

Influence of Robot’s Interaction Style on Performance in a Stroop Task

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Abstract. For a greater acceptance of robots in home-like environments, there is a great need to adapt the behaviors of the robots to the profiles of the individuals they interact with. In this paper, we investigate the impact of the sensory profile of an individual over the robot styles of interaction displayed by a humanoid robot in a non-verbal word-color Stroop task. The style of interaction is based on different visual and auditory stimuli. The results of a within participants study carried out with 30 participants are reported. Our study suggests that the sensory profile of an individual should be taken into consideration when deciding the style of interaction between a robot and the person. We found statistical results that suggest that there is a difference in performance based on having either a low or high auditory category type.

1 Introduction

More and more research in the field of Human-Robot Interaction (HRI) has focused on adapting the behavior of a robot to the user it interacts with. The adaptation can be based on the personality of the user [14, 16], the affective state of the user [7], or different body signals [9].

One area in which little research has been done in HRI is to adapt the behavior of a robot based on the sensory profile of a user. The Sensory Profile has been developed by Winnie Dunn [3, 4] to measure the responses of children to everyday sensory experiences. Initially the model was developed only for children, but later research showed that it can be applied to adults as well [2]. The model has been conceptualized on the basis of the relationship between a neurological threshold continuum (low and high) and a behavioral response continuum (accordance and counteract). Based on the intersection between the two continuum a four-quadrant model was developed [4].

A low neurological threshold indicates that a low-intensity stimulus is required for an individual to react, while a high neurological threshold requires high-intensity stimulus or a longer time to react to the same stimulus. Accordance indicates that the behavior corresponds with the neurological threshold, while counteracting indicates that the person is responding contrary to the neurological threshold. The four quadrants are: Low Registration (high neurological threshold and accordance), Sensation Seeking (high neurological threshold and

counteract), Sensory Sensitivity (low neurological threshold and accordance), and Sensation Avoiding (low neurological threshold and counteract). Each of these four quadrants is characterized by six sensory processing categories (i.e., taste/smell, movement, visual, touch, activity level, auditory).

In this research, we analyze the visual and auditory sensory processing categories corresponding to all four quadrants. The visual and auditory sensory processing categories have been chosen as they are better suited for an interaction between a robot and a user.

The purpose of the experiment presented in this study is to find a correspondence between the sensory profile of a participant and the style of interaction (based on visual and auditory stimuli) of a humanoid robot in order to improve the participant's performance.

Our paper is structured as follows. Section 2 presents the experimental design of the experiment. The results are shown in Section 3. Finally, Section 4 concludes the paper and offers a perspective on future work.

2 Experimental Design

2.1 Robotic platform



(a) Tiago Robot



(b) Laboratory setup

Fig. 1: (a) Tiago Robot; (b) Laboratory setup

In this experiment, the TIAGo robot (see Fig. 1a) was used [10], which was developed by PAL Robotics¹ in Spain. This version of the robot was customized for the ENRICHME EU H2020 project². It is composed of a mobile base, a lifting torso, a touch-screen, and a head. The head has 2 degrees of freedom, providing pan-tilt movements and it features a RGB-D camera and an Optris thermal camera. The frontal part of the head has a stereo microphone and a speaker (mean sound pressure level 84dB(1W/1m), which were aimed at HRI.

¹ www.pal-robotics.com

² <http://www.enrichme.eu>

2.2 User's Sensory Profile based on AASP Questionnaire

The sensory profile can be measured using the Adult/Adolescent Sensory Profile (AASP) Questionnaire [1]. It consists of 60 questions divided into six groups, each one corresponding to one sensory processing category. Each question is measured on a scale from 1 (almost never) to 5 (almost always). For example, a question from the auditory category is: "I am distracted if there is a lot of noise around". The questionnaire can be given to 3 group ages (11-17 years, 18-64 years, more than 65 years), each with its own scoring key. The sensory processing category in each quadrant is measured on a scale from 1 to 5.

Individuals with high scores in Low Registration need a lower rate of presentation of stimuli so that they have time to detect and process the information. Individuals with low scores do not miss sensory stimuli. High scores in Sensation Seeking means that a person tries to engage actively with the sensory world. In contrast, a person with a low score is not actively involved in intensifying the sensory environment. For a person to perform better a given task, a robot should match the user's sensory profile.

2.3 Scenario

Each experiment started with the experimenter greeting the participants and escorting them to the laboratory where the interaction took place. The experimental region was separated from the rest of the room so as to be sure that there were no distractions for the participants (see Fig. 1b). First, each participant had to sign a consent form in order to take part in the experiment. Once the consent form was signed each participant was asked to fill-in the AASP Questionnaire [1]. Upon the completion of the questionnaire, the experimenter left the experimental region, and the robot explained to the participant what they had to do. When the robot finished with the instructions, the experimenter made sure that the participants understood what they had to do.

