

A NOVEL FRAMEWORK FOR PRIVACY-PRESERVING DATA PUBLISHING WITH MULTIPLE SENSITIVE ATTRIBUTES

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ABSTRACT

The world is now experiencing a great technological revolution, as many fields have become dependent on it. The use of technology by members of society has become daily. Data is collected on individuals by using smart technology applications in hospitals or companies. These organizations are managed through databases that record data about their customers. The collected data may include sensitive data (e.g., personal data) that individuals do not want to disclose. In order to continue development, we sometimes need to publish this data for the purposes of research, statistical studies or decision-making. The publication of this data constitutes a threat to the privacy of the customer as it can be exploited by the intruder.

This research focuses on trying to provide Privacy-Preserving Data Publishing algorithm that preserves customer privacy with the possibility of publishing this data with less information loss.

KEYWORDS

trust Privacy-Preserving Data Publishing (PPDP), l-diversity

1. INTRODUCTION

The world is now experiencing a great technological revolution, as many fields have become dependent on it. The use of technology by members of society has become daily. The using of smart technology applications in smart cities leads to the collection of many data about individuals. The collected data may include sensitive data (e.g., personal data) that individuals do not want to disclose. This data is published to public for the purposes of research, statistical studies or decision-making. usually Privacy-Preserving Data Publishing by the traditional approach of removing direct identifying fields such as name or national number. This approach is not sufficient because it has been proven that the intruder can take advantage of Quasi identifiers (QID's) and reveal identity[1].

Figure 1 shows the stages of managing published data and that it passes through three stages: data collection, data storage, and data publishing. The intruder can obtain published data in data publishing stage to disclose identity. Therefore, the disclosure of published data threatens the privacy of the individual because it can be used to reveal identity. Hence the urgent need to use the anonymization techniques to apply it to the data before publishing it.

When the data is collected, it is published in the form of micro-data. Micro-data is a file made up of records 'n'. Each record consists of a number of attributes of individuals 'm'. For example, in the field of business, data about employees is collected to make a decision, as shown in Table 1. In this table, it is clear that there are different types of attributes: Identifying attributes, Quasi identifiers (QID's) and Sensitive Attributes (SA's). Identifying attributes directly reveals the identity of the individual and often this data is never published, that is, it is deleted before publication like name and ID. Quasi identifiers (QID's) indirectly help disclosure the attributes of an individual. Sensitive Attributes (SA's) is the personality attributes that the individual does not want to disclose like salary . Sensitive attributes are often multiple sensitive attributes.

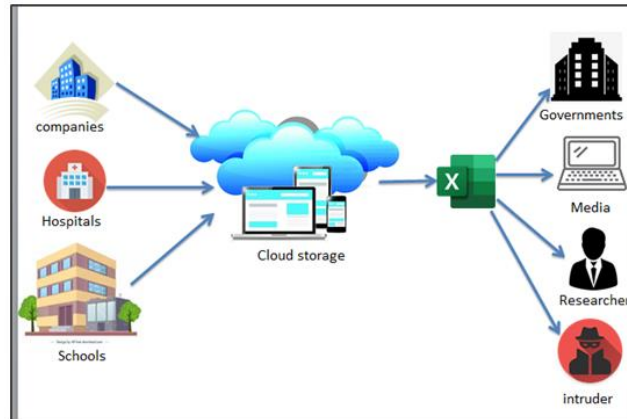


Figure 1. Data Publishing Stages

Table 1. Microdata table.

Identifier	Quasi Identifiers		Sensitive Attributes		
	Name	Age	ZIP code	Salary	Occupation
Adam	33	11564	35000	Doctor	NO
Alice	26	11534	43000	Engineer	NO
Ali	36	11528	11000	Teacher	YES
Aiden	22	21577	33000	Engineer	NO
Bob	21	21558	41000	Doctor	NO
Henry	28	21519	12000	Teacher	YES

2. CONTRIBUTIONS OF THE PAPER

- This study aims to provide an effective algorithm that forms a framework for Preserve the privacy of published data.
- In this study, many basic principles in the field of Privacy-Preserving Data Publishing will be discussed.
- In this study, there is discussion for many previous study about anonymization operations and privacy preserving algorithms.

3. ANONYMIZATION OPERATIONS

As mentioned previously, the published data is in the form of micro-data, which means that it is present in all its types (Identifying attributes, Quasi identifiers Attributes (QID's) and Sensitive Attributes (SA's) in single table. We need to separate the table by the anatomization.

Anatomization is a method of separating the main table into separate tables according to the type of data[1]. It separates the table vertically without distinguishing the data type. The outputs from the anatomization process are a table of sensitive data (ST) and a table of Quasi identifiers table(QT).

Slicing is used to horizontally to portion to form groups called tuple[2]. Slicing is used to apply l-diversity requirement and assign group IDs.l-diversity means every equivalence class should have been at least 1 well represented values for the sensitive attribute[3].

4. RELATED WORK

With the rapid development in the world, there is a need to use modern technology on a daily basis [4]. Government sectors and organizations collect a huge amount of data about individuals [5].

Therefore, there is a need to protect this data from disclosure. Several studies have been presented in the field of Privacy-Preserving Data Publishing (PPDP). All of these studies aim to provide privacy to the individual in an effective, safe and more reliable manner. PPDP contain two steps: data collection and data publishing phase [4].

