Mining Preferences on Identifying Werewolf Players from Werewolf Game Logs

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Abstract. The deception party game "Are You a Werewolf?" requires players to guess other's roles through discussions that are based on one's own role and other players' crucial utterances. This paper proposes a method to mine the empirical preference data used to identify werewolves from game logs. This involves obtaining an empirical preference related to the practice of divination. In this method, if one of the three players revealing oneself as a *seer* divines a player as a *human*, while the other two players divine the player as a *werewolf*, then it can be judged that the divined player's role is a *werewolf*.

Keywords: The were wolf game \cdot "Are You a Were wolf?" \cdot Game logs \cdot Mining

1 Introduction

"Are you a werewolf?" is a party game that was created by the USSR in 1986. It models a conflict between an informed minority, the werewolf, and an uninformed majority, the villagers. The werewolf game has been popular in many countries including Japan where it has inspired several other activities. Some of these related activities include *Werewolf* TLPT (Werewolf: The live playing theater), a live improvisation where the actors and actresses play the werewolf game, and a TV variety show where comedians, actors, and actresses play the werewolf game.

In the research community of artificial intelligence (AI), the werewolf game is well known as one with imperfect information where certain information is hidden from some players. This is contrary to games that provide players with complete information such as chess, shogi, and go, where computer programs won against a human champion. Within the Japanese research community, the werewolf game has been employed to evaluate the performance of AI systems since 2014 [2] which has inspired researchers to develop computer-agent programs that actively participate in the werewolf game. The first Artificial Intelligence-Based Werewolf (AIWolf) competition was held in August 2015. However, in previous studies aiming at developing a computer-agent program that participates in the werewolf game tended to overlook research issues that are closely related to natural language processing and knowledge processing. These higher-level research issues include (i) understanding natural language conversations among the participants, (ii) inferring each player's roles on the basis of their utterances in game-related conversations, and (iii) deciding which player is the werewolf based on high-level inference.

The goal of this paper is to construct an agent that is able to analyze players' utterances and take an active role in the werewolf game. Firstly, we propose a method to mine empirical preferences used to identify *werewolf* players using game \log^{1} . We obtain an empirical preference related to the practice of divination where, if one of the three players reveals himself as a seer divines a player as a *human*, while the other two players divine the player as a *werewolf*, then it can be judged that the divined player's role is the *werewolf*.

2 Mining a Preference Based on Conflict of Divination

Among these preferences related to correctly identifying a *werewolf*, our method employs the act of divination. We especially focus on the case where more than one player reveals themselves as *seers* yet their divination encounters a conflict. More specifically, we concentrate on the case shown in Fig. 1, where three players reveal themselves as *seers*, among whom one player divines a player as a *human*, while the other two players divine the player as a *werewolf*. Then, as a result of mining a preference to correctly identify a *werewolf*, in this case, we can judge that the divined player's role is actually a *werewolf*.

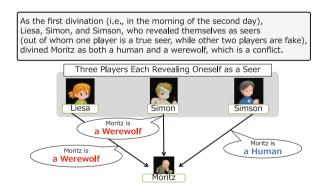


Fig. 1. An example of a conflict of divination

¹ We use WolfBBS (http://ninjin002.x0.com/wolff/ (in Japanese)) were wolf game log data. This is a were wolf game site on the Internet, where the players communicate with each other via a character-based text input communication channel. This were wolf game site keeps a record of the text data of the previous were wolf game logs and makes them publicly available.

