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Accessibility and acceptance of responsive virtual human technology as a survey interviewer training tool

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Abstract

Research on survey non-response suggests that advanced communication and listening skills are among the best strategies telephone interviewers can employ for obtaining survey participation, allowing them to identify and address respondents' concerns immediately with appropriate, tailored language. Yet training on interaction skills is typically insufficient, relying on role-playing or passive learning through lecture and videos. What is required is repetitive, structured practice in a realistic work environment. This research examines acceptance by trainees of an application based on responsive virtual human technology (RVHT) as a tool for teaching refusal avoidance skills to telephone interviewers. The application tested here allows interviewers to practice confronting common objections offered by reluctant sample members. Trainee acceptance of the training tool as a realistic simulation of "real life" interviewing situations is the first phase in evaluating the overall effectiveness of the RVHT approach. Data were gathered from two sources – structured debrief questionnaires administered to users of the application, and observations of users by researchers and instructors. The application was tested with a group of approximately 50 telephone interviewers of varying skill

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and experience levels. The research presents findings from these acceptance evaluations and discusses users' experiences with and perceived effectiveness of the virtual training tool.

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1. Introduction

Responsive virtual human technology (RVHT) involves the use of natural language processing and a behavioral engine to produce natural, interactive dialogues with emotive virtual reality (VR) agents. RVHT has great potential for use in training interaction skills, such as those required for effective survey interviewing. Our understanding of how people interact with responsive virtual humans (a.k.a. embodied conversational agents) is, however, quite limited (see Buisine, Abrilian, Rendu, & Martin (2002), Catrambone, Stasko, & Xiao (2002), Guinn et al. (2004)). Better understanding requires employing RVHT in training applications and conducting systematic use, usability, perception, and training-effectiveness assessments. Important questions yet to be answered include:

- Do embodied conversational agents make learning more accessible?
- How willing are students to accept embodied conversational agents as interactive partners in learning?
- What skills can be acquired, practiced, and validated using RVHT?
- What is involved in providing a convincing simulation of human interaction, realistic enough for the student to suspend disbelief and acquire skills that will transfer to a "live" environment?

Users' interactions with RVHT applications are just beginning to be studied and understood (Ruttkay & Pelachaud, 2004). The research presented here provides an initial assessment of some of the issues associated with user interface design, user acceptance of computer-based training, and perceptions of the effectiveness of the training tool. As part of this assessment, usability assessments were conducted using instructor observations and a structured questionnaire. The assessment involved the use of an RVHT-based training tool for refusal avoidance at the outset of a telephone interview. Approximately 50 telephone interviewers of varying experience levels, ages, genders, races, and educational backgrounds took part in the assessment.

1.1. Previous research on embodied conversational agents

Embodied conversational agents are being used in fields as diverse as computer generated (military) forces (Hill, Chen, Gratch, Rosenbloom, & Tambe, 1998), man-

ufacturing (Regian, Shebilske, & Monk, 1992), medicine (Miksch, Chang, & Hayes-Roth, 1996), and theater (Loyall & Bates, 1997). Embodied conversational agents are only starting to be employed in training on interaction skills, although such skills are critical in a number of fields (Frank et al., 2002; Hubal & Guinn, 2003). Therefore, advanced technologies for training these “soft skills” can be a considerable asset in training. There remain, however, questions that must be answered if embodied conversational agents are to reach the level of sophistication required for robust interaction skills training.

Interaction skills training is certainly a new educational area in which to apply advances in information technology, such as VR and agent technology. To date, VR has been shown to be effective for equipment training (Adams, 1996), maintenance training (Barnett, Helbing, Hancock, Heininger, & Perrin, 2000), simulation of military field exercises and maneuvers (Shlechter, Bessemer, & Kolosh, 1992), and acquisition of spatial knowledge (Regian et al., 1992). It can be used for interaction with unobservable processes or abstract concepts (Dede, Salzman, & Loftin, 1996), tasks that are costly or dangerous to perform (Loftin & Kenney, 1994), and for gaining situation awareness (Maggart & Hubal, 1998). VR systems have become steadily smaller, faster, cheaper, and easier to use (Psotka, 1995). RTI International has integrated a spoken natural language assistant with a VR-based maintenance training environment to enhance ease of use and facilitate instruction (Guinn & Montoya, 1998). Other relevant research efforts in enabling spoken interaction with virtual humans include work done at the University of Pennsylvania (Badler, Phillips, & Webber, 1993), MIT Media Lab (Cassell & Vilhjálmsson, 1999), University of Southern California (Lindheim & Swartout, 2001), and Oregon Graduate Institute (Cole, 1999; Massaro, Cohen, Beskow, Daniel, & Cole, 1998).

