

Development of an affective database made of interactive virtual environments

Original

Development of an affective database made of interactive virtual environments / Dozio, Nicolò; Marcolin, Federica; Scurati, Giulia Wally; Nonis, Francesca; Ulrich, Luca; Vezzetti, Enrico; Ferrise, Francesco. - In: SCIENTIFIC REPORTS. - ISSN 2045-2322. - STAMPA. - 11:24108(2021). [10.1038/s41598-021-03380-y]

Availability:

This version is available at: 11583/2945892 since: 2021-12-16T12:42:23Z

Publisher:

Nature

Published

DOI:10.1038/s41598-021-03380-y

Terms of use:

This article is made available under terms and conditions as specified in the corresponding bibliographic description in the repository

Publisher copyright

(Article begins on next page)



OPEN

Development of an affective database made of interactive virtual environments

Nicolò Dozio^{1✉}, Federica Marcolin², Giulia Wally Scurati¹, Francesca Nonis², Luca Ulrich², Enrico Vezzetti² & Francesco Ferrise¹

Despite the great potential of Virtual Reality (VR) to arouse emotions, there are no VR affective databases available as it happens for pictures, videos, and sounds. In this paper, we describe the validation of ten affective interactive Virtual Environments (VEs) designed to be used in Virtual Reality. These environments are related to five emotions. The testing phase included using two different experimental setups to deliver the overall experience. The setup did not include any immersive VR technology, because of the ongoing COVID-19 pandemic, but the VEs were designed to run on stereoscopic visual displays. We collected measures related to the participants' emotional experience based on six discrete emotional categories plus neutrality and we included an assessment of the sense of presence related to the different experiences. The results showed how the scenarios can be differentiated according to the emotion aroused. Finally, the comparison between the two experimental setups demonstrated high reliability of the experience and strong adaptability of the scenarios to different contexts of use.

The attention towards human emotions has been growing in recent years, given the importance they have on different aspects of everyday life. Emotions affect how we face and react to any experience, event, and situation. Despite there is not a univocal definition of "emotion", the psychology and neuroscience fields have widely acknowledged that emotions are deeply related to human health, well-being, behaviour, thinking, and decision-making, impacting the personal and social dimension of an individual¹. Therefore, arousing emotional reactions through validated stimuli can have different application interests, and the demand is greater than in the past.

Among the various media technologies that can elicit emotional reactions, one of the most interesting is Virtual Reality (VR). Through VR, we can provide users with immersive experiences delivering a variety of sensory stimuli. As a result, users can truly feel to be in the virtual environment (i.e., what is usually defined as the sense of presence²⁻⁴) and to control and interact effectively with it (i.e., the sense of agency^{5,6}). Furthermore, these aspects can strongly contribute to eliciting specific emotions in a way that is comparable and not significantly different from real-life experiences⁷.

Interactions between the level of presence and the emotional experience have been consistently reported in the literature^{8,9}. Despite there is not total agreement on the nature of this interaction, there seems to be also a link between the level of immersion experienced in the VR environment and the emotional response, especially in terms of arousal, one of the commonly used dimensions to describe the emotional reaction⁹. VR environments' ease of interaction leads to the opportunity of inducing relaxations states supporting stress recovery¹⁰ or to support the development of sustainable attitudes and behaviours¹¹. Furthermore, VR can also enhance our ability to empathize with others¹². However, this capability can also emerge as a side effect, as the strengthening effect of VR on emotions is not limited to positive experiences. Indeed, it also includes negative emotions, for instance, comparing the effects of VR to PC games¹³. Hence, regardless of the intentional use of emotions to achieve specific goals, VR designers should always consider and manage emotional aspects. For this reason, there is a need to understand how to generate, or rather avoid triggering, certain emotions through VR. The study of human emotions' elicitation through specific stimuli has a long tradition, and guidelines and methodologies regarding aesthetic features and attributes (e.g.,^{14,15}) have been developed to support the design of emotional artefacts.

The International Affective Picture System (IAPS)¹⁶ still constitutes one of the most used tools for inducing emotions. Other images databases are the Geneva affective picture database (GAPED)¹⁷, the EmoPicS database¹⁸, and the Nencki Affective Picture System (NAPS)¹⁹, developed to provide wider sets of increasing quality, realistic pictures. The extensive utilization of static image databases is probably due to the ease of use of this media,

¹Department of Mechanical Engineering, Politecnico di Milano, 20156 Milan, Italy. ²Department of Management and Production Engineering, Politecnico di Torino, 10129 Turin, Italy. ✉email: nicolo.dozio@polimi.it

which provide to experimenters a high level of control on the presentation methods and requires a relatively low demand in terms of cognitive resources to participants, making it usable for a great variety of populations. However, despite their diffusion, static images have some limitations, primarily linked with their ecological validity and the intensity of the emotion elicited. The relationship between sound and emotions has also been widely explored²⁰ and affective databases are available also for this sensory modality (e.g. IADS²¹). The study of auditory stimuli includes verbal and non-verbal sounds, as well as music. A set of descriptors suitable to evaluate all of them is presented by Weninger et al.²². Words' phonetic features can make them sound pleasant or harsh, influencing their affective rating and also their meaning²³. The Oxford Vocal (OxVoc) is a database of non-verbal sounds performed by adults, children, and animals emitting sad, happy, and neutral vocal expressions²⁴. Considering music, fast tempo and major mode are linked to positive and active emotions, while slow tempo and minor mode are associated with negative and passive ones²⁵. To overcome unisensory limitations, in the 90s, Gross et al.²⁶ developed the first movies affective database, made up of sixteen films eliciting amusement, anger, contentment, disgust, sadness, surprise, neutrality, and, slightly less successfully, fear. Their work has been followed by more recent studies (e.g.^{27–29}), which also differ according to the elicited emotional states. Movie clips surely offer a more involving experience than static images, however they are generally passive. The viewer does not control or interact with the presented events; similar limitations can be overcome using VR tools. Despite the use of emotional and affective media content has led to the creation of several databases of images, sounds, and videos, today and to the best of our knowledge, there are still no databases or design guidelines considering VR experiences and environments raising emotional responses.

In recent years, there also have been attempts to create affective databases through 360 °C video clips. In the work conducted by Li et al.³⁰, 73 selected video clips have been rated on the Valence and Arousal dimensions using the Self-Assessment Manikin scale, finding a correlation between valence ratings and standard deviation of head yaw. The video clips were played using a Head-Mounted Display (HMD) providing a good level of immersion and allowing experimenters to track head movements. Similarly, Jun et al.³¹ used HMD and immersive video clips to collect, among others, data related to presence, arousal, and simulator sickness on a large participants sample. Nevertheless, the contents considered in these works were video clips selected by the authors from the public domain and did not allow participants to interact with the content presented.

Virtual environments could represent the most effective way to arouse emotions because they exploit the benefits of being multisensory and include the possibility of interaction, which is an important element for users' involvement. The novelty and the purpose of the current work are to provide a database of validated interactive virtual environments (VEs) related to five distinct emotional categories to be used for the development of affective VR experiences. We followed a categorization based on five emotions (i.e. anger, fear, disgust, sadness, and happiness) considered to be shared universally, meaning-wise³². The ten newly developed affective VEs were tested on two experimental setups (Exp. 1 and Exp. 2), differentiated by the technology used to deliver the virtual experience. At this stage, none of the experimental set up was based on immersive VR technologies due to the ongoing COVID-19 pandemic. However, we can define the interactive VEs as scenarios that can be navigated by the users and respond to their movements into the virtual space. For this reason, they can easily be exported for other platforms, in particular for VR headsets. The comparison showed a consistency in the results, thus proving that the environments work independently of the rendering technology.

