Trust Prediction From User Rating Implementation Report.

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Abstract—This project is inspired by "Trust prediction from user-item ratings"[1]. The objective of this project is that I intend to create eight Java programs to calculate data by using the methods from the article that written by Nikolay Korovaiko and Alex Thomo. Given features such as user Id and another user Id that in the data set, the program will calculate those data in the local sever buy using different strategies, and be able to output of all the parameters that are needed for doing trust prediction.

ACKNOWLEDGEMENT

In the beginning, I would like to express my very great appreciation to my supervisor Dr.Thomo, for his patient guidance, enthusiastic encouragement and useful critiques of this research work. He has continually encouraged me to think about this project, and when I'm having questions, he always answered patiently. Without his support, this project would not be possible. As an undergraduate student who wants to discover more in the big data world, he definitely gives me the courage and confidence to keep studying and researching.

I. INTRODUCTION

The social network is exponentially growing in recent years. Along with the popular use of the Internet, many people have decided to become a resident on the Internet. Therefore, people's concepts of society have been greatly influenced by the social network. The social network is the main platform that connects everyone on the Internet. People can get information, buying and selling through Internet; however, all of this actives are based on trust links between users. Unlike, building the trust relationship in the real world, It is hard to know what other users through Internet . The trust relationship is essential for online trading. Therefore, predicting the user will trust another user will be an important factor that changes the online trading structure. Since the machine learning technology is also growing rapidly, it will be a good idea to use machine learning skill studying the user behavior in order to make trust prediction. This project will mainly focus on implanting the trust prediction idea from the article that written by Nikolay Korovaiko and Alex Thomo.

II. RELATED WORKS

There has been some research regarding trust prediction for social network. Three researchers have done a studying on developing and improving automatic techniques that support users in making their on-line activities[2]. Another group of researchers has done a study on trust prediction from a sociological perspective[3]. This project relates to those because it will attempt to predict the trust prediction from the social network. Their studies can bring more ideas on building a better trust prediction model.

III. PROJECT DESCRIPTION

The final deliverable for the project will be eight Java programs that allow users to interact with given dataset. The user will give the two user ID, after running a specific program, such as "fla.Java" it will output values into text files. Those text files will contain two user ID, and the value of parameter fla of those two users, and the trust relationship of those two users. "1" indicates user1 trusts user2, "-1" implies that user1 doesn't trust user2. Users can follow these steps to get the eight intermediate sets. Those will be used in building the training model for trust prediction.

A. Prediction and Categories

The first thing I would like to do with the data is that given the attributes listing on the dataset that I downloaded from trustlet[4]. I want to make the following explanations.

- user1 is trust user2
- user2 is trust user1
- user1 and user2 trust each other

The trust relationship is identified as following:

- 1 user1 has positive trust statement to user2
- -1 user1 has negative trust statement to user2

The the factor of determining trust statement are identified as following:

- User ID
- Item ID
- Rating
- Categories
- Reviews
- Reviews rated by other user
- · Categories of reviews item
- Anonymous rating

B. Dataset

All the data comes from trustlet[4]. In this project, I mainly focus on the extended epinions dataset. In the extended epinions dataset, it contains user_rating.txt,mc.txt, and rating.txt.

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| MY_ID | OTHER_ID | VALUE | CREATION |
|------------|-----------|-------|------------|
| 3287060356 | 232085 | -1 | 2001/01/10 |
| 3288305540 | 709420 | 1 | 2001/01/10 |
| 3290337156 | 204418 | -1 | 2001/01/10 |
| 3294138244 | 269243 | -1 | 2001/01/10 |
| 3294138244 | 170692484 | -1 | 2001/01/10 |
| 3296759684 | 347967364 | 1 | 2001/01/10 |
| | | | |

Fig. 1. Information stored in user_rating.txt.

| CONTENT_ID | AUTHOR_ID | SUBJECT_ID |
|------------|-----------|--------------|
| 1445594 | 718357 | 149002425217 |
| 1445595 | 220568 | 149003604865 |
| 1445596 | 717325 | 5303145344 |
| 1445597 | 360156 | 192620893057 |
| 1445598 | 718857 | 149002163073 |
| 1445600 | 513114 | 34252 |
| | | |

Fig. 2. Information stored in mc.txt.

