The effect of operating a virtual doppleganger in a 3D simulation

Gale Lucas^{*1}, Evan Szablowski^{†2}, Jonathan Gratch^{‡1}, Andrew Feng^{§1}, Tiffany Huang^{¶1}, Jill Boberg^{||1}, and Ari Shapiro^{**1}

¹Institute for Creative Technologies, University of Southern California ²University of Oxford

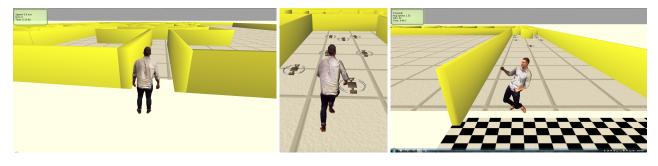


Figure 1: We present a system whereby a human subject can be quickly captured and animated as a 3D avatar. We present a study where we ask subjects to operate either their own avatar or someone else's avatar in a simulation and gauge performance.

26

27

29

30

31

32

33

34

35

37

38

39

41

42

43

44

45

46

47

48

49

50

51

52

54

55

56

57

58

59

60

61

62

63

64

65

66

Abstract

Recent advances in scanning technology have enabled the 2 widespread capture of 3D character models based on human sub-3 jects. Intuition suggests that, with these new capabilities to create avatars that look like their users, every player should have his or 5 her own avatar to play video games or simulations. We explicitly 6 test the impact of having one's own avatar (vs. a yoked control 7 avatar) in a simulation (i.e., maze running task with mines). We test 8 the impact of avatar identity on both subjective (e.g., feeling con-9 nected and engaged, liking avatar's appearance, feeling upset when 10 avatar's injured, enjoying the game) and behavioral variables (e.g., 11 time to complete task, speed, number of mines triggered, riskiness 12 of maze path chosen). Results indicate that having an avatar that 13 looks like the user improves their subjective experience, but there 14 is no significant effect on how users perform in the simulation. 15

¹⁶ Keywords: avatar,gesture,3D,animation,simulation,scanning

17 Concepts: •Computing methodologies \rightarrow Perception;

18 1 Introduction

Recent advances in scanning technology have enabled the rapid creation of 3D characters from human subjects using image, video and depth sensing cameras. One use of such technology is to represent the user in a simulation, i.e as an avatar. Indeed, with these new advances in scanning technology, simulations could be developed where users are first scanned so they have their own "personal" avatar that looks like them. It is thought important for the user

*lucas@ict.usc.edu

[†]EvanSzab@gmail.com

- [‡]gratch@ict.usc.edu
- §feng@ict.usc.edu
- ¶thuang@ict.usc.edu
- boberg@ict.usc.edu

MIG 2016, October 10-12, 2016, San Francisco, CA ISBN: 978-1-4503-ABCD-E/16/07 DOI: http://doi.acm.org/10.1145/9999997.9999999 to be able to recognize his or her avatar in the simulation. As an example, a military training simulation might require a user to run practice drills with virtual squad members that look like the real squad members. Alternatively, a training simulation might require the presence of coworkers to be part of the 3D training environment. Indeed, for the military or industry to undertake the costs to integrate such scanning technology into simulations, having an avatar that photorealistically resembles one's own physical appearance should be shown to improve performance in these simulations.

There is a growing body of research related to the psychological effects of having an avatar that looks like the user (a virtual "doppelganger") in a simulation [Aymerich-Franch and Bailenson 2014; Bailenson 2012; Fox and Bailenson 2009; Fox and Bailenson 2010; Fox et al. 2009; Hershfield et al. 2011; Lee et al. 2010]. Specifically, research has demonstrated that observing one's own avatar over time (i.e., in time lapse) can help users to change their behavior. For example, individuals who saw their own avatar change levels of physical fitness were more engaged in healthier physical behaviors, including physical exercise and eating habits than those who saw an avatar that was not their own [Fox and Bailenson 2009; Fox et al. 2009]. Likewise, individuals who saw their own avatar age were more willing to engage in prudent financial behavior [Hershfield et al. 2011]. Applications have also been developed to overcome public speaking anxiety by seeing one's own avatar give a speech [Aymerich-Franch and Bailenson 2014].