Methods

The study was conducted simultaneously in two experimental setups (i.e., Exp. 1 and Exp. 2) differentiated by the technology used to render the VEs. The experiments followed a within-subjects design where the five emotional entities used to categorise our affective VEs, plus neutrality and the baseline, constituted our experimental conditions.

Participants. The study involved a total of 75 participants. who voluntary took part to the experiment. In particular:

- Exp. 1 involved 48 participants (17 female), aged between 19 and 40 years ($M = 26,27$; $SD = 4336$).
- Exp. 2 involved 27 participants (14 female), aged between 19 and 34 years ($M = 24,52$; $SD = 3378$).

For both the experimental setups, each participant provided written informed consent for study participation. Written consent and all methods were carried out in accordance with the principles of the Helsinki Declaration.

Affective VEs. We used eleven VEs for the experiment. Ten scenarios, two for each of the five basic emotions (i.e. anger, fear, disgust, sadness, happiness), are newly developed. The additional scenario, for neutrality, is described in³³.

Happy scenarios The happiness scenarios were designed differently since one aimed at creating happiness through relaxation and the other through fun and excitement. Both the scenes have a positive valence, but arousal is variable. The first scene consisted of a sunset on a tropical beach with palm trees; the user has to walk towards and into the calm sea (Fig. 1a). The second scene featured a fantastic rainbow world with colourful bubble lights and funny animals and vegetation (Fig. 1b).

Sad scenarios The first consisted of an abandoned hospital, with people suffering and crying (Fig. 1c). The second was a post-apocalyptic scene, with industrial buildings, dead animals and vegetation (Fig. 1d).

Angry scenarios The first was a school, during a fire, with smoke preventing users from seeing the surrounding clearly (Fig. 1e). The second was a labyrinth garden with high fences (Fig. 1f). In both scenes, users have to find

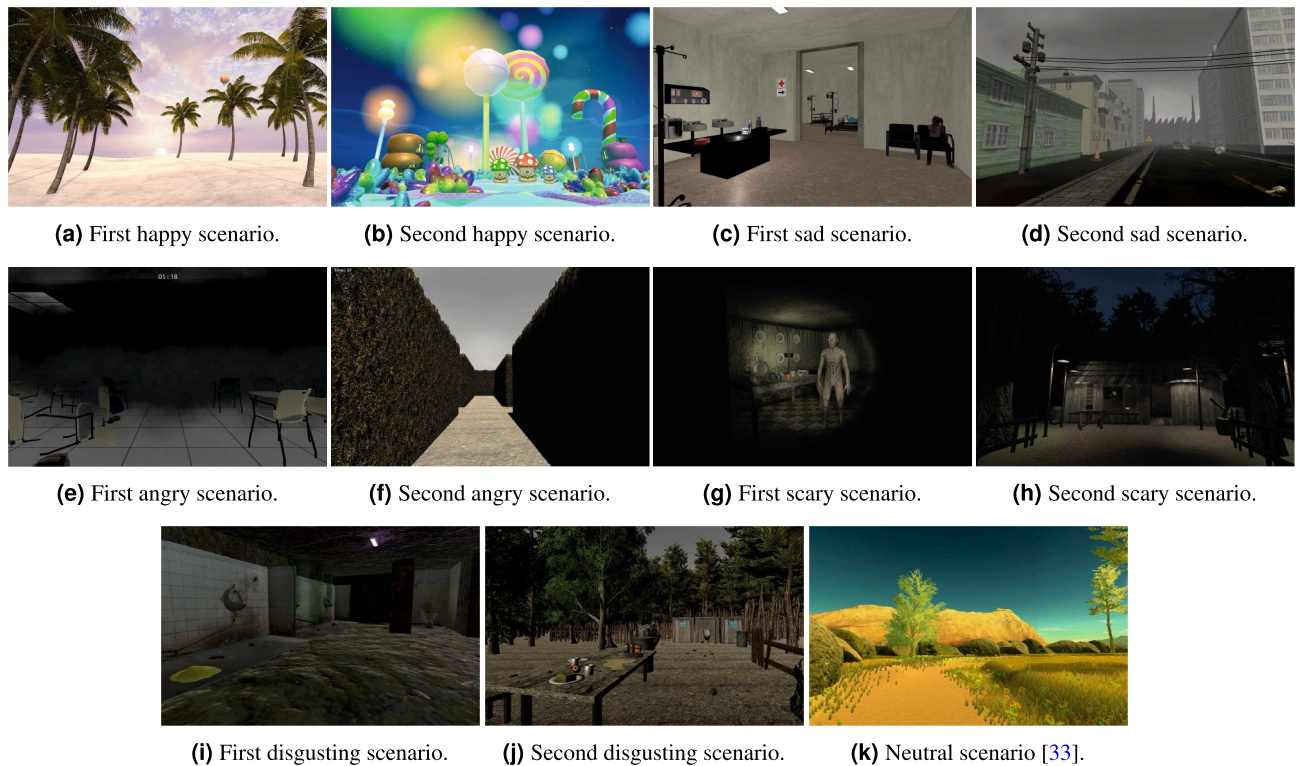


Figure 1. Details of the affective VR environments used to elicit Happiness, Sadness, Anger, Fear, Disgust, and Neutrality.

the exit, but invisible obstacles lead them to start the game repeatedly, showing a red flashing light. Countdowns stimulate users to move quickly.

Scary scenarios The first consisted of a dark, haunted house, with monsters, clowns and typical horror movie events (e.g., TV turning on, door shutting) (Fig. 1g). The second featured a dark wood populated by monsters, with dead bodies and zombies (Fig. 1h).

Disgusting scenarios The first represented an abandoned basement, with insects, rats and dirty toilets (Fig. 1i). The second was a picnic site, with dirty dishes and rotten food, insects, mud, and chemical toilets with people vomiting (Fig. 1j).

Neutral scenario We used the neutral environment developed by Chirico et al.³³ which was constituted by a circular path located in a small meadow surrounded by rocks and a few trees (Fig. 1k). Auditory features were excluded in this scenario to limit any possible emotional influence further.

Measures. *Empathy.* Before taking part in the study, participants were asked to fill in a questionnaire that aimed to assess their empathy level. We used an Italian translated and validated version of the Balanced Emotional Empathy Scale (BEES)³⁴.

Emotion ratings. After each scenario presentation, participants were asked to rate on seven continuous scales from 0 to 100 to measure the intensity with which the participants' associated emotional labels corresponding to 6 basic emotions³², plus neutrality, with the presented scenario. The labels associated with the scales were happiness, sadness, anger, fear, disgust, surprise, and neutrality.

Presence. Presence measures were collected using Version 3.0 of the Presence Questionnaire³⁵. The questionnaire uses a 7-point scale format where each item is anchored at the ends by opposing descriptors, while in the middle, a midpoint anchor is shown. This version of the questionnaire is an update of the Version 2.0³ and present a decrease in the number of items from 32 to 29 items of the Version 3.0 (by removing item 26, 27 and 28) and provide a new four factors structure named Involvement (item 1, 2, 3, 4, 6, 7, 8, 10, 14, 17, 18, 29), Sensory fidelity (item 5, 11, 12, 13, 15, 16), Adaptation/immersion (item 9, 20, 21, 24, 25, 30, 31, 32), and Interface quality (item 19, 22, 23).