For this experiment, a computer based non-verbal word-color Stroop task was developed. This task has been chosen as it was shown in the literature that it can be used as an experimental stressor [11, 13, 15], and no significant differences have been found for gender differences [5, 8]. A variation of the classic incongruent word-color Stroop test [12] was developed, which uses four colors: red, green, blue, and yellow. Each participant performed the Stroop task on the computer monitor that was positioned in front of them. They had to use the mouse to press on the button which corresponded to the color of the text displayed on the screen. Feedback was given after each button press. There was no time limit for answering and for each trial the total number of errors, and the reaction time (RT) was recorded. Once the participant selected the correct color, the next trial began. Each trial consisted of three phases (see Fig. 2): the fixation phase, the stimulus phase, and the inter-trial phase. Before showing the stimulus, there was a 1 second fixation phase. This acted as a warning signal. In [6], the author stated that a warning signal requires a fore period of 0.5 seconds

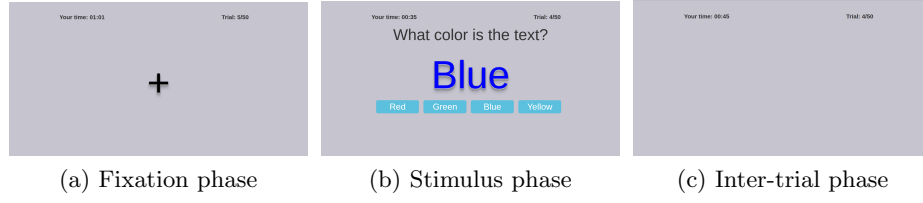


Fig. 2: Stroop task

to fully develop and to lead to the reduction of the RT. The inter-trial period of 1 second acted as a resting period.

Two difficulty levels were developed: easy (congruent Stroop) and difficult (incongruent Stroop). In congruent Stroop the written text matches the color of the text displayed (see Fig. 3a), while in incongruent Stroop the written text does not match the color of the word (see Fig. 3b). For each condition the same number of congruent and incongruent trials were shown in a random order.

After each of the robot’s behaviors the participants had to fill a custom designed questionnaire. It contained multiple Yes/No questions with respect to the amount of auditory and visual stimuli present (e.g., “Were there too many auditory stimuli?”), and 4 questions on a 5-points Likert scale to measure how the participants were affected by the auditory and visual stimuli (e.g., “How were you affected by the auditory stimuli?”) (1 - “Not at All”; 5 - “Very much”), and to assess their perception of the robot’s behavior (e.g., “The robot was stressing.”) (1 - “I disagree completely”; 5 - “I agree completely”).



Fig. 3: Congruent and Incongruent Stroop

2.4 Conditions

In this experiment, we had one condition that did not involve the robot, and two in which the robot displayed different behaviors. The robot used different auditory and visual stimuli in order to influence the performance of the participants.

Each participant performed all 3 conditions. Between each condition there was a short break with some relaxing music. All participants started with the Control condition and continued with the 2 robot conditions. The order of the two robot conditions was randomized between participants.

The movement of the robot was remotely controlled by the experimenter. During the Encouraging Robot condition the robot maintained a fixed position. However, during the Stressing Robot condition, the robot continuously moved back-and-forth in the left side of the participants. It was also controlled to turn around in order to distract the participants.

Condition 1. Control The purpose of the Control condition was for the participants to familiarize themselves with the task in order to counteract the novelty factor. This condition consisted of 60 trials. For this part, the robot was not present in the examination area. The last 20 trials were considered as the control for the RT and errors for each participant.

Condition 2. Encouraging Robot The Encouraging Robot condition consisted of 50 trials that the participants had to perform in the presence of the robot. In this condition the robot displayed both visual (no movement) and auditory (encouraging verbal content, medium volume for robot speech, and no sound for the timer) stimuli. At every 4 seconds the robot said a random encouraging verbal phrase from a given list of phrases (e.g., “I know you can do it”, “Relax”, “Keep up the good work”, “Continue just like that”, “You are progressing really well”). The encouraging content was given no matter how the participant performed. The volume for the speech was set at 50% of the maximum volume of the robot speakers.

Condition 3. Stressing Robot The Stressing Robot condition consisted of 50 trials that the participants had to perform in the presence of the robot. In this condition the robot displayed both visual (movement of the robot) and auditory (stressing verbal content, high volume for robot speech, sound for the timer) stimuli. At every 4 seconds the robot said a random stressing verbal phrase from a given list of phrases (e.g., “Make a choice already”, “What are you doing?”, “Faster, faster”, “Hurry up”, “What is so hard in saying the color of the text?”). The stressing content was given no matter how good or bad the participant performed. The volume for the speech was set at 80% of the maximum volume of the robot speakers. The purpose of the timer was to induce further stress in the participants.

