# Collection and Analysis of Dialogues Provided by Two Speakers Acting as One 

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#### Abstract

We are studying a cooperation style where multiple speakers can provide both advanced dialogue services and operator education. We focus on a style in which two operators interact with a user by pretending to be a single operator. For two operators to effectively act as one, each must adjust his/her conversational content and timing to the other. In the process, we expect each operator to experience the conversational content of his/her partner as if it were his/her own, creating efficient and effective learning of the other's skill. We analyzed this educational effect and examined whether dialogue services can be successfully provided by collecting travel guidance dialogue data from operators who give travel information to users. In this paper, we report our preliminary results on dialogue content and user satisfaction of operators and users.


## 1 Introduction

Such dialogue services as counseling (Dowling and Rickwood, 2013) are often provided through telecommunication systems that enable speakers (typically called operators) to talk from remote places (Crabtree et al., 2006; Sakamoto et al., 2007; Yamashita et al., 2011; Kristoffersson et al., 2013). For such services to be more productive, it is desirable that the skills of the operators are improved.
In this paper, we propose a unique learning style in which multiple operators with different skills cooperate and pretend to be one person (Fig. 1). For two operators to effectively act as one, each must adjust his/her conversational content and timing to the other. In this style, each operator may experience the conversational content of his/her partner as if it were his/her own, creating efficient and effective learning of the other's skill. Users also benefit; they do not have to interact

| ID | Spk | Utterance |
| :---: | :---: | :---: |
| 1 | U | Hello. I am planning trips to Nara and Osaka prefectures. What sightseeing spots do you recommend? |
| 2 | GN | Hello. In the Nara area, I recommend Todaiji Temple and Nara Park. |
| 3 | U | I see. How can I get to them? |
| 4 | GN | You can walk to Todaiji Temple from Kintetsu Nara Station through Nara Park. |
| 5 | U | Thank you. How about Osaka? |
| 6 | GN | (Your turn.) |
| 7 | GO | (Ok.) |
| 8 | GO | Well, in Osaka, I recommend Osaka Castle and Universal Studios. |
| 9 | U | Those are both famous. |
| 10 | GO | You can easily get to them by train. |
| 11 | U | I'm glad they are so convenient. By the way, in Nara, do you recommend any restaurants where I can eat local food around those two spots? |
| 12 | GO | (Why don't you answer?) |
| 13 | GN | (Sure.) |
| 14 | GN | I recommend Asuka Nabe. |
| 15 | U | I see. Any idea how much it costs? |

Figure 1: Example of Mixtol condition where two guides with different skills pretend to be one guide who talks to a user (U). One guide has knowledge about travel in Nara (GN), and the other knows Osaka (GO). For readability, user utterances are shown in bold. Parentheses represent invisible to a user.
with a lot of operators and can establish one-toone relationships. There were studies that aimed at increasing the perceived number of speakers for better interaction despite that there is only a single operator (Yamane et al., 2011; Arimoto et al., 2014); our idea here is the opposite.

Many prior studies exist where multiple actors work together to provide dialogue services. Cooperative architectures with multiple agents or human operators have attracted attention with regards to the development of dialogue systems (Lin et al., 1999; Komatani et al., 2009;


Figure 2: Cooperation style of Osaka and Nara guides under Mixtol and 2 tol conditions

Nakano et al., 2011) as well as Wizard-of-Oz systems (Marge et al., 2016; Abbas et al., 2020). Users talking with a dialogue assistant controlled by multiple speakers on the cloud are reported to receive more reasonable responses (Lasecki et al., 2013). However, no research has examined the basic effect of behaving as one speaker on the satisfaction of the operators and their interlocutors. It remains especially unclear whether multiple operators who are acting as one promote mutual skill learning.

The following is the contribution of this study. First, we show a method for collecting text-chat dialogues in which two speakers acting as one person. Second, we show the basic effects of two speakers who are pretending to be just one person on the dialogue's content and the satisfaction of the operators and the interlocutors.

## 2 Collection of text chats in which two speakers act as one

### 2.1 Dialogue design

Our study focuses on the dialogue services of two human operators with different knowledge. With different knowledge, the two operators can provide a larger variety of information than when they are separate. We collected travel guide text-chat dialogues about two neighboring prefectures. The dialogues were conducted by either one or two operators. We categorized the travel guidance knowledge for one prefecture as each operator's skill. We have the following three conditions for conducting a dialogue:

Mixto1 condition Two operators with different specialties (as their skills) acted as one speaker. For example, we paired an operator who is familiar with Osaka prefecture and another who is familiar with Nara prefecture. Nara and Osaka are geographically adjacent.

