## An Investigation of Twitter Users

## Who Gave Likes to Deleted Tweets Disclosing Submitters' Personal Information

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Abstract-Nowadays, many people use a Social Networking Service (SNS). Most SNS users are careful in protecting the privacy of personal information: name, age, gender, address, telephone number, birthday, etc. However, some SNS users disclose their personal information that can threaten their privacy and security even if they use unreal name accounts. In this study, we investigated Twitter users who gave likes to tweets disclosing submitters' personal information that potentially threatened submitters' privacy and security. We collected 318 tweets promising to disclose submitters' personal information. 30 tweets out of them were deleted in short order, specifically within a week after they were submitted. Then, we investigated the relations between the submitters of these 318 tweets and users who gave likes to them, taking into account whether or not the submitters deleted their tweets in short order. The results of our survey showed that the submitters followed most of the users mutually before the users gave likes to the tweets promising to disclose submitters' personal information whether or not the submitters deleted their tweets in short order. On the other hand, most of the users did not follow each other although they followed the same submitters and gave likes to their tweets.

Keywords-personal information; Twitter; SNS; mutual follows; privacy risk; unreal name account user.

#### I. INTRODUCTION

Nowadays, many people use a Social Networking Service (SNS) to communicate with each other and try to enlarge their circle of friends. SNS users are generally concerned about potential privacy risks. To be specific, they are afraid that unwanted audiences will obtain information about them or their families, such as where they live, work, and play. As a result, SNS users are generally careful in disclosing their personal information. However, some SNS users, especially young users, disclose their personal information on their profiles, for example, real full name, gender, hometown and full date of birth, which can potentially be used to identify details of their real life. In order to discuss the reasons why some SNS users disclose their personal information willingly, it is important to investigate who they want to read their SNS messages disclosing their personal information. However, it is difficult to ask them who they want to read them. To solve this problem, it is important to investigate who gave responses to their SNS messages disclosing their personal information. This is because, if submitters felt unwanted audiences read and gave responses to their SNS messages disclosing their personal information, they would delete them. In order to investigate who gave responses to SNS messages disclosing submitters' personal information, we investigated Twitter users who gave likes to tweets disclosing submitters' personal information [1].

Furthermore, we investigated whether users concerned with a tweet disclosing submitter's personal information followed each other. In other words, we investigated

- whether a submitter followed users who gave likes to his/her tweet disclosing his/her personal information,
- whether users who gave likes to a tweet disclosing submitter's personal information followed the submitter, and
- whether each user who gave a like to a tweet disclosing submitter's personal information followed every other user who gave a like to the same tweet.

In this study, we examine these points by checking their Twitter follow relations, taking into account whether or not a submitter deleted his/her tweet disclosing his/her personal information in short order. The investigation is based on an idea: when an user follow someone on Twitter, he/she is not a stranger to the user. By using the results of the investigation, we discuss the relations of submitters of tweets disclosing their personal information and users who gave likes to the tweets. The results of the investigation might improve social media design elements, such as privacy controls and friend introductions.

The rest of this paper is organized as follows: in Section II, we survey the related works. In Section III, we show how to collect tweets where submitters seemingly disclosed their personal information honestly and detect users who gave likes to them. In Section IV, we examine whether users concerned with a tweet disclosing submitter's personal information followed each other and discuss the relations of them. In Section V, we investigate users who gave likes to tweets that disclosed submitters' personal information and were deleted in short order. Finally, in Section VI, we present our conclusions.

#### II. RELATED WORK

Personally identifiable information is defined as information, which can be used to distinguish or trace an individual's identity, such as social security number, biometric records, etc. alone, or when combined with other information that is linkable to a specific individual, such as date and place of birth, mother's maiden name, etc. [2] [3]. Internet users are generally concerned about unwanted audiences obtaining personal information. Fox et al. reported that 86% of Internet users are concerned that unwanted audiences will obtain information about them or their families [4]. However, Internet users, especially young users, tend to disclose personal information on their profiles, for example, real full name, gender,



Figure 1. An unreal name account user, *Yata*, disclosed her personal profile items in her tweets.

