

## Bayesian Networks - SPML assignment 3

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### 1 Specification

This implementation of the Variable Elimination algorithm is a version of the original algorithm as developed by American computer scientist Rina Dechter.[1] The implementation is written in Java and contains additional features such as non-binary variable processing. Bayesian inference by Variable Elimination has an exponential time complexity, but this can be further reduced by choosing the right order of elimination.[2] The goal of this implementation is to create the Variable Elimination algorithm as efficient as possible, by using a proper order of elimination and efficient data structures to represent variables and factors. The research question of this paper is: "To what extent can Bayesian networks be further optimized by improving the order of variables?". This paper will first describe a specification of inference in Bayesian networks and the design of the Variable Elimination algorithm. Next will be given an overview of the implementation of the algorithm, followed by its results. In conclusion, the performance of the implementation will be evaluated in order to answer the research question.

### 2 Design

The design of this implementation is based on the original Variable Elimination algorithm as developed by Rina Dechter.[1] More specifically, it is based on the pseudo code as described by David Poole and Alan MacWorth.[3]

```

1 Procedure VE_BN(Vs,Ps,O,Q)
2   Inputs
3     Vs: set of variables
4     Ps: set of factors representing the conditional
        probabilities
5     O: set of observations of values on some of the variables
6     Q: a query variable
7   Output
8     posterior distribution on Q
9   Local
10    Fs: a set of factors
11    Fs = Ps
12    for each X in Vs - {Q} using some elimination ordering do

```

```

13         if (X is observed) then
14             for each F in Fs that involves X do
15                 set X in F to its observed value in 0
16                 project F onto remaining variables
17         else
18             Rs = {F in Fs: F involves X}
19             let T be the product of the factors in Rs
20             N = X T
21             Fs = Fs \ Rs union with {N}
22         let T be the product of the factors in Fs
23         N = Sum over Q of each T
24         return T/N

```

**Listing 1:** Pseudo code of the Variable Elimination algorithm, as described by David Poole and Alan MacWorth

The pseudo code describes how the algorithm handles Bayesian inference and makes an estimation of the probability distribution of variables. The first steps include creating the factors and eliminating the observed variables in the factors, as is done in lines 12 to 16. This is done by using a certain order of elimination, that is of big influence of the complexity of the program. Then the factors can be merged by multiplying and marginalizing them until only one factor remains, as happens in line 18 to 21. The last step is to normalize the results. This is done by dividing the outcomes of the final factor by the sum of values of the final factor, and can be seen in line 22 to 24.

There are different variations of the design possible, but the variations that are most notable are the variations in the order of elimination. Two common heuristics include minimizing the number of factors a variable appears in, or minimizing the lowest number of outgoing arcs of a variable.[2]

## 3 Implementation

### 3.1 Representation

The implementation is build on provided code for representing the variables and reading in problems by the Student Assistants. In line with this representation, separate classes are added for the algorithm and the factor. In the Factor class, each factor is represented by the variables it contains and its probability distribution. Each factor can be merged with another factor, meaning the factors are multiplied and then summed out, resulting in a new factor. Factors can also take a list of factors, which will multiply and sum all factors in the given list.

A new factor is created by combining a given variable and its probability table. This is done in line 2 to 4 in listing 2. The listing forms a part of the code, a complete version including all the original comments can be found in the appendix. After assigning the variable and its probabilities, the factor will reduce all columns that are no longer relevant based on

information from observed variables. This is implemented in two steps, namely gathering all indices and values of the items that need to be removed and the removing itself. The first one is represented between lines 6 and 25, and is the most elaborate task. It is done by looping over all the variables and collecting their values and indices if they are observed. The latter is done between lines 26 and 34 and is carried out by inserting the previously gained information.

```

1 public Factor(Variable variable, Table probTable) {
2     variables = new ArrayList<>();
3     variables.add(variable);
4     variables.addAll(variable.getParents());
5
6     ArrayList<Variable> varToRemove = new ArrayList<>();
7     ArrayList<Integer> colToRemove = new ArrayList<>();
8     for (int i = 0; i < variables.size(); i++) {
9         if (variables.get(i).isObserved()) {
10             varToRemove.add(variables.get(i));
11             colToRemove.add(i);
12             String value = variables.get(i).getObservedValue()
13                 ;
14             ArrayList<ProbRow> rowToRemove = new ArrayList<>()
15                 ;
16             for (ProbRow row : probTable.getTable()) {
17                 if (!row.getValues().get(i).equals(value)) {
18                     rowToRemove.add(row);
19                 }
20             }
21             for (ProbRow row : rowToRemove) {
22                 probTable.getTable().remove(row);
23             }
24         } else {
25             probabilities = probTable.getTable();
26         }
27     }
28     for (int i = 0; i < colToRemove.size(); i++) {
29         if (variables.size() > 1 && !variable.equals(
30             varToRemove.get(i))) {
31             variables.remove(varToRemove.get(i));
32             for (ProbRow row : probTable.getTable()) {
33                 int index = colToRemove.get(i);
34                 row.getValues().remove(index);
35             }
36         }
37     }
38     probabilities = probTable.getTable();

```

36

}

**Listing 2:** Implementation of the Factor class

The algorithm is represented as a class and is responsible for calling all necessary factor operations and normalizing the final factor to retrieve the queried probability. It also configures the order of elimination according to given heuristic.

### 3.2 Data Structures Used

In order to find the most optimal implementation, a variety of data structures is used from Java's library. To establish an order of elimination, a PriorityQueue is used. The priority queue is able to easily specify the comparator, which is useful in determining the order of elimination. The factors are represented in a ArrayList, as it is more optimal in getting or setting elements from the list. Since the factors often interact, this is a useful property.

### 3.3 Least Incoming Arcs First

The main heuristic used to optimize efficiency is 'least incoming arcs first', which is one of the two common used heuristics mentioned in section 2 of this paper. This heuristic is implemented by comparing for each variable the number of parents that it has. The ones with the fewest parents will then be the nodes without a parent, which are relatively easy to compute. In listing 3, this is represented in line 2 using a PriorityQueue. After this, the order of the variables is revisited based on the observed variables, as can be seen in lines 4 to 6. After having computed the order, the eliminated variable is also likely to provide information to its children variables therefore influencing the computation considerably. The order of implementation is implemented the following:

```

1 private Queue<Variable> compriseOrder(Variable query, ArrayList<
    Variable> vars, ArrayList<Factor> factors) {
2     PriorityQueue<Variable> order = new PriorityQueue<>(
        Comparator.comparing(Variable::getNrOfParents));
3
4     for (Variable var : vars) {
5         if (!var.isObserved() && !var.equals(query)) {
6             order.add(var);
7         }
8     }
9     return order;

```

**Listing 3:** Implementation of the least incoming arcs first heuristic

### 3.4 Algorithm

The main algorithm is implemented according to the design described in section 2. First, all factors are created by gathering the variables and probabilities from the input. This is

done in line 2 of listing 4. After that, an elimination order gets established based on the given heuristic, as can be seen in line 3. In this implementation it is least incoming arcs heuristic.

The main process loops over all the variables in their respective order and merges the concerning factors into a new factor. Merging refers to the multiplication and marginalization of two (or more) factors. This is done between line 5 and 11. In lines 16 to 18 there is an exception: if the queried variable is the ancestor of the observed variable, the factor will not be merged in the same process as the other factors. This is because the observed variables are not included in the elimination order, therefore the observed variables are not always eliminated but do contain the query. Lastly, the final factor contains all the relevant information and is normalized in line 23.

```

1 public void runElimination(Variable query, ArrayList<Variable>
   vars, ArrayList<Table> probs) {
2     ArrayList<Factor> factors = factorize(vars, probs);
3     Queue<Variable> elimOrder = compriseOrder(query, vars,
       factors);
4
5     while (!elimOrder.isEmpty()) {
6         Variable eliminate = elimOrder.poll();
7         ArrayList<Factor> concerningFactors =
           getFactorsContainingEliminate(eliminate, factors);
8
9         if (concerningFactors.size() > 1) {
10             Factor mergedFactor = new Factor(concerningFactors
              , eliminate);
11             factors.add(mergedFactor);
12         }
13     }
14     Factor finalFactor;
15
16     if (factors.size() > 1) {
17         finalFactor = new Factor(factors, null);
18     }
19     else {
20         finalFactor = factors.get(0);
21     }
22
23     finalFactor = normalize(finalFactor);
24     ui.printQueryAnswer(finalFactor.toString());

```

**Listing 4:** Implementation of the main Variable Elimination algorithm

### 3.5 Processing Non-Binary Variables

As an additional feature to the algorithm, the implementation can handle non-binary values for variables. Every value is represented as a String. When multiplying and marginalizing the factors, the first value of the probability table is taken and will be used to make 'variations' of: all the other variations that need to be summed with this one in order to marginalize the factor. Instead of switching the variation's value from True to False or vice versa, the algorithm loops over all the possible values a variable can have, as can be seen in line 4 and 5 of listing 5. With this implementation, it is possible to take an arbitrary amount of values for a variable and have it represented in the network. To check the position of the variation, we loop over the other entries in the table until the right one is found. Once all variations have been covered, the marginalization is complete.

```

1 // Marginalization over the variable to eliminate
2     for (ProbRow example : factor.probabilities) {
3         ArrayList<String> exampleValues = example.getValues();
4         if (!usedExamples.contains(exampleValues)){
5             ArrayList<ArrayList<String>> variations =
6                 getAllVariations(index, eliminate, example.
7                     getValues());
8             usedExamples.addAll(variations);
9             ProbRow variation = new ProbRow(variations.get(0),
10                 0);
11             for (ProbRow row : factor.probabilities) {
12                 ArrayList<String> dummy = row.getValues();
13                 if (variations.contains(dummy)) {
14                     variation.setProb(variation.getProb() +
15                         row.getProb());
16                 }
17             }
18             variation.getValues().remove(index);
19             finalTable.add(variation);
20             if (finalTable.size() == tableSize) {
21                 break;
22             }
23         }
24     }