RVHT is a relatively recent advance in training technology. Few researchers have begun integrating emotion models with agents (Becheiraz & Thalmann, 1998; Elliott, 1993; Gratch, 2000; Gratch & Marsella, 2004). Portraying emotions in a virtual human, it is argued, requires clearly defined emotional states, action that shows thought processes, and accentuation to reveal feelings (Bates, 1994). In general, lifelike “pedagogical agents” can lead to improvements in problem-solving ability and can engage and motivate trainees (Johnson, Rickel, & Lester, 2000; Lester et al., 1997). Most importantly, RVHT can open entirely new capabilities for computer-based training of interpersonal skills, and can provide the benefits of reduced training costs, individualized tutoring, and greater student convenience that are associated with computer-based training (Hubal & Guinn, 2003).

Today, interaction skills training usually relies on peer-to-peer role playing or passive learning through videos. These approaches lead to a critical training gap, because the students are limited in the practice time and the variety of scenarios that they encounter. Nevertheless, it is exactly this practice that leads to significant on-the-job benefits.

Constraints imposed by most current approaches include insufficient time in the classroom to conduct effective practice sessions, forced and unrealistic role-playing

exercises, and little time or ability for individual feedback and coaching to trainees from the instructor. By using virtual humans to simulate realistic interactions, RVHT increases the amount of time trainees spend acquiring and practicing critical skills, reduces passive learning (information and skills are retained better through active learning), improves the realism of practice sessions, and enables intelligent tutoring (Graesser, Wiemer-Hastings, Wiemer-Hastings, Kreuz, & the Tutoring Research Group, 2000).

We stress that using virtual humans as interaction partners has disadvantages as well as advantages. Most importantly, the current state-of-the-art does not produce fully realistic conversational partners. Advances in utilizing natural language dialog features and behavior models will add tremendously to the realism. From a larger perspective, though, one must understand that virtual training is simply one component of training. Just as a trainee must “skin his/her knuckles” on actual machines in validating maintenance and diagnostic skills, so a trainee must interact with people in validating interaction skills. Virtual environments, though, offer advantages in reliability, repetitiveness, flexibility, throughput, and distribution that lead directly to overall cost-effectiveness of training.

1.2. Mechanics of the training application

One of the most difficult skills for a telephone interviewer to learn – and for an instructor to teach – is gaining cooperation from sample members and avoiding refusals. In telephone interviewing in particular, the first 30 seconds on the telephone with a sample member is crucial. Sample members almost automatically turn to phrases such as, “I do not do surveys”, “I do not have time”, “I am just not interested” to avoid taking part in surveys. Non-response research suggests that the best approach to obtaining participation is for the interviewer to immediately reply with an appropriate, informative, tailored response (Camburn, Gunther-Mohr, & Lessler, 1999; Groves, 2002; Groves & Couper, 1998). How can the interviewer learn and then practice those responses before the survey begins, without creating more refusals during their first few weeks at work by being placed on the telephone unprepared?

The approach tested here involves the use of an RVHT-based application to simulate the environment an interviewer faces during the first 30–60 seconds of a telephone interview. The application allows interviewers to practice their skills in gaining cooperation in a self-paced, realistic environment. The software is designed such that interviewers begin with an introduction and then need to respond to a series of these objections or questions raised by the “virtual respondent”. The interviewer’s responses are captured electronically and processed by a natural language speech processor. Based on the content of the interviewer’s speech, the software launches another objection/question or ends the conversation by either granting the interview or hanging-up the telephone (see Fig. 1).