hometown and full date of birth. As a result, many researchers discussed the reasons why young users willingly disclose personal information on their SNS profiles. Acquisti and Gross explained this phenomenon as a disconnection between the users' desire to protect their privacy and their actual behavior [5]. Also, Livingstone pointed out that teenagers' conception of privacy does not match the privacy settings of most SNSs [6]. On the other hand, Barnes argued that Internet users, especially teenagers, are not aware of the nature of the Internet and SNSs [7]. Viseu, Clement, and Aspinall reported that many online users believe the benefits of disclosing personal information in order to use an Internet site is greater than the potential privacy risks [8]. The authors think that most SNS users are seriously concerned about their privacy and security. However, they often underestimate the risk of their online messages and submit them. Hirai reported that many users had troubles in SNSs because they never thought that strangers observed their communication with their friends [9]. Watanabe, Nishimura, Chikuki, Nakajima, and Okada reported that some Twitter users submitted tweets disclosing their personal information that can threaten their privacy and security even if they use unreal name accounts [10]. In this study, we investigate what relations existed between users concerned with a tweet disclosing submitter's personal information. In order to analyze relations in communities, many researchers have adopted tie strength. Granovetter defined tie strength as the strength of a friendship: close friends are strong ties and acquaintances are weak ties [11]. Both strong ties and weak ties are useful because they provide access to different types of resources [12]. For example, strongly tied peers have greater motivation for assistance and provide access to information known by the group [11]. In contrast, weak ties provide diverse perspectives as well as novel information and resources [13]. Panovich, Miller, and Karger investigated the relation of tie strength to answer quality and showed that social network Q&A is more effective when the asker and answerer know each other well [14]. Gilbert and Karahalios proposed a predictive model of tie strength on Facebook using profile characteristics [15]. In this study, we investigate what relations existed between Twitter users concerned with a tweet disclosing submitter's personal information by checking their Twitter follow relations.



午後9:02 · 2021年12月30日 · Twitter for Android

Figure 2. A tweet promising to disclose the same number of submitter's personal profile items as likes to it.

#### III. A COLLECTION OF TWEETS DISCLOSING SUBMITTERS' PERSONAL INFORMATION

It is difficult to collect tweets disclosing submitters' personal information, such as tweets in Figure 1, directly. To solve this problem, we focused on tweets where submitters promised their audiences to disclose the same number of their own personal profile items as likes to their tweets. Figure 2 shows a tweet submitted by Yata on December 30, 2021. Both in Figure 1 and Figure 2, her screen name is redacted for privacy. Figure 2 shows that Yata promised her audiences to disclose the same number of her personal profile items as likes to her tweet. Actually, as shown in Figure 1, Yata submitted three replies disclosing her five personal profile items to her tweet shown in Figure 2 on December 30, 2021. Watanabe, Nishimura, Chikuki, Nakajima, and Okada reported that Twitter users seemingly disclosed their personal information honestly when they promised to do it, such as Yata's tweet in Figure 2 [10]. As a result, it is easy to collect tweets disclosing submitters' personal profile items when we collect tweets promising to disclose submitters' personal profile items. Furthermore, they often used the same sentence in their tweets, like a game password, as shown in Figure 2, # I will show the same number of my profile items as your likes. In order to collect tweets promising to disclose submitters' personal profile items, we used the shared sentence as key to collect them. To be specific, we collected these tweets by using Twitter API v2 [16]. Twitter API v2 helps us to collect tweets where the given sentence is used. Also, Twitter API v2 helps us to collect user accounts who submitted a specific tweet and who gave likes to it. Every 10 PM, we tried to collect user accounts and their tweets

- that contained # I will show the same number of my profile items as your likes
- that were submitted in the past 24 hours, and
- that were given one or more likes.

After we obtained the tweets promising to disclose submitters' personal profile items, we tried to collect user accounts who gave likes to the obtained tweets every 10 PM for a week. Finally, we collected 318 Japanese tweets promising to disclose submitters' personal information. These 318 tweets were submitted from December 30, 2021 to January 31, 2022 by 317 users. One out of the 317 users submitted two tweets promising to disclose his personal information on January 12 and 17, 2022. These 318 tweets were given 7060 likes by 6325 users within a week after they were submitted. These 318 tweets can be classified into

- 30 tweets that were deleted during the investigation period (one week), and
- 288 tweets that were not.