```

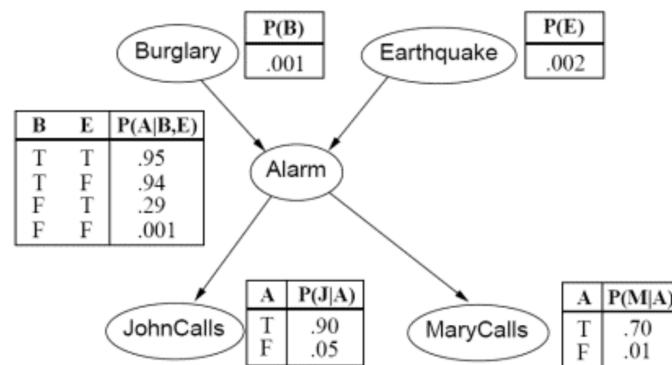
**Listing 5:** Implementation of non-binary variables

## 4 Testing

To test the working and efficiency of the algorithm, the tests have been designed to match different situations where bugs can occur. These tests are split into two parts: binary variables

and non-binary variables. To represent the binary variables, the tests are written for the well-known earthquake problem. To test how the algorithm processes non-binary values, a short problem is created called 'Bike Repair', represented in figure 2. It contains four states, that can take either two or three different values. Both problems are represented in the 'Belief and Decision Network' application from AISpace to verify the output.[4]

#### 4.1 Test cases for the Earthquake problem



**Figure 1:** A graph representation of the 'Earthquake' sample problem.

##### 4.1.1 Test 1

The first test case is relatively simple and tests the relationship between the observed parent node and queried child node work. In addition it also looks at if it gives the correct results. The test is looking at a probability of alarm going off given that the burglary is known to be happening.

**Query:** Alarm

**Observed:** Burglary = True

**Expected outcome** should be have a high probability of alarm being active and a very small probability of alarm being inactive due to the burglary being set to true.

**Actual result**

Alarm	Probability
True	0.9402
False	0.0598

As expected, the outcome for the query concludes that it is very probable for the alarm to be active and is pretty unlikely for the alarm to be inactive. This makes sense given that the burglary is in progress.

#### 4.1.2 Test 2

The next test is pretty interesting. The goal of such a test is to see if the probability calculation if the query is made on a child variable of another given that another child is observed. The situation in this is that the call from Mary is received and the question follows: what is the probability of John calling after we know Mary already called?

**Query:** JohnCalls

**Observed:** MaryCalls = True

**Expected outcome** must be quite different than if the MaryCalls would not be observed. Since we know that Mary gives a call then it should increase the probability of John also giving a call.

**Actual result**

JohnCalls	Probability
True	0.504
False	0.496

Again, as expected the probability of John calling is dramatically increased. The probabilities of calling and not calling are almost at the ratio 50/50. This test shows that observing one successor while querying on another parallel successor of the same variable, makes a huge difference to the outcome.

#### 4.1.3 Test 3

In test 1 the parent-child relation was tested. The next test is similar but now the observation and the query are switched around. The test looks at a situation in which the call from Mary is received. What is the probability that Mary is going to tell that the alarm went off?

**Query:** Alarm

**Observed:** MaryCalls = True

**Expected outcome** would be to see the increase in the alarm being true given that one of its successor nodes is observed.

**Actual result**



Alarm	Probability
True	0.53412
False	0.46588

The results are as expected. The observation of one of the successors increases the likelihood of the predecessor to be true.

#### 4.1.4 Test 4

The following test looks at what happens with the probabilities if all successors of the queried variable are observed. What are the chances of alarm going off given that both persons call?

**Query:** Alarm

**Observed:** JohnCalls = True, MaryCalls = True

**Expected outcome** should be such that increases the probability of alarm to be true very significantly since both calls are observed as positive. If both John and Mary calls, one should expect something serious has happened.

**Actual result**

Alarm	Probability
True	0.95378
False	0.04622

#### 4.1.5 Test 5

Next test is very similar to the previous test. It tests exactly the same relation of the queried variable and its observed child node. The difference this time is that the observed variable has another parent node which is not observed. The situation is modelled in such a way that the goal is to predict the likelihood of that the cause to alarm is the earthquake.

**Query:** Earthquake

**Observed:** Alarm = True

**Expected outcome** for the earthquake to be true given the alarm is on should not be too high since alarm has another possible cause namely the burglary.

**Actual result**

Earthquake	Probability
True	0.36812
False	0.63188

The results show a decent probability for the earthquake to be the cause of the alarm but the most likely case is that the earthquake is not to blame and there is another explanation for the alarm to go off. The results satisfy the expectation.

#### 4.1.6 Test 6

The final test of the Earthquake is our favorite. The test is quite complicated since there are three observed variables which all impact the result. The test looks into the probability of the earthquake being the cause given the burglary in progress and receiving both calls.

**Query:** Earthquake

**Observed:** Burglary = True, JohnCalls = True, MaryCalls = True

**Expected outcome** for the earthquake should be relatively low because there is already an explanation for the both observed calls.

**Actual result**

Earthquake	Probability
True	0.02021
False	0.97979

The outcome of the test is not very surprising because the cause is already known to be burglary which explains the calls received from both John and Mary.

## 4.2 Test cases for the Bike Repair problem

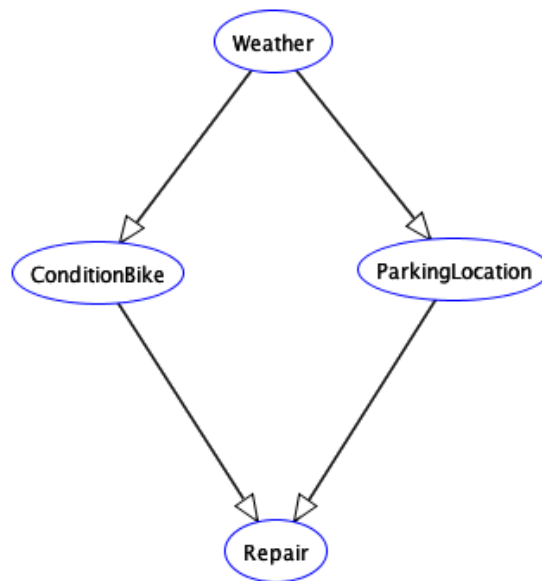
The following problem is made by us and the main focus of this problem is to show that the algorithm can handle variables with non-binary values. Also, it should be noted that the probabilities for the given problem are at the bottom of the appendix.

### 4.2.1 Test 1

The test is modelled in such a way to see if it can handle the non-binary variables. The test is pretty funny and it tries to predict the probability of the weather given the quality of the bike.

**Query:** Weather

**Observed:** ConditionBike = Medium



**Figure 2:** A graph representation of the 'Bike Repair' sample problem.

**Expected outcome** is quite hard to predict given the comical situation of predicting such complicated phenomenon as weather given such a weird observation as bike quality.

**Actual result**

Weather	Probability
Rainy	0.73684
Sunny	0.15789
Snow	0.10526

It looks like that according to the given problem it is most likely to be rainy if the bike is of mediocre quality.

#### 4.2.2 Test 2

The test looks at the turned around situation of the previous test. Now the situation is even more comical which wants to predict the quality of the bike given the observed weather is sunny.

**Query:** ConditionBike

**Observed:** Weather = Sunny

**Expected outcome** again is hard to predict since both variables contain three possible values and the situation is quite unrealistic which leads to prediction difficulties.

**Actual result**

ConditionBike	Probability
Good	0.4
Medium	0.3
Broken	0.3

The outcome of course does not make a lot of sense but, as mentioned before, the resulting probabilities have been tested using the specialized program for such scenarios called Belief and Decision Network Tool.

## 5 Conclusion

The research question of this paper is: "To what extend can Bayesian networks be further optimized by improving the order of variables?". The implementation is based around the least incoming arcs first principle, and managed to pass all the tests (i.e. shows the same results as the Belief and Decision Network Tool from AISpace).[4] The algorithm performs well on both binary and non-binary variables according to the test. However, having the right answer is not related to the

The algorithm is written with efficiency in mind, but since the implementation features only one heuristic no comparisons can be made. Because of this, no conclusions can be drawn on the efficiency of the implementation unfortunately. This would make for an interesting future research however. Other possible future research would be to test the scaling of the running time complexity, using larger sized problems that can be found on various websites.

## References

- [1] Rina derchter, wikipedia, 2018. From Wikipedia, the free encyclopedia.
- [2] Variable elimination, wikipedia., 2018.
- [3] David Poole and AlanMacWorth. David poole and alanmacworth, artificial intelligence: Foundations of computational agents, web version., 2018.
- [4] Jacek Kisyński Shinjiro Sueda Kyle Porter, David Poole, Holger Hoos Peter Gorniak Byron Knoll, with help from Alan Mackworth, and Cristina Conati. Aispace, 2008.

