

Planning

COMP3431 Robot Software Architectures

Planning

A planner finds sequences of actions that will cause transitions from an initial state through intermediate states to a goal state

Actions

- Transitions from one state to the next are achieved by *actions*.
- Must specify how actions work
- Must work out correct sequence of actions to reach goal

Action Models

- Action `action(<parameters>)`
 - PRECOND: <conditions that must be true to apply this actions>
 - EFFECTS: <conditions that become true or false after executing the action>

Action Example

Action Fly(p, from, to)

PRECOND: $\text{Plane}(p) \wedge \text{At}(p, \text{from}) \wedge \text{Airport}(\text{from}) \wedge \text{Airport}(\text{to})$

EFFECT: $\neg\text{At}(p, \text{from}) \wedge \text{At}(p, \text{to})$

- positive and negative literals in effects can be separated into an *add list* and an *delete list*

Example

Init: $\text{Airport}(\text{MEL}) \wedge \text{Airport}(\text{SYD}) \wedge \text{Plane}(\text{P1}) \wedge \text{Plane}(\text{P2}) \wedge \text{Cargo}(\text{C1}) \wedge \text{Cargo}(\text{C2}) \wedge$
 $\text{At}(\text{C1}, \text{SYD}) \wedge \text{At}(\text{C2}, \text{MEL}) \wedge \text{At}(\text{P1}, \text{SYD}) \wedge \text{At}(\text{P2}, \text{MEL})$

Goal: $\text{At}(\text{C1}, \text{MEL}) \wedge \text{At}(\text{C2}, \text{SYD})$

Action Load(c, p, a)

PRECOND: $\text{At}(\text{c}, \text{a}) \wedge \text{At}(\text{p}, \text{a}) \wedge \text{Cargo}(\text{c}) \wedge \text{Plane}(\text{p}) \wedge \text{Airport}(\text{a})$

EFFECT: $\neg \text{At}(\text{c}, \text{a}) \wedge \text{In}(\text{c}, \text{p})$

Action Unload(c, p, a)

PRECOND: $\text{In}(\text{c}, \text{p}) \wedge \text{At}(\text{p}, \text{a}) \wedge \text{Cargo}(\text{c}) \wedge \text{Plane}(\text{p}) \wedge \text{Airport}(\text{a})$

EFFECT: $\text{At}(\text{c}, \text{a}) \wedge \neg \text{In}(\text{c}, \text{p})$

Action Fly(p, from, to)

PRECOND: $\text{At}(\text{p}, \text{from}) \wedge \text{Plane}(\text{p}) \wedge \text{Airport}(\text{from}) \wedge \text{Airport}(\text{to})$

EFFECT: $\neg \text{At}(\text{p}, \text{from}) \wedge \text{At}(\text{p}, \text{to})$

Load(C1, P1, SYD)

Fly(P1, SYD, MEL)

Unload(C1, P1, MEL)

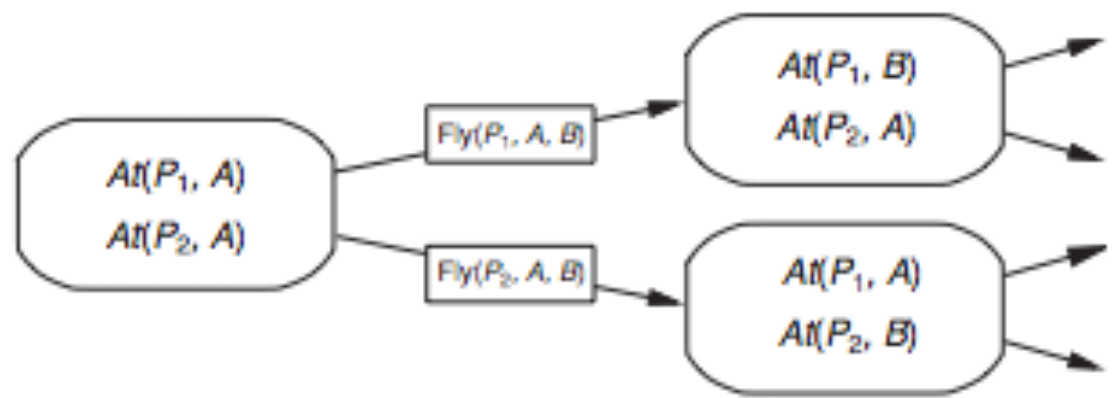
Load(C2, P2, MEL)

Fly(P2, MEL, SYD)

