

## Context: Plan-Space Planning

In **state-space planning**, a program searches through a space of *world states*, seeking to find a path or paths that will take it from its initial state to a goal state.

State-space planning is too inflexible, because:

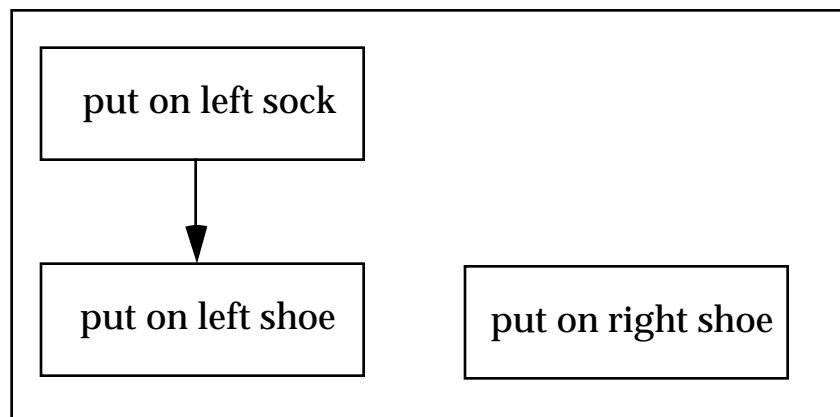
- it creates plans that are total orderings of a set of steps, and
- it assembles these plans in exactly the same order.

# Plan-Space Planning Redux

In **plan-space planning**, a program searches through a space of *plans*, seeking a plan that will take it from its initial state to a goal state.

In this approach, we redefine some of the terms of our search:

- A **plan** is a **set of steps** and a **set of constraints** on the ordering of the steps.
- A **state** is a plan.
- The **goal state** is a plan that achieves all specified goals.
- An **operator** creates a new plan from an old plan.



# Kinds of Operators

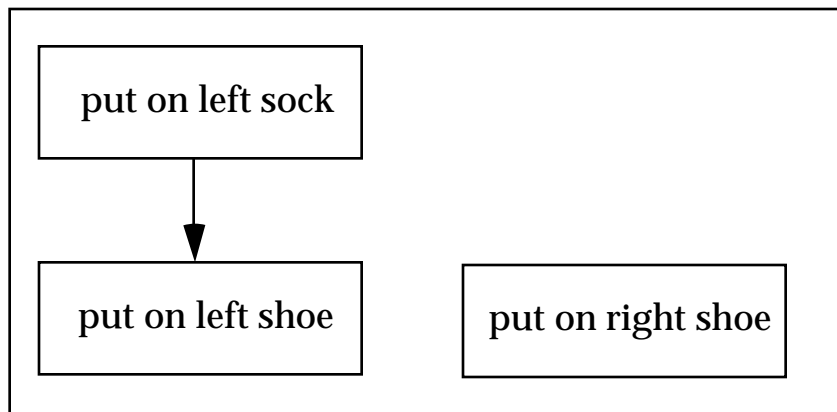
## A refinement operator

- takes as input a partial plan, and
- adds either a step or a constraint to it.

That is, it makes the plan *more specific* by making one or more decisions left open in the partial plan.

## A modification operator

- changes a constraint, or
- removes a step or a constraint, or
- does some combination of the two.



Whereas refinement operators allow the planner to “move forward” toward a goal, modification operators allow the planner to *back up*.

# What is a Plan?

A plan, whether partial or complete, consists of:

- a specification of its precondition state and its postcondition state
- a set of actions, or “steps”,  $S_i$
- a set of orderings on steps,  $\{ (S_i < S_j), \dots \}$

An example of a partial plan:

- **Precondition**

armEmpty and clear( A ) and  
on( A, B ) and on( B, TABLE )

## Postcondition

armEmpty and clear( B ) and  
on( B, A ) and on( A, TABLE )

- $S = \{ S_1, S_2 \}$   
 $S_1 = \text{stack}( B, A )$   
 $S_2 = \text{stack}( A, \text{TABLE} )$
- ORDER =  $\{ (S_2 < S_1), \dots \}$

# How Do We Make Plans?

A plan-space planning algorithm will do something like:

1.  $P := \text{empty-plan}(I, G)$
2. Loop:
  - a. If  $P$  is a solution, return  $P$ .
  - b. Choose  $F := \text{find-flaw}(P)$
  - c. Choose  $M := \text{find-method}(P, F)$
  - d. If there is no such method, return failure.
  - e.  $P := \text{fix-flaw}(P, F, M)$

This algorithm introduces some new concepts...

