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PomdpX File Format (Version 1.0)

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1. Overview

PomdpX is an XML file format for specifying models of Markov decision processes (MDPs), partially observable Markov decision processes (POMDPs), and mixed observability Markov decision processes (MOMDPs) [1]. PomdpX uses a factored model representation, which can be represented graphically as a dynamic Bayesian network (DBN):

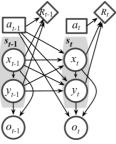


Figure 1.1. A MOMDP model. s_t represents the state, a_t represents the action, o_t represents the observation, and R_t represents the reward at time t. In a MOMDP model, the state variable s_t consists of two components: the fully observable state variable x_t and the partially observable state variable y_t .

PomdpX allows multiple state, action, observation, and reward variables to be specified in a model. A model must have at least one state, action, and reward variable. The observation variable is optional, depending on the type of the model (MDP, POMDP, or MOMDP). Each state variable must be specified as either partially observable (default) or fully observable. As a result, the PomdpX file format can specify any of the following models:

- MDPs, when all state variables are fully observable;
- POMDPs, when all state variables are partially observable;
- MOMDPs, when there are both fully and partially observable state variables.

The XML schema for PomdpX is available here for download.

2. PomdpX Tutorial

The purpose of this section is to provide a tutorial-like approach to using the PomdpX format. We make no assumptions about the user's familiarity with existing pomdp solvers.

2.1. Example Problem

We will be using a modified version of the RockSample problem [2] as our running example to encode into the PomdpX format. It models a rover on an exploration mission and it can achieve rewards by sampling rocks in its immediate area. Consider a map of size 1×3 as shown in Figure 2.1, with one rock at the left end and the terminal state at the right end. The rover starts off at the center and its possible actions are $A = \{West, East, Sample, Check\}$. The DBN for the RockSample problem is shown in Figure 2.2.



Figure 2.1. The 1×3 *RockSample* problem world.

This is a trivial problem but is adequate to showcase the salient features of PomdpX. As with the original version of the problem, the *Sample* action samples the rock at the rover's current location. If the rock is good, the rover receives a reward of 10 and the rock becomes bad. If the rock is bad, it receives a penalty of -10. Moving into the terminal area yields a reward of 10. A penalty of -100 is imposed for moving off the grid and sampling in a grid where there is no rock. All other moves have no cost or reward. The *Check* action returns a noisy observation from $O = \{Good, Bad\}$.

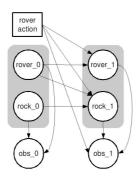


Figure 2.2. Dynamic Bayesian network of the *RockSample* problem. The rover's position is fully observed whereas the rock type is partially observed.

Example 1. A PomdpX document.

```
<?xml version="1.0" encoding="ISO-8859-1"?>
<pomdpx version="0.1" id="rockSample"</pre>
  xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
  xsi:noNamespaceSchemaLocation="pomdpx.xsd"
                             · · · </Description>
     <Description>
                              · · · </Discount>
     <Discount>
                             · · · </Variable>
     <Variable>
     <InitialStateBelief>
                             · · · </InitialStateBelief>
     <StateTransitionFunction> \cdot · · 
                              · · · </ObsFunction>
     <ObsFunction>
                              · · · </RewardFunction>
     <RewardFunction>
</pomdpx>
```

2.2. File Format Structure

A PomdpX document consists of a header and a pomdpx root element which in turn contains child elements, as shown in Example 1 below. The first line of the document is an XML processing instruction which defines that the document adheres to the XML 1.0 standard and that the encoding of the document is ISO-8859-1. Other encodings such as UTF-8 are also possible.

2.2.1. <pomdpx> Tag

Continuing with the example above, the second line contains the root-element of a PomdpX document—the pomdpx element—which has the following attributes:

- version
- id optional name for the specified model.
- xmlns:xsi defines xsi as the XML Schema namespace.
- xsi:noNamespaceSchemaLocation this is where we put our XML Schema

definition, pomdpx.xsd. The PomdpX input should be validated with this schema to ensure well-formedness.

The conventional ordering of the child elements is Description, Discount, Variable and thereafter: InitialStateBelief, StateTransitionFunction, ObsFunction and RewardFunction. However this ordering is not strictly re- quired and one may permute their orderings. Description is an optional, short description of the specified model. The other child elements specify the POMDP tuple $(S, A, O, T, Z, R, \gamma)$ and the initial belief b_0 .

In general these elements should all be present, and each can appear only once. ObsFunction may be omitted if there are no observation variables in the model. Similarly, InitialBeliefState may be omitted if all state variables are fully observed (for example an mdp model). pomdpx's child elements are described in greater detail in the following subsections.

2.2.2. < Description > Tag

This is an optional tag that one may provide to give a brief description of the specified problem. For example:

Example 2. Contents of Description.

```
<Description> RockSample problem for map size 1 x 3.
Rock is at 0, Rover's initial position is at 1.
Exit is at 2.
</Description>
```

2.2.3. <Discount> Tag

This specifies the discount factor y. It has to be a real-valued number, for our RockSample problem, we will be using a discount factor of 0.95 and it is entered as shown:

Example 3. Contents of Discount.

```
<Discount> 0.95 </Discount>
```

2.2.4. <Variable> Tag

The state, action and observation variables which factorize the state S, action A, and observation O spaces are declared within the Variable element. Reward variables, R are also declared here. Example 4 gives the declaration of the variables for the RockSample problem.

Each state variable is declared with the <StateVar> tag. It contains the following attributes:

- vnamePrev identifier for the variable's start state.
- vnameCurr identifier for the variable's end state.
- fullyobs set to true if the variable is fully observed. The default is false. Thus for the variable rock in Example 4, it is partially observed, as implied by the omission of the fullyobs attribute.

