# **New Dimensions in Testimony Demonstration**

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#### Abstract

New Dimensions in Testimony is a prototype dialogue system that allows users to conduct a conversation with a real person who is not available for conversation in real time. Users talk to a persistent representation of Holocaust survivor Pinchas Gutter on a screen, while a dialogue agent selects appropriate responses to user utterances from a set of pre-recorded video statements, simulating a live conversation. The technology is similar to existing conversational agents, but to our knowledge this is the first system to portray a real person. The demonstration will show the system on a range of screens (from mobile phones to large TVs), and allow users to have individual conversations with Mr. Gutter.

# 1 Introduction

This demonstration presents *New Dimensions in Testimony*, the first dialogue system prototype to enable a conversation with a real person who is not available for conversation in real time. Technology such as the telegraph, telephone and videoconferencing allowed people to communicate with each other across long distances with increasing fidelity, but required that the participants make themselves available for conversation at the same time. Other technologies such as writing, audio recording and video recording allowed people to send messages across time, but did not allow synchronous conversation. In the past two decades, embodied conversational agents – that is, artificial characters controlled by computer programs – have been able to converse

with users with increased complexity and naturalness. Our system demonstrates how conversational agent technology can be used with recorded video statements from a real person to create a conversation that is offset in time: the speaker recorded his statements in the past as a message to the future, and users now can interact with him and hold a conversation as if the speaker were present.

The New Dimensions in Testimony prototype is intended to emulate a conversation with Holocaust survivor Pinchas Gutter. Holocaust education today relies to a great extent on survivors talking to audiences in museums and classrooms, relating their experiences directly and creating an intimate connection with their audiences (Bar-On, 2003). However, the youngest survivors are in their seventies today, and in a few years there will be no more survivors left to tell the story in person. The prototype will afford future generations the opportunity to engage in such conversation, talking to Pinchas Gutter and asking him questions about his life before, during and after the Holocaust. What makes our project unique is the ability to connect on a personal level with a survivor, and the history, even when that survivor is not present.

The technology can have a wide range of applications, such as preserving the memory of a person for the future (historical figures as well as ordinary people); enabling conversation with family and friends who are temporarily unavailable (traveling, deployed overseas, or incarcerated); allowing popular speakers (leaders, celebrities) to engage with multiple people at the same time; and enabling access to expert knowledge and customer service.

# 2 Technical details

In the *New Dimensions in Testimony* prototype, users talk to a persistent representation of a Holocaust survivor presented on a video screen, and a computer algorithm selects and plays individual video clips of the survivor in response to user utterances. The result is much like an ordinary conversation between the user and the survivor. The system has been described in detail in previous publications, covering the proof of concept (Artstein et al., 2014), the content elicitation process (Artstein et al., 2015), the language processing (Traum et al., 2015a), the full prototype (Traum et al., 2015b), and ethical considerations (Artstein and Silver, 2016). Here we give a brief description of the language processing technology and the system's runtime components.

#### 2.1 Language processing

At the heart of the runtime computer system is a response classifier and dialogue management component called NPCEditor (Leuski and Traum, 2011), which selects a response to each user utterance. NPCEditor combines the functions of Natural Language Understanding (NLU) and Dialogue Management - understanding the utterance text and selecting an appropriate response. The NLU functionality is a classifier trained on linked question-response pairs, which identifies the most appropriate response to new (unseen) user input. The dialogue management logic is designed to deal with instances where the classifier cannot identify a good direct response. During training, NPCEditor calculates a response threshold based on the classifier's confidence in the appropriateness of selected responses; at runtime, if the confidence for a selected response falls below the predetermined threshold, that response is replaced with an "off-topic" utterance that asks the user to repeat the question or takes initiative and changes the topic (Leuski et al., 2006); such failure to return a direct response, also called non-understanding (Bohus and Rudnicky, 2005), is usually preferred over returning an inappropriate one (misunderstanding). The current system uses a five-stage off-topic selection algorithm which is an extension of that presented in Artstein et al. (2009). Figure 1 shows a sample dialogue illustrating the handling of nonunderstanding.

- User Hello Pinchas, how are you? Las Vegas how are you
- Pinchas Can you just repeat that?
- User Hello Pinchas, can you hear me? how thick is can you hear me
- Pinchas I can hear you, yeah.
- User Pinchas, can you tell me how old you are? Vegas can you tell me how old you are
- **Pinchas** I was born in nineteen thirty two and we are now in two thousand and fourteen and you can make your own reckoning.
- User Can you tell me a little bit about your child-hood?
- **Pinchas** My life before the war, I was born in Lodz in Poland, and I was eight years old when the war started. So the first eight years I lived in a home, a very religious one, a Hasidic home. I had a twin sister, my...
- User Have you ever met Hitler? mermaid Hitler
- Pinchas Please repeat that.
- User Did you ever meet Hitler?
- **Pinchas** Did I ever meet Hitler? Well, Hitler was a Führer of Germany and I was born in Poland and I was a little Jewish boy, so the chances of somebody like me meeting Hitler was impossible, because Hitler was...

User What would you do if you met Hitler?

**Pinchas** Geyn drerd arein, that's Yiddish and what it means go and bury yourself.

**Figure 1:** Sample dialogue from system testing, illustrating correct responses to noisy speech input as well as the handling of non-understanding using off-topic responses. Speech recognition output is shown in italics when it departs substantially from the spoken text. The final utterance was originally recorded as a response to the question "If you could ask one question or say anything to Adolf Hitler, what would that be?"