- 1) user_rating.txt: This text file contains the trust relationship between two users in epinion. The first row indicates that user 3287060356 distrust user 232085 on 2001/01/10[Fig 1].
 - MY_ID: This stores Id of the member who is making the trust/distrust statement.
 - OTHER_ID: The other ID is the ID of the member being trusted/distrusted.
 - VALUE: Value = 1 for trust and -1 for distrust.
 - CREATION: It is the date on which the trust was made.
- 2) mc.txt: This file stores the information about the reviews, and reviewers. The first row shows the review 1445594 is written by user 718357 with subject 149002425217[Fig 2].
 - CONTENT_ID: The object ID of the article.
 - AUTHOR_ID:The ID of the user who wrote the article.
 - SUBJECT_ID:The ID of the subject that the article is supposed to be about.
- *3) rating.txt:* This file stores the information about the ratings and raters. The first row shows the item(review) 139431556 is rated by user 591156 with rating 5 and show the rating on 2001/01/10, and the category is 2518365 [Fig 3].
 - OBJECT_ID: The object ID is the object that is being rated. The only valid objects at the present time are the content_id of the member_content table. This means that at present this table only stores the ratings on reviews and essays
 - MEMBER_ID:Stores the id of the member who is rating

| OBJECT_ID | MEMBER_ID | RATING | STATUS | LAST_MODIFIED | TYPE | VERTICAL_ID |
|-----------|------------|--------|--------|---------------|------|-------------|
| 139431556 | 591156 | 5 | 0 | 2001/01/10 | 1 | 2518365 |
| 139431556 | 1312460676 | 5 | 0 | 2001/01/10 | 1 | 2518365 |
| 139431556 | 204358 | 5 | 0 | 2001/01/10 | 1 | 2518365 |
| 139431556 | 368725 | 5 | 0 | 2001/01/10 | 1 | 2518365 |
| 139431556 | 277629 | 5 | 0 | 2001/01/10 | 1 | 2518365 |
| 139431556 | 246386 | 5 | 0 | 2001/01/10 | 1 | 2518365 |
| | | | | | | |

Fig. 3. Information stored in rating.txt.

the object

- RATING:Stores the 1-5 (1- Not helpful, 2 Somewhat Helpful, 3 Helpful 4 Very Helpful 5- Most Helpful) rating of the object by member.
- STATUS: The display status of the rating. 1:- means the member has chosen not to show his rating of the object and 0 meaning the member does not mind showing his name beside the rating.
- LAST_MODIFIED: The latest date on which the member modified his rating of the object TYPE If and when
 we allow more than just content rating to be stored in
 this table, then this column would store the type of the
 object being rated.
- VERTICAL_ID: Vertical_id of the review.

| MY_ID | OTHER_ID | VALUE |
|------------|-----------|-------|
| 3287060356 | 232085 | -1 |
| 3288305540 | 709420 | 1 |
| 3290337156 | 204418 | -1 |
| 3294138244 | 269243 | -1 |
| 3294138244 | 170692484 | -1 |
| 3296759684 | 347967364 | 1 |
| | | |

Fig. 4. user_rating.txt after cleaning

| OBJECT_ID | MEMBER_ID | RATING | STATUS |
|-----------|------------|--------|--------|
| 139431556 | 591156 | 5 | 0 |
| 139431556 | 1312460676 | 5 | 0 |
| 139431556 | 204358 | 5 | 0 |
| 139431556 | 368725 | 5 | 0 |
| 139431556 | 277629 | 5 | 0 |
| 139431556 | 246386 | 5 | 0 |
| | | | |

Fig. 5. mc.txt after cleaning

C. Preprocessing data

In order to improve the program's running efficiency, it is essential to use a well-processed input dataset. The original text files separate the rater, type of the item and the producer. The key idea in this processing step is to combine the rater who rated the item i, the reviewer who produced the item i, the type of the item.