The 30 tweets and the other 288 tweets were given 708 and 6352 likes, respectively. Figure 3 shows the histogram of the number of likes given to the 288 tweets that were not deleted during the investigation period, specifically within a week after they were submitted. Figure 4 shows the daily number of likes given to the 288 tweets in the investigation period. Day N in Figure 4 means that N days have passed since the obtained tweet was submitted and our investigation started. Day 6 was the last day of the investigation period. Figure 4 shows that 77 % and 15 % of likes were given on Day 0 and Day 1, respectively. Figure 5 shows the histogram of the number of likes given to the 30 tweets that were deleted during the investigation period (one week). Figure 6 shows the daily number of likes given to the deleted 30 tweets in the investigation period. Figure 6 shows that 80 % and 14 % of likes were given on Day 0 and Day 1, respectively. As shown in Figure 4 and Figure 6, the distribution of the daily number of likes given to the deleted 30 tweets is similar to that of the other 288 tweets. Figure 7 shows the daily number of deleted tweets promising to disclose submitters' personal information in the investigation period. As shown in Figure 7, tweets were most often deleted on Day 4.

#### IV. An investigation of users concerned in tweets promising to disclose submitters' personal information

In this section, we investigate whether users concerned with a tweet promising to disclose submitter's personal information followed each other. To be specific, we survey

- Twitter users who submitted tweets promising to disclose the same number of their own personal profile items as likes and
- Twitter users who gave likes to these tweets

and investigate

- whether an user who submitted a tweet promising to disclose his/her personal information followed users who gave likes to the tweet,
- whether users who gave likes to a tweet promising to disclose submitter's personal information followed the submitter, and
- whether users who gave likes to a tweet promising to disclose submitter's personal information followed each other.

The investigation is based on an idea: when an user follow someone on Twitter, he/she is not a stranger to the user. We can know whether an user follows someone on Twitter by using Twitter API v2.

After collecting user accounts of submitters and users who gave likes to tweets promising to disclose submitters' personal information, we analyze the relations between them. The relations between a submitter and an user who gave a like to a tweet promising to disclose submitter's personal information can be classified into three types:

- mutual follow relation: the submitter and the user mutually followed each other.
- one sided follow relation: the submitter followed the user, however, the user did not. Or, the user followed the submitter, however, the submitter did not.
- no follow relation: the submitter and the user did not follow each other.

Furthermore, we analyze the relations among users who gave likes to a tweet promising to disclose submitter's personal information. They can also be classified into three types: mutual follow relation, on sided follow relation, or no follow relation.

Let us consider one example. As shown in Figure 2, a Twitter user, Yata, submitted a tweet promising her audiences to disclose the same number of her own personal profile items as likes on December 30, 2021 at 9:02 PM. We detected her tweet on the same day at 10:00 PM, and then, recorded that she received five likes and submitted three replies disclosing her five personal profile items on December 30, 2021. After that, every 10 PM, we tried to check whether someone gave likes to her tweet. On January 5, 2022, we confirmed that five users gave five likes to her tweet on December 30, 2021, as shown in Figure 2, and finished the investigation on her tweet. Then, we analyzed the relations between Yata and each of the five users and confirmed that she followed them and each of them followed her. As a result, the relations between Yata and each of the five users were mutual follow relations. Furthermore, we analyzed the relations among the five users. There were ten cases to choose two out of the five users. In one case out of the ten, two users followed each other. On the other hand, in nine cases out of the ten, two users did not follow each other. As a result, the relation of one case was a mutual follow relation and the relations of the other nine cases were no follow relations.

As mentioned in Section III, the obtained 318 tweets promising to disclose submitters' personal information can be classified into

• 30 tweets that were deleted during the investigation period (one week), and



(a) the number of likes given to the 288 tweets during the investigation period (one week).



(b) the number of likes given to the 288 tweets on the first day of the investigation period.

Figure 3. The histogram of the number of likes given to the 288 tweets that promised to disclose submitters' personal information and were not deleted during the investigation period (one week).



Figure 4. The daily number of likes given to the 288 tweets since the tweets were submitted.

• 288 tweets that were not.

In this section, we survey the 288 tweets that were not deleted during the investigation period and investigate the relations between the submitters of the 288 tweets and the users who gave likes to them.

A. Follow relations between submitters and users who gave likes to tweets promising to disclose submitters' personal information

At first, we discuss the mutual follow relations between submitters and users who gave likes to tweets promising to disclose submitters' personal information. In order to discuss this problem, we introduce the ratio of mutual follow relations between a submitter and users who gave likes to his/her tweet. Suppose that the number of users who gave likes to tweet tis n and m of them are mutually following the submitter of



(a) the number of likes given to the deleted 30 tweets during the investigation period (one week).