2.5 Hypotheses

Based on the literature review (shown in Section 1) regarding the sensory profile, we propose the following hypotheses:

H1. Participants with low scores in low registration (visual or auditory) will perform better in both Stressing and Encouraging Robot conditions than in the control condition (all trials).

H2. Participants with high scores in sensation seeking (visual or auditory) will perform better in both Stressing and Encouraging Robot conditions than in the control condition (all trials).

H3. Participants with high scores in sensation seeking auditory category will perform better in the Stressing Robot condition than in the Encouraging Robot condition.

H4. Participants with low scores in low registration auditory category will perform better in the Encouraging Robot condition than in the Stressing Robot condition.

2.6 Participants

A total of 35 participants (7 females and 28 males) agreed to take part in this experiment. Due to technical problems encountered during the experiment 5 participants had to be excluded from the analysis. As a result the data from 30 participants ($M = 26.5$, $SD = 5.64$) was further analysed. All participants have a technical background. Before the experiment they were asked how much they knew about robotics, on a scale from 1 to 5 (1=“Not at all” and 5=“Very much”). 11 participants said they knew much or very much about robotics, 13 knew somewhat, while 6 knew a little. 14 participants are from France, 5 from China, 3 from Romania, and 1 from each of the following countries: Brazil, Burkina Faso, Canada, Mexico, Morocco, Russia, Spain, and Tunisia.

Table 1 presents the distribution of the participants based on their sensory processing categories as established by the AASP Questionnaire.

Table 1: Participants distribution based on sensory processing categories

Sensory category	Low Registration	Sensation Seeking	Sensory Sensitivity	Sensation Avoiding
Low Visual	20	17	11	9
High Visual	10	13	19	21
Low Auditory	9	18	6	11
High Auditory	21	12	24	19

3 Experimental Results

As participants had no time limit to complete the Stroop task, the majority of the participants did not commit any errors. Therefore, only the RT for each trial was further analysed. We extracted the mean RT during the congruent Stroop, the incongruent Stroop, and all trials for both encouraging and stressing conditions. As mentioned in Section 2.4, for the control condition we considered only the last 20 trials. Figure 4 shows the RT corresponding to each trial in the two robot conditions for one of the participants.

In order to test hypothesis H1 we applied four Welch Two Sample t-tests on the low auditory and low visual sensory categories for both stressing and

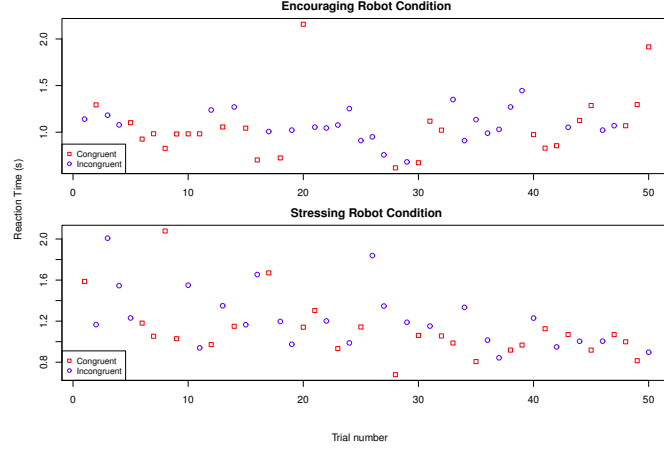


Fig. 4: Reaction times

encouraging conditions for all trials compared to the mean RT for all trials in the control condition. The results are shown in Table 2. Based on these results, our first hypothesis is validated.

Table 2: T-tests analysis for Low Registration

Sensory Category	Control mean	Encouraging mean	t	df	p
Low Visual	1.495438	1.250875	2.4237	30.773	0.02144
Low Auditory	1.741030	1.396309	2.9938	15.592	0.00878
Sensory Category	Control mean	Stressing mean	t	df	p
Low Visual	1.495438	1.234829	2.6883	27.733	0.01201
Low Auditory	1.741030	1.325098	4.0803	12.982	0.00130

For hypothesis H2 we applied the same type of analysis as for H1. The results are shown in Table 3. Based on the results, we can confirm hypothesis H2.

We have found no statistical significance to support hypotheses H3 and H4 (see Table 4), therefore these cannot be validated.

The results show that for both quadrants participants performed better in the Stressing robot condition than in the Encouraging robot condition.

Moreover, we created boxplots of mean RT based on the conditions and the Low Registration and Sensation Seeking quadrants. The results show that participants with low scores performed differently than participants with high scores (e.g., Fig. 5 shows the boxplot for the mean RT in all trials for Low Registration). Participants with high auditory Low Registration performed better than participants with low auditory Low Registration.

