

Fundamentals of Artificial Intelligence

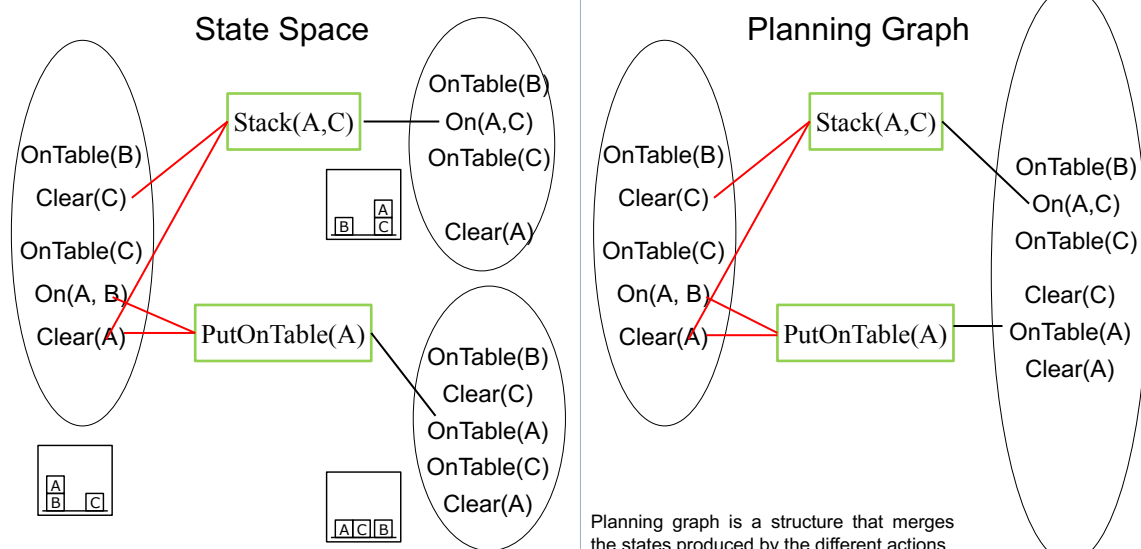
Planning Graphs and GraphPlan



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State Space and Planning Graph



State Space and Planning Graph



- Basic difference between the state space for a planning problem and the corresponding planning graph
 - State space applies an action to a given state and generates a successor state.
 - For each action that is applicable, it generates a separate candidate state, which is a starting point for further exploration.
 - Planning Graph merges the states produced by the different actions that are applicable.
 - Resulting set of propositions expressed as a single layer; as also the actions that resulted in this layer.

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Planning Graph

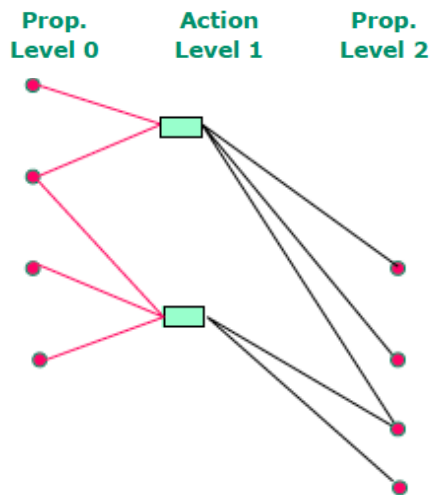


- A layered graph
 - Two kinds of layers alternate
 - Literal (propositions)
 - Action
- The first layer is a literal layer which shows all the literals that are true in the initial layer
 - Every action has a link from each of its preconditions and a link to each of its effects.
 - Literals at consecutive literal levels linked through NoOps
- Every two layers corresponds to a discrete time
 - Propositions (in a layer) that cannot be true simultaneously; and actions that cannot happen simultaneously define a mutex.

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Planning Graph



A plan graph is LAYERED. Have a bunch of alternating layers of propositions and actions. Start with level zero, level one, level two.

At the even- numbered levels you have propositions (Here drawn as a little dot). At the odd-numbered levels, you have actions, shown as boxes.