Example 4. Variable declaration. Defining S, A, O, and R variables.

```
<Variable>
     <StateVar vnamePrev="rover_0" vnameCurr="rover_1"</pre>
     fullyObs="true">
         <NumValues>3</NumValues>
     </StateVar>
     <StateVar vnamePrev="rock_0" vnameCurr="rock_1>"
         <ValueEnum>good bad</ValueEnum>
     </StateVar>
     <ObsVar vname="obs sensor">
         <ValueEnum>ogood obad</ValueEnum>
     </ObsVar>
     <ActionVar vname="action rover">
         <ValueEnum>amw ame ac as</ValueEnum>
     </ActionVar>
     <RewardVar vname="reward rover" />
</Variable>
```

The possible values that a variable can assume are either specified with regards to the <NumValues> or <ValueEnum> tags. In the former, we would give an inte- ger to indicate the number of values/states for the variable. For instance, in the example, the rover is declared with three possible values. The values are sub- sequently referenced internally using numerals, starting from 0 and prepended with 's'. Hence the states for the rover variable would be s0, s1 and s2. When using <NumValues> it is up to the user to attach semantic meaning to the values, in our example, s0 denotes the left grid, s1 the center and s2 the right terminal grid.

In the latter, the user will have to manually enumerate all the possible values/states the variable may take on. In our example, the *rock* has two possible values, it is either *good* or *bad*.

The observation and action variables are also declared similarly with the <ObsVar> and <actionVar> tags respectively. Both
require the attribute vname which serves as the identifier for the variable. The possible values that an observation or action can
assume can also be specified with either <numValues> or <valueEnum>. If <numValues> is used, 'o' and 'a' would be prepended
to the values of observation and action variables respectively.

In the case of <valueEnum>, the user will once again need to enumerate all possible values/states manually. In our example, for the action_rover variable, we enumerate all the four possible actions. 'amw' is a mnemonic for action move west and 'ac' stands for action check and so on.

Finally, reward variables are declared with the <RewardVar> tags which must contain the vname attribute. The vname serves as an identifier for the reward variable. The <RewardVar> is an empty XML tag and no values are specified. Note that we may use the XML shorthand of <RewardVar vname="..." /> to close an empty tag here.

2.2.5 <InitialStateBelief> Tag This is an optional tag. It specifies the initial belief b0 , and may be omitted if all state variables are fully observed. The PomdpX format allows the initial belief to be specified as multiple multiplicative factors, with each <CondProb> tag specifying one of these factors. From our running RockSample problem, since the initial belief is not conditional on anything, it is factored as $b_0 = P(rover_0|\emptyset)P(rock_0|\emptyset)$. We will need two <CondProb> tags to specify it fully as shown below.

Example 5. Contents of InitialStateBelief.

The <CondProb> tag has no attributes and require the following three children tags:

- var> identifies the factor being specified. Only identifiers declared as vnamePrev of state variables are allowed here (see Section 2.2.4).
- <Parent> the set of conditioning variables. Only identifiers declared as vnamePrev or vnameCurr of state variables are
 allowed here. The previous statement is actually slightly misleading, as PomdpX allows certain combinations of
 vnamePrev and vnameCurr identifiers. Referring to Figure 1.1, we only allow conditioning arrows from x (fully observed
 variables) to y (partially observed variables) and not the other way round. Specifically, a vnameCurr identifier is allowed
 as parent only if the variable is fully observed. In addition, the keyword null may be used to signify the absence of any
 vconditioning variables.
- Parameter> specifies the actual probabilities in the factor and is described in detail in Section 2.3.

The previous example is somewhat cumbersome to declare if we have too many state variables. We could have alternatively specified b_0 as simply the joint belief of all state variables, $P(rover_0, rock_0)$, with a single <CondProb> tag as shown in Example 6.

Example 6. Initial joint belief specification.

2.2.5. <StateTransitionFunction> Tag

This specifies the transition function T, which in general is the multiplicative result of the individual transition functions of each state variable in the model. Each <condProb> tag specifies the transition function for each state variable. For our RockSample problem, with reference to Figure 2.2, the overall transition function is: $P(rover_1, rock_1|action_rover, rover_0, rock_0) = P(rover_1|action_rover, rover_0) \times P(rock_1|action_rover, rover_0, rock_0)$.

This is translated to the following in PomdpX. One can see that it is very similar to its equational counterpart, only it has XML tags wrapped around it. We need to provide two CondProb elements, one each for the variable rover and rock.

Example 7. Contents of StateTransitionFunction.

As described in 2.2.5, the <var> tag identifies the state variable whose transition function is being specified. In this case, only identifiers declared as the vnameCurr attribute of state variables may be allowed here.

The identifiers within the <Parent> tag identify the conditioning variables in the transition function. They may be identifiers which had been declared as either the vnamePrev or vnameCurr attributes of state variables, or identifiers which had been declared as the vname attribute of action variables (see Section 2.2.4). Once again, we point out the caveat that PomdpX only allows certain combinations of vnamePrev and vnameCurr. One may only use vnameCurr identifiers within the Parent> tag if the variable is fully observed. We defer the description of Parameter> tag to Section 2.3 as it is fairly involved.

2.2.6. <ObsFunction> Tag

This specifies the observation function Z, which in general is the multiplicative result of the individual observation functions of each observation variable in the model. Each < CondProb> tag specifies one of these individual observation functions. In the

RockSample problem, the probability of an observation is conditional on taking an action and ending in a new state. Thus its parents are action_rover, rover_1 and rock_1, as given in Example 8.

Example 8. Contents of ObsFunction.

For each CondProb element, the identifier within the <Var> tags identifies the observation variable whose observation function is being specified. The identifiers within the <Parent> tags identifies the conditioning variables in the observation function. Identifiers that appear within the <Var> tags must be identifiers which had been declared as the vname attribute of observation variables. Identifiers that appear within the <Parent> tags must be identifiers which had been declared as the vname curr attribute of state variables, or the vname attribute of action variables (see Section 2.2.4). Parameter specifies the actual probabilities in the function and will be described in Section 2.3.

2.2.7. <RewardFunction> Tag

This specifies the reward function R, which in general is the additive result of the individual reward functions of each reward variable in the model. Each <Func> tag specifies one of these individual reward functions. For our *RockSample* problem, the reward depends on the action taken at the current state, thus its parents are *action_rover*, *rover_0* and *rock_0*. This is shown in Example 9.

