

# Artificial Intelligence

## Search-Based Planning

Russell and Norvig - Chapter 11

see also

Planning as Heuristic Search, Bonet and Geffner

<http://www ldc.usb.ve/~hector/reports/hsp-aij.ps>

## AIPS-98 Planning Competition

Round	Planner	Av. Time	Solved	Shortest
Round 1	BLACKBOX	1.49	63	55
	<b>HSP</b>	<b>35.48</b>	<b>82</b>	<b>61</b>
	IPP	7.40	63	49
	STAN	55.41	64	47
Round 2	BLACKBOX	2.46	8	6
	<b>HSP</b>	<b>25.87</b>	<b>9</b>	<b>5</b>
	IPP	17.37	11	8
	STAN	1.33	7	4

## Planning as Search

perform a regular A\* search from the start state  
the only problem is to come up with a good heuristic function

initial state	goal state
At(Home)	At(Home)
Sells(HWS, Drill)	Have(Drill)
Sells(SM, Milk)	Have(Milk)
Sells(SM, Bananas)	Have(Bananas)

### operators

Go(here, there)  
Precond: At(here)  
Effect: At(there) AND NOT At(here)  
Buy(x, store)  
Precond: At(store) and Sells(store,x)  
Effect: Have(x)

## Planning as Search

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- Step 1: Instantiate all Operators (can delete all unnecessary ones)

Go(Home, HWS)	Go(HWS, SM)
Go(Home, SM)	Buy(Milk, SM)
Go(SM, HWS)	Buy(Bananas, SM)
Go(SM, Home)	Buy(Drill, HWS)
Go(HWS, Home)	

### Planning as Search

perform a regular A\* search from the start state  
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- Step 2: Relax the Planning Problem by Removing all Negative Predicates from the Effects List

Go(here, there)  
Precond: At(here)  
Effect: At(there) ~~AND NOT At(here)~~  
Buy(x, store)  
Precond: At(store) and Sells(store,x)  
Effect: Have(x)

Unfortunately, the planning problem remains NP hard.

### Planning as Search

perform a regular A\* search from the start state  
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- Step 3: Simplify the Planning Problem Further by Not Taking Interactions of the Positive Predicates from the Effects List into Account

Consider the original planning problem.  
Calculate the heuristic of state s as  $h_s(\text{goal})$ , with:

$h_s(\text{set of predicates } s') := \max_{\text{predicate } p \text{ in } s'} h_s(s').$  [estimated # of actions to achieve all predicates in s' from s]

$h_s(\text{predicate } p) :=$

0 if p in s  
 $1 + \min_{\text{operator } o \text{ with } p \text{ in add list}} h_s(\text{precondition list of } o)$  otherwise

### Planning as Search

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For our example:

$h_{\text{start}}(\text{goal}) = \max(h_{\text{start}}(\text{At(Home)}),$   
 $h_{\text{start}}(\text{Have(Drill)}),$   
 $h_{\text{start}}(\text{Have(Milk)}),$   
 $h_{\text{start}}(\text{Have(Bananas)}))$   
 $= \max(0, 2, 2, 2) = 2.$

$h_{\text{start}}(\text{At(Home)}) = 0.$

$h_{\text{start}}(\text{Have(Drill)}) = 1 + h_{\text{start}}(\{\text{At(HWS), Sells(HWS, Drill)}\}) = 1+1 = 2.$

$h_{\text{start}}(\{\text{At(HWS), Sells(HWS, Drill)}\}) =$

$\max(h_{\text{start}}(\text{At(HWS)}), h_{\text{start}}(\text{Sells(HWS, Drill)})) = \max(1,0) = 1.$

$h_{\text{start}}(\text{At(HWS)}) = 1 + \min(h_{\text{start}}(\{\text{At(Home)}\}), h_{\text{start}}(\{\text{At(SM)}\})) =$   
 $1 + \min(0, \dots) = 1.$

and so on...

### Planning as Search

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- Step 4: Give up Admissibility to Get the Estimated F-Values Closer to the Correct Ones

Trick 1: When calculating the heuristic values, use

$h_s(\text{set of predicates } s') := \sum_{\text{predicate } p \text{ in } s'} h_s(s').$

Trick 2: During the A\* search, use

$f(\text{state}) = g(\text{state}) + 5 h(\text{state}).$

This results in a mix of Greedy BFS and A\*.

## Planning as Search

perform a regular A\* search from the start state

the only problem is to come up with a good heuristic function

For our example:

$$\begin{aligned}h_{\text{start}}(\text{goal}) &= h_{\text{start}}(\text{At}(\text{Home})) + \\&\quad h_{\text{start}}(\text{Have}(\text{Drill})) + \\&\quad h_{\text{start}}(\text{Have}(\text{Milk})) + \\&\quad h_{\text{start}}(\text{Have}(\text{Bananas})) \\&= 0 + 2 + 2 + 2 = 6.\end{aligned}$$

$$h_{\text{start}}(\text{At}(\text{Home})) = 0.$$

$$h_{\text{start}}(\text{Have}(\text{Drill})) = 1 + h_{\text{start}}(\{\text{At}(\text{HWS}), \text{Sells}(\text{HWS}, \text{Drill})\}) = 1 + 1 = 2.$$

$$\begin{aligned}h_{\text{start}}(\{\text{At}(\text{HWS}), \text{Sells}(\text{HWS}, \text{Drill})\}) &= \\&\quad h_{\text{start}}(\text{At}(\text{HWS})) + h_{\text{start}}(\text{Sells}(\text{HWS}, \text{Drill})) = 1 + 0 = 1.\end{aligned}$$

$$\begin{aligned}h_{\text{start}}(\text{At}(\text{HWS})) &= 1 + \min(h_{\text{start}}(\{\text{At}(\text{Home})\}), h_{\text{start}}(\{\text{At}(\text{SM})\})) = \\&\quad 1 + \min(0, \dots) = 1.\end{aligned}$$

and so on...