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# Measuring the key components of the user experience in immersive virtual reality environments

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Researchers and practitioners frequently employ questionnaires to evaluate the User Experience (UX) mainly due to their cost-effectiveness, systematic nature, and ease of application. However, the use of questionnaires may be constrained by the availability of standardized instruments and the psychometric quality of the questionnaires. This paper presents the index of User Experience in immersive Virtual Reality (iUXVR), a questionnaire designed to measure key aspects of User Experience in immersive Virtual Reality (VR) environments based on the Components of User Experience framework. The questionnaire comprises seven-point Likert-like statements divided into five components: usability, sense of presence, aesthetics, VR sickness, and emotions. The development of the iUXVR was based on a content analysis of existing questionnaires, followed by an expert review and a pilot study. The iUXVR was applied in an experiment that collected 126 thoroughly answered questionnaires. The PLS-SEM analysis identified items with low factor loadings and low explained variance that have been removed from the questionnaire. The questionnaire presented good indicator loadings and adequate reliability estimates even though the items from aesthetics and emotions components are substantially correlated. The structural model suggests that VR sickness does not play an important role in the overall UX, even though it affects users' emotions. On the other hand, the aesthetic experience, which is often neglected in UX models for VR environments, is essential in this context due to its strong relationship with emotions and UX. Furthermore, the sense of presence has less influence on the UX than usability, aesthetics, and emotions. Finally, the validity-supporting evidence is sufficient for exploratory research, substantiating consistent key aspects of the User Experience in immersive VR.

### KEYWORDS

user experience, virtual reality, model, immersive environments, structured equation modeling, standardized questionnaire

# 1 Introduction

Virtual Reality (VR) technologies and principles have advanced significantly in the last five decades (Vince, 1995), recently experiencing a renaissance as immersive VR technology has become cheaper and better. Affordable headset-based VR devices have accelerated this revival in both industrial and academic fields, mainly because they provide a high degree of immersion through a wide field of view, high resolution, and advanced tracking technology (Kim et al., 2020). Since VR aims to convince one that they are somewhere else, it encompasses different components of experience, such as the illusion of presence (including both psychological and physiological states) to modify human perception and VR sickness as a collection of symptoms and effects related to physical discomfort (Jerald, 2016). These particular aspects of VR, along with common elements of the experience, are part of a broader concept: the User Experience (UX).

The UX is usually defined as the "user's perceptions and responses that result from the use and/or anticipated use of a system, product or service" (ISO, 2019). However, the concept of UX varies depending on the theoretical background of experts. The definitions collected by Law et al. (2009) include the UX as (1) all aspects of the users' interaction with the company and its services and products, or (2) the consequence of the user's inner state, the system's features, and the interaction context, or (3) the entire set of affects involving aesthetics, meaning, and emotions that arise from the interaction, or even (4) the value derived from the expectation or interaction with something in a particular context. Furthermore, the approaches for measuring may also consider the experience over time (Karapanos et al., 2009) and different granularity levels (Roto, 2007). Even though experts are skeptical about the measurement of the UX (Law et al., 2014), assessing the UX of a product refers to an extensive collection of methods, skills, and tools to evaluate how a person feels and perceives this product before, during, and after interacting with it.

Researchers and practitioners use different methods to properly evaluate the user experience, e.g., physiological measures (Bian et al., 2016), questionnaires, interviews, and observation (Barbosa et al., 2021). While the devices for measuring many physiological signals can be expensive and the interview/observation techniques demand experimenter training, questionnaires are cheap and require almost no special skills. Moreover, the assessment of the psychometric qualities of questionnaires allows gathering theoretical and empirical evidence to reinforce validity (the support for the interpretation of questionnaire scores for proposed uses) and reliability (the consistency of scores across replications of an evaluation procedure) (AERA, 2014). These questionnaires designed for repeated use and containing well-defined interpretation rules are called standardized questionnaires (Sauro and Lewis, 2016).

Standardized questionnaires and scales are widely used to assess the experience in virtual environments (Chang et al., 2020; Grassini and Laumann, 2020; Kim et al., 2020). However, VR researchers often must choose between employing multiple questionnaires targeting particular components (e.g., usability, presence, or VR sickness) or relying on a single general-purpose UX questionnaire. The issues with the first strategy include the potential noise due to the cognitive load required to respond to many questionnaires with distinct structures and the *ad hoc* technique of combining the scores from different instruments to depict the comprehensive UX. On the other hand, the latter approach usually lacks information about crucial VR components since these general questionnaires are designed to assess only the common aspects of interactive software. The few questionnaires crafted for assessing the holistic UX in VR and their weaknesses are detailed in Section 2.

This paper describes the development of the index of User Experience in immersive Virtual Reality (iUXVR), a questionnaire for assessing the key components of User Experience in immersive Virtual Reality environments based on the Components of User Experience (CUE) framework (Mahlke, 2008). It also presents relevant validity-supporting evidence and reliability estimates for the questionnaire, as well as the analysis of the hypothesized model derived from the CUE.

This research was approved by the Research Ethics Board of the Federal University of Rio Grande do Sul (CAAE 53245721.1.0000.5347) and followed all regulations for studies involving people.

# 2 Related work

The early standardized questionnaires for Human-Computer Interaction (HCI) evaluation were developed in the '70s and '80s and focused on user satisfaction and technology acceptance (LaLomia and Sidowski, 1990). Since then, researchers have tried to develop new instruments with a better psychometric quality covering a wide range of interaction aspects in different contexts.

Many review studies on user experience evaluation mapped the main standardized questionnaires for general use (Vermeeren et al., 2010; Maia and Furtado, 2016; Rivero and Conte, 2017; Darin et al., 2019; Diaz-Oreiro et al., 2019; Nur et al., 2021) or standardized questionnaires for VR applications (Kim et al., 2020; Marques et al., 2024).

We call attention to popular standardized questionnaires focused on broader concepts of UX: AttrakDiff (Hassenzahl et al., 2003), HED/UT Scale (der Heijden and Sørensen, 2003), UEQ (Schrepp et al., 2014), and meCUE (Minge et al., 2016). All of them measure UX through multidimensional factors: hedonic and pragmatic dimensions with their sub-factors (UEQ and AttrakDiff), hedonic and utilitarian dimensions (HED/UT), and perceptions, emotions, and consequences with their sub-factors (meCUE). Despite their good psychometric quality, we could not find any evaluation of these questionnaires in Virtual Reality contexts to provide additional validity evidence and reliability estimations. Without such information, it is not possible to guarantee that they preserve their intended structure when used to assess users' experiences in VR environments, or that they cover particular elements of VR experiences (VR sickness, presence, realism, and others), so researchers usually narrow their options to a smaller set of more specialized instruments.