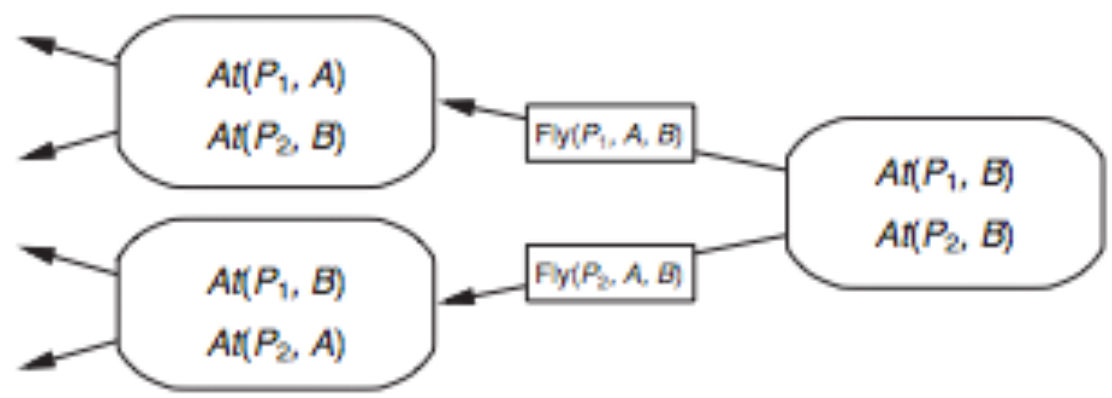
Unload(C2, P2, SYD)

Progression and Regression

- Forward Search



- Backward Search



Backward Regression

$$g' = (g - \text{Add}(a)) \cup \text{Precond}(a)$$

- g' is the regression from goal g over action a
- I.e. going backwards from g , we look for an action, a , that has preconditions and effects that satisfy g'

Planning and TR Programs

Action :-

goal → do_nothing

precond → action

.....

start → action

- TR Programs list actions from a plan, keeping preconditions
- Each rule below should be the regression of the rule above

Sussman's Anomaly

- Goal: $\text{On}(A, B) \wedge \text{On}(B, C)$

- Try achieving $\text{On}(A, B)$ first

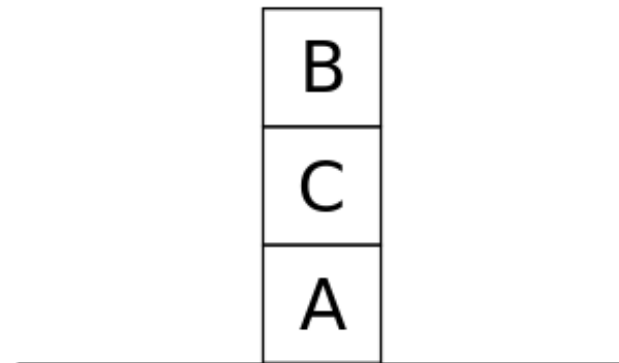
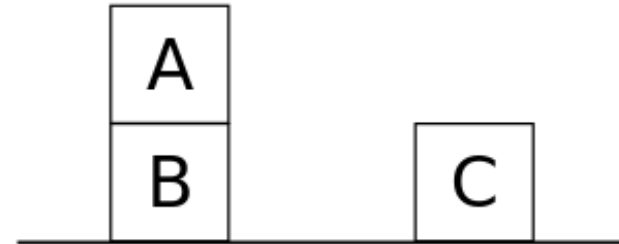
[$\text{move}(c, a, \text{floor})$, $\text{move}(a, \text{floor}, b)$,
 $\text{move}(a, b, \text{floor})$, $\text{move}(b, \text{floor}, c)$]

- Trying $\text{On}(B, C)$ first

[$\text{move}(b, \text{floor}, c)$, **$\text{move}(b, c, \text{floor})$** ,
 $\text{move}(c, a, \text{floor})$, $\text{move}(a, \text{floor}, b)$]

- Should be:

[$\text{move}(c, a, \text{floor})$, $\text{move}(b, \text{floor}, c)$, $\text{move}(a, \text{floor}, b)$]



WARPLAN

Warren, D. H. D. (1974). *Warplan: A system for generating plans*.
Memo No. 76, Department of Computational Logic, University of Edinburgh.

- WARPLAN tries to interleave actions by protecting goals.
 - Achieve $on(A,B)$: $[move(c,a,floor), move(a,floor,b)]$
 - Protect $on(A,B)$
 - Now try $on(B,C)$ by appending actions to end of plan
 - If it tries to undo a protected goal, move backwards through plan and try to slot new plan in.

Warplan

- [move(c,a,floor), move(a,floor,b), **move(a,b,floor)**, ..]
- [move(c,a,floor), .., move(a,floor,b)]

