



Article

Exploring the Impact of Green Walls on Occupant Thermal State in Immersive Virtual Environment

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Abstract: Green walls have been used in built environments as a natural element to bring various benefits, thus improving human health and well-being. However, in conventional virtual environments, the visual connection with a green wall is the only way that this natural element could benefit humans. Unfortunately, the impact of such visual connection on human thermal perception is still not well understood. Thus, we conducted an experimental study with 40 participants comparing the thermal state of two virtual sessions: biophilic (a room with a green wall) and non-biophilic (the same room without a green wall). Both sessions were conducted in a climate chamber under a slightly warm condition (28.89 °C and 50% relative humidity). Participants' thermal state, skin temperature, and heart rate data were collected. According to the results, participants' thermal comfort and hand skin temperature were significantly different between the two sessions, and their mean skin temperature was statistically increased over time. The study suggests that before the extent to which the impact of visual stimuli (e.g., green walls) on thermal perception is fully understood, researchers may need to control visual and thermal stimuli separately when using them in immersive virtual environments. Furthermore, the virtual exposure time should be an important consideration when designing experimental procedures.

Keywords: biophilic; green wall; immersive virtual environment (IVE); physiological responses; thermal state; virtual exposure time

1. Introduction

Recently, immersive virtual environments (IVEs) have gained significant attention from the architectural, engineering, and construction (AEC) research communities because of the unique ability of IVEs to offer immersive experiences, including virtual natural elements [1,2]. In addition, researchers have applied IVEs to a range of research studies, such as occupant energy behavior [3], thermal comfort, and adaptive behavior [4]. Existing thermal comfort studies using mixed IVEs focus on external thermal stimuli such as temperature while most of the studies rely on the main feature of conventional IVEs, i.e., providing visual stimuli. For example, the human thermal state was explored under different temperatures provided by a climate chamber or evoked through body activity, while participants were exposed to the virtually simulated environments as visual stimuli [5–7]. Such studies ignore the potential influence of visual stimuli on thermal state, especially when studying biophilic design features. Moreover, these studies have shown that multiple types of stimuli, such as thermal, can be effectively simulated along with visual stimuli as the main feature of augmented IVEs.

The human perception of surrounding environments occurs through multisensory processing [8]. The multisensory interactions between different senses, such as thermal, visual, and acoustic senses, can affect humans' environmental perception in a complex



Citation: Sedghikhanshir, A.; Zhu, Y.; Chen, Y.; Harmon, B. Exploring the Impact of Green Walls on Occupant Thermal State in Immersive Virtual Environment. *Sustainability* **2022**, *14*, 1840. https://doi.org/10.3390/ su14031840

Academic Editors: Domenico Palladino and Iole Nardi

Received: 29 December 2021 Accepted: 2 February 2022 Published: 5 February 2022

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manner because the senses may affect each other. For example, thermal and visual comfort increases if noise decreases [9] or daylight may affect human thermal perception, so it needs to be considered in thermal comfort models [10,11]. In particular, previous IVE studies have shown that visual stimuli can change human physiological responses, including skin temperature [12,13] and heart rate [14]. Thus, such studies in virtual reality have identified a theoretical connection between visual stimuli and skin temperature and heart rate. Specifically, the visual perception of indoor environments can change the physiological responses of the body, affecting thermal state. However, the impact of certain visual stimuli on thermal state has not been fully explored. Therefore, when augmented IVEs are used to study human perceptions, it is necessary to first control some stimuli while studying the impact of others. In addition, the connection between thermal sensation and physiological responses has already been established in reality [15–17]. Thus, studies investigating the possible connection between visual and thermal senses in a virtual environment may also confirm the effectiveness of IVE applications.

In this study, the authors chose indoor green walls as an application case to investigate the impact of visual stimuli on thermoception in IVEs. Green walls refer to a vertical planting structure that includes living plants with a substrate and an irrigation system [18]. The choice has both practical and theoretical benefits. First, the integration of a green wall as a natural element in interior spaces can improve human connection with nature, according to the biophilia hypothesis [19], and bring a variety of benefits to the occupants through extending the advantages of natural elements into buildings [20], such as cooling effects [21,22], noise reduction [23,24], improved air quality [25–27], and enhanced human comfort and well-being [28,29]. Secondly, green walls may affect human thermal perception by lowering the environmental temperature [30] or by establishing a visual connection with nature that influences psychological and physiological processes [31]. A better understanding of how different stimuli impact thermal sensation individually can provide insights on the design of the green wall and the treatment designs involving visual and thermal stimuli. Therefore, green walls are a good candidate for studying stimuli in IVEs that can be simulated using thermal stimuli, visual stimuli, or a combination of both.

2. Research Questions and Hypothesis

In this study, the primary goal is to understand whether green walls as visual stimuli alone in a virtual environment will change participants' thermal experience. The authors refer to a virtual environment with green walls as a biophilic environment and a virtual environment without green walls as a non-biophilic environment. To achieve the goal, the authors designed a research study comparing participants' thermal experience states and physiological responses in the biophilic and non-biophilic environments. In addition, the authors investigated the impact of the time exposed to virtual environments on the thermal state of participants in both environments. Accordingly, we are looking for answers to the following research questions:

- 1. Was the thermal experience significantly different between biophilic and non-biophilic virtual environments?
- 2. Was the thermal experience significantly different between the time point when the head-mounted display (HMD) was put on and the time point when the experiment was finished?

The first question was intended to explore if the visual connection with green walls alone altered participants' thermal experience. The second question investigated the changes of the thermal experience over the different time points in each environment. To answer these questions, the authors used two types of variables to evaluate participants' thermal experience. The first type was the thermal state votes (V $_{(x)}$), including three variables: sensation (V $_{(s)}$), comfort (V $_{(c)}$), and acceptability (V $_{(a)}$). The second type included the physiological responses (PR $_{(x)}$) associated with the thermal states of participants: skin temperature (PR $_{(st)}$), heart rate (PR $_{(hr)}$), and the ratio between low and high frequencies

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 $(PR_{(f)})$ resulting from heart rate variability. Accordingly, the following hypotheses were defined by the authors:

1. Participants' thermal state votes and physiological responses did not differ significantly between the two different virtual environments (biophilic and non-biophilic).

Thermal state votes:

```
Null Hypothesis, H0: V _{(x)} = V' _{(x)}
Alternate Hypothesis, H1: V _{(x)} \neq V' _{(x)}
```

Where, $V_{(x)}$ is the thermal votes of each type in the biophilic environment, including sensation $(V_{(s)})$, comfort $(V_{(c)})$, or acceptability $(V_{(a)})$; and $V'_{(x)}$ is the thermal votes of each type in the non-biophilic environment, including sensation $(V'_{(s)})$, comfort $(V'_{(c)})$, or acceptability $(V'_{(a)})$.

Physiological responses:

```
Null Hypothesis, H0: PR_{(x)} = PR'_{(x)}
Alternate Hypothesis: H1: PR_{(x)} \neq PR'_{(x)}
```

Where, $PR_{(x)}$ is the physiological responses in the biophilic environment, including skin temperature (PR $_{(st)}$), heart rate (PR $_{(hr)}$), and LF/HF ratio (PR $_{(f)}$); and PR' $_{(x)}$ is the physiological responses in the non-biophilic environment, including skin temperature (PR' $_{(st)}$), heart rate (PR' $_{(hr)}$), and LF/HF ratio (PR' $_{(f)}$).