Researchers can also count on domain-specific questionnaires to evaluate VR content. Instruments to assess the player experience are particularly popular when the VR stimulus is indeed a game. For example, the PENS satisfaction questionnaire (Ryan et al., 2006) focuses on gaming as a self-regulating experience to fulfill some needs. Another common option is the GEQIJ of Poels et al. (2007) that focuses on core components that build the psychological state while gaming: competence, immersion, flow, tension, challenge, negative affect, and positive affect. Finally, the PXI (Abeele et al., 2020) is based on the Means-End theory and covers ten components related to the functional and psychosocial consequences of gaming. Since these instruments are grounded on theories for the gaming context, they are not adequate for any VR experience because some components or items would be irrelevant. For instance, the immersive experiences of a VR theater, a visualization tool for VR analytics, and a rehabilitation VR application do not aim for

entertainment and, therefore, would not value the dimensions of challenge, tension, or narrative. Again, although these instruments present good psychometric proprieties, they usually do not cover the VR sickness symptoms and simultaneously include dimensions beyond the core components of immersive VR experiences.

There is no consensus about the components that should be included in the UX assessment for Virtual Reality environments since it depends on the theoretical assumptions about the UX itself. The available UX models for VR have some components in common (presence and flow), but the connections between the elements are entirely different.

The model proposed by Shin et al. (2013) is based on the Expectation-Confirmation Theory and the Technology Acceptance Model to evaluate 3D virtual learning environments. The questionnaire proposed by the authors is based on other standardized questionnaires and includes seven components of UX divided into four groups: experiential factors (immersion and presence), cognitive factors (perceived usefulness, perceived ease of use, and confirmation), affective factor (satisfaction), and facilitating factor (intention of use). While most of these concepts are straightforward, it is worth mentioning that the immersion component covers the notion of flow in this study, and the confirmation component represents the extent to which the user's expectations are met or exceeded during the interaction. Although all components present good psychometric quality and contribute to UX evaluation, we notice that VR sickness is not present. It is understandable because the structural model does not intend to verify the effect of this component, and the VR stimulus in the study is a non-immersive 3D learning system accessed through a 3D TV. The aesthetic experience is not evaluated, either. Furthermore, the perceived usefulness is frequently assessed in a serious context where the application is a means to an end (in this case, the 3D learning environment is a way of studying or a bridge between content and learning) and seems less critical for general VR software.

The model of Cheng et al. (2014) is designed to examine the UX in VR markets using the flow theory and other surrounding UX-related components. The ten components of the questionnaire are divided into four stages: media content variables (interactivity, involvement, and vividness), antecedents of the flow state (skill, challenge, and focused attention), flow state (flow and telepresence), and consequences of flow (positive affect and loyalty). As the more unusual components, we point out the interactivity that is similar to software responsiveness, the involvement that includes items related to pleasure and interest, and the vividness related to the consistency and realism of the sensory experience. Again, we observe that VR sickness is neglected in the questionnaire because it is hypothesized that it is an antecedent of flow even if participants played a VR game in a six-axis simulator during the studies. Usability and aesthetics are also under-represented in the questionnaire. The questionnaire presents good psychometric properties, although the metrics for discriminant validity are unusual (Hair et al., 2021; Russo and Stol, 2021). The response pattern is different for some items, which may confuse respondents: most items use a 7-point Likert-like response range, but some items are based on a semantic differential space (unhappy/happy, melancholic/contented, etc.). Finally, the questionnaire includes two items related to flow that rely on a massive block of text explaining the complex concept of flow. Since the last sentence of the instructions for the flow items is "Flow has been described as an intrinsically enjoyable experience," it could also contribute to the objective evaluation of enjoyment instead of flow.

It is worth noting that the previous studies (Cheng et al., 2014; Shin et al., 2013) do not intend to develop standardized questionnaires for measuring the UX in VR environments, but they effectively did that as part of the process of estimating structural model parameters to test hypotheses.

On the contrary, the main objective of Tcha-Tokey et al. (2016), Tcha-Tokey et al. (2018) is to build a questionnaire to assess the holistic UX, combining previous theories and models. The extensive set of components of the questionnaire comprises presence, immersion, engagement, flow, skill, emotion, technology adoption, judgment, and experience consequence. The usability component was removed from the questionnaire because of reliability estimation issues. It is relevant to notice that some component names are somewhat misleading, such as the experience consequence that involves only VR sickness symptoms and judgment that comprises attractiveness, pragmatic quality, and hedonic quality. Nonetheless, the questionnaire for assessing the User Experience in Immersive Virtual Environment is comprehensive and presents reasonable psychometric properties. Even the removed usability component is compensated by items related to pragmatic qualities from the judgment component. However, there are some urgent considerations that must be taken into account before using this questionnaire: there are different response patterns that may cause confusion (most items use a 10-point Likert-like response range, but some items are based on a semantic differential space), there is considerable overlapping among the items (for example, "Q31. I felt I was experiencing an exciting moment" regarding flow, "Q39. It was so exciting that I could stay in the virtual environment for hours" regarding emotions, and "59B. I found that this virtual environment was: lame ... exciting" regarding judgment), and there are two competing questionnaire versions with distinct items and different psychometric properties (Tcha-Tokey et al. 2016; Tcha-Tokey et al. 2018). More critically, there is no evidence of convergent and discriminant validity in either version of the questionnaire, the significance of each item to UX is unclear (e.g., based on items loading), and the unbalanced number of items in each sub-scale makes it even more challenging to identify proper scoring. Finally, this study stands out for using a head-mounted display (HMD) as an immersive VR device, even though the only stimulus is an educational VR game.

# 3 Questionnaire proposal

The creation of the index of User Experience in immersive Virtual Reality was based on the following steps that are further detailed.

- 1. Identification of key components of VR experiences
- 2. Creation of the item pool and evaluation by experts
- 3. Pilot experiment
- 4. Main experiment



The iUXVR draws on the Components of User Experience framework proposed by Mahlke (2008) and the structure of the meCUE questionnaire (Minge et al., 2016). The structural model of the iUXVR incorporates five components (usability, aesthetics, sense of presence, VR sickness, and emotions), expanding and specializing the original three CUE components (instrumental qualities, noninstrumental qualities, and emotional reactions) (Mahlke, 2008).

Usability frequently emerges as a key focus in VR research, and it is related to how users interact with a product to achieve goals in the context of use (ISO, 2018). Considering the common qualities described by usability experts (ISO, 2018; Nielsen, 1993; Preece et al., 2015), the iUXVR structural model includes items from three usability factors: learnability (the effort for new users to master the product), efficiency (the performance and the amount of resources used in relation to the outcome), and efficacy (the accuracy, the completeness, and the error-free experience while users try to achieve goals).