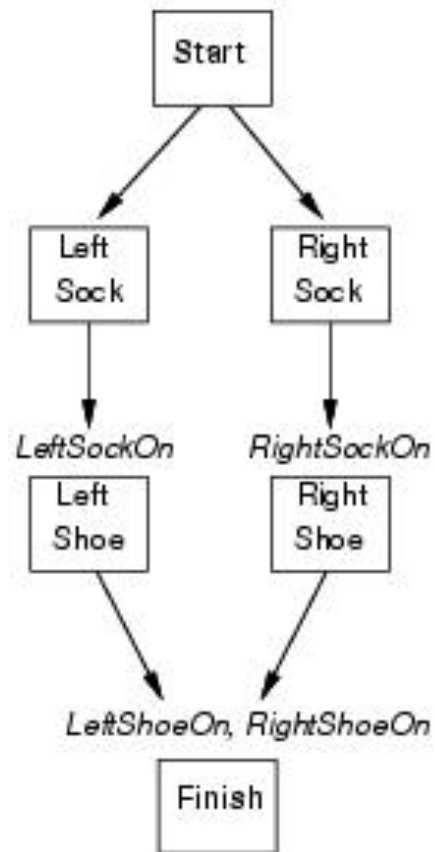
Try inserting plan for on(B,C) here



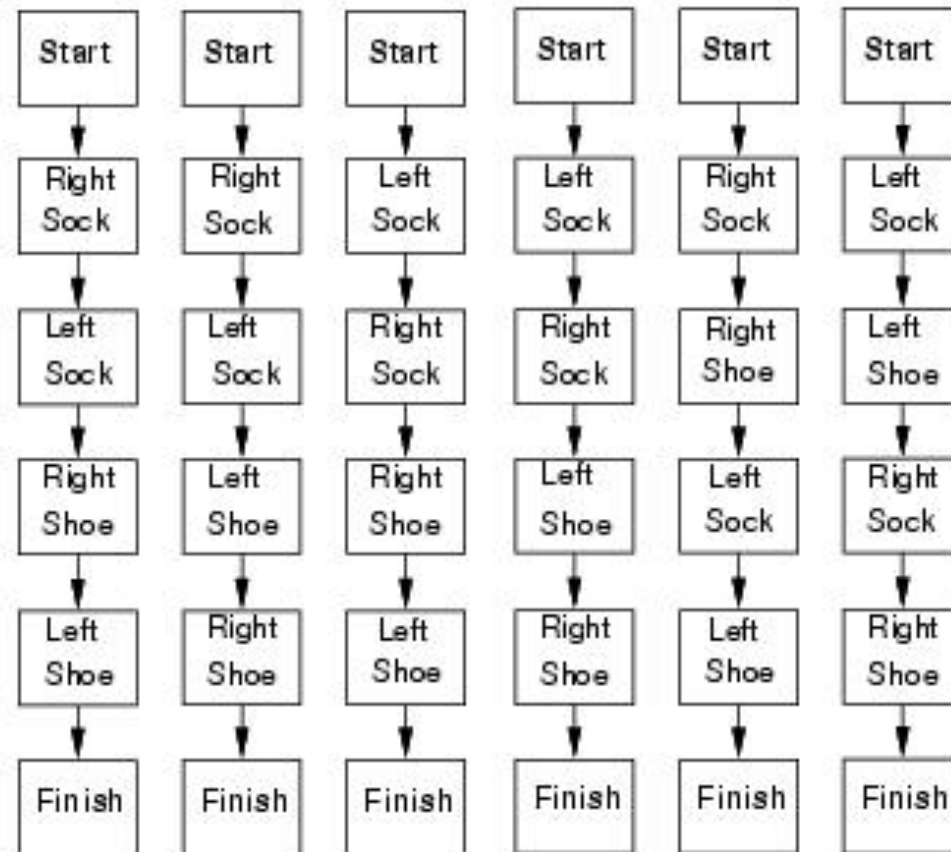
- check that goals before and after are preserved

Partially Ordered Plans

Partial Order Plan:



Total Order Plans:



Partial-Order Planning

Init: $\text{Tire}(\text{Flat}) \wedge \text{Tire}(\text{Spare}) \wedge \text{At}(\text{Flat}, \text{Axle}) \wedge \text{At}(\text{Spare}, \text{Boot})$

Goal: $\text{At}(\text{Spare}, \text{Axle})$

ActionRemove(obj, loc)

