

# Planning

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# Problem Solving vs. Planning

In everyday language planning means to figure out several problem-solving steps before executing any of them...

... of course, the computer usually can't do anything but plan...

# Planning Framework

- Describe initial world state.
- Describe goal world state.
- Identify actions that transform states.

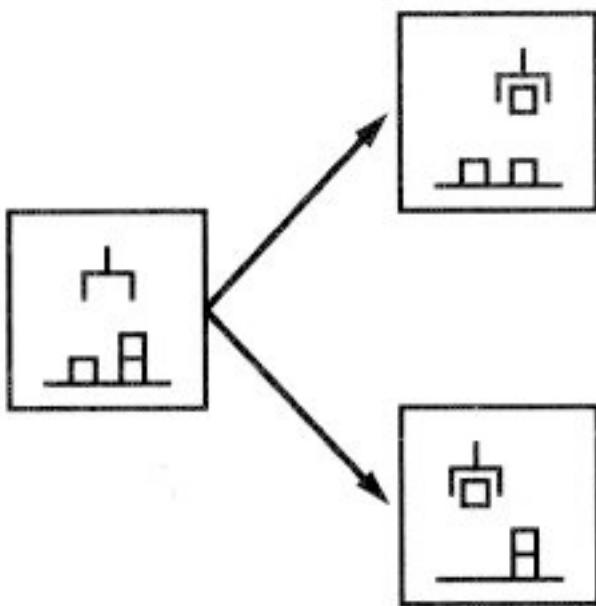
A plan is a sequence of actions which transforms initial state into goal state.

# State Space or Plan Space?

State space – explore states

- Construct a list of states to achieve goal
- Apply actions/operators to generate new states
- Generate plan by identifying search path
- Extract plan by listing actions necessary for each state

# State Space Search



Moves in the space:

- Modify world state via operator

Model of time:

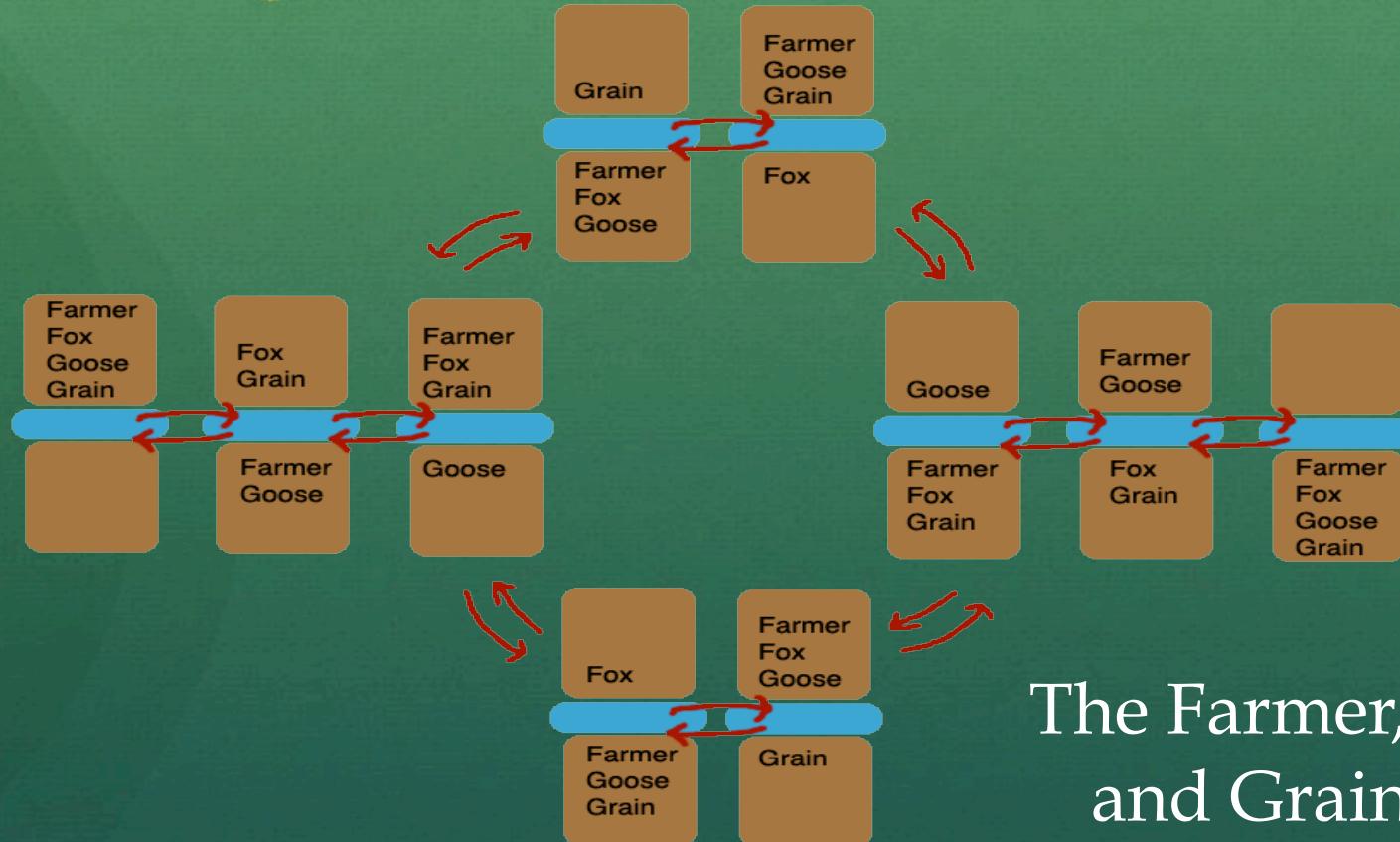
- Depth of node in search space

Plan stored in:

- Series of state transitions

[Rich & Knight 1991]

# State Space Example



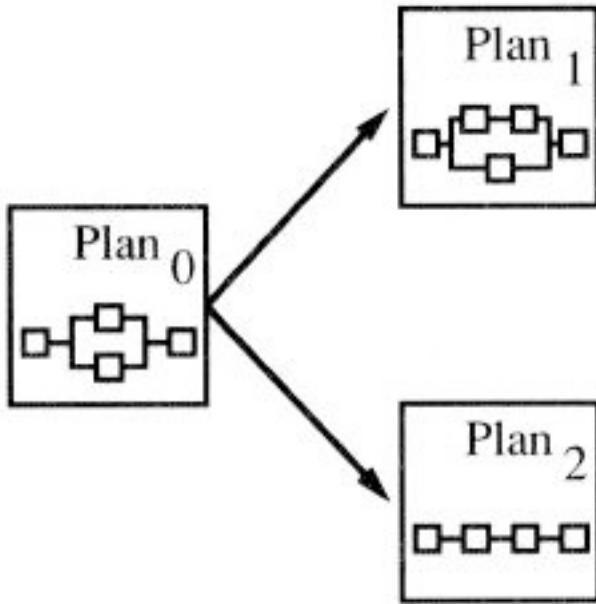
The Farmer, Fox, Goose  
and Grain problem.

# State Space or Plan Space?

Plan space – consider actions

- States are plans (partial plans)
  - plans have actions, bindings, orderings
- Test to see if the plan achieves our goal
- Refine/extend plan with available actions as we search
- Extract plan by listing actions necessary for each state

# State Space Search



Moves in the space:

- Add operators
- Order operators
- Bind variables
- Or otherwise constrain plan

Model of time:

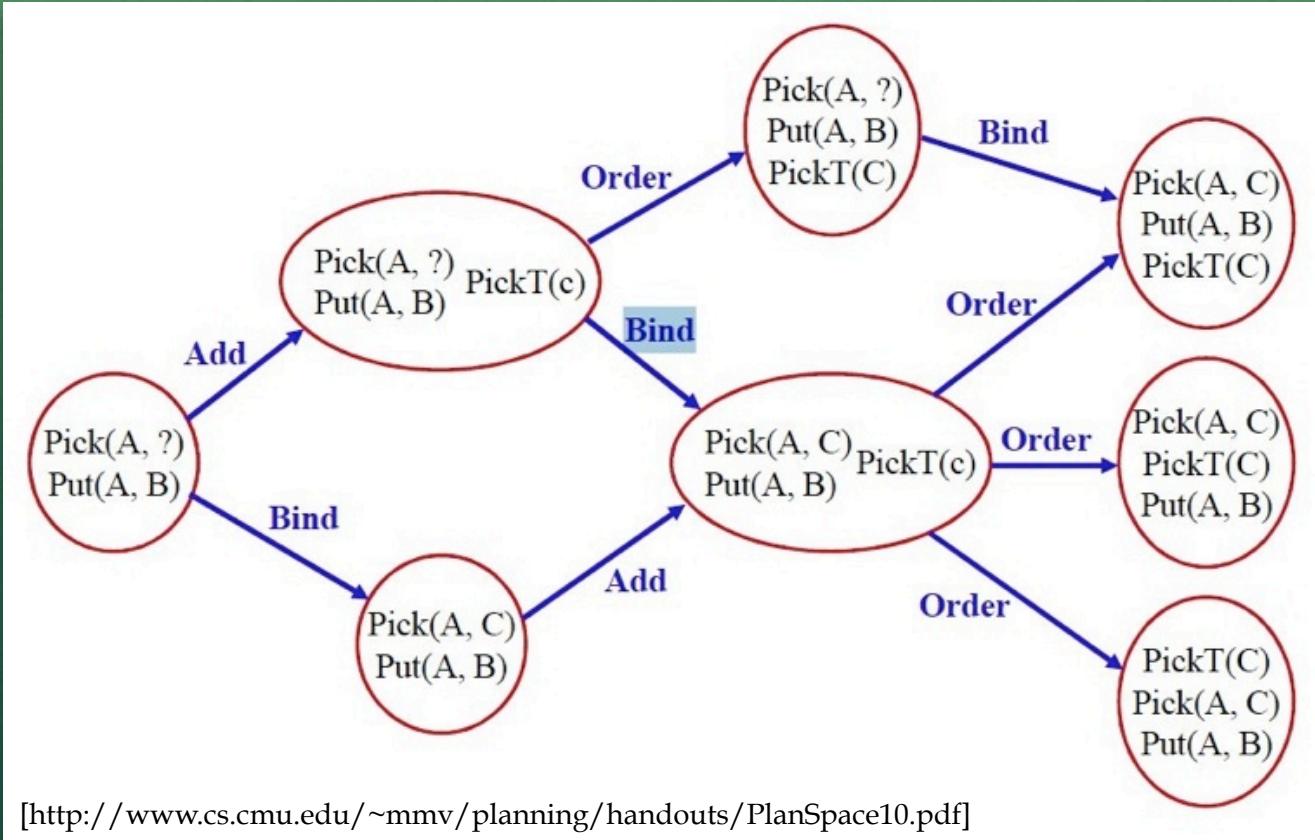
- Partially ordered set of operators

Plan stored in:

- Single node

[Rich & Knight 1991]