Example 9. Contents of RewardFunction.

Similar to the <CondProd> tag, the <Func> tag has no attributes and requires the following three children tags to be defined:

<Var> - this identifies the reward variable whose reward function is being specified. Only identifiers that had been
declared as the vname attribute

of reward variables may appear here.

- <Parent> this identifies the domain of the reward function. All identifiers declared as vnamePrev or vnameCurr attributes of state variables, vname attribute of action variables or vname attribute of observation variables are allowed here
- <Parameter> specifies the actual values in the function and is described in detail in Section 2.3.

2.3. <Parameter> Tag

The <Parameter> tag is a fairly complicated component of PomdpX. It has an optional attribute called type, which has possible values TBL (default) and DD, short for table and decision diagram, respectively. We will describe how to encode the RockSample problem both in TBL and DD.

2.3.1. Table Type (TBL)

When the <Parameter> tag appears as a child of a CondProb element, it must contain <Entry> child tags. Each Entry element specifies the probability entry of a function table. The <Entry> tag itself must consist of the following:

- <Instance> declares all the variables for the probability function. Each variable value must correspond to the
 identifiers that appear between the enclosing <Parent> tag, followed by the identifier that appears between the
 enclosing <Var> tag.
- <ProbTable> specifies the actual numerical values of the probabilities. This is best illustrated by Example 10 below.

 With reference to Figure 2.2, we show the full encoding of the rock 's transition function for the rover 's action of moving West. From the example, the <Var> tag declares that we are defining the transition function for the variable rock (line
- 3). It is conditional on action_rover, rover_0 and rock_0, which appear between the <Parent> tag (line 4). The first <Entry> set (lines 6-9) specifies:

```
P(rock_1 = good|action_rover = amw, rover_0 = s0, rock_0 = good) = 1.0.
```

In this case, when action_rover is amw, and rock_0 is good, rock_1 will be good as well, since a move action will not disturb its state. Conversely, if action_rover is amw, and rock_0 is good it is impossible for rock_1 to be bad as specified by lines 18–29.

Note that order matters here and it might be the source of some subtle bugs if overlooked. As mentioned before, the conditioning variables declared between the <Instance> tag (first three elements in line 7) correspond to the order they appear in the enclosing <Parent> tag, the last element corresponds to the variable being defined. One may arbitarily re-order the conditioning variables as long as they match-up within the <Parent> and <Instance> tags and the last element is always the identifier defined by <Var>>. The convention that we adopt is to declare actions, fully observed variables followed by partially observed variables.

Example 10. Contents of Parameter type="TBL", within CondProb.

```
1. <StateTransitionFunction>
2.
        <CondProb>
            <Var>rock 1</Var>
3.
             <Parent>action_rover rover_0 rock_0
4.
5.
             <Parameter type = "TBL">
7.
                      <Instance>amw s0 good good</Instance>
8.
                      <ProbTable>1.0</ProbTable>
9.
                 </Entry>
10.
                 <Entry>
                      <Instance>amw s1 good good</Instance>
12.
                      <ProbTable>1.0</ProbTable>
                 </Entry>
13.
14.
                 <Entry>
15.
                      <Instance>amw s2 good good</Instance>
                      <ProbTable>1.0</ProbTable>
17.
                 </Entry>
18.
                 <Entry>
19.
                      <Instance>amw s0 good bad</Instance>
20.
                      <ProbTable>0.0</ProbTable>
21.
                 </Entry>
22.
                 <Entry>
                      <Instance>amw s1 good bad</Instance>
23.
24.
                      <ProbTable>0.0</ProbTable>
25.
                 </Entry>
26.
                 <Entry>
27.
                      <Instance>amw s2 good bad</Instance>
                      <ProbTable>0.0</ProbTable>
28.
29.
                 </Entry>
30.
                 <Entry>
                      <Instance>amw s0 bad good</Instance>
31.
32.
                      <ProbTable>0.0</ProbTable>
                 </Entry>
33.
34.
                 <Entry>
35.
                      <Instance>amw s1 bad good</Instance>
                      <ProbTable>0.0</ProbTable>
37.
                 </Entry>
38.
                 <Entry>
39.
                      <Instance>amw s2 bad good</Instance>
40.
                      <ProbTable>0.0</ProbTable>
41.
                 </Entry>
42.
                 <Entry>
                      <Instance>amw s0 bad bad</Instance>
43.
44.
                      <ProbTable>1.0</ProbTable>
45.
                 </Entry>
47.
                      <Instance>amw s1 bad bad</Instance>
                      <ProbTable>1.0</ProbTable>
48.
49.
                 </Entry>
50.
                 <Entry>
                      <Instance>amw s2 bad bad</Instance>
52.
                      <ProbTable>1.0</ProbTable>
                 </Entry>
53.
54.
             </Parameter>
55.
         </CondProb>
56. </StateTransitionFunction>
```

It seems a bit daunting that it takes 56 lines just to declare the transition function for the rock for a simple 1×3 grid. And this only for the *rover*'s action of moving *West*. But XML is verbose by nature and that is the price to pay for interoperability and extensibility. However, PomdpX does provide several convenience features to ease the encoding task.

First and foremost, lines 18–41 are actually redundant since any entry not specified is assumed to be zero. Secondly, we observe that the first three <Entry> sets (lines 6–17) are very similar. They differ only in the state of rover_0 and s0 to s2 are all the possible states of the rover. In such a situation, we may use the wildcard character "*", which means that this is true for all possible values that could appear here. Therefore, lines 6–17 could be replaced by just one <Entry> tag, this is true for lines 42–53 too. Example 10 is re-written more succinctly and shown as Example 11.