Building off this literature, the current work considers whether operating an avatar that is built to look like the user will affect motivation and performance in a simulation. Prior work has considered the effects of the "naturalness" of the character (i.e., more dynamic movement vs. static character navigated through a simulation). Results have been mixed; for example, researchers have found that users were most satisfied with their own performance using the least natural character (i.e., one that moves around the environment in a static pose) [Normoyle and Jörg 2014]. Recent research with embodiment of avatars has looked at differences between embodied robot, cartoon-like humans, stick figures in 1st person perspectives in virtual reality [Lugrin et al. 2015b] or 3rd person perspectives [Lugrin et al. 2015a] for fitness applications. However, our study uses photorealistic avatars from a 3rd person perspective where the user has full view of their avatar, including the avatar's face. Additionally, this work has not considered the

^{**}shapiro@ict.usc.edu

effect of characters that are "more natural" to the user in terms of 129 67 its likeness to the user. Some video game systems allow users to 130 68 personalize characters by adjusting their physical attributes. For 131 69 example, Nintendo offers "Mii" characters. Although these "Mii" 132 70 characters are of relatively low fidelity, users can customize their 133 71 avatar to create a likeness of themselves. The common perception 134 72 is that this makes the game more enjoyable for users and increases 135 73 engagement. In such a simulation context, prior work has consid-74 136 ered whether people respond differently to an avatar that depicts an 137 75 idealized version of themselves (compared to a more accurate one). 76 138 Users who created a "Mii" character reflecting what they would 77 ideally look like reported the simulation felt more interactive than 140 78 those who created a "Mii" character that mirrored their actual phys-141 79 ical appearance [Jin 2009]. However, it has not tested the effect of 142 80 having one's own avatar in such a simulation compared to having 143 81 someone else's avatar. We test that possibility here. 82 145 Prior correlational research supports the prediction that participants 83 146 will enjoy operating an avatar more if it looks like them (vs. some-84 147 one else). Indeed, players report greater enjoyment of video games 85

to the extent that they identify with the character being operated 86 149 [Christoph et al. 2009; Hefner et al. 2007; Trepte et al. 2010]. In 87 150 addition to motivation and enjoyment, we also consider the impact 88 151 of using a doppelganger on performance. While the effect on per-89 152 formance has been unstudied, prior work suggests that having an 90 153 avatar who looks more like the user can affect behavior. For exam-91 154 ple, users who played a violent video game using a character that 92 155 mirrored their actual physical appearance were significantly more 93 156 aggressive than those who played the same violent video game with 94 157 a generic avatar [Hollingdale and Greitemeyer 2013]. 95 158

If there is a significant effect of operating one's own avatar on per-96 formance in a simulation, this could have important implications 97 for certain applications. For example, more high fidelity military 98 applications have been envisioned where photorealistic characters 99 are used in simulations. For example, multiple players may need 100 to identify their own avatar as well as other virtual squad members 101 in order to run drills in a virtual environment. Additional benefits 102 might possibly be that users in such simulations act more realisti-103 cally with an avatar that looks like them rather than a generic char-104 acter. Users might take more care for their avatar not to get injured 105 or killed in the simulation to the extent that they identify it with 106 their person. To achieve this in a high fidelity application, modern 107 scanning technology that allows for rapid creation of 3D characters 108 from human subjects could be used. While this is becoming more 109 affordable, expenses would still accumulate if it was used on a wide 110 scale across the armed forces. 111

Therefore, we conduct research to establish the effects that using 173 112 one's own avatar has on user engagement, liking, and enjoyment 113 174 as well as behavior in the virtual environment, especially perfor-114 mance and the care that is taken to prevent the avatar from harm. 176 115 In this paper, we compare two groups of users on all of these vari-116 ables; specifically, we compare users who have been assigned to 117 play with an avatar that was scanned from them (experimental con-118 dition) to those who have been assigned an avatar built from the 119 previous participant of the same gender (yoked control condition). 120

2 **Related Work** 121

Creating a virtual character from a particular subject is not a trivial 122 task and usually requires extensive work from a 3D artist to model, 123 rig, and animate the virtual character. The first step of avatar cre-124 ation requires reconstruction of a 3D model from either a set of 125 images or depth range scans. With the availability of low-cost 3D 126 127 cameras (Kinect and Primesense), many inexpensive solutions for 3D human shape acquisition have been proposed. The work by 128

[Tong et al. 2012] employs three Kinect devices and a turntable. Multiple shots are taken and all frames are registered using the Embedded Deformation Model [Sumner et al. 2007]. The work done in [Zeng et al. 2013] utilizes two Kinect sensors in front of the self-turning subject. The subject stops at several key poses and the captured frame is used to update the online model. More recently, solutions which utilize only a single 3D sensor have been proposed, and this allows for home-based scanning and applications. The work in [Wang et al. 2012] asks the subject to turn in front of a fixed 3D sensor and 4 key poses are uniformly sampled to perform shape reconstruction. To improve the resolution, KinectAvatar [Cui et al. 2012] considers color constraints among consecutive frames for super-resolution. More recently, the work in [Li et al. 2013] asks the subject to come closer and obtains a superresolution scan at each of 8 key poses. The second step is to create an animated virtual character from the scanned 3D human model. A 3D model needs to be rigged with a skeleton hierarchy and appropriate skinning weights. Traditionally, this process needs to be done manually and is time consuming even for an experienced animator. An automatic skinning method is proposed in [Baran and Popović 2007] to reduce the manual efforts of rigging a 3D model. The method produces reasonable results but requires a connected and watertight mesh to work. The method proposed by [Bharaj et al. 2012] complements the previous work by automatically skinning a multi-component mesh. It works by detecting the boundaries between disconnected components to find potential joints. Such a method is suitable for rigging the mechanical characters that consists of many components. Other rigging algorithms can include manual annotation to identify important structures such as wrists, knees and neck [Mix 2013].