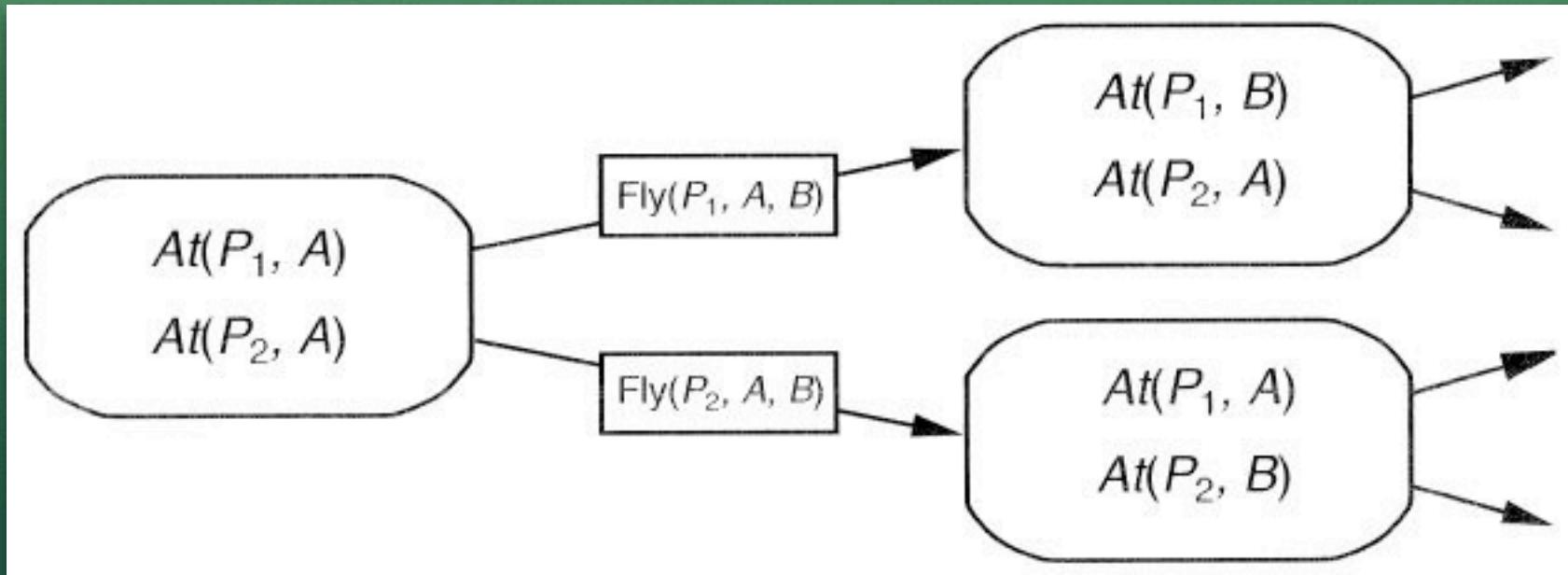
# Plan Space Search



# Forwards or Backwards?

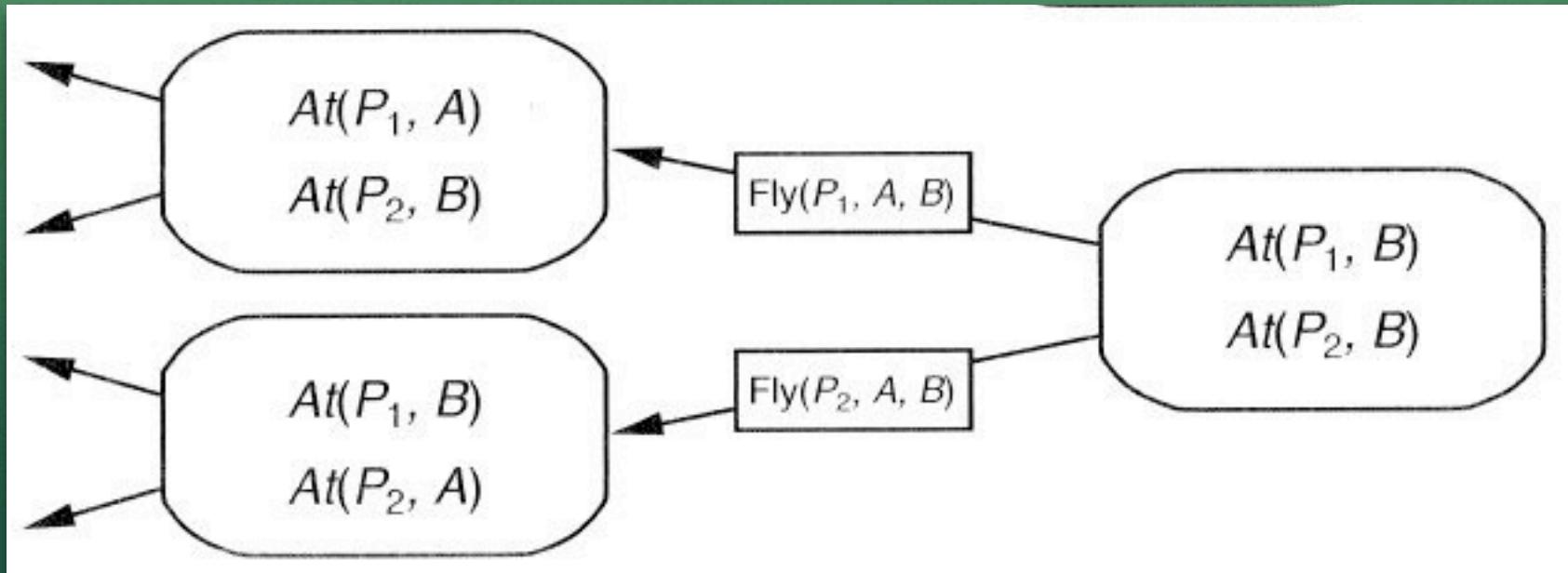
- Forward planning is usually more natural
- Backwards planning is often more efficient

# Forward Planning



[Russel & Norvig 2010]

# Backward Planning



[Russel & Norvig 2010]

# From Whence Complexity?

- Searching the LARGE space
  - worst case, exponential in plan length
- Costs Associated with each Node
  - generating next (successor) nodes
  - identifying when goal state is reached
  - computing heuristics

usually a tradeoff between search time and work per node

# Problem Decomposition

For more complicated problem domains

- Break problem into smaller parts
- Solve parts of the problem
- Recombine parts into complete solution

# Problem Decomposition

Avoid recomputing things

- *The frame problem* – identifying constants

Divide difficult problem into smaller problems.

