Robots and uncertainty: An investigation into the impact of the aesthetic visualisation on people's trust of robots (#59583)

First submission

Guidance from your Editor

Please submit by 8 May 2021 for the benefit of the authors (and your \$200 publishing discount).



Structure and Criteria

Please read the 'Structure and Criteria' page for general guidance.



Raw data check

Review the raw data.



Image check

Check that figures and images have not been inappropriately manipulated.

Privacy reminder: If uploading an annotated PDF, remove identifiable information to remain anonymous.

Files

Download and review all files from the <u>materials page</u>.

- 9 Figure file(s)
- 1 Raw data file(s)
- 1 Other file(s)

ī

Structure and Criteria



Structure your review

The review form is divided into 5 sections. Please consider these when composing your review:

- 1. BASIC REPORTING
- 2. EXPERIMENTAL DESIGN
- 3. VALIDITY OF THE FINDINGS
- 4. General comments
- 5. Confidential notes to the editor
- Prou can also annotate this PDF and upload it as part of your review

When ready <u>submit online</u>.

Editorial Criteria

Use these criteria points to structure your review. The full detailed editorial criteria is on your guidance page.

BASIC REPORTING

- Clear, unambiguous, professional English language used throughout.
- Intro & background to show context.
 Literature well referenced & relevant.
- Structure conforms to <u>PeerJ standards</u>, discipline norm, or improved for clarity.
- Figures are relevant, high quality, well labelled & described.
- Raw data supplied (see <u>PeerJ policy</u>).

EXPERIMENTAL DESIGN

- Original primary research within Scope of the journal.
- Research question well defined, relevant & meaningful. It is stated how the research fills an identified knowledge gap.
- Rigorous investigation performed to a high technical & ethical standard.
- Methods described with sufficient detail & information to replicate.

VALIDITY OF THE FINDINGS

- Impact and novelty not assessed.
 Negative/inconclusive results accepted.
 Meaningful replication encouraged where rationale & benefit to literature is clearly stated.
- All underlying data have been provided; they are robust, statistically sound, & controlled.
- Speculation is welcome, but should be identified as such.
- Conclusions are well stated, linked to original research question & limited to supporting results.

Standout reviewing tips



The best reviewers use these techniques

-	n
	N

Support criticisms with evidence from the text or from other sources

Give specific suggestions on how to improve the manuscript

Comment on language and grammar issues

Organize by importance of the issues, and number your points

Please provide constructive criticism, and avoid personal opinions

Comment on strengths (as well as weaknesses) of the manuscript

Example

Smith et al (J of Methodology, 2005, V3, pp 123) have shown that the analysis you use in Lines 241-250 is not the most appropriate for this situation. Please explain why you used this method.

Your introduction needs more detail. I suggest that you improve the description at lines 57-86 to provide more justification for your study (specifically, you should expand upon the knowledge gap being filled).

The English language should be improved to ensure that an international audience can clearly understand your text. Some examples where the language could be improved include lines 23, 77, 121, 128 – the current phrasing makes comprehension difficult. I suggest you have a colleague who is proficient in English and familiar with the subject matter review your manuscript, or contact a professional editing service.

- 1. Your most important issue
- 2. The next most important item
- 3. ...
- 4. The least important points

I thank you for providing the raw data, however your supplemental files need more descriptive metadata identifiers to be useful to future readers. Although your results are compelling, the data analysis should be improved in the following ways: AA, BB, CC

I commend the authors for their extensive data set, compiled over many years of detailed fieldwork. In addition, the manuscript is clearly written in professional, unambiguous language. If there is a weakness, it is in the statistical analysis (as I have noted above) which should be improved upon before Acceptance.

Robots and uncertainty: An investigation into the impact of the aesthetic visualisation on people's trust of robots

Joel Pinney Corresp., 1, Fiona Carroll Corresp., 1, Paul Newbury 1

¹ Cardiff School of Technologies, Cardiff Metropolitan University, Cardiff, Wales

Corresponding Authors: Joel Pinney, Fiona Carroll Email address: st20102131@outlook.cardiffmet.ac.uk, fcarroll@cardiffmet.ac.uk

Background

Human senses have evolved to pick-up on sensory cues. Beyond our perception, they play an integral role in our emotional processing, learning, and interpretation. They are what help us to sculpt our everyday experiences and can be triggered by aesthetics to form the foundations of our interactions with each other and our surroundings. In terms of Human-Robot Interaction (HRI), robots also have the 'potential' senses to interact with the environment and people around them. They can offer an 'embodiment' that has the potential to make the interaction with technology a more natural, engaging, and acceptable experience. However, for many reasons, people still do not seem to trust and accept robots. Trust is expressed as a person's ability to accept the potential risks associated with participating with an entity such as a robot. Whilst trust is an important factor in building relationships with robots, the presence of uncertainties can add an additional dimension in the decision to trust a robot. In order to begin to understand how to build trust with robots and reverse the negative ideology, this papers examines the influences of aesthetic design techniques on the human ability to trust robots.

Method

This paper explores the potential that robots have unique opportunities to improve their facilities for empathy, emotion, and social awareness beyond their more cognitive functionalities. Through conducting an online questionnaire distributed globally, we explored participants ability and acceptance in trusting the Canbot U03 robot. Participants were presented with a range of visual questions which manipulated the robots facial screen and asked whether or not they would trust the robot. A selection of questions aimed at putting participants in situations where they were required to establish whether or not to trust a robot's responses based solely on the visual appearance. We accomplished this by manipulating different design elements of the robots facial and chest screens which in turn influenced the human-robot interaction.

Results

We found that certain facial aesthetics seem to be more trustworthy than others (cartoon face versus human face etc.) and that certain visual variables (i.e. blur) afforded uncertainty more so than others. Consequentially, this paper reports that participant's uncertainties of the visualisations greatly influenced their willingness to accept and trust the robot. The results of introducing certain anthropomorphic characteristics emphasised participants embrace of the uncanny valley theory, where pushing the line of human likeness introduced a thin line between participants accepting robots and not. By understanding what manipulation of design elements created the aesthetic effect to trigger the affective processes, this paper further enriches our knowledge of how we might design for certain emotions, feelings and

PeerJ Comput. Sci. reviewing PDF | (CS-2021:03:59583:0:2:REVIEW 4 Apr 2021)

Manuscript to be reviewed



ultimately more socially acceptable and trusting robotic experiences.