In the last few years, video-based methods have enabled the capture and reconstruction of human motions as a sequence of 3D models [Starck and Hilton 2007]. Such methods, which are capable of reproducing surface and appearance details over time, have been used to synthesize animations by the combination of a set of mesh sequences [Casas et al. 2014]. This results in a novel motion that preserves both the captured appearance and actor style, without the need of a rigging step. However, current approaches only demonstrate successful results for basic locomotion motions such as walk, jog and jump. The complexity of the movements needed in this work would still require the video-based 3D models to be rigged.

System Design 3

160

161

162

163

164

165

166

167

168

169

170

172

179

180

181

182

183

184

185

187

188

189

190

191

We used the method proposed in [Feng et al. 2015] to obtain an articulated 3D character from human subjects. Participants then navigated a maze with mines in a virtual environment using a WASD keyboard; they were randomly assigned to complete the maze in either the experimental condition (own avatar) or a yoked control condition. We first describe the method used to scan the participants, and then describe the experiment (in Section 4).

We utilized the Occipital Structure Sensor to obtain the 3D avatar scan from the test subject. It is a depth sensor attached on the Apple iPad to allow portable 3D scanning. The process requires the subject to stand still in an A-pose while being captured. During capture, the scanning operator will hold the scanner and walk around the participant to obtain 3D scans from all directions. The resulting scans are then aligned and merged through both rigid and non-rigid alignments to register all scans. The final static geometry is then produced via Poisson mesh reconstruction. The texture information is also inferred from scans of different views via Poisson texture blending. The body scanning capture and reconstruction takes approximately 8 to 10 minutes. Examples of the results of such scans can be seen in Figure 2. The scanned character model also requires proper rigging structure in order to move in the virtual en-

vironment (in this case, a maze). The method automatically builds 192 and adapts a skeleton to the 3D scanned character. The auto-rigging 193 method is based on the one proposed in [Feng et al. 2015] by utiliz-194 ing a 3D human model database to generate a morphable model to 195 automatically fit a 3D human scan. Once the morphable model is 196 constructed, we can transfer the location of skeletal bones, as well 197 as the skinning deformation information onto the scan. The qual-198 ity of the skinning and bone location is of similar quality to that 199 of the original rigging, which can be performed once by a profes-200 sional 3D rigger. This is in contrast to previous automatic rigging 201 methods [Shapiro et al. 2014; Feng et al. 2014; Baran and Popović 202 2007] that rely only on geometry to determine the skeletal location. 203 Once the skinned avatar is created, the user can navigate the avatar 204 in the virtual space (i.e., maze). For the current study (described 205 below), participants were also asked to record 4 utterances for pain 206 reactions (e.g. "Ow!", "Ouch!"). The steps for the preparation of 207 the character are detailed in Table 1. 208

Description		
	(min)	
Subject stands in A-pose and is scanned		
Subject records verbal responses	4	
("ow","ouch")		
Scan is automatically processed into 3d		
model		
Model is automatically rigged		
	Subject stands in A-pose and is scanned Subject records verbal responses ("ow","ouch") Scan is automatically processed into 3d model	

Table 1: Subject capture and 3D character creation process.

209 4 Evaluation

One hundred and six participants (65 males, 41 females) completed 210 a study in which they were randomly assigned to complete the maze 211 with an avatar that looked like them or another participant. Partic-212 ipants were recruited off of CraigsList and volunteered to partici-213 pate in the study in exchange for monetary compensation of \$25. 214 Their performance was further motivated by lottery entries for a 215 cash prize. Specifically, before beginning the maze task, partici-216 pants were instructed to navigate a maze as fast as possible while 217 avoiding hitting the mines and the walls, and they would receive 218 entries into a lottery based on their ability to do so. They were then 219 220 shown the avatar which they were going to navigate the maze with (Figure 3). 221