- 2. Participants' thermal state votes and physiological responses did not differ significantly between two time points, i.e., time point 1 (TP1, when the HMD was put on), and time point 2 (TP2, when the experiment was finished) in the biophilic or non-biophilic environments.
- Thermal state votes:

```
Null Hypothesis, H0: V _{(x)} = V'_{(x)}
Alternate Hypothesis, H1: V _{(x)} \neq V'_{(x)}
```

Where, $V_{(x)}$ is the thermal votes of each type at time point 1 in the biophilic or non-biophilic environment, including sensation $(V_{(s)})$, comfort $(V_{(c)})$, or acceptability $(V_{(a)})$; and $V'_{(x)}$ is the thermal votes of each type at time point 2 in the biophilic or non-biophilic environments, including sensation $(V'_{(s)})$, comfort $(V'_{(c)})$, or acceptability $(V'_{(a)})$.

Physiological responses:

```
Null Hypothesis, H0: PR_{(x)} = PR'_{(x)}
Alternate Hypothesis, H1: PR_{(x)} \neq PR'_{(x)}
```

Where, PR(x) is the physiological responses at time point 1 in the biophilic or non-biophilic environments, including skin temperature ($PR_{(st)}$), heart rate ($PR_{(hr)}$), and LF/HF ratio ($PR_{(f)}$); and $PR'_{(x)}$ is the physiological responses at time point 2 in the biophilic or non-biophilic environment, including skin temperature ($PR'_{(st)}$), heart rate ($PR'_{(hr)}$), and LF/HF ratio ($PR_{(f)}$).

To test these hypotheses, the authors conducted two main statistical analyses with the data accordingly:

- 1. Between sessions: a comparative analysis between biophilic and non-biophilic sessions to test the first hypothesis.
- 2. Within sessions: a comparative analysis in each session between the two time points to test the second hypothesis.

3. Research Method

3.1. The Participants

Upon approval of the experimental protocol by the Instructional Review Board, 40 healthy adults, mostly graduate and undergraduate students, participated in this study during the summer of 2021. The sample size was determined to meet the minimum sample size required (n = 34) with power 0.8, according to the G*Power analysis. Participants were

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informed of the experiment via recruitment flyers distributed in campus buildings. After receiving an email from interested participants, a consent form, including the brief information on the inclusion/exclusion criteria, was sent to the participants for their signature. Then, the participants voluntarily signed up for the two-hour experiment and were paid \$30 as compensation. The list of the criteria for inclusion and exclusion is presented in Table 1.

Table 1.	The criteria	tor inc	lusion and	exclusion.

Inclusion Criteria						
Age	18–35 years					
Sex	Men and women (non-pregnant by self-report)					
Informed Consent	Participants must be able to read, understand, and sign the consent form					
Exclusion Criteria						
Sufficient medical conditions (by using participants' words)	Feeling or being under treatment for any type of health issues or discomfort. Individuals who had been hospitalized because of psychological illness within past five years or were currently undergoing treatment for severe mental illness. Any medical issues that can interfere or be aggravated by using the head-mounted display.					

3.2. Climate Chamber

The testing environment for both virtual sessions was a climate chamber on the main campus of Louisiana State University. A wide range of environmental conditions, including indoor air quality, temperature (15 $^{\circ}$ C to 32 $^{\circ}$ C), and relative humidity (40–90%), could be simulated and controlled by the climate chamber in order to conduct different thermal comfort-related experiments. The HVAC system of the chamber room is equipped with various sensors, such as temperature and humidity sensors, for controlling and monitoring the environmental conditions.

The climate chamber has three rooms: a testing room, a control room, and a mechanical room (Figure 1). The size of the testing room is about $4.2\times3.2\times2.7$ m (L \times W \times H). In both sessions, the temperature and relative humidity were set to 28.89 °C and 50%, respectively. The authors used this slightly warm condition to better observe the capability of the green wall in improving the thermal state of participants.

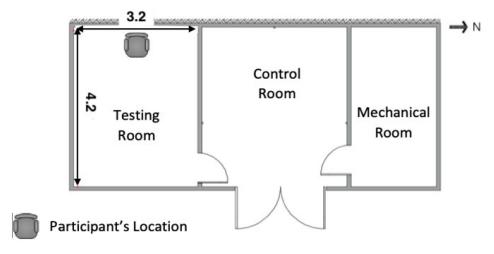


Figure 1. The climate chamber layout.

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3.3. Environmental Simulation and IVE Apparatus

To test the participants' thermal state after facing the green wall, the authors simulated two experimental sessions, non-biophilic and biophilic, both in virtual environments. The non-biophilic session was referred to as NBS, and the biophilic session was referred to as BS. The experimental procedure included two sessions, and each applied with one of these settings: the NBS session had no furniture in the interior space of the virtual testing room (Figure 2), and the BS session was created by adding green walls to two sidewalls of the same virtual room (Figure 2).

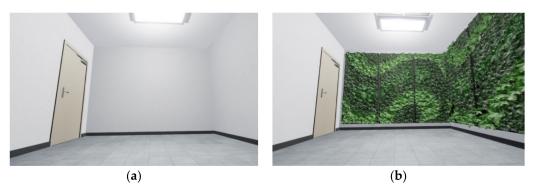


Figure 2. The environmental simulations: (a) the Non-Biophilic Session (NBS); (b) the Biophilic Session (BS).

Both environments were rendered during the experiment using Unreal Engine, and participants experienced them using an HMD device. Before the experiment, participants had a chance to familiarize themselves with the environments before the experiment. Two HMD headsets were used in this experiment. The HTC-Vive, which supports a resolution of 2160 \times 1200 on dual-AMOLED panels of 91 mm with a refresh rate of 90 Hz and a field of view of 110-degrees, was used for the experimental session. The HTC Vive-Pro, with a dual-OLED display supporting a resolution of 2880 \times 1600, was used for the trial session. In addition, dual cameras on the front with a 90 Hz refresh rate helped to monitor the hands' movements.

3.4. Physiological Measures

3.4.1. Skin Temperature

To measure skin temperature, the authors used temperature sensors known as Vernier surface with an exposed thermistor that results in an extremely short response time. The real-time data was collected using Logger Pro software. Since the human brain is constantly regulating the skin temperature to keep the body temperature fixed, the mean skin temperature measures the body's reaction to the ambient environment [32]. Thus, researchers collected the mean skin temperature to evaluate thermal state [33,34]. According to the equation from ISO 9886 [35], the mean skin temperature under the warm condition was calculated using the following formula based on the temperature collected from four body locations:

$$t_{sk} = 0.28 t_{neck} + 0.28 t_{scapula} + 0.16 t_{hand} + 0.28 t_{shin}$$

where, t_{sk} is the mean skin temperature and t_{neck} , $t_{scapula}$, t_{hand} , and t_{shin} are the temperatures measured from the back of the neck, the right scapula, the left hand, and the right shin, respectively.

