

## Planning

Given

- an initial world description
- a description of available actions
- a goal

a plan is a sequence of actions that will achieve the goal.



## Example Planning

If you want a plan to achieve Rob holding the key  $k1$  and being at  $o103$ , you can issue the query

$?carrying(rob, k1, S) \wedge at(rob, o103, S).$

This has an answer

$$S = do(move(rob, mail, o103), \\ do(pickup(rob, k1), \\ do(move(rob, o103, mail), \\ do(move(rob, o109, o103), init))))).$$


## Forward Planner

- Search in the state-space graph, where the nodes represent states and the arcs represent actions.
- Search from initial state to a state that satisfies the goal.
- A complete search strategy (e.g.,  $A^*$  or iterative deepening) is guaranteed to find a solution.
- Branching factor is the number of legal actions. Path length is the number of actions to achieve the goal.
- You usually can't do backward planning in the state space, as the goal doesn't uniquely specify a state.



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## Planning as Resolution

- **Idea:** backward chain on the situation calculus rules or the situation calculus axiomatization of STRIPS.
- A complete search strategy (e.g.,  $A^*$  or iterative deepening) is guaranteed to find a solution.
- When there is a solution to the query with situation  $S = do(A, S_1)$ , action  $A$  is the last action in the plan.
- You can virtually always use a frame axiom so that the search space is largely unconstrained by the goal.



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## Goal-directed searching

- Given a goal, you would like to consider only those actions that actually achieve it.

- Example:

$?carrying(rob, parcel, S) \wedge in(rob, lab2, S).$

the last action needed is irrelevant to the left subgoal.

## STRIPS Planner

- Divide and conquer: to create a plan to achieve a conjunction of goals, create a plan to achieve one goal, and then create a plan to achieve the rest of the goals.
- To achieve a list of goals:
  - choose one of them to achieve.
  - If it is not already achieved
    - ★ choose an action that makes the goal true
    - ★ achieve the preconditions of the action
    - ★ carry out the action
  - achieve the rest of the goals.

## STRIPS Planner Code

*% achieve\_all(Gs, W<sub>1</sub>, W<sub>2</sub>)* is true if *W<sub>2</sub>* is the world resulting  
*%* from achieving every element of the list *Gs* of goals from  
*%* the world *W<sub>1</sub>*.

```

achieve_all([], W0, W0).
achieve_all(Goals, W0, W2) ←
    remove(G, Goals, Rem_Gs) ∧
    achieve(G, W0, W1) ∧
    achieve_all(Rem_Gs, W1, W2).

```



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*% achieve(G, W<sub>0</sub>, W<sub>1</sub>)* is true if *W<sub>1</sub>* is the resulting world  
*%* after achieving goal *G* from the world *W<sub>0</sub>*.

```

achieve(G, W, W) ←
    holds(G, W).
achieve(G, W0, W1) ←
    clause(G, B) ∧
    achieve_all(B, W0, W1).
achieve(G, W0, do(Action, W1)) ←
    achieves(Action, G) ∧
    preconditions(Action, Pre) ∧
    achieve_all(Pre, W0, W1).

```



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## Undoing Achieved Goals

Example: consider trying to achieve

$[carrying(rob, parcel), sitting\_at(rob, lab2)]$

Example: consider trying to achieve

$[sitting\_at(rob, lab2), carrying(rob, parcel)]$

- The STRIPS algorithm, as presented, is unsound.
- Achieving one subgoal may undo already achieved subgoals.

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## Fixing the STRIPS Algorithm

Two ideas to make STRIPS sound:

- Protect subgoals so that, once achieved, until they are needed, they cannot be undone. Let *remove* return different choices.
- Reachieve subgoals that have been undone.
  - Protecting subgoals makes STRIPS incomplete.
  - Reachieving subgoals finds longer plans than necessary.

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## Does protecting always work?

- **Example** Suppose the robot can only carry one item at a time. Consider the goal:

$sitting\_at(rob, lab2) \wedge carrying(rob, parcel)$

- We cannot consider the subgoals in isolation!

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## Regression

- **Idea:** don't solve one subgoal by itself, but keep track of all subgoals that must be achieved.
- Given a set of goals:
  - If they all hold in the initial state, return the empty plan
  - Otherwise, choose an action  $A$  that achieves one of the subgoals. This will be the last action in the plan.
  - Determine what must be true immediately before  $A$  so that all of the goals will be true immediately after. Recursively solve these new goals.

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## Regression as Path Finding

- The nodes are sets of goals. Arcs correspond to actions.
- A node labeled with goal set  $G$  has a neighbor for each action  $A$  that achieves one of the goals in  $G$ .
- The neighbor corresponding to action  $A$  is the node with the goals  $G_A$  that must be true immediately before the action  $A$  so that all of the goals in  $G$  are true immediately after  $A$ .  $G_A$  is the weakest precondition for action  $A$  and goal set  $G$ .
- Search can stop when you have a node where all the goals are true in the initial state.

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## Weakest preconditions

$wp(A, GL, WP)$  is true if  $WP$  is the weakest precondition that must occur immediately before action  $A$  so every element of goal list  $GL$  is true immediately after  $A$ .

For the STRIPS representation (with all predicates primitive):

- $wp(A, GL, WP)$  is *false* if any element of  $GL$  is on delete list of action  $A$ .
- Otherwise  $WP$  is

$$preconds(A) \cup \{G \in GL : G \notin add\_list(A)\}.$$

where  $preconds(A)$  is the list of preconditions of action  $A$  and  $add\_list(A)$  is the add list of action  $A$ .

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## Weakest Precondition Example

The weakest precondition for

$[sitting\_at(rob, lab2), carrying(rob, parcel)]$

to be true after  $move(rob, Pos, lab2)$  is that

$[autonomous(rob),$   
 $adjacent(Pos, lab2),$   
 $sitting\_at(rob, Pos),$   
 $carrying(rob, parcel)]$

is true immediately before the action.

## A Regression Planner

%  $solve(GL, W)$  is true if every element of goal list  $GL$  is true  
 % in world  $W$ .

$solve(GoalSet, init) \leftarrow$   
 $holdsall(GoalSet, init).$   
 $solve(GoalSet, do(Action, W)) \leftarrow$   
 $consistent(GoalSet) \wedge$   
 $choose\_goal(Goal, GoalSet) \wedge$   
 $choose\_action(Action, Goal) \wedge$   
 $wp(Action, GoalSet, NewGoalSet) \wedge$   
 $solve(NewGoalSet, W).$



## Regression Search Space Example