The application uses speech recognition and a behavior engine (for determining the intelligent agent’s emotional state) to produce natural dialogues with the trainees. The speech recognizer uses a basic dictionary of common words as well as a

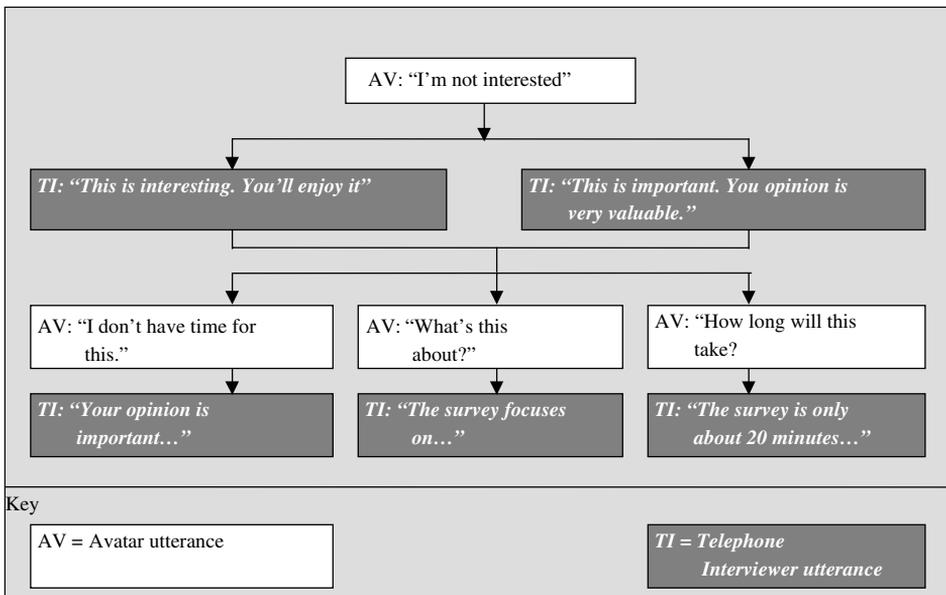


Fig. 1. Example of dialogue flow between a telephone interviewer (TI) and the avatar (AV).

specific dictionary for each turn of a conversation. The specific dictionary consists of up to 200 words based on behavioral observations of real world events. These specific dictionaries are dynamic, therefore, changing with each turn of the conversation. During the development of the application tested here, the researchers monitored live interviews and behavior coded the responses of interviewers and sample members. These behavioral observations were then modeled, using the dictionaries and the emotional state behavior engine. Thus the specific dictionaries created for capturing responses from an interviewer to a respondent who said, "I am too busy" in a harsh tone varied somewhat from the dictionaries created for when the respondent gave the same objection but in a softer, more reasoned tone. As trainees used the application, the emotional state of the virtual respondent varied from scenario to scenario, thus giving trainees exposure to an array of objections and emotional states. The scripts launched by the RVHT program were recorded in both a male and a female voice to add variety to the program. In all a total of six basic objections were recorded in four different tones of voice for both a male and female virtual respondent. Thus a total of 48 different practice scenarios could be offered to the trainees.

2. Methods

A primary goal of the overall research program of which this study is a part is to determine if RVHT can be an effective technology for interaction training across a

broad spectrum of ethnic and socioeconomic backgrounds, jobs, and job levels. In particular, we investigate whether users find RVHT interactions accessible and acceptable. The effectiveness of this technology depends upon its ability to provide appropriate learning experiences, its ability to engage the trainee, and its acceptability to disparate users.

An “accessible” user interface is one that is easy to learn and easy to use, and can result in measurable goals such as decreased learning time and greater user satisfaction (i.e., acceptance) (Weiss, 1993). Characteristics of easy to learn and easy to use interfaces have been described as having navigational and visual consistency, clear communication between the user and application, appropriate representations, few and non-catastrophic errors, task support and feedback, and user control (Nielsen, 1993; Norman, 1993; Schneiderman, 1992; Weiss, 1993).