3.4.2. Heart Rate and LF/HF Ratio

Since heart rate (HR) is highly associated with the metabolic rate of the body, which affects thermal sensation [36], the participants' heart rates were recorded during the experiment using POLAR Ft7, a wireless heart rate monitor with electrodes. The sensor data were recorded using HRV Logger. Heart rate variability (HRV) was recorded by the

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same device as the HR. HRV was also considered in this study, as there is a connection between thermal comfort and HRV [17]. Heart rate variability describes the changes of adjacent heartbeats in the time intervals required to adjust the operations needed to adapt to environmental challenges [37]. The LF/HF ratio resulting from an HRV analysis can be used to assess thermal comfort level. This ratio was reported to be significantly higher in thermal discomfort situations [17].

3.5. The Questionnaires

In this study, the questionnaire consisted of two sections. All survey questions were created using the online survey software Qualtrics (www.qualtrics.com (accessed on 5 November 2021)).

- Demographic and general information: The demographic questionnaire included questions regarding the socio-demographic characteristics of participants, including age, gender, race, birth, raised location, the last five years' living place, education, occupation, and household. The general questionnaire was designed to acquire necessary information that might have an impact on the thermal comfort states, including body weight and height, food intake within the past hour, beverage intake within the past hour, cigarette use within the past hour, alcohol intake within the past 12 h, intense physical activity within the past 12 h, departure location (off-campus, on-campus, in the building), mode of travel (walking, cycling, motorized means), and menstrual cycle. Participants filled out this survey during the pre-experiment session before entering the experimental BS and NBS sessions.
- Thermal state evaluation: The thermal state of the participants was measured using the thermal sensation, thermal comfort, and thermal acceptability votes. Participants' self-reported votes of thermal sensation were reported on the ASHRAE Standard 55 Thermal Comfort, a 7-point Likert scale [38,39]. Thermal sensation was evaluated by this range of scales: "+3, +2, +1, 0, -1, -2, and -3" referring to "Hot, Warm, Slightly Warm, Neutral, Slightly Cool, Cool, and Cold," respectively. Thermal comfort was evaluated by a different range of scales: "+3, +2, +1, -1, -2, and -3" referring to "Very Comfortable, Comfortable, Slightly Comfortable, Slightly Uncomfortable, Uncomfortable, and Very Uncomfortable," respectively [40]. Finally, the overall thermal acceptability of the environment was determined through a binary scale consisting of two answers: "-1 or +1," representing "Acceptable" or "Unacceptable," respectively, similar to the one in Ref [41].

3.6. Experimental Design and Procedure

Before starting the experiments, the authors conducted an initial test on the validity of the virtual model by asking four participants to each fill in two questionnaires: the Igroup Presence questionnaire (IPQ) [42,43] and the Simulator Sickness Questionnaire (SSQ) [44]. The IPQ included 14 items categorized into four sub-measures, and the final score of each category ranged from 20 to 100. The results from the IPQ (general presence = 80, spatial presence = 75, involvement = 57.5, and experienced realism = 55) were higher than reported studies [42,43], suggesting that the presence of the virtual model is valid. In addition, the total cybersickness score (24.31) was within the acceptable range [45].

The authors used a within-subject design for this study, because individual human differences, such as gender, may affect thermal comfort and need to be considered as an important variance [46]. All 40 participants participated in both virtual experimental sessions in one visit with a 20-min break period between sessions. Participants had been informed of the clothing requirements, including lightweight pants and a shirt or T-shirt having long sleeves, before the experiment. Moreover, during this study, the participants' activity was sedentary, and they were seated in a chair during the entire virtual exposure (Figure 3).

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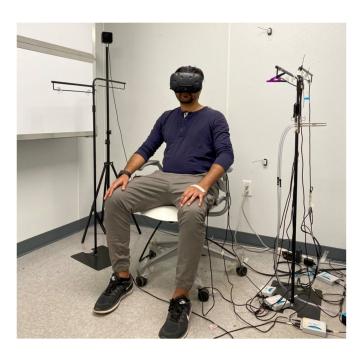


Figure 3. A photo of a participant attending an experimental session.

The experimental procedure included five steps (Figure 4):

- Step 1. Prior to the experiment: Participants had to complete the demographic and general questionnaires and sign the consent form.
- Step 2. The pre-experiment session (20 min): The height and weight of the participants were measured, and the participants completed the questionnaire about the participant's condition on the experiment day. Participants also had a chance to familiarize themselves with the virtual environments by exploring them in the control room before the experiment.
- Step 3. The first and second session (10 min): After the pre-experiment session, participants were invited to enter the testing room and be seated in a chair. After attaching the temperature sensors, participants wore an HMD headset for about 10 min: 3 min of filling out thermal state questionnaire and 7 min of freely watching the virtual environments, whether BS or NBS. According to the literature, participants' physiological states return to the baseline after 7~8 min of habituation in a virtual environment [47].
- Step 4. Break (20 min): Between the two sessions of the experiment, there was a 20-min break in the control area.

	Before the Experiment	Pre-experiment session		1 st Session	Break	2 nd Session	END
Time	-	SIARI	20 min	10 min	20 min	10 min	END
Location	-	 	Control Room	Testing Room	Control Room	Testing Room	
Participant	Consent Form Demographic Questionnaire		General Questionnaire Testing VR Scenes	BS or NBS	Rest	BS or NBS	

Figure 4. The experimental procedure.

3.7. Data Collection and Processing

The demographic and general questionnaires were filled out by participants before the main session of the experiment. Two statistical analyses have been conducted according to the hypotheses. Thus, the following procedures were followed to collect data for each type of analysis:

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• Between sessions: The thermal state questionnaire (TSQ), skin temperature, and heart rate of participants after experiencing the virtual environment for 7 min was compared between the BS and the NBS (Figure 5).

• Within sessions: To test the impact of virtual exposure time on thermal state, the following procedure was followed to collect and process the data:

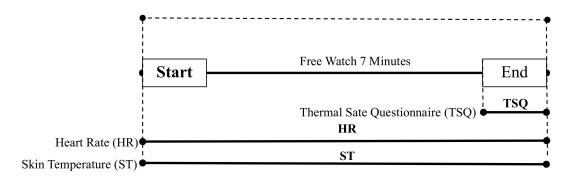


Figure 5. The data collection for between-sessions analysis.

Thermal state questionnaire: The thermal state questionnaire was asked of the participants at two time points: TP1, after attaching the body temperature and heart rate sensors and putting on the VR headset; and TP2, after 7 min of freely watching the virtual environment (Figure 6). In addition, participants' thermal state was examined once the participants entered the chamber's room and were seated, at TP0. This time point was designed to ensure that participants' thermal states before experiencing the virtual environment were comparable in both the BS and the NBS. Thus, participants reported their thermal state of the same real environment, the testing room, at the beginning of each session. Using the Wilcoxon test, Table 2 compares the thermal state of the BS and the NBS at TP0. The test results show that there was no significant difference over all three levels of the thermal state. Additionally, the mean thermal sensation was close to 1 in both sessions, indicating that the participants reported that the slightly warm condition that was consistent with the design of the study.

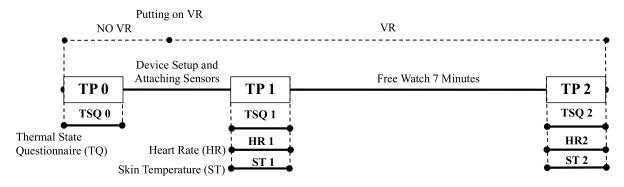


Figure 6. The procedure for data collection within sessions.