- 1) Removing unnecessary informations: First of all, we need to clean the dataset for the better calculation accuracy and running efficiency.
 - user_rating.txt: I deleted CREATION column[Fig 4].
 - rating.txt: I deleted LAST_MODIFIED column and TYPE column, and VERTICAL_ID column[Fig 5].
- 2) Store dataset into the program: I used Scanner inputstream = new Scanner(file) to take input from the rating.txt, and mc.txt;
 - item[]: It stores the the item id from user_rating.txt.
 - user[]: It stores the user id from user_rating.txt.
 - item1[]: It stores the item id from mc.txt.
 - type1[]: It stores the type of the item from mc.txt.
 - review1[]: It stores the reviewer id from mc.txt.

```
public static long search(long i) {
        for (int k = 0; k < 1559803; k++) {
            if (i == item1[k]) {
                return type1[k];
        return -1;
    public static void output() {
            PrintStream out = new PrintStream(new FileOutputStream(
                    "C:\\Users\\s6770\\Desktop\\project1\\sources\\rater.txt"));
            long output = 0;
            for (int i = 0; i < 13668320; i++) {
                output = search(item[i]);
                out.println(output);
            out.close();
        } catch (FileNotFoundException e) {
            e.printStackTrace():
    }
int i =0;
```

Fig. 6. Code segment of pairing the rater with type of the item.

- 3) Pairing the rater with type of the item.: Here is code segment of paring the rater with the type of rated item[Fig 6]. The basic idea is sending every item id in item[] to function Search, This function will return the typed of that item. It output the type into the type.txt file.
- 4) Pairing the rater with reviewer.: Here is code segment of paring the rater with reviewer[Fig 7]. The basic idea is sending every item id in item[] to function Search, This function will return reviewer id. It output the id into the reviewer.txt file.

Fig. 7. code segment of paring the rater with the type of rated item

| OBJECT_ID | MEMBER_ID | RATING | STATUS | TYPE | REVIEWER |
|-----------|-----------|--------|--------|------|----------|
| 762106 | 302684 | 5 | 0 | 5382 | 410833 |
| 763070 | 407724 | 5 | 0 | 5382 | 296847 |
| 762106 | 282012 | 4 | 0 | 5382 | 410833 |
| 762106 | 319858 | 5 | 0 | 5382 | 410833 |
| 762106 | 216630 | 5 | 0 | 5382 | 410833 |
| 762067 | 228431 | 5 | 0 | 5382 | 246598 |
| 763070 | 206439 | 5 | 0 | 5382 | 296847 |
| | | | | | |

Fig. 8. new rating.txt

5) Combining type.txt and reviewer.txt: After we get the two text files we can start combining rating.txt, type.txt, and reviewer.txt. Here is the new rating.txt file[Fig 8].

D. Sorting

Before we start sorting, it is important to remove all the noisy data(rows with data missing). After cleaning the data, we can start sorting the rows depends on the column feature. In rating.txt, I sorted rows depends on the user id from smallest value to largest value[Fig 9].

I also create a copy of rating.txt, and I renamed it with category.txt In category.txt, I sorted rows depends on the reviewer id from smallest value to largest value[Fig 10].

In user_rating.txt, I sorted rows depend on the MY_ID[Fig 11].