The assessment provided here of the interviewer training module is based on researcher/instructor observations, and user debriefings in the form of a questionnaire. Empirical data were collected on users’ observed ability to interact with the application as well as their perception of the interaction. The training application was tested with a group of approximately 50 telephone interviewers of varying ages, races, experience, and education levels. Trainees who participated in the assessment used the application to practice communication and thinking skills required with real conversation partners. These skills involve the use of adaptive strategies, listening and responding to the other’s concerns.

To evaluate the *accessibility* of the application we focused on the following:

- Do users understand the basic features of the application?
- Are users able to complete each task and exit the application?
- Do users understand where they are in the application?
- Are different users (e.g., based on age, time on the job, and education level) equally able to use the application?

Instructor/researcher observation was used to assess more directly the interaction between the user and the training application, addressing questions such as:

- When there are problems (e.g., the virtual human seems to respond inappropriately), what are user reactions?
- Are inappropriate responses due to a programming error, misunderstanding in the interaction, or incorrect user behavior?
- What knowledge engineering improvements will lead to better recovery by the application when inappropriate responses occur?

Analysis of these questions will provide clues as to how smoothly the application runs, or when and why difficulties arise in its use.

The question of whether and why participants “accept” or “reject” the virtual training environment is also central to this research. To evaluate *acceptance* of the application by the trainees, we debriefed participants using a structured question-

naire to gauge reactions and engagement in the application. In particular we are interested in the following:

- Are the virtual humans realistic enough for the users? Why or why not?
- How fast and accurate is the speech recognition?
- When recognition is inaccurate, does the application respond reasonably?
- Overall, do the users “buy-into” the virtual environment?
- Could trainees detect changes in the emotive states of the virtual human using only audio cues?
- Did the trainee perceive any gains in skills from using the application?
- Would they use the application again and/or recommend its use by others?

While some of these acceptance measures may be particular to the specific application tested, most help in gaining a general understanding of user satisfaction with RVHT.

As part of the evaluation process, data were collected using a questionnaire filled out by the interviewers and notes made by instructors and researchers who observed the training sessions. The questionnaire asked questions related to users’ perceptions of the realism of the interactions with the “virtual human”, ease of use of the software, the perceived effectiveness of the training sessions, and some basic background characteristics of the users. In all, a diverse group of 48 interviewers filled-out the questionnaires (96% of the software users). A breakdown of some of the demographic characteristics of this set of users is provided on [Table 1](#). Finally, each training session was observed by either the researchers or training instructors, who made notes of their observations. These observations are included as part of the analysis.

3. Results

The questions posed to the interviewers were designed to assess their perceptions and experiences in using the RVHT training tool in four basic areas: ease of use of the software, realism of the training environment, impact on skill development, and desire to recommend or use the software again. Although this is the first detailed look at how users interact with emotive embodied conversational agents for soft-skills development, we can formulate some hypotheses regarding how different types of users might respond based on how users differ in their general use and acceptance of other computer-based tools. For example, we might expect to find that trainees who are younger, have more education, and are more comfortable using computers will have fewer difficulties in using the system. Likewise, we might expect that more experienced interviewers might not find the training tool as useful as inexperienced interviewers because the more experienced interviewers will have already developed and honed their refusal avoidance skills (a supposition that mirrors the finding of [Groves \(2002\)](#)). To examine possible differences in accessibility and acceptance of the program, we cross-tabulated all of the closed-ended questions in the question-

Table 1
Demographics of RVHT trainees

Characteristic	<i>N</i>	%
<i>Sex</i>		
Male	12	25%
Female	36	75%
<i>Education</i>		
High school/GED	2	4%
Some college	12	25%
Four-year degree	25	52%
Advanced degree	9	19%
<i>Age</i>		
18–21	7	15%
22–29	17	35%
30–39	8	17%
40–49	7	15%
50+	9	18%
<i>Race</i>		
African–American	34	70%
White	7	15%
Hispanic	7	15%
<i>Experience</i>		
<1000 hours	19	40%
1000–1999 hours	17	35%
2000+ hours	12	25%
<i>Comfort with keyboard</i>		
Slow-touch typing	15	31%
Fast-touch typing	33	69%

naire with the demographic variables listed on Table 1. Significant differences are noted in the text ¹.

