

The relationship between cybersickness and eye-activity in response to varying speed, scene complexity and stereoscopic VR parameters

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Abstract

Eye trackers are non-invasive devices that can be integrated into VR head-mounted displays and the data they seamlessly provide can be instrumental in mitigating cybersickness. However, the connection of eye-activity to cybersickness has not been studied in a broad sense, where the effects of different VR content factors causing cybersickness are examined together. Addressing this gap, we present an extensive investigation of the relationship between eye-activity and cybersickness in response to three major cybersickness factors – navigation speed, scene complexity and stereoscopic rendering – simulated in varied severity. Our findings reveal multiple links between several eye-activity features and user-reported discomfort reports, the most significant of which are associated with speed levels, highlighting the relationship between feeling of vection and eye-activity. The evaluation also established significant differences in eye-activity response with different stimulus types and time spent in VR, suggesting an accumulation effect. Furthermore, the regression analysis hints that blink frequency can be utilized as a significant predictor of cybersickness, regardless of time spent in VR.

Keywords: virtual reality, cybersickness, eye-activity

1. Introduction

Today, most virtual reality (VR) setups make use of head mounted displays (HMDs) in order to immerse users within the virtual environment

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4 (VE). Thanks to affordable commercial VR kits and easy-to-use game en-
5 gines with VR capabilities, the technology has become more accessible and
6 engaging (Celikcan, 2022). Nevertheless, the medium still has important
7 issues remaining to be resolved. Among these, the most notorious one is cy-
8 bersickness (LaViola Jr, 2000). This affliction is mainly associated with VR
9 applications and presents itself with symptoms similar to motion sickness and
10 simulator sickness. Yet, cybersickness is different as it can arise during VR
11 experience without any real (physical) movement while motion sickness and
12 simulator sickness occur in systems with real-life movement. Cybersickness
13 may present itself in many symptoms including headache, eye strain, nausea
14 and disorientation (Rebenitsch and Owen, 2016). It is theorized that the
15 conflict between the visual and vestibular systems in response to the purely
16 visual motion is a major contributor to the discomfort (Kim et al., 2021).
17 This is supported by the studies that show a connection between environ-
18 ment realism and presence of cybersickness (Liu and Uang, 2011). As these
19 symptoms are detrimental to user experience, they diminish the accessibility
20 of VR applications.

21 Vergence-accommodation conflict (VAC) (Hoffman et al., 2008) is another
22 major contributor to cybersickness in VR experiences where stereoscopic cues
23 are used to create the illusion of three-dimensional environments. The dis-
24 comfort arises due to the conflict between the distances of vergence location,
25 where the eyes converge or align over the object of interest, and accommo-
26 dation location, where the eye lenses adjust to in order to focus vision. This
27 conflict does not usually occur in normal vision as the two distances match,
28 however when stereoscopic vision is emulated by VR displays such as con-
29 temporary HMDs, the vergence distance can change but the accommodation
30 distance stays constant on the display. The conflict causes a feedback loop
31 that leads to discomfort, especially with extended use.

32 The Simulator Sickness Questionnaire (SSQ) (Kennedy et al., 1993) has
33 been widely used as a tool for assessing cybersickness. The questionnaire
34 returns subscores labeled as nausea (SSQ-N), oculomotor (SSQ-O), and dis-
35 orientation (SSQ-D) as well as an overall ailment score (total score, SSQ-T)
36 in response to questions about 16 different symptoms and their severity. The
37 use of SSQ has been criticized for its length, as the time required to admin-
38 ister it may lead to the attenuation of cybersickness symptoms (Ames et al.,
39 2005). Accordingly, some studies (van Emmerik et al., 2011) moved towards
40 including single-question probes to quickly capture immediate discomfort. In
41 this study, we employ SSQ and a single-question discomfort query together

42 to capture both long-term and immediate effects of cybersickness factors.

43 Cybersickness has been studied using biofeedback measures such as elec-
44 troencephalograms (EEG), electrocardiograms (ECG), and skin conductance
45 to examine the relationship between physiological signals and the severity of
46 experienced discomfort (Kim et al., 2005). A thorough understanding of this
47 relationship could allow for the development of systems that can accommo-
48 date the VE for discomfort mitigation without interfering the user for explicit
49 input. Such systems could increase the accessibility of VR applications by
50 facilitating better utilization of VR stimuli.

51 In this study, we investigate the influence of major VR content factors on
52 user-reported cybersickness and their link to five eye-activity features (fixa-
53 tion count, saccade count, blink count, mean fixation duration and change
54 in pupil size). Our study aims to address two primary research questions:

- 55 • How does the selected set of eye-activity features relate to cybersickness
56 experienced with VR-HMDs in response to varying stimuli of navigation
57 speed, scene complexity and stereoscopic rendering parameters?
- 58 • How is this relationship affected by the duration of exposure to VR?

59 To this end, we evaluate the following hypotheses:

- 60 • The change in persistent cybersickness differs with each passing session
61 (H1)
- 62 • Eye-activity features are linked to immediate cybersickness (H2)
- 63 • Eye-activity features are linked to persistent cybersickness (H3)
- 64 • Eye-activity features show different responses to cybersickness in dif-
65 ferent sessions (H4)
- 66 • Eye-activity features show different responses to cybersickness invoked
67 by different factors (H5)
- 68 • Stimuli levels and eye-activity features are predictors of immediate cy-
69 bersickness (H6)

70 These hypotheses were tested with data from our user experiment, where
71 the set of independent variables included VR content parameters associated
72 with the three content factors under consideration - i.e., navigation speed,

73 level of scene complexity and the two stereoscopic rendering parameters
74 (interaxial-distance and zero-parallax distance) - and duration of exposure
75 to VR. The results are reported in Section 4 and discussed in Section 5.

76 Overall, the main contributions of this study are as follows:

- 77 • The effects of three major VR content factors - navigation speed, scene
78 complexity and stereoscopic rendering parameters - on cybersickness
79 are explored conjointly by evaluating responses elicited by the same
80 VE using both eye-activity feedback and subjective discomfort reports.
- 81 • The study presents an innovative experimental design realized with
82 a sample of 33 participants immersed in a VE designed to gradually
83 induce discomfort by simulating the factor types in isolation while their
84 eye-activity features are collected.
- 85 • By conducting the experiment in three repeated sessions, the time spent
86 in VR is also taken into account to assess the accumulation of cyber-
87 sickness.
- 88 • The study employs two self-reported measures of cybersickness: im-
89 mediate levels of discomfort taken via responses to immersive single
90 question probes and persistent levels of discomfort taken via responses
91 to SSQ forms.
- 92 • In light of the collected measures, an extensive analysis of the relation-
93 ship between the eye-activity and cybersickness is provided.

94 2. Related Work

95 Kolasinski’s study (1995), one of the earliest works on cybersickness, iden-
96 tified multiple factors including frame rate and tracking errors as the main
97 causes of cybersickness. Rebenitsch and Owen (2016) compiled a review
98 about the subject, with an extensive overview of the research done in the
99 field. According to their review, a large portion of the research focused on
100 the factors within the VE contributing to the discomfort. In a more re-
101 cent work (2021), they also proposed multiple statistical models that can be
102 used to estimate reports of cybersickness using either demographic informa-
103 tion from the user or hardware/software factors of the application. They
104 reported that demographic factors explained 44.2% of the adjusted variance
105 in a linear model while the hardware/software factors explained 55.3%.

106 In this work, we focus on three content factors of cybersickness: navi-
107 gation speed, scene complexity and stereoscopic rendering. All three have
108 been established as major cybersickness factors that can be controlled by
109 software (Rebenitsch and Owen, 2016; 941, 2021; Lawson et al., 2022). So et
110 al. (2001) reported that navigation speed in a VE had a significant effect on
111 the oculomotor subscore of SSQ and thus related to eye and vision related
112 symptoms. Agic et al. (2020) investigated the effects of movement speed on
113 cybersickness and biometrically measured stress. They did not find a signif-
114 icant difference of symptoms or stress with respect to speed, however they
115 reported some correlations between demographic and measured information,
116 such as gender and physical discomfort while wearing the HMD. On the other
117 hand, Keshavarz et al. (2019) found that both the duration and the intensity
118 of vection (the sense of movement felt by the user purely based on visual
119 stimulus) was connected to the speed of navigation. They also reported that
120 crowdedness of the environment contributed to the intensity of the vection
121 felt. Terenzi and Zaal (2020) investigated reactions to particle fields with
122 different acceleration and optic flow variations. They found that different
123 thresholds of discomfort were associated with different flow fields. Kavakli
124 et al. (2008) compared SSQ scores of two groups of users exposed to two
125 different VEs, one with a realistic city and another rendering only the lines
126 of this city. While they reported higher SSQ results at the end of exposure
127 for the realistic city group, these findings were not statistically significant.
128 Similarly, Pouke et al. (2018) immersed users in two VEs for them to walk
129 in, one being a realistic version and another being a cel-shaded version of the
130 same outdoor museum. However, they did not observe significant differences
131 in reported motion sickness between the realistic and cel-shaded versions.