Example 11. Usage of wildcard character *.

```
1. <StateTransitionFunction>
2. <CondProb>
3. <Var>rock 1</Var>
4. <Parent>action rover rover 0 rock 0</Parent>
5. <Parameter type = "TBL">
6. <Entry>
```

```
<Instance>amw * good good</Instance>
8.
                      <ProbTable>1.0</ProbTable>
                </Entrv>
9.
10.
                <Entrv>
11.
                     <Instance>amw * bad bad</Instance>
                     <ProbTable>1.0</ProbTable>
                </Entry>
13.
14.
            </Parameter>
15.
        </CondProb>
16. </StateTransitionFunction>
```

Example 12. Usage of character -.

```
1. <StateTransitionFunction>
2.
        <CondProb>
3.
            <Var>rock 1</Var>
            <Parent>action rover rover 0 rock 0</Parent>
5.
            <Parameter type = "TBL">
                <Entry>
                       <Instance>amw * good - </Instance>
7.
                      <ProbTable>1.0 0.0</ProbTable>
8.
9.
                </Entry>
10.
                 <Entry>
                     <Instance>amw * bad - </Instance>
11.
                      <ProbTable>0.0 1.0</ProbTable>
12.
13.
                </Entrv>
14.
            </Parameter>
15.
         </CondProb>
16. </StateTransitionFunction>
```

Although it is not obvious here, one can imagine if the entries were both non-zero, the use of "-" would save us from having to specify another set of <Entry> tag.

With the introduction of the "-" character, the first <Entry> set (lines 6-9) in Example 12 is in effect specifying the following:

 $P(rock\ 1 = good|action\ rover = amw,\ rover\ 0 = *,\ rock\ 0 = good) = 1.0\ and\ P(rock\ 1 = bad|action\ rover = amw,\ rover\ 0 = *,\ rock\ 0 = good) = 0.0.$

There is also an implicit ordering in Example 12. For instance, the usage of "-" for the first <Entry> set (lines 6-9), considers the possible values of rock to be *good* first then *bad*, hence the <ProbTable> entries are listed as (1.0 0.0) rather than (0.0 1.0). This "internal" order is actually taken from the way rock is declared in the <ValueEnum> tag (see Section 2.2.4), in which its possible values were declared to be first *good* then *bad*.

In the quest for further compression, there is a final modification we can make to Example 12. We make the observation that the two <Entry> sets seem some- what complementary differing only in the states of rock_0 and <ProbTable> entries. Thus employing the same trick for Example 12, we can replace the states of "rock_0' with a "-". This gives us Example 13.

Example 13. Usage of double -.

```
1. <StateTransitionFunction>
        <CondProb>
           <Var>rock 1</Var>
3.
            <Parent>action rover rover 0 rock 0</Parent>
4.
5.
            <Parameter type = "TBL">
                      <Instance>amw * - - </Instance>
7.
                      <ProbTable>1.0 0.0 0.0 1.0</probTable>
9.
                </Entry>
            </Parameter>
10.
11.
        </CondProb>
12. </StateTransitionFunction>
```

By using double "-", the single <Entry> set in Example 13 is equivalent to specifying the following:

```
P (rock 1 = good | action rover = amw, rover <math>0 = *, rock \ 0 = good) = 1.0

P (rock 1 = bad | action rover = amw, rover <math>0 = *, rock \ 0 = good) = 0.0

P (rock 1 = good | action rover = amw, rover <math>0 = *, rock \ 0 = bad) = 0.0

and

P (rock 1 = bad | action rover = amw, rover <math>0 = *, rock \ 0 = bad) = 1.0.
```

The <ProbTable> entries in Example 13 are in effect a 2 × 2 identity matrix. Hence our PomdpX format also allows for the

keyword *identity*₂ to be used in lieu of having to enumerate all the ones and zeros (like line 8). Therefore Examples 13 and 14 are functionally equivalent.

Example 14. Usage of keyword identity.

```
1. <StateTransitionFunction>
2.
        <CondProb>
3.
            <Var>rock 1</Var>
4.
            <Parent>action rover rover 0 rock 0</Parent>
5.
            <Parameter type = "TBL">
                <Entry>
                      <Instance>amw * - - </Instance>
7.
8.
                      <ProbTable>identity</ProbTable>
9.
                </Entry>
10.
            </Parameter>
        </CondProb>
12. </StateTransitionFunction>
```

Another recognized keyword which may also be used in the \P robTable> tags is uniform. This is equivalent to the probability 1/n repeated n times, where n is the number of possible values that could appear here. For example, the \P robTable> tag below,

Example 15. Usage of keyword uniform.

gives: $P(rock\ 0 = good | \varnothing) = 0.5$ and $P(rock\ 0 = bad | \varnothing) = 0.5$, which specifies our initial belief that the rock has equal probability of being $good\ or\ bad$.

Besides being a child of the CondProb element, the <Parameter> tag may also appear as a child of the Func element which is used to define the reward function. In this case, the <Entry> tag within the <Parameter> must contain

the following:

- <Instance> declares values of all the variables for the reward function. Each variable value must correspond to the identifiers that appear between the enclosing <Parent> tag.
- <ValueTable> specifies the actual numerical reward.

Example 16 shows a snippet defining the reward function for the rover. In this example, the <Entry> specifies:

```
R_{reward\ rover} (action rover = ame, rover 0 = s1, rock 0 = *) = 10.
```

By now, the wildcard character "*" should be familiar to the user. Its use here denotes the fact that the *rover* will obtain a reward of 10 moving East from s1 (to the terminal state), regardless of whether the *rock* is *good* or *bad*.

Note that the characters "*" and "-" can be used in a similar manner as described in the previous sections. However, the keywords uniform and identity cannot appear between <valueTable> tags, since those keywords only make sense for probabilities and not rewards.

We reiterate here that any probability or value entries of a function table which are not specified within a <Parameter> tag are assumed to be zero. Fur- thermore, a particular probability or value entry can also be specified more than once. The definition that appears last within a <Parameter> tag is the one that will take effect. This is convenient for specifying exceptions to a more general specification. The full compact version of the PomdpX input file for the RockSample problem with <Parameter type="TBL"> is given in Appendix A.

2.3.2. Decision Diagram (DD)

Note that the APPL parser does **not** support decision diagrams currently. However, decision diagrams are officially part of POMDPX, and we plan to support it in APPL in the future.

