# Data Mining - The Diary

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# Introduction

This document is my learning diary written on behalf of Data Mining course led at spring term 2015 at University of Helsinki.

# 1 Week 1

The **support count**  $\sigma(X)$  of an item set X is the amount of transactions containing X ( $X \subset t_i$ ). Basically, we were computing support counts for various itemsets with the exception of applying additional constraints to the queries (such as particular grade range).

The **support** of an item set X is  $\sigma(X)/N$ , where N is the amount of all transactions. Support of X may be thought of as a classical probability of a random transaction containing X.

An **association rule** is an implication of the form  $X \to Y$ , where X and Y are itemsets having no items in common. The interpretation of an association rule is that if a transaction contains X, it "tends" to contain Y as well. Note that "tends" depends on parameters we specify to a data mining system. **Support** of an association rule  $X \to Y$  is

$$s(X \to Y) = \frac{\sigma(X \cup Y)}{N}.$$

Support of the rule R may be thought of as a classical probability of R appearing in a random transaction. **Rule confidence** gives the probability of Y appearing in the same transactions with set X and is defined as

$$c(X \to Y) = \frac{\sigma(X \cup Y)}{\sigma(X)}.$$

# 1.1 Reflection

Getting the data from a file to internal representation was pretty challenging: the data seems a little bit "dirty" and I am sure there is room for improvement. What comes to accessing data, I have made an effort to make sure that it runs fast. Basically I have three model classes:

Course holds the course name, the course code, grading mode and the amount of credits awarded.

Student holds only a unique student ID and enrollment year,

CourseAttendanceEntry holds a course C, a student S, the year and month S attended C, and the grade S received. Basically, these entries implement a many-to-many relationship between courses and students.

# 2 Week 2

#### Task 5

The supports are as follow:

E	0.684
O	0.632
P	0.526
W	0.158
EO	0.474
EP	0.316
EW	0.053
OP	0.263
ow	0.053
PW	0.105
EOP	0.221
EOW	0.053
EPW	0
OPW	0
EOPW	0

The only observation that I was able to come up with is that if s(X) is support of an itemset X, then

$$s(X) \leq \min_{A \subsetneq X} s(A).$$

# Task 10

We have around 23 million (N) different paperback books and we want to generate all 10-combinations of those. Suppose we are given an index tuple  $t=(t_1,t_2,\ldots,t_{10})=(1,2,\ldots,10)$ . Next generate a combination of books indexed by t and increment  $t_{10}$ . When  $t_{10}=N+1$ , increment  $t_9$  and set  $t_{10}=t_9+1$ . After  $t_9=N-1$  (and thus  $t_{10}=N$ ) has been generated, increase  $t_8$  and set  $t_9=t_8+1,t_{10}=t_8+2$ . Continue this routine until  $t_1=N-9,t_2=N-8,\ldots,t_9=N-1,t_{10}=N$ .

# Task 15

In this task we are supposed to measure time of generating k-combinations of courses for  $k \in \{2, 3, 5\}$ . The results are summarized in the following table:

k	t	
2	$4 \mathrm{\ ms}$	
3	40  ms	
5	291  ms	

Increasing k from 2 to 3 increases the running time by a factor of 10; increasing k from 3 to 5 increases the running time by a factor of 7,3. Since n = 213,

$$\binom{n}{3} \binom{n}{2}^{-1} = \frac{n!2!(n-2)!}{n!3!(n-3)!}$$
$$= \frac{(n-2)!}{3(n-3)!}$$
$$= \frac{n-2}{3}$$
$$\approx 70,$$

and

$$\binom{n}{5} \binom{n}{3}^{-1} = \frac{n!3!(n-3)!}{n!5!(n-5)!}$$
$$= \frac{(n-3)!}{20(n-5)!}$$
$$= \frac{(n-4)(n-3)}{20}$$
$$\approx 2100.$$

which does not quite go hand in hand with the measurements.

# Task 19

The objective of this task is to compare brute-force and Apriori algorithms for frequent itemset generation.

k	support	Brute-force (ms)	Apriori (ms)
2	0.3	379	154
3	0.175	9389	774
4	0.1	N/A	1845
5	0.1	N/A	1637

After Arto's counsel, I was able to speedup generation of 3-combinations by a factor of 20, but I was not able to make 4-combination generation feasible.

#### Task 21

The largest size of itemsets with support at least 0.05 seems to be 11. I got 19 of such itemsets; one of them is

- TVT-ajokortti
- Ohjelmoinnin perusteet

- $\bullet\,$  Opiskelutekniikka
- Tietokantojen perusteet
- Ohjelmoinnin jatkokurssi
- Tietoliikenteen perusteet
- $\bullet\,$  Tietorakenteet ja algoritmit
- $\bullet\,$  Johdatus tietojenkäsittelytieteeseen
- Tietokone työvälineenä
- Ohjelmistotekniikan menetelmät
- Aineopintojen harjoitustyö: Tietokantasovellus