#### PLANNING GRAPHS

#### Planning Graphs

- Planning graphs are an efficient way to create a representation of a planning problem that can be used to
  - Achieve better heuristic estimates
  - Directly construct plans
- Planning graphs only work for propositional problems.

#### Planning Graphs

- Planning graphs consists of a seq 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 that represent what might be possible at that step in the plan
  - Might be is the key to efficiency
  - Records only a restricted subset of possible negative interactions among actions.

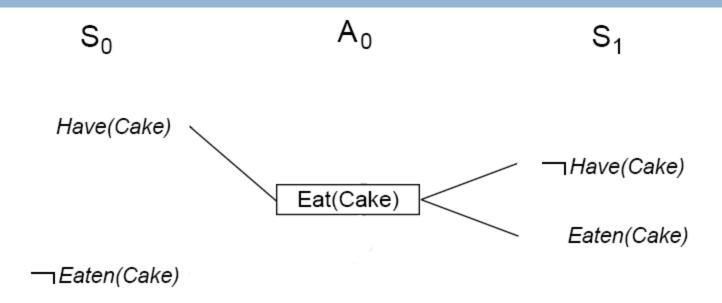
# Planning Graphs

- □ Each level consists of
- Literals = all those that could be true at that time step, depending upon the actions executed at preceding time steps.
- Actions = all those actions that could have their preconditions satisfied at that time step, depending on which of the literals actually hold.

```
Init(Have(Cake))
Goal(Have(Cake) ∧ Eaten(Cake))
Action(Eat(Cake),
 PRECOND: Have(Cake)
 EFFECT: ¬Have(Cake) ∧ Eaten(Cake))
Action(Bake(Cake),
 PRECOND: ¬ Have(Cake)
 EFFECT: Have(Cake))
```

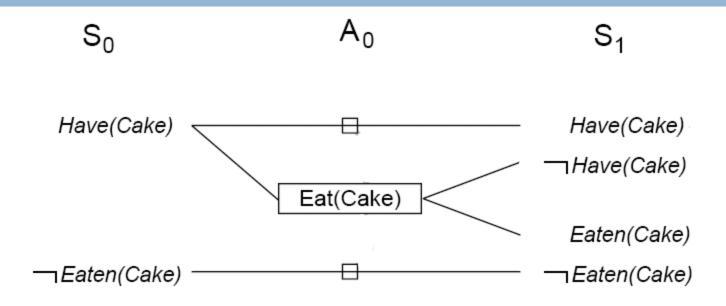
 $S_0$   $A_0$   $S_1$ Have(Cake)  $\neg$ Eaten(Cake)

Create level 0 from initial problem state.

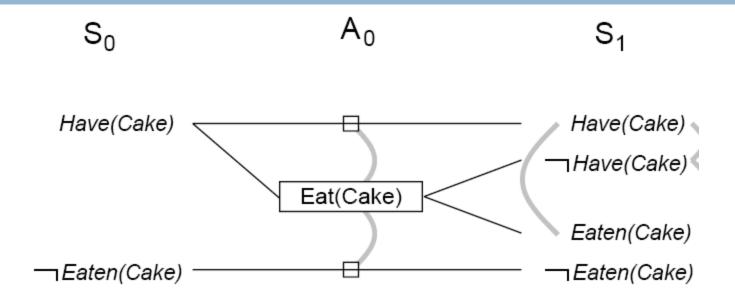


Add all applicable actions.

Add all effects to the next state.



Add *persistence actions* (inaction = no-ops) to map all literals in state  $S_i$  to state  $S_{i+1}$ .

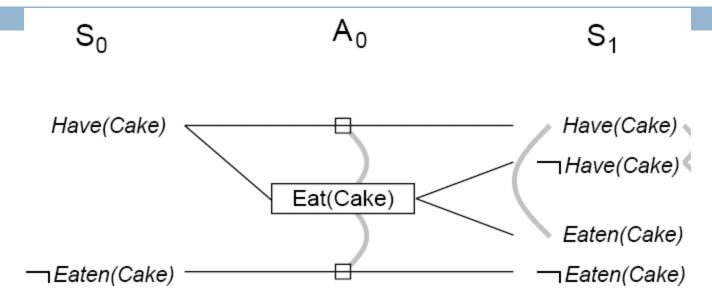


Identify *mutual exclusions* between actions and literals based on potential conflicts.