PRECOND: $\text{At}(\text{obj}, \text{loc})$

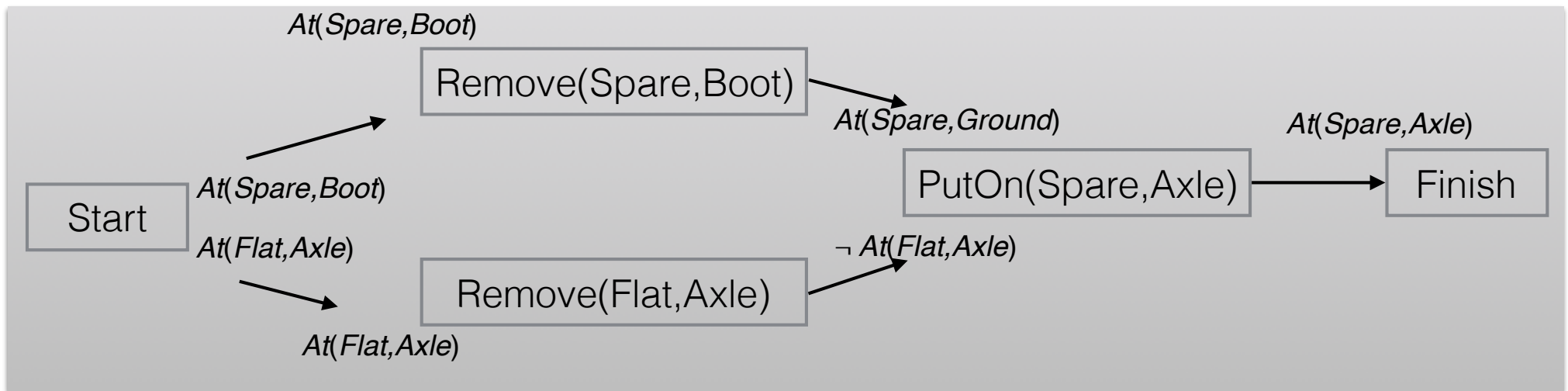
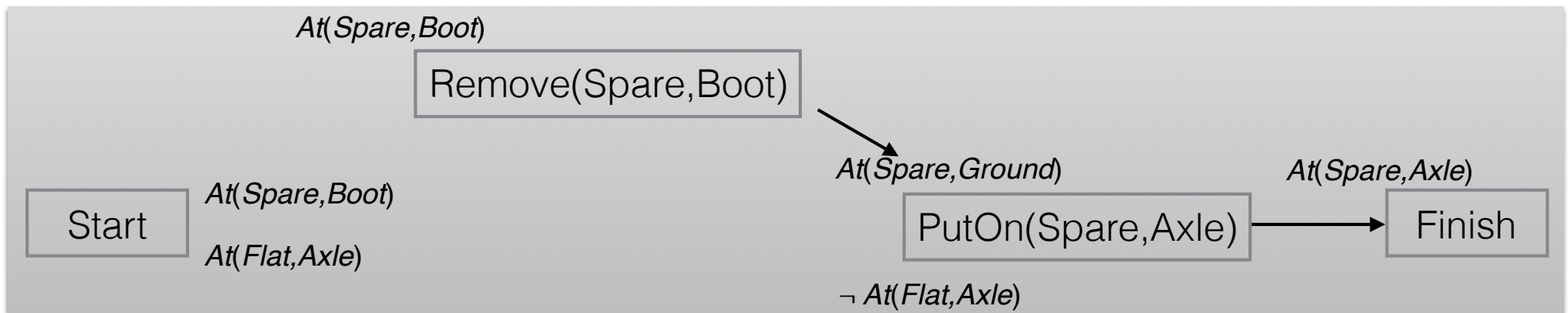
EFFECT: $\neg \text{At}(\text{obj}, \text{loc}) \wedge \text{At}(\text{obj}, \text{Ground})$

ActionPutOn(t, Axle)

PRECOND: $\text{Tire}(t) \wedge \text{At}(t, \text{Ground}) \wedge \neg \text{At}(\text{Flat}, \text{Axle})$

EFFECT: $\neg \text{At}(t, \text{Ground}) \wedge \text{At}(t, \text{Axle})$

Partial-Order Planning



Forward Planning

- Forward planners are now among the best.
- Use heuristics to estimate costs
- Possible to use heuristic search, like A^* , to reduce branching factor.

Planning graphs

- Used to achieve better heuristic estimates.
 - A solution can also directly extracted using GRAPHPLAN.
- Consists of a sequence of levels that correspond to time steps in the plan.
 - Level 0 is the initial state.
 - Each level consists of a set of literals and a set of actions.
 - Literals = all those that could be true at that time step, depending upon the actions executed at the preceding time step.
 - Actions = all those actions that could have their preconditions satisfied at that time step, depending on which of the literals actually hold.

Planning graphs

- Records only a restricted subset of possible negative interactions among actions
- They work only for propositional problems.

Example

Init: Have (Cake)

Goal: Have(Cake) \wedge Eaten(Cake)

Action: Eat (Cake)

PRECOND: Have(Cake)

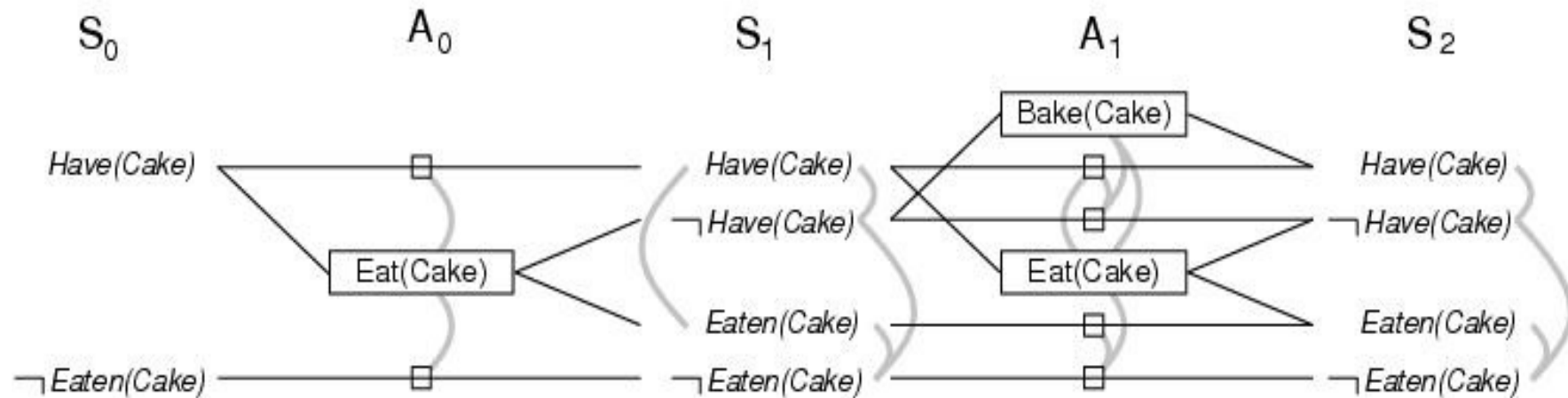
EFFECT: \neg Have(Cake) \wedge Eaten(Cake)