132 Scenes with roller coasters were used for several studies for their ability
133 to feature high speed scenes with multiple rotations to induce cybersickness.
134 Wibirama et al. (2018) reported that users experienced more severe symp-
135 toms of cybersickness on the higher speed footage of a real roller coaster
136 rather than the slower one without real-world footage. Nalivaiko et al. (2015)
137 also reported their more realistic simulation of a roller coaster caused more
138 nausea in the users.

139 The type of display used such as an HMD or a flat display and the
140 content on it were also shown to have a significant effect on cybersickness.
141 Yildirim (2019a) looked into player enjoyment and feeling of cybersickness
142 with different display types and reported more discomfort when using HMDs.
143 Yildirim (2019b) also evaluated different game genres (racing games and first

144 person shooters) with different display types. Both genres caused signifi-
145 cantly different ratings of discomfort between display types, in line with the
146 previous research. Wibirama et al. (2019) compared user activity (playing or
147 spectating) in games. They also evaluated type of movement in the games
148 (flow-like motion as in racing games or fast, unpredictable movement as in
149 shooter games). They reported higher sense of discomfort in games with
150 unpredictable movement and spectating rather than flow-like movement and
151 actively playing, respectively. Kwok et al. (2018) compared combinations
152 of two different speeds in two types of VR display (HMD and CAVE sys-
153 tems). They reported significant difference in both discomfort and misery
154 scores related to different speeds. The authors also reported a non-significant
155 difference between display types, but only when the speed was low.

156 Eye tracking is a non-invasive means of acquiring rich and timely biomet-
157 ric feedback. It has been used by several works (Chen et al., 2017; Snowden
158 et al., 2016; Tichon et al., 2014) in evaluating virtually created environments
159 and the emotional responses they elicit. Eye tracking has also been used to
160 evaluate cybersickness, though to a lesser extent compared to other biometric
161 measures such as ECG or EEG (Celikcan, 2019; Kim et al., 2008). Nonethe-
162 less, the increasing availability of VR-HMDs with embedded eye trackers
163 and its non-invasive nature make eye tracking a particularly valuable tool for
164 cybersickness research. The eye-activity data provided through easy-to-use
165 software interfaces can offer objective insight into cybersickness in contrast to
166 subjective questionnaires. Cebeci et al. (2019) investigated the effects of VEs
167 with different emotional stimuli on the biometric responses from the viewers
168 as well as cybersickness. They reported that eye-activity features such as
169 number of fixations and saccades correlated with the changes in SSQ scores
170 in addition to emotional changes. Similarly, Bahit et al. (2016) discovered
171 a correlation between the amount of fixations and level of cybersickness in
172 simulation of driving in the morning while being sleep-deprived, with severe
173 symptoms reducing visual attention. Wibirama et al. (2018) used three-
174 dimensional gaze tracking in their aforementioned roller coaster VEs and
175 reported more frequent depth oscillations for participants with higher scores
176 on the SSQ. Lopes et al. (2020) evaluated pupil movement and blink fre-
177 quency as a marker for cybersickness. However, they reported that the blink
178 data did not show any statistically significant difference for the presence of
179 discomfort and the pupil position data was deemed inconclusive.

180 3D delivery of content, usually via stereoscopy, is an important part of VR
181 applications. Hence, researchers also investigated VAC in these applications.

182 Kim and Lee (2011) investigated visual fatigue when users were shown 2D and
183 3D images and the effects on EEG signals. They found significant differences
184 in EEG features, blink rate and eye fatigue between 2D and 3D delivery.
185 Wang et al. (2019) proposed a trained model that can detect eye fatigue by
186 using eye features up to 90% accuracy and reported a significant change in
187 these features between the start and end of the experiment.

188 In contrast to the previous work, this study investigates multiple VR
189 content factors contributing to cybersickness, including navigation speed,
190 scene complexity, and stereoscopic rendering. Scene complexity, in particular,
191 has received relatively little attention in prior research, which has focused
192 more on realism (Kavakli et al., 2008; Pouke et al., 2018) than other aspects
193 of scene complexity such as the number of objects in view, their color and
194 movement patterns. While there have been studies that explored the link
195 between VAC and cybersickness (Szpak et al., 2019; Zheng et al., 2019; Zou
196 et al., 2015), to the best of our knowledge, no other work has examined
197 the effects of different stereoscopic rendering parameters on cybersickness
198 experienced with VR-HMDs. Simulated speed has been studied as a factor
199 of cybersickness to a greater extent (Keshavarz et al., 2019; Nalivaiko et al.,
200 2015; Kwok et al., 2018; Agić et al., 2020). Yet, just a few of these studies
201 have assessed the eye response to speed-induced cybersickness using only
202 a subset of the eye-activity features analyzed in this work. In addition,
203 many studies on cybersickness and the associated physiological responses
204 have made evaluations accounting for the time spent in VR but without
205 considering the effects of other controllable factors (Kim et al., 2005; Bahit
206 et al., 2016). Whereas, in this study, we investigate the relationship between
207 cybersickness and eye-activity based on self-reports of discomfort in response
208 to multiple VR content factors that are simulated by the same VE in varying
209 severities, but in isolation. Furthermore, we present an extensive evaluation
210 of this relationship by also regarding the time spent in VR and utilizing two
211 self-reported measures of cybersickness in order to capture both immediate
212 and persistent levels of discomfort.

213 3. Experiment

214 We have conducted a within-subject user experiment with a VE designed
215 to induce cybersickness symptoms via the simulation of three types of VR
216 content factors in varying degrees. For the sake of clarity, first we make a

217 list of definitions that we use in the experiment design. Then, we discuss the
218 components of the user experiment in the remainder of the section.

219

220 **Scene:** A specific version of the implemented VE that simulates one of the
221 three factors to induce cybersickness in isolation from the other two.

222 **Level:** A stage of a scene during which a participant experiences the spe-
223 cific factor simulated by that scene at a predetermined stimulus intensity.
224 Each scene comprises of a fixed set of levels that the participant experiences
225 consecutively.

226 **Trial:** This refers to the period of data collection during which a participant
227 is exposed to a single level of a given scene. Hence, a participant viewing a
228 single level of a particular scene constitutes a single trial and they experience
229 as many consecutive trials as the number of levels defined for that scene.

230 **Session:** A single cycle of the experiment in which a participant experiences
231 all levels of all three scenes once.

232 3.1. Participants

233 Participants for the study were gathered via a campus-wide announce-
234 ment at Hacettepe University. Participants volunteered by providing their
235 available times using an online form. Prior to the experiment, participants
236 were tested for the conditions that would make them insensitive to the simu-
237 lated cybersickness factors. For this, they were required to take an Ishihara
238 color blindness test, and a stereo blindness test where they were asked to
239 identify a shape with a different depth in a red-cyan random dot stereogram
240 image. They were also asked to provide confirmation that they were not
241 susceptible to light induced epileptic seizures.

242 A total of 35 participants completed the experiment from start to finish.
243 However, two of these participants did not report any discomfort during the
244 study. As the goal of this experiment is to observe cybersickness on the eye-
245 activity data, these two participants were considered outliers and their data
246 were excluded from the study.

247 Thus, 33 remaining participants made up the study sample for the anal-
248 ysis. The sample was aged 18-42 (mean age 23.8 ± 5.56 , 7 females and 26
249 males). On average, the sample belonged to 29.7 ± 22.7 percentile on the
250 motion sickness susceptibility questionnaire (MSSQ), which indicates low
251 susceptibility. The average level of VR experience of the sample was low
252 (0.9 ± 1.1 on a Likert scale from 0 to 4), while they showed moderate video
253 gaming habits (2.1 ± 1.4 on a Likert scale from 0 to 4).

254 3.2. Experimental Procedure and the Virtual Environment

255 The overall procedure of the experiment is out-
 256 lined in Figure 1. During the experiment, partic-
 257 ipants were immersed in the VE for three such
 258 sessions back-to-back. This design allowed for the
 259 evaluation of time spent immersed in VR as a vari-
 260 able and thus to account for accumulation effects.
 261 In this experiment, in addition to eye activity, we
 262 also collected participants’ brain activity feedback
 263 in the form of EEG signals. Due to the scope of the
 264 current study, we refer the reader to Ozkan et al.
 265 (2023) for details on the EEG-related aspects of
 266 the experiment and their analysis in connection to
 267 cybersickness.