- Robots and Uncertainty: An investigation into the
- impact of the aesthetic visualisation on peoples trust
- of robots.

```
4
     Joel Pinney<sup>1</sup>, Fiona Carroll<sup>1</sup>, Paul Newbury<sup>1</sup>
 5
 6
     <sup>1</sup> Cardiff School of Technologies, Cardiff Metropolitan University, Cardiff, UK
 7
 8
     Corresponding Author:
 9
     Joel Pinney<sup>1</sup>
10
      Western Avenue, Cardiff, CF5 2YB, UK
11
      Email address: st20102131@outlook.cardiffmet.ac.uk
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
```

Abstract

44 Background

Human senses have evolved to pick-up on sensory cues. Beyond our perception, they play an integral role in our emotional processing, learning, and interpretation. They are what help us to sculpt our everyday experiences and can be triggered by aesthetics to form the foundations of our interactions with each other and our surroundings. In terms of Human-Robot Interaction (HRI), robots also have the 'potential' senses to interact with the environment and people around them. They can offer an 'embodiment' that has the potential to make the interaction with technology a more natural, engaging, and acceptable experience. However, for many reasons, people still do not seem to trust and accept robots. Trust is expressed as a person's ability to accept the potential risks associated with participating with an entity such as a robot. Whilst trust is an important factor in building relationships with robots, the presence of uncertainties can add an additional dimension in the decision to trust a robot. In order to begin to understand how to build trust with robots and reverse the negative ideology, this paper examines the influences of aesthetic design techniques on the human ability to trust robots.

Method

This paper explores the potential that robots have unique opportunities to improve their facilities for empathy, emotion, and social awareness beyond their more cognitive functionalities. Through conducting an online questionnaire distributed globally, we explored participants ability and acceptance in trusting the Canbot U03 robot. Participants were presented with a range of visual questions which manipulated the robots facial screen and asked whether or not they would trust the robot. A selection of questions aimed at putting participants in situations where they were required to establish whether or not to trust a robot's responses based solely on the visual appearance. We accomplished this by manipulating different design elements of the robots facial and chest screens which in turn influenced the human-robot interaction.

Results

We found that certain facial aesthetics seem to be more trustworthy than others (cartoon face versus human face etc.) and that certain visual variables (i.e. blur) afforded uncertainty more so than others. Consequentially, this paper reports that participant's uncertainties of the visualisations greatly influenced their willingness to accept and trust the robot. The results of introducing certain anthropomorphic characteristics emphasised participants embrace of the uncanny valley theory, where pushing the line of human likeness introduced a thin line between participants accepting robots and not. By understanding what manipulation of design elements created the aesthetic effect to trigger the affective processes, this paper further enriches our knowledge of how we might design for certain emotions, feelings and ultimately more socially acceptable and trusting robotic experiences.

Introduction

In a world where robotics is becoming more prominent, our ability to trust them has never been so important. With the robot's physical appearance drastically influencing our perceptions of trust, a greater awareness of how design elements and their aesthetic effect may trigger what affect processes are imperative. Robots have an exceptional potential to benefit humans within a team, yet a lack of trust in the robot could result in underutilizing or not using the robot at all (Floyd et al., 2014). As Barnes and Jentsch (2010) identified, the key to a successful relationship between man and machines is in how well they understand each other. Understanding can develop through the form and structure of the robot that in turn helps establish social expectations. In addition, a robot's morphology can have an effect on its accessibility and desirability (Fong et al., 2003). The research presented in this paper explores how robot aesthetics can heighten participants ability to trust robots. Participants were introduced to an array of robot visualisations (face and chest) and asked to note their impressions towards each visualisation and whether they trusted the robot. This then enabled the researchers to investigate how design elements and their combined aesthetic arrangement can act as emotional stimuli and the ability to trust each robot. The study explored the impact of different aesthetic enhancements/ adjustments to the robot's appearance to afford trust. In detail, by using various design elements (i.e. colour, blurriness, tone) we were interested in better understanding how we design for the fundamental principles of aesthetic order in human-robotic interaction. We anticipate that uncertainties in and between the visualisations will greatly influence participants willingness to accept the robot (i.e. cohesion of messages, positive and balanced stimuli, non-invasive colours etc.). This paper highlights not only the impact of risks and uncertainties created by the visualisations on the human robot interaction but also the potential of robot aesthetics to commence a trusting relationship.

104 105 106

107

108

109

110

111112

113

114

115

116

117

118

119

120

121

122

123

124

125

82

83

84 85

86 87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

Literature Review

Human robot interaction

Human-Robot Interaction (HRI) is a field dedicate to understanding, designing, and evaluating robotic systems for use by or with humans.' (Huang, 2016, p.1). Yanco and Drury (2002) claims that Human-robot interaction is a subset of the field of human-computer interaction (HCI) and that HRI can be informed by the research in HCI. Scholtz (2002) argues that there are many differences between HRI and HCI, dependent on dimensions in environment, system users and physical awareness. 'The fundamental goal of HRI is to develop the principles and algorithms for robot systems that make them capable of direct, safe and effective interaction with humans.' (Feli-Siefer & Mataric, 2010, p.86). It is the 'effective' interaction which is of interest to the authors of this paper (i.e. the ability to build a trusting relationship through effective human-robot interaction). HRI quality may be strongly dependent on the capacity of the communication channel(s) to carry information between human and robot (Steinfelf et al., 2016). Robotic communication is based on three components, the channel of communication, communication cues and the technology that affects transmission. Information can be communicated through three channels: Visual, Audio, and environmental (Green et al., 2008). The authors of this paper will be focusing on the visual channel of communication and building affective visual communication cues. A socially interactive robot should be able to communicate its trustworthiness through the use of non-verbal signals including facial expressions and bodily gestures (Stoeva and Gelautz, 2020). The face is capable

126

127

128

129

130

131

132

133

134

135

136137

138

139

140 141

142

143

144

145

146

147

148

149

150

151

152

153

154155

156 157

158

159

160 161

162

163

164

165

166

167

168

169

of expressing a range of emotions that that others generally have little difficulty identifying (Hancock et al., 2007). Richert et al. (2018) considers these human-like designs combined with the integration of natural users' interfaces could enhance the overall acceptance and interaction of these technologies. In more detail, Duffy (2003) states a robot's capacity to be able to engage in meaningful social interaction with people requires a degree of anthropomorphism (human-like qualities). As Gurthrie citied in Daminao and Dumouchel (2018) points out, the tendency to see human faces in ambiguous shapes provides an important advantage to humans, helping them to distinguish between friend or enemies and establish an alliance. A robot's appearance can instantly affect how a robot is interpreted by its users, and in turn how the user may interact with the robot (Lupetti, 2017). In terms of human-robot interaction the physical appearance can have an important effect (Canning et al., 2014), yet before humans are able to effectively interact with robots, they must be able to accept and trust them (Billings et al., 2012). This trust is what is of real interest to the authors of this paper, in order to influence how we design for effective trusting relationships between human and robot through their physical and visual appearance.