E. Java program explanation

In this project, I build eight Java classes, and each of them is corresponding with the parameter calculation in the article. All of them will take input from category.txt, rating.txt, user_rating.txt, and list.txt.

| OBJECT_ID | MEMBER_ID | RATING | STATUS | TYPE | REVIEWER |
|------------|-----------|--------|--------|------------|----------|
| 1292308 | 199775 | 5 | 0 | 6283 | 521788 |
| 3386805892 | 199781 | 4 | 0 | 159845 | 212098 |
| 2206633604 | 199781 | 5 | 0 | 40251 | 243427 |
| 750400 | 199781 | 3 | 0 | 160847 | 200202 |
| 3606023812 | 199781 | 5 | 0 | 139535 | 222936 |
| 1196199556 | 199781 | 5 | 0 | 5617849216 | 528728 |
| | | | | | |

Fig. 9. rating.txt sorted by user id

| OBJECT_ID | MEMBER_ID | TYPE | REVIEWER | RATING | STATUS |
|------------|-----------|------------|----------|--------|--------|
| 7892471428 | 296496 | 6283 | 199775 | 3 | 0 |
| 7892471428 | 687460 | 6283 | 199775 | 3 | 0 |
| 7892471428 | 244660 | 6283 | 199775 | 3 | 0 |
| 7892471428 | 292701 | 6283 | 199775 | 3 | 0 |
| 805720 | 622084 | 5583836032 | 199776 | 5 | 0 |
| 805720 | 307076 | 5583836032 | 199776 | 5 | 0 |
| | | | | | |

Fig. 10. rating.txt sorted by reviewer id

1) fl.Java: This java class will take input from rating.txt, user_rating.txt, and list.txt.

fla: The key idea of this calculation is to create those functions:

- Iu: return the set of items rated by u.
- Iur: return the set of items rated r (where r 2 f1; 2; 3; 4; 5g) by u.
- ru_avg: return the average rating by user u.
- rui: return the rating of item i that rated by user u.

After creating those functions we can start putting everything together as the formula f1a in the article shows.

f1b: The key idea of this calculation is to create those functions:

- Iu_up: returns the set of item that u gives rating with 4 or with 5.
- Iu_down: returns the set of item that u gives rating with 1 or with 5.

After creating those functions we can start putting everything together as the formula f1b in the article shows. Since, f1c, f1d, f1e follow the same Strategy, I'm not going to list then below.

2) f2.Java: This java class will take input from rating.txt, user_rating.txt, and list.txt.

f2a: The key idea of this calculation is to create those functions:

- Cu:return the set or multi-set (depending on the feature) of categories of the items in Iu.
- Set: set structure that stores items.

After creating those functions we can start putting everything together as the formula f2a in the article shows.

f2b: The key idea of this calculation is to create those functions:

• Cu:return the set or multi-set (depending on the feature) of categories of the items in Iu.

| MY_ID | OTHER_ID | VALUE |
|--------|------------|-------|
| 199781 | 236296 | 1 |
| 199781 | 308739 | 1 |
| 199781 | 205535 | 1 |
| 199781 | 238184 | 1 |
| 199781 | 434399 | -1 |
| 199781 | 2453704580 | -1 |
| | | |

Fig. 11. user_rating.txt sorted by user one id

• Iur: return the set of items rated r (where r 2 f1; 2; 3; 4; 5g) by u

After creating those functions we can start putting everything together as the formula f2b in the article shows.

f2c: The key idea of this calculation is to create those functions:

- Cu:return the set or multi-set (depending on the feature) of categories of the items in Iu.
- ruc: return the average rating of user u in category c.
- ru_hat return the average rating of user u to all categories.

After creating those functions we can start putting everything together as the formula f2c in the article shows.

- 3) f3.Java: This java class will take input from category.txt, user_rating.txt.
- f3: The key idea of this calculation is to create those functions:
 - return the set or multiset (depending on the feature) of categories of the reviews (items) produced by u
 - Set: set structure that stores reviewer id.

After creating those functions we can start putting everything together as the formula f3 in the article shows.

4) f4.Java: This java class will take input from rating.txt, user_rating.txt, and list.txt.

f4: The key idea of this calculation is to create those functions:

- Yu: return the set or multi-set (depending on the feature) of reviewers (users) who have produced the reviews (items) in Iu
- ruy: return average rating given by a user to the reviews from a reviewer
- ru_downhat: return average rating given be a user to all reviewer.

After creating those functions we can start putting everything together as the formula f4 in the article shows.