268 The VR application, including the VE, was re-
 269 alized in Unity and participants experienced it us-
 270 ing an HTC Vive VR setup.

271 Prior to starting the experiment, participants
 272 were checked for the inclusion criteria and pro-
 273 vided with information on cybersickness and its
 274 symptoms, the experimental setup and necessary
 275 controls. They were also informed of their right
 276 to quit the experiment any time in case they felt
 277 extreme discomfort. They filled a consent form,
 278 an MSSQ-Short form and a demographic informa-
 279 tion form that included VR experience level, video
 280 gaming habits, age, and gender.

281 The HMD helmet was fitted to their head af-
 282 ter their interpupillary distance (IPD) was mea-
 283 sured with a digital pupillometer and the HMD
 284 lenses were adjusted to match their IPD. Next,
 285 participants had a tutorial session, in which they
 286 were acclimated to the VE and learned how to re-
 287 port their intensity of discomfort felt during a level
 288 (henceforth called *immediate discomfort score*) on
 289 a scale from 1 (“none at all”) to 7 (“extremely”)
 290 via a pop-up VR interface (shown in Figure 2)
 291 using the HTC Vive Controller. Participants were



Figure 1: Flowchart of the experimental procedure for a single session. Each participant experienced three such sessions, in which the scenes were ordered in a 3x3 Latin square design. IDS stands for immediate discomfort score.

292 explicitly informed that only a score of 1 indicated
293 absence of discomfort and any discomfort should
294 be reported with a higher score (2 or up) propor-
295 tional to the severity of discomfort they feel. The
296 tutorial was continued until they declared that they were confident in using
297 the system. This was followed by eye-tracker calibration and pupil-size base-
298 line recording (as detailed later in Section 3.3). An initial SSQ response was
299 also taken before proceeding with the experiment.

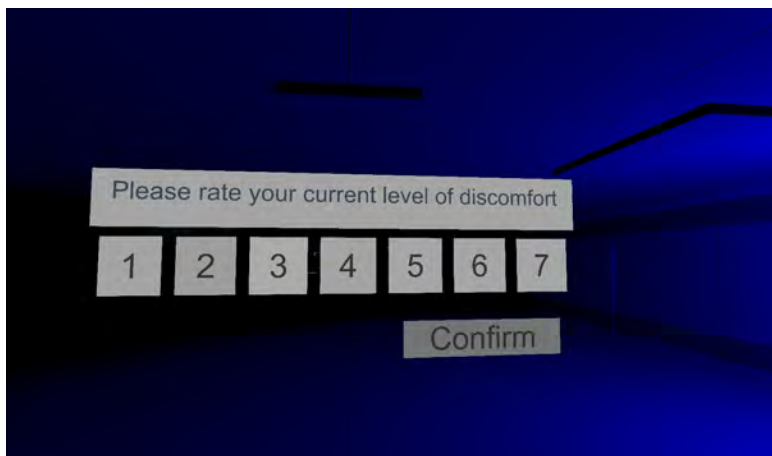


Figure 2: Pop-up VR interface for immediate discomfort score reporting at the end of a level.

300 Afterwards started the actual experiment phase, where each cybersick-
301 ness factor was simulated in a separate scene of the VE with its own set
302 of stimulus levels, as detailed below. A sample frame from each scene can
303 be seen in Figure 1, and additional frames are given in Figures 4 and 6.
304 The supplementary video demonstrates a complete run of the three scenes
305 comprising all simulated levels.

306 The VE was designed in the form of a corridor having a width of 11 Unity
307 Engine units, which are taken as corresponding to meters in physical units. A
308 point light placed at the center of the focus object served as the main source
309 of lighting in the environment, while background objects and/or textures
310 provided inferior auxiliary lighting, as detailed in the following subsections.
311 Over the course of a level, participants were asked to follow a moving focal
312 object, a glowing blue octahedron, which had a width of 0.4 Unity Engine
313 units, as it moved down a dark wide corridor on a winding path for 10 seconds.

314 While moving, the focus object oscillated horizontally, requiring participants
315 to shift their vision between left and right.

316 After each level was presented, participants were prompted to provide
317 their immediate discomfort score. Once the score was obtained, the ap-
318 plication proceeded to showing the next level of stimulus according to the
319 predefined order of that stimulus set when participants indicated they were
320 ready for the next level by pressing the designated hand controller button.

321 When all levels of a stimulus set were exhausted, a black screen was dis-
322 played for a minimum of 30 seconds to allow participants rest their eyes
323 and recollect themselves. The scene for the next stimulus factor was initi-
324 ated when participants pressed the same button as before, expressing their
325 readiness to continue.

326 A session was concluded when all three scenes were completed. After
327 this, participants were asked to remove the helmet and fill out an SSQ. A
328 single session consisted of a total of 270 seconds of eye-activity data collected
329 in approximately 9-10 minutes, which includes baseline recording and breaks
330 in-between the levels where immediate discomfort scores were obtained.

331 After resting for at least three minutes, participants were reminded that
332 they could stop at any time if they felt overwhelming discomfort, otherwise
333 they could continue whenever they felt ready. At their request, they were
334 re-fitted with the HMD and shown the VE for another session.

335 Once participants were exposed to the VE for a total of three sessions,
336 the experiment was finalized. The order of the scenes across the sessions
337 was arranged in a 3x3 Latin square design in order to offset any carry-over
338 influence between different factor types.

339 Details on how each of the three cybersickness factors was simulated in
340 the VE are given below.

341 *3.2.1. Navigation Speed*

342 Ten levels of navigation speed (1.2, 2.4, 4.8, 9.6, 14.4, 19.2, 28.8, 38.4,
343 57.6, and 76.8 meters/sec for the consecutive levels) were used in the exper-
344 iment, as shown in Figure 3. The speed of the focus object was set to match
345 the designated navigation speed for each level. Additionally, for this scene
346 only, red arrows pointing forward were added on the surface textures of the
347 walls and floor to promote the sense ofvection. An emission shader was
348 applied to these arrows, making them unaffected by the scene lighting and
349 visible independently from the focus object, which was the only other light
350 source in the environment.

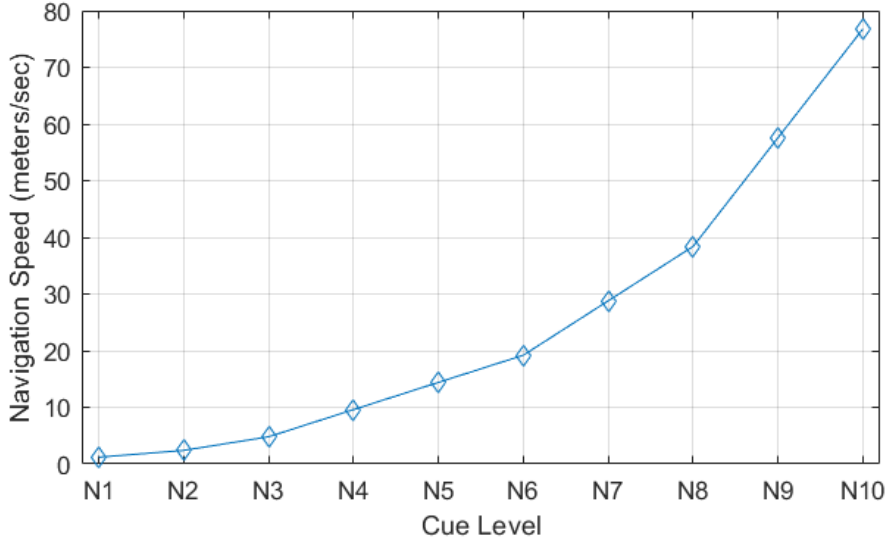


Figure 3: Plot showing the navigation speed values for each stimulus level.

351 *3.2.2. Stereoscopic Rendering Parameters*

352 In our study, two major stereoscopic rendering parameters were consid-
 353 ered: interaxial-distance, which is the distance between the two cameras
 354 rendering the scene, and zero-parallax -distance, which is the distance from
 355 the cameras where the captured points in each view appear at the same
 356 relative screen location, *i.e.*, without disparity. While today’s commercially
 357 available HMDs, including the HTC Vive used in this study, keep these pa-
 358 rameters fixed by default, it is possible to alter them using projection matrix
 359 manipulations (Avan et al., 2022) to create different levels of stereoscopic
 360 depth perception.