In 2006 one of anonymization method of privacy-preserving Data publishing is Anatomy that is discussed in [6]. This method is used to hide identity. It is used in the process of generalization and suppression, as there is no modification to quasi-identifiers or sensitive attributes. In this method, the relationship between the quasi attributes and the sensitive attributes are separated. In 2009 While seeking to improve the data utility, taking into account privacy, ANGEL method appeared [7]. This method depends on the generalization and improve it.

In 2011 RATING algorithm is proposed create Attribute Table and an ID Table that are based on various sensitivity coefficients for different attributes[8].

In 2013 SLOMS proposed to be dealt with the multiple sensitive attributes where sensitive attributes are divided vertically into several tables and then grouped to meet the requirements of the I-diversity[9].The problem with this method is that there is a large percentage of information loss.

In 2016 Another method of anonymization method is Anatomization with Slicing .In this method, the anatomy and slicing techniques are combined. The anatomy method and slicing method produce the quasi-identifier table as the original form and divides the table horizontally and exchanges the sensitive attributes in each partition. The disadvantages of this methods generate more complex tables[10] .

In 2019 Raju et al proposed use the distribution of sensitive values[11]. In this method, the distribution of sensitive values is used as a method to preserve privacy where there is similarity between them and group of quasi-identifier attributes.

In 2020 ,[12] use special format of l-diversity that called (l, d) semantic diversity to Privacy-preserving data publishing with multiple sensitive attributes.

In 2021 Susan also proposed clustering method for Privacy-preserving Data Publishing With Multiple Sensitive Attributes [13].

5. METHODOLOGY

This study seeks to provide algorithm for Privacy-Preserving Data Publishing. At the beginning, we will explain the inputs and outputs of this algorithm. The inputs will be collected by companies or government agencies, either for the purpose of statistical studies or others. This data is either sensitive , Quasi-identifier data or identifier data. The inputs deals as micro data. identifier data is usually removed before publishing. .The outputs of this algorithm are anonymized tables. This algorithm will be detailed in the form of steps. Inputs, outputs and the goal of each step will be explained. The first step is to apply anatomy method in order to split the micro-data table vertically to separate sensitive data table ST and Quasi Identifiers data table QT as in Figure 2.The input: micro-data table,outputs:ST and QT and objective: to separate sensitive data from Quasi Identifiers data. The second step is to create dependency table(DT) where each sensitive attribute is assigned a SID and determines its dependence on the remaining sensitive attributes as shown in Figure 3. Input: ST, output:DT and objective:Create a dependency table to use in step 3. The third step is to create the sensitive tables ST_i separately, depending on DT that resulting from the second step, as shown in Figure 4.Inputs:DT, outputsST₁,ST₂ ...ST_i and objective: to be used in building anonymized tables. The fourth step is to slice each ST_i horizontally so as to satisfy l-diversity requirement and assign group IDs as shown in Figure 5 .The Inputs:ST_i, outputs: ST_i with The slicing that meets the l-diversity requirement, and objective:To provide tables that contribute to creating an anonymized table. The fifth step is to slice each ST_i horizontally that contain numerical value so as to satisfy l-diversity requirement and assign NIDs as shown in Figure 6 .The Inputs:ST_i that contains numerical value , outputs: NST_i with The slicing that meets the l-diversity requirement, and objective:To provide tables that contribute to creating an anonymized table. The Sixth step is to construct the anonymized table (AT) from QT in the original form and the SA that are mapped to their respective tables (ST_i,NST_i) as shown in Figure 6 .The Inputs:ST_i ,NST_i and QT , outputs: anonymized table AT and objective:Configure an anonymous table so that it can be published without worrying about identity detection.

The following tables are published ST_i, NST_i, QT and AT without worrying about identity detection.

Quasi Identifiers		Sensitive Attributes		
Age	ZIP code	Salary	Occupation	Financial support
33	11564	35000	Doctor	NO
26	11534	43000	Engineer	NO
36	11528	11000	Teacher	YES
22	21577	33000	Engineer	NO
21	21558	41000	Doctor	NO
28	21519	12000	Teacher	YES

Figure 2. Separating QT and ST

Dependency table		
SID	SA	Dependency
S ₁	Occupation	--
S ₂	Salary	S ₁
S ₃	Financial support	S ₂

Figure 3. Dependency Table

Sensitive Table (ST1)		Sensitive Table(ST2)	
Salary	Occupation	Salary	Financial support
35000	Doctor	35000	NO
43000	Engineer	43000	NO
11000	Teacher	11000	YES
33000	Engineer	33000	NO
41000	Doctor	41000	NO
12000	Teacher	12000	YES

Figure 4. Sensitive Tables (STi)

Sensitive Table (ST1)			Sensitive Table(ST2)		
Salary	Occupation	Group ID	Salary	Financial support	Group ID
35000	Doctor	G1	35000	NO	G1
43000	Engineer		43000	NO	
11000	Teacher		11000	YES	
33000	Doctor	G2	33000	NO	G2
41000	Engineer		41000	NO	
12000	Teacher		12000	YES	

Figure 5. STi After Apply l-diversity

Numeric Sensitive Table(NST1)	
Salary	NID
35000	N1
11000	
33000	
41000	N2
12000	
43000	

Figure 6. Numeric Sensitive Table(NSTi)

6. CONCLUSIONS

Privacy threats increase dramatically on publishable data, which contains sensitive data that must be preserved and anonymised. This paper discusses a proposed algorithm to preserve the privacy of published data. It also provides an effective model against privacy threats for the published data. As part of future work it can be demonstrated how this algorithm contributes to reduce the information losing and execution time and increase diversity degree.

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