Decision diagrams are another way of describing the conditional probabilities of the variables. A decision diagram in PomdpX is represented as a rooted, directed, acyclic graph (DAG), which consists of <Node> tags and branches with <Edge> tags. Figure 2.3 shows a generic structure of the DAG used in PomdpX. Similar to TBL, the <Parameter> tag with type = "DD" may appear with the <CondProb> or <Func> tags. But unlike TBL, the syntax for the DD type is exactly the same within both <CondProb> and <Func> tags. Hence the following descriptions apply to DD in both cases.

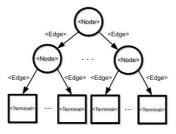


Figure 2.3. Generic structure of a DAG used in PomdpX. Intermediate nodes are circles and terminals are squares.

Example 17 shows a snippet of how the initial belief for the RockSample problem can be coded using DD. The discerning reader can immediately tell that using DD results in a more nested XML structure. This is so since we have to branch on each of the variables declared within the <Var> tag (line 1). However, there are convenience methods provided by PomdpX to alleviate this. We note that the <Parameter type="DD"> tag can have two possible children: namely <DAG> or <SubDAGTemplate>. In Example 17, we are using <DAG> (line 4), whose purpose is to signify that we are explicitly defining the node- edge branching and terminal values. On the other hand, <SubDAGTemplate> allows us to reuse a pre-defined template at certain portions. We will describe <SubDAGTemplate> in detail later.

Within the <DAG> tag is where we will declare the variables as nodes and their possible values as edges. To declare a variable as a node, we use the <Node> tag. It requires an attribute var to indicate which state variable it is being defined for. For example, in line 7 of Example 17, we are defining it for the variable rover_0. The variable rover_0 has three values, s0 to s2, denoting its possible locations. These will be declared using the <Edge> tag which has a mandatory attribute val to indicate which value it is being defined for. These are given in lines 6, 7 and 17.

Example 17. Contents of Parameter type="DD", within CondProb.

```
1. <Var>rover 0 rock 0</Var>
2. <Parent>null</Parent>
з.
    <Parameter type = "DD">
4.
          <Node var = "rover 0">
5.
              <Edge val="s0"><Terminal>0.0</Terminal></Edge>
6.
7.
               <Edge val="s1">
                   <Node var = "rock 0">
8.
                       <Edge val = "good">
10.
                         <Terminal>0.5</Terminal>
11.
                      </Edge>
12.
                      <Edge val = "bad">
13.
                         <Terminal>0.5</Terminal>
                      </Edge>
14.
15.
                  </Node>
             </Edge>
16.
17.
             <Edge val="s2"><Terminal>0.0</Terminal></Edge>
18.
           </Node>
        </DAG>
20. </Parameter>
```

We find it easy to keep in mind that <Node> is for the declaration of variables, hence its attribute is var and <Edge>'s attribute is val since it is declaring for the values. In general, a decision diagram is described by starting from a node and branching to another node and so on, until a terminal state is reached. This is shown in lines 7-16. The order follows the sequence of variables declared within the <Var> tag. In Example 17, the DAG is rooted at rover_0. The <Terminal> tag is used to specify the terminating node of the DAG. It takes a real-valued number as argument. This may be either a conditional probability value or a reward.

One can imagine that with a large number of variables, the levels of <Node>-<Edge> branching will be tremendous. However, one can make use of context- sensitive independence to "short-circuit" this process. In Example 17, since it is not possible for the rover_0 to start at s0, it is not necessary to branch on rock_0 after taking the edge s0. Thus we can straightaway declare a <Terminal> value of 0.0 here (line 6). This applies for value s2 also as shown in line 17. For value s1, since rock_0 has a uniform probability of being good or bad, we declare the <Terminal> values of 0.5 each after taking the edges good and bad respectively (lines 7-16).

Another useful convenience method provided by PomdpX is the XML tag: <SubDAG>. It is an empty XML tag, but it has the following attributes:

- \bullet type this declares the type of DAG being specified. There are four possible types of <code><SubDAG></code>.
 - * deterministic this is a shorthand for <Terminal> value equals 1.0 for the value specified by val, and is used to specify that the DAG

is not noisy. See Example 18.

* persistent - its usage is similar to the keyword identity in that DAGs specified as persistent would not change in

their value. See Example 19.

- * uniform its usage is exactly the same as when used in <ProbTable> (section 2.3.1), it means that the probabilities are equally distributed. See Example 20. In fact, Examples 17 and 20 are equivalent. Notice how the usage of <SubDAG type="uniform"> shortens the node-edge branching significantly.
- * template as the name suggests, a <SubDAG> declared as this type is modular and can be reused anywhere within the <Parameter> declaration. See Example 21.
- var specifies the variable that it is declaring for. It is not valid for the type template.
- val used only in conjunction with type deterministic. It specifies the value the particular variable takes on.
- idref used only with type template. It specifies the template to be used by referencing the template through its identifier. The template

must have been declared with the <SubDAGTemplate>.

Example 18 gives the transition function for the *rover* for action *West*. Lines 9–19, show how one can declare the transition for the *rover* starting at *s0*. Since the movement of the *rover* is deterministic and non-noisy, there would be lots of redundant zero values being declared within the Terminal tags. With SubDAG type="deterministic">,, we could replace lines 9–19 by simply stating the val which is non-zero and the var for which it is defined for. Lines 21–28 illustrate the benefit of using this syntax which is more compact.

In situations where the state of a variable will not change from one instance to another. We may use <subDAG type="persistent"> as shown in Example 19, which describes a snippet of the rock's transition function. With respect to the example, this simply means that the state of rock_1 remains the same regardless of the move West, East and Check actions of the rover. Example 20 shows the usage of <subDAG> of type uniform. Comparing it with Example 17, it is clear that the use of <subDAG> and uniform type result in a more compact representation.