The Aesthetics component reflects a complex phenomenon that involves aesthetic appreciation and stimulus. The visual aesthetics and stimulation factors in this research are related respectively to the classical aesthetics (the classic notions of aesthetic design) and the expressive aesthetics (the richness that is a reflection of the designers' creativity and originality) described by Lavie and Tractinsky (2004). While visual aesthetics is clearly part of classical aesthetics, the stimulation is considered part of expressive aesthetics based on substantial correlations between expressive aesthetics and similar constructs, such as engagement (Hartmann et al., 2008) and arousal (Porat and Tractinsky, 2012).

Furthermore, the emotions are "the conscious experience of affect, complete with attribution of its cause and identification of its object" (Norman, 2004) that can be mapped into a small set of basic feelings (Izard, 1977; Izard, 2007). Unlike the dimensional perspective involving positive and negative emotions (Minge

et al., 2016), we propose that the basic feelings approach might help VR software developers tune score procedures according to the intended experience. For instance, the emotion of 'fear' is expected in a horror VR game experience and thus positively contributes to the UX.

The Sense of Presence represents the subjective experience of being in one place while physically situated in another (Witmer and Singer, 1998). Considering the theoretical framework proposed by Slater (2009), there are two main factors for the presence component regarding the subjective experience: the illusion of place ("the strong illusion of being in a place in spite of the sure knowledge that you are not there") and the illusion of plausibility ("the overall credibility of the scenario being depicted in comparison with expectations").

Finally, the VR Sickness component defines a collection of unpleasant virtual reality-induced symptoms and effects, including stomach awareness, headache, and dizziness (Cobb et al., 1999). This phenomenon is extensively investigated by the VR scientific community (Chang et al., 2020; Davis et al., 2014; Martirosov and Kopecek, 2017) even if the causes of VR sickness remain debatable.

Based on these components, we proposed a two-level measurement model (Becker et al., 2012) as shown in Figure 1. The lower level components (usability, presence, aesthetics, VR sickness, and emotions) are reflective constructs, i.e., the items of the questionnaire regarding that factor reflect the variation of a psychological latent variable and share the same theme (Coltman et al., 2008). The  $\lambda$  symbol represents the indicator loading of each item in the questionnaire, that is, the intensity of the relationship from the factor to each item. On the other hand, the high-order component (UX) is a formative construct, i.e., the scores of different components form the overall index of the UX and these scores are not correlated (Coltman et al., 2008). The  $\beta$  symbol represents the predictor weight of each component in the questionnaire, that is, the

	9. Eu achei fácil fazer as coisas no mundo virtual.							
	Discordo totalmente (1)	Discordo (2)	Discordo um pouco (3)	Nem concordo, nem discordo (4)	Concordo um pouco (5)	Concordo (6)	Concordo totalmente (7)	
FIGURE 2 Example o	of an item from th	ne iUXVR.						

regression weight from the component to the high-order component UX. Finally, the  $\zeta$  symbol represents the residual or that part of the UX that is not explained by the five components and belongs to unmeasured elements.

### 3.1 Building the questionnaire

One researcher conducted a content analysis (Moraes, 1999) by reviewing 47 questionnaires and scales related to User Experience, usability, presence, aesthetics, emotions, VR sickness, and other relevant components.

The questionnaires considered for the analysis were collected from review studies on usability (Sauro, 2015; Assila et al., 2016), presence (Grassini and Laumann, 2020; Souza et al., 2022), VR sickness (Martirosov and Kopecek, 2017; Chang et al., 2020), aesthetics (Lima and Wangenheim, 2022), and the overall UX (referenced in Section 2). The instruments with the highest number of citations on Google Scholar and Scopus were selected for this step. Moreover, this analysis did not include questionnaires and scales developed for domain-specific applications, e.g., instruments for assessing game experience.

Additionally, the content analysis included instruments identified in a mapping study on questionnaires and scales used to assess the UX in immersive VR environments. Notably, the instruments proposed by Shin et al. (2013), Cheng et al. (2014), and Tcha-Tokey et al. (2016) were included. In this case, no exclusion criteria based on citation count were applied. The analysis broke down the instruments into 693 information units. While most of these units correspond to a single item from the questionnaires, some were split into two or more units. This was particularly true for items derived from questionnaires based on the semantic differential theory (each pole of the semantic space represents one distinct unit). Furthermore, these units were also grouped into 155 categories. The theme of each category emerged according to its content, leading to the creation of an initial set of 148 items divided into questionnaire factors. Each item comprises a statement in Brazilian Portuguese and a 7-point Likert-like response range that is fully labeled and numbered (Figure 2).

### 3.2 Experts evaluation

Four experts and experienced researchers in User Experience and Virtual Reality evaluated the 148 items from the previous step. Each item was scored by two experts regarding its relevance to the UX assessment and text quality (ambiguity, vagueness, unnecessary text complexity, and use of regionalisms are some of the elements considered by the experts). The experts also recommended changing the factor of some items, new wording, and new items.

Notably, the fine-tuning of wording and structure reduces the use of technical terminology and allow people with different educational background. Also, the evaluation of item relevance and quality increases the representativeness of the chosen items.

## 3.3 Pilot study

The initial version of the iUXVR was applied in a pilot study using the same setup as the main experimental sessions described in Section 3.4. Seven participants answered the out-VR questionnaire after using VR applications and were debriefed on the instructions and items. We used printed versions of the questionnaire with different designs during the pilot study to identify the more adequate structure.

Participants were recruited through convenience sampling, including individual invitations to research group members and acquaintances. This strategy guarantees more control over the diversity of participant experiences (age, educational background, and experience with immersive VR) and does not undermine the research's validity in a pilot study phase.

The participants varied in age (from 23 to 57 years old), education (from complete high school to a PhD. degree), and experience with immersive VR (from no experience at all to frequent use).

Besides the Consent Form, a Screening Form was presented at the beginning of each experimental session, aiming to keep sensitive people from participating, according to the equipment manual. This was the only exclusion criteria for participants. The same procedures were used in the main experiment.

In addition to observing participants as they responded to the iUXVR, each pilot experimental session was followed by an unstructured interview focusing on the structure and wording of the items, as well as the overall layout of the questionnaire.

The observations were documented through the researcher's notes, which provided insights mainly regarding the layout used in the first version of the iUXVR. The initial grid structure of the questionnaire led to frequent mistakes, as respondents often marked their answers on the wrong row. To mitigate this problem, a more expanded layout with clearly separated items and response ranges was created despite the increased number of pages required for the printed questionnaire.

The analysis of the interviews improved the clarity and comprehensibility of the items for participants with different backgrounds. For example, the improved version of the iUXVR used bold text for the words no and not, and replaced the words stylish and upset with elegant and frustrated to be more easily understood in Portuguese. Also, one item was rewritten entirely based on participants' feedback: "I feel like I've just returned from a trip after my experience in the virtual world ended" was replaced with "I feel like the virtual world is a place where I have actually been."