#### Mutual exclusion

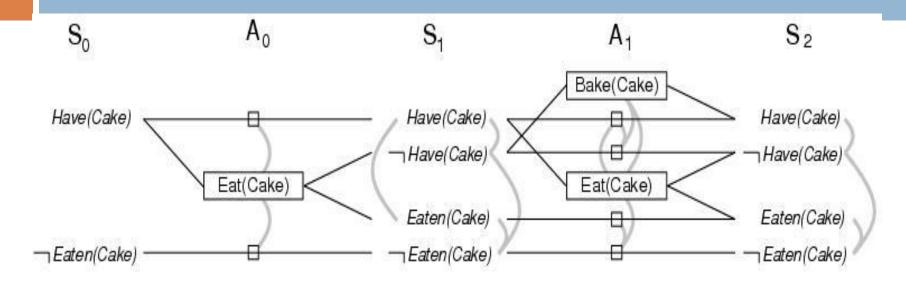
- A mutex relation holds between two actions when:
  - Inconsistent effects: one action negates the effect of another.
  - Interference: one of the effects of one action is the negation of a precondition of the other.
  - Competing needs: one of the preconditions of one action is mutually exclusive with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

## 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.
  - S1 defines multiple states and the mutex links are the constraints that define this set of states.

## Cake example



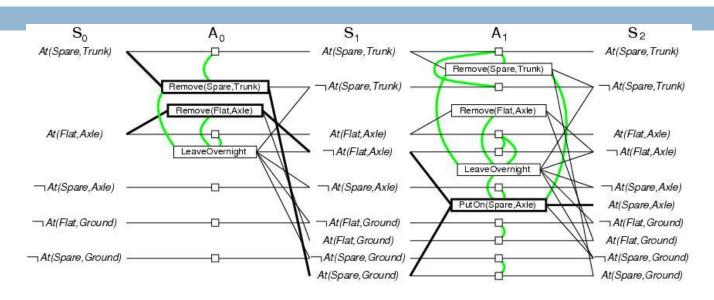
- Repeat process until graph levels off:
  - two consecutive levels are identical, or
  - contain the same amount of literals (explanation follows later)

## The GRAPHPLAN Algorithm

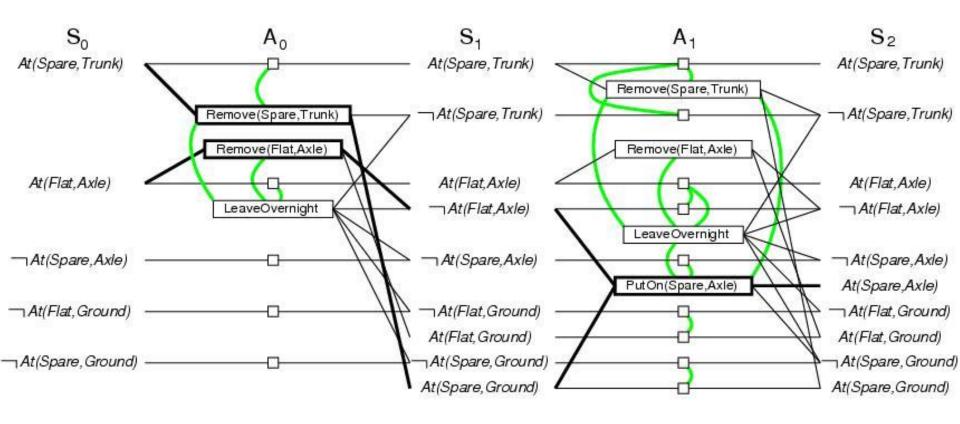
Extract a solution directly from the PG

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

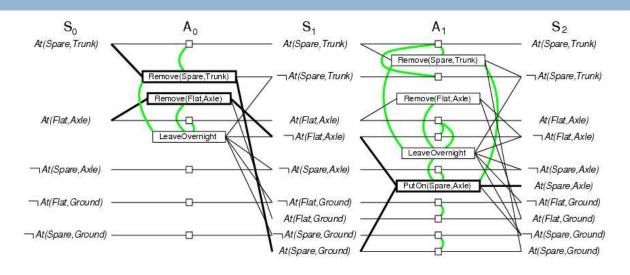
## GRAPHPLAN example



- Initially the plan consist of 5 literals from the initial state and the CWA literals (S0).
- Add actions whose preconditions are satisfied by EXPAND-GRAPH (A0)
- Also add persistence actions and mutex relations.
- Add the effects at level \$1
- Repeat until goal is in level Si