Example 18. Usage of SubDAG type="deterministic".

```
1. <Var> rover 1</Var>
2.
       <Parent>action rover rover 0</Parent>
       <Parameter type = "DD">
3.
4.
           <DAG>
5.
               <Node var = "action rover">
6.
                    <Edge val = "amw">
7.
                        <Node var = "rover 0>
8.
                            <Edge val = "s0">
                                <Node var = "rover 1">
9.
                                    <Edge val = "s0">
10.
11.
                                         <Terminal>0.0</Terminal>
12.
                                     </Edge>
                                     <Edge val = "s1">
13.
14.
                                         <Terminal>0.0</Terminal>
15.
                                     </Edge>
16.
                                     <Edge val = "s2">
17.
                                         <Terminal>1.0</Terminal>
                                     </Edge>
                                 </Node>
19.
                             </Edge>
20.
21.
                             <Edge val = "s1">
22.
                                 <SubDAG type = "deterministic"
23.
                                    var = "rover 1" val = "s0" />
                             </Edge>
24.
                             <Edge val = "s2">
25.
26.
                                 <SubDAG type = "deterministic"
27.
                                         var = "rover 1" val = "s2" />
28.
                         </Node>
29.
30.
                    </Edge>
31. ...
32.
            </Node>
        </DAG>
34. </Parameter>
```

Example 19. Usage of SubDAG type="persistent".

Example 20. Usage of SubDAG type="uniform".

```
1. <Var>rover 0 rock 0</Var>
2. <Parent>null</Parent>
       <Parameter type = "DD">
3.
4.
           <DAG>
                  <Edge val="s0"><Terminal>0.0</Terminal></Edge>
6.
                   <Edge val="s1">
7.
                      <SubDAG type = "uniform" var = "rock 0" />
8.
9.
                   </Edge>
10.
                  <Edge val="s2"><Terminal>0.0</Terminal></Edge>
11.
12.
       </DAG>
13. </Parameter>
```

Another convenience feature provided by PomdpX is the ability to modularize certain definitions for reuse. This is achieved with the <SubDAGTemplate> tag, it requires an attribute id to serve as an identifier for it. Its benefit is illustrated in Figure 2.4, where the three identical parts reuse the same definition provided by <SubDAGTemplate>. Example 21 shows the encoding of the observation function for the rover when it performs the action Check. By declaring the <SubDAG> of type template in line 10, it effectively means we are replacing it with lines 17–32. The full encoding of RockSample problem using DD type is given in Appendix B.

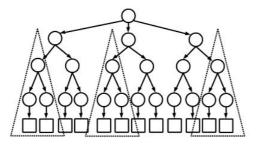


Figure 2.4 – Triangular portions of the decision diagram may use the same template definitions.

Example 21. Usage of SubDAG type="template".

```
1. <Var>obs sensor</Var>
2. <Parent>action rover rover 1 rock 1</Parent>
3. <Parameter type = "DD">
5. <Node var = "action rover">
6. ...
7. <Edge val = "ac">
8. <Node var = "rover 1">
9. <Edge val = "s1">
10. <SubDAG type="template" idref="obs rock"/>
11. </Edge>
12. ...
13. </Node>
14. </Edge>
15. </Node>
16. </DAG>
17. <SubDAGTemplate id = "obs rock">
18. <Node var="rock 1">
19. <Edge val="good">
20. <Node var="obs sensor">
21. <Edge val="ogood"><Terminal>0.8</Terminal></Edge>
22. <Edge val="obad"><Terminal>0.2</Terminal></Edge>
23. </Node>
```

```
24. </Edge>
25. <Edge val="bad">
26. <Node var="obs sensor">
27. <Edge val="ogood"><Terminal>0.2</Terminal></Edge>
28. <Edge val="obad"><Terminal>0.8</Terminal></Edge>
29. </Node>
30. </Edge>
31. </Node>
32. </SubDAGTemplate>
33. </Parameter>
```

3. References

[1] S.C.W. Ong, S.W. Png, D. Hsu, and W.S. Lee. <u>POMDPs for robotic tasks with mixed observability</u>. In *Proc. Robotics: Science and Systems*, 2009.

[2] T. Smith and R. Simmons. Heuristic Search Value Iteration for POMDPs. In Proc. Uncertainty in Artificial Intelligence, 2004.