For participants in the experimental condition, they were shown the 222 avatar that was just created from their scan in front of the maze they 223 were going to run. For participants in the yoked control condition, 224 they were shown the avatar that was created from the scan from 225 the last gender-matched participant in front of the maze they were 226 going to run. Additionally, they were allowed to hear the pain re-227 actions of that avatar. Specifically, in the experimental condition, 228 these were their own recordings, whereas in the yoked control con-229 dition, they were the recordings of the last gender-matched partici-230 pant. The cover story suggested that the scanning procedure and the 231 maze running task were unrelated, so that participants in the yoked 232 control condition could have an ostensible explanation for using an-233 other avatar. This deception was revealed upon debriefing, and no 234 participants expressed concern about being deceived. Once partici-235 pants viewed the avatar they were going to use to navigate the maze, 236 they were oriented to navigating the avatar around walls and obsta-237 cles in the maze virtual environment. Navigation was controlled 238 through a WASD keyboard configuration (a gaming standard simi-239 lar to the arrow keys). Participants controlled their assigned avatar 240 in a third-person view. Running into an obstacle (e.g. a wall or 241 242 spiked trap) stopped avatar movement and triggered a sound effect of the avatar expressing pain (see Figure 4). 243





Figure 3: Presentation of avatar to the user before the maze task begins. Note that the subject is initially given a frontal view of the doppleganger.



Figure 4: Screen capture from a session where a user is navigating his own avatar through the maze.

Participants were given 15 minutes to complete the maze. Sixteen participants failed to complete the maze in the time given, and were

therefore excluded from analyses below.

Upon completion of the maze, participants were asked to answer 16 247 questions about their experience. All items were answered using a 248 5 point scale ranging from Strongly Disagree (1) to Strongly Agree 249 (5). Participants were asked to complete a manipulation check (1 250 item) and indicate how realistic the avatar looked (4 items), as well 251 as to report on: the extent to which they were feeling connected and 252 engaged (4 items), how much they liked the avatars appearance (3 253 items), the extent to which they were feeling upset when the avatar 254 was injured (3 items), and how much they enjoying the game (1 255 item). Example items are provided below in Table 2. 256

A number of measures were extracted from the game play during 257 this maze running simulation. First, we measured the total time it 258 took participants to complete the maze in seconds (up to 900 sec-259 onds, which corresponded to the 15 minute time limit). We mea-260 sured the distance they navigated to complete the maze in (virtual) 261 meters, and, thus, also their average speed across the maze in me-262 ters per second. We measured the number of times they collided 263 with the maze wall or mines. Additionally, in the areas of the maze 264 where participants had the choice between riskier and safer paths, 265 we calculated the percent of the path that was taken that was risky. 266 Specifically, as seen in Figure 5 below, participants could choose 267 shorter distance paths with more mines (1 and 4) or longer distance 268 paths with fewer mines (0 and 2, as well as 3 and 5, respectively). 269 We computed the proportion of steps taken, time spent in the risky 270 zones using the formula: (0.5 * (N steps taken time spent in 1 / N)271 steps taken time spent in (0, 1, 2)) + (0.5 * (N steps taken time spent)272 273 in 4 / N steps taken time spent in 3, 4, 5)). All paths taken by the subjects can be seen in Figure 6. 274

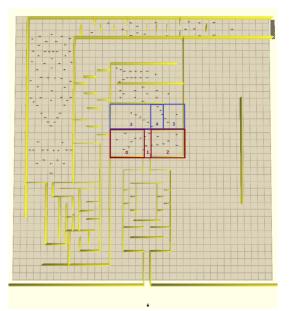


Figure 5: Specifically, as seen in Figure 6 below, when choosing between which of the red zones (0, 1, 2) to traverse, participants could choose the shorter distance path with more mines (zone 1) or longer distance paths with fewer mines (zones 0 or 2) Likewise, when choosing how to navigate through the blue zones (3, 4, 5), they could choose the shorter distance path with more mines (zone 4) or longer distance paths with fewer mines (zones 3 or 5). Accordingly, we computed the proportion of time spent in the risky zones using the formula:

 $t_{risky} = (0.5 * (n_1/n_{012}) + (0.5 * (n_4/n_{345})))$

where n_1 is the time spent in zone1, n_{012} is the time spent in zones 0, 1 or 2, n_4 is the time spent in zone 4, and n_{345} is the time spent in zones 3, 4 or 5.

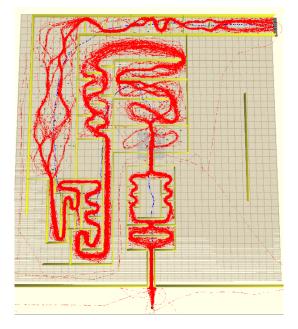


Figure 6: Paths taken by the subjects through the maze.