Aesthetic Interaction

'Aesthetic interaction is not about conveying meaning and direction through uniform models; it is about triggering imagination, it is thought provoking and encourages people to think differently about interactive systems, what they do and how they might be used differently to serve differentiated goal' (Petersen et al., 2004, p.271). For many people, an understanding of a robot is achieved through the senses and the reading of bodily form and gestures, facial and chest screens, and sounds as opposed to only the reading of a screen. As a result, it is very important for us to be able to consider the aesthetic processes involved in our interaction with robots. Research shows that aesthetics can afford the construction of associations and meanings through feelings, intuitions, thoughts, memories etc. (whilst we interact with computers) which we can then stitch together to form a deeper understanding and appreciation of what we are seeing/ experiencing (Carroll, 2010). Indeed, the aesthetic-interaction can promote a relationship between the user and the computer (i.e. robot) that encapsulates a person's full relationship sensory, emotional, and intellectual. In doing so, it can entice an 'engaged interaction' which can change the user's perceptions and interpretations (Carroll, 2010). In our human-robotic interactions, the authors of this paper feel that the aesthetic provides many opportunities to enhance our human-robotic experiences particularly our trust and acceptability of robots. As Prinz cited in Holmes (2017) points out, our conscious experience consists of perceptions with shades of feelings – objects (such as robots) can be comforting or scary, sounds are pleasing or annoying, our body feels good or bad - which all can play a crucial role in guiding our behaviours. According to Moors et al. (2013), the basic premise of appraisal theories is that emotions are adaptive responses, which reflect our appraisals of features of the environment/events that are significant for our wellbeing. Essentially, emotions are elicited by evaluations (appraisals) of how events and situations relate to our important goals, values, and concerns. Scherer (2009) suggests that there are four major appraisal objectives that an organism needs to reach to adaptively react to a salient event: relevance (i.e. how relevant is this event for me?), implications (i.e. what are the implications or consequences of this event and how do they affect my well-being, and so on?), coping potential (i.e. how well can I cope with or adjust to these consequences?) and normative significance (i.e. what is the significance of this event for me-concept and for social norms and

171

172

173

174

175

176

177

178

179

180

181

182

183 184

185

186

187

188

189

190

191 192

193

194

195

196

197

198199

200 201

202

203

204

205

206

207

208

209

210

211

212

values?). Interestingly, each emotion has a unique appraisal structure. For example, the aesthetic emotion interest involves two appraisals (Silvia, 2005): appraising an event as new, complex, and unfamiliar (a high novelty-complexity appraisal) and as comprehensible(a high coping-potential appraisal). Interest causes an emotional and motivational state that facilitates exploration, engagement, and learning (Silvia, 2008); it reflects both the emotional and cognitive aspects of engagement(Ainley, 2012). In terms of the aesthetic emotion of knowledge, firstly, the emotions stem from people's appraisals of what they know, what they expect to happen, and what they think they can learn and understand (Silvia, 2009). Secondly, the emotions, for the most part, motivate learning, thinking, and exploring, actions that foster the growth of knowledge (Silvia, 2009). It is generally agreed that the aesthetic information process starts with input from a stimulus, then continues through several processing stages (i.e. Connected to deeper memorial instances) and ends in the final decision-making (i.e.an evaluative judgement of the stimulus) (Markovi´c, 2012). Locher (2015) describes the aesthetic experience as occurring in two stages. Firstly, an initial exposure to the artefact where a viewer spontaneously generates a global impression/gist of the work and secondly, where aesthetic processing ensues (i.e. directed focal exploration to expand knowledge and contribute to a viewer's interpretation, aesthetic judgement, and emotions regarding the artefact). In his thought-provoking paper" Feeling and Thinking: Preferences Need No Inferences" Zajonc (1980) discusses the possibility that the very first stage of the organism's reaction to stimuli and the very first elements in retrieval are affective. In 1980, he claimed that it is possible for us to like something or be afraid of it before we know precisely what it is and perhaps even without knowing what it is. Since then, many researchers have explored what has become known as automatic affective processing; the idea that organisms are able to determine whether a stimulus is good or bad without engaging in intentional, goal-directed, conscious, or capacity demanding processing of the (evaluative attributes of the) stimulus (DeHouwer and Hermans, 2001). In light of this, it follows that the appraisal is inherently transactional: It involves an interaction between the event and the appraiser (Lazarus, 1991). Importantly, the emotions are elicited according to the way a person appraises a situation (Ellsworth, P. C., & Scherer, 2003). Significantly, however, research shows that certain aesthetic elements can trigger cognitive and affective processes into motion to influence aesthetic appraisals and more especially how a person aesthetically appraises a situation (Blijlevenset al., 2012). In fact, stimuli that evoke aesthetic responses are always composites of multiple elements that don't ordinarily occur together and when they do, their joint effect is different in kind from the separate effects of the individual elements (Mechner, 2018). In terms of visual elements such as colour, line, form, and composition priming certain emotions, Melcher and Bacci (2013) found that there is a strong bottom-up and objective aspect to the perception of emotion in abstract artworks that may tap into basic visual mechanisms. In his book, James (2018) considered aesthetic emotions to be the immediate and primary sensory pleasure resulting from exposure to a stimulus. Therefore, we ask, can these aesthetic emotions/interactions, in turn, influence how robots are received and how we make decisions to trust them? Indeed, apart from the logical schemes and sense perception, there is also a powerful 'felt' dimension of experience that is prelogical, and that functions importantly in what we think, what we perceive, and how we behave (Cox and Gendlin, 1963). What is of real importance to the authors of this paper is the interplay between the aesthetic, cognitive, and affective

processes in how we make decisions to trust a robot; in particular, how the in-take of aesthetic information from a robot's facial and/or chest visualisation can influence how we trust the robot.