4. Appendix A

RockSample.pomdpx, type="TBL"

```
Full Specification of RockSample problem in PomdpX.
    <?xml version="1.0" encoding="ISO-8859-1"?>
    <pomdpx version="1.0" id="rockSample"</pre>
       xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
       xsi:noNamespaceSchemaLocation="pomdpx.xsd">
          <Description>RockSample problem for map size 1 x 3.
            Rock is at 0, Rover's initial position is at 1.
            Exit is at 2.
          </Description>
          <Discount>0.95</Discount>
          <Variable>
               <StateVar vnamePrev="rover 0" vnameCurr="rover 1"</pre>
                 fullyObs="true">
                   <NumValues>3</NumValues>
               </StateVar>
               <StateVar vnamePrev="rock 0" vnameCurr="rock 1">
                   <ValueEnum>good bad</ValueEnum>
               <ObsVar vname="obs sensor">
                   <ValueEnum>ogood obad</ValueEnum>
               </ObsVar>
               <ActionVar vname="action rover">
                   <ValueEnum>amw ame ac as</ValueEnum>
               <RewardVar vname="reward rover" />
          </Variable>
          <TnitialStateBelief>
               <CondProb>
                    <Var>rover 0</Var>
                    <Parent>null</Parent>
                    <Parameter type="TBL">
                         <Entry>
                              <Instance> - </Instance>
                              <ProbTable>0.0 1.0 0.0</ProbTable>
                          </Entry>
               </Parameter>
          </CondProb>
           <CondProb>
                <Var>rock 0</Var>
               <Parent>null</Parent>
               <Parameter type="TBL">
                   <Entry>
                       <Instance>-</Instance>
                        <ProbTable>uniform</ProbTable>
                   </Entry>
               </Parameter>
          </CondProb>
       </InitialStateBelief>
       <StateTransitionFunction>
           <CondProb>
               <Var>rover 1</Var>
               <Parent>action rover rover 0</Parent>
               <Parameter type="TBL">
                    <Entry>
```

```
<Instance>amw s0 s2</Instance>
                   <ProbTable>1.0</ProbTable>
               </Entry>
               <Entrv>
                   <Instance>amw s1 s0</Instance>
                   <ProbTable>1.0</ProbTable>
               <Entrv>
                   <Instance>ame s0 s1</Instance>
                   <ProbTable>1.0</ProbTable>
               </Entry>
               <Entry>
                   <Instance>ame s1 s2</Instance>
                   <ProbTable>1.0</ProbTable>
               </Entry>
                   <Instance>ac s0 s0</Instance>
                   <ProbTable>1.0</ProbTable>
               </Entry>
                   <Instance>ac s1 s1</Instance>
                   <ProbTable>1.0</ProbTable>
               </Entry>
               <Entry>
                   <Instance>as s0 s0</Instance>
                   <ProbTable>1.0</ProbTable>
               <Entry>
                   <Instance>as s1 s2</Instance>
                   <ProbTable>1.0</ProbTable>
               <Entry>
                  <Instance>* s2 s2</Instance>
                   <ProbTable>1.0</ProbTable>
               </Entry>
        </Parameter>
    <CondProb>
        <Var>rock 1</Var>
        <Parent>action rover rover 0 rock 0</Parent>
                <Instance>amw * - - </Instance>
                <ProbTable>1.0 0.0 0.0 1.0</ProbTable>
            </Entry>
                <Instance>ame * - - </Instance>
                <ProbTable>identity</ProbTable>
            </Entry>
            <Entry>
                <Instance>ac * - - </Instance>
                <ProbTable>identity</ProbTable>
            </Entrv>
                <Instance>as * - - </Instance>
                <ProbTable>identity</ProbTable>
            <Entry>
                <Tnstance>as s0 * - </Tnstance>
                <ProbTable>0.0 1.0</ProbTable>
            </Entry>
        </Parameter>
    </CondProb>
</StateTransitionFunction>
<ObsFunction>
        <Var>obs sensor</Var>
        <Parent>action rover rover 1 rock 1</Parent>
        <Parameter type="TBL">
            <Entry>
                <Instance>amw * * - </Instance>
                <ProbTable>1.0 0.0</ProbTable>
            </Entry>
                <Instance>ame * * - </Instance>
                <ProbTable>1.0 0.0</ProbTable>
            <Entry>
```

```
<Instance>as * * - </Instance>
                  <ProbTable>1.0 0.0</ProbTable>
              </Entry>
              <Entrv>
                  <Instance>ac s0 - - </Instance>
                  <ProbTable>1.0 0.0 0.0 1.0</probTable>
              </Entry>
              <Entrv>
                  <Instance>ac s1 - - </Instance>
                  <ProbTable>0.8 0.2 0.2 0.8</ProbTable>
               <Entry>
                   <Instance>ac s2 * - </Instance>
                    <ProbTable>1.0 0.0</ProbTable>
               </Entry>
           </Parameter>
       </CondProb>
  </ObsFunction>
  <RewardFunction>
       <Func>
           <Var>reward rover</Var>
           <Parent>action rover rover 0 rock 0</Parent>
           <Parameter type="TBL">
               <Entry>
                    <Instance>ame s1 *</Instance>
                    <ValueTable>10</ValueTable>
               </Entry>
               <Entry>
                    <Instance>amw s0 *</Instance>
                    <ValueTable>-100</ValueTable>
               <Entry>
                    <Instance>as s1 *</Instance>
                    <ValueTable>-100</ValueTable>
               <Entry>
                    <Instance>as s0 good</Instance>
                    <ValueTable>10</ValueTable>
               </Entry>
               <Entry>
                    <Instance>as s0 bad</Instance>
                    <ValueTable>-10</ValueTable>
               </Entry>
           </Parameter>
      </Fine
  </RewardFunction>
</pomdpx>
```

5. Appendix B

RockSample.pomdpx, type="DD"