Table 3: T-tests analysis for Sensation Seeking

Sensory Category	Control mean	Encouraging mean	t	df	p
High Visual	1.497737	1.269498	2.3626	22.698	0.02711
High Auditory	1.59425	1.35239	2.8233	21.342	0.01008

Sensory Category	Control mean	Stressing mean	t	df	p
High Visual	1.497737	1.263102	2.5509	21.147	0.01855
High Auditory	1.59425	1.320723	3.9411	20.646	0.00076

Table 4: T-tests analysis for H3 and H4

Stroop type	Sensory Category	Encouraging mean	Stressing mean	t	df	p
Congruent	High Auditory	1.22071	1.21187	0.1476	20.344	0.8841
Incongruent		1.48406	1.42957	0.5352	17.758	0.5991
All trials		1.35239	1.32072	0.4052	18.793	0.6899
Congruent	Low Auditory	1.25064	1.19795	0.7045	15.7	0.4914
Incongruent		1.54197	1.45224	0.7481	13.051	0.4676
All trials		1.39630	1.32509	0.7841	14.275	0.4458

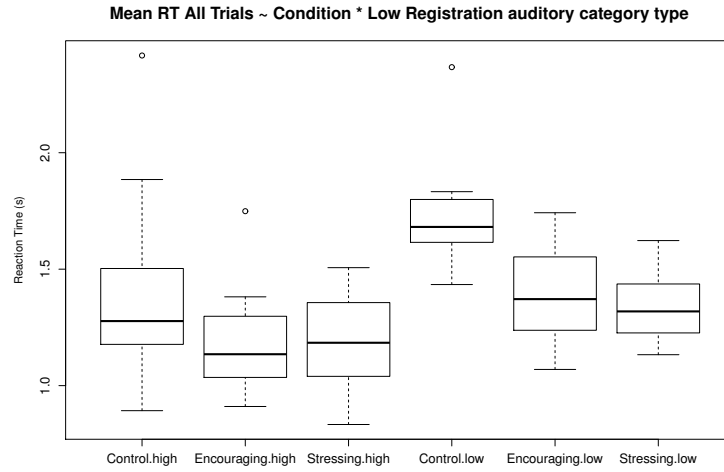


Fig. 5: Mean RT in all trials for Low Registration

Next, we wanted to see if these results are statistically significant. Therefore, we performed pairwise t-tests on the mean RT in congruent, incongruent and all trials for Stroop and used as factors the auditory type for Low Registration and Sensation Seeking. We found statistically significant results for five of our tests (see Table 5).

For each condition we applied one-way ANOVA analysis of variance on the mean RT in congruent, incongruent, and all trials of Stroop task, and used the sensory profile as factors. We considered as factors the sensory categories for each quadrant. The significant results are shown in Table 6.

Table 5: Pairwise t-tests results

Stroop type	Low Registration	Sensation Seeking
Congruent	0.0027	0.061
Incongruent	0.0013	0.0052
All Trials	0.00017	0.0046

Table 6: ANOVA test results

Condition	Quadrant	Sensory category	Stroop type	Sum Sq	Mean Sq	F value	Pr(>F)
Control	Sensory Sensitivity	Auditory	incongruent	1.477	1.477	11.51	0.002**
	Low Registration	Auditory	all trials	0.842	0.843	8.392	0.007**
Encouraging	Low Registration	Auditory	incongruent	0.529	0.529	9.225	0.005**
	Sensation Seeking	Auditory	incongruent	0.42	0.42	6.861	0.014*
	Low Registration	Auditory	all trials	0.303	0.303	7.512	0.01*
	Sensation Seeking	Auditory	all trials	0.24	0.24	5.648	0.024*
Stressing	Sensation Seeking	Auditory	congruent	0.187	0.187	7.201	0.121*
	Sensation Seeking	Auditory	all trials	0.172	0.172	5.402	0.027*

4 Conclusion and Future work

In this paper, we have presented the way in which a robot could use visual and auditory stimuli to increase the performance of a user in a non-verbal word color Stroop task. We performed a within participants study with 3 conditions: control - no robot, encouraging robot and stressing robot. We found that there is a correspondence between the sensory profile of a participant and the interaction style of the robot. Based on the results we can conclude that two of our

hypotheses have been confirmed: H1 and H2, while for the other two hypotheses we have not find any support.

Some of our future work include to find a model based on the sensory profile of a participant and their RTs during the Stroop task. Based on this model we plan to adapt the behavior of the robot in a new condition: Adaptive Robot condition. During this experiment RGB and thermal data were recorded. We plan to analyse the recorded data and to measure the arousal level of the participants.

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