Trust, Risk and Uncertainty

213214

215216

217218

219

220

221

222

223

224

225

226

227

228

229

230

231

232

233

234

235

236

237

238

239

240

241

242

243244

245

246

247248

249

250

251

252

253

254

255

256

"Trust is a phenomenon that humans use every day to promote interaction and accept risk in situations where only partial information is available, allowing one person to assume that another will behave as expected." (Cahillet al., 2003, p.53). For many people, trust is the ability to hold a belief in someone and/or something can be counted upon and dependable, by accepting a level of risk associated with the interaction of another party (Paradedaet al., 2016). A willingness to potentially become vulnerable to the actions of others, based on the expectation that the trusted party will perform actions essential or necessary to the trustor (Mayer et al., 1995). According to Gambetta (2000), trust can be summarised as a particular level of subjective probability with which an agent assesses another in performing a particular action. That trust implicitly means the probability that an action by others will be beneficial enough to consider engaging in cooperation with them de-spite the risks. Indeed, trust can be evaluated as a probability; however, itis nevertheless a cerebral contract between trustee and trustor that develops within relations between humans (Coeckelbergh, 2012). In terms of the robot aesthetic, the authors of this paper feel that we have a unique opportunity to further enrich our knowledge of how designing for trust may afford a unique robotics experience. In situations such as trusting robots where a person's past behaviours and reputations are unknown, we acquire other sources of information to determine a person's motivations (DeSteno et al., 2012). These other sources of information are used to communicate understanding, which can be done through the use of empathy. As Lee (2006) points out an agent who appears to empathetic are perceived as more trustworthy. likeable, and caring. As robots do not possess the ability to build traditional relationships with humans; they, therefore, rely heavily on visual appearance to portray their trust. As Lee (2006) reported human to human perceptions of trust is widely reliant on the empathy they have for one another. Research shows that a common way in which people convey empathy is in the use of their facial expressions (Riek and Robinson, 2008). In robot-human interaction, research has shown that facial features and expressions can portray important information about others trustworthiness (Valdesolo, 2013). For this paper, it highlights the importance of considering the design elements to initiate positive affective processes. Research by Merritt and Ilgen (2008) shows that widespread implementation of automated technologies has required a greater need for automation and human interaction to work harmoniously together. The conclusion has supported that individuals will use machines more if it trusted compared to those they do not .it. is generally been agreed that where there is trust there is risk, as Gambetta (2000) indicated trust is a probability, as you determine the level of risk you can make alternations to the probability of trustworthiness. Lewis et al. (2018) states the introduction of anthropomorphism poses serious risks, as humans may develop a higher level of trust in a robot than is warranted. Additionally, risks do not always reflect real dangers, but rather culturally framed anxieties originating from social organisation Wakeham (2015). Interestingly, research by Robinette et al. (2016) shows in certain situations a person may over-trust a robot while mitigating risks and disregarding the prior performance of the robot. However, another dimension of trust is un-certainty. According to Wakeham (2015) who described being uncertain as having an obscured view of the truth, with a limit on what an individual might know. Uncertainty can cause a restriction in the ability to trust;

Ţ.

with uncertainty you are unable to know all that can happen, resulting in trust becoming a leap of faith (Nooteboom, 2019). The decision whether or not to trust a robot based on the uncertainty presented can trigger ethically adjusted behaviours that aims to avoid dangers and minimise potential risk (Tannert et al., 2007). Viewing uncertainty from a psychological perspective presents both subjective uncertainty and objective uncertainty. Subjective uncertainty represents the feelings of a person, while objective is concerned with the information a persons has (Schunn and Gregory, 2012). In more detail research has show how uncertainty influences people's ability to trust (Glaser, 2014), yet in the same way trust is a way of dealing with uncertainty and objective risks (Frederiksen, 2014).

Materials and Methods

This study was conducted at Cardiff Metropolitan University from the 31st of March 2020 to the 15th of April 2020 and was designed to capture the perception of participants feelings and attitudes towards trusting robots. The study was conducted using the powerful online survey software: Qualtrics. A total of seventy-four participants from the age of 16 plus years (50 Female & 24 Males) completed the study from a varied demographic. Participants resided globally (i.e. Europe, Africa, Asia, Australia, North American and South America) and captured an assortment of participants with and without robotic knowledge or experience. The study took approximately thirty minutes in duration. All graphics were generated using adobe photoshop and the study and questions asked had a strong aesthetic visual component.

The study mainly consisted of quantitative questions in order to provide summaries through descriptive statistics. Additionally, an assortment of questions required participants to engage in qualitative questions which then enabled a thematic analysis to enrich interpretations and uncover similarities. The questions were separated into two categories to target both the general acceptance of robotics and specific questions relating to the Canbot U03 robot. The order of the questions was designed to firstly empathise and generate an understanding of the participants acceptance of robots. In order to not influence a participant's feelings and past experience with robots, the Canbot U03 was not shown during the first block of questions.

Once participants had concluded the initial preparatory questions, they were introduced to the opening visual of the Canbot U03 robot. Participants were presented to a Canbot U03 (see fig.1) with no visual modification and asked whether or not they would trust this robot based on its visual appearance (i.e. only based on the design features).

Figure 1

Participants were then presented with a series of questions with different aesthetic modifications throughout. The first modifications came with the Canbot U03 robot presented with a series of cartoon facial expressions portraying different emotions. Participants were prompted to identify the robot's emotion and whether or not they felt the robot was more or less trusting than before. To detail, questions such as the following were asked to participants: How trusting is this robots appearance?, What emotion do you think the robot is feeling?, Does this visual change affect your ability to trust the robot?, How does the robot make you feel with this appearance? Participants were also asked to provide descriptions on the following questions What characteristics do you believe only robots should have? How do you design a robot that people would trust?

Figure 2:

The following block of questions prompted participants to consider the anthropomorphic characteristics of the robot (see fig.2). Participants were introduced to a series of robots that related to having human features, these questions probed participants for their feeling towards these powerful visual modifications.

The next section of questions was relating to the how the design element colour influenced a participant's opinions and descriptive of the robot. This required participants to associate words (i.e. dangerous, happiest, trusting, unpredictable, unrealistic) with an array of Canbot U03 robots with different colours hues. Participants were presented with 8 robot visualisations (see fig.3) all with varying colour hues (i.e. Pink, orange, blue, yellow etc..) and prompted to associate the expressive wording with an individual Canbot, no Canbot or all Canbots.

Participants were also introduced to a range of visualisations with contrasting images such as conflicting facial expression and chest screen imagery (i.e. Happy facial expression + Danger symbol on the chest). Participants were asked a series of questions such including: Which Canbot would you describe as most uncertain, What impact did the cohesion of screens have on your decision?, Does the facial expression overrule the icon on the chest screen when considering the Canbots emotions?. These questions were aimed at understanding how the level of cohesion between chest screen and facial screen can influence a participant's willingness to trust the robot.