	Scale	Number	Items
i	Manipulation check	1	The avatar resembled my personal appearance.
ii	Realism of the avatar	4	The avatar looked physically realistic.
			The sounds from the avatar seemed realistic.
			The avatar physically behaved in a realistic way (body movement).
			I felt comfortable controlling my avatar.
iii	Connected and engaged	4	I was invested in the task and personally cared about my performance.
			I perceived a relationship with my avatar.
			The avatar's appearance increased my interest in the task.
			I am proud of my avatar's performance.
iv	Liked the apperance	3	The avatar was attractive.
			I felt comfortable with my avatar's appearance.
			I am proud of my avatar's performance.
V	Feel upset when injured	3	I cared when the avatar expressed pain.
			I did not enjoy seeing my avatar get hurt.
			I felt responsible for my avatar.
vi	Enjoyed the game	1	The game was enjoyable.

Table 2: Subjective Measures

316

317

338

339

340

341

342

343

344

345

347

354

275 5 Results

276 Analyses are reported for the 90 participants who completed the 318 maze within the given (15 minute) time limit. We first present the 319 277 results for the subjective measures, and then turn to the behavioral 278 (gameplay) measures. For both subjective and behavioral measures, 321 279 ANOVA was conducted to test the effect of condition (experimen-322 280 tal vs yoked control), gender (male vs female), and their interac-323 281 tion. Given that men and women differ in height, the height of the 282 324 participants avatar (in virtual meters) was controlled for to rule out 325 283 confounds due to height differences. 284

First, we wanted to ensure that participants found that the avatar 327 285 looked more like them in the experimental condition than in yoked 328 286 control; indeed, this manipulation check showed that our manip-287 329 ulation was successful (M = 4.39, SE = 0.16 vs M = 2.37, SE = 288 330 0.15; F(1,85) = 85.69; p < .001). However, this did not affect the 289 331 extent to which the avatar seemed realistic (M = 4.06, SE = 0.10332 290 vs M = 3.98, SE = 0.10; F(1,85) = 0.36, p = .55), so differences 333 291 in perceived realism cannot account for any effects on subjective 292 334 experiences. Furthermore, for both the manipulation check and re-293 335 alism, there were no effects of or interactions with gender (Fs <294 336 1.45, ps > .23). 295 337

We analyzed the subjective experiences of: feeling connected and engaged, liking the appearance of the avatar, feeling upset when the avatar was injured, and enjoying the game. First, as can be seen in Figure 7, participants who navigated the maze with their own avatar reported feeling more connected and engaged than those in the yoked control condition (F(1,85) = 14.90, p < .001). There was no effect of or interaction with gender (Fs < 0.21, ps > .64).

Furthermore, as can be seen in Figure 8, participants who navigated the maze with their own avatar also reported liking the appearance of their avatar more than those in the yoked control condition (F(1,85) = 12.89, p = .001).

There was also a trend for women to like the appearance of the 348 307 avatar less than men (M = 3.39, SE = 0.15 vs. M = 3.74, SE = 0.11; 349 308 F(1,85) = 2.90, p = .09); however, this effect of gender did not 350 309 depend on condition (F(1,85) = 1.01, p = .32). Apparently women 310 liked the appearance of the avatar less -whether it was their avatar 352 311 or someone elses- compared to how much men liked the appearance 353 312 of the avatar. 313

Concerning either feeling upset or enjoyment, however, there were no main effects. Specifically, there was no effect of condition or

gender on feeling upset when the avatar was injured by running into a mine or wall (Fs < 1.27, ps > .26) or on enjoyment of the game (Fs < 0.30, ps > .58). There was also no interaction of condition and gender for feeling upset when the avatar was injured (F(1,85) = 0.04, p = .84). However, there was a significant interaction between condition and gender for enjoyment of the game (F(1,85) = 3.81, p = .05). As can be seen in Figure 9, men who were assigned their own avatar tended to enjoy navigating the maze more than men who used someone elses avatar (p = .12), whereas women who used another player's avatar tended to enjoy the game more compared to those women who were assigned to use their own avatar (p = .21).

In contrast to these effects on subjective experience of the users, there were no significant effects of experimental condition (own avatar vs. yoked control) on time to complete the maze, distance travelled in the maze, average speed, number of mines or walls hit, or percent of risky paths chosen (Fs < 0.93, ps > .34). Only one effect of gender approached significance; women were marginally slower (M = 1.44 meters/second, SE = 0.08) than men (M = 1.65 meters/second, SE = 0.06; F(1,85) = 3.55, p = .06); because avatar height was controlled for, this marginal effect is not due to gender difference in height. Furthermore, all other effects of gender were not significant (Fs < 1.90, ps > .17), and it did not interact with condition (Fs < 1.22, ps > .27).