- Many problems are *nearly decomposable*.
- Identify and handle potential interactions.

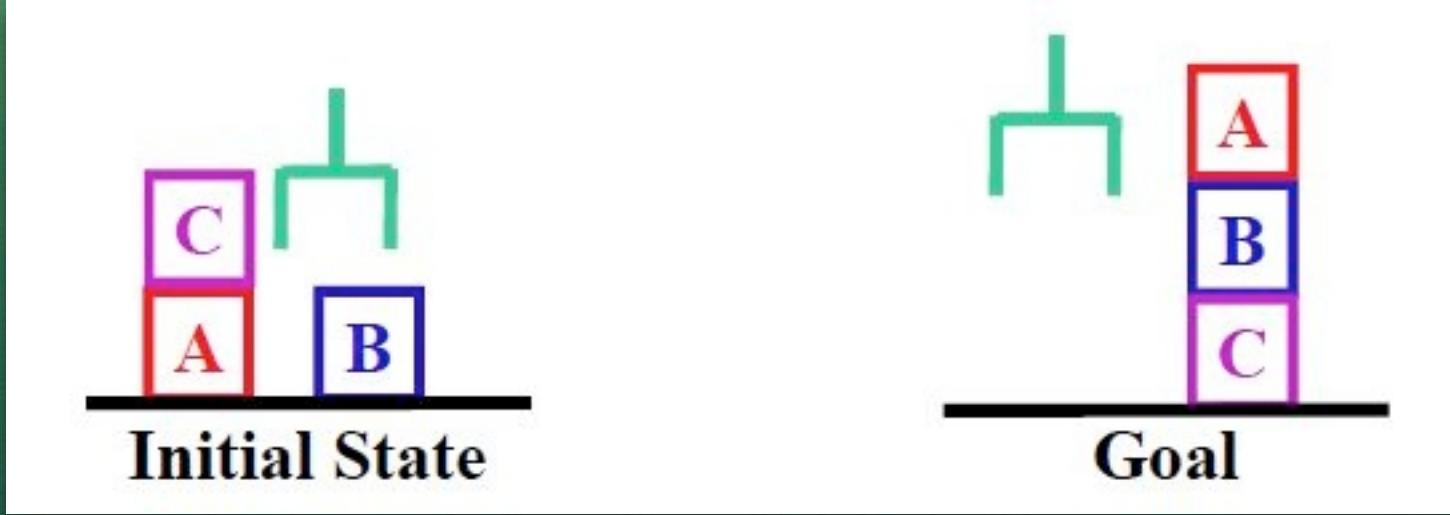
# Sussman's Anomaly

illustrates why planning  
is non-trivial

Gerald Sussman  
MIT, under Marvin Minsky  
developed Scheme  
founding director, FSF