### 3.4 Main experiment

Sixty-three people (41 self-identified as male, 21 as female, and one did not disclose their gender), aged between 18 and 56 (M = 21.53, SD = 5.64, Mdn = 20), agreed to participate in the study after being recruited through social networks, e-mail lists, flyers posted on bulletin boards, and word-of-mouth invitations. Concerning the participants' formal education, most participants are pursuing an undergraduate degree (n = 41, or 65%), have a high school diploma (n = 15, or 23%), or hold an undergraduate degree (n = 5, or 8%).

All participants engage with digital technologies (smartphones, computers, smart TVs, and others) daily and are also familiar with the term 'Virtual Reality'. Fifty-three participants (84%) are aware of immersive Virtual Reality technologies. Twenty-six participants (41%) have experience with immersive VR devices (e.g., a VR headset or an amusement park's VR simulator): nineteen reported using immersive VR only once, three people reported using immersive VR sometimes in a year, two reported monthly use of immersive VR, and two reported using immersive VR weekly.

The experiments occurred in the Federal University of Rio Grande do Sul and Federal University of Pampa facilities in airconditioned rooms with an available space of (minimum)  $10 \times 10$  ft. Participants used a Meta Quest 2 HMD with a washable silicone cover and no earphones (the speakers of the HMD are good enough in a quiet room). In order to keep some haptic feedback, the participants used the Quest 2 VR Controllers for interaction instead of the built-in hand tracking.

Participants used three VR applications: Oculus First Contact<sup>1</sup>, Painting VR<sup>2</sup>, and Beat Saber<sup>3</sup>. These applications are fully compatible with Meta VR Controllers and rated 'comfortable' on the Shop Meta Quest, reducing the intense VR sickness risk. Oculus First Contact is a tutorial for participants to familiarize themselves with VR hardware and interaction styles, so we did not collect any UX measures after its usage. Painting VR is a virtual studio where participants are instructed to paint a landscape or character on the canvas, representing the goal-mode (Hassenzahl, 2003) because users have a specific long-term goal within a peaceful environment. Finally, Beat Saber is a rhythm game that focuses on the action-mode (Hassenzahl, 2003), as it is a fast-paced, reactive game that demands intensive interaction with much smaller goals (hitting the boxes in time with the rhythm).

Additionally, we selected applications with relatively intuitive or straightforward control schemes that could be learned within a short use session. Since complex patterns of interaction or many menu layers are hard to master, some questionnaire items related to the easiness of learning, efficiency, and efficacy could be unrepresentative in a short scenario. Moreover, the language profile of participants demanded VR applications with instructions and content in Portuguese.

Participants engaged with each VR application for about 15 min before completing the questionnaires. Besides the Portuguese version of the iUXVR questionnaire, three additional instruments translated into Portuguese were used for data collection: the System Usability Scale (SUS) (Brooke, 1986; Martins et al., 2015), the Presence Questionnaire (PQ) (Silva et al., 2016; Witmer et al., 2005), and the Simulation Sickness Questionnaire (SSQ) (de Carvalho et al., 2011; Kennedy et al., 1993). It is worth mentioning that only the iUXVR and one other random questionnaire were answered following the experience with each application to minimize participants' fatigue from extended experimental sessions. The VR software and questionnaire sequence were randomized as presented in Figure 3 using a Latin square design approach Zaiontz (2018).

Notably, we collected data from 126 iUXVR questionnaires since each participant completed it twice. Even though some outliers had been detected, the observations were retained as they may reflect valid variations in user experience and contribute to the ecological validity of the study. In addition to preserving representative data, removing observations in a modestly sized sample could compromise the overall stability of the estimators (e.g., item loadings, path coefficients, etc.).

## 4 Evaluation of psychometric properties

In this research, we focus on three sources of information regarding validity (AERA, 2014): evidence based on test content (the analysis of relationships between the component we intended to measure and the content of the questionnaire, including the theme, wording, and structure), evidence based on the internal structure (the degree of relationship among test items, components, and scores), and evidence based on the relation with other variables (the comparisons with external variables like other instruments that measure the same component).

## 4.1 Evidence based on the test content

The careful analysis of the content (Section 3.1), the evaluation process with experts (Section 3.2), and the feedback from the pilot study (Section 3.3) expand the body of evidence regarding the test content (AERA, 2014).

Regarding the analysis of the experts, they recommended adding 22 new items to the initial collection. From the resulting 170 items, 48 were selected for the initial version of the questionnaire based on their relevance and quality: items marked as superfluous or poor quality by one or more expert were removed.

<sup>1</sup> https://www.oculus.com/experiences/quest/2188021891257542

<sup>2</sup> https://www.oculus.com/experiences/quest/3106117596158066

<sup>3</sup> https://www.oculus.com/experiences/quest/2448060205267927



Except for items about VR sickness, those sharing a common factor are deliberately placed non-consecutively to mitigate bias (Podsakoff et al., 2003). The VR sickness items are clustered at the beginning of the questionnaire due to the transient nature of the symptoms (Stanney and Kennedy, 1998). The exact number of items for each component is: usability (16 items), aesthetics (10 items), presence (10 items), VR sickness (6 items), and emotions (6 items). The English version of the questionnaire is presented in Table 1.

## 4.2 Evidence based on the internal structure

Evidence related to the internal structure of the questionnaire comprises reliability coefficients and analyses based on Partial Least Square Structural Equation Modeling (PLS-SEM) since the last is a reliable approach for reduced sample sizes compared to Exploratory Factor Analysis (EFA) and Confirmatory Factor Analysis (CFA) (Hair et al., 2021).

Even though the overall complexity of a structural model has little influence on the minimum sample size requirements for PLS-SEM (Hair et al., 2021), we calculated the minimum sample size for our model using the G\*Power software (v. 3.1.9.7) instead of relying on conventional rules of thumb (e.g.,  $N \ge 100$ ,  $N \ge 200$  or  $N \ge 5 \times indicators$ ). Considering a medium effect size ( $f^2 = .15$ ), the nine predictors of the original model (5 components plus 4 mediation paths), and standard error probabilities ( $\alpha = .05$ ,  $\beta = .80$ ), a minimum sample size of 114 participants is required. Since each participant completed two iUXVR questionnaires, the current sample of 63 participants (126 collected questionnaires) is sufficient. Moreover, it is worth mentioning that PLS-SEM does not require normally distributed data, so normality tests are not reported. Next, we estimated the model shown in Figure 1 using a repeated indicator approach (Becker et al., 2012) and included an additional single item indicator to measure the overall experience: Rate your experience in the virtual world from 0 (zero) to 10 (ten), where 0 is a terrible experience and 10 is an amazing experience. All the estimations were done using the R programming language (version 4.3.3) and the SEMinR package (version 2.3.3). Moreover, confidence intervals were calculated through bootstrap with 1,000 sub-samples.