Action: Bake (Cake)

PRECOND: \neg Have(Cake)

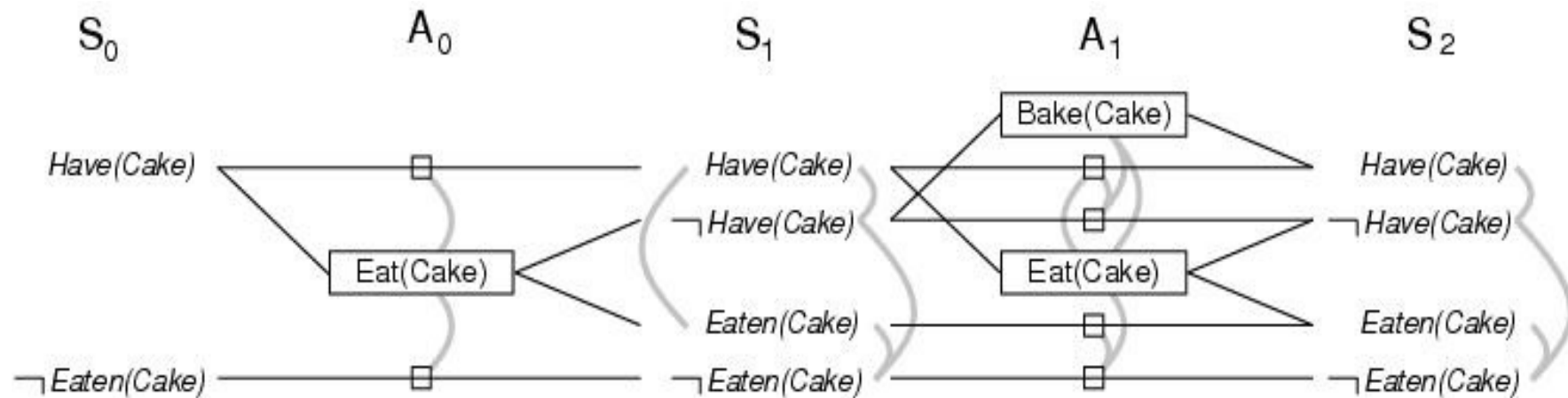
EFFECT: Have(Cake)

Cake example



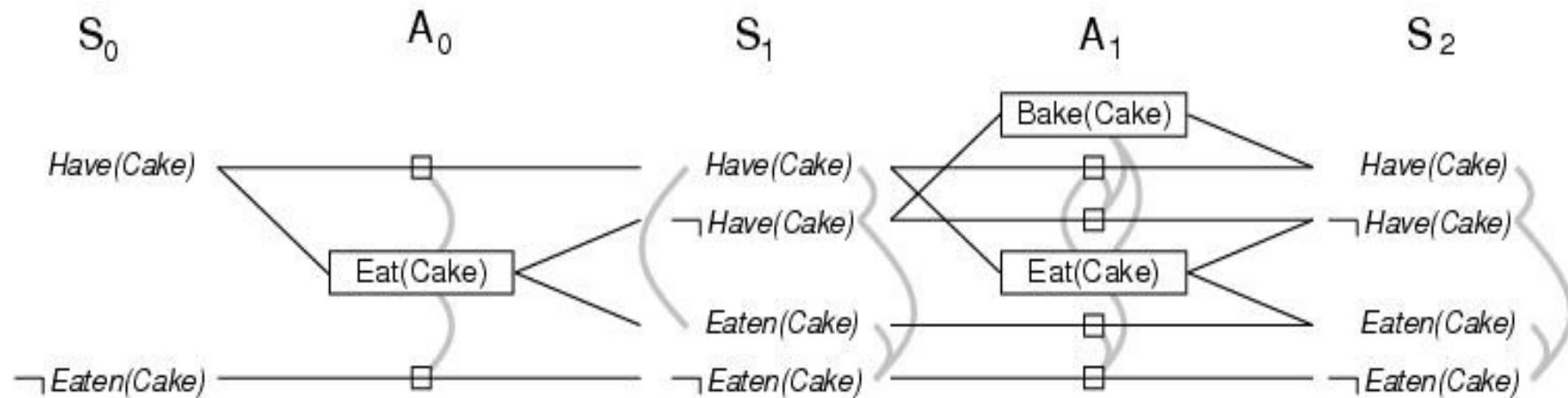
- Start at level S_0 and determine action level A_0 and next level S_1 .
 - $A_0 \gg$ all actions whose preconditions are satisfied in the previous level.
 - Connect precond and effect of actions $S_0 \rightarrow S_1$
 - Inaction is represented by persistence actions.
- Level A_0 contains the actions that could occur
 - Conflicts between actions are represented by mutex links

Cake example



- Level S_1 contains all literals that could result from picking any subset of actions in A_0
 - Conflicts between literals that can not occur together (as a consequence of the selection action) are represented by mutex links.
 - S_1 defines multiple states and the mutex links are the constraints that define this set of states.
- Continue until two consecutive levels are identical: leveled off
 - Or contain the same amount of literals (explanation follows later)

Cake example



- A mutex relation holds between **two actions** when:
 - Inconsistent effects: one action negates the effect of another.
 - Interference: one of the effects of one action is the negation of a precondition of the other.
 - Competing needs: one of the preconditions of one action is mutually exclusive with the precondition of the other.
- A mutex relation holds between **two literals** when (inconsistent support):
 - If one is the negation of the other OR
 - if each possible action pair that could achieve the literals is mutex.