The numbering of the Version 3.0 items reflects the original numbering of Version 2.0 to which items 26, 27 and 28 have been removed.

Since some of the items were referred to the assessment of tactile/haptic feedbacks (i.e. item 13, 17, 29) or focused on measuring specific interaction dynamics or activities which were not feasible nor requested during our exploration tasks (i.e. items 7, 9, 15, 16, 23, 24, 31), we decided to exclude them from data collection, resulting in an adapted version of the questionnaire constituted by 19 items. We used Cronbach's alpha to measure the

reliability of our modified 19-item scale, which was still acceptable ($\alpha = 0.83$; $N = 336$). We also computed internal consistency reliability coefficients for the original four factors with the remaining 19 items:

- Involvement (item 1, 2, 3, 4, 6, 8, 10, 14, 18) ($\alpha = 0.82$);
- Sensory fidelity (item 5, 11, 12) ($\alpha = 0.83$);
- Adaptation/immersion (item 20, 21, 25, 30, 32) ($\alpha = 0.65$);
- Interface quality (item 19, 22) ($\alpha = 0.47$).

Procedure. The testing was performed simultaneously in two setups, differentiated by the technology used to render the virtual environments. Before the scenario presentation, participants were requested to read and sign a consent form. Then, they were instructed about the structure of the study and the composition of the questionnaires. After the explanation, they were asked to first assess their current emotional state on the seven emotional labels, which constituted our baseline. We then gave them a mouse and a keyboard. We proceeded with a brief training session on a simple virtual environment developed with Unity Software (version 2019.4.13f1), constituted by a floor and some geometric 3D obstacle. Participants controlled their movements with WASD keys and oriented their point of view with the mouse. When they felt confident with the controls, participants communicated that they were ready to start the exploration session, in which they were asked to navigate and explore seven scenarios, one for each discrete emotion plus the neutral scenario. Each scene had a fixed duration of 90 seconds. Standardised scenario selection and presentation order was counterbalanced between participants using a Latin Square design. After each scenario, participants were asked to rate the seven emotional labels and complete our adapted version of the Presence Questionnaire. In Exp. 2, Presence measures were collected one time at the end of the experiment. The assessment phase between the presentation of the scenarios lasted 5 min on average and this break, combined with the order of the counterbalanced scenarios, helped us counteract any residual emotional bias between different conditions. The entire experimental session lasted about 45 min. All data were analysed and reported anonymously.

Experimental setups. *Exp. 1:* participants were asked to sit on a fixed chair located in front of a wall screen (width 3; height 2.5 meters) at a distance of 2 m from the projected wall. VR environments were projected using a projector (resolution 1920×1080 p; framerate 60 fps) connected to a PC (GPU: NVIDIA GTX 2070 Max-Q; CPU: Intel i7; RAM 32 GB). The audio was played through over-ear headphones connected to the PC., The use of HMDs was discarded due to the general laboratory safety practices during the COVID-19 Pandemic.

Exp. 2: participants were seated on a fixed chair located in front of a desktop computer at a distance of 70 cm from it. VR scenarios were displayed on a monitor (screen size: 27 inches; resolution: 2560×1440) connected to a PC (GPU: NVIDIA QUADRO P3200; CPU: Intel(R) Xeon(R) E-2186M @ 2.90GHz; RAM: 32 GB). Audio was played through a speaker connected to the PC., In this experiment an RGB-D camera was added to capture facial expressions for future analyses on Facial Expression Recognition (FER). The use of HMDs was discarded in order to reduce occlusion issues and because of the general laboratory safety practices during the COVID-19 Pandemic.

Though head tracking technology might have improved interaction with VEs, we decided not to use it. The reason is that in Exp. 1, participants were asked to sit on a chair. Thus head position was supposed not to change significantly. About head orientation, usually in using big wall displays, rotations are removed, and only displacements are left to track. This is because the user is supposed to look at the unique available wall to visualize the information. In Exp. 2, we included an RGB-D camera, and the user was supposed not to move or rotate the head to simplify data acquisition.

Data analysis. For the empathy score, we performed a mixed repeated measures ANOVA with our experimental conditions as within-subjects factor, the emotional labels as measures and the questionnaire score as a between-subjects variable.

Two normality tests (i.e. Kolmogorov-Smirnov, Shapiro-Wilk) were carried out to determine if data related to the emotional labels were normally distributed. They did not follow a normal distribution, so we decided to proceed by using a non-parametric Friedman test analysis of differences among repeated measures. Then, a post hoc analysis with Wilcoxon signed-rank test was conducted. Since multiple comparisons increase the probability to commit Type I errors, a Bonferroni correction was applied to lower the critical p-value depending on the number of tests performed. We had 7 conditions (including baseline) resulting in 21 ($= 7 \times 6/2$) $[N(N-1)/2]$ possible combination, therefore we adjusted the significance level to 0.002 ($= 0.05/21$)³⁶.

For Presence rates, we performed two normality test (i.e. Kolmogorov-Smirnov and Shapiro-Wilk), and the results showed that the data related to the four factors of the Presence Questionnaire were normally distributed. We, therefore, proceeded with one-way repeated measures ANOVAs (conditions: Neutral, Happy, Sad, Scary, Angry, Disgusting) with our four factors as measures (i.e. Involvement, Sensory fidelity, Adaptation/Immersion, and Interface quality). We then performed post hoc comparisons using the Bonferroni correction ($\alpha = 0.05$).

Regarding the comparison between the two setups, data related to the emotional labels were not normally distributed. Therefore, we performed a Mann-Whitney U test for each emotional label to compare the results obtained in our experimental conditions among the two different setups.

Finally, to compare the Presence scores between the two experimental setups, we computed an overall Presence score for Exp. 1 using the data collected for each condition. We then performed a one-way ANOVA to compare the overall Presence score and the four constitutive factors (i.e., Involvement, Sensory fidelity, Adaptation/immersion, Interface quality) between the two setups.

Results

Empathy. We collected 67 responses ($N_{Exp.1} = 43$; $N_{Exp.2} = 24$). Empathy scores were classified in three different categories: above, below, and corresponding to the average of the population in which the questionnaires were validated. Responses showed that 19 participants in Exp. 1 and 12 participants in Exp. 2 obtained a lower score than the mean of the population.

Exp. 1: Results showed an interaction effect of empathy scores and conditions on Sadness [$F(6.696) = 3.571$; $p < 0.001$; $\eta_p^2 = 0.155$] and Anger [$F(7.089) = 2.910$; $p = 0.007$; $\eta_p^2 = 0.130$] rates.

In particular, participants with a lower level of empathy reported lower Sadness rates in the Sad ($M = 26.32$; $SD = 20.02$) and Angry ($M = 4.84$; $SD = 8.35$) conditions, than those with empathy scores corresponding to the average (Sad condition: $M = 49.18$; $SD = 28.21$) or above the average (Sad condition: $M = 57.67$; $SD = 25.54$; Angry condition: $M = 23.83$; $SD = 30.02$). Furthermore, in the Scary condition empathy scores above the average corresponded with higher rates of Anger ($M = 39.0$; $SD = 37.27$) than those with an average ($M = 12.41$; $SD = 16.56$) or below the average ($M = 7.79$; $SD = 13.94$) score at the BEES questionnaire.