# Sussman's Anomaly

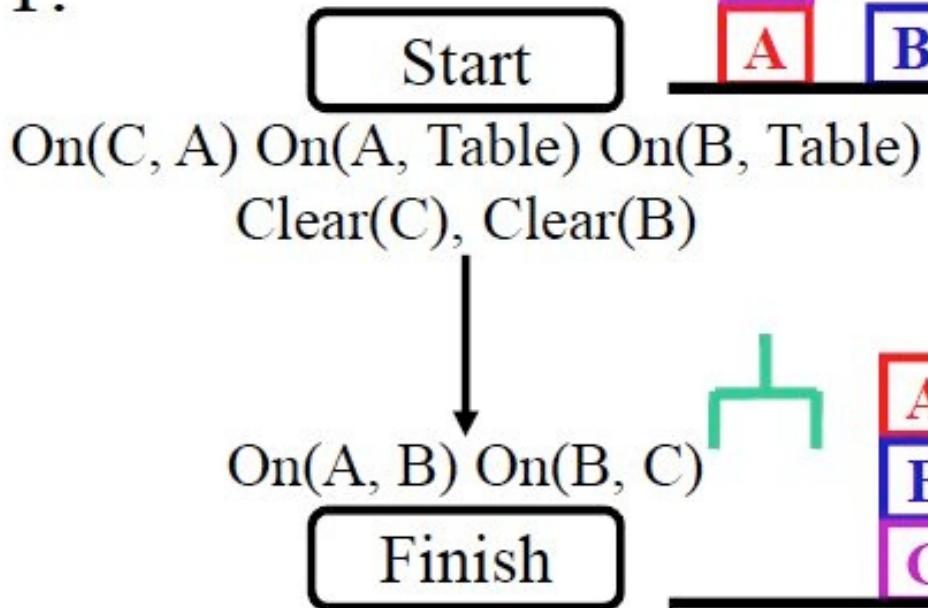


[<http://www.cs.cmu.edu/~mmv/planning/handouts/PlanSpace10.pdf>]

Wednesday, October 26, 2011

# Sussman's Anomaly

1.



simple planners  
separate the goal  
into subgoals:

get A atop B  
get B atop C

# Sussman's Anomaly

2.

On(C, A) On(A, Table) On(B, Table)

Clear(C) Clear(B)

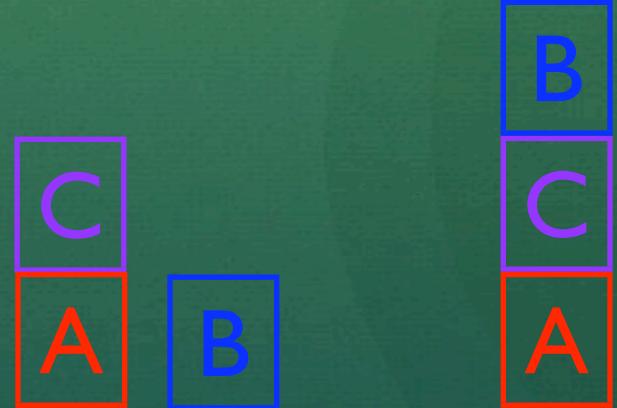
Start

Clear(B) Clear(C)  
**Move(B, C)**

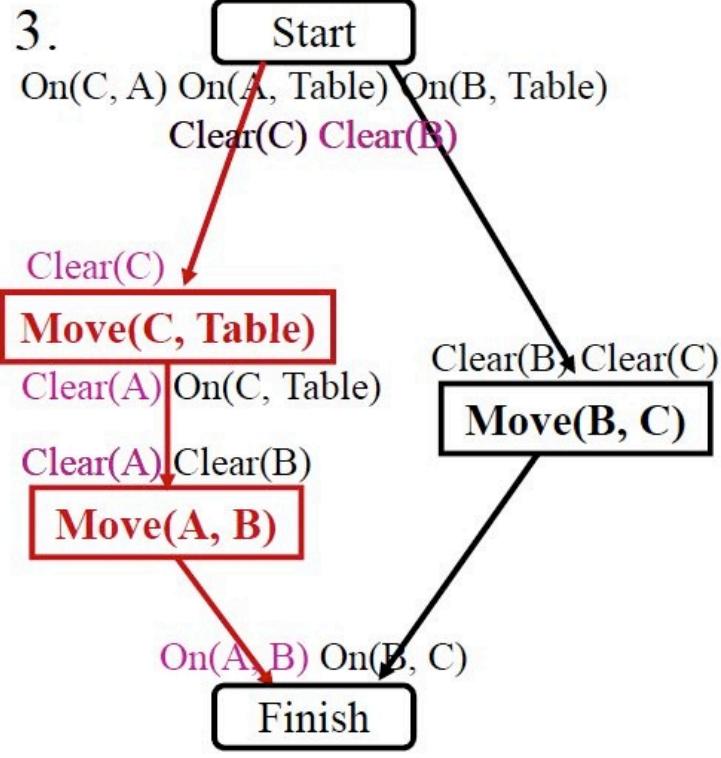
On(A, B) On(B, C)