They acted as one visible guide with knowledge of both prefectures (Fig. 2(a)).

2to1 condition Two operators with different specialties took turns talking directly (Fig. 2(b)) with one user in a three-party dialogue. This condition was collected as a baseline to evaluate the validity of the Mixtol condition.

1to1 condition One operator gave recommendation to one user about two prefectures. The operator has much knowledge about one of them, but the other is outside his/her skill set.

Collaborative dialogues (Mixto1 and 2to1 conditions) are expected to positively affect the operators' learning. We collected the 1 to 1 condition dialogues before and after the Mixto1 and 2to1 conditions to examine such educational effects.

### 2.2 Environment

All the speakers used Slack ${ }^{1}$ to communicate in a text-chat format. They played either a guide (operator) or a user.

In the Mixtol condition, two guides acted as one guide and interacted with one user. Each guide opened two Slack windows in one display. One window was used to interact with the user, and the other was used to consult with the other guide. The guides discussed their strategy for talking with the user in a window hidden from the user. The user opened a window to interact with the guide in one display and talked with both guides about his/her trip to the two pre-designated prefectures. The two guides used the same account to talk to the user; the user didn't realize he/she was talking to two guides.

In the 2 to 1 condition, two guides and one user also participated in the dialogue as in the Mixtol condition. However, both talked to the user using different accounts. Each guide opened a window to interact with the user without opening an additional window to just interact with the other guide.

In the 1 to 1 condition, one operator and one user each opened a window and directly interacted with each other.

### 2.3 Subjective questionnaires

Since it is unclear how our collected interactions affected the satisfaction of the guides, they answered a 12-item subjective questionnaire to assess task achievement and their impressions of

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Figure 3: Data collection. Numbers in parentheses represent the number of interactions.
each conversation. For the Mixto1 and 2to1 conditions, the guides also answered three items about their impressions of performing the conversation as one or two people. They also freely described their experience at the end of Session 2 (Section 2.4). The users answered ten items regarding their impressions of the task achievement and the conversations.

### 2.4 Data collection

We recruited speakers to act as operators or users. The operators and users were paid for their participation. All dialogues were conducted in Japanese. Sixteen operators participated as guides. Operators were assigned to their home prefecture as their specialty (we assume that operators were knowledgeable about their home prefectures). Their ages ranged from 20 to 50 years, with six males and ten females. Two guides of the same gender from neighboring prefectures were paired.

Forty-eight speakers ( 16 males and 32 females) whose ages ranged from 20 to 50 participated in the dialogues as users. Each participated in a travel guide dialogue outside their home prefecture.

We collected the data over three sessions (Fig. 3). All the guides participated in all three sessions. Sixteen were divided into two groups of eight; the M group having the Mixtol condition and the T group having the 2 to 1 condition in Session 2. Users participated in only one of the sessions and talked three times with different guides or guide pairs under the same condition. Each dialogue lasted ten minutes. We collected 144 travel text-chat dialogues and questionnaires from each guide and each user. The following are the descriptions of Sessions 1 to 3:

Sessions 1 and 3 All guides talked under the 1tol condition. Each guide had text chats three times with a different user in each dialogue. We collected 48 dialogues for each session.

Session 2 The M group's guide pair worked under the Mixtol condition and the T group worked under the 2 tol condition. Each guide pair
had text chats six times with a different user in each dialogue. Therefore, we collected 24 Mixtol dialogues and 24 2to1 dialogues.

## 3 Analysis

### 3.1 Approach

Evaluation of dialogue flows Using the collected text chat, we qualitatively analyzed how the guides facilitated the travel decisions under each condition. Under the 1 tol condition, the guides had limited knowledge that assisted them with travel to prefectures outside their specialty. Under the Mixtol and 2 tol conditions, the operator had the opportunity to provide trip guidance while talking in turns with the other guide. We observed how the guides made recommendations based on the conditions.

Number of guide utterances for non-specialty prefectures The guides touched on the expertise of the other guides under the Mixto1 and 2tol conditions. These guides may have gained information about the non-specialized prefectures from the conversations of the other guides, educating them about these unfamiliar prefectures. We analyzed whether the Mixtol condition, acting as a single guide, increases the utterances of the nonspecialized prefectures of guides.

### 3.2 Results

Dialogue flows The actual examples of collected dialogues for the Mixto1 and 2to1 conditions are shown in Figs 1 and 4 (translated from Japanese to English by authors).