Exp. 2: Results did not show a significant effect ($p > 0.05$) of BEES scores on the seven emotional scales in our experimental conditions.

Emotion ratings. Participants were asked to rate on seven continuous scales from 0 to 100 the intensity with which they experienced six basic emotions³², plus neutrality, according to the presented scenario. The labels associated with the scales were happiness, sadness, anger, fear, disgust, surprise, and neutrality. The experiments followed a within-subjects design where the five emotional entities used to categorise our VR scenarios, plus the neutral scenario and the baseline, constituted our experimental conditions. The results showed a statistically significant difference for each scale depending on which scenario was presented (i.e., the experimental condition). More specifically:

- Happiness—Exp. 1: $\chi^2(6) = 147.382$; $p < 0.001$. Exp. 2: $\chi^2(6) = 107.698$; $p < 0.001$.
- Sadness—Exp. 1: $\chi^2(6) = 120.835$; $p < 0.001$. Exp. 2: $\chi^2(6) = 52.590$; $p < 0.001$.
- Anger—Exp. 1: $\chi^2(6) = 127.306$; $p < 0.001$. Exp. 2: $\chi^2(6) = 63.215$; $p < 0.001$.
- Fear—Exp. 1: $\chi^2(6) = 159.074$; $p < 0.001$. Exp. 2: $\chi^2(6) = 68.945$; $p < 0.001$.
- Disgust—Exp. 1: $\chi^2(6) = 175.720$; $p < 0.001$. Exp. 2: $\chi^2(6) = 101.449$; $p < 0.001$.
- Surprise—Exp. 1: $\chi^2(6) = 44.682$; $p < 0.001$. Exp. 2: $\chi^2(6) = 58.931$; $p < 0.001$.
- Neutrality—Exp. 1: $\chi^2(6) = 86.193$; $p < 0.001$. Exp. 2: $\chi^2(6) = 26.848$; $p < 0.001$.

Figure 2a and b show participants' rates in our two experimental setups, while Tables 1 and 2 show the results for each emotional label in the condition in which it obtained the highest rating, compared to all the other conditions (e.g., participants' rates for the label 'Anger' in the Angry condition compared to the rates for the same label in all the other conditions).

Neutrality. In *Exp. 1*, Neutrality rates in the Neutral condition ($M = 49.96$) were significantly higher than the Happy ($M = 37.13$; $Z = -3.162$; $p = 0.002$), Sad ($M = 25.81$; $Z = -4.566$; $p < 0.001$), Angry ($M = 22.69$; $Z = -4.717$; $p < 0.001$), Scary ($M = 18.02$; $Z = -5.062$; $p < 0.001$), and Disgusting ($M = 28.42$; $Z = -4.344$; $p < 0.001$) conditions. Neutrality rates did not differ significantly from the Baseline condition ($M = 55.69$; $Z = -0.807$; $p = 0.42$).

In *Exp. 2*, Neutrality rates in the Neutral condition ($M = 33.52$) did not differ significantly ($p \geq 0.002$) from any of the other experimental conditions.

Happiness. In *Exp. 1*, Happiness rates in the Happy condition ($M = 61.42$) were significantly higher than the Neutral ($M = 47.06$; $Z = -4.217$; $p < 0.001$), Sad ($M = 19.21$; $Z = -5.563$; $p < 0.001$), Angry ($M = 22.29$; $Z = -5.715$; $p < 0.001$), Scary ($M = 21.73$; $Z = -5.480$; $p < 0.001$) and Disgusting ($M = 20.38$; $Z = -5.469$; $p < 0.001$) conditions.

In *Exp. 2*, Happiness rates in the Happy condition ($M = 71.41$) were significantly higher than the Neutral ($M = 53.19$; $Z = -3.392$; $p = 0.001$), Sad ($M = 6.48$; $Z = -4.544$; $p < 0.001$), Angry ($M = 12.67$; $Z = -4.383$; $p < 0.001$), Scary ($M = 11.26$; $Z = -4.471$; $p < 0.001$) and Disgusting ($M = 9.7$; $Z = -4.459$; $p < 0.001$) conditions.

Surprise. In *Exp. 1*, Surprise rates were highest in the Happy condition ($M = 38.19$) and they differed significantly from the Baseline ($M = 21.94$; $Z = -3.222$; $p = 0.001$), Neutral ($M = 21.52$; $Z = -3.616$; $p < 0.001$), Sad ($M = 15.83$; $Z = -4.797$; $p < 0.001$) and Disgusting ($M = 22.31$; $Z = -3.474$; $p = 0.001$) conditions.

In *Exp. 2*, Surprise rates were highest in the Happy condition ($M = 55.54$) and they differed from all the other conditions except the Scary one ($M = 34.37$; $Z = -2.775$; $p = 0.006$).

Sadness. In both *Exp. 1* and *Exp. 2*, Sadness rates in the Sad condition ($M_{Exp.1} = 40.25$; $M_{Exp.2} = 40.26$) were significantly higher ($p < 0.001$) than all the other conditions.

Exp. 1: Baseline ($M = 6.92$; $Z = -5.468$), Neutral ($M = 5.35$; $Z = -5.647$), Happy ($M = 3.79$; $Z = -5.647$), Angry ($M = 12.81$; $Z = -5.647$), Scary ($M = 13.52$; $Z = -5.489$), and Disgusting ($M = 11.23$; $Z = -5.393$).

Exp. 2: Baseline ($M = 14.37$; $Z = -3.608$), Neutral ($M = 3.81$; $Z = -4.386$), Happy ($M = 3.81$; $Z = -4.203$), Angry ($M = 12.56$; $Z = -3.813$), Scary ($M = 12.22$; $Z = -3.863$), and Disgusting ($M = 18.11$; $Z = -3.318$).

- Neutrality - Exp. 1: $\chi^2(6) = 86.193; p < 0.001$. Exp. 2: $\chi^2(6) = 26.848; p < 0.001$.

