## Discovery of Frequent Itemsets and Association Rules

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## 1 Solution

We implemented the solution in pure scala without any big data processing framework. We used the T10I4D100K.dat dataset uploaded on canvas. The source code is split into four classes, Apriori.scala that implementes the Apriori algorithm; AssocRules.scala that mines association rules from counted itemsets; DataUtils.scala that reads the data into a item-basket data model and Main.scala that orchestrates the pipeline and prints the results.

## 2 How to run

Clone this repository and navigate to frequent itemsets project. Then use:

```
sbt compile //compile
sbt test //test
sbt run //run
sbt assembly //generate fat jar
```

## 3 Evaluation and results

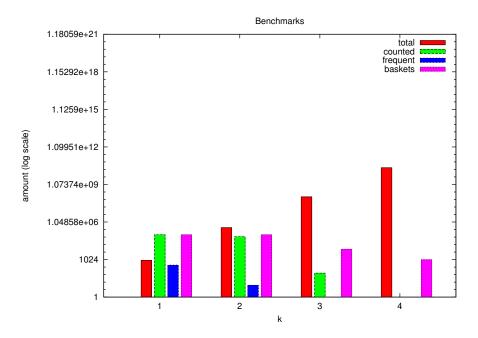


Figure 1: Analysis of number of counts made at each stage (log scale). Frequent itemsets of length 3 was 1, and counted itemsets of length 4 was thus 0. In-between each iteration we also filter the baskets (we hoped to reduce the complexity of the double-loop to count itemsets which has complexity  $\mathcal{O}(b \cdot f \cdot k)$  where b is the number of baskets, f is the number of frequent sets and k is the size of each set  $(\mathcal{O}(k))$  is the complexity to check if the set is subset of basket).

```
Example output (s=1000, c=0.5, k=3)
Counting all singletons for 100000 baskets
Total unique items to count: 870
Number of frequent singletons 375
Filtering out baskets with no frequent itemsets..
Processing frequent items for 2-sets, approximately 70312.5 sets to check and 99933 baskets
Filtering out baskets with no frequent itemsets..
Finding association rules for 2-sets
Processing frequent items for 3-sets, approximately 40.5 sets to check and 7087 baskets
Filtering out baskets with no frequent itemsets..
Finding association rules for 3-sets
Processing frequent items for 4-sets, approximately 0.5~{\rm sets} to check and 1035~{\rm baskets}
Filtering out baskets with no frequent itemsets..
Finding association rules for 4-sets
Done. Evaluating
Number Frequent Items of length 1: 375
Number Frequent Items of length 2: 9
Number of association rules for itemsets length: 2: 3
Association Rule: AssociationRule(Set(Item(227)),Item(390)),
confidence: 0.577007700770077,
interest: 0.550157700770077
Association Rule: AssociationRule(Set(Item(704)), Item(825)),
confidence: 0.6142697881828316,
interest: 0.5834197881828316
Association Rule: AssociationRule(Set(Item(704)),Item(39)),
confidence: 0.617056856187291,
interest: 0.574476856187291
Number Frequent Items of length 3: 1
Number of association rules for itemsets length: 3: 3
Association Rule: AssociationRule(Set(Item(825), Item(704)), Item(39)),
confidence: 0.9392014519056261,
interest: 0.8966214519056261
Association Rule: AssociationRule(Set(Item(39), Item(704)), Item(825)),
confidence: 0.9349593495934959,
interest: 0.9041093495934959
Association Rule: AssociationRule(Set(Item(39), Item(825)), Item(704)),
confidence: 0.8719460825610783,
interest: 0.8540060825610784
Number Frequent Items of length 4: 0
Number of association rules for itemsets length: 4: 0
[success] Total time: 189 s, completed 2017-nov-16 11:09:11
```