There are FOUR kinds of EDGES:

Precondition Edge

Add to layer 1 all the **actions that have their preconditions satisfied** in layer 0.

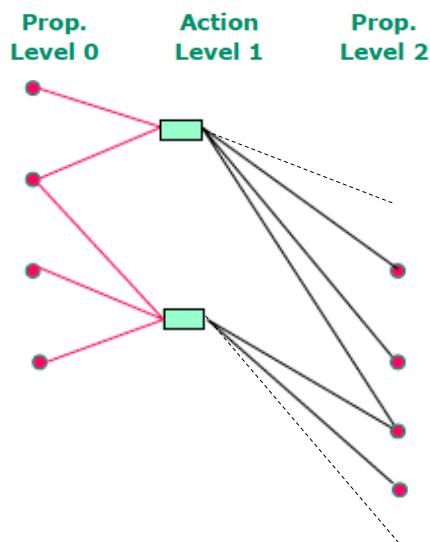
Positive Edge

Add to proposition layer 2 **all the propositions that are effects of actions** in layer 1.

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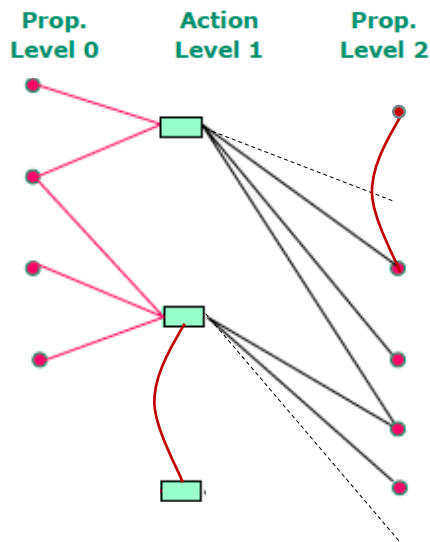
Negative Edge

Linking an action to **delete effect of the action;** propositions that no longer true.

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Planning Graph



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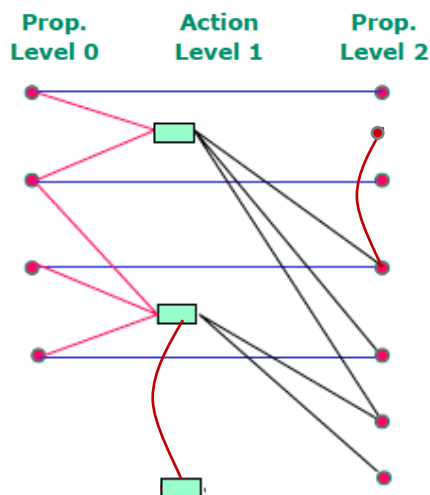
Mutex Edge

Linking **mutually exclusive** two propositions in same layer; or two actions in same layer.

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Planning Graph



Add to next proposition layer, all of the propositions that you had in the previous layer. **Connect them with maintenance actions or No-ops**, shown here as blue lines connecting propositions from layer n to layer $n + 2$.

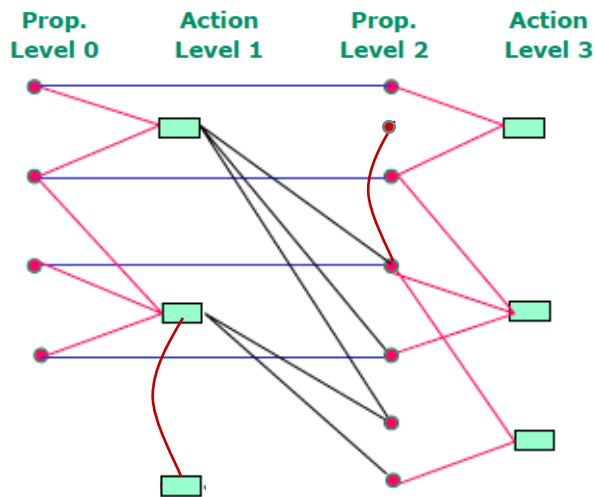
These maintenance actions represent the possibility of having some proposition be true at step n because it was true at step $n - 2$, and we didn't do anything to make it false; that is, that we maintained its truth value.