Finish

first, pursue  
get B atop C



# Sussman's Anomaly

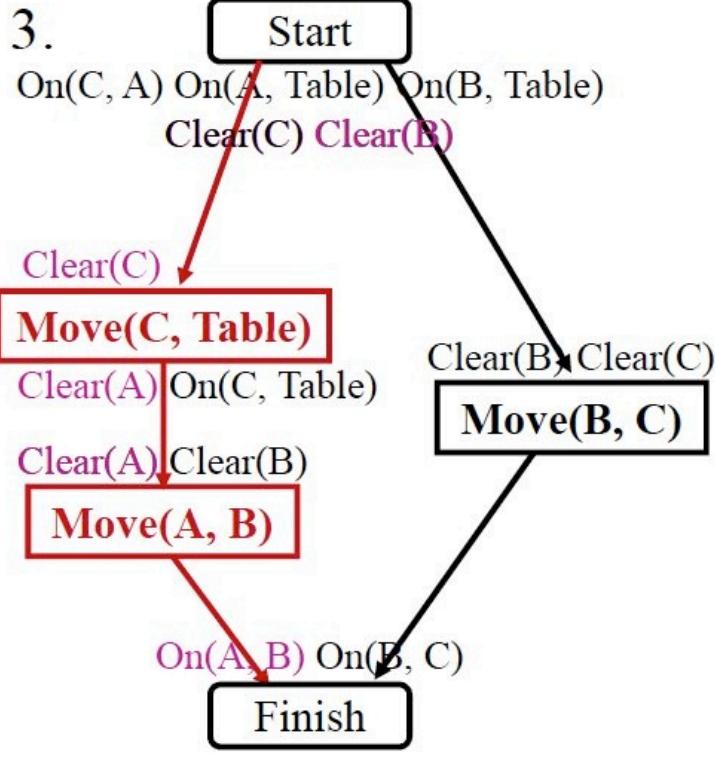


then, pursue  
second subgoal  
get A atop B

move(C, table)  
move(A, B)



# Sussman's Anomaly

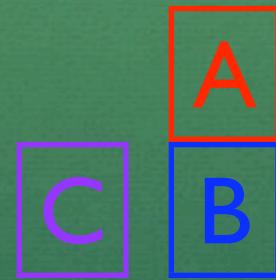
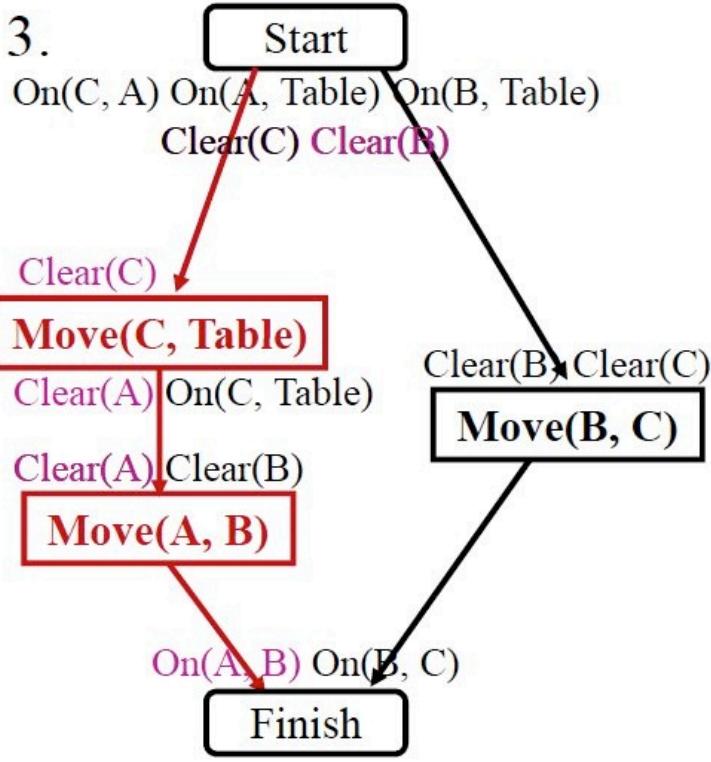


try second  
subgoal first  
get A atop B

move(C, table)  
move(A, B)

# Sussman's Anomaly

3.