(b) the number of likes given to the deleted 30 tweets on the first day of the investigation period.

Figure 5. The histogram of the number of likes given to the deleted 30 tweets promising to disclose submitters' personal information.



Figure 6. The daily number of likes given to the deleted 30 tweets since the tweets were submitted.



Figure 7. The daily number of deleted tweets promising to disclose submitters' personal information since the tweets were submitted.



Figure 8. The histograms of the ratio of mutual follow relations between the submitters of the 288 tweets that were not deleted during the investigation period and the users who gave likes to them on the first day (Day 0) and the last day (Day 6) of the investigation period.



Figure 9. The histograms of the ratio of no follow relations between the submitters of the 288 tweets that were not deleted during the investigation period and the users who gave likes to them on the first day (Day 0) and the last day (Day 6) of the investigation period.

tweet t. Then, the ratio of mutual follow relations between the submitter of tweet t and the users who gave likes to it,  $P_{MF1}(t)$ , is defined as follows:

$$P_{MF1}(t) = \frac{m}{n}$$

Figure 8 shows the distribution of the ratio of mutual follow relations between the submitters of the 288 tweets that were not deleted during the investigation period and the users who gave likes to them. Furthermore, Figures 8 (a) and (b) show the distribution of them investigated on the Day 0 and Day 6, respectively. As shown in Figure 8, it is probable that most of the users have followed the submitters mutually before they gave likes to submitters' tweets promising to disclose their personal information. In other words, the submitters and most of the users were not strangers to each other. The distribution of the mutual relation ratio on Day 6 (Figure 8 (b)) moved to the left than that on Day 0 (Figure 8 (a)). It showed that

the number of users who did not follow the submitters and whom the submitters did not follow increased. It is probable that submitters were careful to follow unfamiliar users even if they gave likes to their tweets.

Next, we discuss the no follow relations between submitters and users who gave likes to tweets promising to disclose submitters' personal information. In order to discuss this problem, we introduce the ratio of no follow relations between a submitter and users who gave likes to his/her tweet. Suppose that the number of users who gave likes to tweet t is n and l of them are not following the submitter of tweet t and the submitter is not following them, too. Then, the ratio of no follow relations between the submitter of tweet t and the users who gave likes to it,  $P_{NF1}(t)$ , is defined as follows:

$$P_{NF1}(t) = \frac{l}{n}$$



Figure 10. The histograms of the ratio of mutual follow relations among the users who gave likes to the 288 tweets that were not deleted during the investigation period on the first day (Day 0) and the last day (Day 6) of the investigation period.



Figure 11. The histograms of the ratio of no follow relations among the users who gave likes to the 288 tweets that were not deleted during the investigation period on the first day (Day 0) and the last day (Day 6) of the investigation period.

Figure 9 shows the distribution of the ratio of no follow relations between the submitters of the 288 tweets that were not deleted during the investigation period and the users who gave likes to them. Figure 9 shows that the number of users who had the no follow relations with the submitters was small on Day 0 and increased since then. It is probable that the delays were caused by the time it took to find tweets disclosing submitters' personal information.

# B. Follow relations among users who gave likes to tweets promising to disclose submitters' personal information

At first, we discuss the mutual follow relations among users who gave likes to tweets promising to disclose submitters' personal information. In order to discuss this problem, we introduce the ratio of mutual follow relations among users who gave likes to a tweet. Suppose that the number of users who gave likes to tweet t is n and there are m cases where two users of them are following each other. Then, the ratio of mutual follow relations among the users who gave likes to tweet t,  $P_{MF2}(t)$ , is defined as follows:

$$P_{MF2}(t) = \frac{m}{n(n-1)/2}$$

Figure 10 shows the distribution of the ratio of mutual follow relations among the users who gave likes to the 288 tweets that were not deleted during the investigation period. Figure 10 shows that it is probable that most of the users did not follow each other mutually. In other words, most of the users were strangers to each other although they followed the same submitters and gave likes to their tweets.