## 6 Appendix

### 6.1 Log file

The following results are from the Earthquake.bif problem:

TEST 1:

The queried variable(s) is/are: Alarm

The observed variable(s) is/are:

Burglary This variable has the value: True

The reduced formula based on the network structure:  $P(B=True) \cdot P(E) \cdot P(A|B=True, E) \cdot P(J|A) \cdot P(M|A)$

The formula of the reduced factors:  $f_1(E) \cdot f_2(A, E) \cdot f_3(J, A) \cdot f_4(M, A)$

The elimination order, based on least incoming arcs: 1. E 2. M 3. J

Merging the following factors by eliminating E variable  $f_1(E) f_2(A, E)$

Formula after the merge:  $f_1(J, A) \cdot f_2(M, A) \cdot f_3(A)$

The following factor is safely ignored:  $f_1(M, A)$

Formula after the merge:  $f_1(J, A) \cdot f_2(A)$

The following factor is safely ignored:  $f_1(J, A)$

Formula after the merge:  $f_1(A)$

Final answer: Alarm [True] | 0.9402 [False] | 0.0598

TEST 2:

The queried variable(s) is/are: JohnCalls

The observed variable(s) is/are: MaryCalls This variable has the value: True

The reduced formula based on the network structure:  $P(B) \cdot P(E) \cdot P(A|B, E) \cdot P(J|A) \cdot P(M=True|A)$

The formula of the reduced factors:  $f_1(B) \cdot f_2(E) \cdot f_3(A, B, E) \cdot f_4(J, A) \cdot f_5(M=True, A)$

The elimination order, based on least incoming arcs: 1. B 2. E 3. A

Merging the following factors by eliminating B variable  $f_1(B) f_2(A, B, E)$

Formula after the merge:  $f_1(E) \cdot f_2(J, A) \cdot f_3(M=True, A) \cdot f_4(A, E)$

Merging the following factors by eliminating E variable  $f_1(E) f_2(A, E)$

Formula after the merge:  $f_1(J, A) \cdot f_2(M=True, A) \cdot f_3(A)$

Merging the following factors by eliminating A variable  $f_1(J, A) f_2(M=True, A) f_3(A)$

Formula after the merge:  $f_1(J)$

Final answer: JohnCalls [True] | 0.504 [False] | 0.496

TEST 3:

The queried variable(s) is/are: Alarm

The observed variable(s) is/are:

MaryCalls This variable has the value: True

The reduced formula based on the network structure:  $P(B) \cdot P(E) \cdot P(A|B, E) \cdot P(J|A) \cdot P(M=True|A)$

The formula of the reduced factors:  $f_1(B) \cdot f_2(E) \cdot f_3(A, B, E) \cdot f_4(J, A) \cdot f_5(M=True, A)$

The elimination order, based on least incoming arcs: 1. B 2. E 3. J

Merging the following factors by eliminating B variable  $f_1(B) f_2(A, B, E)$

Formula after the merge:  $f_1(E) \cdot f_2(J, A) \cdot f_3(M=True, A) \cdot f_4(A, E)$

Merging the following factors by eliminating E variable  $f_1(E) f_2(A, E)$

Formula after the merge:  $f_1(J, A) \cdot f_2(M=True, A) \cdot f_3(A)$

The following factor is safely ignored:  $f_1(J, A)$

Formula after the merge:  $f_1(M=True, A) \cdot f_2(A)$

Merging last remaining factors:  $f_1(M=True, A) f_2(A)$

Final answer: Alarm [True] | 0.53412 [False] | 0.46588

TEST 4:

The queried variable(s) is/are: Alarm

The observed variable(s) is/are:

JohnCalls This variable has the value: True

MaryCalls This variable has the value: True

The reduced formula based on the network structure:  $P(B) \cdot P(E) \cdot P(A|B, E) \cdot P(J=True|A) \cdot P(M=True|A)$

The formula of the reduced factors:  $f_1(B) \cdot f_2(E) \cdot f_3(A, B, E) \cdot f_4(J=True, A) \cdot f_5(M=True, A)$

The elimination order, based on least incoming arcs: 1. B 2. E

Merging the following factors by eliminating B variable  $f_1(B) f_2(A, B, E)$

Formula after the merge:  $f_1(E) \cdot f_2(J=True, A) \cdot f_3(M=True, A) \cdot f_4(A, E)$

Merging the following factors by eliminating E variable  $f_1(E) f_2(A, E)$

Formula after the merge:  $f_1(J=True, A) \cdot f_2(M=True, A) \cdot f_3(A)$

Merging last remaining factors:  $f_1(J=True, A) f_2(M=True, A) f_3(A)$

Final answer: Alarm [True] | 0.95378 [False] | 0.04622

TEST 5:

The queried variable(s) is/are: Earthquake

The observed variable(s) is/are:

Alarm This variable has the value: True

The reduced formula based on the network structure:  $P(B) \cdot P(E) \cdot P(A=\text{True}|B,E) \cdot P(J|A=\text{True}) \cdot P(M|A=\text{True})$   
The formula of the reduced factors:  $f_1(B) \cdot f_2(E) \cdot f_3(A=\text{True},B,E) \cdot f_4(J) \cdot f_5(M)$   
The elimination order, based on least incoming arcs: 1. B 2. M 3. J  
Merging the following factors by eliminating B variable  $f_1(B) \cdot f_2(A=\text{True},B,E)$   
Formula after the merge:  $f_1(E) \cdot f_2(J) \cdot f_3(M) \cdot f_4(A=\text{True},E)$   
The following factor is safely ignored:  $f_1(M)$   
Formula after the merge:  $f_1(E) \cdot f_2(J) \cdot f_3(A=\text{True},E)$   
The following factor is safely ignored:  $f_1(J)$   
Formula after the merge:  $f_1(E) \cdot f_2(A=\text{True},E)$   
Merging last remaining factors:  $f_1(E) \cdot f_2(A=\text{True},E)$   
Final answer: Earthquake [True] | 0.36812 [False] | 0.63188  
TEST 6:  
The queried variable(s) is/are: Earthquake  
The observed variable(s) is/are:  
Burglary This variable has the value: True  
JohnCalls This variable has the value: True  
MaryCalls This variable has the value: True  
The reduced formula based on the network structure:  $P(B=\text{True}) \cdot P(E) \cdot P(A|B=\text{True},E) \cdot P(J=\text{True}|A) \cdot P(M=\text{True}|A)$   
The formula of the reduced factors:  $f_1(E) \cdot f_2(A,E) \cdot f_3(J=\text{True},A) \cdot f_4(M=\text{True},A)$   
The elimination order, based on least incoming arcs: 1. A  
Merging the following factors by eliminating A variable  $f_1(A,E) \cdot f_2(J=\text{True},A) \cdot f_3(M=\text{True},A)$   
Formula after the merge:  $f_1(E) \cdot f_2(E)$   
Merging last remaining factors:  $f_1(E) \cdot f_2(E)$   
Final answer: Earthquake [True] | 0.02021 [False] | 0.97979  
The following tests are from the problem of our own creation.  
TEST 1:  
The queried variable(s) is/are: Weather  
The observed variable(s) is/are:  
ConditionBike This variable has the value: Medium  
The reduced formula based on the network structure:  $P(W) \cdot P(C=\text{Medium}|W) \cdot P(P|W) \cdot P(R)$   
The formula of the reduced factors:  $f_1(W) \cdot f_2(C=\text{Medium},W) \cdot f_3(P,W) \cdot f_4(R)$   
The elimination order, based on least incoming arcs: 1. R 2. P  
The following factor is safely ignored:  $f_1(R)$   
Formula after the merge:  $f_1(W) \cdot f_2(C=\text{Medium},W) \cdot f_3(P,W)$   
The following factor is safely ignored:  $f_1(P,W)$   
Formula after the merge:  $f_1(W) \cdot f_2(C=\text{Medium},W)$   
Merging last remaining factors:  $f_1(W) \cdot f_2(C=\text{Medium},W)$   
TEST 2  
Weather [Medium, Rainy] | 0.73684 [Medium, Sunny] | 0.15789 [Medium, Snow] | 0.10526  
The queried variable(s) is/are: ConditionBike  
The observed variable(s) is/are:  
Weather This variable has the value: Sunny  
The reduced formula based on the network structure:  $P(W=\text{Sunny}) \cdot P(C|W=\text{Sunny}) \cdot P(P|W=\text{Sunny}) \cdot P(R)$   
The formula of the reduced factors:  $f_1(C) \cdot f_2(P) \cdot f_3(R)$   
The elimination order, based on least incoming arcs: 1. R 2. P  
The following factor is safely ignored:  $f_1(R)$   
Formula after the merge:  $f_1(C) \cdot f_2(P)$   
The following factor is safely ignored:  $f_1(P)$   
Formula after the merge:  $f_1(C)$   
ConditionBike [Good] | 0.4 [Medium] | 0.3 [Broken] | 0.3

## 6.2 Main class

```

1 package varel;
2
3 import java.util.ArrayList;
4
5 /**
6  * Main class to read in a network, add queries and observed
   variables, and run variable elimination.

```

```

7  *
8  * @author Marcel de Korte, Moira Berens, Djamari Oetringer,
   *   Abdullahi Ali, Leonieke van den Bulk
9  * @co-author/editor Mantas Makelis, David Leeftink
10 * /
11
12 public class Main {
13
14     private final static String networkName = "earthquake.bif"; //
   // The network to be read in (format and other
15 // networks can be found on http://www.bnlearn.com/
   // bnrepository/)
16
17     public static void main(String[] args) {
18
19         // Read in the network
20         Networkreader reader = new Networkreader(networkName);
21
22         // Get the variables and probabilities of the network
23         ArrayList<Variable> vs = reader.getVs();
24         ArrayList<Table> ps = reader.getPs();
25
26         // Make user interface
27         UserInterface ui = new UserInterface(vs, ps);
28
29         // Print variables and probabilities
30         ui.printNetwork();
31
32         // Ask user for query and heuristic
33         ui.askForQuery();
34         Variable query = ui.getQueriedVariable();
35
36         // Ask user for observed variables
37         ui.askForObservedVariables();
38         ArrayList<Variable> observed = ui.getObservedVariables();
39
40         // Ask user for heuristic
41         //ui.askForHeuristic();
42         //String heuristic = ui.getHeuristic();
43
44         // Print the query and observed variables
45         ui.printQueryAndObserved(query, observed);
46
47         //PUT YOUR CALL TO THE VARIABLE ELIMINATION ALGORITHM HERE
48         Algorithm algorithm = new Algorithm(ui);
49         algorithm.runElimination(query, vs, ps);

```

```

50     }
51 }

```

Listing 6: Main.java

### 6.3 Class representing algorithm

```

1  package varelim;
2
3  import java.util.*;
4
5  /**
6   * Represents the variable elimination algorithm.
7   *
8   * @author Mantas Makelis, David Leeftink
9   */
10 public class Algorithm {
11
12     private UserInterface ui;
13
14     public Algorithm(UserInterface ui) {
15         this.ui = ui;
16     }
17
18     /**
19      * Runs variable elimination algorithm which makes factors and
20      * merges them in defined order until only one factor is
21      * left and the
22      * probability of the query can be determined.
23      * The order of the algorithm:
24      * 1. Collect all factors
25      * 2. Fix order
26      * 3. Multiply factors in order
27      * 4. Marginalize factors
28      * 5. Normalize results
29      *
30      * @param query the variable for which the probability needs
31      * to be determined
32      * @param vars a list of all the variables in the Bayesian
33      * network
34      * @param probs a list of the probability tables for each
35      * variable
36      */
37     public void runElimination(Variable query, ArrayList<Variable>
38         vars, ArrayList<Table> probs) {
39         ui.printProductFormula(vars);
40         // Initialise factors according to all variables