3.1. Ease of use of the application

Training software should be accessible to users; that is, it should be relatively easy to use. As shown on Table 2, users of the RVHT software seemed to find it very accessible to use, with 84% indicating the software was either extremely easy or very easy to use (52% extremely, 31% very, 13% somewhat, 4% not too, 0% not at all). Nearly everyone found the written instructions (96%) and the verbal instructions (98%) that accompanied the training to be clear and accurate. Only eight (17%) of

¹ Because of the small number of observations ($N = 48$) we also created dichotomous variables for both the dependent variables (collapsing scales where possible) and independent variables (collapsing or combining variables with 3 or more values). These variables were also examined to determine if significant differences among subgroups could be identified. Significance was evaluated at the ($p < 0.10$) level.

Table 2
Interviewers' evaluation of the RVHT training software

	Extremely	Very	Somewhat	Not too	Not at all
In general, how easy was the application to use?	52.1% (25)	31.3% (15)	12.5% (6)	4.2% (2)	0% (0)
In general, how realistic did you find the overall conversation with the "virtual respondent"?	2.1% (1)	14.6% (7)	43.8% (21)	16.7% (8)	22.9% (11)
In general, how realistic did you find the objections, concerns, questions posed by the "virtual respondent"?	12.5% (6)	35.4% (17)	39.6% (19)	8.3% (4)	4.2% (2)
How easily could you determine the "virtual respondent's" emotional state or attitude based on the <i>tone of his/her voice</i> ?	22.9% (11)	43.8% (21)	29.2% (14)	4.2% (2)	0% (0)
How easily could you determine the "virtual respondent's" emotional state or attitude based on the <i>words used or objectives raised</i> by him/her?	8.3% (4)	54.2% (26)	27.1% (13)	10.4% (5)	0% (0)

the 48 trainees indicated that they required additional assistance to use the training software (after the initial training received by all trainees).

The primary difficulties encountered by the users were "insufficient memory" errors received on some of the training stations. The version of the application tested did, at times, use up considerable CPU memory. Once the machines were adjusted to handle the software memory requirements, the error messages were no longer an issue.

3.2. Realism of the training environment

The promise of RVHT-based training tools is that they can simulate a "real" environment, thereby allowing trainees repetitive practice in conditions that are as close as possible to what they will encounter on the job. For this particular application, the "virtual respondent" needed to mirror the behaviors and emotions of real respondents encountered when doing live interviewing. This means delivering an array of objections to the trainees in different tones of speech and emotional levels in a fast-paced manner. Interviewers were asked a series of questions to try to assess how well they accepted the virtual environment as a substitute for real work conditions. In other words, do they "buy-into" the virtual environment?

The answer is somewhat mixed. In general, trainees did not find the virtual environment to be realistic and they cited two primary reasons: the slowness of the response of the "virtual respondent" and the limited number of different objections/questions offered by the "virtual respondent". They did, however, find the responses that were offered to be realistic and stated that they could detect and respond to

changes in tone and emotional cues offered by the “virtual respondents”. A majority of the trainees also indicated that they felt the sessions helped them to improve their skills needed at the outset of an interview either somewhat or a lot.

When asked, *In general, how realistic did you find the overall conversation with the ‘virtual respondent’*, 17% said they thought it was extremely or very realistic, 44% said it was somewhat realistic, 17% not too realistic and 23% not at all realistic (see Table 2). Slowness of the “virtual respondents” in replying (due to the lag caused by the speech recognizer as it interpreted the interviewer’s responses and determined the next script to launch) was the primary problem cited by interviewers. Over three-quarters (77%) of the users felt the response time was too slow (4% felt it was too fast and 19% indicated the speed was just right). Perhaps not surprisingly, trainees who describe themselves as “fast-touch typists” were more likely than those who indicated they were “slow-touch typists” to say the response time was too slow (82% fast-touch vs. 67% slow-touch; $p < 0.08 \chi^2$). Interviewers who are more comfortable at a keyboard and who, it can be surmised, tend to get through an interview faster were the ones most put-off by the perceived slowness of the response time.