361 To evaluate the effects of different stereoscopic rendering settings in vary-
 362 ing degrees of disparity and depth, 10 different pairs of interaxial-distance
 363 and zero-parallax distance (Table 1) were used in this scene. Only one of the
 364 two parameters was changed at a time between consecutive levels. Initially,
 365 the scene was rendered with a moderate interaxial-distance and a relatively
 366 short zero-parallax distance setting. Next, the zero-parallax -distance was
 367 increased first, followed by the interaxial-distance. After interaxial-distance
 368 was increased to its maximum level, the zero-parallax -distance was reduced
 369 again, causing severe visual strain while fusing the left and right views. The
 370 overall adjustment scheme of the two parameters through the 10 levels is il-

Table 1: Table showing the values (in Unity Engine units) used through the levels simulating stereoscopic rendering parameters and the corresponding disparity values observed for the focus object (in number of pixels for frames rendered in a resolution of 1415 by 674 pixels). The separate row at the bottom gives the default values of the stereoscopic rendering parameters, which are used with the scenes simulating navigation speed and scene complexity, and the corresponding disparity.

Stimulus Level	Interaxial Distance	Zero-Parallax Distance	Disparity
Level 1	0.400	4.0	175
Level 2	0.400	6.0	140
Level 3	0.400	8.0	106
Level 4	0.400	10.0	95
Level 5	0.600	10.0	137
Level 6	0.800	10.0	160
Level 7	1.000	10.0	213
Level 8	1.000	8.5	226
Level 9	1.000	7.0	253
Level 10	1.000	5.0	270
Default	0.022	10.0	105

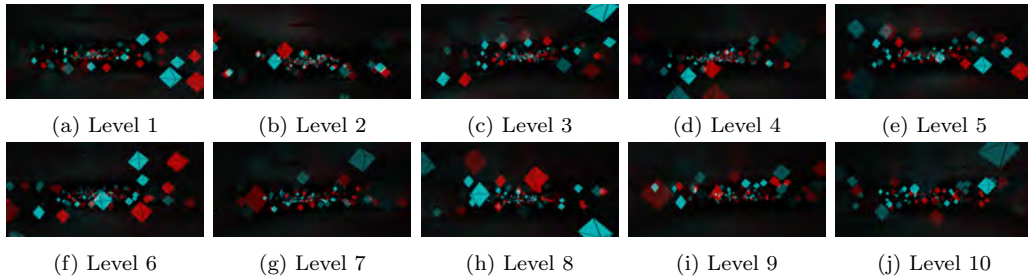


Figure 4: Sample frames demonstrating each pair of stereoscopic rendering parameters per level. The frames were converted first to grayscale and then to a red-cyan scheme for the sake of illustration clarity.

371 illustrated in Figure 5. Additionally, in order to increase the amount of depth
372 cues, the scene was populated with smaller stationary copies of the focus
373 object, randomly colored red, green or blue, in the background. Sample
374 anaglyph frames from the levels are provided in Figure 4.

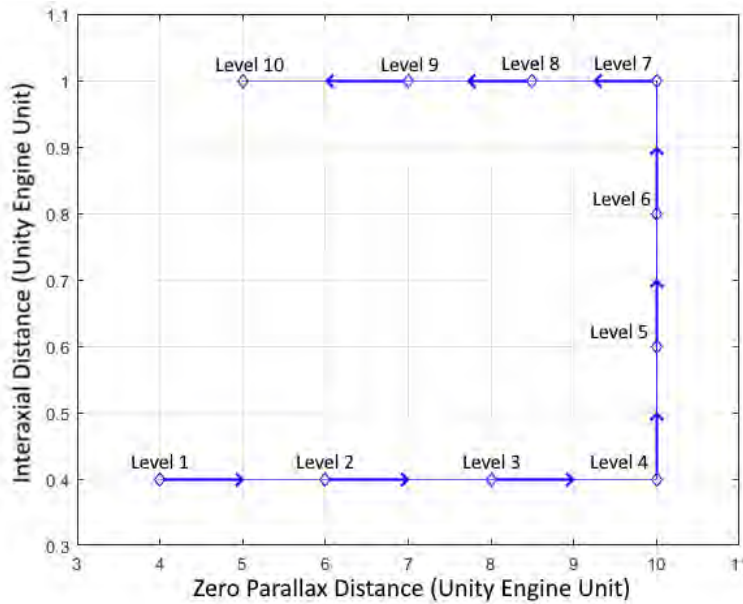


Figure 5: Directed chart showing the change of stereoscopic rendering parameters for each stimulus level.

375 3.2.3. Scene Complexity

376 Seven levels of scene complexity were simulated with increasing intensity.
 377 The first level consisted of only the empty corridor environment and the focus
 378 object. The second level employed 84 copies of the focus object, which were
 379 identical to the original and oscillated up and down periodically along the
 380 edges of the environment. The third level further increased the number of
 381 these copies by another 171, which were arranged in three additional lines
 382 along the corridor with increasing density towards the end. The fourth level
 383 did not add more objects, but randomly colored the copies red, green or blue,
 384 creating a more vibrant background. The fifth level added particle emitters
 385 to the copies directed towards the central path of the user, which produced
 386 20 particles per second matching the color of the source object. At the sixth
 387 level, the particles were given extra intensity via HDR textures and a force
 388 field was activated to propel them directly at participants' view. Also, the
 389 amount of particles were increased to 50 particles per second. The seventh
 390 level substantially increased brightness of particles and boosted the emission
 391 rate to 75 particles per second, causing the particles to occupy most of the
 392 field of view at severe discomfort. A set of sample frames, one illustrating

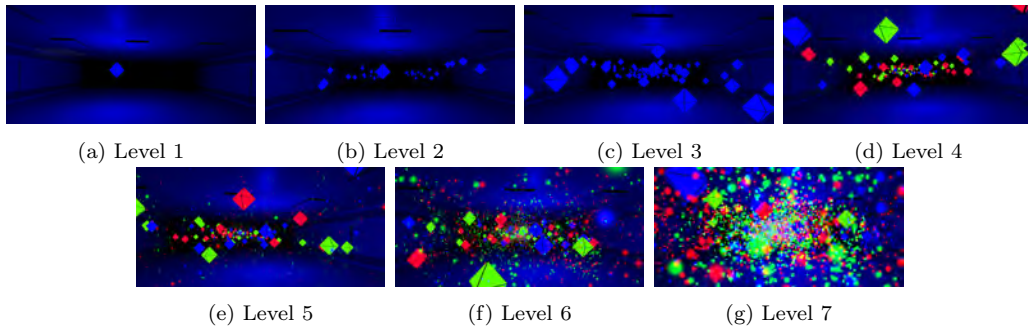


Figure 6: Sample frames demonstrating the levels of scene complexity employed in the user study as explained in section 3.2.3.

each level, is provided in Figure 6.

It should be noted that the scenes simulating navigation speed and stereoscopic rendering parameters were kept at minimal complexity in order to isolate the effects of varying complexity on responses to the scene complexity trials as much as possible. Similarly, the navigation speed during the simulation of scene complexity and stereoscopic rendering parameters was kept at the same minimum value (1.2 meters/sec) that is used in the first level of the navigation speed scene and the stereoscopic rendering parameters were kept at the default values (given at the bottom row of Table 1) during the simulation of navigation speed and scene complexity levels.

3.3. Collection and Processing of Eye-Activity Data

For evaluation, we used several prominent eye-activity features extracted from the data collected with a Tobii eye-tracker embedded inside an HTC Vive HMD. Eye-activity data collected with HMDs is robust and not prone to outside artifacts as HMDs provide an isolated environment, while the tracker can also adapt to low-light conditions automatically. Besides, as the tracker is securely attached to the HMD, it does not affect the user’s immersion in the VE in any way, unlike other biofeedback alternatives such as EEG, ECG or galvanic skin response measurement devices/probes that need to be attached to the body.

The Tobii SDK for Unity enabled recording the gaze information and the measured pupil size in real-time. The data can be acquired with every frame rendered but it was sampled at a constant 50 Hz in the interest of keeping the samples uniform. Using PyGaze (Dalmaijer et al., 2014), an open source

418 eye-tracking toolbox, the raw data was converted into the following features
419 of eye-activity:

420 - **Fixation Count**, the number of instances where the gaze is fixated on a
421 certain region during a trial.

422 - **Saccade Count**, the number of instances where the gaze moves quickly
423 from one point to another during a trial.

424 - **Blink Count**, the number of eye blinks during a trial.

425 - **Mean Fixation Duration**, the average duration of fixations recorded
426 during a trial expressed in milliseconds.