The effect of the no-ops is that the set of propositions in the proposition layers grow monotonically.

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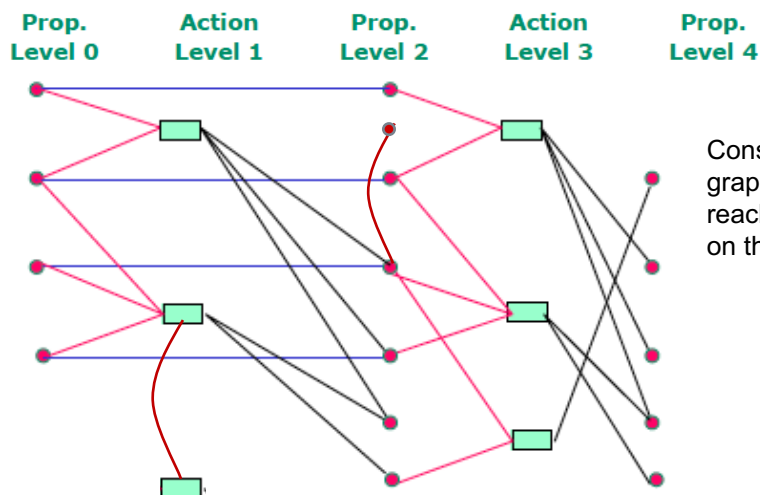
Planning Graph



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Planning Graph

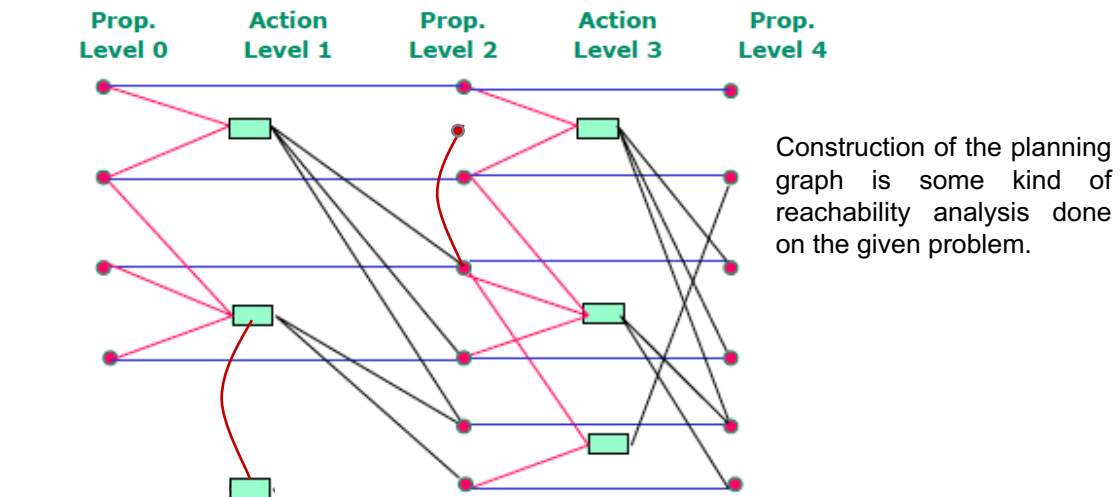


Construction of the planning graph is some kind of reachability analysis done on the given problem.

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Planning Graph



We have **HERE** three proposition levels (levels 0, 2, and 4) and **two** action levels (levels 1 and 3). **Encode depth-two plans** (There are 02 layers of actions). Action at Level 1 - actions to do first step; Action at level 3 - actions to do on the second step.