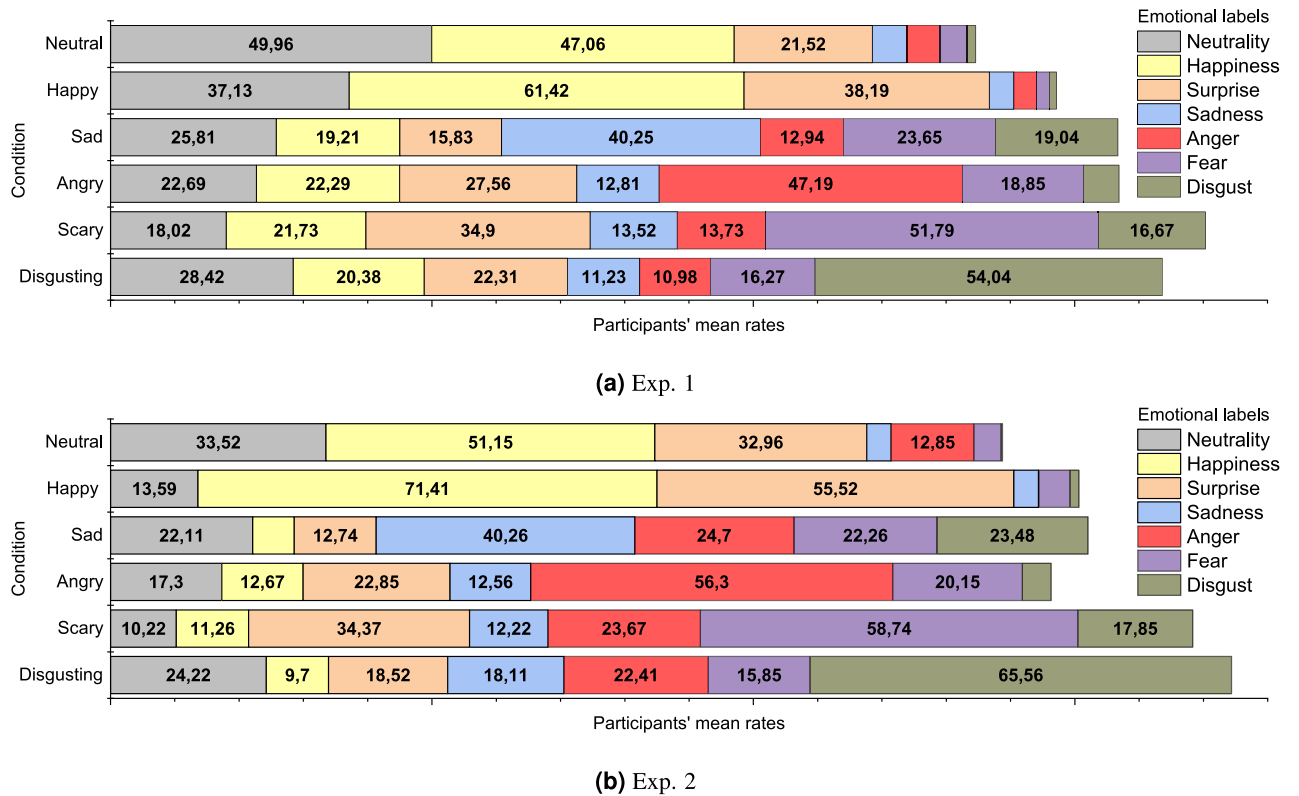


Figure 2. Participants' mean rates for the 7 emotional labels in the two experimental setups.

VS	Baseline		Neutral		Happy		Sad		Angry		Scary		Disgusting	
	Z	p	Z	p	Z	p	Z	p	Z	p	Z	p	Z	p
Neutral/neutrality	- 0.807	0.42			- 3.162	0.002	- 4.566	<0.001	- 4.717	<0.001	- 5.062	<0.001	- 4.344	<0.001
Happy/happiness	- 0.692	0.489	- 4.217	<0.001			- 5.563	<0.001	- 5.715	<0.001	- 5.480	<0.001	- 5.469	<0.001
Happy/surprise	- 3.222	0.001	- 3.616	<0.001			- 4.797	<0.001	- 2.290	0.022	- 1.002	0.316	- 3.474	0.001
Sad/sadness	- 5.468	<0.001	- 5.647	<0.001	- 5.647	<0.001			- 5.647	<0.001	- 5.489	<0.001	- 5.393	<0.001
Angry/anger	- 5.836	<0.001	- 5.597	<0.001	- 5.844	<0.001	- 5.779	<0.001			- 5.580	<0.001	- 5.532	<0.001
Scary/fear	- 5.804	<0.001	- 5.907	<0.001	- 5.907	<0.001	- 5.907	<0.001	- 5.443	<0.001			- 5.751	<0.001
Disgusting/disgust	- 5.876	<0.001	- 5.779	<0.001	- 5.843	<0.001	- 5.907	<0.001	- 5.730	<0.001	- 5.519	<0.001		

Table 1. Exp. 1—comparison of each label in the condition with the highest rating and all other conditions.

VS	Baseline		Neutral		Happy		Sad		Angry		Scary		Disgusting	
	Z	p	Z	p	Z	p	Z	p	Z	p	Z	p	Z	p
Neutral/neutrality	- 0.943	0.345			- 2.810	0.005	- 1.429	0.153	- 1.582	0.114	- 2.552	0.011	- 1.289	0.197
Happy/happiness	- 2.845	0.004	- 3.392	0.001			- 4.544	<0.001	- 4.383	<0.001	- 4.471	<0.001	- 4.459	<0.001
Happy/surprise	- 4.004	<0.001	- 3.418	<0.001			- 4.203	<0.001	- 3.499	<0.001	- 2.775	0.006	- 4.230	<0.001
Sad/sadness	- 3.608	<0.001	- 4.386	<0.001	- 4.203	<0.001			- 3.813	<0.001	- 3.863	<0.001	- 3.318	0.001
Angry/anger	- 3.634	<0.001	- 4.244	<0.001	- 4.375	<0.001	- 3.378	0.001			- 3.149	0.002	- 3.652	<0.001
Scary/fear	- 3.846	<0.001	- 4.461	<0.001	- 4.545	<0.001	- 4.258	<0.001	- 4.295	<0.001			- 4.214	<0.001
Disgusting/disgust	- 4.172	<0.001	- 4.547	<0.001	- 4.545	<0.001	- 4.495	<0.001	- 4.545	<0.001	- 4.321	<0.001		

Table 2. Exp. 2—comparison of each label in the condition with the highest rating and all other conditions.

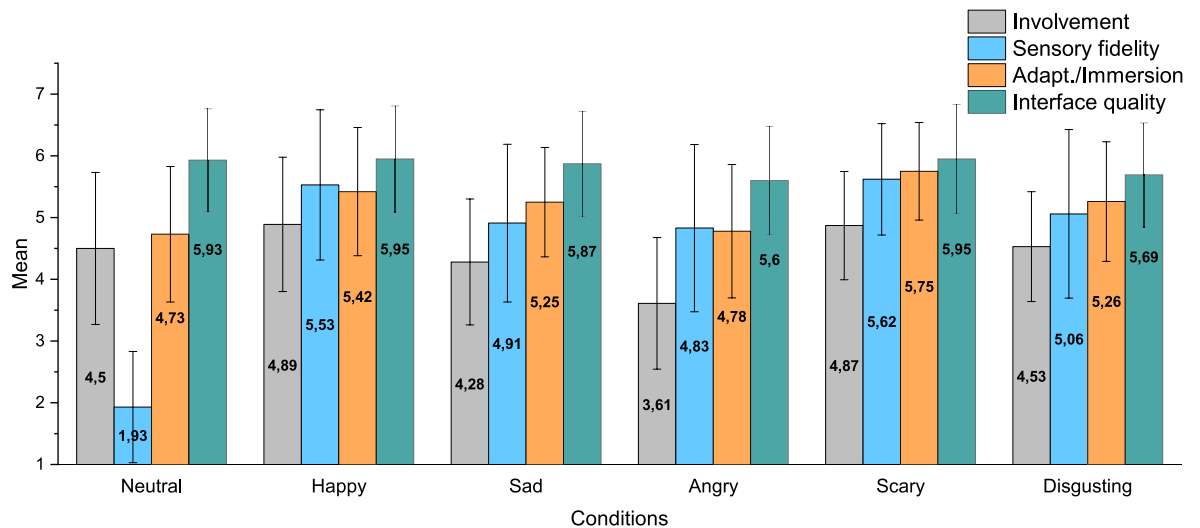


Figure 3. Exp. 1—presence mean rates for each experimental condition.

