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## Principles of AI Planning

## Exercise Sheet 11

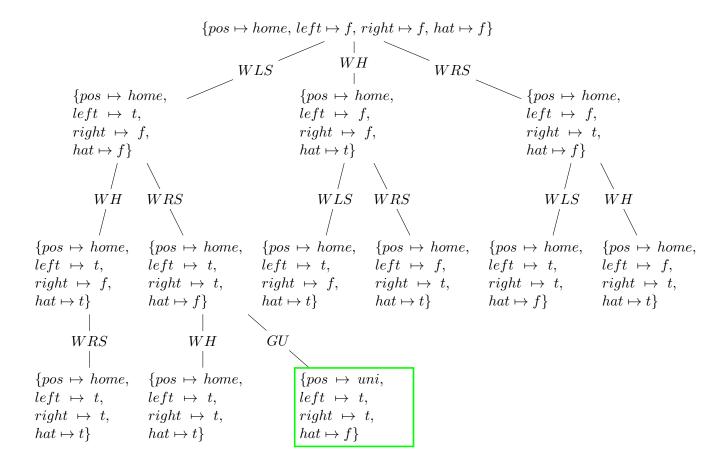
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## Exercise 11.1 - Strong stubborn sets

Consider the  $SAS^+$  planning task  $\Pi$  with variables  $V = \{pos, left, right, hat\}, \mathcal{D}_{pos} = \{home, uni\}$  and  $\mathcal{D}_{left} = \mathcal{D}_{right} = \mathcal{D}_{hat} = \{t, f\}$ . The initial state  $I = \{pos \mapsto home, left \mapsto f, right \mapsto f, hat \mapsto f\}$  and the goal specification is  $\gamma = \{pos \mapsto uni\}$ . There are four operators in O, namely

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wear-left-shoe (WLS) = \langle pos = home \land left = f, left := t \rangle
wear-right-shoe (WRS) = \langle pos = home \land right = f, right := t \rangle
wear-hat (WH) = \langle pos = home \land hat = f, hat := t \rangle
go-to-university (GU) = \langle pos = home \land left = t \land right = t, pos := uni \rangle
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(a) Draw the breadth-first search graph (with duplicate detection) for planning task  $\Pi$  without any form of partial-order reduction.



(b) Draw the breadth-first search graph (with duplicate detection) for planning task  $\Pi$  using strong stubborn set pruning. For each expansion of a node for a state s, specify in detail how  $T_s$  (and thus  $T_{app(s)}$ ) are computed, i.e., explain how the initial disjunctive action landmark is chosen and how operators are iteratively added to  $T_s$  as part of necessary enabling sets or interfering operators, respectively. Break ties in favor of wear-left-shoe over wear-right-shoe.

How many node expansion do you save with strong stubborn sets compared to plain breadth-first search? What about the lengths of the resulting solutions?

The strong stubborn set in  $S_1$  is determined by taking into account the disjunctive action landmark, we know the operator *go-to-university* must be inside this set.

As go-to-university is not applicable in the initial state, then we need to add a neccessary enabling set for this operator, a possible NES is  $\{wear\text{-}left\text{-}shoe\}$  or  $\{wear\text{-}right\text{-}shoe\}$ , we broke ties by adding the operator wear-left-shoe to the strong stubborn set.

As wear-left-shoe is applicable, we must add all operators that interfere, the only operator that interferes with this operator is go-to-university but it is already in the set, therefore:

$$T_{S_1} = \{go\text{-}to\text{-}university, wear\text{-}left\text{-}shoe}\}\$$
  
 $T_{S_1} \cap T_{app(S_1)} = \{wear\text{-}left\text{-}shoe}\}$ 

The strong stubborn set in  $S_2$  is determined using again  $\{go\text{-}to\text{-}university\}$  as DAL. As go-to-university is not applicable in  $S_2$ , then the smallest NES is  $\{wear\text{-}right\text{-}shoe\}$ As wear-right-shoe is applicable, we must add the operator go-to-university as it interferes, but it is already in the set, therefore:

$$T_{S_2} = \{go\text{-}to\text{-}university, wear\text{-}right\text{-}shoe}\}\$$
  
 $T_{S_2} \cap T_{app(S_2)} = \{wear\text{-}right\text{-}shoe}\}$ 

The strong stubborn set in  $S_3$  is determined using again  $\{go\text{-}to\text{-}university\}$  as DAL. As go-to-university is applicable in  $S_3$ , then we need to add all operators that interfere, in this case go-to-university disables  $\{wear\text{-}left\text{-}shoe, wear\text{-}right\text{-}shoe, wear\text{-}hat\}$ 

$$T_{S_3} = \{go\text{-}to\text{-}university, wear\text{-}left\text{-}shoe, wear\text{-}right\text{-}shoe, wear\text{-}hat}\}\$$

$$T_{S_3} \cap T_{app(S_3)} = \{go\text{-}to\text{-}university, wear\text{-}hat}\}$$

In this case the first visited node was a goal state, after that we stopped the search.