Finally, to probe the concept of risk further, participants were presented with mathematical problems which would be too complex for human calculation (i.e. 887x974 & 997x1066). Participants would then be asked to identify which Canbot (A-H) was displaying the correct solution upon their chest screen. This question required participants to determine the answer they deemed correct based solely on trusting the robot's physical appearance. Optional text boxes were provided throughout questions to allow participants to expand and express opinions on the robot's appearances.

The Ethics Board at Cardiff Metropolitan University approved the study (CST_2020_Staff_0002) and participants involved were all provided and singed an online consent form to participate in the study and for the academic use of the non-identifiable data.

Results

The observations indicate that a participant's willingness to trust a robot was heavily impacted on the aesthetic elements that they were exposed to, and whether or not the participant had past experiences with robots. When asked about Figure 1, fifty percent of participants said they

would trust this robot, twenty-eight percent were unsure, and the remaining twenty-two percent recorded that they would not trust the robot. Interestingly, anthropomorphism did not encourage more to trust the robot. Figure 2 (Robot B) shows how the introduction of the face impacted participants who first trusted the robot, twenty of the thirty-seven (fifty-four percent) of participants who first trusted were now non-trusting or uncertain to trust the robot. However, anthropomorphism did have a positive influence on those unsure to trust the first robot (Figure 1), with fifty-two percent changing their opinion from 'unsure' to 'yes' to trust. In the human-like visualisations, it seemed participants had different opinions on how robots should be designed for trust. One participant (P72) said, 'Less human-like as this makes them feel more deceptive' while another described human-features as 'creepy' and 'People may become intimidated by implementing human behaviours into a machine'.

intimidating'.

When asked Would you trust this robot? and What do you think this robot feels

Figure 4:

When probed further into how designing for trust participants said, 'Give them their own

personality that isn't based on human expression 'and that 'human features make the model

'creepy'. One participant notes that the introduction of realistic human face 'makes people

uneasy'. Human eyes graphs in the human-eyes visualisation (see figure 2) participants were

asked their feelings on realistic eyes. 80 percent of participants expressed their dislike of this

appearance, making them feel 'confused, scared, worries and surprised'. One participant noted

'the need for distinction between human and robot' and the inclusion of human likeness may be

446 <u>Figure 5:</u>

In the blurry face visualisations (figure 5), it appeared participants were more apprehensive to trust the robot. The findings show that half of the participants were able to correctly identify the robot's emotional cue as 'happy' despite the introduction of blurriness, while the other half of participants were torn between 'confused, angry, uncertain, uneasy and uncomfortable' for the which emotion the robot presented. The introduction of the dissimilar stimuli of the happy facial expression and the blurriness presented participants with uncertainties through the contrasting messages each presents (i.e. Happy face – trust, blurriness – uncertain). When prompting participants away from identifying which emotion the robot depicted to how these changes made them feel, the results were clearer. Participants concerns were expressed when their feelings on how this Canbot made them feel mostly included terms such as uncertain, uneasy, and confused.

Figure 6:

In addition, the findings show different impressions towards facial features when faced with the decision to trust (i.e. What robot is providing you with the correct information?). Interestingly sixty-six percent of participants selected robot B (Figure 6) as the most trusting, despite the introduction of a hybrid robot (Robot D - Figure 6). Robot five was the next most accepted (fifteen percent), yet on closer inspection participant's speed to answer this question was significantly higher (fifty percent increase) than other responses, thus indicating the potential use of a calculator to

determine the correct answer to the equation. With further probing of the concept of trust participants said, 'Give them their own personality that isn't based on human expression' and that 'human features make the model 'creepy'. One participant notes that the introduction of realistic human face 'makes people uneasy'.

Figure 7:

Similar results were seen in Figure 7, with the alterations to the chest screen affording uncertainty to trust the robot to give the correct answer. We asked participants which of the 6 robots posed the correct answer to the equation 997*1066. Sixty-four percent of participants selected robot B (the robot with limited visual modifications) as most trusting despite it providing incorrect information.

Moreover, participants felt that in order for a robot to be trusting there is a need for 'a screen that clearly shows the message that is being transmitted' and that 'I would expect the screen display to match with any expressions'. In terms of harmony between face and chest screen, one participant highlighted that 'It would be difficult to trust a robot with a face and another image within the robot screen. I would trust better with just one option.' In particular, when exposed to figure 7, participants felt that the facial expressions produced a contradicting message to the one upon the chest screen. With sixty percent of participants declaring the robot as untrustworthy and a further thirty-eight percent unsure whether or not to trust the robot. One participant could not trust the robot as 'I could not take anything this bot says seriously with that expression'. This highlights the true impact of the misaligned messages on participants ability to trust.

Figure 8:

Discussion

In this study we investigated the impact of the aesthetic order of facial and chest visualisations on participants willingness to trust robots. In particular, it considered the potential risks and uncertainty afforded by certain aesthetic orders to the human-robotic trusting relationship. Our results showed the clear influence that past experience had on a participant's willingness to trust the original robot. Particularly, the visualisation with no modifications were found to have a substantial higher percentage of trust in those with past experience. Participants with no past experiences were relying solely on the visual appearance to determine their level of trust. These findings are in line with what Sanders et al., (2017) hypothesizes and found, in detail, how those participants with past robotics experience would lead to a higher trust of robots and a better positive attitude towards them.

Interestingly, we found that a blurred facial expression was a significant influence on whether participants trusted a robot. In both the blurred facial and chest screen visualisations afforded uncertainty and resulted in a participant's unwillingness to trust a robot.

Based on previous research that shows colours can influence various moods (Kurt & Osueke, 2014), we predicted similarly that the aesthetic element colour could initiate different affective responses when applied to a robot. Through introducing participants to an array of robot visualisations that applied an assortment of distinct colour changes we tested that hypothesis. We found that comparably participants were following known psychology of colour associations when selecting what feelings and wordings they associated to the robots with the assortment of colours. For example, figure 10 displays the words participants associated with the array of colours and other visual modifications. As we hypothesized certain colours have followed the known associations of related words, such as when participants were promoted to associate the red colored robot to a particular word. Following the commonly known western culture word associations with the colour red (i.e. dangerous, excitement, festive) (Cousins, 2012), we evaluated its affect while present on a robot outer shell and found a similar result of red being

associated with the term dangerous.