Anger. In both the experimental setups, Anger rates in the Angry condition ($M_{Exp.1} = 47.19$; $M_{Exp.2} = 56.3$) were significantly higher ($p < 0.001$) than all the other conditions.

Exp. 1: Baseline ($M = 5.17$; $Z = -5.836$), Neutral ($M = 5.13$; $Z = -5.597$), Happy ($M = 3.54$; $Z = -5.844$), Sad ($M = 12.94$; $Z = -5.358$), Scary ($M = 13.73$; $Z = -5.580$), and Disgusting ($M = 10.98$; $Z = -5.532$).

Exp. 2: Baseline ($M = 17.85$; $Z = -3.634$), Neutral ($M = 12.85$; $Z = -4.244$), Happy ($M = 0.07$; $Z = -4.375$), Sad ($M = 24.7$; $Z = -3.378$), Scary ($M = 23.67$; $Z = -3.149$; $p = 0.002$), and Disgusting ($M = 22.41$; $Z = -3.652$).

Fear. In both Exp. 1 and Exp. 2, Fear rates in the Scary condition ($M_{Exp.1} = 51.79$; $M_{Exp.2} = 58.74$) were significantly higher ($p < 0.001$) than all the other conditions.

Exp. 1: Baseline ($M = 6.40$; $Z = -5.804$), Neutral ($M = 4.21$; $Z = -5.907$), Happy ($M = 2.00$; $Z = -5.907$), Sad ($M = 23.65$; $Z = -5.443$), Angry ($M = 13.73$; $Z = -5.508$), and Disgusting ($M = 16.27$; $Z = -5.751$).

Exp. 2: Baseline ($M = 14.37$; $Z = -3.846$), Neutral ($M = 4.22$; $Z = -4.461$), Happy ($M = 4.85$; $Z = -4.545$), Sad ($M = 22.26$; $Z = -4.258$), Angry ($M = 20.15$; $Z = -4.295$), and Disgusting ($M = 15.85$; $Z = -4.214$).

Disgust. For both the experimental setups, Disgust rates in the Disgusting condition ($M_{Exp.1} = 54.04$; $M_{Exp.2} = 65.56$) were significantly higher ($p < 0.001$) than all the other conditions.

Exp. 1: Baseline ($M = 1.33$; $Z = -5.876$), Neutral ($M = 1.35$; $Z = -5.779$), Happy ($M = 1.08$; $Z = -5.843$), Sad ($M = 19.04$; $Z = -5.730$), Angry ($M = 5.50$; $Z = -5.519$), and Scary ($M = 16.67$; $Z = -5.523$).

Exp. 2: Baseline ($M = 12.11$; $Z = -4.172$), Neutral ($M = 0.22$; $Z = -4.547$), Happy ($M = 1.37$; $Z = -4.545$), Sad ($M = 23.48$; $Z = -4.495$), Scary ($M = 17.85$; $Z = -4.321$), and Angry ($M = 4.48$; $Z = -4.545$).

Presence. Participants were asked to fill our adapted version of the presence questionnaire after each condition only during Exp. 1. For this reason, the following analysis will consider only data from Exp. 1, while data from Exp. 2 will be considered only for a comparison between the two setups. Presence mean rates for each condition are shown in Fig. 3.

Involvement. We observed a significant effect of conditions on Involvement [$F(5) = 18.927$; $p < 0.001$; $\eta_p^2 = 0.287$]. As visible from Fig. 3, the less involving condition was Angry ($M = 3.61$; $SD = 1.065$) which differed significantly ($p < 0.05$) from all the other conditions. Furthermore, the Happy ($M = 4.89$; $SD = 1.087$) and Scary ($M = 4.87$; $SD = 0.876$) conditions also had a significant higher level of involvement compared to the Sad condition ($M = 4.28$; $SD = 1.02$).

Sensory fidelity. Results showed a significant effect of the experimental conditions on Sensory Fidelity [$F(5) = 76.644$; $p < 0.001$; $\eta_p^2 = 0.620$]. The Neutral condition ($M = 1.93$; $SD = 0.9$) was significantly lower than all the other conditions, but since the items in this factor were mainly related to auditory features, which were voluntarily absent in our Neutral scenario, we expected to obtain lower results. Pairwise comparison also shows a significant higher level for sensory fidelity in Happy ($M = 5.53$; $SD = 1.218$) and Scary ($M = 5.62$; $SD = 0.903$) conditions compared to Sad ($M = 4.91$; $SD = 1.277$), and finally a significant difference between Scary and Angry ($M = 4.83$; $SD = 1.081$).

Adaptation/immersion. Conditions had a significant effect on Adaptation/Immersion [$F(4.175) = 14.369$; $p < 0.001$; $\eta_p^2 = 0.234$]. Also for this factor, the Neutral condition ($M = 4.73$; $SD = 1.099$) had a significantly lower mean compared to all the other conditions, except for Angry ($M = 4.78$; $SD = 1.081$), which differed significantly only from Happy ($M = 5.42$; $SD = 1.099$), and Scary ($M = 5.75$; $SD = 0.791$) conditions. The highest level of

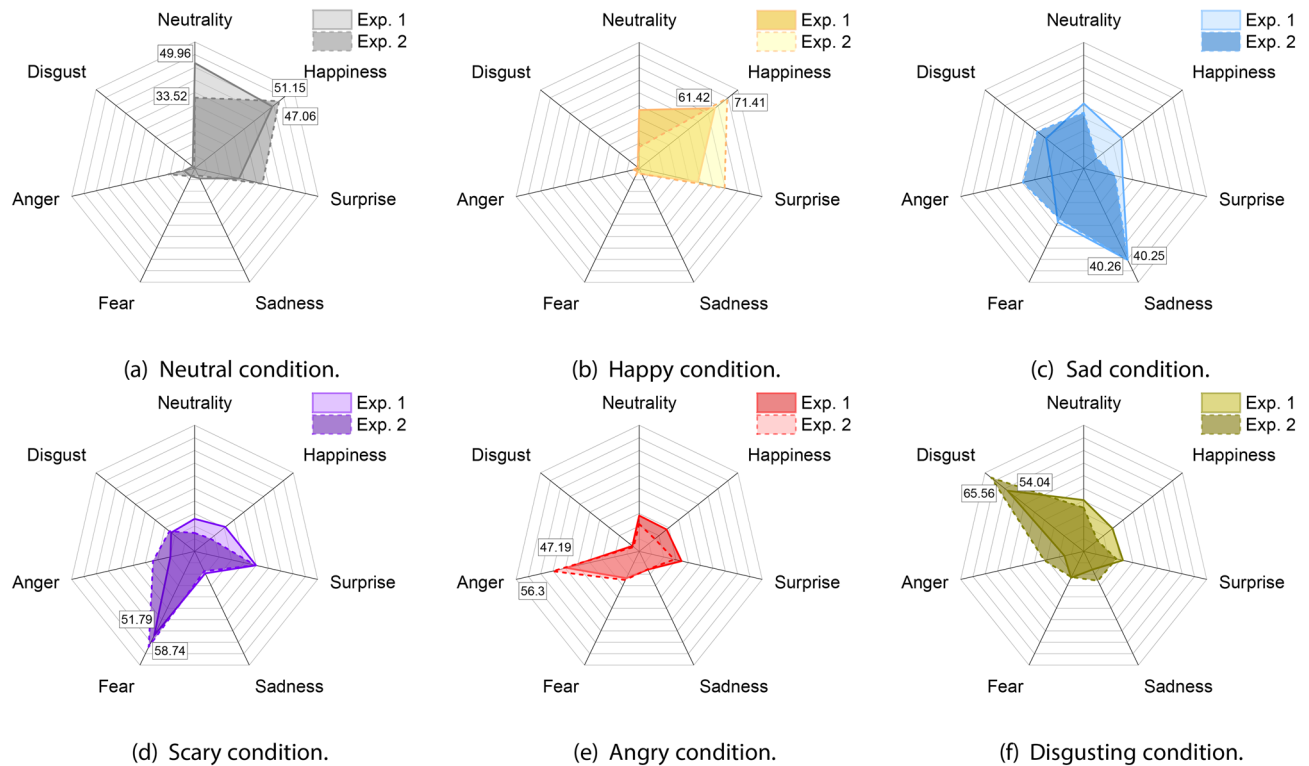


Figure 4. Comparison between the emotional rates in Exp. 1 and Exp. 2.