```



```

35     ArrayList<Factor> factors = factorize(vars, probs);
36
37     // Create the order of elimination according to the number
38     // of parents
39     Queue<Variable> elimOrder = compriseOrder(query, vars,
40         factors);
41     ui.printEliminationOrder(new PriorityQueue<>(elimOrder));
42
43     while (!elimOrder.isEmpty()) {
44         Variable eliminate = elimOrder.poll();
45
46         // Retrieve factors which contain the popped variable
47         ArrayList<Factor> concerningFactors =
48             getFactorsContainingEliminate(eliminate, factors);
49         ui.printMergingFactors(concerningFactors, eliminate);
50
51         // Eliminate the variable which is contained in at
52         // least 2 factors
53         if (concerningFactors.size() > 1) {
54             Factor mergedFactor = new Factor(concerningFactors
55                 , eliminate);
56             factors.add(mergedFactor);
57         }
58         // Any factor concerning 1 variable results in (1,1)
59         // probability.
60         ui.printFactorFormula(factors, false);
61     }
62     Factor finalFactor;
63
64     // In case the query is the ancestor of observed variables
65     .
66     if (factors.size() > 1) {
67         ui.printLastFactorMerge(factors);
68         finalFactor = new Factor(factors, null);
69     }
70     else {
71         finalFactor = factors.get(0);
72     }
73
74     // Gather results
75     finalFactor = normalize(finalFactor);
76     ui.printQueryAnswer(finalFactor.toString());
77
78 }
79
80 /**

```

```

74      * Normalize the final factor by the formula : factor / (sum
      * of probabilities of the factor)
75      *
76      * @param finalFactor
77      * @return
78      */
79      private Factor normalize(Factor finalFactor) {
80          // Sum up all the probabilities
81          double sumProb = 0;
82          for (ProbRow row : finalFactor.getProbabilities()) {
83              sumProb += row.getProb();
84          }
85          for (ProbRow probability : finalFactor.getProbabilities())
86          {
87              // Normalize results, round to 5 digits.
88              probability.setProb(Math.round((probability.getProb()
89                  / sumProb) * 100000.0) / 100000.0);
90          }
91          return finalFactor;
92      }
93
94      /**
95      * Converts all the variables to a list of the factors.
96      *
97      * @param vars a list of all the variables in the Bayesian
98      * network
99      * @param probs a list of the probability tables for each
100      * variable
101      * @return a list containing all the factors
102      */
103      private ArrayList<Factor> factorize(ArrayList<Variable> vars,
104          ArrayList<Table> probs) {
105          ArrayList<Factor> factors = new ArrayList<>();
106          // Create factors out of all variables which are NOT
107          // observed
108          for (Variable var : vars) {
109              Factor factor = new Factor(var, getProb(var, probs));
110              factors.add(factor);
111          }
112          ArrayList<Factor> fullyObserved = getFullyObserved(factors);
113          ui.printFactorFormula(fullyObserved, true);
114          return fullyObserved;
115      }

```

```

112  /**
113   * Gets the fully observed factors removed.
114   * Remove factors with only observed.
115   *
116   * @param factors factor list
117   * @return a list of factors
118   */
119  private ArrayList<Factor> getFullyObserved(ArrayList<Factor>
    factors) {
120      ArrayList<Factor> updatedFactors = new ArrayList<>();
121      for (Factor factor : factors) {
122          boolean remove = true;
123          for (Variable variable : factor.getVariables()) {
124              if (!variable.isObserved()) {
125                  remove = false;
126              }
127          }
128          if (!remove) {
129              updatedFactors.add(factor);
130          }
131      }
132      return updatedFactors;
133  }
134
135  /**
136   * Comprises the order in which to eliminate the variables.
137   * Consists of least-arcs incoming, fewest factors and random.
138   *
139   * @param query the variable for which the probability needs
140   *             to be determined
141   * @param vars a list of all the variables in the Bayesian
142   *             network.
143   * @return the order of elimination
144   */
145  private Queue<Variable> compriseOrder(Variable query,
    ArrayList<Variable> vars, ArrayList<Factor> factors) {
146      // Initialise the priority queue which compares members by
147      // the number of their parents
148      PriorityQueue<Variable> order = new PriorityQueue<>(
149          Comparator.comparing(Variable::getNrOfParents));
150
151      // Add variables which are NOT observed and is not a query
152      for (Variable var : vars) {
153          if (!var.isObserved() && !var.equals(query)) {
154              order.add(var);
155          }
156      }
157  }

```

```

152     }
153     return order;
154 }
155
156 /**
157  * Retrieves the corresponding probability table for a
158   * variable.
159  *
160  * @param var the variable for which to retrieve the table
161  * @param probs a list of the probability tables for each
162   * variable
163  * @return the corresponding probability table
164  */
165 public Table getProb(Variable var, ArrayList<Table> probs) {
166     for (Table prob : probs) {
167         if (prob.getVariable().equals(var)) {
168             return prob;
169         }
170     }
171     return null;
172 }
173
174 /**
175  * Gets factors which contain the given variable.
176  *
177  * @param var the variable for which to look in factors
178  * @param factors a list of all the factors
179  * @return a list containing only the factors which contain
180   * the given variable
181  */
182 public ArrayList<Factor> getFactorsContainingEliminate(
183     Variable var, ArrayList<Factor> factors) {
184     ArrayList<Factor> containing = new ArrayList<>();
185     // Add factor to the containing if the factor contains
186     // variable to eliminate
187     for (Factor factor : factors) {
188         if (factor.containsVariable(var)) {
189             containing.add(factor);
190         }
191     }
192     // Remove all factors from the factor list that contained
193     // the variable to eliminate
194     for (Factor factor : containing) {
195         factors.remove(factor);
196     }
197     return containing;
198 }

```

```

192     }
193 }

```

**Listing 7:** Algorithm.java

## 6.4 Class representing Factor

```

1 package varelim;
2
3 import java.util.ArrayList;
4 import java.util.Comparator;
5 import java.util.LinkedList;
6 import java.util.PriorityQueue;
7
8 /**
9  * Represents the factor in variable elimination algorithm and is
10  * the part of it.
11  * The class contains few constructors. One constructor
12  * initialises factors, others merge a list of factors into one.
13  *
14  * @author Mantas Makelis, David Leeftink
15  */
16 public class Factor {
17
18     private ArrayList<Variable> variables; // Variables that are
19     contained in the factor
20     private ArrayList<ProbRow> probabilities; // The probability
21     table of this factor
22
23     /**
24      * This constructor is used to initialise the factor out of a
25      * variable.
26      * NOTE: It also eliminates the unnecessary probabilities of
27      * the observed variables.
28      *
29      * @param variable the variable to which the factor belongs
30      * @param probTable the probability table of the variable
31      */
32     public Factor(Variable variable, Table probTable) {
33         // Add all variables that the factor contains
34         variables = new ArrayList<>();
35         variables.add(variable);
36         variables.addAll(variable.getParents());
37
38         // collecting items of the observed values in the factors
39         ArrayList<Variable> varToRemove = new ArrayList<>();
40         ArrayList<Integer> colToRemove = new ArrayList<>();

```

```

35     for (int i = 0; i < variables.size(); i++) {
36         if (variables.get(i).isObserved()) {
37             varToRemove.add(variables.get(i));
38             colToRemove.add(i);
39             String value = variables.get(i).getObservedValue()
40                 ;
41             ArrayList<ProbRow> rowToRemove = new ArrayList<>()
42                 ;
43             for (ProbRow row : probTable.getTable()) {
44                 if (!row.getValues().get(i).equals(value)) {
45                     rowToRemove.add(row);
46                 }
47             }
48             for (ProbRow row : rowToRemove) {
49                 probTable.getTable().remove(row);
50             }
51         } else {
52             probabilities = probTable.getTable();
53         }
54     }
55
56     // removing the observed values from the factors
57     for (int i = 0; i < colToRemove.size(); i++) {
58         if (variables.size() > 1 && !variable.equals(
59             varToRemove.get(i))) {
60             variables.remove(varToRemove.get(i));
61             for (ProbRow row : probTable.getTable()) {
62                 int index = colToRemove.get(i);
63                 row.getValues().remove(index);
64             }
65         }
66     }
67
68     // Add probability table to the factor
69     probabilities = probTable.getTable();
70 }
71
72 /**
73  * Constructor of the factor from other factors with the
74  * variable which must be eliminated in progress
75  * This constructor is only used to merge a number of factors
76  * into one.
77  *
78  * @param factors a list of factors which contain the
79  * eliminate variable which must be merged
80  * @param eliminate a variable which will be eliminated in the

```

```

75     process
76     */
77     public Factor(ArrayList<Factor> factors, Variable eliminate) {
78         Factor factor = new Factor();
79
80         // the general case
81         if (eliminate != null) {
82             factor = normalMerge(factors, eliminate);
83         }
84
85         // in case where query is the ancestor of the observed
86         else {
87             factor = specialMerge(factors);
88         }
89
90         // set final factor values
91         variables = factor.getVariables();
92         probabilities = factor.getProbabilities();
93     }
94
95
96     /**
97     * The general merging case.
98     * Takes two factors as a parameter, then multiplies them and
99     * marginalizes them.
100
101     * @param factors
102     * @param eliminate
103     * @return Merged factor (multiplied, then marginalized).
104     */
105     private Factor normalMerge(ArrayList<Factor> factors, Variable
106     eliminate) {
107
108         // Initialise null factor for future use
109         Factor factor = new Factor();
110
111         PriorityQueue<Factor> factorQueue = new PriorityQueue<>(  

112             Comparator.comparing(Factor::getNoOfVariables));
113         factorQueue.addAll(factors);
114
115         // Loop over factors
116         while (!factorQueue.isEmpty()) {
117             if (factorQueue.isEmpty()) {
118                 // First time of the loop, pop two factors out and
119                 // merge them with another constructor