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Illustrative Example



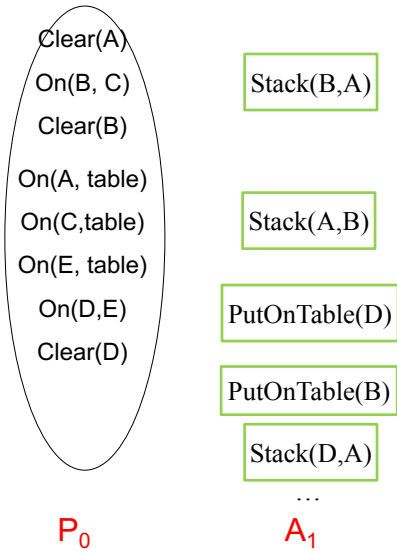
Clear(A)
 On(B, C)
 Clear(B)
 On(A, table)
 On(C, table)
 On(E, table)
 On(D, E)
 Clear(D)

 P_0

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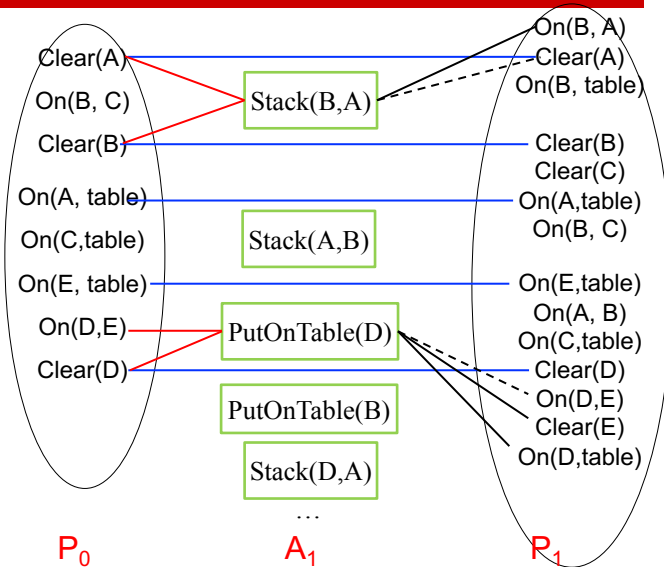
Illustrative Example



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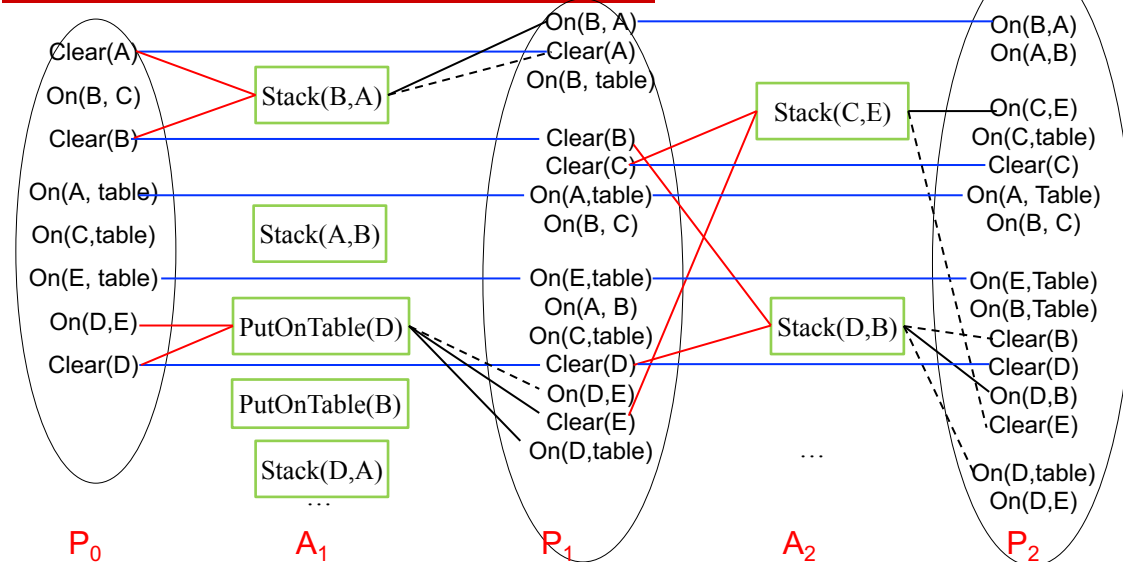
Illustrative Example