PG and heuristic estimation

- PG's provide information about the problem
 - A literal that does not appear in the final level of the graph cannot be achieved by any plan.
 - Useful for backward search (cost = inf).
 - Level of appearance can be used as cost estimate of achieving any goal
literals = level cost.
 - Small problem: several actions can occur
 - Restrict to one action using serial PG (add mutex links between every pair of actions, except persistence actions).
 - Cost of a conjunction of goals? Max-level, sum-level and set-level heuristics.
- PG is a relaxed problem.

The GRAPHPLAN Algorithm

How to extract a solution directly from the PG

```
function GRAPHPLAN(problem) return solution or failure
  graph ← INITIAL-PLANNING-GRAPH(problem)
  goals ← GOALS[problem]
  loop
    if goals all non-mutex in last level of graph then
      solution ← EXTRACT-SOLUTION(graph, goals, LENGTH(graph))
      if solution ≠ failure then return solution
      else if NO-SOLUTION-POSSIBLE(graph) then return failure
    graph ← EXPAND-GRAPH(graph, problem)
```


Example: Spare tire problem

Init($\text{At}(\text{Flat}, \text{Axle}) \wedge \text{At}(\text{Spare}, \text{Trunk})$)

Goal($\text{At}(\text{Spare}, \text{Axle})$)

Action($\text{Remove}(\text{Spare}, \text{Trunk})$)

PRECOND: $\text{At}(\text{Spare}, \text{Trunk})$

EFFECT: $\neg \text{At}(\text{Spare}, \text{Trunk}) \wedge \text{At}(\text{Spare}, \text{Ground})$)

Action($\text{Remove}(\text{Flat}, \text{Axle})$)

PRECOND: $\text{At}(\text{Flat}, \text{Axle})$

EFFECT: $\neg \text{At}(\text{Flat}, \text{Axle}) \wedge \text{At}(\text{Flat}, \text{Ground})$)

Action($\text{PutOn}(\text{Spare}, \text{Axle})$)

PRECOND: $\text{At}(\text{Spare}, \text{Ground}) \wedge \neg \text{At}(\text{Flat}, \text{Axle})$

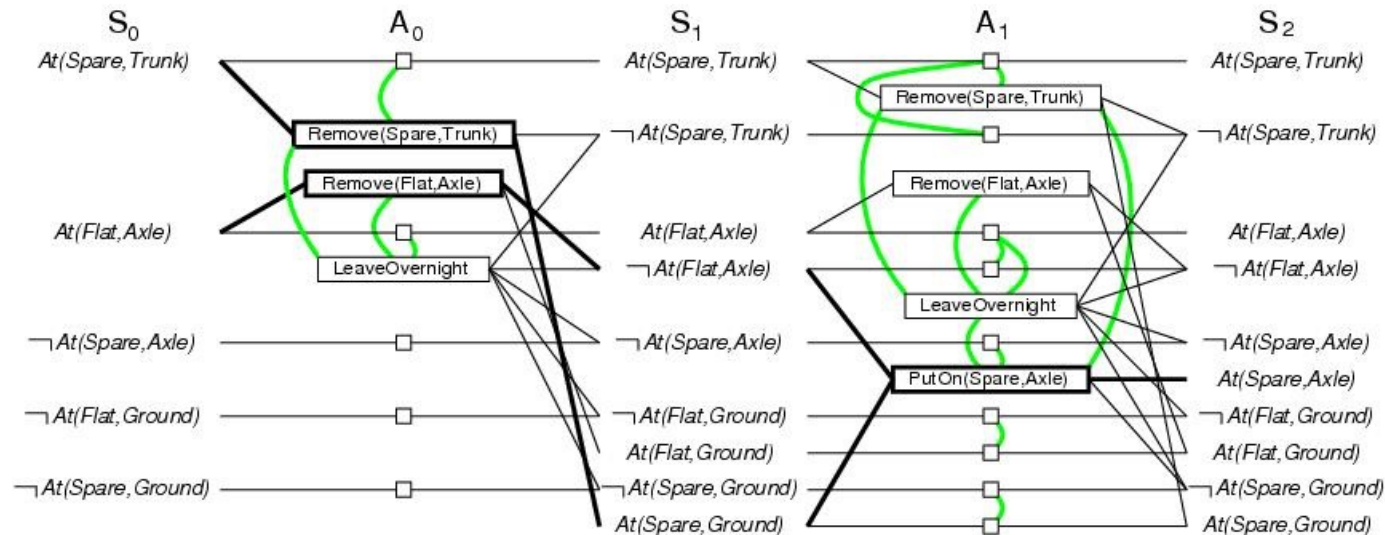
EFFECT: $\text{At}(\text{Spare}, \text{Axle}) \wedge \neg \text{At}(\text{Spare}, \text{Ground})$)