```

```

116         factor = mergeFactors(factorQueue.poll(),
117                                factorQueue.poll(), eliminate);
118     } else {
119         // All the other times of the loop, pop one factor
120         // and merge with the previously merged factor
121         factor = mergeFactors(factor, factorQueue.poll(),
122                                eliminate);
123     }
124 }
125
126 // Calculate the right probability table size
127 int tableSize = 1;
128 for (Variable var : factor.getVariables()) {
129     if (!var.equals(eliminate) && !var.isObserved()) {
130         tableSize *= var.getNumberOfValues();
131     }
132 }
133
134 ArrayList<ProbRow> finalTable = new ArrayList<>();
135 ArrayList<ArrayList<String>> usedExamples = new ArrayList<>();
136
137 int index = factor.variables.indexOf(eliminate);
138
139 // Marginalization over the variable to eliminate
140 for (ProbRow example : factor.probabilities) {
141     ArrayList<String> exampleValues = example.getValues();
142     if (!usedExamples.contains(exampleValues)){
143         ArrayList<ArrayList<String>> variations =
144             getAllVariations(index, eliminate, example.
145                             getValues());
146         usedExamples.addAll(variations);
147         ProbRow variation = new ProbRow(variations.get(0),
148                                         0);
149         for (ProbRow row : factor.probabilities) {
150             ArrayList<String> dummy = row.getValues();
151             if (variations.contains(dummy)) {
152                 variation.setProb(variation.getProb() +
153                                   row.getProb());
154             }
155         }
156         variation.getValues().remove(index);
157         finalTable.add(variation);
158         if (finalTable.size() == tableSize) {
159             break;
160         }
161     }
162 }

```



```

154     }
155
156     // Retrieve and remove variables from the merged factor
157     ArrayList<Variable> vars = factor.getVariables();
158     vars.remove(eliminate);
159     return new Factor(vars,finalTable);
160 }
161
162 /**
163  * Merges the factors, in case the query variable is the
164  *   ancestor of the observed variable(s).
165  * @param factors
166  * @return merged factor (multiplied)
167  */
168 private Factor specialMerge(ArrayList<Factor> factors) {
169
170     // Initiate new factor for future use
171     Factor factor = new Factor();
172     Variable query = new Variable();
173
174     // determine query variable and its factor
175     for (Factor mainFactor : factors) {
176         if (mainFactor.getVariables().size() == 1) {
177             query = mainFactor.getVariables().get(0);
178             factor = mainFactor;
179             break;
180         }
181     }
182     factors.remove(factor);
183     LinkedList<Factor> eliminateList = new LinkedList<>(
184         factors);
185     ArrayList<Variable> varsToRemove = new ArrayList<>();
186
187     // Loop over all factors to eliminate, and then merge.
188     while (!eliminateList.isEmpty()) {
189         Factor factorToMerge = eliminateList.poll();
190         for (Variable var : factorToMerge.getVariables()) {
191             if (!var.equals(query)) {
192                 varsToRemove.add(var);
193                 break;
194             }
195         }
196         factor = mergeFactors(factor, factorToMerge, query);
197     }
198
199     // remove unnecessary the variables

```

```

198         for (Variable var : varsToRemove) {
199             factor.variables.remove(var);
200         }
201         return factor;
202     }
203
204     /**
205      * Creates possible variations that need to be add up in the
206      * marginalization.
207      * @param index
208      * @param eliminate
209      * @param example
210      * @return List of variations (Which is an ArrayList of
211      *         Strings)
212     */
213     private ArrayList<ArrayList<String>> getAllVariations(int
214         index, Variable eliminate, ArrayList<String> example) {
215         ArrayList<ArrayList<String>> values = new ArrayList<>();
216         for (String value : eliminate.getValues()) {
217             ArrayList<String> newExample = (ArrayList<String>)
218                 example.clone();
219             newExample.set(index, value);
220             values.add(newExample);
221         }
222         return values;
223     }
224
225     /**
226      * The merger factor constructor which is only used in the
227      * constructor of multiple factors.
228      * This constructor creates one factor out of two.
229      *
230      * @param factor1 first factor
231      * @param factor2 second factor
232      * @param eliminate the variable to eliminate
233     */
234     private Factor mergeFactors(Factor factor1, Factor factor2,
235         Variable eliminate) {
236         // Initialise the array of combined probabilities
237         ArrayList<ProbRow> combinedProbs = new ArrayList<>();
238
239         // index used for identifying the right variable
240         int index1 = factor1.variables.indexOf(eliminate);
241         int index2 = factor2.variables.indexOf(eliminate);
242         ArrayList<ProbRow> probs1 = factor1.probabilities;
243         ArrayList<ProbRow> probs2 = factor2.probabilities;

```

```

238
239 // Loop over both factors
240 for (ProbRow row1 : probs1) {
241     for (ProbRow row2 : probs2) {
242
243         // determine right format for the new factor
244         if (row1.getValues().get(index1).equals(row2.
245             getValues().get(index2))) {
246             double prob = row1.getProb() * row2.getProb();
247             ProbRow row;
248             if (probs1.size() > probs2.size()) {
249                 row = new ProbRow(row1.getValues(), prob);
250             } else {
251                 row = new ProbRow(row2.getValues(), prob);
252             }
253             combinedProbs.add(row);
254         }
255     }
256
257 // Create the merged factor
258 ArrayList<Variable> finalVars = factor1.variables.size() <
259     factor2.variables.size() ? factor2.variables : factor1
260     .variables;
261 Factor merged = new Factor(finalVars, combinedProbs);
262 return merged;
263 }
264
265 /**
266  * Empty constructed, used to initialize variables.
267  */
268 public Factor() {
269 }
270
271 /**
272  * A constructor which sets the variables and probabilities.
273  *
274  * @param variables variables of the factor
275  * @param probabilities probabilities of the factor
276  */
277 private Factor(ArrayList<Variable> variables, ArrayList<
278     ProbRow> probabilities) {
279     this.variables = variables;
280     this.probabilities = probabilities;
281 }

```

```

280  /**
281   * A check if the factor is empty.
282   *
283   * @return true if not empty, otherwise, false
284   */
285  private boolean isNull() {
286      return probabilities == null && variables == null;
287  }
288
289  /**
290   * Getter for the variables of the factor.
291   *
292   * @return variables
293   */
294  public ArrayList<Variable> getVariables() {
295      return variables;
296  }
297
298  /**
299   * Getter for probabilities of the factor.
300   *
301   * @return probabilities
302   */
303  public ArrayList<ProbRow> getProbabilities() {
304      return probabilities;
305  }
306
307  /**
308   * Gets variable count in the factor.
309   *
310   * @return count of variables
311   */
312  public int getNoOfVariables() {
313      return variables.size();
314  }
315
316  /**
317   * A check to see if the supplied variable is in the factor.
318   *
319   * @param var the variable for which to look
320   * @return true if the factor contains the variable, otherwise
321   *         , false
322   */
323  public boolean containsVariable(Variable var) {
324      return variables.contains(var);

```

```

325
326  /**
327   * Converts the factor probabilities table to a string.
328   *
329   * @return a string of the table
330   */
331  @Override
332  public String toString() {
333      StringBuilder sb = new StringBuilder();
334      sb.append("\n").append(variables.get(0).getName()).append(
335          "\n");
336      for (ProbRow pr : probabilities) {
337          sb.append(pr.getValues()).append(" | ").append(pr.
338              getProb()).append("\n");
339      }
340      return sb.toString();
341  }

```

Listing 8: Factor.java

## 6.5 Class representing user interface

```

1  package varelim;
2
3  import java.util.ArrayList;
4  import java.util.PriorityQueue;
5  import java.util.Scanner;
6
7  /**
8   * Class that handles the communication with the user.
9   *
10   * @author Marcel de Korte, Moira Berens, Djamari Oettringer,
11   *         Abdullahi Ali, Leonieke van den Bulk
12   * @co-author/editor Mantas Makelis, David Leeftink
13   */
14  public class UserInterface {
15
16      private ArrayList<Variable> vs;
17      private ArrayList<Table> ps;
18      private Variable query = null;
19      private ArrayList<Variable> obs = new ArrayList<>();
20      private String line;
21      private String heuristic;
22      private Scanner scan;
23

```

```

24  /**
25   * Constructor of the user interface.
26   *
27   * @param vs, the list of variables.
28   * @param ps, the list of probability tables.
29   */
30  public UserInterface(ArrayList<Variable> vs, ArrayList<Table>
31      ps) {
32      this.vs = vs;
33      this.ps = ps;
34  }
35
36  /**
37   * Asks for a query from the user.
38   */
39  public void askForQuery() {
40      System.out.println("\nWhich variable(s) do you want to
41          query? Please enter in the number of the variable.");
42      for (int i = 0; i < vs.size(); i++) {
43          System.out.println("Variable " + i + ": " + vs.get(i).
44              getName());
45      }
46      scan = new Scanner(System.in);
47      line = scan.nextLine();
48      if (line.isEmpty()) {
49          System.out.println("You have not chosen a query value.
50              Please choose a query value.");
51          askForQuery();
52      }
53      try {
54          int queriedVar = Integer.parseInt(line);
55          if (queriedVar >= 0 && queriedVar < vs.size()) {
56              query = vs.get(queriedVar);
57          } else {
58              System.out.println("This is not a correct index.
59                  Please choose an index between " + 0 + " and "
60                  + (vs.size() - 1) + ".");
61              askForQuery();
62          }
63      } catch (NumberFormatException ex) {
64          System.out.println("This is not a correct index.
65              Please choose an index between " + 0 + " and "
66              + (vs.size() - 1) + ".");
67          askForQuery();
68      }
69  }