By pruning with the strong stubborn set we only visited 4 states, in contrast without pruning we visited 13 states, 9 states more, which represents approximately a 30% of the previous graph.

## Exercise 11.2 - Weak vs. strong stubborn sets

Show that weak stubborn sets admit exponentially more pruning than strong stubborn sets.

Consider the family of planning tasks  $(\Pi_n)_{n\in\mathbb{N}}$ , where  $\Pi_n = \langle V_n, I_n, O_n, \gamma \rangle$  is the planning task with the following components:

- $V_n = \{a, x, y, b_1, ..., b_n\}$  with variable domains  $\mathcal{D}_a = \mathcal{D}_x = \mathcal{D}_y = \{0, 1\}$  and  $\mathcal{D}_{b_i} = \{0, 1, 2\}$  for all  $i \in \{1, ..., n\}$
- $O_n = \{o, o', o_d, \overline{o_d}, o_1, ..., o_n, \overline{o_1}, ..., \overline{o_n}\}$
- $pre(o) = \{a \mapsto 0\}, eff(o) = \{x \mapsto 1\}$
- $pre(o') = \{a \mapsto 0\}, eff(o') = \{y \mapsto 1\}$
- $pre(o_d) = \{a \mapsto 0\}, eff(o_d) = \{a \mapsto 1, b_1 \mapsto 1, ..., b_n \mapsto 1\}$
- $pre(\overline{o_d}) = \{a \mapsto 1\}, eff(o_d) = \{a \mapsto 0, b_1 \mapsto 1, ..., b_n \mapsto 1\}$
- $pre(o_i) = \{b_i \mapsto 1\}, eff(o_i) = \{b_i \mapsto 2\} \text{ for } 1 \le i \le n$
- $pre(\overline{o_i}) = \{b_i \mapsto 2\}, eff(\overline{o_i}) = \{b_i \mapsto 1\} \text{ for } 1 < i < n$
- $I_n = \{a \mapsto 0, x \mapsto 0, y \mapsto 0, b_1 \mapsto 0, ..., b_n \mapsto 0\}$
- $\gamma = \{x \mapsto 1, y \mapsto 1\}$

Let's obtain the strong stubborn set for the given initial state of a planning task  $\Pi_i$ .

The disjunctive action landmark must contain operators o or o' as this operators are the only ones that can change the value of the variables x and y to 1.

We will consider both cases and arrive to the same stubborn set.

Case 1: DAL containing o

As the operator o is applicable we must add all operators that interfere with o, in this case operator  $o_d$  disables o, therefore it must be added to  $T_{I_i}$ .

As operator  $o_d$  is applicable we add all operators, as every operator interferes with  $o_d$ .

Explanation: we can see that  $o_d$  disables operators o, o' (because of a assignment) and  $\overline{o_i}$  for  $1 \leq i \leq j$  (because of  $b_i$  assignment), furthermore it conflicts with  $\overline{o_d}$  as it assigns a different value to a and it conflicts with every  $o_i$  for  $1 \leq i \leq j$  as it has a distinct  $b_i$  assignment.

Case 2: DAL containing o'

As o' is applicable we need to add  $o_d$  as it interferes with o',  $o_d$  is applicable and it interferes with all other operators, therefore the stubborn set is the set of operators

$$T_{I_i} = O_i = \{o, o', o_d, \overline{o_d}, o_1, ..., o_i, \overline{o_1}, ..., \overline{o_i}\}$$

In fact the same behavior will happen for future states as if we haven't reach the goal state we will still have the DAL set including operators o or o'.

We can see that if operator o (or o') is applicable we can follow the same logic presented before and if it is not, then the operator  $\overline{o_d}$  must be included as part of the NES and as it is applicable we need to add all operators  $o_i$ ,  $\overline{o_i}$  and  $o_d$  as they interfere with it. This will result in no order reduction at all.

On the other hand the weak stubborn set for the initial state is the following:

The smallest DAL contains either o or o'.

Case 1: DAL containing o

As the operator o is applicable we search for operators that have conflicting effects with o or that are disabled by o. But we can see no precondition includes x therefore o doesn't disable any operator, and no other operator affects x then there are no conflicting operators.

$$T_{I_j} = \{o\}$$

Case 2: DAL containing o'

As the operator o' doesn't have conflicting effects or disables another operator.

$$T_{I_j} = \{o'\}$$

We can conclude that with the given family of planning task there is no way to make smaller the strong stubborn set as it may always contain all the applicable operators, but in contrast the weak stubborn set can contain only 1 operator in every planning task of this family.

Furthermore solving the planning task using the weak stubborn set will only take two steps, by using operator o followed by o' or viceversa. In contrast as there is in fact no pruning of operators in the strong stubborn set, we will need to explore exponentially more states.