 Table 1. Distribution of the variation of divination when one or more players reveal themselves as seers

(a) Distribution of the variation of a human and a were-wolf in divination

Variation of divination	# of games (%)
Only a human	37 (56.9)
Only a <i>werewolf</i>	0 (0)
Mixture of a <i>human</i> and a <i>werewolf</i>	28 (43.1)
Total	65 (100)

(b) Rate of games where the true role of the divined player being a werewolf when the variation of divination is the mixture of a human and a werewolf

Variation of divination		# of games where the true role of the divined player being a werewolf (%)
A human and a werewolf	9 (32.1)	4 (44.4)
A human, a human, and a werewolf	12 (42.9)	4 (33.3)
A human, a werewolf, and a werewolf	7(25.0)	7 (100)
Total	28 (100)	15 (53.6)

Before we mined the preference introduced above, we first randomly selected 65 game logs from the WolfBBS site. In every game, the *seers* are assumed to reveal themselves. Thus, in every game, one or more players will reveal themselves as *seers*. Considering this, in each of the randomly selected 65 games, we examine the result of the first divination (i.e., on the morning of the second day) by the player(s) who reveal themselves as *seer(s)*. Here, the variation of the divination by one or more player(s) who reveal themselves as *seer(s)*. Here, the variation of the divination by one or more player(s) who reveal themselves as *seer(s)* are among the following three: i.e., only a *human*, only a *werewolf*, and the mixture of a *human* and a *werewolf*. Table 1(a) shows the distribution of those three variations within the 65 games, where it is quite interesting to note that there is no observation of the divination variation as only a *werewolf*².

We further concentrate on those 28 games where the variation of the divination is the mixture of a *human* and a *werewolf*. Table 1(b) shows the distribution of the detailed variation of the divination, i.e., divination by two players as a *human* and a *werewolf*, divination by three players as:

- a human, a human, and a werewolf,
- and a human, a werewolf, and a werewolf.

For each of those three variations, Table 1(b) also shows the rate of the divined player's true role being a *werewolf*. This result clearly shows that the divined player is always a *werewolf* when the variation of the divination is a *human*, a *werewolf*, and a *werewolf*. Thus, we successfully mine a 100% correct preference in identifying a *werewolf* player that is based on the conflict in the divination process.

 $^{^2}$ This is simply because the werewolves' side usually do not abandon a true werewolf player by divining him/her as a werewolf.

Table 2. Variations of the roles of the three players who reveal themselves as seers
and divine (when the three players revealing themselves as seers each divine a player
as a <i>human</i> , a <i>werewolf</i> , and a <i>werewolf</i>)

Variation of divination	# of games (%)
(a) the seer divines the player as a <i>human</i> , the <i>werewolf</i> and <i>possessed</i> divine the player as a <i>werewolf</i>	0 (0)
(b) the <i>werewolf</i> divines the player as a <i>human</i> , the <i>seer</i> and possessed divine the player as a <i>werewolf</i>	0 (0)
(c) the possessed divines the player as a <i>human</i> , the <i>seer</i> and <i>werewolf</i> divine the player as a <i>werewolf</i>	7 (100)
Total	7 (100)

For the seven cases of the variation of the divination being a human, a werewolf, and a werewolf, Table 2 further examines the variation of the true roles of the three players who reveal themselves as seers. Again, it is quite interesting to note that in all of those seven cases, the possessed divine the player as a human, while the seer and the werewolf divine him/her as a werewolf (i.e., case (c)). The reason why the werewolf tends to take this strategy of following the seer's divination but abandoning the divined true werewolf player is to simply avoid being executed even after the divined true werewolf player is executed and is exposed as a werewolf. Also, a werewolf does not tend to take the strategies in cases (a) and (b) in Table 2 simply because they avoid taking the risk of being exposed as a werewolf but take on the strategy of abandoning the divined true werewolf player (case (b)), or not taking the strategy of divining a human player as a werewolf (case (a)).

3 Conclusion

This paper proposed a method of mining empirical preferences of identifying werewolf players from game logs. In terms of the related work on developing a computer-agent program that participates in the werewolf game, most studies have examined face-to-face werewolf games and analyzed the non-verbal audio cues, physical gestures, and conversational features such as speaker turns (e.g., Chittaranjan and Hung [1]).

References

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