In the 1 tol condition, the guide talked one-toone with one user. In some scenes, the guide was unable to answer questions outside his specialty. For example, the guides frequently said "I'm sorry I don't know" in the conversation.

In the Mixto1 example (Fig 1), two guides provided travel recommendations for Nara and Osaka prefectures. For "I am planning trips to Nara and Osaka prefectures. What sightseeing spots do you recommend? (ID = 1)," the Nara guide introduced Nara ("Hello. In the Nara area, I recommend Todaiji ( $\mathrm{ID}=2$ )") and the Osaka guide introduced Osaka ("Well, in Osaka, I recommend Osaka Castle and Universal Studios ( $\mathrm{ID}=8$ )"). By using the window that was hidden from the user, the guides could consult when to switch among themselves (e.g., "Your turn (ID = 6)" and "Ok (ID = 7)").

| ID | Spk | Utterance |
| :---: | ---: | :--- |
| 1 | $\mathbf{U}$ | Nice to meet you. I am thinking of travel- <br> ing around Fukuoka and Kumamoto for <br> 3 or 4 nights. I'd like to go to Aso Nature <br> Land, Dazifu Tenmangu, and the food <br> stalls in Nakasu. What other places do <br> you recommend? <br> If you have time, I recommend Kurokawa |
| 2 | GK | Onsen. <br> I see. I also want to go to a hot spring. <br> This'll be my first visit to Fukuoka. |
| 4 | GF | Hello. If you have time, how about Moji Port <br> in Kitakyushu City because its retro streets <br> are cute. Lots of fancy cafes and souvenir <br> shops, too. <br> Oh, that sounds nice. I love eating, too. <br> 5 |
| 6 | GF | If you are looking for gourmet food, <br> the iron-pot gyoza and mizutaki around <br> Haruyoshi are delicious in Fukuoka. <br> In Kumamoto, the Kumamoto ramen, <br> basashi, and red ox dishes are famous. |
| 7 | GK | U |

Figure 4: Example of 2 tol condition: U, GF, and GK represent user, guide for Fukuoka, and guide for Kumamoto. For readability, user utterances are shown in bold.

In the 2 tol condition, the two guides talked individually to directly help the user. Figure 4 shows the travel guide dialogue for Kumamoto and Fukuoka prefectures by the Kumamoto and Fukuoka guides. Both guides talked about their specialty. The Fukuoka guide said, "the ironpot gyoza and mizutaki around Haruyoshi are delicious in Fukuoka (ID = 6)." The Kumamoto guide said, "In Kumamoto, the Kumamoto ramen, basashi, and red ox dishes are famous (ID = 7)."

These observations show that the guides had the opportunity to provide trip assistance while speaking in turns with the other guide under the Mixtol and 2 to 1 conditions.

Number of guide utterances for non-specialty prefectures We annotated whether each utterance in the dialogue was related to each of the two prefectures and counted the number of utterances of the guides for their non-specialized prefectures. For each group ( M and T ), we analyzed whether there was a difference in the number of utterances in Sessions 1 and 3 before and after completing Session 2.

A Wilcoxon's rank-sum test showed that the M group under the Mixtol condition showed a significant tendency to increase the number of utterances regarding non-specialized prefectures 1 to1 of Session $1(\mathrm{M}$ group $)=2.5,1$ to1 of Session 3 $(\mathrm{M}$ group $)=4.0, \mathrm{~W}=198, \mathrm{p}<.1)$. On the other
hand, we found no significant difference in the T group who experienced the 2 tol condition ( 1 to 1 of Session 1 (T group) $=1.5$, 1tol of Session 3 $(\mathrm{T}$ group $)=3.0, \mathrm{~W}=227, \mathrm{p}=\mathrm{n} . \mathrm{s}$.). This result suggests that the M group guides gained knowledge about their non-specialties by experiencing the Mixto1 conditions.

## 4 Subjective Impressions of Speakers

We analyzed the overall satisfaction impressions of the guides and users on a 7 -point Likert scale (7 $=$ totally agree, $1=$ totally disagree ).

### 4.1 Approach

Guide satisfaction Our study focused on the situation where two guides talk as one. Such a situation might be confusing for guides and users. To ensure that the guides did not have any difficulty speaking under this condition, we used the following statement: "When I talked to the user, I sometimes felt it was difficult."

In the Mixtol condition, two guides talked as one. By sharing the dialogue context as one operator, each operator may experience the conversational content of his/her partner as if it were his/her own, creating efficient and effective learning of the other's skill. In the Mixtol condition, the guides may also be more aware of cooperating with the other guides and deepen their mutual trust.