The analysis of the factor loadings provides significant insights into the structure of the questionnaire. Although the recommended loading for an indicator is above 0.708 (explaining 50% of the indicator's variance), loading values of 0.40 are still acceptable in exploratory research (Hair et al., 2021). After estimating the model using PLS-SEM, we removed all items with low indicator loadings ( $\lambda < .40$ ), items with low contribution to explain variance, and items which the removal would increase reliability estimates substantially (Hair et al., 2021). This procedure cut the number of items from 48 to 25. Table 2 summarizes the factor loading of each remaining item with bootstrap t-statistics and confidence intervals.

The reliability coefficients Cronbach's alpha and Dijkstra and Henseler's rho are used to estimate the internal consistency of factors (Russo and Stol, 2021), representing the extent to which indicators of a single construct are associated. While the coefficient alpha is a tau-equivalent estimator derived from the intercorrelation of the items, the coefficient rho is a congeneric reliability measure that is more precise when the assumptions for alpha are not met (Hair et al., 2021). Both estimators range from 0 (no association between the items at all) to 1 (perfect items homogeneity and no measurement error). Even though threshold values for reliability coefficients are not a consensus, values between 0.60 and 0.95 are acceptable in exploratory research (Hair et al., TABLE 1 Items from the initial version of the index of User Experience in immersive Virtual Reality (items marked with \* have their scores reversed, as they contribute negatively to the experience, and items removed due to low factor loadings or minimal contribution to reliability estimates are also indicated).

1. I Feel nauseous.*	
2. I feel dizzy.*	
3. I feel general discomfort.*	
4. My eyes feel tired.*	
5. I'm sweating a lot.* [removed]	
6. I have a headache.*	
7. I understood how to do things in the virtual world. [removed]	
8. I forgot that the world was just a virtual world	
9. I found it easy to do things in the virtual world	
10. I think the virtual world looked elegant	
11. I did things in the virtual world with confidence	
12. I think the virtual world was boring.* [removed]	
13. I feel like the virtual world is a place where I have actually been. [removed	]
14. I felt good in the virtual world	
15. I found it hard to learn how to do things in the virtual world.* [removed]	
16. I think the virtual world was showing things in a way that they could happ [removed]	en.
17. I was able to do the things I wanted in just a few steps	
18. I think the virtual world was messy.* [removed]	
19. I had control over the things I did in the virtual world	
20. I think the virtual world was fascinating	
21. I completely forgot that I was using Virtual Reality equipment	
22. I felt content in the virtual world	
23. I think I quickly learned how to do things in the virtual world	
24. I thought that things in the virtual world were really happening	
25. I think doing things in the virtual world requires much mental effort.* [remove	ed]
26. I think the virtual world was beautiful	
27. I think the virtual world did not help me when I made mistakes.* [remove	d]
28. I think the virtual world was fun	
29. I completely forgot about the real world while I was in the virtual world	
30. I felt angry while using the virtual world.*	
31. I found it confusing doing things in the virtual world.* [removed]	
32. I felt like the virtual world could be real	
33. I think doing things in the virtual world requires much physical effort.* [removed]	
34. I think the virtual world was attractive. [removed]	
35. I think the virtual world helped me to make no mistakes. [removed]	
36. I think the virtual world was exciting	
37. I felt that the virtual world completely surrounded me. [removed]	
(Continued in next colu	mn

(Continued in next column)

TABLE 1 (*Continued*) Items from the initial version of the index of User Experience in immersive Virtual Reality (items marked with \* have their scores reversed, as they contribute negatively to the experience, and items removed due to low factor loadings or minimal contribution to reliability estimates are also indicated).

38. I felt tense while using the virtual world.* [removed]
39. I would need someone's help to do things in the virtual world.* [removed]
40. I was able to interact with things in the virtual world as if they were real. [removed]
41. I thought things in the virtual world were very slow.* [removed]
42. I think the virtual world was disgusting.* [removed]
43. I could not do some things I wanted to do in the virtual world.* [removed]
44. I think that the virtual world sparks my imagination. [removed]
45. I felt like I was interacting directly with the virtual world. [removed]
46. I felt frustrated while using the virtual world.*
47. I did things in the virtual world the way I thought. [removed]
48. I felt happy in the virtual world

2021) since lower coefficients represent a lack of association among items or significant measurement error, and higher coefficients indicate excessive redundancy or undesirable response patterns.

Additionally, the Average Extracted Variance (AVE) is another metric that focuses on the indicators' loadings to evaluate the strength of the relation among items of a single construct and to which extent they are interchangeable (Russo and Stol, 2021). The threshold of AVE  $\geq$  0.5 is pretty common because it suggests that the factor explains 50% or more of the indicators' variance (Hair et al., 2021).

Table 3 shows the reliability coefficients and the AVE for the UX factors after dropping items that contributed less to the questionnaire stability (indicator loading <.708 with an increase in reliability estimates after deletion). These reliability estimates accumulate evidence of the convergent validity category for reflective constructs (Cheng et al., 2014).

Concerning the evidence related to discriminant validity, the Heterotrait-Monotrait ratio of correlations (HTMT) is frequently used to assess whether different constructs are measuring different concepts (Russo and Stol, 2021). The HTMT represents "the mean value of the indicator correlations across constructs [...] relative to the (geometric) mean of the average correlations for the indicators measuring the same construct" (Hair et al., 2021). The conservative threshold to HTMT is a value below 0.9 as acceptable for similar factors (Hair et al., 2021). Table 4 present the HTMT values for this research sample.

# 4.3 Evidence based on relations to other variables

Evidence concerning the relations with other variables comes from the Pearson product-moment correlation coefficient (r) with the other three questionnaires (SUS, SSQ, and PQ). Since each additional questionnaire was not completed in all experimental sessions, the number of observations for correlations varies: SUS (n = 43), SSQ (n = 41), and PQ (n = 42). Some typical standards are