Full Specification of RockSample problem in PomdpX.

```
<?xml version="1.0" encoding="ISO-8859-1"?>
<pomdpx xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance" version="0.1" id="rockSample"</pre>
\\xsi:noNamespaceSchemaLocation="pomdpx.xsd">
    <Description>RockSample problem for map size 1 x 3.
       Rock is at 0, Rover's initial position is at 1.
       Exit is at 2.
    </Description>
        <StateVar vnamePrev="rover 0" vnameCurr="rover 1" fullvObs="true">
           <NumValues>3</NumValues>
       </StateVar>
        <StateVar vnamePrev="rock 0" vnameCurr="rock 1">
           <ValueEnum>good bad</ValueEnum>
        </StateVar>
        <ObsVar vname="obs sensor">
           <ValueEnum>ogood obad</ValueEnum>
        <ActionVar vname="action rover">
           <ValueEnum>amw ame ac as</ValueEnum>
        </ActionVar>
        <RewardVar vname="reward rover"/>
    </Variable>
```

```
<InitialStateBelief>
       <Var>rover 0 rock 0</Var>
        <Parent>null</Parent>
        <Parameter type="DD">
            <DAG>
                <Node var="rover 0">
                    <Edge val="s0">
                        <Terminal>0.0</Terminal>
                    </Edge>
                    <Edge val="s1">
                        <SubDAG type="uniform" var="rock 0"/>
                    </Edge>
                    <Edge val="s2">
                        <Terminal>0.0</Terminal>
                    </Edge>
                </Node>
            </DAG>
        </Parameter>
   </CondProb>
</InitialStateBelief>
<RewardFunction>
   <Func>
        <Var>reward rover</Var>
        <Parent>action rover rover 0 rock 0</parent>
        <Parameter type="DD">
            <DAG>
                <Node var="action rover">
                    <Edge val="amw">
                        <Node var="rover 0">
                            <Edge val="s0">
                                <Terminal>-100.0</Terminal>
                            </Edge>
                            <Edge val="s1">
                                <Terminal>0.0</Terminal>
                            <Edge val="s2">
                                <Terminal>0.0</Terminal>
                            </Edge>
                        </Node>
                    </Edge>
                    <Edge val="ame">
                        <Node var="rover 0">
                            <Edge val="s0">
                                <Terminal>0.0</Terminal>
                            </Edge>
                            <Edge val="s1">
                                <Terminal>10.0</Terminal>
                            </Edge>
                            <Edge val="s2">
                                <Terminal>0.0</Terminal>
                            </Edge>
                        </Node>
                    </Edge>
                    <Edge val="ac">
                        <Terminal>0.0</Terminal>
                    </Edge>
                    <Edge val="as">
                        <Node var="rover 0">
                            <Edge val="s0">
                                <Node var="rock 0">
                                    <Edge val="good">
                                        <Terminal>10</Terminal>
                                    </Edge>
                                    <Edge val="bad">
                                        <Terminal>-10</Terminal>
                                    </Edge>
                                </Node>
                            </Edge>
                            <Edge val="s1">
                                <Terminal>-100</Terminal>
                            </Edge>
                            <Edge val="s2">
                                <Terminal>-100</Terminal>
                            </Edge>
                        </Node>
                    </Edge>
                </Node>
```

```
</DAG>
        </Parameter>
   </Func>
</RewardFunction>
<ObsFunction>
    <CondProb>
        <Var>obs sensor</Var>
        <Parent>action rover rover 1 rock 1</Parent>
        <Parameter type="DD">
            <DAG>
                <Node var="action rover">
                    <Edge val="amw">
                        <SubDAG type="deterministic" var="obs sensor" val="ogood"/>
                    </Edge>
                    <Edge val="ame">
                        <SubDAG type="deterministic" var="obs sensor" val="ogood"/>
                    </Edge>
                    <Edge val="ac">
                        <Node var="rover 1">
                            <Edge val="s0">
                                <Node var="rock 1">
                                    <Edge val="good">
                                        <SubDAG type="deterministic" var="obs sensor" val="ogood"/>
                                    </Edge>
                                    <Edge val="bad">
                                        <SubDAG type="deterministic" var="obs sensor" val="obad"/>
                                    </Edge>
                                </Node>
                            </Edge>
                            <Edge val="s1">
                                <SubDAG type="template" idref="obs rock"/>
                            </Edge>
                            <Edge val="s2">
                                <SubDAG type="template" idref="obs rock"/>
                    <Edge val="as">
                        <SubDAG type="deterministic" var="obs sensor" val="ogood"/>
                    </Edge>
                </Node>
            <SubDAGTemplate id="obs rock">
                <Node var="rock 1">
                    <Edge val="good">
                        <Node var="obs sensor">
                            <Edge val="ogood">
                                <Terminal>0.8</Terminal>
                            </Edge>
                            <Edge val="obad">
                                <Terminal>0.2</Terminal>
                            </Edge>
                        </Node>
                    </Edge>
                    <Edge val="bad">
                        <Node var="obs sensor">
                            <Edge val="ogood">
                                <Terminal>0.2</Terminal>
                            </Edge>
                            <Edge val="obad">
                                <Terminal>0.8</Terminal>
                            </Edge>
                        </Node>
                    </Edge>
                </Node>
            </SubDAGTemplate>
        </Parameter>
   </CondProb>
</ObsFunction>
<StateTransitionFunction>
    <CondProb>
        <Var>rover 1</Var>
        <Parent>action rover rover 0</Parent>
        <Parameter type="DD">
            <DAG>
                <Node var="action rover">
                    <Edge val="amw">
                        <Node var="rover 0">
```

```
<Edge val="s0">
                                    <SubDAG type="deterministic" var="rover 1" val="s2"/>
                                </Edge>
                                <Edge val="s1">
                                    <SubDAG type="deterministic" var="rover 1" val="s0"/>
                                <Edge val="s2">
                                    <SubDAG type="deterministic" var="rover 1" val="s2"/>
                                </Edge>
                            </Node>
                        </Edge>
                        <Edge val="ame">
                            <Node var="rover 0">
                                <Edge val="s0">
                                    <SubDAG type="deterministic" var="rover 1" val="s1"/>
                                <Edge val="s1">
                                    <SubDAG type="deterministic" var="rover 1" val="s2"/>
                                </Edge>
                                <Edge val="s2">
                                    <SubDAG type="deterministic" var="rover 1" val="s2"/>
                            </Node>
                        </Edge>
                        <Edge val="ac">
                            <SubDAG type="persistent" var="rover 1"/>
                        </Edge>
                        <Edge val="as">
                            <Node var="rover 0">
                                <Edge val="s0">
                                    <SubDAG type="deterministic" var="rover 1" val="s0"/>
                                </Edge>
                                <Edge val="s1">
                                    <SubDAG type="deterministic" var="rover 1" val="s2"/>
                                    <SubDAG type="deterministic" var="rover 1" val="s2"/>
                                </Edge>
                            </Node>
                        </Edge>
                    </Node>
                </DAG>
            </Parameter>
        </CondProb>
        <CondProb>
            <Var>rock 1</Var>
            <Parent>action rover rover 0 rock 0</Parent>
            <Parameter type="DD">
                <DAG>
                    <Node var="action rover">
                        <Edge val="amw">
                            <SubDAG type="persistent" var="rock 1"/>
                        </Edge>
                        <Edge val="ame">
                            <SubDAG type="persistent" var="rock 1"/>
                        </Edge>
                        <Edge val="ac">
                            <SubDAG type="persistent" var="rock 1"/>
                        </Edge>
                        <Edge val="as">
                            <Node var="rover 0">
                                <Edge val="s0">
                                    <SubDAG type="deterministic" var="rock 1" val="bad"/>
                                </Edge>
                                <Edge val="s1">
                                    <SubDAG type="persistent" var="rock 1"/>
                                </Edge>
                                <Edge val="s2">
                                    <SubDAG type="persistent" var="rock 1"/>  
                                </Edge>
                            </Node>
                        </Edge>
                    </Node>
                </DAG>
            </Parameter>
        </CondProb>
</pomdpx>
```

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