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Illustrative Example

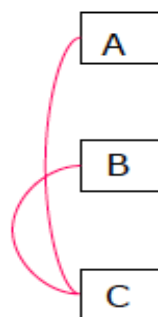


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Mutually Exclusive Actions

Find and mark pairs of actions that are mutually exclusive.



That is, they can't both be done on the same step; they can't be done in parallel. When two actions are mutex, we'll show it in our graph by drawing an arc between them, as shown in red

Here. Actions A and C are mutex, and actions B and C are mutex.

This means that we could execute both A and B in parallel, but if we do C, we can't do either of the others.

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Mutually Exclusive Actions



1. Inconsistent effects: effect of one action is negation of effect of another. The semantics of these actions in parallel are not defined.

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2. Interference: one action deletes the precondition of the other; Only one linear ordering of the two actions would be feasible.

Mutually Exclusive Actions



1. Inconsistent effects: effect of one action is negation of effect of another
2. Interference: one action deletes the precondition of the other; Only **one linear ordering of the two actions** would be feasible.
3. Competing needs: **actions have preconditions that are mutex** at level $i-1$.

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Mutually Exclusive Propositions



Two propositions at level i are **mutex**

1. Negation: they are **negations of one another**

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Mutually Exclusive Propositions



Two propositions at level i are **mutex**

1. Negation: they are negations of one another
2. Inconsistent support: **all ways of achieving the propositions at level $i-1$ are pairwise mutex.**

Observe that if **two propositions are not mutex** in a layer, they will be **not mutex in all subsequent layers** because of the No-op action.

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GraphPlan



□ A propositional planner

1. Make a plan graph of depth k
2. Search for a solution
3. If succeed, return a plan
4. Else $k=k+1$
5. Go to 1

The idea is that you make a plan graph of depth k , and then you search for a solution, and if you succeed you return a plan. Otherwise, you increment K and try again.

The process of building the planning graph continues till either the goal propositions have appeared nonmutex in the planning graph or the planning graph has levelled off.

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GraphPlan



□ Phase 1 – Planning Graph Construction

- Creates graph encoding pairwise consistency and reachability of actions and propositions from initial state.
- Graph includes, as a subset, all plans that are complete and consistent.

□ Phase 2 - Solution Extraction

- Graph treated as a kind of constraint satisfaction problem (CSP).
- Selects whether or not to perform each action at each time point, and testing consistency.

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Building the Planning Graph



- First task that GraphPlan takes up is construction of the planning graph.
- Initialize the layer zero of the planning graph to the start state!
- Process of extending the graph continues till one of the following two conditions is achieved.
 - Newest proposition layer contains all goal propositions; and no mutex relations between the goal propositions.
 - The planning graph has levelled off. This means that for two consecutive levels
 - Same set of Propositions; Same set of mutex relations
 - Consequently no new actions can make an appearance; If goal propositions are not present in a levelled planning graph, they can never appear!

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Solution Extraction



- When the planning graph reaches a level that contains all the goal propositions, it is time to check if a solution can be extracted.
 1. One way of looking at the plan existence question is to see if the goal propositions have support from a nonmutex set of actions.
 2. If YES! combined preconditions can be seen as a regressed sub-goal set, which can be solved recursively.
- If all the literals in the goal appear at the deepest level and non mutex, then search for a solution for each subgoal at level i
 1. For each subgoal at level i
 - a. Choose an action to achieve it
 - b. If it's mutex with another action, Fail