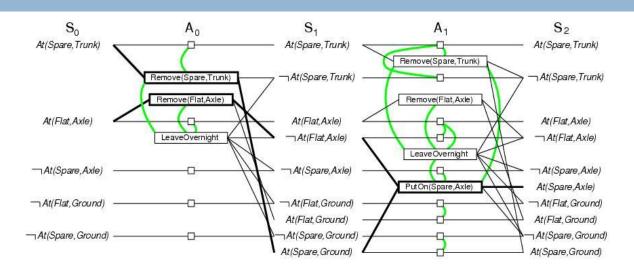
## GRAPHPLAN example



#### 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 S2, At(Spare,Axle) and At(Flat,Axle)

## GRAPHPLAN example

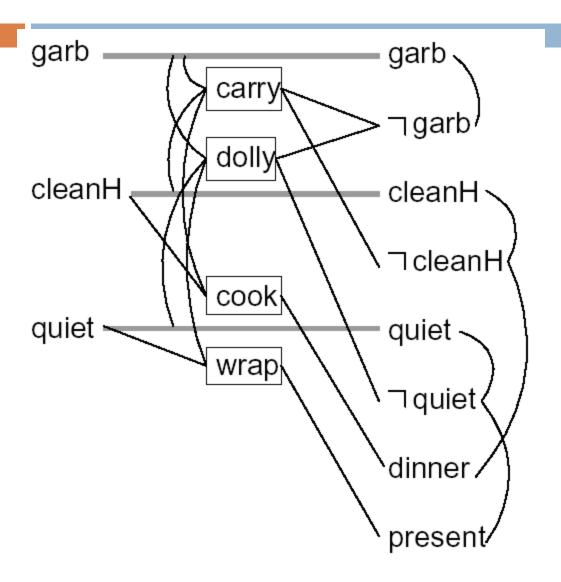


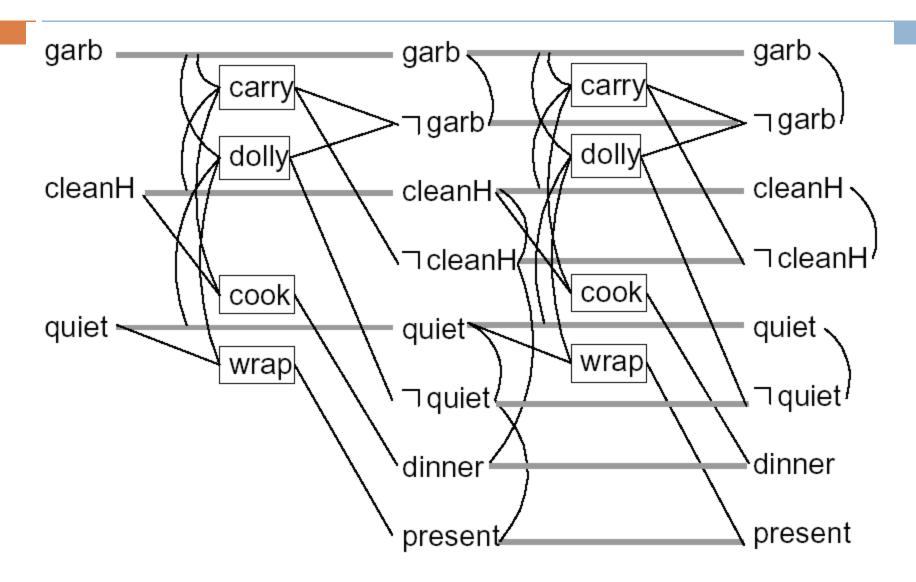
- □ In S2, the goal literals exist and are not mutex with any other
  - Solution might exist and EXTRACT-SOLUTION will try to find it
- EXTRACT-SOLUTION can use Boolean CSP to solve the problem or a search process:
  - □ Initial state = last level of PG and goal goals of planning problem
  - Actions = select any set of non-conflicting actions that cover the goals in the state
  - Goal = reach level S0 such that all goals are satisfied
  - Cost = 1 for each action.