5) f5.Java:

f5a: The key idea of this calculation is to create those functions:

- rv_avg: return average rating reviewer v received.
- ru_avg: return average rating that user u giving to the items
- all_avg: contains the average of all rating.

After creating those functions we can start putting everything together as the formula f5a in the article shows.

f5b: The key idea of this calculation is to create those functions:

- Iu_up: return the set of item that u gives rating with 4 or with 5.
- Jv: return the set of reviews (items) produced by v.

After creating those functions we can start putting everything together as the formula f5b in the article shows.

f5c: The key idea of this calculation is to create those functions:

- Iu_dwon: return the set of item that u gives rating with 1 or with 2.
- Jv: return the set of reviews (items) produced by v.

After creating those functions we can start putting everything together as the formula f5c in the article shows.

6) f6.Java:

f6a: The key idea of this calculation is to create those functions:

- rv: return the set of all ratings for vs items.
- ru: return the set of all ratings for us items.
- Iuv: return set of vs items rated by u.
- an_rv: return the set of all anonymous ratings for vs items.
- an_ru: return the set of all anonymous ratings for us items
- an_Iuv: return set of vs items rated anonymously by u.

After creating those functions we can start putting everything together as the formula f6a in the article shows.

f6b: The key idea of this calculation is to create those functions:

- rv_up: return the set of all ratings for vs items with rating 4 or rating 5.
- ru_up: return the set of all ratings for us items with rating 4 or rating 5.
- Iuv_up: return set of vs items rated by u with rating 4 or rating 5.
- an_rv_up: return the set of all anonymous ratings for vs items with rating 4 or rating 5.
- an_ru_up: return the set of all anonymous ratings for us items with rating 4 or rating 5.
- an_Iuv_up: return set of vs items rated anonymously by u with rating 4 or rating 5.

After creating those functions we can start putting everything together as the formula f6b in the article shows.

f6c: The key idea of this calculation is to create those functions:

- rv_down: return the set of all ratings for vs items with rating 1 or rating 2.
- ru_down: return the set of all ratings for us items with rating 1 or rating 2.
- Iuv_down: return set of vs items rated by u with rating 1 or rating 2.
- an_rv_down: return the set of all anonymous ratings for vs items with rating 1 or rating 2.
- an_ru_down: return the set of all anonymous ratings for us items with rating 1 or rating 2.

• an_Iuv_down: return set of vs items rated anonymously by u with rating 1 or rating 2.

After creating those functions we can start putting everything together as the formula f6c in the article shows.

f7.Java:

f7a:

- rv_downhat: return average rating given to the items produced by v.
- all_avg: overall average rating in the dataset.

After creating those functions we can start putting everything together as the formula f7a in the article shows.

f7b:

- ru_downhat: return average rating that u gives to the reviews
- all_avg: overall average rating in the dataset.

After creating those functions we can start putting everything together as the formula f7b in the article shows.

f7c:

- rv_downhat: return average rating given to the items produced by v.
- ru_downhat: return average rating that u gives to the reviews

After creating those functions we can start putting everything together as the formula f7c in the article shows.

7) f8.Java:

*f*8:

- rv_downhat: return the set of trustees of user u, i.e., those users that u trusts.
- Set: set structure that stores user id.

After creating those functions we can start putting everything together as the formula f8 in the article shows.

F. TOOLS, LANGUAGES, PLATFORMS

For version control functionality I will use Git. For preprocessing the data I will use EmEditor and Java. To implement this project I will use Java programming language. Java is a concurrent, class-based, object-oriented programing language. After considering all the details of this project. Java is a proper language that can be used to implement this project.