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Solution Extraction

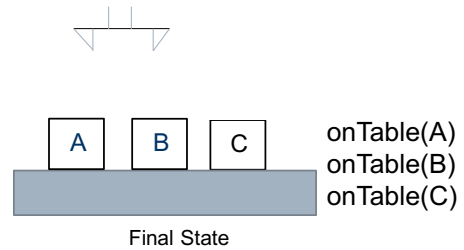
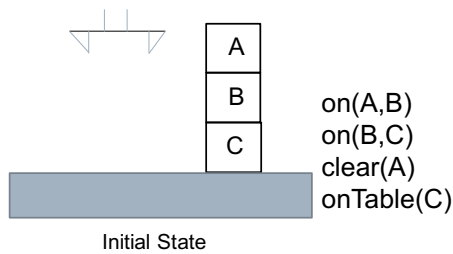


- When the planning graph reaches a level that contains all the goal propositions, it is time to check if a solution can be extracted.
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 1. For each subgoal at level i
 - a. Choose an action to achieve it
 - b. If it's mutex with another action, Fail.
 2. Repeat for preconditions at level i-2

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Illustrative Example



Stack(x,y)

PRE: {OnTable(x), Clear(x), Clear(y)}
ADD: {On(x,y)}
DEL: {OnTable(x), Clear(y)}

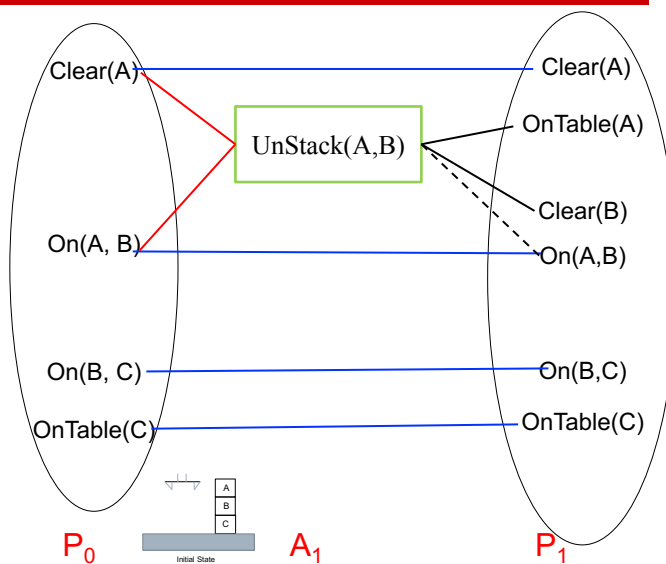
UnStack(x,y)

PRE: {On(x,y), Clear(x)}
ADD: {OnTable(x), Clear(y)}
DEL: {On(x,y)}

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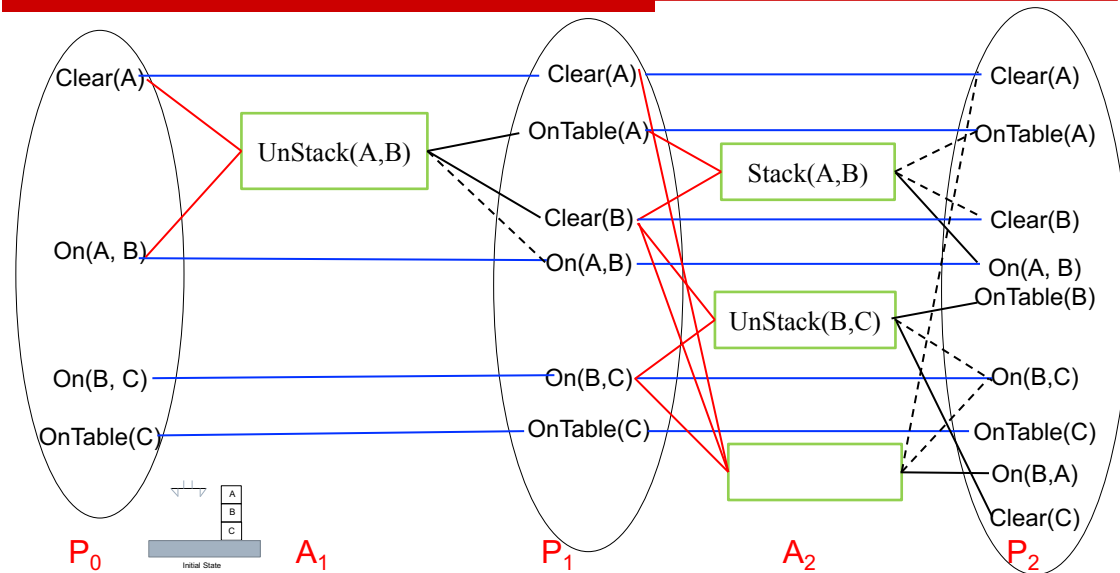
Illustrative Example