The system has over 1700 recorded responses (a total of almost 18 hours of video), allowing it to give appropriate direct responses to about 64% of the user questions, with 20% off-topic responses and the remaining 16% being errors. This is sufficient to enable a reasonable conversation flow (Traum et al., 2015a). Between responses the system loops through short videos of idle behavior by the survivor, giving the feeling of live presence. When the user starts speaking, this changes to concentrated listening behavior, adding to the feeling of engagement.



Figure 2: System architecture: Black lines show the data flow through the system, while gray arrows indicate the control messages from the Launcher interface. Solid arrows represent messages passed via ActiveMQ, and dotted lines represent data going over TCP/IP.

#### 2.2 Software components

The system is built on top of the components from the USC ICT Virtual Human Toolkit, which is publicly available (Hartholt et al., 2013).<sup>1</sup> Specifically, we use the AcquireSpeech tool for capturing the user's speech, CMU PocketSphinx<sup>2</sup> and Google Chrome ASR<sup>3</sup> tools for speech recognition, NPCEditor (Leuski and Traum, 2011) for classifying the utterance text and selecting the appropriate response, and a video player to deliver the selected video response. The individual components run as separate applications and are linked together by VHMsg<sup>4</sup> messaging over ActiveMQ: each component connects to the broker server and sends and receives messages to other components via the broker. The system setup also uses the JLogger tool for recording the messages, and the Launcher tool that controls starting and stopping of individual tools. Figure 2 shows the overall system architecture. A typical session on a Mac is shown in Figure 3.

#### 2.3 System hardware

A typical installation is run on a 15-inch MacBook Pro with Retina display, connected via HDMI to an external monitor or television. We have used displays ranging from a basic 22-inch desktop mon-



Figure 3: A typical desktop runtime environment: Launcher on the left, NPCEditor top right, Google Chrome ASR bottom right. Video player is displayed (maximized) on an external screen, and JLogger is minimized.



Figure 4: User talking to Mr. Gutter on a large TV.

itor for personal interaction to a large theatre projector screen, though our preferred display is an 80inch high definition television in vertical orientation (Figure 4). This allows showing the speaker at approximately life size, making it appropriate for oneon-one and small group interaction, as well as large group interaction in a theatre setting.

For small, informal demonstrations in a quiet setting, we have had good results using the MacBook Pro's built-in microphone for audio capture, and the built-in trackpad as a push-to-talk button. In more challenging environments we use a Sennheiser HSP-4 headworn microphone, which works well to isolate the user's speech from the background noise. The microphone is connected to a wireless transmitter-receiver pair and sent to the computer through a Focusrite Scarlett 2i2 USB recording audio interface. Push-to-talk functionality is provided

<sup>&</sup>lt;sup>1</sup>http://vhtoolkit.ict.usc.edu

<sup>&</sup>lt;sup>2</sup>http://cmusphinx.sourceforge.net

<sup>&</sup>lt;sup>3</sup>https://www.google.com/intl/en/chrome/demos/speech.html

<sup>&</sup>lt;sup>4</sup>https://sourceforge.net/projects/vhmsg/



Figure 5: User talking to Mr. Gutter on a mobile phone.

by a wireless mouse, removing any physical connection with the computer and allowing the user full freedom of movement. The speaker's audio is normally transmitted over HDMI together with the video, but can be routed through the Focusrite interface to external speakers when needed.

## 2.4 Mobile version

The mobile version (Figure 5) is built using an Android-based virtual human software platform (Feng et al., 2015). This platform allows script-based access to speech recognition, video playback, and dialogue management services via Jerome, an implementation of the NPCEditor algorithm.

In order to accommodate the smaller display and mobile nature of a handheld device, the videos were reduced from  $1080 \times 1920$  to  $270 \times 480$ , effectively reducing the size of the videos by a factor of 16. This results in a change in video file size from approximately 1.7 gb per hour (28 mb per minute) of content to 110 mb per hour (1.75 mb per minute) of content. Frequently used videos, such as those for listening and off-topic responses are stored locally on the mobile device, while the rest are stored on a video-streaming cloud service and are retrieved on demand. Streaming videos of such size via wifi connection yields similar response times to playing the videos locally on the device, and greatly reduces the size of the mobile app. An additional button on the app allows the user to indicate explicitly that a given response is inappropriate to the question asked; this information is used for future classifier training.

The classification algorithm and data are processed locally on the device. Speech recognition is handled via the Android's interface to Google ASR. Thus, there are three network messages for each user utterance: one to obtain the results of the ASR, another to retrieve the desired video if found, and a third to store the recognized question and response in a cloud-based database, for later analysis. The classifier data can be replaced through an update to the mobile app, thus allowing for easy propagation of improvements in the question/answer interaction as larger amounts of data are captured and analyzed.

# **3** Demonstration outline

The demonstration will feature a live interaction between participants and Pinchas Gutter, on both desktop and mobile platforms. Depending on the participant's preference, interaction will be either moderated (speech relayed by a demonstrator) or direct (participant operating the push-to-talk and talking into the microphone). The live conversations will highlight Mr. Gutter's understanding, his ability to deal with non-understanding of user utterances, and the overall coherence of the conversation. It will also showcase many of Mr. Gutter's moving personal stories, and illustrate the sense of closeness and bonding that can form when talking to a person through a system of time-offset interaction.

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