G. PROJECT TIMELINE

- 1) Studying: The studying of this project can be broken down into three main components:
 - Reading the original article
 - Reading the recommended system text book
 - Watching the tutorial from coursera

H. Weekly Milestone

- Week of January 12: Start reading the article, and preparing for the project. Decided the high and lowlevel requirement of this project. Decided what software tool and programming language will be used in this project. Finding the proper dataset.
- Week of January 19: Downloaded the dataset from trust-let[2]. Combine the text file into one text file. Picking

- different features from the dataset, and building charts for each feature. Following the article requirement, doing the pre-processing of the dataset.
- Week of January 26: Reading the recommender system textbook. Watching the tutorials from the course. Deciding the techniques and strategies will be implemented in this project. Made a graph chart of the structure of the project. Started building the project.
- Week of February 3: Continue working on the project. Reading the textbook. Watching the tutorial videos. preparing for the project report. Check what I missed from my program by reading the article. Fixing the bugs in my current program.
- Week of February 10: Continue working on the project. Focusing on the article. Searching necessary information for writing the project report. Trying to simplify the calculation step from the article.
- Week of February 17: Keep reading the article and searching information for writing the report. Trying to implement parameter 6 function in Python.
- Week of February 24: Finding the more proper data for this project. Complete the implementation in Python. Running the program, and it outputs the testing data.
- Week of March 4: Download the proper dataset, and starting the data preprocessing part. Implementing this project in Java. The logic will follow the logic that used in the python program. Building the input in the Java program.
- week of March 11: Completed the data preprocessing, and checking the correctness of the processed dataset. keep working on th Java program. Splitting the main program into eight individual programs that correspond to eight parameter calculations in the article.
- week of March 18: Completing the eight individual programs. Running every programs to get intermediate data set.
- week of March 25: Checking the program, and keep running them to get outputs. Comparing the new intermediate set with the old intermediate set. Writing the project report.

I. ROLE AND ASSIGNMENT

1) Kun Ye: He is an international student who is currently studying computer science at the University of Victoria. He is interested in Machine Learning, Neuronal network, and natural language processing. In this project, he will be responsible for finding the proper dataset. data preprocessing, implementing the project from the article, and testing the output data.

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IV. NOTE

A. OUTPUTS

Here is the sample from the intermediate set.

- 1) Parameter 1:
- f1a[Fig 12]
- f1b[Fig 13]
- f1c[Fig 14]
- f1d[Fig 15]f1e[Fig 16]
- 2) Parameter 2:
- f2a[Fig 17]
- f2b[Fig 18]
- f2c[Fig 19]
- 3) Parameter 3:
- f3[Fig 20]
- 4) Parameter 4:
- f4[Fig 21]
- 5) Parameter 5:
- f5a[Fig 22]
- f5b[Fig 23]
- f5c[Fig 24]
- 6) Parameter 6:
- f6a[Fig 25]
- f6b[Fig 26]
- f6c[Fig 27]
- 7) Parameter 7:
- f7a[Fig 28]
- f7b[Fig 29]
- f7c[Fig 30]
- 8) Parameter 8:
- f8[Fig 31]

| User u | User v | f1a | Trust statement |
|---------|------------|-------------|-----------------|
| 1199781 | 236296 | 1.000000000 | 1 |
| 199781 | 308739 | 1.000000000 | 1 |
| 199781 | 238184 | 0.730296743 | 1 |
| 199781 | 210284 | 0.777613345 | -1 |
| 199781 | 1640730500 | 0.885270413 | 1 |
| 199781 | 371087 | 0.894427191 | 1 |
| | | | |

Fig. 12. f1a sample from intermediate set

| User u | User v | f1b | Trust statement |
|--------|-----------|-------------|-----------------|
| 199781 | 210284 | 0.001655972 | -1 |
| 199781 | 223652 | 0.011494253 | 1 |
| 199781 | 243427 | 0.003496503 | 1 |
| 199781 | 292382 | 0.028571429 | 1 |
| 199784 | 213850 | 0.200000000 | 1 |
| 199828 | 577933188 | 0.025641026 | 1 |
| | | | |

Fig. 13. f1b sample from intermediate set

| User u | User v | f1c | Trust statement |
|--------|-----------|-------------|-----------------|
| 199781 | 210284 | 0.001655972 | -1 |
| 199781 | 223652 | 0.011494253 | 1 |
| 199781 | 243427 | 0.003496503 | 1 |
| 199781 | 292382 | 0.028571429 | 1 |
| 199784 | 213850 | 0.200000000 | 1 |
| 199828 | 577933188 | 0.025641026 | 1 |
| | | | |