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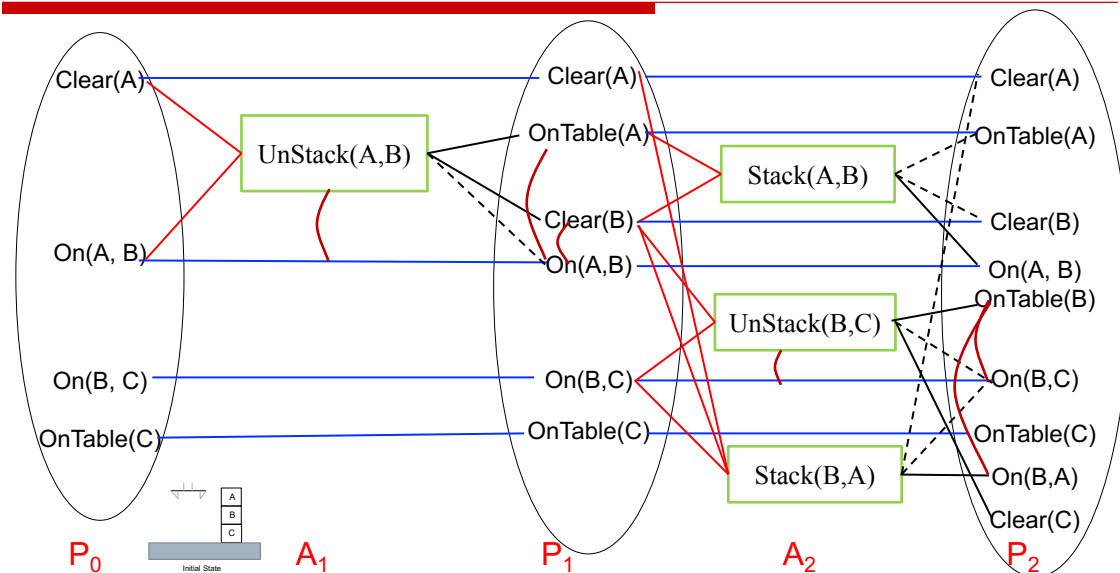
Illustrative Example