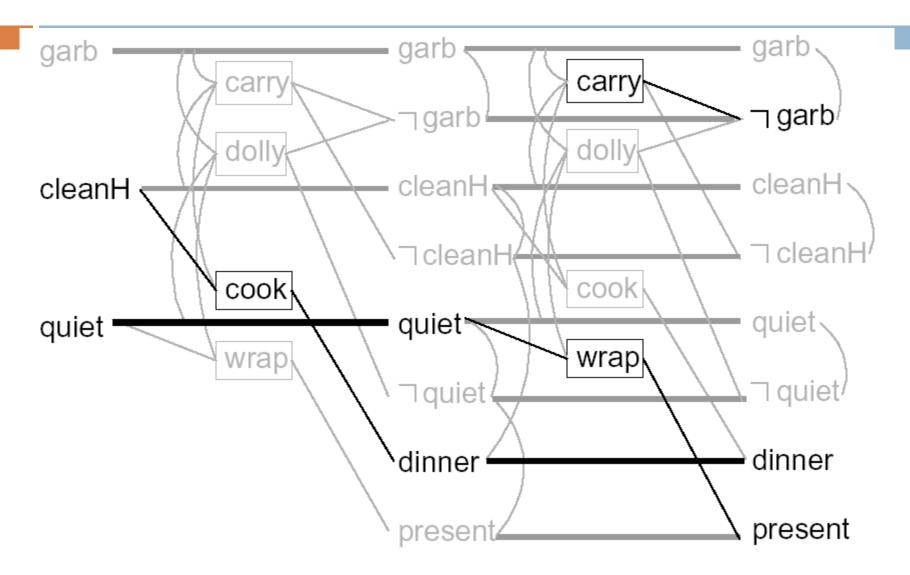
#### **GRAPHPLAN Termination**

- 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

 Initial Conditions: (and (garbage) (cleanHands) (quiet)) Goal: (and (dinner) (present) (not (garbage)) Actions: Cook :precondition (cleanHands) :effect (dinner) Wrap :precondition (quiet) :effect (present) Carry :precondition :effect (and (not (garbage)) (not (cleanHands)) Dolly :precondition :effect (and (not (garbage)) (not (quiet)))



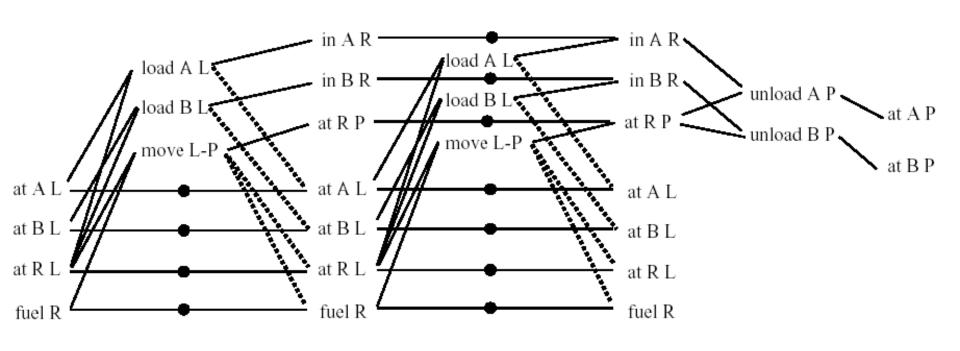




#### Rocket domain

```
(define (operator move)
    :parameters ((rocket ?r) (place ?from) (place ?to))
    :precondition (:and (:neq ?from ?to) (at ?r ?from) (has-fuel ?r))
    :effect (:and (at ?r ?to) (:not (at ?r ?from)) (:not (has-fuel ?r))))
(define (operator unload)
    :parameters ((rocket ?r) (place ?p) (cargo ?c))
    :precondition (:and (at ?r ?p) (in ?c ?r))
    :effect (:and (:not (in ?c ?r)) (at ?c ?p)))
(define (operator load)
    :parameters ((rocket ?r) (place ?p) (cargo ?c))
    :precondition (:and (at ?r ?p) (at ?c ?p))
    :effect (:and (:not (at ?c ?p)) (in ?c ?r)))
```

# Planning Graph Example Rocket problem



propositions time 1 actions time 1 propositions time 2

actions time 2

propositions time 3 actions time 3 goals