Table 2. The thermal state votes of participants at TP0 between the BS and the NBS.

Thermal State	Mean	\pm SD	Wilcoxon Sign Rank Test			
Thermal State	BS NBS		(<i>p</i> -Value) (Significance Level, 0.05)			
Sensation	1.17 ± 0.7	1 ± 0.7	0.37			
Comfort	0.5 ± 1.3	0.6 ± 1.28	0.83			
Acceptability	0.6 ± 0.81	0.85 ± 0.53	0.11			

Note: BS = biophilic session and NBS = non-biophilic session. Thermal sensation scales: 1 = slightly warm, 0 = neutral.

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The next two time points, TP1 and TP2, occurred while participants were experiencing different virtual environments according to the session design. The data collected from these time points could help to detect the impact of exposure time (7 min) on the thermal state in virtual environments.

Physiological measures: The local skin temperature, mean skin temperature, and heart rate data were split according to the two time points when the thermal questionnaires were asked during the virtual exposures. Figure 6 shows the time point in the real environment (TP0) and the two time points (TP1 and TP2) when thermal state data, skin temperatures, and heart rate data were collected.

4. Data Analysis and Results

In this study, two types of statistical tests were used according to the types of variables. The authors employed a two-tailed Wilcoxon Sign Rank test fitted for analyzing the qualitative data and ordinally scaled parameters, such as thermal state votes, in this study. A two-tailed pairwise t-test was applied to analyze continuous parameters such as physiological responses [48]. Before conducting any analyses, the authors employed a sample size analysis to detect its potential impact. Several factors may influence the analysis with particular sample sizes, such as significance level and the sample mean differences between the BS and the NBS. The sample mean difference can be determined through the power analysis formula, considering 0.05 as a significant level and 0.8 as a statistical power [49].

Table 3 shows the required sample size for Wilcoxon tests to differentiate between the BS and the NBS, with 0.05 as a significance level and 0.8 as a statistical power. For instance, if the sample mean difference is larger than 0.1 for a Wilcoxon test on thermal sensation, a sample size of 947 is needed to reliably differentiate the BS from the NBS. It is important to consider the different sample size for the thermal state questionnaire, since one survey failed to be saved. Thus, the sample size of 39 in this study can find a significant difference of the mean thermal votes between the two sessions at a 0.5 interval scale for thermal sensation and acceptability, and at a 0.75 interval scale for thermal comfort.

Table 3. The estimated sample sizes required to find a significant difference in thermal state based on
the sample mean difference between the BS and the NBS.

	Δ _{mean}	Thermal Sensation	Thermal Comfort	Thermal Acceptability
	0.1	947	2121	487
	0.25	152	400	78
Estimated Sample Sizes	0.5	38	85	20
Sumple Sizes	0.75	17	38	9
	1	10	22	5

Note: BS = biophilic session and NBS = non-biophilic session; Δ mean—Wilcoxon calculation of mean difference between the BS and the NBS including different thermal vote interval scales. The bold numbers suggest the estimated sample sizes required to find a significant difference.

Table 4 shows the required sample size for t-test tests to differentiate the BS and the NBS with 0.05 as a significance level and 0.08 as a statistical power. Similar to the estimated sample sizes from the Wilcoxon tests, the sample size of 40 in this study can find a significant difference in the mean skin temperature and heart rate by using a t-test with sample mean difference of $0.75\,^{\circ}\text{C}$ and $8\,\text{bpm}$, respectively.

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Table 4. The estimated sample sizes required to find a significant difference in skin temperature and heart rate based on the sample mean difference between the BS and the NBS.

Δ Mean	Skin Temperature	Δ Mean	Heart Rate	
0.25 °C	251	1 bpm	1738	
0.5 °C	62	4 bpm	46	
0.75 °C	28	8 bpm	27	

Note: Δ mean—Wilcoxon calculation of mean difference between the BS and the NBS including different skin temperature and heart rate interval scales. The bold numbers suggest the estimated sample sizes required to find a significant difference.

4.1. Demographic and General Questionnaires

The demographic data indicated that there were 24 male and 16 female participants, most of whom were graduate or undergraduate students. The questionnaires recorded the age and other general information of participants (Table 5).

Table 5. The demographic and general information of participants.

Age (Mea	an \pm SD)	27.67 ± 4.3
Alcohol or cigarettes (12 h	before to the experiment)	0
Intense Physical Activity (12	h before to the experiment)	10%
Departure Location	Off-campus	55%
	On-campus	45%
	Motorized Vehicles	52.5%
Type of Commute	Walking	40%
-	Cycling	7.5%

4.2. Environmental Temperature Conditions

To ensure the comparability of the environmental conditions between the two experimental sessions, BS and NBS, a two-tailed pairwise *t*-test was applied to analyze the room temperatures recorded in the BS vs. the NBS. The environmental temperature was measured by a temperature sensor located at a height of 1.1 m, the head level of seated occupants [50]. The authors also compared the room temperature in each session between the two time points, TP1 and TP2. The results indicated that there was no significant difference between all three environmental temperature data sets or between TP1 and TP2 within each session (Figure 7 and Table 6). These results suggest that both types of analysis, between and within sessions, were conducted under comparable environmental temperature conditions.

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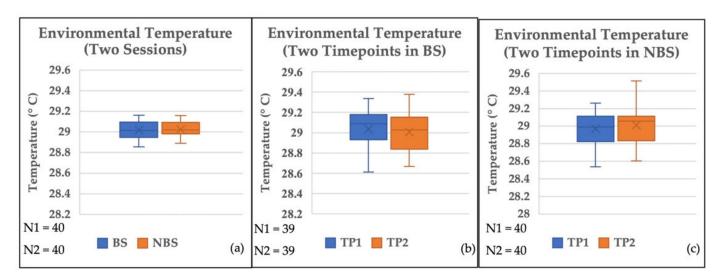


Figure 7. The environmental temperature conditions (a) between the two sessions; (b) within the BS; (c) within the NBS. Note: N1 = BS and TP1; N2 = NBS and TP2; \times mean marks.

Table 6. The environmental temperature comparisons.

	BS		NBS			DE	+	17-1	
Between Session	N	Mean °C	St. DEV.	N	Mean °C	St. DEV.	DF	τ	<i>p</i> -Value
_	40	29.017	0.08	40	29.024	0.08	39	0.54	0.59
T. T. T. C		TP1			TP2		DE	1	<i>p</i> -value
Within Sessions —	N	Mean °C	St. DEV.	N	Mean °C	St. DEV.	DF	ι	p-varue
BS	39	29.035	0.19	39	29.006	0.2	38	0.7	0.49
NBS	40	28.972	0.18	40	29.017	0.19	39	1.33	0.19

Note: BS = biophilic session, NBS = non-biophilic session, TP1= time point 1, and TP2 = time point 2.

4.3. Between Sessions Analysis

4.3.1. Thermal State Votes

Thermal votes were compared between the two sessions using the Wilcoxon Sign Rank Test at a significance level of 0.05 (Figure 8). Results indicated that there was a significant difference in thermal comfort between the BS and the NBS (Table 7); participants reported the BS as more comfortable. Additionally, no significant difference was observed in terms of thermal sensation and acceptability. However, according to the mean votes (Table 7), participants reported 0.28 lower thermal sensation votes and 0.11 higher thermal acceptability in the BS. The test showed that participants felt more comfortable in the biophilic environment, even though they felt the same slightly warm environment and accepted it.

