

# Principles of AI Planning

## 15. Strong nondeterministic planning

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## Strong planning



Concepts  
Algorithms  
Summary

In this chapter, we will consider the simplest case of nondeterministic planning by restricting attention to **strong plans**.

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## Concepts



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Strong plans  
Images  
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## Strong plans



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Recall the definition of strong plans:

### Definition (strong plan)

Let  $S$  be the set of states of a planning task  $\Pi$ . Then a **strong plan** for  $\Pi$  is a function  $\pi : S_\pi \rightarrow O$  for some subset  $S_\pi \subseteq S$  such that

- $\pi(s)$  is applicable in  $s$  for all  $s \in S_\pi$ ,
- $S_\pi(s_0) \subseteq S_\pi \cup S_\star$  ( $\pi$  is closed),
- $S_\pi(s') \cap S_\star \neq \emptyset$  for all  $s' \in S_\pi(s_0)$  ( $\pi$  is proper), and
- there is no state  $s' \in S_\pi(s_0)$  such that  $s'$  is reachable from  $s'$  following  $\pi$  in a strictly positive number of steps ( $\pi$  is acyclic).

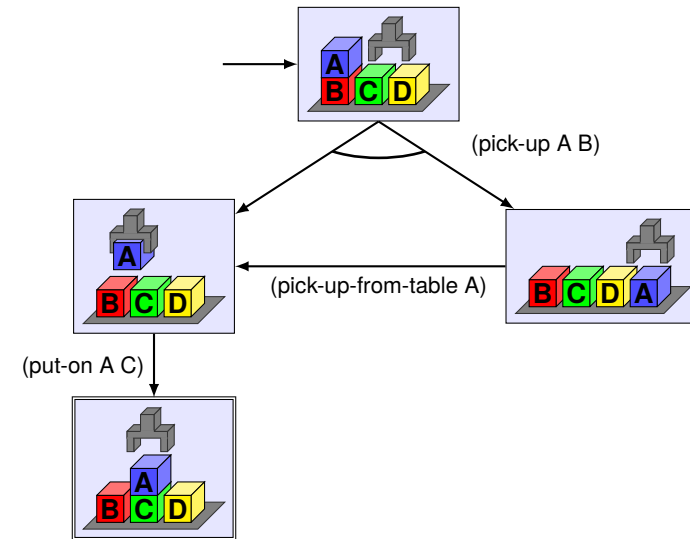
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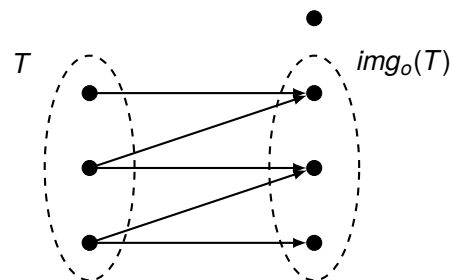
## Execution of a strong plan

- 1 Determine the current state  $s$ .
- 2 If  $s$  is a goal state then terminate.
- 3 Execute action  $\pi(s)$ .
- 4 Repeat from first step.



## Image

The **image** of a set  $T$  of states with respect to an operator  $o$  is the set of those states that can be reached by executing  $o$  in a state in  $T$ .



## Definition (image of a state)

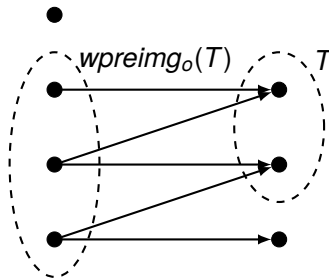
$$img_o(s) = \{s' \in S \mid s \xrightarrow{o} s'\} = app_o(s)$$

## Definition (image of a set of states)

$$img_o(T) = \bigcup_{s \in T} img_o(s)$$

## Weak preimage

The **weak preimage** of a set  $T$  of states with respect to an operator  $o$  is the set of those states from which a state in  $T$  can be reached by executing  $o$ .



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## Definition (weak preimage of a state)

$$wpreimg_o(s') = \{s \in S \mid s \xrightarrow{o} s'\}$$

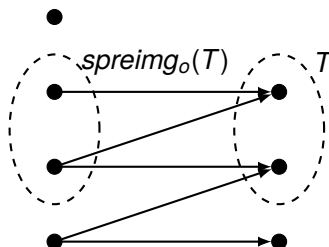
## Definition (weak preimage of a set of states)

$$wpreimg_o(T) = \bigcup_{s \in T} wpreimg_o(s).$$

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## Strong preimage

The **strong preimage** of a set  $T$  of states with respect to an operator  $o$  is the set of those states from which a state in  $T$  is always reached when executing  $o$ .