- An *empty plan* is a plan with no steps and no constraints.

This plan says, “Yeah, I plan to get from A to B,” but does not contain actions to do it.

- A *solution* is any plan that achieves the  $I \rightarrow G$ .

So, Step2a is where we do our goal test in this algorithm.

# Flaws and Methods

1.  $P := \text{empty-plan}(I, G)$
2. Loop:
  - a. If  $P$  is a solution, return  $P$ .
  - b. Choose  $F := \text{find-flaw}(P)$
  - c. Choose  $M := \text{find-method}(P, F)$
  - d. If there is no such method, return failure.
  - e.  $P := \text{fix-flaw}(P, F, M)$

A *flaw* is anything wrong with a plan.

- It might be something that is undone, such as “no action achieves this part of the goal” or “no action achieves this precondition of a step in the plan”.
- However, this algorithm can construct a partial plan that is internally inconsistent. (How?)

In such a case, a flaw can be an inconsistency, such as executing one step might undo a precondition for another step.

A *method* is a way to fix a flaw.

Usually, a flaw is a something undone, and so a method might *add a step or a constraint* to the plan.

# A Demo of Plan-Space Planning

Assume that a robot is given this set of operators:

stack( x, y )

precondition: clear( y ), holding( x )

add: armEmpty, on( x, y )

delete: clear( y ), holding( x )

unstack( x, y )

precondition: on( x, y ), clear( x ), armEmpty

add: holding( x ), clear( y )

delete: on( x, y ), armEmpty

pickup( x )

precondition: clear( x ), on( x, TABLE ), armEmpty

add: holding( x )

delete: on( x, TABLE ), armEmpty

putdown( x )

precondition: holding( x )

add: on( x, TABLE ), armEmpty

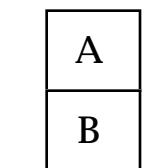
delete: holding( x )

Solve:

Initial state:



Goal state:



demonstration of above



# An Exercise

Assume that a robot is given this set of operators:

stack( x, y )

precondition: clear( y ), holding( x )

add: armEmpty, on( x, y )

delete: clear( y ), holding( x )

unstack( x, y )

precondition: on( x, y ), clear( x ), armEmpty

add: holding( x ), clear( y )

delete: on( x, y ), armEmpty

pickup( x )

precondition: clear( x ), on( x, TABLE ), armEmpty

add: holding( x )

delete: on( x, TABLE ), armEmpty

putdown( x )

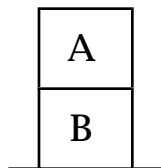
precondition: holding( x )

add: on( x, TABLE ), armEmpty

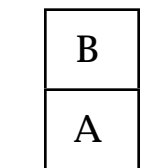
delete: holding( x )

Solve:

Initial state:



Goal state:



**solution to above**

# Another Exercise

stack( x, y )

precondition: clear( y ), holding( x )  
add: armEmpty, on( x, y )  
delete: clear( y ), holding( x )

unstack( x, y )

precondition: on( x, y ), clear( x ), armEmpty  
add: holding( x ), clear( y )  
delete: on( x, y ), armEmpty

pickup( x )

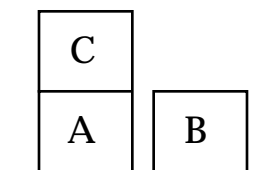
precondition: clear( x ), on( x, TABLE ), armEmpty  
add: holding( x )  
delete: on( x, TABLE ), armEmpty

putdown( x )

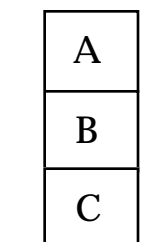
precondition: holding( x )  
add: on( x, TABLE ), armEmpty  
delete: holding( x )

Solve:

Initial state:



Goal state:



**solution to above**

# Flaws and Fixes in a Program

How can a **program** use this approach to make plans?

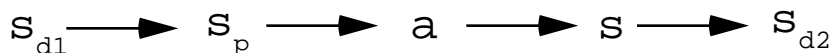
The interesting new ideas here are:

- What is a **flaw** in a plan?
- What is a **method** for fixing a flaw?
- How does the program identify each?