TABLE 2 Indicator lo	oadings of the	five-factor	solution	(25	items).
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ltem statements	Factor	λ	T Stat.	2.5% CI	97.5% Cl
Q1	VR sickness	0.899	3.532	-0.111	0.943
Q2	VR sickness	0.783	2.590	-0.590	0.930
Q3	VR sickness	0.903	3.126	-0.357	0.959
Q4	VR sickness	0.459	1.575	-0.697	0.705
Q6	VR sickness	0.668	2.721	-0.084	0.892
Q8	Presence (Plausibility)	0.855	11.012	0.751	0.910
Q9	Usability (Efficiency)	0.819	16.599	0.714	0.901
Q10	Aesthetics (Visual)	0.793	8.496	0.530	0.902
Q11	Usability (Efficacy)	0.797	10.292	0.590	0.886
Q14	Emotions	0.715	4.398	0.304	0.911
Q17	Usability (Efficiency)	0.841	21.758	0.749	0.901
Q19	Usability (Efficacy)	0.823	14.374	0.667	0.894
Q20	Aesthetics (Stimulation)	0.911	13.096	0.686	0.954
Q21	Presence (Place)	0.880	12.543	0.813	0.918
Q22	Emotions	0.884	21.797	0.772	0.932
Q23	Usability (Learnability)	0.738	7.569	0.505	0.879
Q24	Presence (Plausibility)	0.859	13.798	0.798	0.910
Q26	Aesthetics (Visual)	0.782	11.919	0.632	0.884
Q28	Aesthetics (Stimulation)	0.932	19.622	0.777	0.965
Q29	Presence (Place)	0.771	9.447	0.644	0.849
Q30	Emotions	0.814	8.759	0.570	0.914
Q32	Presence (Plausibility)	0.871	14.031	0.815	0.915
Q36	Aesthetics (Stimulation)	0.917	15.692	0.735	0.961
Q46	Emotions	0.733	7.463	0.475	0.853
Q48	Emotions	0.834	9.980	0.618	0.924

used to describe the strength of the correlation (Reynolds et al., 2021): weak (r < 0.30), moderate ( $0.30 \le r \le 0.70$ ), and strong (r > 0.70). All correlation were calculated using the R programming language (version 4.3.3).

The correlation between the usability component (learnability, efficiency, and efficacy) and the SUS scores are considered strong in our sample (r = 0.816, p-value <0.001).

TABLE 3 Reliability estimates for the five-factor solution (25 items).

Factor	Alpha	rho <sub>C</sub>	AVE	
Usability	0.865	0.901	0.647	
Aesthetics	0.918	0.939	0.756	
Emotions	0.856	0.897	0.638	
Sense of presence	0.902	0.927	0.719	
VR sickness	0.826	0.867	0.579	

Similarly, the correlation between the VR sickness component and the SSQ scores is close to the threshold for being considered strong (r = 0.684, p-value <0.001).

It was not possible to find a significant correlation between the presence component (illusion of place and illusion of plausibility) and the PQ scores (r = 0.114, p-value = 0.474). The probable causes are presented in Section 6.

## 5 Evaluation of the structural model

After reducing the number of items to 25, the hypothesized structural model was assessed regarding collinearity issues, relevance and significance of the path coefficients, and model explanation power.

The original structural model starts with components related to usability (learnability, efficiency, and efficacy), aesthetics (visual aesthetics and stimulation), sense of presence (illusion of place and illusion of plausibility), and VR sickness. Emotions partially mediate these components to build the User Experience high-order component. It is worth mentioning that it extends the general structure of the CUE framework (Mahlke, 2008) by adding two aspects crucial to immersive VR experiences: presence and VR sickness. Again, we used the R programming language (version 4.3.3) and the SEMinR package (version 2.3.3) to estimate all the elements in our model. Furthermore, the confidence intervals were calculated through bootstrap with 1,000 sub-samples.

Collinearity happens when two or more factors are highly correlated. Since the estimation of the path coefficients in PLS-SEM structural models is based on regressions of factors on their corresponding predictors (Hair et al., 2021), the path coefficients might be biased if high levels of collinearity are involved in the estimation. It is possible to consider that variance inflation factors (VIF) higher than 5 lead to substancial collinearity (Hair et al., 2021).

Considering the antecedents of the component emotions in the structural model, all VIF values are below the critical value (usability = 1.583, sense of presence = 1.097, aesthetics = 1.637, VR sickness = 1.020). Furthermore, the antecedent of the UX component presented VIF values below the threshold (usability = 1.279, sense of presence = 1.133, aesthetics = 4.901, VR sickness = 1.279) but one (emotions = 5.544).

The relevance of a path coefficient usually ranges from -1 (strong negative relationships) to +1 (strong positive relationships), and it represents the influence of one factor on another (Hair et al., 2021). For example, a path coefficient of 0.5 indicates that when the predictor factor (the arrow's origin) increases by one standard deviation unit, the influenced factor (the arrow's destination) will increase by 0.5 standard deviation units. There are no rules of thumb for relevance measures since they depend on the research context. Also, the significance of a

Item statements	Usability	Aesthetics	Emotions	Presence	VR sickness
Usability	_	_	_	_	—
Aesthetics	0.653	_	_	_	—
Emotions	0.690	0.965	_	_	_
Presence	0.207	0.301	0.329	_	—
VR sickness	0.154	0.093	0.301	0.159	—

TABLE 4 HTMT for the five-factor solution (25 items).



path coefficient are estimated by bootstrapping. It indicates that some effect is significantly different from zero and can be assumed to exist in the population (Hair et al., 2021).

Finally, the explanatory power is expressed by the coefficient of determination  $R^2$ , representing the variance explained in predicted constructs. The coefficient ranges from 0 to 1, and typical standards describe its explanatory power (Hair et al., 2021): weak ( $.25 \le R^2 < .5$ ), moderate ( $.5 \le R^2 < .75$ ), and strong ( $R^2 \ge .75$ ). Extremely high coefficients of determination indicate that the model might over-fit the data and should be explained.

Figure 4 presents the hypothesized model's path coefficients and explanatory power.

# 6 Discussion

The first thing to notice is the tendency for smaller factors (learnability, efficiency, efficacy, illusion of place, illusion of plausibility, visual aesthetics, and stimulation) to be collapsed into their major components (usability, presence, and aesthetics). The analysis of HTMT ratios of the smaller factors shows a strong correlation between some of them (Hair et al., 2021; Russo and Stol, 2021): the limit value of 0.9 is surpassed for the pair learnabilityefficiency, efficiency-efficacy, illusion of place-plausibility, and visual aesthetics-stimulation. Also, the solution with nine separate factors presented low-reliability estimates and item loadings, indicating that it was not a stable solution. These effects were expected and suggest that the smaller factors should be assessed together in the context of immersive Virtual Reality. This is the practice for the models of other authors (Cheng et al., 2014; Shin et al., 2013; Tcha-Tokey et al., 2016; Tcha-Tokey et al., 2018).

Furthermore, the aesthetics factor also presented a high HTMT ratio concerning the emotions factor (HTMT = 0.965). This effect was unsurprising because the emotions and the aesthetic experience are deeply intertwined, but the factors were kept separate to preserve the original CUE model structure. The low VIF value between the emotions and the antecedent aesthetics in the structural model (VIF = 1.637) and the significant relationship from aesthetics to emotions ( $\beta$  = .767) support that the aesthetics experience is a good predictor of the user's emotions in our model, i.e., the components are related, but they are not measuring the same thing.