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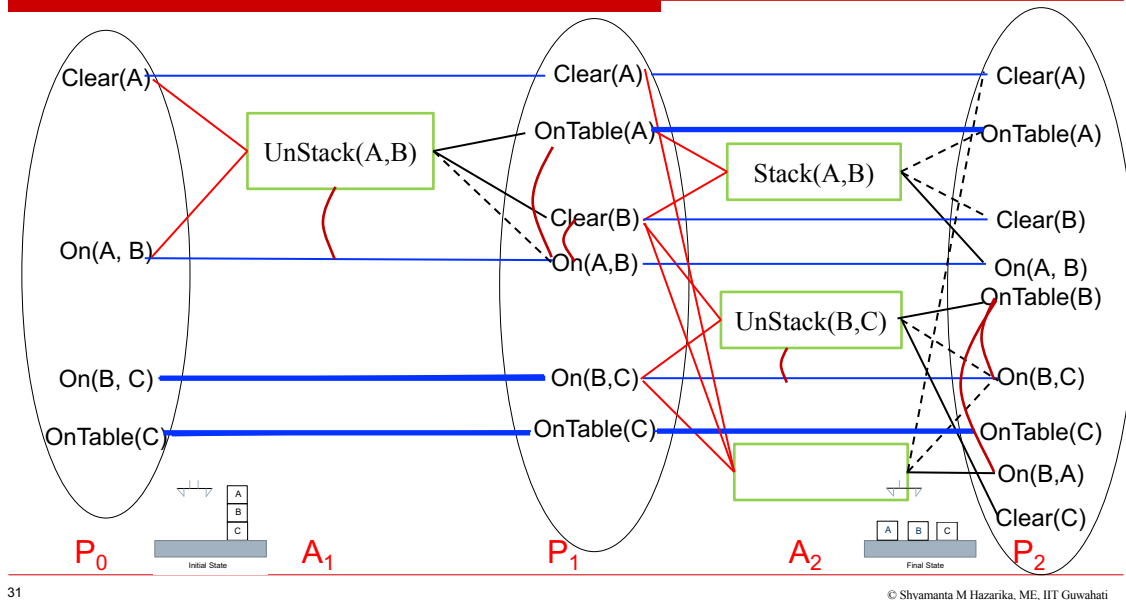
Illustrative Example



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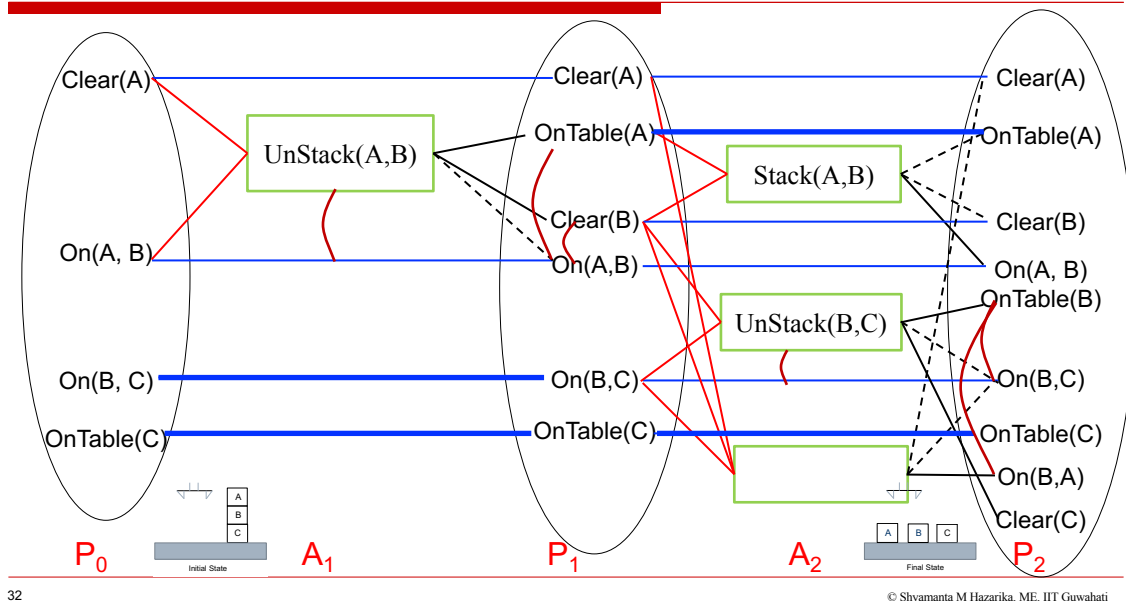
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Final Comments

- Development of GraphPlan gave a huge impetus to the research in planning.
 - Graphplan – introduced the **two stage process** to planning.
 - **First Stage** involved **delimiting the search space**; and some kind of reachability analysis done on the given problem.
 - **Second Stage was searching** for a plan in a delimited space.
- Advancements in planning algorithms and increasing computing power led to the exploration of richer domains for planning.
 - Conditional effects, contingent planning; planning with durative actions and trajectory constraints have been explored.
 - Planning techniques applied to many real world applications!