427 - **Pupil-Size Change**, per-frame change in pupil size relative to the baseline
428 recording at the matching illumination level as averaged over the duration of
429 a trial.

430 To measure pupil-size change, a personal baseline recording was con-
431 ducted for each participant at the start of each session. This involved showing
432 the participant a blank, completely dark background, and gradually increas-
433 ing the brightness in even steps to establish a baseline level of pupil diameter
434 per brightness step. The mean pupil diameters of the user sample are shown
435 per brightness step in Figure 7. During each stimulus level, screenshots were

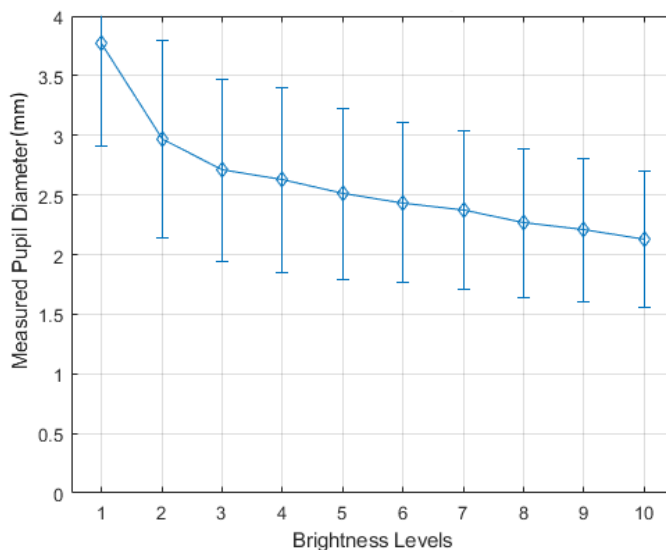


Figure 7: The average pupil diameter per brightness level captured with the baseline recordings.

436 taken at fixed intervals and the mean brightness of each screenshot was com-
437 pared to the steps of the baseline recording to identify the closest match.
438 The percentage difference between the pupil diameter at a given screenshot
439 and the baseline diameter at the matching brightness step was then used to
440 determine the change in pupil size at that instant.

441 The effect of various artifacts on the other collected eye-activity measures
442 were mitigated during feature extraction. For saccade and fixation detection,
443 the samples where a subject's either eye was closed were not taken into
444 account. For blinks, fixations and saccades, individual minimum durations
445 that are larger than the sampling rate (0.02 seconds) were used in order to
446 eliminate false positives.

447 4. Results

448 In the user study, each participant completed 27 trials for the three cy-
449 bersickness factors (corresponding to seven levels of scene complexity, ten
450 levels of navigation speed and ten levels of stereoscopic rendering param-
451 eters) in each session (totaling 81 trials after three sessions). To have a binary
452 measure of discomfort, participants were instructed to give an immediate dis-
453 comfort score of 1 out of 7 only when they did not feel any discomfort upon
454 the experienced trial. Accordingly, the trials that were rated with scores of
455 2 or higher were registered as the discomfort cases. Altogether, the whole
456 sample of 33 participants completed a total of

- 457 • 693 scene complexity trials, 377 of which resulted in no discomfort while
458 316 reported discomfort;
- 459 • 990 navigation speed trials, 622 of which resulted in no discomfort while
460 368 reported discomfort;
- 461 • and 990 stereoscopic rendering trials, 381 of which resulted in no dis-
462 comfort while 609 reported discomfort.

463 Over the collected data, the evaluation was carried out based on the
464 posited hypotheses.

465 4.1. *The change in persistent cybersickness differs with each passing session* 466 *(H1)*

467 The changes between consecutive SSQ responses across the sessions were
468 subjected to a one way repeated measures analysis of variance (RMANOVA)

Table 2: Statistics of the changes between pre- and post- session SSQ scores and the corresponding RMANOVA test results.

	After Session 1	After Session 2	After Session 3	Significance
	M \pm SD	M \pm SD	M \pm SD	
Difference in Nausea (SSQ-N)	-4.04 \pm 12.40	4.43 \pm 10.95	12.14 \pm 14.56	$F_{2,64} = 12.558, \mathbf{p} < \mathbf{0.001}$
Difference in Oculomotor (SSQ-O)	2.06 \pm 14.83	10.56 \pm 17.04	13.09 \pm 16.33	$F_{2,64} = 4.283, \mathbf{p} = \mathbf{0.018}$
Difference in Disorientation (SSQ-D)	8.01 \pm 19.38	9.28 \pm 20.49	7.59 \pm 20.90	$F_{2,64} = 0.053, \mathbf{p} = 0.949$
Difference in Total SSQ (SSQ-T)	1.59 \pm 13.99	9.40 \pm 16.67	13.26 \pm 15.84	$F_{2,64} = 4.728, \mathbf{p} = \mathbf{0.012}$

469 test. The results are shown in Table 2 along with means and standard de-
 470 viations of the reported changes in SSQ scores for each session. A promi-
 471 nent increase is evident in nausea, oculomotor and total SSQ scores as the
 472 experiment progresses and the corresponding distributions are found to be
 473 significantly different.

474 4.2. Eye-activity features are linked to immediate cybersickness (H2)

475 Curves of the collected eye-activity features as averaged over the sample
 476 per session are given in Figure 8 separated by factor type. The curves show
 477 particularly noticeable trends when speed trials are concerned. The num-
 478 ber of saccades, number of fixations and mean fixation duration attenuate
 479 as speed increases. In addition to this, variations across different sessions
 480 are observed, indicating an effect based on time spent in VR. Also, height-
 481 ened measures of immediate discomfort are evident as the sessions progress,
 482 especially with the stereoscopic rendering parameters, indicating a lowered
 483 tolerance as more time is spent in VR. The recorded eye-activity shows mostly
 484 negative pupil diameter change, suggesting pupil constriction. This is mainly
 485 due to pupil near response (Mathôt, 2018; Kasthurirangan and Glasser, 2005)
 486 which is observed when the viewer focuses on a nearby point. As the study
 487 participants were instructed to keep their gaze on the nearby focus object,
 488 this is likely to have triggered pupil near response and resulted in constriction
 489 in general.

490 To see how the reported cybersickness in response to the experienced
 491 stimuli presented itself in the recorded eye-activity features, Pearson corre-

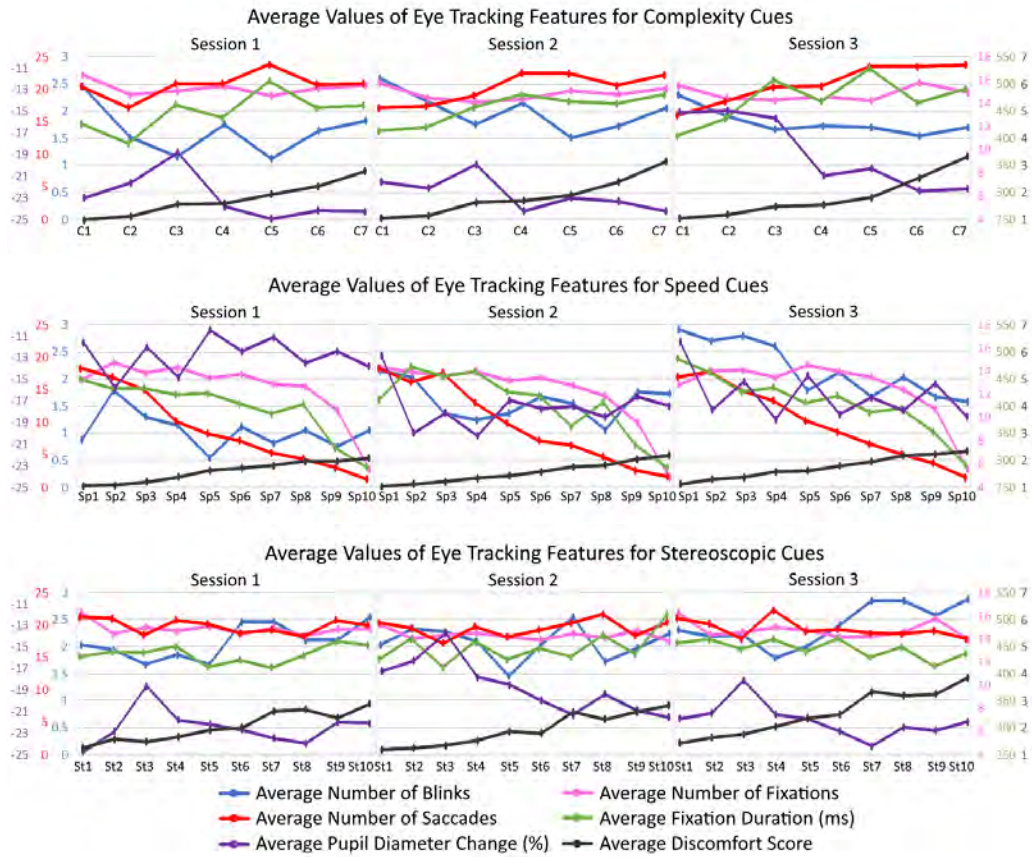


Figure 8: Curves of eye-activity features for the scene complexity, navigation speed and stereoscopic rendering trials as averaged over the subject sample. To facilitate the comparison, the curves are presented using the same vertical scale in all three graphs.