Adaptation/Immersion was reached by the Scary condition, which was also significantly higher than Sad ($M = 5.25$; $SD = 0.887$) and Disgusting ($M = 5.26$; $SD = 0.969$) conditions.

Interface quality. Result showed a small effect of conditions on Interface quality [$F(3.974) = 2.455$; $p < 0.05$; $\eta_p^2 = 0.05$]. Pairwise comparisons only showed an almost significant difference ($p = 0.052$) between the Scary $M = 5.95$; $SD = 0.883$) and the Angry $M = 5.6$; $SD = 0.875$) conditions.

Comparison between Exp. 1 and Exp. 2. In this section, we compare the results obtained in the two experimental setups to explore effects linked to the differences in the presentation of our scenarios.

Emotion ratings. As suggested by Fig. 4, the two emotional labels which differed the most were Neutrality and Happiness. For Neutrality rates, we found differences between the two setups in the Neutral [$U(N_{Exp.1} = 48$; $N_{Exp.2} = 27) = 465$; $Z = -2.03$; $p = 0.042$] (Fig. 4a), Happy [$U = 348.5$; $Z = -3.363$; $p < 0.001$] (Fig. 4b), and Scary [$U = 453$; $Z = -2.261$; $p = 0.023$] (Fig. 4d) conditions. For Happiness rates, the analysis highlighted differences between the two setups only for the Sad [$U = 415$; $Z = -2.714$; $p = 0.006$] (Fig. 4c), and the Disgusting [$U = 466$; $Z = -2.085$; $p = 0.037$] (Fig. 4f) conditions. In addition, Surprise rates differed only in the Happy condition [$U = 443$; $Z = -2.265$; $p = 0.023$] (Fig. 4b). For the other environments participants' rates were very similar and only Anger rates showed a small difference in the Happy condition [$U = 465$; $Z = -2.697$; $p = 0.005$] (Fig. 4b).

Despite the few differences that emerged from the comparison, it is important to highlight that the overall trend followed by participants' rates in our scenarios was consistent between the two samples. As visible from Tables 1 and 2, the comparisons for each label follow the same trend in both the experimental setups, except for Neutrality rates in the Neutral condition, which behave differently from Exp. 1 to Exp. 2.

Presence. Results did not show significant differences between the two experimental setups [Presence: $F(1) = 1.108$; $p = 0.3$; Involvement: $F(1) = 0.147$; $p = 0.7$; Sensory fidelity: $F(1) = 0.534$; $p = 0.47$; Adaptation/immersion: $F(1) = 1.445$; $p = 0.23$; Interface quality: $F(1) = 0.494$; $p = 0.49$].

Discussion

This study tested ten new affective VEs categorised according to five emotional entities (i.e., happiness, sadness, fear, anger, disgust), plus a previously validated environment for neutrality³³. The testing was carried out using two experimental setups, differentiated based on the technology used to reproduce the virtual environments. We then individually analysed the data collected in the two experimental setups and compared them to explore the reliability of virtual environments in arousing the same emotional response using different technologies.

To check possible biases in our participant sample, we used a validated scale (i.e. BEES) to assess the empathy capacity. Results showed a marginal effect of these measure on participants' Sadness and Anger rates only in the Sad, Angry and Scary conditions.

Overall, the results confirm the effectiveness of our affective VEs in eliciting specific emotions, with a clear distinction between the scenarios related to Happiness, Anger, Fear, Sadness, and Disgust. The scenarios were rated significantly higher in the corresponding emotional label concerning all the other scales available. The environment used to elicit Neutrality received significantly higher rating in the corresponding label only in Exp. 1, while less defined results were obtained in Exp. 2, where we observed higher Happiness rates. Nevertheless, the Neutral environment was constituted by design elements shared with our Happy scenarios and this may explain the overlap obtained in our results.

Furthermore, the comparison between the two experimental setups confirms the high reliability and versatility of our environments in eliciting specific emotions even using different technological means to reproduce them. In fact, the results obtained in the two experiments are highly similar and present only a few exceptions, especially when considering the Neutral condition. For all the other emotional entities considered, the comparison showed the same trend shared between the two experimental setups and no statistically significant differences for the highest rated emotion in each condition, except for the Neutral scenario.

Regarding presence measures, we collected these data with two main objectives: (1) to compare if two different experimental setups with different levels of immersion provided different levels of presence; (2) to explore differences linked to the emotional component elicited in each environment. We did not find significant differences between the two setups, but results from Exp. 1 showed that our different conditions affected all the four factors constituting the Presence Questionnaire adapted for this study. The less involving scenarios were those meant to elicit Anger. Since the underlying mechanism followed in those scenarios was to frustrate users by continuously making them fail and restart, this is an expected and justified result. The most involving environments were those linked to Fear, opposed to the least involving scenario represented by the Neutral one, which also showed the lower level of Sensory Fidelity. However, this was an expected result since the constitutive items in this factor were mainly related to auditory features, which in this condition were voluntarily absent.

Conclusions

Our initial validation promotes the possible application of the developed VEs in studies on emotions that involve the use of interactive and dynamic scenarios. Moreover, our results suggest the possibility to adapt hardware technologies and setup depending on the context and experiment requirements, without the risk of compromising the scenarios' effectiveness. Therefore, these environments can be considered an initial step in developing a VR affective database capable of covering five distinct emotional entities. Future developments will require, to increase the level of immersion by using fully immersive technology such as HMD or CAVE, and to introduce a more detailed analysis of the emotional experience, for example, through the collection of physiological data and the analysis of facial expressions.