Figure 9:

However, it is important to consider how cultural beliefs and geographical regions may also have an influence on a person's perceptions of colour. A particular colour hue can have multiple meanings and interpretations to people in different regions of the world (Kurt & Osueke, 2014). It is critical that when designing a robot to afford trust that these cultural backgrounds, geographical location, and beliefs are carefully considered when selecting a robot's hue to be fit for purpose. Additionally, it is important that this same level of consideration is taken for other design elements, to evaluate how the different designs are perceived in different regions, backgrounds, and faiths.

The research has also highlighted the importance of cohesion between the facial screen and chest screen. In the question prompting participants to consider the information on the chest screen (see figure 7) the participants were never asked whether or not they trusted the robot as a whole, only if they trusted the information on the screen, yet the negative stimuli released by the facial expression had demonstrated a majority of participants declaring the robot as not trustworthy. Moving forward when designing a robot that can be trusted it is important to consider all elements, as stimuli from other visual outputs can potentially influence an independent communication channel.

Conclusion and future work

This research has shown that robots have the unique ability to create an emotional connection with human through the use of facial expression and aesthetics. As documented, we have seen the introduction of anthropomorphism which creates a fine line between increasing

trustworthiness and becoming 'scary'. Nevertheless, the non-physical humanlike anthropomorphic designs (cartoon designs) encourage participants to further trust the robots, showing the unique ability to improve their facilities for empathy. Moreover, this research has shown that the face is not the sole visual aesthetic that can be utilised to initiate affective processes. The chest screen provides an additional entity to further enrich the potential to provide an engaging experience. Ultimately, the cohesion between the multiple screens is an important consideration for the design of socially acceptable robots. As is the design elements and principles and understanding how their aesthetic order can play such an important role in initiating a trusting robotic experience.

Going forth we feel there may be interest in replicating the study but utilising actual robots. We feel this study paves the way for future studies that involve aesthetic data physicalization, where further sensory cues can be tested to evaluate their influence on our trusting ability of robots. Additionally, this research touched upon how design elements may influence different participants from different cultural backgrounds, geographical locations, and beliefs, we feel it would be of interest to explore this further to make develop robots which are culturally appropriate.

appropriate.
 Moreover, it would be interesting to further expand on the use of aesthetic designs to evaluate
 how further modifications (i.e. different colour tones, design elements, design principles etc.)
 can affect and in some case increase a participant's willingness to trust a robot.

Acknowledgements

We would like to take this opportunity to thank the Eureka Robotics Lab for their continued support. As one of the flagship research clusters at the Cardiff School of Technologies, EUREKA Robotics Lab is the innovative research hub nested in the School of Technologies, Cardiff Metropolitan University, serving Wales and global stakeholders (EUREKA Robotics Lab, 2021).

References

- 1. Floyd, M., Drinkwater, M.W., Aha, D. W. (2014). Case-based behavior adaptation using an inverse trust metric, AAAI Workshop Technical Report.
- Barnes, M., Jentsch, F. (2010). Human-Robot Interactions in Future Military Operations,
 Ashgate Publishing Company.
- 3. Fong, T., Nourbakhsh, I., Dautenhahn, K. (2003). A survey of socially interactive robots, Robotics and Autonomous Systems, 42, 3-4.
- Huang, W. (2016). When HCI Meets HRI: the intersection and distinction, Proceedings
 of the 9th Nordic Conference on Human-Computer Interaction, 1-8.

- 5. Yanco, H. A., Drury, J. L. (2002). A Taxonomy for Human-Robot Interaction
- Engineering.
- 6. Scholtz, J. (2002). Human Robot Interactions: Creating Synergistic CyberForces, Multi-
- Robot Systems: From Swarms to Intelligent Automata, 177–184.
- 7. Feli-Siefer, D., Mataric, M.J. (2010). Human-robot interaction, IEEE Robotics and
- Automation Magazine 17(2).
- 8. Steinfeld, A., Fong, T., Kaber, D., Lewis, M., Scholtz, J., Schultz, A., Goodrich, M.
- 654 (2006). Common metrics for human-robot interaction, HRI 2006: Proceedings of the
- 655 2006 ACM Conference on Human-Robot Interaction, 33-40.
- Green, S. A., Billinghurst, M., Chen, X., Chase, J. G. (2008). Human-Robot Col-
- laboration: A Literature Review and Augmented Reality Approach in Design,
- International Journal of Advanced Robotic Systems, 5, 1-18.
- 10. Stoeva, D., Gelautz. M. (2000). Body language in affective human-robot inter-action,
- ACM/IEEE International Conference on Human-Robot Interaction, 606–608.
- 11. Hancock, J. T., Landrigan, C., Silver, C. (2007). Expressing emotion in text-
- basedcommunication, Conference on Human Factors in Computing Systems -
- Proceedings, 929–932.
- 12. Richert, A., Müller, S., Schrode, S., Jeschke, S. (2018). Anthropomorphism in social
- robotics: empirical results on human–robot interaction in hy-brid production workplaces.
- AI, and Society 3 (3), 413–424.
- 13. Duffy, B. R. (2003). Anthropomorphism and the social robot, Robotics and Autonomous
- Systems, 42, (3-4), 177–190.
- 14. Guthrie, L. cited in Damiano, P. Dumouchel. (2018). Anthropomorphism inhuman-robot
- 670 co-evolution, Frontiers in Psychology 9, 1–9.
- 15. Luptetti, M. L. (2017). Available at https://interactions.acm.org/blog/view/robots-
- aesthetics-and-heritage-contexts (accessed 05/05/2020).
- 673 16. Canning, C., Donahue, T. J., Scheutz, M. (2014). investigating human perceptions of
- robot capabilities in remote human-robot teamtasks based on first-person robot video
- feeds, IEEE International Conference on Intelligent Robots and Systems, 4354–4361.