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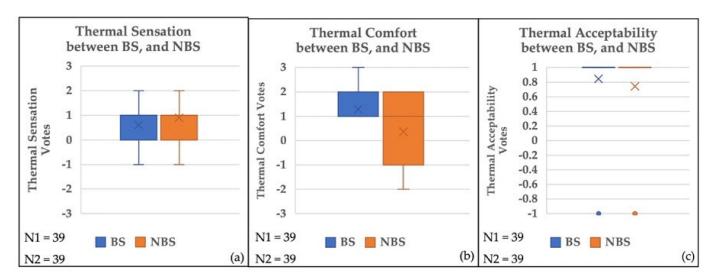


Figure 8. The mean thermal state votes including (a) thermal sensation, (b) thermal comfort, and (c) thermal acceptability between the BS and the NBS. Note: N1 = BS and N2 = NBS; • • outliers; \times mean marks.

Table 7. The thermal state votes of participants between the BS and the NBS.

Thermal State	BS			NBS			Wilcoxon Sign Rank Test (p-Value)
Thermal State	N	Mean	St.DEV.	N	Mean	St.DEV.	(Significance Level, 0.05)
Thermal Sensation	39	0.62	0.75	39	0.9	0.85	0.0968
Thermal Comfort	39	1.28	1.19	39	0.36	1.44	0.0044 +
Thermal Acceptability	39	0.85	0.54	39	0.74	0.68	0.4641

Note: BS = biophilic session and NBS = non-biophilic session; * significant result.

4.3.2. Physiological Responses

The comparisons of the local and the mean skin temperature between the BS and the NBS were performed using a two-tailed pairwise *t*-test (Figure 9). According to the results (Table 8), no significant difference in the mean skin temperature was observed between the two sessions. In terms of local skin temperature, there was a significant difference in hand temperature while no difference was observed for neck, scapula, or shin temperature. Thus, hand temperature was significantly higher in the BS while the mean skin temperature was not different between the two sessions.

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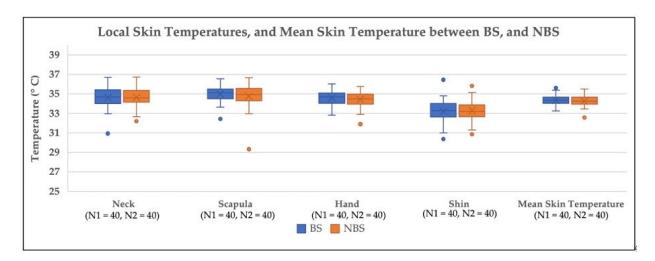


Figure 9. The four local skin temperatures and the mean skin temperature between the BS and the NBS. Note: N1 = BS and N2 = NBS; • • outliers; × × mean marks.

Table 8. The four local skin temperatures and the mean skin temperature of participants between the BS and the NBS.

Skin	BS			NBS			Two-Tailed Pairwise <i>t-</i> Test
Temperature	N	Mean °C	St.DEV.	N	Mean °C	St.DEV.	(<i>p</i> -Value) (Significance Level, 0.05)
Neck	40	34.652	1.06	40	34.65	0.98	0.98
Scapula	40	34.997	0.85	40	34.768	1.28	0.17
Hand	40	34.626	0.73	40	34.439	0.83	0.03 +
Shin	40	33.215	1.15	40	33.303	1.13	0.4
Mean Skin Temperature	40	34.342	0.56	40	34.272	0.54	0.22

Note: BS = biophilic session and NBS = non-biophilic session. $^{\scriptscriptstyle +}$ significant result.

Heart rate and LF/HF were compared between the BS and the NBS using a two-tailed pairwise t-test (Figure 10). According to the results (Table 9), no significant difference was observed in the heart rate and the LF/HF ratio between the two sessions.

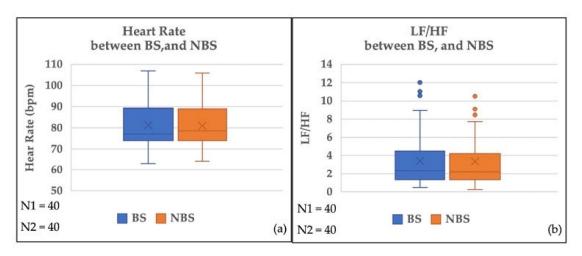


Figure 10. (a) Heart rate and (b) LF/HF between the BS and the NBS. Note: N1 = BS and N2 = NBS; • • outliers; × × mean marks.

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	BS				NBS		Two-Tailed Pairwise <i>t</i> -Test (<i>p</i> -Value)
	N	Mean	St.DEV.	N	Mean	St.DEV.	(Significance Level, 0.05)
HR (bpm)	40	81.25	10.68	40	80.9	10.26	0.55
LF/HF	40	3.41	3.02	40	3.32	2.8	0.84

Table 9. Heart rate and LF/HF of participants between the BS and the NBS.

Note: BS = biophilic session and NBS = non-biophilic session.

4.4. Within Sessions Analysis

4.4.1. Thermal State Votes

Thermal votes were compared between the two time points using the Wilcoxon Sign Rank Test at a significance level of 0.05 in BS (Figure 11), and NBS (Figure 12). The results showed that there was no significant difference in all three types of thermal state votes between the two time points in the BS or the NBS (Table 10). Thus, the applied virtual exposure time did not affect participants' thermal states. Moreover, according to the mean votes (Table 10), participants reported 0.15 lower thermal sensation votes and 0.33 higher thermal comfort after 7 min of experiencing a virtual biophilic environment. However, the results of the NBS indicate the exact reverse pattern, since participants reported 0.125 higher thermal sensation votes and 0.45 lower thermal comfort. These results suggest that spending more time in a virtual environment could negatively impact participants' thermal state, while adding natural elements such as green walls could not only mitigate the negative impact of exposure time, but also improve the thermal state. This observation needs further investigation to study the impact of virtual visual stimuli, time, and individual differences. For instance, a significant difference might be detected by increasing the exposure time to 10 or 15 min.

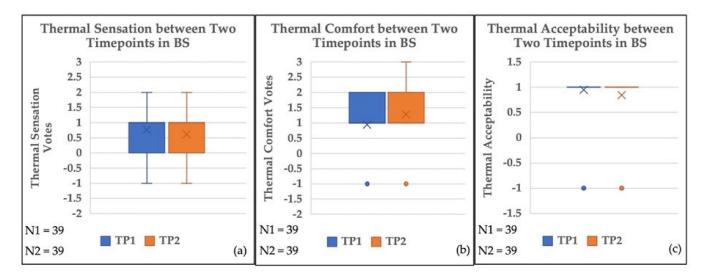


Figure 11. The mean thermal state votes including (a) thermal sensation, (b) thermal comfort, and (c) thermal acceptability between the two time points of virtual exposure, TP1 and TP2, in the BS. Note: N1 = TP1 and N2 = TP2; • • outliers; × × mean marks.