Received: 30 June 2021; Accepted: 1 December 2021

Published online: 16 December 2021

References

- Izard, C. E. The many meanings/aspects of emotion: Definitions, functions, activation, and regulation. *Emotion Rev.* **2**, 363–370 (2010).
- Slater, M. & Usoh, M. Presence in immersive virtual environments. In *Proceedings of IEEE virtual reality annual international symposium*, 90–96. (IEEE, 1993).
- Witmer, B. G. & Singer, M. J. Measuring presence in virtual environments: A presence questionnaire. *Presence Teleoper. Virtual Environ.* **7**, 225–240 (1998).
- Ijsselstein, W. A., de Ridder, H., Freeman, J. & Avons, S. E. Presence: Concept, determinants, and measurement. In *Human Vision and Electronic Imaging V* (eds. Rogowitz, B. E. & Pappas, T. N.), vol. 3959, 520–529 (2000).
- Kilteni, K., Groten, R. & Slater, M. *The Sense of Embodiment in Virtual Reality* (2012). <https://ieeexplore.ieee.org/document/8316900/>.
- David, N., Newen, A. & Vogeley, K. The “sense of agency” and its underlying cognitive and neural mechanisms. *Conscious. Cogn.* **17**, 523–534 (2008).
- Chirico, A. & Gaggioli, A. When virtual feels real: Comparing emotional responses and presence in virtual and natural environments. *Cyberpsychol. Behav. Soc. Netw.* **22**, 220–226 (2019).
- Riva, G. *et al.* Affective interactions using virtual reality: The link between presence and emotions. *CyberPsychol. Behav.* **10**, 45–56 (2007).
- Diemer, J., Alpers, G. W., Peperkorn, H. M., Shiban, Y. & Mühlberger, A. The impact of perception and presence on emotional reactions: A review of research in virtual reality. *Front. Psychol.* **6**, 1–9 (2015).
- Annerstedt, M. *et al.* Inducing physiological stress recovery with sounds of nature in a virtual reality forest—results from a pilot study. *Physiol. Behav.* **118**, 240–250 (2013).
- Scurati, G. W., Bertoni, M., Graziosi, S. & Ferrise, F. Exploring the use of virtual reality to support environmentally sustainable behavior: A framework to design experiences. *Sustainability* **13**, 943 (2021).
- Schutte, N. S. & Stilinović, E. J. Facilitating empathy through virtual reality. *Motiv. Emot.* **41**, 708–712 (2017).
- Lavoie, R., Main, K., King, C. & King, D. Virtual experience, real consequences: The potential negative emotional consequences of virtual reality gameplay. *Virtual Real.* **25**, 69–81 (2021).
- Dahlgaard, J. J., Schütte, S., Ayas, E. & Dahlgaard-Park, S. M. Kansei/affective engineering design. *TQM J.* (2008).
- Lokman, A. M., Noor, N. L. M. & Nagamachi, M. Expertkanseiweb: A tool to design kansei website. In *International conference on enterprise information systems*, 894–905 (Springer, 2009).
- Bradley, M. M. & Lang, P. J. The International Affective Picture System (IAPS) in the study of emotion and attention. In *Handbook of Emotion Elicitation and Assessment* (eds Coan, J. A. & Allen, J. J. B.) 29–46 (Oxford University Press, 2007).
- Dan-Glauser, E. S. & Scherer, K. R. The Geneva affective picture database (GAPED): A new 730-picture database focusing on valence and normative significance. *Behav. Res. Methods* **43**, 468–477 (2011).

18. Wessa, M. *et al.* Emopics: Subjektive und psychophysiologische evaluation neuen bildmaterials für die klinisch-bio-psychologische forschung. *Z. Klin. Psychol. Psychother.* **39**, 77 (2010).
19. Marchewka, A., Żurawski, Ł., Jednoróg, K. & Grabowska, A. The nencki affective picture system (naps): Introduction to a novel, standardized, wide-range, high-quality, realistic picture database. *Behav. Res. Methods* **46**, 596–610 (2014).
20. Zentner, M., Grandjean, D. & Scherer, K. R. Emotions evoked by the sound of music: Characterization, classification, and measurement. *Emotion* **8**, 494–521 (2008).
21. Bradley, M. M. & Lang, P. J. *International Affective Digitized Sounds (2nd Edition; IADS-2): Affective Ratings of Sound and Instruction Manual* (University of Florida, 2007).
22. Weninger, F., Eyben, F., Schuller, B. W., Mortillaro, M. & Scherer, K. R. On the acoustics of emotion in audio: What speech, music, and sound have in common. *Front. Psychol.* **4**, 292 (2013).
23. Aryani, A., Conrad, M., Schmidtke, D. & Jacobs, A. Why 'piss' is ruder than 'pee'? The role of sound in affective meaning making. *PLoS ONE* **13**, e0198430 (2018).
24. Parsons, C. E., Young, K. S., Craske, M. G., Stein, A. L. & Kringelbach, M. L. Introducing the oxford vocal (oxvoc) sounds database: A validated set of non-acted affective sounds from human infants, adults, and domestic animals. *Front. Psychol.* **5**, 562 (2014).
25. Palmer, S. E., Schloss, K. B., Xu, Z. & Prado-León, L. R. Music-color associations are mediated by emotion. *Proc. Natl. Acad. Sci.* **110**, 8836–8841 (2013).
26. Gross, J. J. & Levenson, R. W. Emotion elicitation using films. *Cognit. Emot.* **9**, 87–108 (1995).
27. Maffei, A. & Angrilli, A. E-MOVIE—Experimental MOVies for induction of emotions in neuroscience: An innovative film database with normative data and sex differences. *PLoS ONE* **14**, 1–22 (2019).
28. Schaefer, A., Nils, E., Sanchez, X. & Philippot, P. Assessing the effectiveness of a large database of emotion-eliciting films: A new tool for emotion researchers. *Cognit. Emot.* **24**, 1153–1172 (2010).
29. Rottenberg, J., Ray, R. D. & Gross, J. J. Emotion elicitation using films. In *Handbook of Emotion Elicitation and Assessment*, chap. 1 (eds. Coan, J. A. & Allen, J. B.) 9–28 (Oxford University Press, 2007).
30. Li, B. J., Bailenson, J. N., Pines, A., Greenleaf, W. J. & Williams, L. M. A public database of immersive VR videos with corresponding ratings of arousal, valence, and correlations between head movements and self report measures. *Front. Psychol.* **8** (2017).
31. Jun, H., Miller, M. R., Herrera, F., Reeves, B. & Bailenson, J. N. Stimulus sampling with 360-videos: Examining head movements, arousal, presence, simulator sickness, and preference on a large sample of participants and videos. *IEEE Trans. Affect. Comput.* **3045**, 1–1 (2020).
32. Ekman, P. & Friesen, W. V. Constants across cultures in the face and emotion. *J. Personal. Soc. Psychol.* **17**, 124–129 (1971).
33. Chirico, A., Ferrise, F., Cordella, L. & Gaggioli, A. Designing awe in virtual reality: An experimental study. *Front. Psychol.* **8**, 1–14 (2018).
34. Meneghini, A. M., Sartori, R. & Cunico, L. Adattamento e validazione su campione italiano della balanced emotional empathy scale di Albert Mehrabian. *Ricerche di psicologia* **29**, 123–152 (2006).
35. Witmer, B. G., Jerome, C. J. & Singer, M. J. The factor structure of the presence questionnaire. *Presence Teleoper. Virtual Environ.* **14**, 298–312 (2005).
36. Cabin, R. J. & Mitchell, R. J. To Bonferroni or not to Bonferroni: When and how are the questions. *Bull. Ecol. Soc. Am.* **81**, 246–248 (2000).

Acknowledgements

The authors thank Alba La Rosa and Gabriele Marsocci for the work done in the development of the tested environments.

Author contributions

All authors conceived the experiments, N.D., G.W.S. and F.F. conducted the experiment 1, while L.U., F.N. and F.M. conducted the experiment 2. N.D. analysed the results. All authors reviewed and approved the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

Correspondence and requests for materials should be addressed to N.D.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2021