6 Discussion

From previous speculation, users piloting their own avatars (vs. someone elses) would be expected to show more engagement, liking and enjoyment, as well as better performance and care to prevent injury to their avatar. While the current work suggests that users do feel more engaged and connected and also liked their avatar more, the remaining possibilities were not supported. Only men enjoyed playing the game more with their own avatar than someone elses; women actually showed the opposite effect. Moreover, there were no significant effects of any kind on any behavioral factor. Users with their own avatars did not show differences in time to complete the maze, distance traveled, or speed. They also were no more careful with their avatar on any metric we considered collisions with mines, collisions with walls, and ratio of riskier paths (shorter but with more mines) over safer paths.

Across all these measures, a clear pattern emerged: users were more motivated and engaged when they had access to their own avatars, but performance and the care that is taken to prevent the avatar from

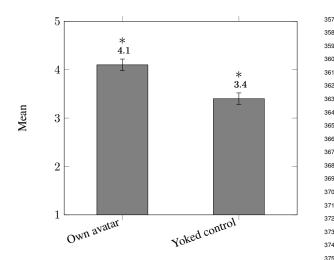


Figure 7: Effect of condition on feeling connected and engaged.

376

396

397

398

399

400

401

402

403

404 405

406

407

408

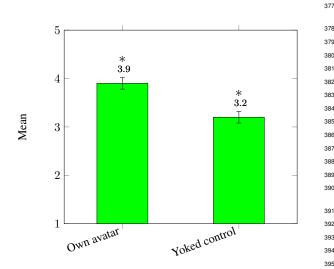


Figure 8: Effect of condition on liking the avatar's appearance.

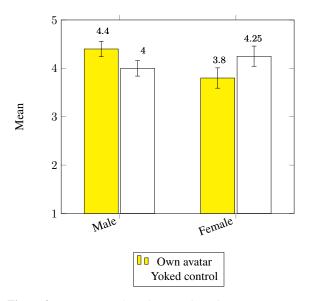


Figure 9: Interaction of condition and gender on enjoyment.

harm were unaffected. There are a number of reasons that this may be the case. First, concerning the latter null effect, it is possible that the crude control method of the avatar prevented users from feeling sufficient responsibility for potential harm that occurred to the character. This seems somewhat unlikely, however, because on average participants reported concern for the avatar above the scale midpoint (M = 3.79). Likewise, while the effort described above focused on modeling the avatar to be realistic, less care was taken to create an engaging background for the task or to ensure the quality of the motion (e.g., when changing directions, appearance of shadow) or ensure that users saw the avatar's face consistently across the game. These factors together could possibly have hindered our ability to find effects of avatar appearance (own vs someone else's); however, because the current study did find effects on some subjective measures, this explanation for the null results holds less weight. More generally though, avatar appearance (own vs someone elses) may truly have no relevance to how users play the game. Evidence from self-reported subjective experience supports this possibility, as participants in the experimental condition reported no greater concern over the avatar being injured than those in the control condition.

However, it is possible that there is an effect on user performance or behavior, but we failed to find it due to chance. Although we had a sufficient sample size to detect a moderate effect, we could have still failed to detect such an effect due to chance. To the extent that the effect is smaller, we would have had a greater chance of failure to detect the effect. Estimates of effect size based on the current data show that, if there is an effect, it is most likely quite small (d 0.1 to 0.2). The practical significance of such a small effect would be limited. Even if such an effect does exist, it may not be large enough to warrant the expense of scanning users on a large scale just to reap benefits on performance and behavior. Rather our results suggest that the significant win that would come from scanning avatars from users would be on motivation and engagement with the simulation.

It is also possible that other tasks would show a larger, and thus perhaps statistically significant, effect of piloting ones own avatar. For example, in contrast to such training exercises, simulations that are more social in nature may show a significant effect of avatar appearance (own vs someone elses). Individuals being asked to negotiate or exchange goods may act more trustworthy if their avatar looks like them. Indeed, having a different body (and thereby being unrecognizable) may afford users a sense of anonymity, which has been shown to reduce concern of being judged for socially undesirable behaviors [Lucas et al. 2014]. Freed from such social pressures when using someone else's avatar, users may be more willing to violate social norms by acting in dishonest or untrustworthy ways during negotiations or other exchanges. To facilitate such subsequent research, additional future work could capture a few key facial expressions as a part of the capture procedure. Further research should address this possibility, as well as explore whether other types of virtual tasks show differences based on avatar appearance (own vs. someone else's).