492 lation analysis was used. The trials were grouped up according to factor
 493 type and session order. The analysis revealed several weak but statisti-
 494 cally significant correlations between the immediate discomfort scores and
 495 the eye-activity features. When participants were exposed to different scene
 496 complexity levels, we observed significant correlations with the blink counts
 497 recorded in sessions 1 and 2 and the mean fixation durations in session 1.
 498 When participants experienced different stereoscopic rendering parameters,
 499 their immediate discomfort scores significantly correlated with the saccade
 500 counts of sessions 1 and 2 and the blink counts recorded in sessions 2 and
 501 3. While the discomfort experienced with the speed levels showed significant

Table 3: Pearson correlation coefficients (r) between immediate discomfort scores and eye-activity features. The discomfort scores are analyzed as separated by session and factor type. Results that are statistically significant are given in bold.

Feature	Session 1			Session 2			Session 3		
	Complexity	Speed	Stereo	Complexity	Speed	Stereo	Complexity	Speed	Stereo
Fixation Count	-0.016	-0.075	-0.006	0.009	-0.232***	0.067	0.016	-0.150**	0.005
Saccade Count	0.119	-0.159**	0.271***	0.086	-0.281***	0.143**	0.098	-0.268***	-0.055
Blink Count	0.223***	0.025	0.043	0.248***	0.131*	0.138*	0.098	0.241***	0.167**
Mean Fixation Duration	0.151*	-0.081	0.107	0.114	-0.195***	0.039	0.070	-0.122*	-0.100
Change in Pupil Size	0.000	0.059	-0.107	0.151*	0.152**	-0.043	0.157*	0.287***	0.084

* p < 0.05, ** p < 0.01, *** p < 0.001

502 negative correlation with saccade counts only for the first session, significant
503 correlations were observed with all eye-activity features in the following ses-
504 sions. The r values of the correlation analysis are given in Table 3 with their
505 significance levels marked.

506 4.3. Eye-activity features are linked to persistent cybersickness (H3)

507 With this correlation analysis, we are interested in the relationship be-
508 tween the eye-activity features and the SSQ results, which represent the
509 persistent discomfort felt at the end of a session rather than the immediate
510 discomfort felt during a given level of a session. For this, Pearson correlation
511 was applied between the averages of the eye-activity features over the ses-
512 sions and the differences between the pre- and post- session SSQ responses.
513 Blink count, change in pupil size and saccade count are not found to be sig-
514 nificantly correlated with the SSQ scores. Mean fixation duration is found
515 to be weakly correlated with changes in nausea scores. In addition, fixation
516 count is found to have weak but statistically significant negative correlations
517 with changes in the disorientation and oculomotor subscores, as well as the
518 total SSQ scores. The complete set of results are given in Table 4.

519 4.4. Eye-activity features show different responses to cybersickness in differ- 520 ent sessions (H4)

521 As further sessions mean more time spent in the VE, eye-activity re-
522 sponses to cybersickness from different session can be compared to assess
523 for significant differences. For this, individual analysis of variance (ANOVA)
524 tests were conducted using only the trials where participants reported imme-
525 diate discomfort. The blink, saccade and fixation counts showed significant
526 changes across different sessions while the other eye features showed no such

Table 4: Pearson correlation coefficients (r) between the changes in SSQ scores and eye-activity features. Statistically significant correlations are shown in bold.

	Blink Count	Fixation Count	Saccade Count	Mean Fixation Duration	Pupil Size Change
SSQ-N	0.108	-0.174	0.036	0.266**	-0.011
SSQ-O	0.130	-0.220*	-0.086	0.137	0.157
SSQ-D	0.066	-0.229*	-0.104	0.025	0.101
SSQ-T	0.125	-0.248*	0.066	0.170	0.110

* p < 0.05, ** p < 0.01, *** p < 0.001

527 change. Corresponding statistics and the significance values are given in
528 Table 5.

Table 5: Statistics of eye-activity features in trials where immediate discomfort is reported and the corresponding ANOVA analysis results per session. ANOVA results with p values less than 0.05 were considered statistically significant and shown in bold.

	Session 1 M ± SD	Session 2 M ± SD	Session 3 M ± SD	Significance
Blink Count	1.71 ± 2.22	2.19 ± 2.53	2.40 ± 2.76	F_{2,1284} = 8.345 p < 0.001
Pupil Size Change (%)	-19.48 ± 10.38	-19.25 ± 10.09	-18.65 ± 10.43	F _{2,1284} = 0.788 p = 0.455
Saccade Count	17.67 ± 10.49	16.63 ± 10.54	16.14 ± 10.14	F_{2,1284} = 3.194 p = 0.041
Fixation Count	14.24 ± 3.54	13.54 ± 3.92	13.89 ± 4.05	F_{2,1284} = 3.914 p = 0.020
Mean Fixation Duration (msec)	432.13 ± 126.71	437.79 ± 153.56	436.33 ± 157.45	F _{2,1284} = 0.224 p = 0.799

529 4.5. *Eye-activity features show different responses to cybersickness invoked*
 530 *by different factors (H5)*

531 ANOVA tests using only the trials where immediate discomfort was re-
 532 ported were also conducted to investigate which eye-activity features exhib-
 533 ited significant differences between the factors. Significant differences were
 534 observed for all eye-activity features between different factors. Correspon-
 535 ding statistics and the significance values are provided in Table 6.

536 Further, two-way multivariate analysis of variance (MANOVA) test showed
 537 statistically significant differences with discomfort for both different factor
 538 types and different sessions in the VE ($F_{2,1284} = 72.322$, $p < 0.001$ for differ-
 539 ent factors, $F_{2,1284} = 3.390$, $p < 0.001$ for time spent, $F_{4,1284} = 3.923$, $p <$
 540 0.001 for interaction effect). This indicates a significant interaction between
 541 factor type and time spent in VE. That is, the effect of factor type changes
 542 as the sessions progress and vice versa.

543 The distributions of the eye-activity features extracted from the trials
 544 where immediate discomfort was reported are further illustrated using violin
 545 plots combined with box plots in Figure 9.

Table 6: Statistics of eye-activity features in trials where immediate discomfort is reported and the corresponding ANOVA analysis results per cybersickness factor. ANOVA results with p values less than 0.05 were considered statistically significant and shown in bold.

	Complexity	Speed	Stereo	Significance
	M \pm SD	M \pm SD	M \pm SD	
Blink Count	2.07 \pm 2.74	1.88 \pm 2.40	2.30 \pm 2.52	$F_{2,1284} = 3.172$ $p = 0.042$
Pupil Size Change (%)	-20.68 \pm 9.60	-14.19 \pm 9.35	-21.24 \pm 10.24	$F_{2,1284} = 66.444$ $p < 0.001$
Saccade Count	21.83 \pm 9.12	6.87 \pm 9.96	20.12 \pm 8.55	$F_{2,1284} = 374.518$ $p < 0.001$
Fixation Count	14.82 \pm 3.10	11.74 \pm 3.01	14.70 \pm 3.01	$F_{2,1284} = 91.649$ $p < 0.001$
Mean Fixation Duration (msec)	482.46 \pm 157.65	378.51 \pm 147.50	445.51 \pm 129.75	$F_{2,1284} = 48.305$ $p < 0.001$