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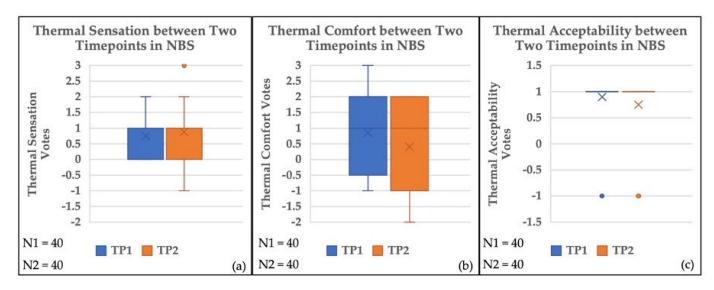


Figure 12. The mean thermal state votes including (a) thermal sensation, (b) thermal comfort, and (c) thermal acceptability between the two time points of virtual exposure, TP1 and TP2, in the NBS. Note: N1 = TP1 and N2 = TP2; • • outliers; \times mean marks.

Table 10. The heart rate and LF/HF of participants attending the BS and the NBS at two time points, TP1 and TP2.

n.c.	TP1				TP2		Wilcoxon Sign Rank Test (p-Value)	
BS	N	Mean	St.DEV.	N	Mean	St.DEV.	(Significance Level, 0.05)	
Thermal Sensation	39	0.77	0.63	39	0.62	0.75	0.2179	
Thermal Comfort	39	0.95	1.1	39	1.28	1.19	0.0755	
Thermal Acceptability	39	0.95	0.32	39	0.85	0.54	0.3139	
NBS -	TP1			TP2			Wilcoxon Sign Rank Test (p-Value)	
ND5	N	Mean	St.DEV.	N	Mean	St.DEV.	(Significance Level, 0.05)	
Thermal Sensation	40	0.75	0.59	40	0.875	0.85	0.4283	
Thermal Comfort	40	0.85	1.19	40	0.4	1.45	0.2670	
Thermal Acceptability	40	0.9	0.44	40	0.75	0.67	0.2421	

Note: BS = biophilic session, NBS = non-biophilic session, TP1 = time point 1, and TP2 = time point 2.

4.4.2. Physiological Responses

When comparing the local and mean skin temperatures between the two time points using a two-tailed pairwise t-test in BS (Figure 13), and NBS (Figure 14), there was a significant difference in the local and mean skin temperature between the two time points for both sessions (Table 11). Accordingly, the mean and local skin temperatures were raised at the second time point of both sessions. Thus, spending more time in a virtual environment resulted in a higher skin temperature regardless of the type of virtual environment.

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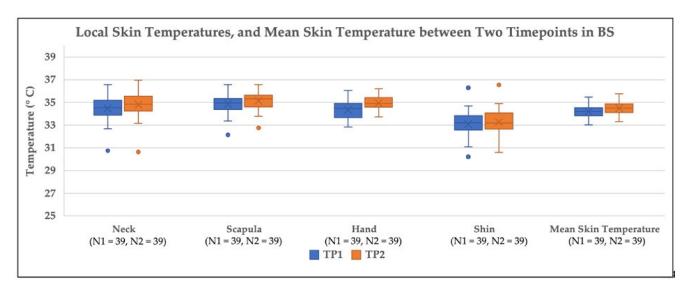


Figure 13. The four local skin temperatures and the mean skin temperature between TP1 and TP2 in the BS. Note: N1 = TP1 and N2 = TP2; • • outliers; \times mean marks.

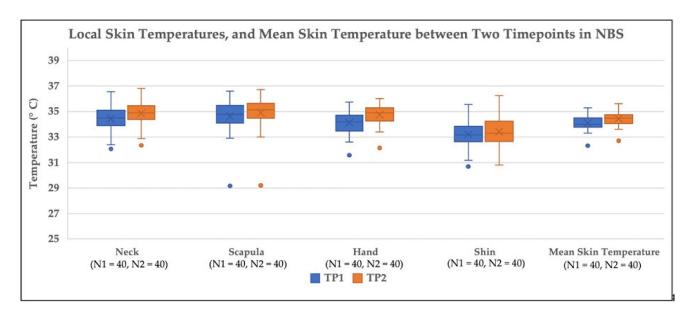


Figure 14. The four local skin temperatures and the mean skin temperature between TP1 and TP2 in the NBS. Note: N1 = TP1 and N2 = TP2; • • outliers; \times mean marks.

The heart rate and LF/HF ratio between the two time points were compared using a two-tailed pairwise t-test in BS (Figure 15), and NBS (Figure 16). There was no significant difference in heart rate and HF/LF ratio between the two time points of both the BS and the NBS (Table 12). However, a lower heart rate and LF/HF ratio were expected after 7 min of virtual exposure for the biophilic session.

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Table 11. The four local skin temperatures and the mean skin temperature of participants attending the BS and the NBS at the two time points, TP1 and TP2.

BS	TP1				TP2		Two-Tailed Pairwise t-Test	
DS	N	Mean °C	St. DEV.	N	Mean $^{\circ}$ C	St. DEV.	(<i>p</i> -Value) (Significance Level, 0.05)	
Neck	39	34.476	1.08	39	34.803	1.13	7.69×10^{-9}	
Scapula	39	34.867	0.91	39	35.159	0.81	2.705×10^{-8}	
Hand	39	34.346	0.79	39	34.942	0.67	6.92×10^{-13}	
Shin	39	33.097	1.13	39	33.275	1.15	0.0035	
Mean Skin Temperature	39	34.179	0.6	39	34.497	0.56	1.79×10^{-12}	
		TP1		TP2			Two-Tailed Pairwise <i>t</i> -Test	
NBS	N	Mean °C	St. DEV.	N	Mean °C	St. DEV.	(<i>p</i> -Value) (Significance Level, 0.05)	
Neck	40	34.433	0.95	40	34.853	0.97	2.54×10^{-10}	
Scapula	40	34.634	1.29	40	34.901	1.28	2.59×10^{-10}	
Hand	40	34.127	0.93	40	34.748	0.77	7.18×10^{-10}	
Shin	40	33.198	1.11	40	33.415	1.19	0.0005	
Mean Skin Temperature	40	34.095	0.54	40	34.447	0.56	2.94×10^{-13}	

Note: BS = biophilic session, NBS = non-biophilic session, TP1 = time point 1, and TP2 = time point 2. All comparisons are significantly different.

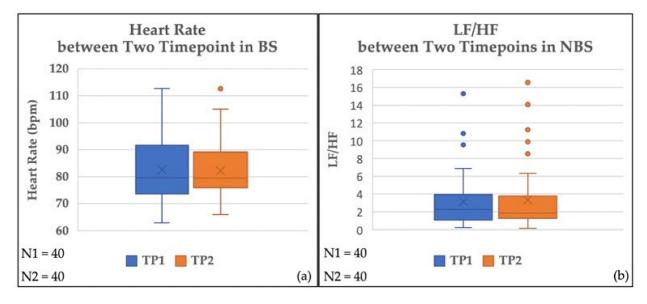


Figure 15. The (a) heart rate and (b) LF/HF comparisons between TP1 and TP2 in the BS. Note: N1 = TP1 and N2 = TP2; • • outliers; \times mean marks.