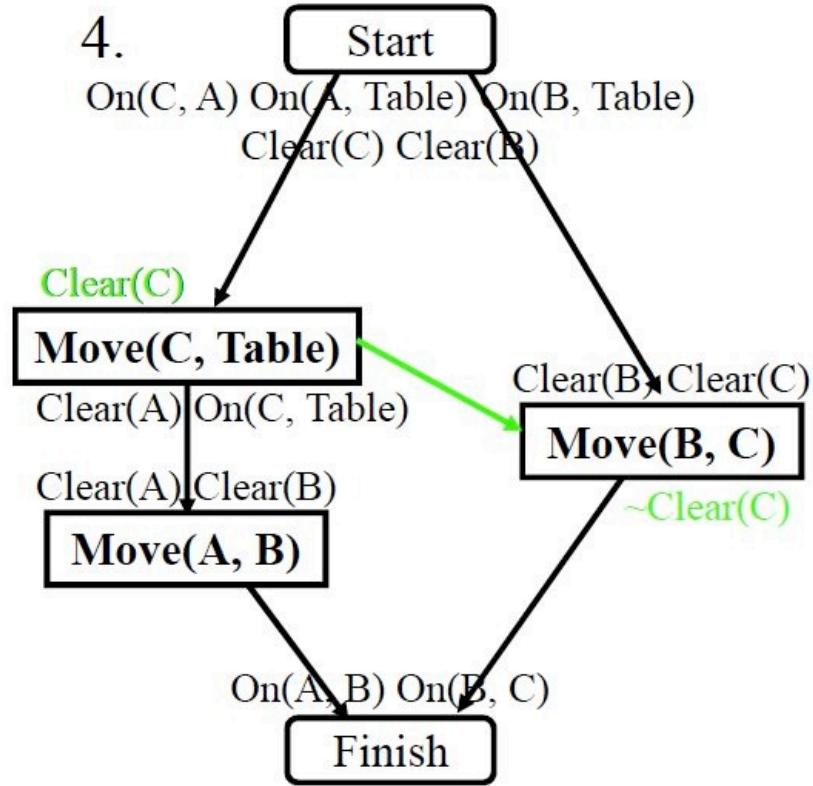


now first  
subgoal  
get B atop C

move(B, C)

# Sussman's Anomaly

4.



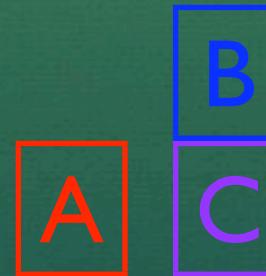
1



2



3



# Sussman's Anomaly

5.

Start  
On(C, A) On(A, Table) On(B, Table)  
Clear(C) Clear(B)

Clear(C)

**Move(C, Table)**

Clear(A) On(C, Table)

Clear(A) Clear(B)

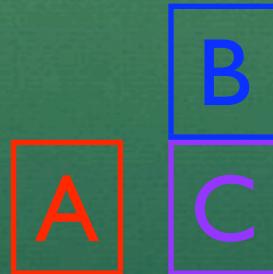
**Move(A, B)**

$\sim$ Clear(B)

On(A, B) On(B, C)

**Finish**

3



4



required interleaving of subgoals

# Plan Terminology

- Totally ordered plan
  - there is an ordering  $O$  of actions
- Fully instantiated plan
  - all variables are constrained,  $B$
- Consistent plan
  - there are no contradictions in  $O$  or  $B$
- Complete plan
  - all preconditions of all actions in  $O$  are met

# Types of Planners

- Heuristic Search
- Planning Graph
- Satisfiability, Constraint Satisfaction
- First-order Logic Deduction
- Refining Partially Ordered Plans

# Planning vs. Scheduling

- classic planning - what to do, in what order
- scheduling takes into account resource constraints
- one approach: plan first, schedule afterwards
- to minimize time, determine earliest start times for tasks
- want to find **critical path**
  - the path with the maximum shortest time to completion

# Problems with Planning

- Symbolic approach poor for continuous problems
- Symbolic approach bad for making value judgments (like ranking two options)
- Assumptions: world well behaved, actions do succeed
- Ignores adversaries

# More wrinkles

- Can steps be ignored or undone?
- In the real world, some actions are irrevocable
- Is the universe predictable?
- If not, computer simulation falters

# So, in the real world...

- Don't plan too far ahead – just react to situation.
- Do our best – design a plan likely to succeed.
  - Still, plan may well fail.
  - Small surprises may not completely ruin plan.
  - How to react to salvage plan?

# In games...

- We have a lot of control over the world
- Game actions are often monotonic  
(once performed effect is permanent.)
- Custom solutions implemented for hard subtasks
- Just have to “appear intelligent”