Next, we discuss the no follow relations among users who gave likes to tweets promising to disclose submitters' personal information. In order to discuss this problem, we introduce the ratio of no follow relations among users who gave likes to a



Figure 12. The histograms of the ratio of mutual follow relations between the submitters of the deleted 30 tweets and the users who gave likes to them on the first day (Day 0) and one day prior to the day they were deleted.



Figure 13. The histograms of the ratio of no follow relations between the submitters of the deleted 30 tweets and the users who gave likes to them on the first day (Day 0) and one day prior to the day they were deleted.

tweet. Suppose that the number of users who gave likes to tweet t is n and there are l cases where two users of them are not following each other. Then, the ratio of no follow relations among the users who gave likes to tweet t,  $P_{NF2}(t)$ , is defined as follows:

$$P_{NF2}(t) = \frac{l}{n(n-1)/2}$$

Figure 11 shows the distribution of the ratio of no follow relations among the users who gave likes to the 288 tweets that were not deleted during the investigation period. The distribution of the no relation ratio on Day 6 (Figure 11 (b)) was similar to that on Day 0 (Figure 11 (a)). It showed that it is probable that not many users started to follow users within a week even if they gave likes to the same tweets. It is probable that users were careful to follow unfamiliar users even if they gave likes to the same tweets.

#### V. AN INVESTIGATION OF USERS CONCERNED IN DELETED TWEETS PROMISING TO DISCLOSE SUBMITTERS' PERSONAL INFORMATION

As mentioned in Section III, the obtained 318 tweets promising to disclose submitters' personal information contained 30 tweets that were deleted during the investigation period, specifically within a week after they were submitted. In this section, we investigate the relations between the submitters of the deleted 30 tweets and the users who gave likes to them.

Figure 12 shows the distribution of the ratio of mutual follow relations between the submitters of the deleted 30 tweets and the users who gave likes to them. Furthermore, Figures 12 (a) and (b) show the distribution of them investigated on the Day 0 and one day prior to the day they were deleted, respectively. As in Figure 8, Figure 12 shows that it is probable that most of the users have followed the submitters mutually before they gave likes to submitters' tweets promising



Figure 14. The histograms of the ratio of mutual follow relations among the users who gave likes to the deleted 30 tweets on the first day (Day 0) and one day prior to the day they were deleted.



Figure 15. The histograms of the ratio of no follow relations among the users who gave likes to the deleted 30 tweets on the first day (Day 0) and one day prior to the day they were deleted.

to disclose their personal information. In other words, the submitters and most of the users were not strangers to each other for some time.

Figure 13 shows the distribution of the ratio of no follow relations between the submitters of the deleted 30 tweets and the users who gave likes to them. As in Figure 9, Figure 13 shows that the number of users who had the no follow relations with the submitters was small.

Figure 14 and Figure 15 show the distribution of the ratio of mutual follow relations and no follow relations among the users who gave likes to the deleted 30 tweets, respectively. As in Figure 10 and Figure 11, Figure 14 and Figure 15 show that it is probable that many of the users did not follow each other mutually although they followed the same submitters and gave likes to their tweets. In other words, many of the users were strangers to each other even if they followed the same submitters and gave likes to the same tweets. In this way, the follow relations of users concerned with the deleted 30 tweets promising to disclose submitters' personal information are similar to those of users concerned with the 288 tweets that were not deleted during the investigation period. As a result, the results of our survey showed that, whether or not submitters deleted their tweets disclosing their personal information in short order,

- the submitters followed most of the users mutually before the users gave likes to tweets promising to disclose submitters' personal information, and
- most of the users did not follow each other although they followed the same submitters and gave likes to their tweets.

### VI. CONCLUSION

In this paper, we investigated the relations of submitters of tweets promising to disclose their personal information

and users who gave likes to the tweets, taking into account whether or not the submitters deleted their tweets in short order. The results of our investigation show that most of the users had followed the submitters mutually before they gave likes to submitters' tweets promising to disclose their personal information whether or not the submitter deleted their tweets in short order. On the other hand, most of the users did not follow each other although they followed the same submitters and gave likes to their tweets. As time went on, the number of users who gave likes to submitters' tweets promising to disclose their personal information but did not follow the submitters and whom the submitters did not follow increased. It is probable that submitters were careful to follow unfamiliar users even if they gave likes to their tweets. Also, users were careful to follow unfamiliar users even if they followed the same submitters and gave likes to the same tweets. The system that understands these relations might carefully treat users who choose not to friend someone with good reasons.

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