Along these lines, future studies should also consider if effects of 409 using ones own avatar are found in multi-player situations. For ex-410 ample, an evaluation could be built to resemble a military training 411 simulation where users run practice drills with virtual squad mem-412 bers that look like the real squad members. Although there was no 413 effect in a single player simulation, one might be found when two 414 or more players pilot their own avatars in the same virtual environ-415 ment simultaneously. 416

Research should also further investigate gender differences in this
realm. In spite of stereotypes regarding gender and gaming, women
only exhibited one marginally significant difference in gameplay:
their average speed was marginally lower than men. However, they

did show some differences in subjective experience. Women's en- 479 421 joyment did not seem to benefit from using their own avatar like it 480 422 did for their male counterparts. In fact, women who piloted their 481 423 own actually reported less enjoyment than those who used some- 482 424 one else's. Similar effects have been found in other studies such as 425 [Aymerich-Franch and Bailenson 2014], where women responded 483 426 more poorly to public speaking training that involved seeing their 484 427 own doppelganger give a speech than men. We, and others, may 428 have found such an effect because female users feel more self-486 429 conscious about their bodies: such concerns may detract from their 430 experience using their own avatar. Indeed, anecdotal evidence for 431 488 this possibility presented itself when several female participants re-432 489 ported being dismayed at the appearance of their own avatar, ex-433 pressing a desire to look more attractive when scanned. While this 490 434 anecdotal evidence supports self-consciousness as an explanation, 491 435 another possibility for this result could be that physical features that 436 492 were more important to females were not reproduced as well. This 437 may be especially the case for features such as the hair or the eye- 493 438 lashes etc. which are more prominent in females than males. In the 494 439 current work, the finding that women tended to like the appearance 495 440 of the avatar less than men may speak to this point, but admittedly 496 441 this trend was not qualified by appearance condition (own vs. some-442 one else's). 443 498

However, these results do indicate that both male and female users 499 444 500 experience greater engagement and connection as well as liking 445 while piloting their own avatar compared to someone else's. Ac-446 501 cordingly, modern scanning technology that allows for rapid cre-447 502 ation of 3D characters from human subjects could be used to in-448 503 crease engagement and motivation in training simulations. Users 449 504 may not perform or behave differently in the simulation, but in-450 505 creased engagement and/or motivation from piloting their own 451 avatars could encourage them to train more and, thereby, possibly 452 506 improve learning. 453 507

454 References

- 455 AYMERICH-FRANCH, L., AND BAILENSON, J. 2014. The use of 511
- doppelgangers in virtual reality to treat public speaking anxiety: 512
 a gender comparison. In *Proceedings of the International Society* 513
- 458 *for Presence Research Annual Conference*, Citeseer, 173–186.
- 459 BAILENSON, J. N. 2012. Doppelgangers-a new form of self? *Psy-* 515 chologist 25, 1, 36–38.
- BARAN, I., AND POPOVIĆ, J. 2007. Automatic rigging and anima tion of 3d characters. In *ACM Transactions on Graphics (TOG)*,
 vol. 26, ACM, 72.
- 464 BHARAJ, G., THORMÄHLEN, T., SEIDEL, H.-P., AND
- 465 THEOBALT, C. 2012. Automatically rigging multi-component ⁵²¹
- characters. In *Computer Graphics Forum*, vol. 31, Wiley Online
 Library, 755–764.
- 468 CASAS, D., VOLINO, M., COLLOMOSSE, J., AND HILTON, A.
- 2014. 4d video textures for interactive character appearance. In
 Computer Graphics Forum, vol. 33, Wiley Online Library, 371–
- 471 **380**. 527
- 472 CHRISTOPH, K., DOROTHÉE, H., AND PETER, V. 2009. The
- video game experience as true identification: A theory of enjoyable alterations of players' self-perception. *Communication* 530
- joyable alterations of players' self-perception. *Communication theory 19*, 4, 351–373.
- CUI, Y., CHANG, W., NÖLL, T., AND STRICKER, D. 2012. 532
 Kinectavatar: fully automatic body capture using a single kinect. 533
- ⁴⁷⁸ In Asian Conference on Computer Vision, Springer, 133–147.