```

```

64
65  /**
66   * Ask the user for observed variables in the network.
67   */
68  public void askForObservedVariables() {
69
70      obs.clear();
71      System.out.println("Which variable(s) do you want to
72                          observe? Please enter in the number of the variable, \n
73                          "
74                          + "followed by a comma and the value of the observed
75                          variable. Do not use spaces. \n"
76                          + "If you want to query multiple variables, delimit
77                          them with a ',' and no spaces.\n"
78                          + "Example: '2,True;3,False'");
79      for (int i = 0; i < vs.size(); i++) {
80          StringBuilder values = new StringBuilder();
81          for (int j = 0; j < vs.get(i).getNumberOfValues() - 1;
82              j++) {
83              values.append(vs.get(i).getValues().get(j)).append
84                  (" , ");
85          }
86          values.append(vs.get(i).getValues().get(vs.get(i).
87              getNumberOfValues() - 1));
88
89          System.out.println("Variable " + i + ": " + vs.get(i).
90              getName() + " - " + values);
91      }
92      scan = new Scanner(System.in);
93      line = scan.nextLine();
94      if (!line.isEmpty()) {
95          if (!line.contains(",")) {
96              System.out.println("You did not enter a comma
97                                  between values. Please try again");
98              askForObservedVariables();
99          } else {
100              while (line.contains(";")) { // Multiple observed
101                  variables
102                  try {
103                      int queriedVar = Integer.parseInt(line.
104                          substring(0, line.indexOf(",")));
105                      String bool = line.substring(line.indexOf(
106                          ",") + 1, line.indexOf(";"));
107                      changeVariableToObserved(queriedVar, bool)
108                          ;
109                      line = line.substring(line.indexOf(";") +

```

```

123         1); // Continue
124         // with
125         // next
126         // observed
127         // variable.
128     } catch (NumberFormatException ex) {
129         System.out.println("This is not a correct
130             input. Please choose an index between "
131             + 0 + " and "
132             + (vs.size() - 1) + ".");
133         askForObservedVariables();
134         return;
135     }
136 }
137
138 if (!line.contains(";")) { // Only one observed
139     variable
140     try {
141
142         int queriedVar = Integer.parseInt(line.
143             substring(0, line.indexOf(",")));
144         String bool = line.substring(line.indexOf(
145             ",") + 1);
146         changeVariableToObserved(queriedVar, bool)
147         ;
148     } catch (NumberFormatException ex) {
149         System.out.println("This is not a correct
150             input. Please choose an index between "
151             + 0 + " and "
152             + (vs.size() - 1) + ".");
153         askForObservedVariables();
154     }
155 }
156 }
157 }
158 }
159 }
160
161 /**
162  * Checks whether a number and value represent a valid
163  * observed value or not and if so, adds it to the
164  * observed list. If not, asks again for new input.
165  */
166 public void changeVariableToObserved(int queriedVar, String
167     value) {
168     Variable ob;
169     if (queriedVar >= 0 && queriedVar < vs.size()) {
170         ob = vs.get(queriedVar);

```



```

132         if (ob.isValueOf(value)) {
133             ob.setObservedValue(value);
134             ob.setObserved(true);
135         } else {
136             System.out.println("Apparently you did not fill in
137                 the value correctly. You typed: \"" + value
138                 + "\"Please try again");
139             askForObservedVariables();
140             return;
141         }
142         obs.add(ob); // Adding observed variable and it's
143                     // value to list.
144     } else {
145         System.out.println("You have chosen an incorrect index
146             . Please choose an index between " + 0 + " and "
147             + (vs.size() - 1));
148         askForObservedVariables();
149     }
150 }
151
152 /**
153  * Print the network that was read-in (by printing the
154  * variables, parents and probabilities).
155  */
156 public void printNetwork() {
157     System.out.println("The variables:");
158     for (int i = 0; i < vs.size(); i++) {
159         StringBuilder values = new StringBuilder();
160         for (int j = 0; j < vs.get(i).getNumberOfValues() - 1;
161             j++) {
162             values.append(vs.get(i).getValues().get(j)).append
163                 (" , ");
164         }
165         values.append(vs.get(i).getValues().get(vs.get(i).
166             getNumberOfValues() - 1));
167         System.out.println((i + 1) + " ) " + vs.get(i).getName
168             () + " - " + values); // Printing
169         // the
170         // variables.
171     }
172     System.out.println("\nThe probabilities:");
173     for (int i = 0; i < ps.size(); i++) {
174         if (vs.get(i).getNrOfParents() == 1) {
175             System.out.println(ps.get(i).getVariable().getName
176                 () + " has parent "
177                 + vs.get(i).getParents().get(0).getName());

```

```

169         } else if (vs.get(i).getNrOfParents() > 1) {
170             StringBuilder parentsList = new StringBuilder();
171             for (int j = 0; j < vs.get(i).getParents().size();
172                 j++) {
173                 parentsList.append(vs.get(i).getParents().get(
174                     j).getName());
175                 if (!(j == vs.get(i).getParents().size() - 1))
176                     {
177                         parentsList.append(" and ");
178                     }
179             }
180             System.out.println(ps.get(i).getVariable().getName
181                 () + " has parents "
182                 + parentsList);
183         } else {
184             System.out.println(ps.get(i).getVariable().getName
185                 () + " has no parents.");
186         }
187     }
188
189     Table probs = ps.get(i);
190     for (int l = 0; l < probs.size(); l++) {
191         System.out.println(probs.get(l));           // Printing
192     }                                               // the
193     System.out.println();                          // probabilities.
194 }
195
196 /**
197  * Prints the query and observed variables given in by the
198  * user.
199  */
200 public void printQueryAndObserved(Variable query, ArrayList<
201     Variable> Obs) {
202     System.out.println("\nThe queried variable(s) is/are: ");
203     // Printing
204     // the
205     // queried
206     // variables.
207     System.out.println(query.getName());
208     if (!Obs.isEmpty()) {
209         System.out.println("The observed variable(s) is/are: "
210             ); // Printing
211         // the
212         // observed
213         // variables.
214         for (Variable Ob : Obs) {

```

```

206         System.out.println(Ob.getName());
207         System.out.println("This variable has the value: "
208             + Ob.getObservedValue());
209     }
210 }
211
212 /**
213  * Asks for a heuristic.
214  */
215 public void askForHeuristic() {
216     System.out.println("Supply a heuristic. Input 1 for least-
217         incoming, 2 for fewest-factors and enter for random");
218     scan = new Scanner(System.in);
219     line = scan.nextLine();
220     if (line.isEmpty()) {
221         heuristic = "empty";
222         System.out.println("You have chosen for random");
223     } else if (line.equals("1")) {
224         heuristic = "least-incoming";
225         System.out.println("You have chosen for least-incoming
226             ");
227     } else if (line.equals("2")) {
228         heuristic = "fewest-factors";
229         System.out.println("You have chosen for fewest-factors
230             ");
231     } else {
232         System.out.println(line + " is not an option. Please
233             try again");
234         askForHeuristic();
235     }
236     scan.close();
237 }
238
239 /**
240  * Getter of the observed variables.
241  *
242  * @return a list of observed variables given by the user.
243  */
244 public ArrayList<Variable> getObservedVariables() {
245     return obs;
246 }
247
248 /**
249  * Getter of the queried variables.
250  *

```

```

247     * @return the variable the user wants to query.
248     */
249     public Variable getQueriedVariable() {
250         return query;
251     }
252
253     /**
254     * Getter of the heuristic.
255     *
256     * @return the name of the heuristic.
257     */
258     public String getHeuristic() {
259         return heuristic;
260     }
261
262     /**
263     * Prints the answer of the user query.
264     *
265     * @param finalTable a string of the table of the last factor
266     * after elimination
267     */
268     public void printQueryAnswer(String finalTable) {
269         System.out.println(finalTable);
270     }
271
272     /**
273     * Prints the reduced product formula based on the network
274     * structure
275     *
276     * @param vars a list of all variables
277     */
278     public void printProductFormula(ArrayList<Variable> vars) {
279         StringBuilder sb = new StringBuilder();
280         sb.append("\nThe reduced formula based on the network
281         structure:\n");
282         for (Variable var : vars) {
283             sb.append("P(").append(var.getName(), 0, 1);
284             if (var.isObserved()) {
285                 String value = var.getObservedValue();
286                 sb.append("=").append(value);
287             }
288             if (var.getNrOfParents() != 0) {
289                 sb.append("|");
290                 for (Variable parent : var.getParents()) {
291                     sb.append(parent.getName(), 0, 1);
292                     if (parent.isObserved()) {

```

```

290         String value = parent.getObservedValue();
291         sb.append("=").append(value);
292     }
293     if (var.getParents().indexOf(parent) != var.
294         getParents().size() - 1) {
295         sb.append(",");
296     }
297 }
298 sb.append(")");
299 if (vars.indexOf(var) != vars.size() - 1) {
300     sb.append(" ");
301 }
302 }
303 sb.append("\n");
304 System.out.println(sb.toString());
305 }
306
307 /**
308  * Prints the formula of the reduced factors.
309  *
310  * @param fullyObserved reduced factor list
311  */
312 public void printFactorFormula(ArrayList<Factor> fullyObserved
313     , boolean firstTime) {
314     StringBuilder sb = new StringBuilder();
315     if (firstTime) {
316         sb.append("The formula of the reduced factors:\n");
317     } else {
318         sb.append("Formula after the merge:\n");
319     }
320     addFactorsToStringBuilder(fullyObserved, sb, false);
321     System.out.println(sb.toString());
322 }
323
324 /**
325  * Print the elimination order.
326  *
327  * @param elimOrder a list of variables in the elimination
328  *     order
329  */
330 public void printEliminationOrder(PriorityQueue<Variable>
331     elimOrder) {
332     StringBuilder sb = new StringBuilder();
333     sb.append("The elimination order, based on least incoming
334         arcs:\n");