We used the following three items to evaluate the guide's satisfaction with the other guide's cooperation: Statement (a) assessed feelings of respect for the other guide: "I felt a sense of trust in the other guide." To evaluate the ease of cooperation with the other guide, we used statement (b): "I was able to work with the other guide." To evaluate the impressions of learning from the other guide, we used statement (c): "I learned from the other guide's responses."

User satisfaction The easy-to-talk impressions felt by users under the Mixto1 and 2to1 conditions may differ. In the latter, the user distinguishes between the two guides and interacts in a multi-party manner. However, the user does not distinguish between them in the Mixtol condition. This difference might affect the user's speaking ease. To evaluate whether users felt it was difficult to talk, we used questionnaire item (d): "There were times when I felt it was hard to talk."

We also evaluated whether users felt they accomplished their task with questionnaire item (e):
"Through the dialogue with the guide(s), I obtained useful information" to evaluate whether the users obtained the necessary knowledge for their travel.

### 4.2 Results

Guide satisfaction To analyze the impressions of the guides' difficulty in speaking, we calculated the median of each condition. The median of each condition was lower than four points. This indicates that the guides did not perceive particular difficulty in speaking.
For their impressions of cooperating with another guide, we compared (a), the trust of another guide, under the Mixto1 and 2 to 1 conditions. Wilcoxon's rank-sum test showed that the Mixto1 condition was significantly higher than the 2 tol condition (Mixtol $=6,2$ tol $=5, \mathrm{~W}=1520.5$, $\mathrm{p}<.05$ ).

We also compared (b), measure of cooperation satisfaction, with the Mixtol and 2 tol conditions. The Mixtol condition was significantly higher than the 2 to 1 condition (Mixto1 $=6,2$ to $1=$ $4, \mathrm{~W}=1831, \mathrm{p}<.05$ ).
The Mixto1 and 2 tol conditions were also compared for (c), an evaluation item of learning impression. The Mixtol condition was significantly higher than the 2 to 1 condition ( Mixtol $=6,2$ to $1=$ $5, \mathrm{~W}=1445, \mathrm{p}<.05$ ).
From the above results, the guides' satisfaction was higher in the Mixtol condition than in the 2 tol condition. The guides felt a sense of cooperation and trust with the other guide, adding that under the Mixtol condition, they acquired more knowledge than under the 2 tol condition.

One possible factor that resulted in such positive impressions for the Mixtol condition was that the guides were engaged in first-person conversations. Probably they quickly became absorbed in the conversations because the users acted like just one guide. Perhaps the guides felt that they had acquired knowledge because it was easy to regard the utterances of the other guides as their own. In the future, we must clarify which factor deepens the guides' impressions of subjective learning by scrutinizing the dialogue content.
In addition, it may also be necessary to examine the effect of a hidden channel used by the guides because it may have had particular effects on the cooperation of the guides.

User satisfaction We did not find a significant difference in (d), the users' perceived difficulty of speaking, in a Wilcoxon's rank-sum test that compared the Mixtol and 2 tol conditions (Mixto1 = 2,2 tol $=3, \mathrm{~W}=235, \mathrm{p}=$ n.s.). Both median values were lower than four (= neither), suggesting that they did not find it difficult to talk under either condition.

Next we analyzed (e), the impression of the users' information collection. When the Mixtol and 2 to 1 conditions were compared, no significant difference was detected (Mixto1 $=6,2$ to $1=$ $6, \mathrm{~W}=258, \mathrm{p}=$ n.s.). Both conditions had high scores. Perhaps the task of acquiring travel knowledge was relatively easy. Differences might surface in more difficult tasks.

In this experiment, we identified no significant differences in the user satisfaction between the Mixtol and 2tol conditions. However, we also found no evidence that the Mixto1 condition negatively impacted the users. Whether Mixto 1 can improved the dialogue quality must be investigated with another situation in the future.

## 5 Conclusion

We evaluated a situation in which two operators with different skills acted as one. We collected travel guide dialogues where two operators acting as one speaker, as two speakers, and alone. We evaluated the contents under each condition as well as the satisfaction of the operators and users. The operators experienced increased satisfaction with their learning and cooperation. The users were not dissatisfied with the situation of two operators speaking as one. It is suggested that the proposed cooperation style gives operators an opportunity to engage in advanced dialogue services as well as to learn the skills of the other operators.

In the future, we must scrutinize how the operators increased their satisfaction with learning and evaluate what kind of knowledge sharing occurred between the operators. We also need to examine a combination of other kinds of skills.

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[^0]:    ${ }^{1}$ https://slack.com

