A Framework of Reply Speech Generation for Concept-to-Speech Conversion in Spoken Dialogue Systems

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Abstract
Due to recent advancements in speech technologies, a large number of spoken dialogue systems have been constructed. However, since most of them adopt existing text-to-speech synthesizers, it is rather difficult to reflect the linguistic information obtained during the reply sentence generation well in output speech. A framework is necessary for correctly reflecting higher-level linguistic information, such as syntactic structure and discourse information. We have constructed a spoken dialogue system built on road guidance and realized concept-to-speech conversion, where output speech is generated in a unified process. Tag LISP forms keep the syntactic structures throughout the process in order to reflect the linguistic information in the prosody of output speech. Furthermore, by making it possible to insert not only words but also phrase templates in tags, various sentences were generated with a minor increase of templates. Validity of the methods is shown through experiments.

Index Terms: spoken dialogue system, concept-to-speech conversion

1. Introduction
Speech is known to be the most basic and important method of communication for humans, and therefore there is an increasing request for a scheme enabling man and machine interaction through speech. In response to this request, a number of spoken dialogue systems have been developed. However, research works on speech output generation are rather few, and in most systems text-to-speech (TTS) conversion devices are used for generating speech replies. During the process of reply sentence generation, the system has higher-level linguistic information of the generated sentence such as its syntactic structure, important words carrying key information of the reply content, and so on. Such information should be reflected in the prosody of speech as mentioned already. To accomplish this, we adopted the \( F_0 \) contour generation process model \( (F_0, \text{model})[6] \) for the control of \( F_0 \) contours of reply speech. The phrase and accent commands of the model are known to have a good correspondence with the linguistic information, and symbols representing them are inserted in the sentences according to the result of \( F_0 \) contour analysis of dialogue speech[8].

The rest of the paper is constructed as follows: Section 2 describes the overview of the spoken dialogue road guidance system. After explaining the method of sentence generation[5] and the prosodic control in section 3, result of listening experiment is shown in section 4. Section 5 concludes the paper.

2. Outline of the dialogue system
The system has a full map, while the user can view a short distance around his/her current location. Figure 1 shows an example of the map. Square symbols with two letters inside show places, which serve as landmarks in the dialogue between the user and the system. For instance, CS denotes convenience store, SH denotes shrine, and so on. The system knows all the places shown as square symbols. Also it knows the distance between two places as the number attached to each path. The circle of Fig. 2 shows the range viewable by the user. The user also knows the start point (coordinate: \( X=50, Y=470 \), for instance), and coordinate of the current location. The map legend (names of two letters in square symbols) is displayed at all times to the user. The rectangular symbol in the circle with “ROAD WORK” indicates that road work is going on and the user cannot pass through. Such temporal information is not given to the system. Because of limited information provided to the user, and lack of temporal information for the system, mis-understanding may occur between them. Also since the user’s location is provided to the system only through the dialogue, the system may sometimes incorrectly locate the user in the map. These situations require the system to generate reply speech in various contents and styles.

The system consists of a speech recognizer, a syntax analyzer, a dialogue manager, and a speech synthesizer, together with a display controller showing the fragment of the map near the current location of the user (circled portion of Fig. 2).
also has three dictionaries: a word dictionary, part-of-speech dictionary, and conjugation dictionary, which are necessary for dialogue management. The recognizer receives the speech input and converts it into a word string. The grammar-based version of speech recognition software, Julian[9], was used in this system. The syntax analyzer outputs the syntactic structure of the word string through morpheme and syntactic analyses. The morpheme analysis result is obtainable as the output of Julian. Syntactic analysis is conducted by a simple rule developed by the authors. The dialogue manager first extracts information on the user’s current situation (such as current location) from the user’s speech input, and then sends the user an instruction on how to reach the destination. It also generates reply content and converts it into a string of prosodic and phone symbols. The speech synthesizer generates output speech from the string. The speech synthesis is based on a waveform concatenation with TD-PSOLA prosody modification[10].

