## Problem Set 1

September 19, 2012

Due date: Wed, October 3 2012 at 4pm; before class.

**Exercise 1 (20 points):** You are given a set V consisting of n integers. The task is to report all n products of the n distinct (n-1)-cardinality subsets of V. Your algorithm should run in linear time and it should not use division.

**Exercise 2 (20 points):** Every time you go to Espresso Royal Coffee (ERC) and you buy a latte, the barista is providing you with a sticker. Every such sticker names one of the 100 different coffee types that ERC has served throughout the years. Once you collect all 100 *distinct* stickers you will earn an espresso machine. If the coffee types are uniformly assigned to stickers find the *expected* number of lattes you need to drink before you get your own espresso machine.

**Exercise 3 (20 points):** For each of the following measures, determine whether it is monotone, antimonotone, or non-monotone (i.e., neither monotone nor anti-monotone).

For example, a measure s over itemsets is anti-monotone (resp. monotone) if for two itemsets X and Y we have that  $s(X) \ge s(Y)$  whenever  $X \subset Y$  (resp.  $X \supset Y$ ).

A characteristic rule is a rule of the form  $\{p\} \to \{q_1, \ldots, q_n\}$ , where  $p, q_1, \ldots, q_n$  are items and the rule antecedent contains only a single item. An itemset of size k can produce up to k characteristic rules. Let  $\xi$ be the minimum confidence c of all characteristic rules generated from a given itemset  $\{p_1, \ldots, p_k\}$ . That is,

$$\xi(\{p_1, \dots, p_k\}) = \min \{c(\{p_1\} \to \{p_2, \dots, p_k\}) \\ c(p_k \to \{p_1, \dots, p_{k-1})\})\}.$$

(5 points): Is  $\xi$  monotone, anti-monotone or non-monotone?

(5 points): Repeat the above where instead of min we use max.

A discriminant rule is a rule of the form  $\{p_1, \ldots, p_n\} \to \{q\}$ , where the rule consequent contains only a single item. An itemset of size k can produce up to k discriminant rules. Let  $\eta$  be the minimum confidence of all discriminant rules generated from a given itemset:

$$\eta(\{p_1, \dots, p_k\}) = \min \{c(\{p_2, \dots, p_k\} \to \{p_1\}) \\ c(\{p_1, \dots, p_{k-1}\}) \to \{p_k\}\}.$$

(5 points): Is  $\eta$  monotone, anti-monotone or non-monotone?

(5 points): Repeat the above where instead of min we use max.

**Exercise 4 (20 points):** Consider the association rule  $A \to B$  and the interestingness measure  $M = \frac{P(B|A) - P(B)}{1 - P(B)}$ .

- 1. (5 points) What is the range of this measure? When does the measure attain its minimum and maximum values?
- 2. (5 points) How does M behave when P(A, B) is increased, while P(A) and P(B) remain unchanged?
- 3. (5 points) What is the value of the measure when A and B are statistically independent?
- 4. (5 points) How does the measure behave under the inversion operation (in the 0-1 table representing the data 0s become 1s and vice versa).

**Exercise 5 (20 points):** Let D be a transaction dataset, and D' another dataset formed from D by independently erasing items from the transactions in D; every item from every transaction in D is erased with probability p. Provide answer to the following questions:

- 1. (10 points) For an itemset S, compute its expected support in D' as a function of its support in D. (Hint: the expected support will depend on the size of S as well as the probability p).
- 2. (10 points) Compute the probability that a frequent itemset in D will remain frequent in D' for the same *minsup* threshold.