- 17. Billings, D. R., Schaefer, K. E., Chen, J. Y., Hancock, P. A. (2012). Human-robot
- interaction: Developing trust in robots, HRI'12 Proceedings of the 7th Annual
- ACM/IEEE International Conference on Human-RobotInteraction, 109–110.
- 18. Cahill, V., Gray, E., Seigneur, J. M., Jensen, C. D., Chen, Y., Shand, B., Dimmock, N.,
- Twigg, A., Bacon, J., English, C., Wagealla, W., Terzis, S., Nixon, P., Serugendo, G. Di
- Marzo., Bryce, C., Carbone, M., Krukow, K., Nielsen, M. (2003). Using trust for secure
- collaboration in uncertain environments, IEEE Pervasive Computing 2 (3).
- 19. Paradeda, R. B., Hashemian, M., Rodrigues, R. A., Paiva, A. (2016). how facial
- expressions, and small talk may influence trust in a robot, Lecture Notes in Computer
- 685 Science, 9979 LNAI, 169–178.
- 686 20. Mayer, R. C., Davis, J. H., Schoorman, F. D. (1995). Model of Trust, Management 20 (3),
- 687 709–734.
- 688 21. Gambetta, D. (2000). Can We Trust Trust? Trust: Making and Breaking Co-operative
- Relations, 213–237.
- 690 22. DeSteno, D., Breazeal, C., Frank, R.H., Pizarro, D., Baumann, J., Dickens, L., Lee, J.J.
- 691 (2012). Detecting the Trustworthiness of Novel Partners in Economic Exchange,
- 692 Psychological Science 23 (12), 1549–1556.
- 23. Lee, B. (2006). Empathy, androids and 'authentic experience', Connection Science 18
- 694 (4), 419–428.
- 695 24. Riek, L. D., Robinson, P. (2008). Real-time empathy: Facial mimicry on a robot, ACM
- Workshop on Affective Interaction in Natural Environments (AFFINE) at the
- 697 International ACM Conference on Multimodal Inter-faces (ICMI 08), 1–5.
- 698 25. Valdesolo, P. (2013). what body language indicates 'Trustworthy', Available at
- 699 https://www.scientificamerican.com/article/psychologist-uncover-hidden-signals-of-trust-
- 700 *using-a-robot/*, (accessed 04/05/2020).
- 701 26. Merritt, S.M., Ilgen, D.R. (2008). not all trust is created equal: Dispositional and history-
- based trust in human-automation interactions, Human Fac-tors 50 (2), 194–210.
- 703 27. Lewis, M., Sycara, K., Walker, P. (2018). The Role of Trust in Human-RobotInteraction,
- Studies in Systems, Decision and Control, 117, 135–159.
- 705 28. Wakeham, J. (2015). Uncertainty: History of the Concept, second edi Edition, no.
- November, Elsevier.

- 707 29. Robinette, P., Li, W., Allen, R., Howard, A.M., Wagner, A. R. (2016). Overtrust of
- robots in emergency evacuation scenarios, ACM/IEEE International Conference on
- 709 Human-Robot Interaction, 101–108.
- 30. Nooteboom, B. (2019). Uncertainty and the Economic Need for Trust, Vol. 42, Brill,
- 711 BOSTON.
- 712 31. Tannert, C., Elvers, H., Jandrig, B. (2007). The ethics of uncertainty, EMBO reports8
- 713 (10), 892–896.
- 32. Glaser, J.E. (2014). Conversational Intelligence: How great leaders build trust & get
- extraordinary results.1st edn. Bibliomotion, New York.
- 716 33. Frederiksen, M. (2014). Trust in the face of uncertainty: a qualitative study of
- 717 intersubjective trust and risk, International Review of Sociology 24 (1), 130–144.
- 34. Sanders, T. L., MacArthur, K., Volante, W., Hancock, G., MacGillivray, T., Shugars, W.,
- Hancock, P.A. (2017). Trust, and prior experience in human-robot interaction,
- Proceedings of the Human Factors and Ergonomics Society, 1809–1813.
- 35. Ainley, M. (2012). Students' interest and engagement in classroom activities. In
- Handbook of Research on Student Engagement.
- 36. Blijlevens, J., Carbon, C. C., Mugge, R., and Schoormans, J. P. (2012). Aesthetic
- appraisal of product designs: Independent effects of typicality and arousal. British
- Journal of Psychology.
- 726 37. Carroll, F. (2010). Designing (for) experiences in photorealistic VR environ-mesne
- 727 Review of Hypermedia and Multimedia.4
- 38. Cox, J. W. R. and Genelin, E. T. (1963). Experiencing and the Creation of Meaning: A
- Philosophical and Psychological Approach to the Subjective. The Philosophical Quarterly
- 730 39. De Houser, J. and Hermans, D. (2001). Automatic affective processing. Cognition and
- Emotion.
- 40. Ellsworth, P. C., & Scherer, K. R. (2003). Appraisal processes in emotion. In Handbook
- of affective sciences.
- 41. James, W. (2018). The principles of psychology. Personality. Culture. Society.
- 42. Lazarus, R. (1991). The Language of Displayed Art. New York: Oxford University
- 736 Press.
- 43. Locher, P. J. (2015). The Aesthetic Experience with Visual Art at FirstGlance.

- 738 44. Markovi´c, S. (2012). Components of aesthetic experience: Aesthetic fascination,
- aesthetic appraisal, and aesthetic emotion. I-Perception, 3(1):1–17.
- 45. Mechner, F. (2018). A Behavioral and Biological Analysis of Aesthetics: Implications
- for Research and Applications. Psychological Record.
- 742 46. Melcher, D. and Bacci, F. (2013). Perception of emotion in abstract artworks: A
- multidisciplinary approach. InProgress in Brain Research.
- 47. Moors, A., Ellsworth, P. C., Scherer, K. R., and Frijda, N. H. (2013). Appraisal theories
- of emotion: State of the art and future development. Emotion Review.
- 48. Petersen, M. G., Iversen, O. S., Krogh, P. G., and Ludvigsen, M. (2004). Aesthetic
- 747 interaction A pragmatist's aesthetics of interactive systems.
- 49. Prinz cited in Holmes, B. (2017). Why be conscious? . . . New Scientist, 234 (3125),
- 749 28–32.
- 50. Scherer, K. R. (2009). Emotions are emergent processes: They require adynamic
- 751 computational architecture.
- 752 51. Silvia, P. J. (2005). What is interesting? Exploring the appraisal structure of interest.
- 753 Emotion.
- 52. Silvia, P. J. (2008). Appraisal components and emotion traits: Examining the appraisal
- basis of trait curiosity. Cognition and Emotion.
- 756 53. Silvia, P. J. (2009). Looking Past Pleasure: Anger, Confusion, Disgust, Pride,
- Surprise, and Other Unusual Aesthetic Emotions. Psychology of Aesthetics, Creativity,
- 758 and the Arts.
- 759 54. Zajonc, R. B. (1980). Feeling and thinking: Preferences need no inferences. American
- 760 Psychologist.
- 761 55. C. D. Schunn and T. J. Gregory. (2012). "The psychology of uncertainty in scientific
- data analysis No Title," in *Handbook of the Psychology of Science.*, F. Feist and M.
- Gorman, Eds. Springer Publishing, pp. 461–485.
- 56. Coeckelbergh "Can we trust robots?" *Ethics Inf. Technol.*, vol. 14, no. 1, pp. 53–60,
- 765 2012, doi: 10.1007/s10676-011-9279-1.