Fig. 14. f1c sample from intermediate set

| User u | User v | f1d | Trust statement |
|--------|--------|-------------|-----------------|
| 199781 | 210284 | 0.000191168 | -1 |
| 199781 | 223652 | 0.002083333 | 1 |
| 199781 | 243427 | 0.001035197 | 1 |
| 199781 | 684774 | 0.001647446 | -1 |
| 199828 | 256232 | 0.001319261 | 1 |
| 199828 | 214801 | 0.001218027 | 1 |
| | | | |

Fig. 15. fld sample from intermediate set

| User u | User v | f1e | Trust statement |
|--------|-------------|-------------|-----------------|
| 199781 | 238184 | 0.000079246 | 1 |
| 199781 | 210284 | 0.000042279 | -1 |
| 199781 | 205491 | 0.000069080 | 1 |
| 199781 | 368762 | 0.000063099 | 1 |
| 199781 | 241578 | 0.000056398 | 1 |
| 199831 | 20098289540 | 0.000048319 | 1 |
| | | | |

Fig. 16. f1e sample from intermediate set

| User u | User v | f2a | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 236296 | 0.043269231 | 1 |
| 199781 | 308739 | 0.033415842 | 1 |
| 199781 | 205535 | 0.008350731 | 1 |
| 199781 | 238184 | 0.023682293 | 1 |
| 199781 | 434399 | 0.004175365 | -1 |
| 199781 | 2453704580 | 0.002159827 | -1 |
| | | | |

Fig. 17. f2a sample from intermediate set

| User u | User v | f2b | Trust statement |
|--------|--------|-------------|-----------------|
| 199781 | 236296 | 0.593826030 | 1 |
| 199781 | 308739 | 0.660070456 | 1 |
| 199781 | 205535 | 0.114707867 | 1 |
| 199781 | 238184 | 0.649136868 | 1 |
| 199781 | 434399 | 1.000000000 | -1 |
| 199781 | 719295 | 0.580230964 | 1 |
| | | | |

Fig. 18. f2b sample from intermediate set

| User u | User v | f2c | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 308739 | 0.197260310 | 1 |
| 199781 | 238184 | 0.080212478 | 1 |
| 199781 | 2320404356 | 0.897905968 | 1 |
| 199781 | 210284 | 0.407746844 | -1 |
| 199781 | 243232 | 0.202448644 | -1 |
| 199781 | 1640730500 | 0.130130620 | 1 |
| | | | |

Fig. 19. f2c sample from intermediate set

| User u | User v | f3 | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 236296 | 0.008196721 | 1 |
| 199781 | 308739 | 0.027027027 | 1 |
| 199781 | 238184 | 0.005154639 | 1 |
| 199781 | 2453704580 | 0.025641026 | -1 |
| 199781 | 719295 | 0.023255814 | 1 |
| 199781 | 210284 | 0.017241379 | -1 |
| | | | |

Fig. 20. f3 sample from intermediate set

| User u | User v | f4 | Trust statement |
|--------|--------|-------------|-----------------|
| 199781 | 236296 | 0.278046765 | 1 |
| 199781 | 308739 | 0.718136020 | 1 |
| 199781 | 238184 | 0.416143580 | 1 |
| 199781 | 719295 | 0.141522551 | 1 |
| 199781 | 210284 | 0.632878593 | -1 |
| 199781 | 243232 | 0.319541383 | -1 |
| | | | |

Fig. 21. f4 sample from intermediate set

| User u | User v | f5a | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 308739 | 4.855870183 | 1 |
| 199781 | 205535 | 4.862934211 | 1 |
| 199781 | 238184 | 5.002500642 | 1 |
| 199781 | 2453704580 | 0.026540221 | -1 |
| 199781 | 2320404356 | 4.844219779 | 1 |
| 199781 | 719295 | 4.854903376 | 1 |
| | | | |