3. Reply generation

3.1. Linguistic information processing

In order to realize CTS conversion, generated sentences should keep higher-level linguistic information such as syntactic structure and role of its constituting words during the speech synthesis process. To realize this condition, all the concepts are represented in LISP forms. We adopted LISP forms, because they can easily keep the syntactic structure of a sentence by grouping words using parentheses. In order to represent a concept, the LISP form used here has tags as its elements instead of words/phrases. A tag corresponds to words/phrases with similar meanings or roles in sentences. Henceforth, this type of LISP form is called tag LISP form. Tags have some attributions such as “importance” and “novelty,” which should be reflected in the prosody of output speech.

3.2. Sentence generation

Given a phrase template in tag LISP form, a phrase (with syntactic structure and information on important words) is generated by pasting words/phrases at tag positions of the template. Then the generated phrases are concatenated as designated in a sentence template, which is also represented in the tag LISP form. Words are assumed to be important when they are pasted at tags representing places and directions.

Through this procedure, we can create various styles in generated sentences, not limited to simple sentences, but also to complex/compound sentences. For instance, a sentence “migini magatte ekimade ittekudasai (Turn right and go to the station.)” is generated through the following processes:

1. Generate the noun phrase “(ni(miGi))” from the frame “(ni(SDIrection))”.
2. Generate the noun phrase “(made(eki))” from the frame “(made($LAndMARK))”.
3. Generate the verb phrase “((te(magaru(ni(miGi))))(te(iku(made(eki)))))” from the frame “(te($Verb$Noun$Phrase))”.
4. Concatenate these two verb phrases to generate a phrase “((te(magaru(ni(miGi))))(te(iku(made(eki)))))”.
5. Insert the phrase at “$Verb$Phrase” position of the frame “(kudasai($VVerb$Phrase))” to generate “(kudasai(te(magaru(ni(miGi))))(te(iku(made(eki)))))”.

The sentence generated by the above process is a compound sentence, but it can be a set of two short sentences “migini magatte kudasai. sorekara ekimade ittekudasai (Turn right. Then go to the station.),” if we slightly modify the process. The first sentence “migini magatte kudasai,” is generated with a step similar to step 5: insert “((te(magaru(ni(miGi))))(te(iku(made(eki)))))” at “$VVerb$Phrase” position of “(kudasai($VVerb$Phrase))”. The second sentence “sorekara ekimade ittekudasai” is also generated similarly, but a conjunction “sorekara” is added to show the relation of the sentences.

The flexibility in the style of generated sentences comes from the use of phrase templates as well as sentence templates.

3.3. Comparisons with existing methods

Although, our research using CTS, our research is exclusive to Japanese spoken dialog systems, there exist some related previous works such as template-based approach[7] in Dutch. In the research, each slot in the templates allows a limited number of words, and the variety of reply sentences depends directly on the number of templates. One of the distinguished differences between our method and their approach is the use of phrase templates as well as sentence templates. The introduction of phrase templates allows for a variety of resulting sentence templates and overcomes the inflexibility of rigid sentence templates.

3.4. Control of prosodic features

In order to create CTS synthesis, it also requires developing the speech synthesis system which reflects all the tag Lisp style information given in 3.2.

3.4.1. Phrase/accent command symbols

The generated sentence should include information necessary for speech synthesis. For this purpose, the final sentence should be not only in the orthographic text form, but also in a form of a sequence of phone and prosodic symbols. The
prosodic symbols are those indicating magnitudes/amplitudes of phrase/accents commands of the $F_0$ model. When all the command values are assigned, the model calculates the sentence $F_0$ contour. The symbols and the rules to assign them in a sentence were those formerly developed through the analysis of $F_0$ contours of dialogue speech by the multiple linear regression method[8]. Given “importance of word” and syntactic structure, the prosodic symbols are selected and inserted into the appropriate positions of the phone symbol string. For instance, the symbol sequence for the sentence “hidari magatte jiNjamade ittekudasai (Turn left and go to the shrine.)” is given as follows:

\[
P111212 \text{ hi } F311 \text{ da } ri e \text{ ma } ga \text{ sx } te \text{ A0 } P11 \text{ D311} \\
zi \text{ A0 } n \text{ zja } ma \text{ de } P21 \text{ i } F413 \text{ xx } te \text{ ku } da \text{ sa } A0 \text{ i } P0 \text{ S1}
\]

Here, the symbols starting with P show the phrase command (onset) locations and magnitudes. Accent command (onset) locations and amplitudes are shown by the symbols starting with D and F: D for accent type with accent nucleus and F for one without. The digits included in these symbols indicate to which class each item of multiple linear regression analysis belongs. The magnitude/amplitude for each phrase/accents command symbol is given by accessing the table arranged formerly by the authors[8].