Action(LeaveOvernight)

PRECOND:

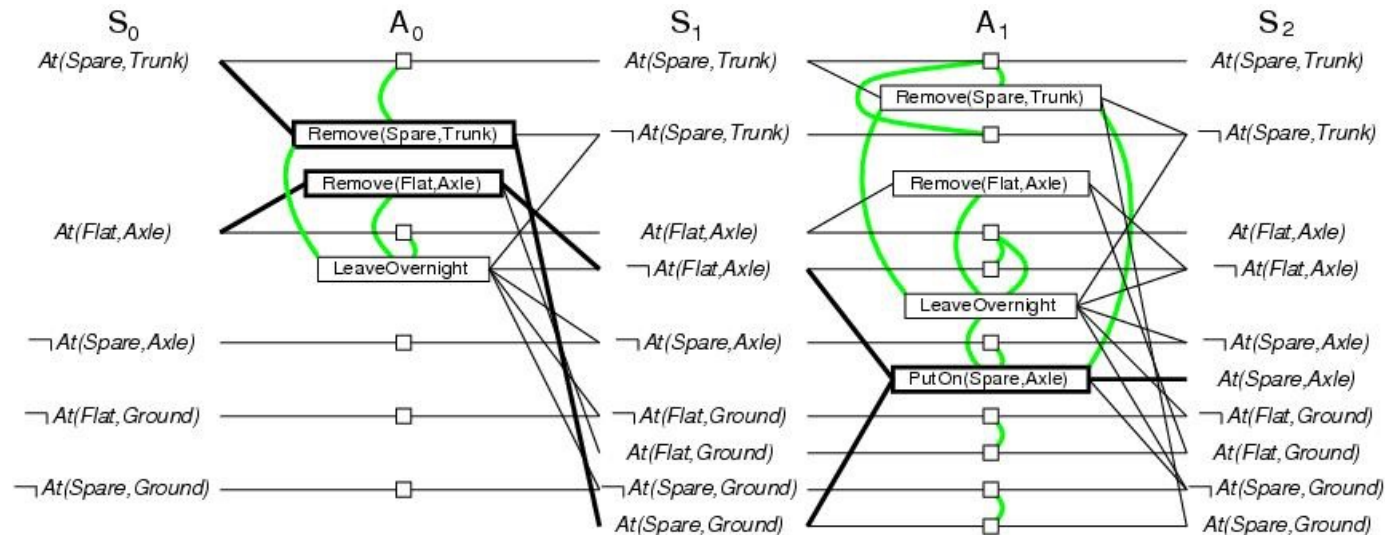
EFFECT: $\neg \text{At}(\text{Spare}, \text{Ground}) \wedge \neg \text{At}(\text{Spare}, \text{Axle}) \wedge \neg \text{At}(\text{Spare}, \text{trunk}) \wedge \neg \text{At}(\text{Flat}, \text{Ground}) \wedge \neg \text{At}(\text{Flat}, \text{Axle})$)

GRAPHPLAN example



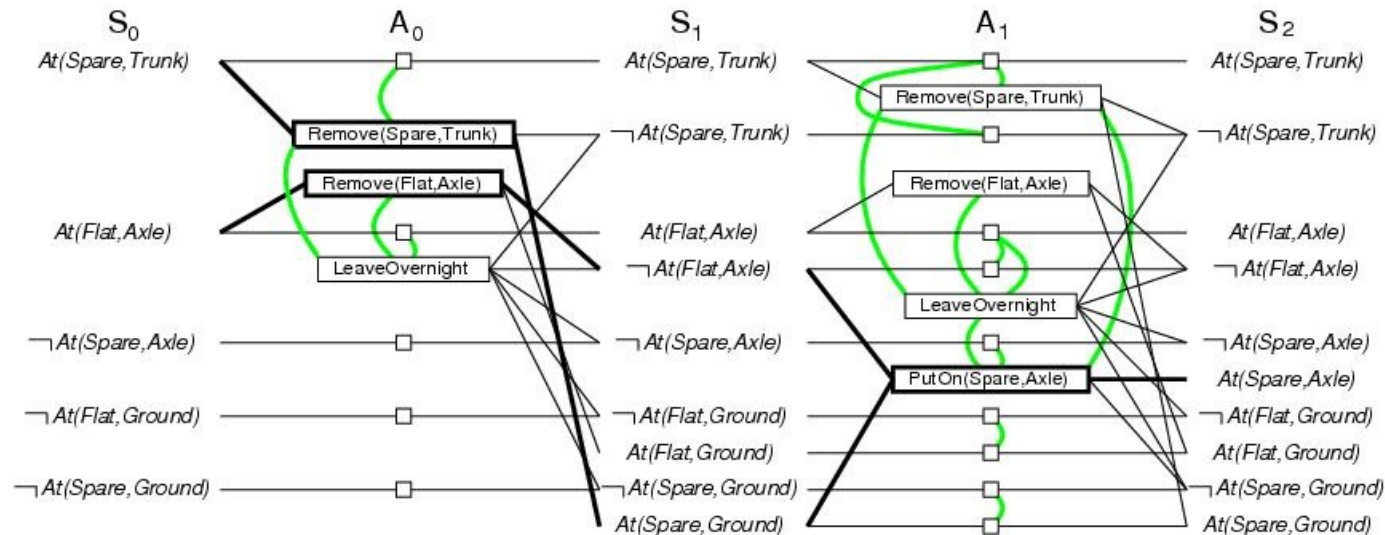
- Initially the plan consist of literals from the initial state and literals from the closed world assumption (S_0).
- Add actions whose preconditions are satisfied by EXPAND-GRAPH (A_0)
- Also add persistence actions and mutex relations.
- Add the effects at level S_1
- Repeat until goal is in level S_i