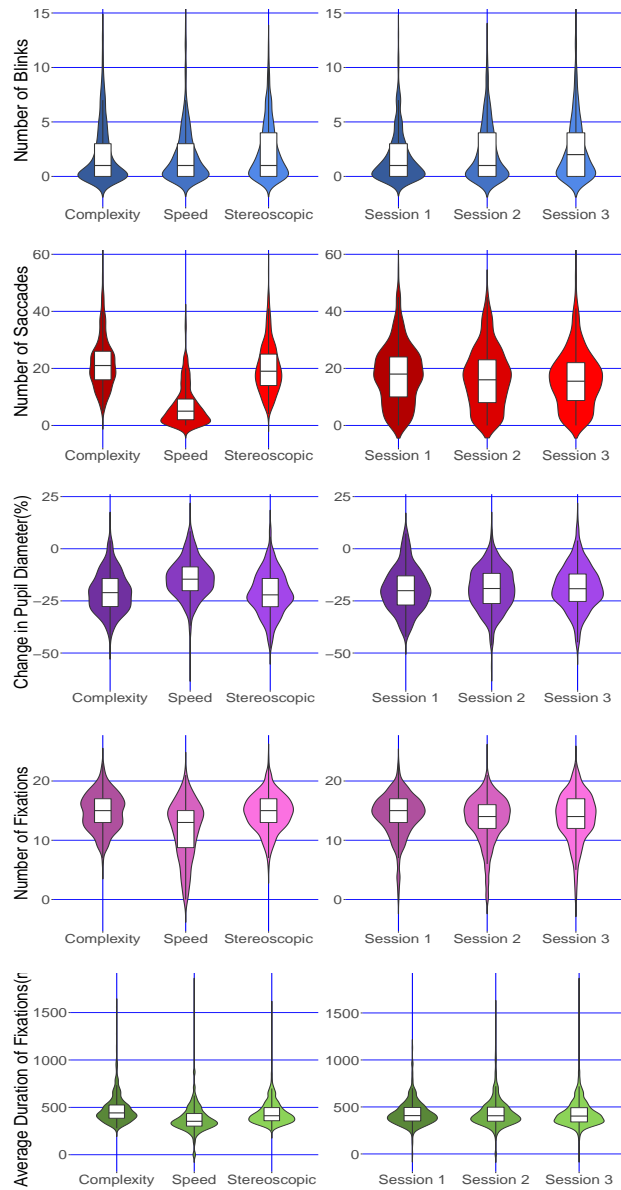


Figure 9: Combined violin and box plots of eye-activity features extracted from the trials where immediate discomfort was reported. The plots on the left side are separated by factor type and the plots on the right side are separated by session. Violin plots give density distributions for corresponding features. The lower and upper bound of the box plots represent the first and third quartile of the samples, respectively, while the one in the middle represents the median.

Table 7: Statistics from linear regression models that take factor parameters and eye-activity features as input and attempt to predict the immediate discomfort score separated by session. Adjusted R^2 metric, ranging from 0 to 1, describes how well the model predicts the output, while β is the standardized coefficient for the corresponding input. Inputs with p values less than 0.05 were considered statistically significant predictors of immediate discomfort and shown in bold.

	Session 1	Session 2	Session 3
Adjusted R^2	$R^2 = 0.212$	$R^2 = 0.263$	$R^2 = 0.366$
Blink Count	$\beta = \mathbf{0.104}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = \mathbf{0.191}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = \mathbf{0.164}$ $\mathbf{p} < \mathbf{0.001}$
Pupil Size	$\beta = 0.034$	$\beta = \mathbf{0.077}$	$\beta = \mathbf{0.237}$
Change	$\mathbf{p} = 0.304$	$\mathbf{p} = \mathbf{0.010}$	$\mathbf{p} < \mathbf{0.001}$
Saccade Count	$\beta = \mathbf{0.168}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = -0.027$ $\mathbf{p} = 0.537$	$\beta = -0.039$ $\mathbf{p} = 0.332$
Fixation Count	$\beta = 0.069$ $\mathbf{p} = 0.066$	$\beta = \mathbf{0.112}$ $\mathbf{p} = \mathbf{0.004}$	$\beta = 0.065$ $\mathbf{p} = 0.058$
Mean Fixation	$\beta = 0.048$	$\beta = 0.051$	$\beta = -0.006$
Duration	$\mathbf{p} = 0.201$	$\mathbf{p} = 0.183$	$\mathbf{p} = 0.874$
Scene Complexity	$\beta = \mathbf{0.287}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = \mathbf{0.410}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = \mathbf{0.389}$ $\mathbf{p} < \mathbf{0.001}$
Navigation Speed	$\beta = \mathbf{0.394}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = \mathbf{0.358}$ $\mathbf{p} < \mathbf{0.001}$	$\beta = \mathbf{0.306}$ $\mathbf{p} < \mathbf{0.001}$
Camera Interaxial-	$\beta = \mathbf{0.361}$	$\beta = \mathbf{0.362}$	$\beta = \mathbf{0.557}$
Distance	$\mathbf{p} < \mathbf{0.001}$	$\mathbf{p} < \mathbf{0.001}$	$\mathbf{p} < \mathbf{0.001}$
Camera Zero-	$\beta = \mathbf{0.092}$	$\beta = \mathbf{0.102}$	$\beta = \mathbf{0.078}$
Parallax Distance	$\mathbf{p} = \mathbf{0.009}$	$\mathbf{p} = \mathbf{0.002}$	$\mathbf{p} = \mathbf{0.013}$

546 *4.6. Stimuli levels and eye-activity features are predictors of immediate cy-*
547 *bersickness (H6)*

548 To evaluate the predictive effect, a linear regression test was applied to the
549 entire dataset. The trials were divided into three sessions, and all eye-activity
550 features and factor parameters (navigation speed, scene complexity level,

551 camera interaxial distance, and camera zero-parallax distance) were analyzed
552 as potential predictors of immediate discomfort scores. The detailed results
553 of the test are provided in Table 7. It was found that all factor parameters
554 were significant predictors of discomfort in all sessions. Among the eye-
555 activity features, blink count was a significant predictor in all sessions, while
556 change in pupil size was identified as a significant predictor in the last two
557 sessions. Saccade and fixation counts were significant predictors in sessions
558 1 and 2, respectively, while average fixation duration was not found to be a
559 significant predictor in any session.

560 5. Discussion

561 To examine the accumulated discomfort associated with extended expo-
562 sure to the simulated cybersickness factors, we used the differences in SSQ
563 responses to assess changes in persistent symptoms across different VR ses-
564 sions. Our analysis showed that the changes in SSQ subscales relating to
565 nausea and oculomotor discomfort and the changes in overall cybersickness
566 severity given by the total SSQ scale were significantly different across dif-
567 ferent sessions. Although the changes in disorientation subscale did not dif-
568 fer significantly, disorientation ratings showed large increases in all sessions,
569 while nausea and oculomotor discomfort ratings showed large increases in
570 later sessions. This implies that disorientation symptoms such as dizziness
571 and vertigo may have been experienced earlier than the others. Overall, the
572 results support hypothesis H1, which posited that the change in persistent
573 cybersickness severity would be significantly different across sessions.

574 Evaluation of the immediate discomfort scores revealed multiple signifi-
575 cant correlations with the eye-activity features scattered across the sessions.
576 Fixation counts were observed to decrease with cybersickness related to nav-
577 igation speed, similar to the results by Bahit et al. (2016), who reported a
578 decrease in focus with high SSQ ratings in a driving simulator. However,
579 during the navigation speed trials, saccade counts were reduced, indicating
580 slower eye movements rather than rapid ones, when participants experienced
581 cybersickness. Conversely, the analysis revealed positive correlation (increas-
582 ing relationship) between immediate discomfort and saccade count when par-
583 ticipants experienced VAC-related cybersickness, likely due to an inability to
584 focus their gaze coherently, searching for objects that can be fused comfort-
585 ably. These differing reactions in saccade counts suggest that VAC-related

586 cybersickness and vection-related cybersickness can be distinguished using
587 eye-activity features.

588 Similarly, mean fixation duration returned positive correlations with im-
589 mediate discomfort during scene complexity trials while navigation speed
590 trials returned negative correlations, indicating fixations with shorter du-
591 ration. Increase in blink count was a persistent indicator of cybersickness
592 across all factor types. This is consistent with Cebeci et al.'s (2019) find-
593 ings that reported increased blink rates in users who returned higher ratings
594 of nausea and oculomotor discomfort. Increased pupil size was associated
595 with cybersickness due to movement speed, similar to the amount of fixa-
596 tions. We have observed the strongest reaction from the navigation speed
597 related recordings, which showed correlations across all features. The analy-
598 sis indicates that hypothesis H2 is confirmed only between saccade count and
599 immediate discomfort for the navigation speed trials as no other eye-activity
600 feature demonstrated a consistently significant link across all sessions. The
601 analysis also hints that the blink count and change in pupil size can become
602 more correlated with the cybersickness associated with the speed trials as
603 participants spend more time in the VE.