The trainees were, however, more positive when evaluating the realism of the objections and questions offered by the “virtual respondent”. A plurality (48%) indicated that the content of what was said was either extremely or very realistic, with 40% saying it was somewhat realistic, 8% not too realistic, and 4% not at all realistic. They also felt it was relatively easy to determine the emotional state of the virtual respondent based on the tone of voice they heard (23% extremely easy, 44% very easy, 29% somewhat easy, and 4% not too easy; no one indicated that they could not determine the avatar’s emotional state from the tone of the “virtual human’s” voice). Likewise, the content of the speech used by the avatar was also a good cue to trainees as to the “virtual human’s” emotional state: 8% extremely easy to tell, 54% very easy, 27% somewhat easy, 10% not too easy, 0% not at all easy.

Being able to recognize changes in the emotional state of the virtual respondent changed – at least in the minds of many trainees – how the interviewer approached the situation. Nearly 60% indicated that they behaved differently in the practice scenario based on the tone of the virtual respondent’s voice. Interestingly, a higher percentage of women than men reported reacting differently to the changing tone of the avatar’s voice (women 67% vs. men 33%, $p < 0.04 \chi^2$). Similarly, 54% said they treated the situation differently based on the actual words used by the avatar in expressing a concern or voicing an objection. There were, however, no differences between men and women on this question. When asked how they behaved differently, interviews said they tended to soften and take a more conciliatory tone when the virtual respondent seem to grow more hostile or angered, and they mirrored the tone when the virtual respondent seemed more pleasant. Likewise, they reported tailoring the content of their responses to try to meet the objections or questions of the virtual sample member rather than simply moving forward with their script. It seems, therefore, that both content of the objections raised by the virtual respondent and the emotional behavior of the “virtual human” were gener-

ally accepted by the trainees and caused them to react differently within the various training scenarios.

When asked in an open-ended format to list some of the problems with the realism of the software, many cited the slowness and others indicated that the limited number of objections raised by the virtual respondent made the sessions less realistic than what they encounter on the telephone. Because this was the first iteration of the software, a conscious decision was made at the design phase to maintain a limited set of six main objections and questions (“I am not interested”, “I am too busy”, “What is the survey about?”, “I do not have time right now”, “How was I selected?”, and “How long will this take?”). These six responses, however, were recorded in four different tones of voice (ranging from calm to upset) and recorded in both a male and a female voice. A total of 48 possible practice scenarios were, therefore, actually possible (6 responses \times 4 tones of voice \times 2 sexes). It appears, however, that while the interviewers do recognize and react to the different emotional cues they obtain from the different scenarios, they do not necessarily process these as being distinct. They focus more on the actual content of the argument (regardless of the tone of voice or whether the voice is a male or female) when considering how diverse the scenarios offered are. In designing future versions of the software this will need to be considered to increase interviewer acceptance of the training tool as a realistic simulation of the environment within which they must work.

3.3. *Impact on skill development*

The purpose for allowing trainees to operate within a virtual environment is to allow them to develop and hone essential skills before entering the “real” environment, thereby reducing the amount of “on the job” skill development required. For telephone interviewers, this means an opportunity to practice their skills at gaining cooperation at the outset of an interview. Practice in a virtual environment, it is hoped, will allow interviewers – particularly new interviewers – to develop, practice, and hone these skills before getting on the telephone. New interviewers can do considerable damage at the outset of a telephone study, generating a large number of refusals as they gain comfort and confidence on the telephone. If practice within a virtual environment at the beginning of a project can reduce the numbers of initial refusals even modestly, then the training program will have value. While longer-term assessments of the effectiveness of the RVHT software will need to include examination of more objective measures of improved performance, this preliminary assessment focused on the users assessment of the impact of the training on their own skill development.