First, a formal definition:

A proposition  $a$  is **necessarily true** before executing step  $s$  in plan  $p$  if both of the following are true:

- There is a step  $s_p$  in  $p$  such that  $s_p$  necessarily comes before  $s$  and  $s_p$  adds  $a$ .
- For every step  $s_d$  in  $p$  that may delete  $a$ , either  $s_d$  necessarily comes before  $s_p$  or  $s_d$  necessarily comes after  $s$ .



What does “necessarily” mean here?

# Using the Modal Truth Criterion

Now, we can define flaws and methods:

- A flaw is any precondition  $a$  of a step  $s$  that is not *necessarily true* before executing  $s$ .
- To fix a flaw, do both of the following:
  - *Make sure that  $a$  is made true before executing  $s$ .*

You can add a new step  $s_p$  and make it necessarily prior to  $s$ .

Or you can choose an  $s_p$  that is already in the plan and add an ordering constraint.

- *Make sure that  $a$  is not clobbered by some  $s_d$ .*

You can change the variable bindings on some  $s_d$  so that it necessarily does not delete  $a$ .

Or you can add an ordering so that  $s_d$  must either come before  $s_p$  or come after  $s$ .

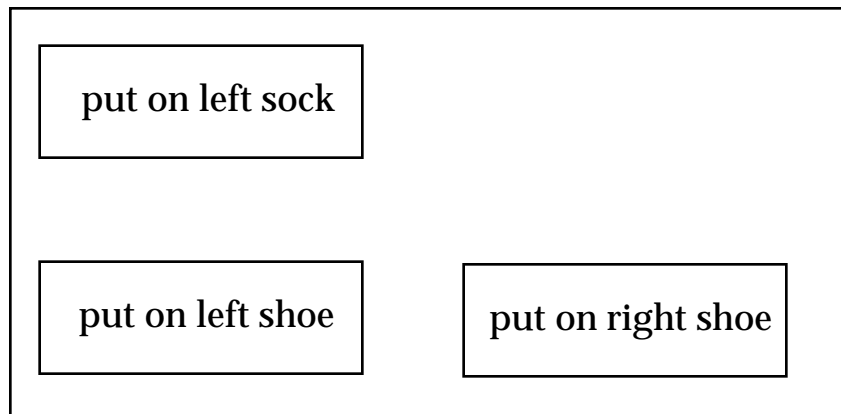
# Applying the MTC

A flaw is any precondition  $a$  of a step  $s$  that is not *necessarily true* before executing  $s$ .

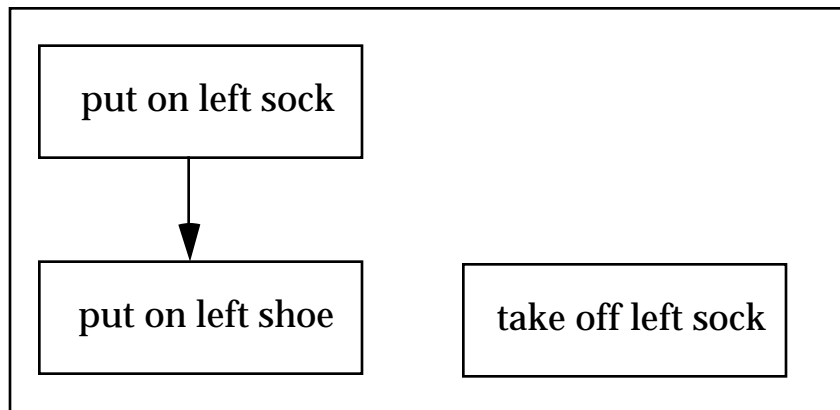
To fix a flaw, do both of the following:

- Make sure that  $a$  is made true before executing  $s$ .
- Make sure that  $a$  is not clobbered by some  $s_d$ .

Example 1:



Example 2:



# Partial-Order Planning

This style of planning is called *partial-order planning* (POP), because it enables a planner to construct plans that are only partially ordered and thus only complete enough to accomplish its goal.

Such a plan leaves the agent that will use it as much flexibility as possible at “execution time”.

The POP algorithm that uses the MTC and causal links is the culmination of a progression of increasingly more sophisticated planning algorithms.

POP satisfies our three key ideas from two sessions ago:

- States and operators are decomposable.
- It can add an action to the plan at any place.
- It decomposes a problem into sub-tasks, solves them separately, and re-assemble the solutions.

Sometimes, though, it comes up short in practice. So it is the subject of continued research!