Since the phrase commands show different features depending on their locations in the sentence, the digits after P are differently assigned for the two cases; top of the (prosodic) sentence and middle of the sentence. Table 1 shows meaning of the 6 digits (items) included in the sentence initial phrase symbols. In Table 1, FRD is the abbreviated form of “Fundamental Routine of Dialogue” and denotes a pair of user and system utterances, which are directly related to each other, such as a question and an answer. As for the in-sentence symbols, their first and second digits correspond to the second and the fifth digits of the sentence initial symbols.

As for the accent commands, 3 digits have the meaning as indicated in Table 2. “Important” and “novel” are for the content word included in the accent phrase. For each accent phrase, a symbol is selected according to its accent type and is inserted into the phone string at the position corresponding to the accent command onsets. Details are given in 3.4.3.

Symbols P0 and A0 are those indicating the ends of the phrase and accent commands started by the preceding symbols, respectively. Pauses are placed at the symbols starting with S. Symbol S1 corresponds to a long pause between two sentences.

### Table 1: Phrase command symbols.

<table>
<thead>
<tr>
<th>Digit</th>
<th>Value</th>
<th>Meaning</th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td>1st digit</td>
<td>1</td>
<td>Opening FRD</td>
<td></td>
</tr>
<tr>
<td>2nd digit</td>
<td>1</td>
<td>Contains an important word</td>
<td></td>
</tr>
<tr>
<td>3rd digit</td>
<td>1</td>
<td>Changing the topic</td>
<td></td>
</tr>
<tr>
<td>4th digit</td>
<td>1</td>
<td>Following to a conjunction</td>
<td></td>
</tr>
<tr>
<td>5th digit</td>
<td>1</td>
<td>Covers 7 morae or less</td>
<td></td>
</tr>
<tr>
<td>6th digit</td>
<td>1</td>
<td>Ends with particle “ka”</td>
<td></td>
</tr>
</tbody>
</table>

### Table 2: Accent command symbols.

<table>
<thead>
<tr>
<th>Digit</th>
<th>Value</th>
<th>Meaning</th>
</tr>
</thead>
<tbody>
<tr>
<td>1st digit</td>
<td>1</td>
<td>Important and novel</td>
</tr>
<tr>
<td>2nd digit</td>
<td>2</td>
<td>Not important but novel</td>
</tr>
<tr>
<td>3rd digit</td>
<td>3</td>
<td>Important but not novel</td>
</tr>
<tr>
<td>4th digit</td>
<td>4</td>
<td>Not important and not novel</td>
</tr>
<tr>
<td>2nd digit</td>
<td>1</td>
<td>At the phrase initial position</td>
</tr>
<tr>
<td>3rd digit</td>
<td>1</td>
<td>Noun</td>
</tr>
<tr>
<td>4th digit</td>
<td>2</td>
<td>Verb</td>
</tr>
<tr>
<td>5th digit</td>
<td>3</td>
<td>Adjective/Adverb</td>
</tr>
<tr>
<td>6th digit</td>
<td>4</td>
<td>Demonstrative/Interrogative pronoun</td>
</tr>
<tr>
<td>7th digit</td>
<td>5</td>
<td>Conjunction</td>
</tr>
</tbody>
</table>

#### 3.4.2. Positioning of phrase command symbols

A sentence initial symbol is simply placed at the beginning of a sentence, while an in-sentence symbol is inserted at the right branching syntactic boundaries, which are found easily by tracing the LISP form. This algorithm included a problem of too long phrase components, when left branching syntactic boundaries succeeded without right branching boundaries. In the current method, when a phrase component exceeds 12 morae an additional phrase command is placed at the boundary where concatenation of two consecutive words is weakest. The strength of concatenation is calculated as the word bi-gram. A sentence end symbol is simply placed at the end of the sentence, and, pauses are placed at the sentence boundaries.