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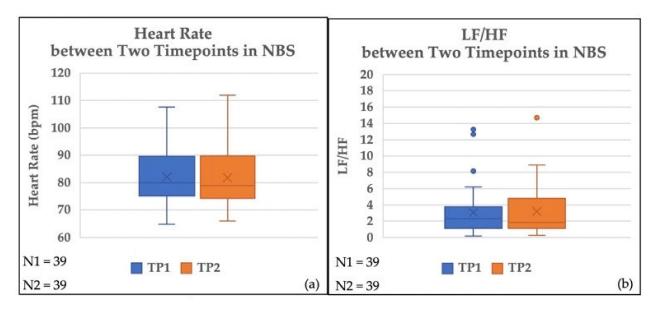


Figure 16. The (a) heart rate and (b) LF/HF comparisons between TP1 and TP2 in the NBS. Note: N1 = TP1 and N2 = TP2; • • outliers; \times mean marks.

Table 12. The heart rate and LF/HF of participants of attending the BS and the NBS at the two time points, TP1 and TP2.

BS -		TP1			TP2		Two-Tailed Pairwise <i>t</i> -test (<i>p</i> -Value)	
ъ5 -	N Mean St.DEV. N Mean St.DEV.		(Significance Level, 0.05)					
HR (bpm)	40	82.63	11.55	40	82.19	11.01	0.48	
LF/HF	40	3.13	3.17	40	3.35	3.74	0.76	
NBS -	TP1			TP2			two-tailed pairwise <i>t</i> -test (p-Value)	
NDS -	N	Mean	St.DEV.	N	Mean	St.DEV.	(significance level, 0.05)	
HR (bpm)	39	82.02	10.47	39	81.78	10.66	0.62	
LF/HF	39	3.07	3.06	39	3.18	3.03	0.86	

Note: BS = biophilic session, NBS = non-biophilic session, TP1= time point 1, and TP2 = time point 2.

5. Discussion

5.1. Between Sessions

When comparing participants' thermal states and physiological responses between the BS and the NBS, significant differences were observed in thermal comfort and hand skin temperature. Since participants' thermal state was measured by thermal sensation, thermal comfort, and thermal acceptability, the definition of these different perceptions would help to discuss the results. According to the ASHRAE Standard, thermal comfort refers to the mind's satisfaction, while thermal sensation indicates a feeling [51]. Thus, thermal sensation is correlated with physiological responses including skin temperature, while thermal comfort is relevant to the psychological aspect of the mind. The distinction between thermal sensation and comfort in evoking various responses may explain the results.

The thermal comfort difference (Table 7) suggests that a green wall as a visual stimulus alone in a virtual environment can improve human thermal comfort. The potential of a visual connection to nature in improving thermal comfort has been found in other studies [31]. The results suggest that adding a natural element such as a green wall to a virtual environment could sufficiently improve participants' mind satisfaction in terms of thermal comfort. However, thermal sensation and thermal acceptability were not significantly different. The result associated with the thermal sensation can be further

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explained by the skin temperature. Previous studies proved that skin temperature was a reliable proxy for assessing thermal sensation [32]. In this study, the result of thermal sensation is consistent with the mean skin temperature, since there was no significant difference between the BS and the NBS (Tables 7 and 8). In addition, the statistical analysis was limited to the sample mean difference presented in Table 3. Thus, if the thermal sensation was significant, a larger sample was needed.

In addition, an environment is thermally acceptable when the majority of its occupants report it as acceptable [51]. The literature suggests an existing connection between thermal acceptability and both thermal sensation and thermal comfort [41]. Since the results from thermal sensation and thermal acceptability are not consistent, it is hard to discuss thermal acceptability based on thermal sensation and comfort. One possibility to explain the results of thermal acceptability is the adaptive hypothesis, which suggests the impact of contextual factors and past experiences on occupants' thermal expectations [39]. Since most of the participants were from a warm climate, they might prefer warmer indoor temperatures. Thus, both sessions were acceptable for the participants.

There was no effect of the experiments on overall skin temperature. To explain this result, it needs to be noted that the chamber's temperature was set to 28.89 °C to provide a slightly warm condition during the experiment. Although participants' mean thermal sensation was close to 1, slightly warm (Table 2) at the first time point (TP0), this temperature might not be high enough for participants to evoke significant physiological responses, such as skin temperature. Thus, a warmer experimental condition such as 30°C [34] or 35 °C [52] may ensure that researchers observe differences in participants' physiological responses. Regarding the local skin temperature, the significant difference in hand temperature is not consistent with the other local skin temperatures or the mean skin temperature. This could be because the fluctuation of hand temperature is significant when the thermal state is close to the neutral (Table 8) [53].

No difference was observed in the heart rate and LF/HF between the BS and the NBS. Since heart rate is one of the indicators predicting thermal sensation [34], it is consistent with the results of thermal sensation. However, a lower LF/HF was expected in the BS since LF/HF is associated with thermal comfort [17]. Since these two sessions were only different in terms of visual stimuli, adding a green wall to the environment might change the LF/HF normal pattern. Thus, more investigation is needed to detect factors that would impact LF/HF.

5.2. Within Sessions

When comparing participants' thermal states and physiological responses between TP1 and TP2 in both sessions, a significant difference in the local and mean skin temperatures was observed. According to Table 11, the average mean skin temperature at TP2 was significantly higher than at TP1 in both sessions. In addition, the ascending pattern could be visually detected from time series plots of the mean skin temperature for each participant in both sessions (Figures 17 and 18). Although there is not a clear explanation for why participants' mean skin temperatures were higher after spending time in the virtual environment, the following are two possible explanations:

- The IVE condition could affect the thermal state and physiological responses [6].
 Thus, wearing an HMD and experiencing a virtual environment would increase
 physiological responses such as skin temperature. However, further investigation is
 needed to detect the impact of virtual technology based on exposure time and different
 thermal conditions.
- The exposure time to various thermal conditions could impact the mean skin temperature since the prediction models of body temperature include the duration time [54,55]. Thus, spending more time in a slightly warm condition might raise the body temperature through body heat accumulation.

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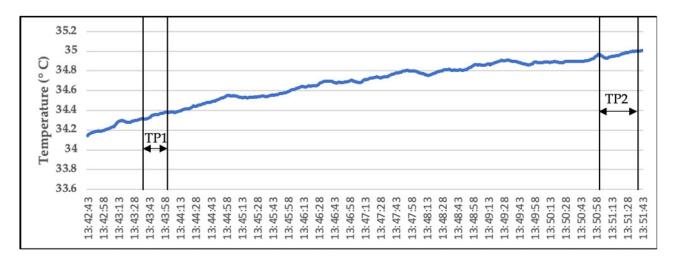


Figure 17. An example of mean skin temperature in the NBS.

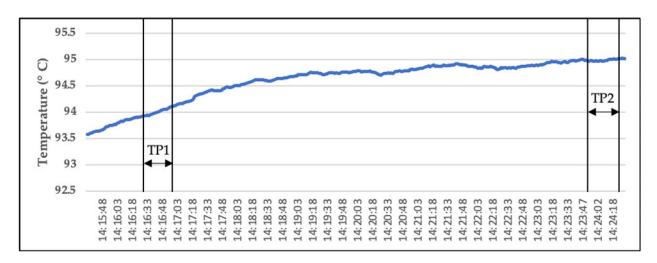


Figure 18. An example of mean skin temperature in the BS.

Thus, virtual exposure time could affect skin temperature, but a short time of exposure, such as 7 min, might not be enough to statistically change the thermal state.