```

```

331     int order = 1;
332     while (!elimOrder.isEmpty()) {
333         Variable var = elimOrder.poll();
334         sb.append(order).append(". ").append(var.getName(), 0,
335             1).append("\n");
336         order++;
337     }
338     System.out.println(sb.toString());
339 }
340
341 /**
342  * Prints the factors that are going to be merged.
343  *
344  * @param concerningFactors the list of factors to merge
345  * @param eliminate the variable to eliminate
346  */
347 public void printMergingFactors(ArrayList<Factor>
348     concerningFactors, Variable eliminate) {
349     StringBuilder sb = new StringBuilder();
350     if (concerningFactors.size() > 1) {
351         sb.append("Merging the following factors by
352             eliminating ").append(eliminate.getName(), 0, 1).
353             append(" variable\n");
354         addFactorsToStringBuilder(concerningFactors, sb, true)
355         ;
356     } else {
357         sb.append("The following factor is safely ignored:\n");
358         ;
359         addFactorsToStringBuilder(concerningFactors, sb, true)
360         ;
361     }
362     System.out.println(sb.toString());
363 }
364
365 /**
366  * Prints the last factors that are merged. Only used if the
367  * query variable is the ancestor of the observed variable(s)
368  * .
369  *
370  * @param factors a list of factors to be merged
371  */
372 public void printLastFactorMerge(ArrayList<Factor> factors) {
373     StringBuilder sb = new StringBuilder();
374     sb.append("Merging last remaining factors: \n");
375     addFactorsToStringBuilder(factors, sb, true);
376     System.out.println(sb.toString());

```

```

368     }
369
370     /**
371      * An auxiliary function to add factors list to the string
372      * builder.
373      *
374      * @param factors a list of factors
375      * @param sb string builder
376      * @param newLine a check if a new line is needed
377      */
378     private void addFactorsToStringBuilder(ArrayList<Factor>
379     factors, StringBuilder sb, boolean newLine) {
380         for (int i = 0; i < factors.size(); i++) {
381             sb.append("f").append(i + 1).append("(");
382             for (Variable var : factors.get(i).getVariables()) {
383                 if (var.isObserved()) {
384                     sb.append(var.getName(), 0, 1).append("=").
385                     append(var.getObservedValue());
386                 } else {
387                     sb.append(var.getName(), 0, 1);
388                 }
389             }
390             sb.append(")");
391             if (i != factors.size() - 1 && !newLine) {
392                 sb.append(" ");
393             } else {
394                 sb.append("\n");
395             }
396         }
397     }
398 }
399 }

```

Listing 9: UserInterface.java

## 6.6 Class representing variable

```

1 package varelim;
2
3 import java.util.ArrayList;
4 import java.util.Objects;
5
6 /**

```

```

7  * Class to represent a variable.
8  *
9  * @author Marcel de Korte, Moira Berens, Djamari Oetringer,
    Abdullahi Ali, Leonieke van den Bulk
10 * @co-author/editor Mantas Makelis, David Leeftink
11 */
12 public class Variable {
13
14     private String name;
15     private ArrayList<String> possibleValues;
16     private ArrayList<Variable> parents; // Note that parents is
    not set in the constructor, but manually set with
17 // setParents() because of the .bif file layout
18     private String observedValue;
19     private boolean observed = false;
20     private int nrFactors;
21     /**
22      * Constructor of the class.
23      *
24      * @param name, name of the variable.
25      * @param possibleValues, the possible values of the variable.
26      */
27     public Variable(String name, ArrayList<String> possibleValues)
    {
28         this.name = name;
29         this.possibleValues = possibleValues;
30     }
31
32     public Variable() {}
33
34     /**
35      * Transform variable and its values to string.
36      */
37     public String toString() {
38         StringBuilder valuesString = new StringBuilder();
39         for (int i = 0; i < possibleValues.size() - 1; i++) {
40             valuesString.append(possibleValues.get(i)).append(", "
    );
41         }
42         valuesString.append(possibleValues.get(possibleValues.size
    () - 1));
43         return name + " - " + valuesString;
44     }
45
46     /**
47      * Getter of the values.

```



```

48      *
49      * @return the values of the variable as a ArrayList of
      Strings.
50      */
51      public ArrayList<String> getValues() {
52          return possibleValues;
53      }
54
55      /**
56      * Check if string v is a value of the variable.
57      *
58      * @return a boolean denoting if possibleValues contains
      string v.
59      */
60      public boolean isValueOf(String v) {
61          return possibleValues.contains(v);
62      }
63
64      /**
65      * Getter of the amount of possible values of the variable.
66      *
67      * @return the amount of values as an int.
68      */
69      public int getNumberOfValues() {
70          return possibleValues.size();
71      }
72
73      /**
74      * Getter of the name of the variable.
75      *
76      * @return the name as a String.
77      */
78      public String getName() {
79          return name;
80      }
81
82      /**
83      * Getter of the parents of the variable.
84      *
85      * @return the list of parents as an ArrayList of Variables.
86      */
87      public ArrayList<Variable> getParents() {
88          return Objects.requireNonNullElseGet(parents, ArrayList::
      new);
89      }
90

```

```

91  /**
92   * Setter of the parents of the variable.
93   *
94   * @param parents the list of parents as an ArrayList of
95   *   Variables.
96   */
97  public void setParents(ArrayList<Variable> parents) {
98      this.parents = parents;
99  }
100
101  /**
102   * Check if a variable has parents.
103   *
104   * @return a boolean denoting if the variable has parents.
105   */
106  public boolean hasParents() {
107      return parents != null;
108  }
109
110  /**
111   * Getter for the number of parents a variable has.
112   *
113   * @return the amount of parents as an int.
114   */
115  public int getNrOfParents() {
116      if (parents != null) {
117          return parents.size();
118      }
119      return 0;
120  }
121
122  /**
123   * Setter of the observed value of the variable.
124   *
125   * @param observedValue as a String to which observed value
126   *   the current value of the variable should be set.
127   */
128  public void setObservedValue(String observedValue) {
129      this.observedValue = observedValue;
130  }
131
132  /**
133   * Getter of the observed value of the variable.
134   *
135   * @return the value of the variable as a String.
136   */

```

```

135     public String getObservedValue() {
136         return observedValue;
137     }
138
139     /**
140     * Setter for if a variable is observed.
141     *
142     * @param observed a boolean denoting if the variable is
143     *     observed or not.
144     */
145     public void setObserved(boolean observed) {
146         this.observed = observed;
147     }
148
149     /**
150     * Getter for if a variable is observed.
151     *
152     * @return a boolean denoting if the variable is observed or
153     *     not.
154     */
155     public boolean isObserved() {
156         return observed;
157     }
158
159     @Override
160     public boolean equals(Object var) {
161         Variable variable = (Variable) var;
162         return name.equals(variable.getName());
163     }
164
165     /**
166     * Get total number of appearances in factors
167     * @return number of appearances
168     */
169     public int getNrFactors(){
170         return nrFactors;
171     }
172
173     /**
174     * Setter for total number of appearances in factors
175     * @param i new count
176     */
177     public void setNrFactors(int i){
178         nrFactors = i;
179     }

```

178 }

Listing 10: Variable.java

## 6.7 Class representing probability row

```

1 package varelim;
2
3 import java.util.ArrayList;
4
5 /**
6  * Class to represent a row of a probability table by its values
7  * and a probability.
8  *
9  * @author Marcel de Korte, Moira Berens, Djamari Oettringer,
10  *      Abdullahi Ali, Leonieke van den Bulk
11  * @co-author/editor Mantas Makelis, David Leeftink
12  */
13 public class ProbRow {
14
15     private ArrayList<String> values;
16     private double prob;
17
18     /**
19      * Constructor of the class.
20      *
21      * @param values, values of the variables (main variable+
22      *      parents) in the row, of which the value of the main
23      *      variable itself is always first.
24      * @param prob, probability belonging to this row of values.
25      */
26     public ProbRow(ArrayList<String> values, double prob) {
27         this.prob = prob;
28         this.values = values;
29     }
30
31     /**
32      * Transform probabilities to string.
33      */
34     public String toString() {
35         StringBuilder valuesString = new StringBuilder();
36         for (int i = 0; i < values.size() - 1; i++) {
37             valuesString.append(values.get(i)).append(", ");
38         }
39         valuesString.append(values.get(values.size() - 1));
40         return valuesString + " | " + Double.toString(prob);
41     }
42 }

```

```

39
40  /**
41   * Getter of the values of this probability row.
42   *
43   * @return ArrayList<String> of values
44   */
45  public ArrayList<String> getValues() {
46      return values;
47  }
48
49  /**
50   * Getter of the probability of this probability row
51   *
52   * @return the probability as a double.
53   */
54  public double getProb() {
55      return prob;
56  }
57
58  /**
59   * Setter of the probability
60   *
61   * @param prob the probability
62   */
63  public void setProb(double prob) {
64      this.prob = prob;
65  }
66  }

```

Listing 11: ProbRow.java

## 6.8 Class representing probability table

```

1  package varelim;
2
3  import java.util.ArrayList;
4
5  /**
6   * Class to represent a probability table consisting of
7   * probability rows.
8   *
9   * @author Marcel de Korte, Moira Berens, Djamari Oetringer,
10   * Abdullahi Ali, Leonieke van den Bulk
11   * @co-author/editor Mantas Makelis, David Leeftink
12   */
13  public class Table {

```

```

13
14 private Variable variable;
15 private ArrayList<ProbRow> table;
16
17 /**
18  * Constructor of the class.
19  *
20  * @param variable, variable belonging to the current
21  *   probability table.
22  * @param table, table made out of probability rows (ProbRows)
23  *
24  */
25 public Table(Variable variable, ArrayList<ProbRow> table) {
26     this.variable = variable;
27     this.table = table;
28 }
29
30 /**
31  * Returns the size of the Table (amount of probability rows).
32  *
33  * @return amount of rows in the table as an int.
34  */
35 public int size() {
36     return table.size();
37 }
38
39 /**
40  * Transform table to string.
41  */
42 public String toString() {
43     StringBuilder tableString = new StringBuilder(variable.
44         getName() + " | ");
45     for (int i = 0; i < variable.getNrOfParents(); i++) {
46         tableString.append(variable.getParents().get(i).
47             getName());
48         if (!(i == variable.getNrOfParents() - 1)) {
49             tableString.append(", ");
50         }
51     }
52     for (ProbRow row : table) {
53         tableString.append("\n").append(row.toString());
54     }
55     return tableString.toString();
56 }
57
58 /**