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## Definition (strong preimage of a set of states)

$$spreimg_o(T) = \{s \in S \mid \exists s' \in T : s \xrightarrow{o} s' \wedge img_o(s) \subseteq T\}$$

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# Algorithms

## Algorithms for strong planning

- 1 **Dynamic programming** (backward)
 

Compute operator/distance/value for a state based on the operators/distances/values of its all successor states.

  - 1 Zero actions needed for goal states.
  - 2 If states with  $i$  actions to goals are known, states with  $\leq i + 1$  actions to goals can be easily identified.

Automatic reuse of plan suffixes already found.
- 2 **Heuristic search** (forward)
 

Strong planning can be viewed as AND/OR graph search.

OR nodes: Choice between operators  
AND nodes: Choice between effects

Heuristic AND/OR search algorithms:  
AO\*, Proof Number Search, ...

## Dynamic programming

### Planning by dynamic programming

If for all successors of state  $s$  with respect to operator  $o$  a plan exists, assign operator  $o$  to  $s$ .

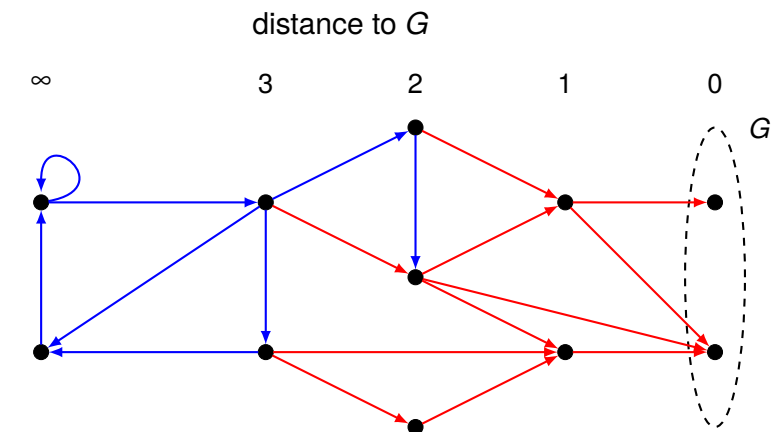
- **Base case  $i = 0$ :** In goal states there is nothing to do.
- **Inductive case  $i \geq 1$ :** If  $\pi(s)$  is still undefined and there is  $o \in O$  such that for all  $s' \in \text{img}_o(s)$ , the state  $s'$  is a goal state or  $\pi(s')$  was assigned in an earlier iteration, then assign  $\pi(s) = o$ .

### Backward distances

If  $s$  is assigned a value on iteration  $i \geq 1$ , then the **backward distance** of  $s$  is  $i$ . The dynamic programming algorithm essentially computes the **backward distances** of states.

## Backward distances

### Example



## Definition (backward distance sets)

Let  $G$  be a set of states and  $O$  a set of operators.  
The **backward distance sets**  $D_i^{bwd}$  for  $G$  and  $O$  consist of those states for which there is a guarantee of reaching a state in  $G$  with at most  $i$  operator applications using operators in  $O$ :

$$D_0^{bwd} := G$$

$$D_i^{bwd} := D_{i-1}^{bwd} \cup \bigcup_{o \in O} \text{preimg}_o(D_{i-1}^{bwd}) \text{ for all } i \geq 1$$

## Definition (backward distance)

Let  $G$  be a set of states and  $O$  a set of operators, and let  $D_0^{bwd}, D_1^{bwd}, \dots$  be the backward distance sets for  $G$  and  $O$ .  
Then the **backward distance** of a state  $s$  for  $G$  and  $O$  is

$$\delta_G^{bwd}(s) = \min\{i \in \mathbb{N} \mid s \in D_i^{bwd}\}$$

(where  $\min \emptyset = \infty$ ).

# Strong plans based on distances

Let  $\Pi = \langle V, I, O, \gamma \rangle$  be a nondeterministic planning task with state set  $S$  and goal states  $S_*$ .

## Extraction of a strong plan from distance sets

- 1 Let  $S' \subseteq S$  be those states having a finite backward distance for  $G = S_*$  and  $O$ .
- 2 Let  $s \in S'$  be a state with distance  $i = \delta_G^{bwd}(s) \geq 1$ .
- 3 Assign to  $\pi(s)$  any operator  $o \in O$  such that  $\text{img}_o(s) \subseteq D_{i-1}^{bwd}$ . Hence  $o$  decreases the backward distance by at least one.

Then  $\pi$  is a strong plan for  $\mathcal{T}$  iff  $I \in S'$ .

**Question:** What is the **worst-case** runtime of the algorithm?

# Summary

- We have considered the special case of nondeterministic planning where
  - planning tasks are **fully observable** and
  - we are interested in **strong plans**.
- We have introduced important concepts also relevant to other variants of nondeterministic planning such as
  - **images** and
  - **weak and strong preimages**.
- We have discussed one basic classes of algorithms:  
**backward induction** by dynamic programming.