Trainees were asked to evaluate if they thought the RVHT software increased their abilities in six different areas (see Table 3). Nearly three-quarters of the trainees felt that the practice sessions increased a lot or somewhat their ability to respond to questions and concerns by sample members. Approximately 56% felt it helped them a lot or somewhat in better gaining respondent cooperation at the outset of an interview. Likewise, over half felt it helped in their ability to adapt to differences in respondents’ tone or voice or perceived moods and to adapt to differences in the speed and pace of different sample members’ speech. About half of the trainees also

Table 3
Interviewers' perceptions of effectiveness of RVHT training software

	A lot	Somewhat	A little	Not at all
Respond to questions/concerns raised by sample members	25.0% (12)	47.9% (23)	16.7% (8)	10.4% (5)
Better gain respondent cooperation during the first seconds of a call	25.0% (12)	31.3% (15)	29.2% (14)	14.6% (7)
Enhance your ability to adapt to differences in respondents' tone/mood	25.0% (12)	29.2% (14)	29.2% (14)	16.7% (8)
Think on your feet	20.8% (10)	39.6% (19)	27.1% (13)	12.5% (6)
Enhance your ability to adapt to differences in respondents' pace of speaking	18.8% (9)	33.3% (16)	27.1% (13)	20.8% (10)
Avoid refusals at the outset of an interview	16.7% (8)	35.4% (17)	31.3% (15)	16.7% (8)

thought that the sessions helped them a lot or somewhat in avoiding refusals at the outset of an interview.

Once again, while more objective measures of increased ability to gain cooperation from sample members are needed in the longer-term evaluation of this training tool, it does appear that trainees perceive an increase in their ability to deal with various facets of the opening of an interview as a result of their training sessions.

3.4. Trainee recommendation for use of the RVHT training tool

An effective training tool is also one that trainees should enjoy using, would use again, and recommend to others (see Table 4). Approximately two-thirds (65%) of the users said that they found using the RVHT software to be fun and enjoyable. Interestingly men were significantly more likely than women to say that they found the sessions to be enjoyable (92% men vs. 56% women, $p < 0.05 \chi^2$). Nearly three-quarters (73%) said they would like to use the software again. In addition, 83% said they would recommend the program as a training tool for other interviewers. In open-ended responses, a number of interviewers indicated that it would be a very good practice vehicle for new or less experienced interviewers.

4. Discussion and conclusions

This initial assessment of an RVHT-based training tool for telephone interviewers provides some valuable insights into how trainees access and accept virtual environ-

Table 4
Recommendation for future use of RVHT training tool

	Yes	No
Would you recommend the RVHT program as a training tool for other interviewers?	83% (40)	17% (8)
Would you like to use the RVHT program again as a training tool?	73% (35)	27% (13)
Was using RVHT fun and enjoyable?	65% (31)	35% (17)

ments as practice labs and “virtual humans” as training partners. There were aspects of the training program that interviewers clearly liked, such as the ability to do repeated practice of frequently asked questions, being able to distinguish different emotional states from the tone of voice and speech content of the virtual respondent, and the opportunity to learn to think on their feet in a simulated environment before being placed into a live interviewing situation.

There were also aspects that the interviewers did not like, such as the slowness of the response of the virtual respondent and the perceived lack of variety in the scenarios that were presented. This provides constructive feedback for the engineering and improvement of the software. Adding additional scenarios is a relatively easy process, involving research into the “normal” flow of such scenarios and simple scripting and programming. The responsiveness issue is a more fundamental matter, reflecting the current state-of-the-art in speech recognition. For virtual training partners to be more readily accepted, the underlying speech recognition technology needs to be improved, providing quicker, more efficient processing of the input from interviewers and more rapid launching of responses by the virtual respondent. While our research focused on a specific training application, the results have implications for a broader range of training and educational RVHT-based tools. The lessons learned here can be used to inform the development of tools in these other areas.

We do not anticipate RVHT-based training will replace instructor-led training, but we expect that combinations of RVHT-based training and instructor-led training will significantly reduce training development costs (with new development tools) and training delivery costs, while increasing trainee throughput and maintaining training effectiveness and consistency. As an additional return-on-investment, RVHT-based training can provide inexpensive, focused sustainment (i.e., refresher) training. We feel it is important to continue to investigate more robust and effective RVHT models and more efficient means of creating the models, to better understand user preferences and acceptance of RVHT, and to determine how best to use RVHT in combination with other training methods to provide cost-effective training on critical interaction skills.

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