```

```

55     * Gets the i'th element from the ArrayList of ProbRows.
56     *
57     * @param i index as an int.
58     * @return i'th ProbRow in Table.
59     */
60     public ProbRow get(int i) {
61         return table.get(i);
62     }
63
64     /**
65     * Getter of the table made out of ProbRows
66     *
67     * @return table as an ArrayList of ProbRows.
68     */
69     public ArrayList<ProbRow> getTable() {
70         return table;
71     }
72
73     /**
74     * Getter of the variable that belongs to the probability
75     * table.
76     *
77     * @return the variable.
78     */
79     public Variable getVariable() {
80         return variable;
81     }
82
83     /**
84     * Getter of the parents that belong to the node of the
85     * probability table.
86     *
87     * @return the parents as an ArrayList of Variables.
88     */
89     public ArrayList<Variable> getParents() {
90         return variable.getParents();
91     }
92 }

```

Listing 12: Table.java

## 6.9 Class representing network reader

```

1 package varelim;
2
3 import java.io.BufferedReader;
4 import java.io.FileNotFoundException;

```

```

5 import java.io.FileReader;
6 import java.io.IOException;
7 import java.util.ArrayList;
8 import java.util.Arrays;
9 import java.util.Collections;
10
11 /**
12  * Class that reads in a network from a .bif file and puts the
13   * variables and probabilities at the right places.
14  *
15  * @author Marcel de Korte, Moira Berens, Djamari Oetringer,
16   * Abdullahi Ali, Leonieke van den Bulk
17  * @co-author/editor Mantas Makelis, David Leeftink
18  */
19 public class Networkreader {
20     private ArrayList<Variable> vs = new ArrayList<>();
21     private ArrayList<Table> ps = new ArrayList<>();
22     private ArrayList<ProbRow> probRows;
23     private String probName;
24     private ArrayList<Variable> parents = new ArrayList<>();
25     private int nrOfRows;
26
27     /**
28      * Constructor reads in the data file and adds the variables
29      * and its
30      * probabilities to the designated arrayLists.
31      *
32      * @param file, the name of the .bif file that contains the
33      * network.
34      */
35     public Networkreader(String file) {
36         BufferedReader br;
37         try {
38             String cur; // Keeping track of current line observed
39                         // by BufferedReader
40             br = new BufferedReader(new FileReader(file));
41             try {
42                 while ((cur = br.readLine()) != null) {
43                     if (cur.contains("variable")) {
44                         //Add variable to the list
45                         String varName = cur.substring(9, cur.
46                             length() - 2);
47                         cur = br.readLine();
48                         ArrayList<String> possibleValues =

```



```

        searchForValues(cur);
        vs.add(new Variable(varName,
            possibleValues));
    }
    if (cur.contains("{")) {
        parents = new ArrayList<>();
    }
    if (cur.contains("probability")) {
        // Conditional to check for parents of
        // selected variable
        searchForParents(cur);
    }
    if (cur.contains("table")) {
        //Conditional to find probabilities of 1
        // row and add Probabilities to
        // probability list
        ArrayList<ProbRow> currentProbRows =
            searchForProbs(cur);
        probRows.addAll(currentProbRows);
        Table table = new Table(getByName(probName
            ), probRows);
        ps.add(table);
    }
    if (cur.contains(")") && cur.contains("(") &&
        !cur.contains("prob")) {
        // Conditional to find probabilities of
        // more than 1 row;
        // add probabilities to probability list
        ArrayList<ProbRow> currentProbRows =
            searchForProbs(cur);
        probRows.addAll(currentProbRows);
        if (probRows.size() == nrOfRows) {
            Table table = new Table(getByName(
                probName), probRows);
            ps.add(table);
        }
    }
}
} catch (IOException ignored) {}
} catch (FileNotFoundException e) {
    System.out.println("This file does not exist.");
    System.exit(0);
}
}
}
/**

```

```

81  * Searches for a row of probabilities in a string
82  *
83  * @param s a string s
84  * @return a ProbRow
85  */
86  public ArrayList<ProbRow> searchForProbs(String s) {
87      ArrayList<ProbRow> currentProbRows = new ArrayList<>();
88      int beginIndex = s.indexOf(',') + 2;
89      if (s.contains("table")) {
90          beginIndex = s.indexOf('e') + 2;
91      }
92
93      int endIndex = s.length() - 1;
94      String subString = s.substring(beginIndex, endIndex);
95      String[] probsString = subString.split(", ");
96      double[] probs = new double[probsString.length];
97      for (int i = 0; i < probsString.length; i++) {
98          probs[i] = Double.parseDouble(probsString[i]);
99      }
100
101      if (!s.contains("table")) {
102          ArrayList<String> parentsValues = new ArrayList<>();
103          ArrayList<String> nodeValues = new ArrayList<>();
104          beginIndex = s.indexOf('(') + 1;
105          endIndex = s.indexOf(')');
106          subString = s.substring(beginIndex, endIndex);
107          String[] stringValues = subString.split(", ");
108          Collections.addAll(parentsValues, stringValues);
109          for (Variable v : vs) {
110              if (probName.equals(v.getName())) {
111                  nodeValues = v.getValues();
112              }
113          }
114          for (int i = 0; i < probs.length; i++) {
115              parentsValues.add(0, nodeValues.get(i));
116              ArrayList<String> currentVal = new ArrayList<>(
117                  parentsValues);
118              currentProbRows.add(new ProbRow(currentVal, probs[
119                  i]));
119              parentsValues.remove(0);
120          }
121      } else {
122          ArrayList<String> values = new ArrayList<>();
123          ArrayList<String> nodeValues = new ArrayList<>();
124          for (Variable v : vs) {
125              if (probName.equals(v.getName())) {

```

```

125         values = v.getValues();
126     }
127 }
128     for (int i = 0; i < probs.length; i++) {
129         nodeValues.add(values.get(i));
130         ArrayList<String> currentVal = new ArrayList<>(
131             nodeValues);
132         ProbRow prob = new ProbRow(currentVal, probs[i]);
133         currentProbRows.add(prob);
134         nodeValues.clear();
135     }
136     return currentProbRows;
137 }
138
139 /**
140  * Searches for values in a string
141  *
142  * @param s a string s
143  * @return a list of values
144  */
145 public ArrayList<String> searchForValues(String s) {
146     int beginIndex = s.indexOf('{') + 2;
147     int endIndex = s.length() - 3;
148     String subString = s.substring(beginIndex, endIndex);
149     String[] valueArray = subString.split(", ");
150     return new ArrayList<>(Arrays.asList(valueArray));
151 }
152
153 /**
154  * Method to check parents of chosen variable.
155  *
156  * @param cur, which gives the current line.
157  */
158 public void searchForParents(String cur) {
159     if (cur.contains("|")) { // Variable has parents
160         extractParents(cur);
161     } else { // Variable has no parents
162         probName = cur.substring(14, cur.length() - 4);
163         for (Variable v : vs) {
164             if (probName.equals(v.getName())) {
165                 nrOfRows = v.getNumberOfValues();
166             }
167         }
168     }
169     probRows = new ArrayList<>();

```

```

170 }
171
172 /**
173  * Gets a variable from variable Vs when the name is given
174  *
175  * @return variable with name as name
176  */
177 private Variable getByName(String name) {
178     Variable var = null;
179     for (Variable v : vs) {
180         if (v.getName().equals(name)) {
181             var = v;
182         }
183     }
184     return var;
185 }
186
187 /**
188  * Extracts parents and puts them in a list of parents of that
189  * node.
190  *
191  * @param cur, a string to extract from
192  */
193 public void extractParents(String cur) {
194     probName = cur.substring(14, cur.indexOf("|") - 1);
195     Variable var = getByName(probName);
196     String sub = cur.substring(cur.indexOf(',') + 2, cur.
197         indexOf(',') - 1);
198     while (sub.contains(",")) { // Variable has more parents
199         String current = sub.substring(0, sub.indexOf(','));
200         sub = sub.substring(sub.indexOf(',') + 2);
201         for (Variable v : vs) {
202             if (v.getName().equals(current)) {
203                 parents.add(v); // Add parent to list
204             }
205         }
206     }
207     if (!sub.contains(",")) { // Variable has no more parents
208         for (Variable v : vs) {
209             if (v.getName().equals(sub)) {
210                 parents.add(v); //
211             }
212         }
213     }
214     var.setParents(parents);

```

```

214         nrOfRows = computeNrOfRows(probName);
215     }
216
217     /**
218     * Computes the number of rows needed given the current
219     * parents
220     *
221     * @return the number of rows
222     */
223     private int computeNrOfRows(String probName) {
224         int fac = 1;
225         for (Variable parent : parents) {
226             fac = fac * parent.getNumberOfValues();
227         }
228         for (Variable v : vs) {
229             if (probName.equals(v.getName())) {
230                 fac = fac * v.getNumberOfValues();
231             }
232         }
233         return fac;
234     }
235
236     /**
237     * Getter of the variables in the network.
238     *
239     * @return the list of variables in the network.
240     */
241     public ArrayList<Variable> getVs() {
242         return vs;
243     }
244
245     /**
246     * Getter of the probabilities in the network.
247     *
248     * @return the list of probabilities in the network.
249     */
250     public ArrayList<Table> getPs() {
251         return ps;
252     }
253 }

```

Listing 13: Networkreader.java

## 6.10 Probabilities of the Bike Repair problem

probability ( Weather ) table 0.5, 0.25, 0.25; probability ( ConditionBike | Weather ) (Rainy) 0.15, 0.7, 0.15; (Sunny) 0.40, 0.30, 0.30; (Snow) 0.4, 0.2, 0.4; probability ( ParkingLo-

cation | Weather ) (Rainy) 0.90, 0.1; (Sunny) 0.5, 0.5; (Snow) 0.6, 0.4; probability ( Repair | ParkingLocation , ConditionBike) (Inside, Good) 0.02, 0.98; (Inside, Medium) 0.5, 0.5; (Inside, Broken) 0.99, 0.01; (Outside, Good) 0.8, 0.2; (Outside, Medium) 0.4, 0.6; (Outside, Broken) 0.2, 0.8;