The investigation of the dropped items also provides valuable insights. For example, the item "I'm sweating too much" presented a very low factor loading, likely due to ambiguity regarding its

	Painting VR scores		Beat saber scores		
Component	М	SD	М	SD	
Usability	29.66	5.58	31.24	3.48	
Aesthetics	32.42	5.05	33.52	2.10	
Emotions	31.31	4.30	32.41	2.51	
Presence	21.45	8.96	21.24	8.28	
VR sickness	27.55	4.46	26.91	3.99	
Overall UX score	142.39	19.53	145.32	11.99	

TABLE 5 Descriptive statistics of scores for the VR applications (n = 63).

cause–was sweating induced by the silicone cover of the HMD, physical exertion while playing, or an actual symptom of VR sickness? The two items related to effort ("I think doing things in the virtual world requires much mental effort", and "I think doing things in the virtual world requires much physical effort") also showed very low factor loadings, suggesting that mental and physical effort may not be strongly associated with the overall usability in the context of immersive VR.

On the other hand, the item "Q4. My eyes feel tired" was retained in the questionnaire despite the relatively low factor loading ( $\lambda = .459$ ) due to the importance of oculomotor stress indicators in estimating VR sickness. This type of analysis is critical for developing a theoretically consistent questionnaire, ensuring that numerical criteria do not blindly guide its creation.

All factors presented appropriate indexes concerning the reliability coefficients and the Average Extracted Variance.

The strong correlations to other questionnaires (SUS and SSQ) reveal that the items are similar to established measures in representativeness and precision. Once the comparison of presence component scores of the iUXVR with PQ scores failed to achieve statistical significance, it is not reliable to draw any conclusions. Assuming the items related to the sense of presence in the iUXVR are adequate, the apparent factorial instability identified in different versions (Witmer et al., 2005) and different languages (Silva et al., 2016; Vasconcelos-Raposo et al., 2021) of the Presence Questionnaire probably contributes to the lack of correlation. Another possible reason for the low correlation is that the theoretical assumptions for the sense of presence component are incompatible: the iUXVR considers two factors (illusion of place and illusion of plausibility), and the PQ involves up to six factors (involvement, audio fidelity, haptic/ visual fidelity, adaptation/immersion, consistency, and interface quality) (Witmer et al., 2005).

It is possible to notice some collinearity between emotions and UX (VIF = 5.544), but it is expected since emotions mediate the effects of previous variables. Also, emotions play a critical role on the UX through the "WOW effect" that is frequently experienced by immersive VR first users, which is the majority of our sample. Further investigation shall confirm whether this level of collinearity is critical or not.

The structural model reveals that the aesthetics factor has a major influence on the UX directly ( $\beta = .431$ ) and through emotions

(partially mediated). This is an important finding since the other models do not include emotions (Shin et al., 2013), do not include aesthetics (Cheng et al., 2014), or fail to detect a significant relationship (from judgment to emotion) (Tcha-Tokey et al., 2018). Since the path from aesthetics to UX is stronger than from emotions to UX, ignoring the aesthetic component biases the assessment of the holistic VR experience.

The strong effect of aesthetics on emotions ( $\beta = .767$ ) was expected due to the nature of the visual appraisal and aesthetic experience. Despite the effects of usability and presence on emotions being quite weak, the VR sickness shows the second stronger path to emotions ( $\beta = -.216$ ). Similarly, the authors of the UXIVE model (Tcha-Tokey et al., 2018) report a similar path coefficient from experience consequences to emotion (-.283).

One major difference between the iUXVR and UXIVE models is the magnitude of the path from presence to emotions. Although both models report significant paths between the factors, the UXIVE model (Tcha-Tokey et al., 2018) estimates a much higher effect (0.791) than the iUXVR model ( $\beta$  = .08). Since the Cheng's model just estimates this path moderated by the component of flow (Cheng et al., 2014), the exact strength of this effect demands future investigation.

The relationship between emotions and UX is also significant in our model ( $\beta = .34$ ). This finding is supported by Tcha-Tokey et al. (2016) since the average correlation of the UXIVE emotion items with the UXIVE questionnaire score is moderate (0.412).

The path coefficient from VR sickness to the UX is nonsignificant, so VR-induced symptoms could affect the user's emotions, but they do not directly impact the impressions that build the core UX. On the one hand, the significant indirect effect through emotions suggests that the VR sickness score could be interpreted separately from the other UX dimensions, as it may represent a non-core component. On the other hand, even an indirect effect can still make a meaningful contribution to the overall UX score, particularly when it plays an important role in predicting the mediating construct. Both scoring approaches should be further explored in future research.

Finally, the explanatory power of predictors of emotions (usability, VR sickness, aesthetics, and sense of presence) is strong ( $R^2 = .82$ ). In other words, a large portion of the variance in the emotions factor can be predicted based on the other factors in our sample. It is important to note that the coefficient of determination  $R^2 = 1.0$  in the UX factor is a side effect of the repeated indicators approach to estimate the model (Becker et al., 2012). However, it is possible to observe a moderate explanatory power in predicting the overall rating of UX through the UX score in our sample ( $R^2 = .604$ ). Given that the nonessential components of UX are not measured, despite their existence and representation by the  $\zeta$  term in the measurement model (Figure 1), it is expected that the explanatory power regarding the single-item rating will not be strong. These coefficients exceed the explanatory power reported in similar models (Shin et al., 2013).

The descriptive statistics in Table 5 indicate that the two VR applications performed similarly on all assessed components.



# TABLE 6 Items of the final version of the index of User Experience in immersive Virtual Reality (items marked with \* should have their scores

reversed since they contribute negatively to the experience).

reversed since they contribute negatively to the experience).
1. I Feel nauseous.*
2. I feel dizzy.*
3. I feel general discomfort.*
4. My eyes feel tired.*
5. I have a headache.*
6. I found it easy to do things in the virtual world
7. I think the virtual world looked elegant
8. I forgot that the world was just a virtual world
9. I felt good in the virtual world
10. I did things in the virtual world with confidence
11. I think the virtual world was fascinating
12. I completely forgot that I was using Virtual Reality equipment
13. I felt content in the virtual world
14. I was able to do the things I wanted in just a few steps
15. I think the virtual world was beautiful
16. I thought that things in the virtual world were really happening
17. I felt angry while using the virtual world.*
18. I had control over the things I did in the virtual world
19. I think the virtual world was fun
20. I completely forgot about the real world while I was in the virtual world
21. I felt frustrated while using the virtual world.*
22. I think I quickly learned how to do things in the virtual world
23. I think the virtual world was exciting
24. I felt like the virtual world could be real
25. I felt happy in the virtual world

# 7 Conclusion

In recent times, VR technology has become more affordable and better. This availability, combined with an increasing number of VR applications and a growing interest in User Experience, has led researchers to develop many questionnaires to assess the VR experience in a comprehensive approach.