Manuscript to be reviewed

PeerJ Computer Science

57. Cousins, C. (2012). Color and Cultural Design Considerations. Available at: 766 https://www.webdesignerdepot.com/2012/06/color-and-cultural-design-767 considerations/#:~:text=Western%20cultures%20(North%20America%20and,Eastern%2 768 769 0block%2C%20it%20represents%20communism. (Accessed 10/03/2021). 58. Kurt, S., and Osueke, K.K. (2014). "The Effects of Color on the Moods of College 770 Students," SAGE Open, vol. 4, no. 1. 771 772 59. Cardiffmet.ac.uk. (2021). EUREKA Robotics Lab. [online] Available at: https://www.cardiffmet.ac.uk/technologies/Pages/EUREKA-Robotics-Lab.aspx 773 [Accessed 17 March 2021]. 774

Original image of the Canbot-U03 robot



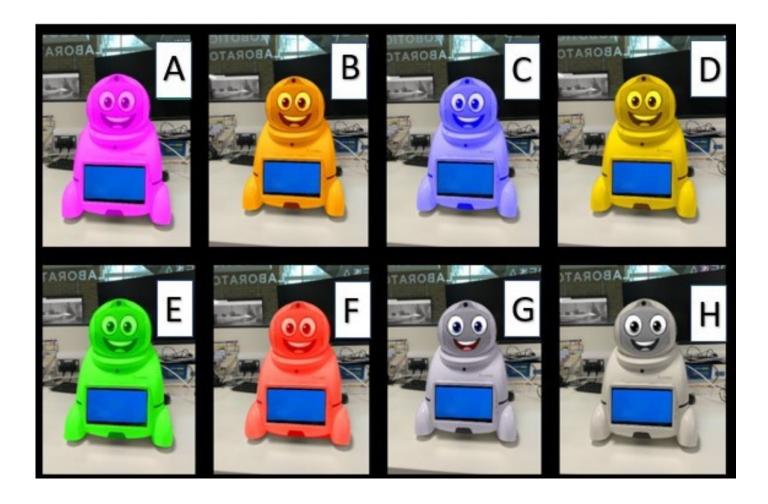
PeerJ Comput. Sci. reviewing PDF | (CS-2021:03:59583:0:2:REVIEW 4 Apr 2021)

Canbot-U03 robot with human eyes modification.



PeerJ Comput. Sci. reviewing PDF | (CS-2021:03:59583:0:2:REVIEW 4 Apr 2021)

Multiple Canbot-U03 robots with different colours hues.

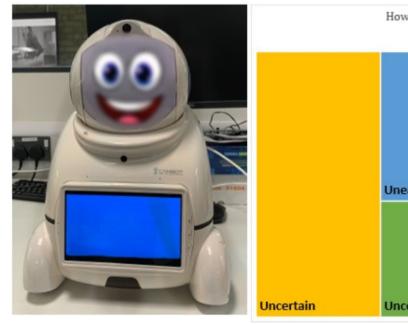


Question to participants: Would you trust this Canbot with the new visual changes?

(A) Indicates participants responses to Canbot with no visual changes. (B) Indicates participants responses to Canbot with smiling cartoon facial expression.

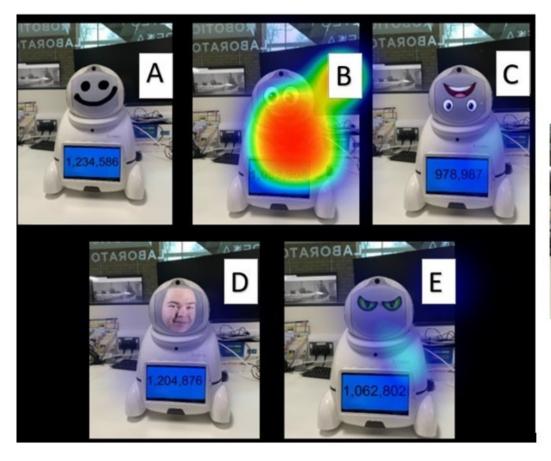
Would you trust this robot?	Robot (A) with no visual changes (original robot)	Robot (B) with enhanced visual changes (Cartoon smiling facial expression)
YES	37	34
No	16	28
Don't Know	21	12

Canbot with Blurry facial expression and tree map diagram displaying responses from "How does this Canbot make you feel?



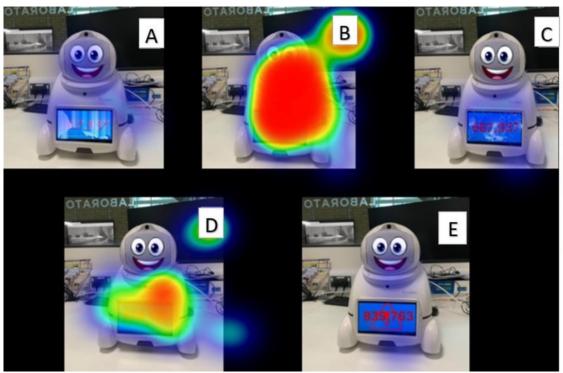


Heatmap displaying participants responses to: What robot would you trust is giving you the correct answer?



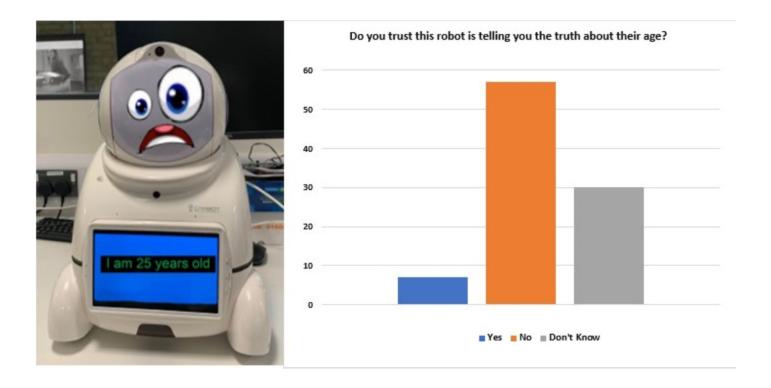


Heatmap displaying participants responses to: What robot would you trust is giving you the correct answer?





Robot with confused facial expression and participants responses to: Would you trust this robot is telling the truth about their age?



Sunburst visualisation displaying the visual modifications and participants associated wording.