Fig. 22. f5a sample from intermediate set

| User u | User v | f5b | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 308739 | 0.002415459 | 1 |
| 199781 | 205535 | 0.002415459 | 1 |
| 199781 | 238184 | 0.004830918 | 1 |
| 199781 | 2320404356 | 0.002415459 | 1 |
| 199781 | 719295 | 0.004830918 | 1 |
| 199781 | 1640730500 | 0.004830918 | 1 |
| | | | |

Fig. 23. f5b sample from intermediate set

| User u | User v | f5c | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 1510707076 | 0.047619048 | -1 |
| 199781 | 286650 | 0.047619048 | -1 |
| 199828 | 621186948 | 0.285714286 | -1 |
| 199828 | 481857412 | 0.142857143 | -1 |
| 199831 | 237979 | 0.021739130 | -1 |
| 199855 | 204681 | 0.024390244 | -1 |
| | | | |

Fig. 24. f5c sample from intermediate set

| User u | User v | f6a | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 236296 | 0.061304169 | 1 |
| 199781 | 308739 | 0.053407853 | 1 |
| 199781 | 205535 | 0.122617175 | 1 |
| 199781 | 238184 | 0.049441736 | 1 |
| 199781 | 434399 | 0.103293782 | -1 |
| 199781 | 2453704580 | 0.045822518 | -1 |
| | | | |

Fig. 25. f6a sample from intermediate set

| User u | User v | f6b | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 236296 | 0.045292387 | 1 |
| 199781 | 308739 | 0.039844096 | 1 |
| 199781 | 205535 | 0.108233280 | 1 |
| 199781 | 238184 | 0.037675205 | 1 |
| 199781 | 434399 | 0.063300435 | -1 |
| 199781 | 2453704580 | 0.034729006 | -1 |
| | | | |

Fig. 26. f6b sample from intermediate set

| User u | User v | f6c | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 236296 | 1.214999700 | 1 |
| 199781 | 308739 | 0.857856843 | 1 |
| 199781 | 205535 | 1.357856843 | 1 |
| 199781 | 238184 | 0.673646317 | 1 |
| 199781 | 434399 | 0.607856843 | -1 |
| 199781 | 2453704580 | 0.357856843 | -1 |
| | | | |

Fig. 27. f6c sample from intermediate set

| User v | f7a | |
|------------|-------------|--|
| 236296 | 0.147624040 | |
| 308739 | 0.155853085 | |
| 205535 | 0.162917113 | |
| 238184 | 0.302483544 | |
| 2453704580 | 0.326523123 | |
| 2320404356 | 0.144202681 | |
| | | |

Fig. 28. f7a sample from intermediate set

| User u | f7b |
|--------|-------------|
| 199837 | 0.130576177 |
| 199837 | 0.130576177 |
| 199850 | 0.016492252 |
| 199850 | 0.016492252 |
| 199850 | 0.016492252 |
| 199850 | 0.016492252 |
| | |

Fig. 29. f7b sample from intermediate set

| User u | User v | f7c | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 236296 | 0.546308214 | 1 |
| 199781 | 308739 | 0.554537259 | 1 |
| 199781 | 205535 | 0.561601287 | 1 |
| 199781 | 238184 | 0.701167718 | 1 |
| 199781 | 434399 | 0.001069366 | -1 |
| 199781 | 2453704580 | 0.725207297 | -1 |
| | | | |

Fig. 30. f7c sample from intermediate set

| User u | User v | f8 | Trust statement |
|--------|------------|-------------|-----------------|
| 199781 | 238184 | 0.020270270 | 1 |
| 199781 | 1640730500 | 0.024242424 | 1 |
| 199781 | 371087 | 0.011111111 | 1 |
| 199781 | 515078 | 0.013157895 | 1 |
| 199781 | 216430 | 0.026431718 | 1 |
| 199781 | 241374 | 0.019607843 | 1 |
| | | | |

Fig. 31. f8 sample from intermediate set