#### 3.4.3. Positioning of accent command symbols

Given the accent types, F or D symbols representing accent command onsets of accent phrases are inserted in the phone string: at the top of the accent phrase for the type 1 accent and between the first and second morae for other types. (F symbols correspond to the type 0 accent and are always placed between the first and second morae.) Here, an accent phrase is defined as a sentence unit consisting of a content word and its following particle(s). In the tag LISP form, it corresponds to a unit with a tag, delimited by a set of parentheses. An accent type is assigned for each accent phrase by referring to the accent type dictionary. The dictionary has accent type and attribute information (for each word), and, using a system developed by the authors[11], the accent type can be decided automatically. Symbol A0 represents the accent command end and is placed immediately after the accent nucleus mora. For an accent phrase with type 0 accent, which has no accent nucleus, symbol A0 is placed at the end of accent phrase.

In Japanese, when two accent phrases exist sequentially with no phrase command between, accent commands of these phrases may interact with each other. The second digit of an accent command symbol is added to represent the change in accent command amplitude due to this interaction[12].

### 4. Listening Experiment

#### 4.1. Outline

A listening test was conducted on the reply speech to show the validity of our method: whether syntactic structure (kept through the sentence generation process by using tag LISP form) and discourse information (included in tag) are well reflected in the prosody of reply speech or not.
From the dialogue example of the system, eight sentences were selected and their speech was synthesized by the following three methods:

**Proposed method:** Uses syntactic and discourse ("importance" and "novelty" of words) information obtained through the sentence generation process and its application to a dialogue system of road guidance. (JUMAN[13] and KNP[14]) instead of those obtained through the sentence generation process.

**JUMAN+KNP analysis:** Uses syntactic structures obtained by the sentence analysis by Japanese parsers (JUMAN[13] and KNP[14]) instead of those obtained through the sentence generation process.

**No discourse information:** Not using "importance" and "novelty" of words.

Twenty-four Japanese speakers were asked to evaluate the reply speech for each of 8 sentences generated by the three methods. The evaluation was conducted in 5 rank scoring: 1 when prosody of synthetic speech is poor, 3 when it is marginal and 5 when it is mostly natural. The three versions of speech were presented randomly.

### 4.2. Results

Table 3 shows scores averaged over the 24 speakers. The best scores were obtained by the proposed method for all the sentences. T-test (in 5% significance level) was conducted to check if the differences in scores are meaningful. Although, for sentences 2 and 4 there were no significant differences among the three versions, and for sentence 6 no significant difference between the versions by the proposed method and JUMAN+KNP method. Prosodic features are identical for the three versions in sentence 4 and for the two versions (proposed method and JUMAN+KNP method) in sentence 2.

As a whole, the proposed method is significant different from other two methods. Additionally, this advantage tends to expand according to the length of sentences.

### Table 3: Average of the score for each synthesized speech

<table>
<thead>
<tr>
<th>Sentence No.</th>
<th>1</th>
<th>2</th>
<th>3</th>
<th>4</th>
</tr>
</thead>
<tbody>
<tr>
<td>Proposed method</td>
<td>3.58</td>
<td>3.42</td>
<td>3.46</td>
<td>2.42</td>
</tr>
<tr>
<td>JUMAN+KNP analysis</td>
<td>3.04</td>
<td>3.25</td>
<td>2.92</td>
<td>2.38</td>
</tr>
<tr>
<td>No discourse information</td>
<td>2.50</td>
<td>3.13</td>
<td>2.38</td>
<td>2.33</td>
</tr>
</tbody>
</table>

### 5. Conclusion

In the road guidance spoken dialogue system, we presented a framework of reply speech generation for concept-to-speech conversion. Tag Lisp form-based phrase template keeps syntactic structure and important word information to be used at the prosodic control of speech synthesis while it realizes style flexible sentence generation. The validity of the method was proven through a listening test of synthetic speech.

For the future work, better prosodic control is planned through analysis of the dialogue in the road-guidance situation. Correct assignment of the degree of importance and novelty to each word in generated sentence is also important for the better prosodic control. A scheme to change the style of the reply sentences according to user’s preference and dialogue situation is also in the scope of the future work.

### 6. References


