# How Task Complexity and Voice Type Shape Prosodic and Physiologic Cues of Engagement in Human–Machine Dialogue

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#### **Abstract**

This study investigates prosodic cues of user engagement in task-oriented interactions with non embodied conversational assistants. We hypothesize that task complexity and the type of assistant voice (synthetic vs. human) influence user engagement. We measure both vocal and physiological parameters expected to correlate with engagement. We focus on prosodic features such as fundamental frequency, speech rate and intensity, and also explore physiological indicators, including electrodermal activity and heart rate. While we did not observe significant variations in physiological parameters, our results suggest that both voice type and task complexity influence prosodic markers of engagement.

## 1 Introduction

Agents used in a professional context —particularly in industrial environments— have to meet additional constraints. A non-embodied artificial agent is preferred (Feng et al., 2020), as it eliminates visual distractions and allows the user to focus on their primary task. Consequently, the type of artificial agent most commonly used in this context is a conversational assistant (CA). The use of CAs enhances tool efficiency and reduces users' cognitive load (Quigley et al., 2004). Despite these advantages, professionals remain reluctant to use CA. Whether due to fear of being replaced by machines or a rejection of recent technologies, they do not use CA in the long term (Cai et al., 2022). To assess this acceptability, we hypothesise that making a machine more engaging could foster the relationship between user and machine.

## 2 Background

In this study we define engagement as the degree of sustained and goal-directed attention between two interactants over the course of an interaction Sidner

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and Dzikovska (2002). Engagement can be modulated according to different parameters, such as the type of task we perform, which modifies our level of interest (Berger et al., 2023; Peters et al., 2005). Engagement is optimal when skills match the level of difficulty. A difficulty level perceived as too low leads to boredom (Chanel et al., 2008; Kawada et al., 2023; Scherer, 2003; Westgate, 2020) wich occurs when one is under-stimulated. The voice of our interlocutor may also affect us, especially in the case of a CA that lacks a physical embodiment (Tolmeijer et al., 2021; Éva Székely et al., 2023). Human voices are traditionally preferred over artificial ones and are therefore perceived as more engaging. Jansen (2019) shows that the more an entity resembles a human, the greater our affinity. However, when this resemblance reaches a certain threshold, affinity drops sharply. Uncanny valley is the expression used to describe the feeling of strangeness experienced at that time (Jansen, 2019). Our study is set in a context where the CA is not at the center of the interaction but serves to assist the user in their professional task. In addition to being the most logical choice in an interaction with a voice-based system, prosodic parameters had, to our knowledge, never been studied in human-machine interaction. Physiologic parameters, wich have already been studied in both human-human and human-machine interactions(Perugia et al., 2017; Monkaresi et al., 2016; Rani and Sarkar, 2005), unlike prosodic parameters, will allow us to confirm our experimental measurements.

We investigated whether the type of voice and the complexity of the task influenced participants' engagement by studying the prosodic cues in their voices. We hypothesize that using a CA with a human voice in an industrial setting would lead it to fall into the uncanny valley, due to a mismatch between the CA's vocal capabilities and the associated robotic tools. We argue that participants should be more engaged when interacting with the

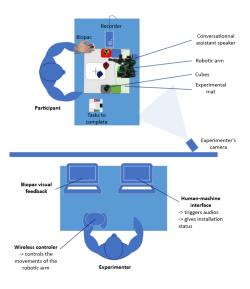


Figure 1: Experimental Set-up

artificial voice rather than the human voice. The second hypothesis is that participants will be more engaged in the interaction if the task complexity is higher, because a task that is too easy may lead to understimulation.

#### 3 Method

The experiment consists of an interaction in French between fluent participants and a robotic arm accompanied by a CA, as illustrated in Figure 1. The arm is operated remotely using a wireless video game controller. The CA is implemented using a Wizard-of-Oz paradigm, meaning that its utterances are triggered remotely to simulate a smooth and natural interaction. Participants are instructed to use their voice to direct the robotic arm to move colored cubes into different designated areas. They are required to complete objective cards by providing the correct movement instructions to the robotic arm.

In order to present more or less engaging conditions to our participants, we defined two levels of task complexity: an easy task, which is supposed to be unstimulating and therefore boring, and a difficult task, which is supposed to be stimulating and therefore engaging. The complexity of the task is adjusted by the complexity of the objective cards. We also tested two different female voices for our CA: a human voice and an artificial voice. Each participant will attend 4 interaction sessions (2 complexity X 2 voices) with the robotic arm accompanied by a CA.

**Participants** Thirty-three participants (24 women and 9 men) were recruited. Each participant received a compensation of €15 for a 90-minute session. Five sessions were excluded from the analysis: one due to improper application of the protocol, four due to faulty recordings.

Participant equipment Participants are equipped with various Biopac measurement tools: an abdominal belt placed below the chest to record respiration; electrodes attached to the second phalanges of the index and middle fingers on the non-dominant hand to measure EDA; and a photoplethysmograph (PPG) on the same hand to record heart rate. A headset microphone connected to a Zoom H4n Pro is also used to record participants' speech.

#### 4 Results

No significant differences were observed in the physiological measures (t-test and ANOVA) neither by voice type or task complexity. Concerning the prosodic parameters, results show sevreal significant differences. The standard deviation of intensity was significantly (p<0.05) higher for the human voice ( $\sim$ 12.06) compared to the artificial voice ( $\sim$ 11.45). Speech rate was faster for the artificial voice, with a rate of around 3.54 syllables per second (SD:  $\sim 0.59$ ), compared to around 3.32 syllables per second (SD:  $\sim$ 0.46) for the human voice (p<0.03). The speech rate was significatively (p<0.02) slower for the difficult task ( $\sim$ 3.30 syllables/second) compared to the easy task ( $\sim$ 3.55 syllables/second). There was a fairly substantial session order effect for EDA.

## 5 Conclusion

The aim of this study is to find engagement cues in the voice of a CA user. To this end, we selected the user's physiological cues correlated with engagement in human-machine interactions and the prosodic cues of the user's voice correlated with engagement in human-human interactions. We compared these parameters as a function of the CA's voice and the difficulty of the task to be performed. While we did not observe significant variations in physiological parameters, our results suggest that both voice type and task complexity influence prosodic markers of engagement.

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