604 However, correlation analysis with accumulated discomfort assessed via
605 the SSQ ratings depicted a different picture by confirming hypothesis H3
606 for fixation count and mean fixation duration. Fixation count was found
607 to correlate negatively with total SSQ and subscales of disorientation and
608 oculomotor discomfort while mean fixation duration was found to correlate
609 positively with nausea subscale. The contrast with the previous correlations
610 on immediate discomfort imply that persistent cybersickness and immediate
611 cybersickness from the simulated cybersickness factors can manifest differ-
612 ently in eye-activity features. The findings further suggest that the accumu-
613 lated severity of cybersickness may be connected to fixation count and mean
614 fixation duration.

615 The evaluation indicated both different sessions and different factors can
616 evoke significantly different eye responses in case of cybersickness. Further
617 examination of Figure 9 shows different eye-activity distributions related to
618 speed trials in contrast to stereoscopic rendering and scene complexity trials
619 when cybersickness is present. The finding is in line with the correlation
620 analysis with immediate discomfort scores, where eye-activity features from
621 the speed trials showed the highest correlations to immediate discomfort
622 while the stereoscopic rendering and scene complexity trials displayed fewer.
623 This distinction points out that eye-activity features can simplify the task

624 of identifying the source of cybersickness once it is detected. Number of
625 blinks, fixations and saccades were significant for both different factors and
626 sessions. Cebeci et al. (2019) also reported significantly different saccade
627 rates and fixation counts for environments differing in scene complexity and
628 speed trials. Our results confirm hypothesis H4 for blink, saccade and fixation
629 counts as they are significantly different in all sessions. Moreover, hypothesis
630 H5 is confirmed for the whole set of eye-activity features we investigated as
631 they all have significant differences for different factors.

632 Regression analysis identified that several eye-activity features and scene
633 parameters can serve as significant predictors for immediate cybersickness.
634 Stereoscopic rendering parameters were found to be significant predictors,
635 especially the zero-parallax distance with the highest weight, suggesting the
636 strongest effect. While we have manipulated the stereoscopic parameters
637 from the default HMD values to induce visual discomfort with extreme dis-
638 parities, they can be adjusted to improve the VR experience, as well. For in-
639 stance, the system proposed by Avan et al. (2022) can automatically provide
640 stereoscopic rendering parameters according to a sparsely pre-defined param-
641 eter set as the user navigates the virtual scene using a VR-HMD setup. The
642 results indicate that their method is able to enhance the user experience in
643 terms of overall perceived depth and picture quality while maintaining visual
644 comfort on a par with the HMD’s default settings. Navigation speed emerges
645 as another significant predictor of immediate discomfort. However, the im-
646 mediate discomfort curves across the simulated speed levels do not point to
647 a critical value that could be regarded as a limit beyond which discomfort
648 scores drastically increase. Same can be argued for scene complexity, which
649 was also found to be a significant predictor in all sessions.

650 Number of blinks detected in a given stimulus interval (i.e., blink fre-
651 quency) was also found to be a reliable predictor as it was significant in all
652 three sessions. This suggests that blink frequency can be instrumental in
653 predicting the existence of cybersickness, regardless of the time spent in VR.
654 Several studies (Kim et al., 2005; Dennison et al., 2016) have demonstrated
655 an increase in blink frequency with prolonged immersion in VR, highlighting
656 the significance of this predictor and its increasing effect in further sessions.
657 Change in pupil size was shown to be a significant predictor in sessions 2
658 and 3. The regression analysis designated saccade and fixation counts to be
659 less reliable predictors, as they were significant only for a single session. Yet,
660 saccade count was shown to have significant connections to navigation speed
661 levels, which is compatible with Cebeci et al.’s (2019) findings that indicated

662 significant correlations between SSQ subscores and saccade rate in a roller
663 coaster scene. The adjusted R^2 values indicate that a linear regression model
664 can explain some of the relationship between eye-activity features and cyber-
665 sickness but not fully. This relationship is likely more complex than what a
666 linear regression model might suggest, and could be further explored using
667 a neural network. The resulting model partially supports hypothesis H6, as
668 mean fixation duration was not found to be a significant predictor in any
669 session.

670 **6. Limitations and Future Work**

671 Each scene of the VE employed in this study was designed with the pur-
672 pose of invoking discomfort due to a single cybersickness factor alone and
673 studying it in isolation from the others. Similarly, the scenes were structured
674 in abstract unrealistic layouts with the aim to minimize emotional and cog-
675 nitive effects that are unrelated to that specific factor. Yet, these measures
676 constitute an inherent limitation as the resulting scenes are quite unlike what
677 users encounter in most VR applications. As a complementary to this work,
678 these factors can be studied together in realistically designed VR scenes in
679 future studies. Such realistic scenes would facilitate the study of aspects
680 related to presence, as well.

681 The use of back-to-back sessions with three-minute breaks in between
682 was a deliberate experimental design choice in order to evaluate time spent
683 immersed in VR as a variable and account for accumulated cybersickness.
684 However, the duration of the breaks between consecutive levels and scenes
685 may be seen as somewhat limiting. In order to prevent contamination effects,
686 participants were asked at the end of each designated break period if they
687 were comfortable continuing the experiment. They were also instructed to
688 resume the experiment by pressing a designated hand controller button only
689 if they felt ready after any break following a level or scene. While such pre-
690 cautions have been utilized in previous cybersickness studies that employed
691 multiple short-term stimuli in succession (Pöhlmann et al., 2021; Terenzi and
692 Zaal, 2020; Pöhlmann et al., 2022), similar to our study, it should be noted
693 that these measures may not have completely eliminated carryover effects.

694 Another noteworthy limitation is the sample demographics. Our sample
695 is comprised of a fairly young (23.8 average) and mostly male (26 out of 33
696 total) group. They also showed somewhat low motion sickness susceptibil-
697 ity as reported by MSSQ and moderate video gaming habits. Should the

698 future studies be carried out with larger samples that are more balanced
699 in the demographics in question, they can convey a broader understanding
700 of the nature of cybersickness in relation to the cybersickness factors under
701 consideration.

702 **7. Conclusions**

703 In this study, we focused on investigating cybersickness experienced with
704 VR-HMDs and addressed two primary research questions. Firstly, we aimed
705 to assess the association between certain eye-activity features, including fix-
706 ation count, saccade count, blink count, mean fixation duration, and pupil
707 size change, with cybersickness in response to stimulus variations in key con-
708 tent factors of cybersickness, namely, navigation speed, scene complexity,
709 and stereoscopic rendering parameters. Secondly, we aimed to investigate
710 how the relationship between the aforementioned eye-activity features and
711 cybersickness changes with the duration of exposure to VR. To achieve these
712 objectives, we conducted a within-subject user study with 33 participants
713 immersed in a VE through a VR-HMD. We collected their eye-activity data
714 with corresponding self-reported discomfort measures while they experienced
715 three different versions of the VE, each simulating one of the three content
716 factors in varying degrees of severity. The experiment was conducted in
717 three repeated sessions to account for the accumulation effects with increas-
718 ing exposure duration. Additionally, we collected self-reported measures of
719 discomfort using in-VR single-item queries and post-VR SSQs to account
720 for both immediate and persistent cybersickness, respectively. The collected
721 data and the code used to process the data are publicly available at the link
722 provided below. Furthermore, we provide a supplemental video to illustrate
723 the scenes used as stimuli in the study.

724 Our findings suggest that eye-activity can be instrumental in detecting
725 cybersickness experienced with VR-HMDs, and may also be promising for de-
726 termining the type of cybersickness, s.t., whether it stems from VAC, vection
727 etc., as well. Eye-activity features are particularly relevant for speed-related
728 stimuli that elicit vection, and further research in this area could be beneficial
729 for creating more immersive movements in VEs while minimizing cybersick-
730 ness. Blink frequency appears to be an especially important feature, as it
731 was significant in both the correlation analysis with immediate discomfort
732 scores and the regression analysis. The results also highlight the importance
733 of carefully selected stereoscopic rendering parameters, as this factor was the

734 most likely to cause discomfort, even though the effect also contributes to
735 the feeling of depth. Methods offering optimized alternatives to the default
736 stereoscopic parameters (Avan et al., 2022), can be key in improving the
737 feeling of depth while maintaining visual comfort.

738 **Declarations**

739 **Data Availability.** The data collected with the user study is available at
740 [the paper website](#).

741 **Code availability.** The code used to process the data is available at [the](#)
742 [paper website](#).

743 **Authors' contributions.**

744 *Alper Ozkan:* Methodology, Investigation, Data Curation, Validation, Soft-
745 ware, Formal analysis, Writing - Original Draft, Writing - Review & Editing,
746 Visualization

747 *Ufuk Celikcan:* Conceptualization, Methodology, Validation, Writing - Orig-
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