This paper reports the assessment of the psychometric properties of the index of User Experience in immersive Virtual Reality and the evaluation of its structural model. Evidence regarding the questionnaire content includes a rationale behind the UX components, the development of the items based on the content analysis of existing questionnaires, the evaluation of the items by experts, and the questionnaire tuning process in a pilot study. Evidence concerning the internal structure indicates good reliability coefficients for its factors. Finally, evidence based on the relation with other variables supports the coherence of usability and VR sickness components scores, as they positively correlate to other standardized questionnaires that measure the same constructs.

The PLS-SEM approach was suitable for the number of observations and successfully allowed the measurement model parameters and the structural model paths to be calculated. The model suggests significant implications for assessing the UX in immersive VR, such as the need to include the aesthetic component in standardized questionnaires and the possibility of removing the VR sickness component due to its low contribution in evaluating the UX directly.

Our questionnaire has some significant advantages over previous studies. While the questionnaires proposed by Tcha-Tokey et al. (2016), Tcha-Tokey et al. (2018) have 68 to 84 items, the reduced collection of items in the iUXVR (25 items) speeds up the evaluation process and reduces errors caused by fatigue. Additionally, using the same structure for all items (a fully labeled 7-point Likert-like scale) eliminates any effects caused by mixing different response formats, as seen in other questionnaires (Cheng et al., 2014; Tcha-Tokey et al., 2016; Tcha-Tokey et al., 2018). Items from the VR sickness component were also placed at the beginning of the iUXVR questionnaire to assess passing symptoms as early as possible, while similar items were placed at the end of the UXIVE questionnaire (Tcha-Tokey et al., 2016).

The proposed model of UX in VR (Figure 5) may be extended more efficiently compared to the structures presented in previous studies since it comprises a strict set of components that are meaningful for most immersive VR applications. The iUXVR is composed solely of key UX components that are frequently evaluated by VR researchers and developers, avoiding domainspecific dimensions-e.g., challenge and skill (Cheng et al., 2014) - and overlapping concepts-e.g., engagement and flow (Tcha-Tokey et al., 2016; 2018). Some of these critical components are missing in other questionnaires: VR sickness and aesthetics are not assessed by Cheng et al. (2014) and Shin et al. (2013), and usability is assessed through objective measures by Tcha-Tokey et al. (2016) because the usability factor did not achieve good psychometric quality in the questionnaire. Finally, items related to the aesthetic experience belong to a well-defined component in the iUXVR, whereas items with similar roles are grouped within a broader 'judgment' factor for Tcha-Tokey et al. (2016).

The final version of the questionnaire is presented in Table 6. Regarding the experimental setup, we focused on stimuli from immersive VR equipment, while Shin et al. (2013) used 3D televisions to present lectures recorded with stereoscopic cameras. Considering that HMDs were significantly more expensive at the time of Shin's research, the choice of 3D TVs is understandable. However, the lower level of immersion provided by such equipment (Suh and Prophet, 2018) could affect the model's validity for immersive technology.

Unlike other studies (Cheng et al., 2014; Tcha-Tokey et al., 2016), we used more than one application with different usage modes (Hassenzahl, 2003): action mode (Beat Saber) and goal mode (Painting VR). Moreover, we avoided custom VR software (Tcha-Tokey et al., 2016) and educational applications (Shin et al., 2013; Tcha-Tokey et al., 2016) by opting for commercial software focused solely on leisure.

As expected, there are some threats to the validity of this study. First, the relatively small sample could lead to wider confidence intervals for the parameter estimates, introduce instability in the model's parameters, and increase the bias for overfitting. However, the number of observations exceeded the estimated minimum sample size, mitigating the more severe consequences at present.

In addition, while using a single device (Meta Quest 2) and two software applications (Beat Saber and Painting VR) may limit the generalizability of the results to other platforms or applications, this design choice enhances control over potential external variables. By focusing on a single device and software environment, we ensured consistent conditions across all experiments, thereby reducing variability in how the experiments were conducted. Additionally, the research project was limited by the availability of different VR equipment, and the participants' language further restricted the range of VR software that could be used, as only applications with content in Portuguese were suitable. Exploring new VR software in a long-term research project could help address the practical constraints of this study, particularly those related to participants' language profiles and the availability of different VR devices. Future work also includes the use of the iUXVR for other VR applications (education, training, data visualization, etc.).

The recruitment strategy may also introduce some potential bias, but it included individuals both from within and outside the university community to ensure a diverse range of participants. This approach facilitated efficient data collection with limited resources, allowed compliance with the Brazilian National Ethics Board regarding compensation and rewards, and used multiple recruitment channels to minimize sample homogeneity. The "WOW effect" discussed in Section 6 is a real phenomenon in Brazil regarding emerging technologies. Even though this effect can inflate component scores (leading to artificial correlations among constructs) or jeopardize the temporal stability of the experiment replication, the sample of our study reflects the diversity of global contexts and provides an opportunity for collaboration that produces significant insights. Furthermore, the sample in our study is representative of potential early adopters and consumers of immersive VR in Brazil. Future studies could expand recruitment to enhance the generalizability of the findings.

The evaluation of measurement invariance (Henseler et al., 2016) is also a topic of interest once a questionnaire for assessing UX should provide equally valid and reliable scores for VR software of distinct domains but requires a larger sample size.

# Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material, further inquiries can be directed to the corresponding author.

# Ethics statement

The studies involving humans were approved by Research Ethics Board of the Federal University of Rio Grande do Sul - Brazil (CAAE 53245721.1.0000.5347). The studies were conducted in accordance with the local legislation and institutional requirements. The participants provided their written informed consent to participate in this study.

## Author contributions

JC: Conceptualization, Formal Analysis, Investigation, Methodology, Writing – original draft, Writing – review and editing. DB: Conceptualization, Methodology, Supervision, Writing – review and editing. MP: Conceptualization, Methodology, Supervision, Writing – review and editing.

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# Conflict of interest

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

# Generative AI statement

The author(s) declare that Generative AI was used in the creation of this manuscript. Generative AI was used exclusively for text revision and English revision.

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# Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/frvir.2025.1585614/ full#supplementary-material

**SUPPLEMENTARY DATA SHEET 1** Data from the Simulator Sickness Questionnaire.

**SUPPLEMENTARY DATA SHEET 2** Data from the System Usability Scale.

### SUPPLEMENTARY DATA SHEET 3

Data from the Presence Questionnaire.

### SUPPLEMENTARY DATA SHEET 4

Data from the index of User Experience in immersive Virtual Reality.

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