GRAPHPLAN example



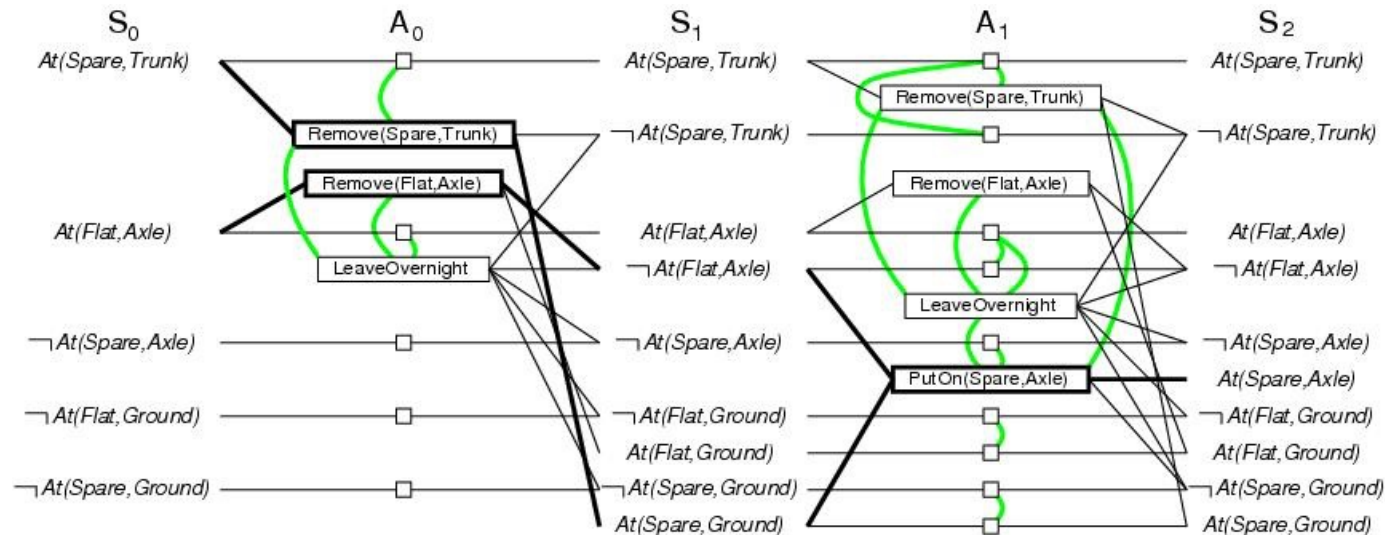
- EXPAND-GRAPH also looks for mutex relations
 - Inconsistent effects
 - E.g. $Remove(Spare, Trunk)$ and $LeaveOvernight$ due to $At(Spare, Ground)$ and **not** $At(Spare, Ground)$
 - Interference
 - E.g. $Remove(Flat, Axle)$ and $LeaveOvernight$ $At(Flat, Axle)$ as PRECOND and **not** $At(Flat, Axle)$ as EFFECT
 - Competing needs
 - E.g. $PutOn(Spare, Axle)$ and $Remove(Flat, Axle)$ due to $At(Flat, Axle)$ and **not** $At(Flat, Axle)$
 - Inconsistent support
 - E.g. in S_2 , $At(Spare, Axle)$ and $At(Flat, Axle)$

GRAPHPLAN example



- In S_2 , the goal literals exist and are not mutex with any other
 - Solution might exist and EXTRACT-SOLUTION will try to find it
- EXTRACT-SOLUTION can use Boolean CSP to solve the problem or a search process:
 - Initial state = last level of PG and goal goals of planning problem
 - Actions = select any set of non-conflicting actions that cover the goals in the state
 - Goal = reach level S_0 such that all goals are satisfied
 - Cost = 1 for each action.

GRAPHPLAN example



- Termination? YES
- PG are monotonically increasing or decreasing:
 - Literals increase monotonically
 - Actions increase monotonically
 - Mutexes decrease monotonically
- Because of these properties and because there is a finite number of actions and literals, every PG will eventually level off !

Extracting the Plan

- Heuristic forward search planners, like Lama, use A^* to find path from start to goal
 - Cost is based on level in graph
- Answer Set Programming is a very efficient type of constraint solving that is fast but only works on propositional representations