5.3. Between and Within Sessions Thermal Votes

A closer look at the results from both between- and within-session analyses shows that the thermal comfort votes were significantly different between sessions, while no difference was observed in each session between the two time points. Thus, the same participant felt that the BS was more comfortable, while the participant's thermal comfort did not change in each session. Further analysis was conducted to determine an explanation for this result. According to the analysis (Figure 19), there was not a significant difference in participants' thermal comfort votes between the two sessions (Table 13) at TP1. In addition, the room temperature at TP1 was similar between the two sessions (Table 14). Therefore, participants started the experiment in the same thermal state in a comparable environmental condition. However, the thermal comfort vote raised in the BS while it decreased in the NBS. After 7 min, the thermal comfort vote differed significantly in the two sessions due to this exact inverse change. Since the two sessions were only different in terms of the type of virtual environment, the findings suggest that visual connection with a natural element, such as a green wall, could improve thermal comfort. However, there is a need for further studies to detect the impact of the virtual green wall on thermal sensation, acceptability, and physiological responses in other thermal conditions.

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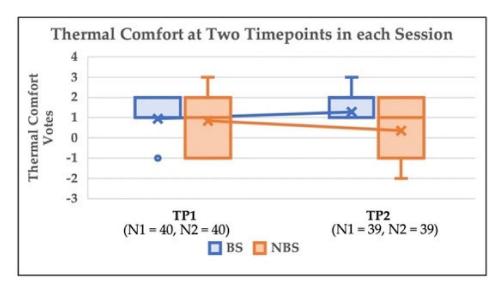


Figure 19. The thermal comfort of both sessions in each time point. Note: N1 = BS and N2 = NBS; • • outliers; \times * mean marks.

Table 13. The BS and NBS comparisons at TP1.

	BS				NBS			
Thermal State -	N	Mean	St.DEV.	N	Mean	St.DEV.	Wilcoxon Sign Rank Test (<i>p</i> -Value) (Significance Level, 0.05)	
Thermal Sensation	40	0.75	0.63	40	0.75	0.59	0.8978	
Thermal Comfort	40	0.97	1.1	40	0.85	1.19	0.6139	
Thermal Acceptability	40	0.95	0.32	40	0.9	0.44	0.5686	

Note: BS = biophilic session and NBS = non-biophilic session.

Table 14. The BS and NBS environmental temperature comparison at TP1.

BS			NBS		DE		<i>p</i> -Value		
TP1	N	Mean °C	St.DEV.	N	Mean °C	St.DEV.	DF	ι	p-varue
	39	29.035	0.19	39	28.972	0.18	38	1.52	0.1369

Note: BS = biophilic session, NBS = non-biophilic session, and TP1 = timepoint 1.

6. Limitations

We assessed the effect of visual connection with a green wall in an IVE under a slightly warm condition ($28.89\,^{\circ}$ C). Although the results provided insights into human thermal perception in a warm condition, this study does not investigate a green wall's impact on thermal perception under other conditions. Thus, more studies are needed to evaluate their effect under cooler or warmer conditions to provide a better understanding of the visual connection with a green wall under all potential thermal conditions.

Moreover, the type of heat loss varies between different thermal conditions, and this study only recorded body temperature changes. However, the transfer of heat is highly controlled by latent heat loss processes such as evaporation in warm conditions [56], and skin wetness data was not collected in this study.

Lastly, each participant was free to observe the virtual environment for seven minutes. According to the literature, participants' physiological states return to the baseline after 7~8 min habituation in a virtual environment [47]. Thus, the 7 min virtual exposure time was determined to minimize the risk of cybersickness. However, previous studies in real environments employed a longer time [31]. Thus, it may require a longer exposure time to detect the differences between biophilic and non-biophilic environments.

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7. Conclusions and Future Research

The study has shown that a visual connection with a green wall in IVEs can affect the thermal comfort perception of participants, although such visual connection affected thermal sensation, acceptability, and physiological responses differently. Thus, the study indicates that when using IVEs to study thermal perception, one needs to consider the compounded effect of visual and thermal stimuli. Consequently, until the extent to which the impact of visual stimuli (e.g., green walls) is fully understood, researchers may need to control visual and thermal stimuli separately when using them for data collection in IVEs.

In addition, the findings for each session show that the virtual exposure time could affect skin temperature, although a short time of exposure, such as seven minutes in this case, might not be enough to statistically change the thermal state. The virtual exposure time should be an important consideration when designing experimental procedures.

These findings suggest that future research is needed in the following areas. First, the inner workings of visual stimuli such as a green wall on thermal state and physiological responses needs more research. For example, although the results of thermal sensation with mean skin temperature were consistent, lower sensation votes and skin temperature were expected. Future research is needed to include other physiological responses, such as skin wetness, based on environmental conditions [56] to accurately study human physiological responses. Secondly, a more thorough investigation is required to determine the extent to which visual stimuli, such as a virtual green wall, may affect the thermal state and physiological responses in other thermal or environmental conditions. For example, experiments may be conducted at a higher environmental temperature (>28.89 °C) or using a stronger treatment (e.g., covering all walls with green walls) [57]. Thirdly, the exposure time of visual stimuli in virtual reality could play a role in the thermal perception of participants. This factor needs more exploration in conjunction with other factors such as room temperature. Finally, it is important to consider that the statistical analysis in the previous section was limited to the sample mean difference (Table 3). Thus, it takes a larger sample to detect the differences in the thermal sensation or the thermal acceptability if their sample mean difference is smaller than 0.5.

Abbreviations: Table 15 includes list of abbreviations used in this paper.

Abbreviation		Abbreviation	
BS	Biophilic Session	ST	Skin Temperature
HMD	Head-Mounted Display	TP1	Time Point 1
HR	Heart Rate	TP2	Time point 2
IVE	Immersive Virtual Environments	TSQ	Thermal State Questionnaire
NBS	Non-Biophilic Session	V (x)	Thermal State Votes
PR (x)	Physiological Response	V (s)	Thermal Sensation Votes
PR (st)	Physiological Response (skin temperature)	V (c)	Thermal Comfort Vote
PR (hr)	Physiological Response (heart rate)	V (a)	Thermal Acceptability Vote

Table 15. Abbreviations.

Author Contributions: Conceptualization, A.S., Y.Z., Y.C. and B.H.; methodology, A.S., Y.Z., Y.C. and B.H.; formal analysis, A.S.; investigation, A.S. and Y.Z.; writing—original draft preparation, A.S.; writing—review and editing, Y.Z., Y.C. and B.H.; supervision, Y.Z.; funding acquisition, Y.Z. All authors have read and agreed to the published version of the manuscript.

Funding: This research was supported by the National Science Foundation (Grant No. 1805914).

Institutional Review Board Statement: The study was conducted according to the guidelines of the Declaration of Helsinki, and approved by the Institutional Review Board of Louisiana State University (IRB#3998, 31 January 2018).

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Informed Consent Statement: Informed consent was obtained from all subjects involved in the study.

Data Availability Statement: The corresponding author can provide the data presented in this study upon request.

Acknowledgments: This research was supported by the National Science Foundation (Grant No. 1805914). Any opinions, findings, conclusions, or recommendations expressed in this material are those of the authors and do not necessarily reflect the views of the National Science Foundation.

Conflicts of Interest: The authors declare no conflict of interest.

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