- FENG, A., LUCAS, G., MARSELLA, S., SUMA, E., CHIU, C.-C., CASAS, D., AND SHAPIRO, A. 2014. Acting the part: the role of gesture on avatar identity. In *Proceedings of the Seventh International Conference on Motion in Games*, ACM, 49–54.
- FENG, A., CASAS, D., AND SHAPIRO, A. 2015. Avatar reshaping and automatic rigging using a deformable model. In *Proceedings* of the 8th ACM SIGGRAPH Conference on Motion in Games, ACM, 57–64.
- FOX, J., AND BAILENSON, J. N. 2009. Virtual self-modeling: The effects of vicarious reinforcement and identification on exercise behaviors. *Media Psychology* 12, 1, 1–25.
- FOX, J., AND BAILENSON, J. N. 2010. The use of doppelgängers to promote health behavior change. *CyberTherapy & Rehabilitation 3*, 2, 16–17.
- FOX, J., BAILENSON, J., AND BINNEY, J. 2009. Virtual experiences, physical behaviors: The effect of presence on imitation of an eating avatar. *Presence: Teleoperators and Virtual Environments* 18, 4, 294–303.
- HEFNER, D., KLIMMT, C., AND VORDERER, P. 2007. Identification with the player character as determinant of video game enjoyment. In *Entertainment Computing–ICEC 2007*. Springer, 39–48.
- HERSHFIELD, H. E., GOLDSTEIN, D. G., SHARPE, W. F., FOX, J., YEYKELIS, L., CARSTENSEN, L. L., AND BAILENSON, J. N. 2011. Increasing saving behavior through age-progressed renderings of the future self. *Journal of Marketing Research 48*, SPL, S23–S37.
- HOLLINGDALE, J., AND GREITEMEYER, T. 2013. The changing face of aggression: The effect of personalized avatars in a violent video game on levels of aggressive behavior. *Journal of Applied Social Psychology* 43, 9, 1862–1868.

508

509

510

514

517

518

519

520

524

534

- JIN, S.-A. A. 2009. Avatars mirroring the actual self versus projecting the ideal self: The effects of self-priming on interactivity and immersion in an exergame, wii fit. *CyberPsychology & Behavior 12*, 6, 761–765.
- LEE, S., CARLSON, G., JONES, S., JOHNSON, A., LEIGH, J., AND RENAMBOT, L. 2010. Designing an expressive avatar of a real person. In *International Conference on Intelligent Virtual Agents*, Springer, 64–76.
- LI, H., VOUGA, E., GUDYM, A., LUO, L., BARRON, J. T., AND GUSEV, G. 2013. 3d self-portraits. *ACM Transactions on Graphics (TOG)* 32, 6, 187.
- LUCAS, G. M., GRATCH, J., KING, A., AND MORENCY, L.-P. 2014. Its only a computer: Virtual humans increase willingness to disclose. *Computers in Human Behavior* 37, 94–100.
- LUGRIN, J.-L., LANDECK, M., AND LATOSCHIK, M. E. 2015. Avatar embodiment realism and virtual fitness training. In 2015 *IEEE Virtual Reality (VR)*, IEEE, 225–226.
- LUGRIN, J.-L., LATT, J., AND LATOSCHIK, M. E. 2015. Avatar anthropomorphism and illusion of body ownership in vr. In 2015 *IEEE Virtual Reality (VR)*, IEEE, 229–230.
- 2013. Mixamo auto-rigger. http://www.mixamo.com/c/auto-rigger.
- NORMOYLE, A., AND JÖRG, S. 2014. Trade-offs between responsiveness and naturalness for player characters. In *Proceedings* of the Seventh International Conference on Motion in Games, ACM, 61–70.

- 535 Shapiro, A., Feng, A., Wang, R., Li, H., Bolas, M.,
- MEDIONI, G., AND SUMA, E. 2014. Rapid avatar capture and simulation using commodity depth sensors. *Computer Anima*-
- tion and Virtual Worlds 25, 3-4, 201–211.
- STARCK, J., AND HILTON, A. 2007. Surface capture for performance-based animation. *IEEE Computer Graphics and Applications* 27, 3, 21–31.
- SUMNER, R. W., SCHMID, J., AND PAULY, M. 2007. Embedded deformation for shape manipulation. In *ACM Transactions on Graphics (TOG)*, vol. 26, ACM, 80.
- TONG, J., ZHOU, J., LIU, L., PAN, Z., AND YAN, H. 2012.
 Scanning 3d full human bodies using kinects. *IEEE transactions* on visualization and computer graphics 18, 4, 643–650.
- 548 TREPTE, S., REINECKE, L., AND BEHR, K. 2010. Avatar creation 549 and video game enjoyment: effects of life-satisfaction, game
- competitiveness, and identification with the avatar world. In An-
- nual Conference of the International Communication Associa tion, Suntec, Singapore.
- WANG, R., CHOI, J., AND MEDIONI, G. 2012. Accurate full
 body scanning from a single fixed 3d camera. In 2012 Second
 International Conference on 3D Imaging, Modeling, Processing,
- 556 Visualization & Transmission, IEEE, 432–439.
- 557 ZENG, M., ZHENG, J., CHENG, X., AND LIU, X. 2013. Tem-
- plateless quasi-rigid shape modeling with implicit loop-closure.
 In Proceedings of the IEEE Conference on Computer Vision and
- 560 Pattern Recognition, 145–152.