. Psychol.* 41, 10–18. doi: 10.1016/j.jenvp.2014.11.006
- Vecchiato, G., Tieri, G., Jelic, A., De Matteis, F., Maglione, A. G., and Babiloni, F. (2015). Electroencephalographic correlates of sensorimotor integration and embodiment during the appreciation of virtual architectural environments. *Front. Psychol.* 6:1944. doi: 10.3389/fpsyg.2015.01944
- Wang, D., Dai, F., Ning, X. P., Dong, R. G. G., and Wu, J. Z. (2017). Assessing workrelated risk factors on low back disorders among roofing workers. J. Constr. Eng. Manage. 143:10.1061/(ASCE)CO. doi: 10.1061/(ASCE)CO.1943-7862.0001320
- Wang, T. K., Huang, J., Liao, P. C., and Piao, Y. M. (2018). Does augmented reality effectively foster visual learning process in construction? an eye-tracking study in steel installation. Adv. Civ. Eng. 2018, 1–12. doi: 10.1155/2018/2472167
- Wang, X., Li, D., Menassa, C. C., and Kamat, V. R. (2019). Investigating the effect of indoor thermal environment on occupants' mental workload and task performance using electroencephalogram. *Build. Environ.* 158, 120–132. doi: 10.1016/j.buildenv.2019.05.012

- Wang, J. M., Cheng, R., Liu, M., and Liao, P. C. (2021). Research trends of humancomputer interaction studies in construction hazard recognition: a bibliometric review. *Sensors* 21:6172. doi: 10.3390/s21186172
- Wang, M., Li, L., Hou, C., Guo, X., and Fu, H. (2022). Building and health: mapping the knowledge development of sick building syndrome. *Buildings* 12: 287.
- Xing, X. J., Li, H., Li, J., Zhong, B. T., Luo, H. B., and Skitmore, M. (2019). A multicomponent and neurophysiological intervention for the emotional and mental states of high-altitude construction workers. *Autom. Constr.* 105:102836 doi: 10.1016/j.autcon.2019.102836
- Xing, X. J., Zhong, B. T., Luo, H. B., Rose, T., Li, J., and Antwi-Afari, M. F. (2020). Effects of physical fatigue on the induction of mental fatigue of construction workers: a pilot study based on a neurophysiological approach. *Autom. Constr.* 120:103381. doi: 10.1016/j.autcon.2020.103381
- Xu, H. P., Li, J., Wu, J. M., and Kang, J. (2019). Evaluation of wood coverage on building facades towards sustainability. *Sustainability* 11:1407. doi: 10.3390/ su11051407
- Yang, Y. L., Hu, L., Zhang, R., Zhu, X. L., and Wang, M. Y. (2021). Investigation of students? short-term memory performance and thermal sensation with heart rate variability under different environments in summer. *Build. Environ.* 195:107765. doi: 10.1016/j.buildenv.2021.107765
- Yao, Y., Lian, Z., Liu, W., Jiang, C., Liu, Y., and Lu, H. (2009). Heart rate variation and electroencephalograph - the potential physiological factors for thermal comfort study. *Indoor Air* 19, 93–101. doi: 10.1111/j.1600-0668.2008.00 565.x
- Yin, J., Zhu, S. H., MacNaughton, P., Allen, J. G., and Spengler, J. D. (2018). Physiological and cognitive performance of exposure to biophilic indoor environment. *Build. Environ.* 132, 255–262. doi: 10.1016/j.buildenv.2018.01. 006
- Yin, J., Arfaei, N., MacNaughton, P., Catalano, P. J., Allen, J. G., and Spengler, J. D. (2019). Effects of biophilic interventions in office on stress reaction and cognitive function: a randomized crossover study in virtual reality. *Indoor Air* 29, 1028–1039. doi: 10.1111/ina.12593
- Zhang, F., Haddad, S., Nakisa, B., Rastgoo, M. N., Candido, C., Tjondronegoro, D., et al. (2017). The effects of higher temperature setpoints during summer on office workers' cognitive load and thermal comfort. *Build. Environ.* 123, 176–188. doi: 10.1016/j.buildenv.2017.06.048
- Zhang, Y., Zhang, M., and Fang, Q. (2019). Scoping review of EEG studies in construction safety. Int. J. Environ. Res. Public Health. 21: 4146. doi: 10.3390/ ijerph16214146
- Zhang, Z. J., Zhuo, K. F., Wei, W. H., Li, F., Yin, J., and Xu, L. Y. (2021). Emotional responses to the visual patterns of urban streets: evidence from physiological and subjective indicators. *Int. J. Environ. Res. Public Health* 18:9677. doi: 10. 3390/ijerph18189677
- Zhou, X. S., Hu, Y. N., Liao, P. C., and Zhang, D. (2021). Hazard differentiation embedded in the brain: a near-infrared spectroscopy-based study. *Autom. Constr.* 122:103473. doi: 10.1016/j.autcon.2020.103473
- Zhu, Y., Chen, T., Ding, N., Chraibi, M., and Fan, W. C. (2021). Follow people or signs? a novel way-finding method based on experiments and simulation. *Physica A* 573:125926. doi: 10.1016/j.physa.2021.12 5926

**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

**Publisher's Note:** All claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors and the reviewers. Any product that may be evaluated in this article, or claim that may be made by its manufacturer, is not guaranteed or endorsed by the publisher.

Copyright © 2022 Wang, Liu, Lai, Cao, Wu and Guo. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.