

INTRODUCTION TO AI STRIPS PLANNING

.. and Applications to Video-games!

Course overview

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- Lecture 1: Game-inspired competitions for AI research, AI decision making for non-player characters in games
- Lecture 2: STRIPS planning, state-space search
- Lecture 3: Planning Domain Definition Language (PDDL), using an award winning planner to solve Sokoban
- Lecture 4: Planning graphs, domain independent heuristics for STRIPS planning
- Lecture 5: Employing STRIPS planning in games: SimpleFPS, iThinkUnity3D, SmartWorkersRTS
- Lecture 6: Planning beyond STRIPS

Goal Oriented Action Planning (GOAP)

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- Video Games:
 - ▣ Finite State Machines
 - ▣ Decision Diagrams
 - ▣ Behavior Trees
 - ▣ Goal Oriented Action Planning ←
- Academic AI on agents:
 - ▣ Knowledge representation, First-order logic, Classical planning, Planning with preferences, ...
 - ▣ Belief-Desire-Intention architecture, Agent-based programming, ...
 - ▣ Probabilistic reasoning, Bayesian networks, Utility theory, Markov Decision Processes, ...

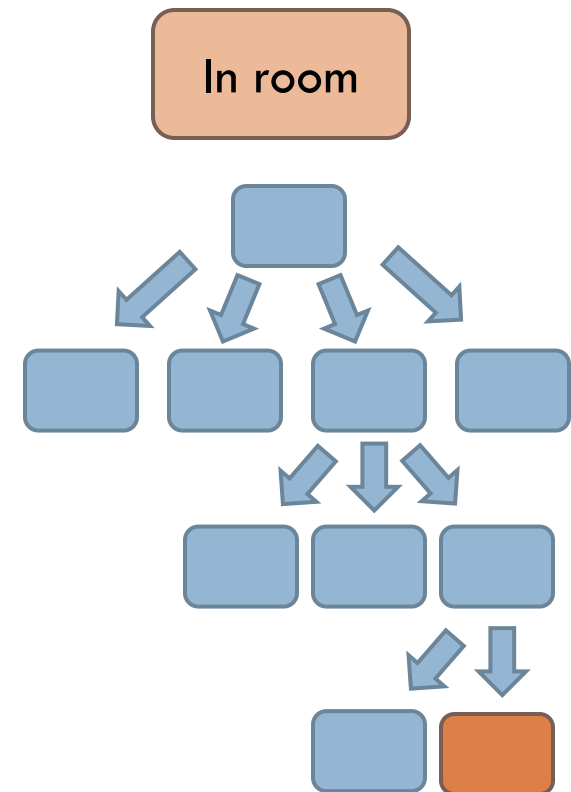


Goal Oriented Action Planning (GOAP)

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- **Search** for a **plan** that achieves the **goal** in the current state

Move into room	Preconditions: Door open Effects: In room
Move to door	Preconditions: - Effects: At door
Unlock door	Preconditions: Hold key Effects: Door open
Kick door	Preconditions: - Effects: Door open



Goal Oriented Action Planning (GOAP)

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- **Search** for a **plan** that achieves the **goal** in the current state
- There is a **standard formalism** for representing such problems in **AI literature** and a **large body of work!**
- Video-games: The best strategy is to use the existing formalism and take advantage of the work in the literature

Course overview

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- Lecture 1: Game-inspired competitions for AI research, AI decision making for non-player characters in games
- Lecture 2: **STRIPS planning**, state-space search
- Lecture 3: Planning Domain Definition Language (PDDL), using an award winning planner to solve Sokoban
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- Lecture 6: Planning beyond STRIPS

STRIPS planning

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- Typical description of a planning problem:
 - ▣ Initial state
 - ▣ Goal
 - ▣ Available actions
- Typical solution of a planning problem:
 - ▣ A sequence of actions that when executed in the initial state results in a state that satisfies the goal condition.
- Planning: The automatic discovery of such solutions

What is a planning problem?

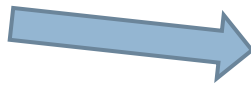
8

- Let's start with a simple example..

What is a planning problem?

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- Given:
 - Initial state



What is a planning problem?

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- Given:
 - Initial state
 - Goal



What is a planning problem?

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- Given:
 - Initial state
 - Goal
 - Available actions



What is a planning problem?

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□ Given:

- Initial state

- Goal

- Available actions

□ Find:

- A **sequence of actions** that achieves the goal

- E.g.: [**Left, Down, Left, Up, ...**]

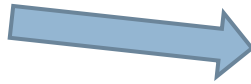


What is a planning problem?

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□ Given:

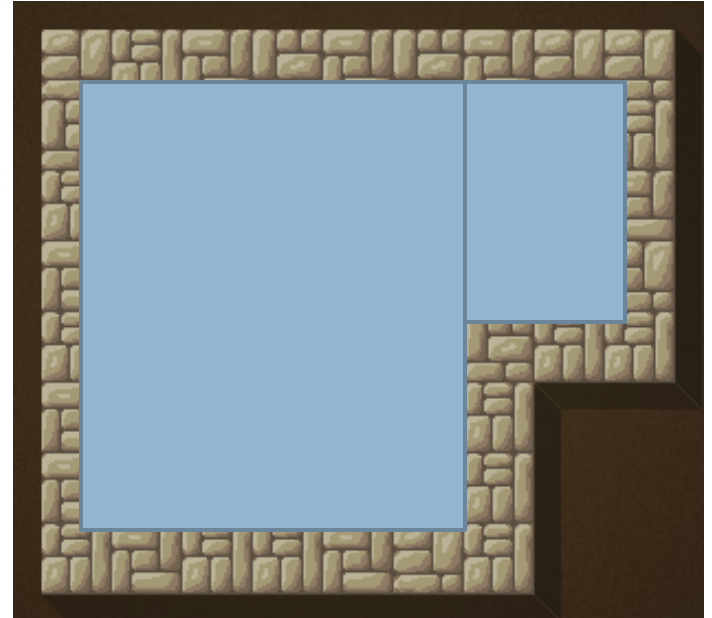
□ Initial state



□ Goal



□ Available actions



□ Find:

□ A **sequence of actions** that achieves the goal

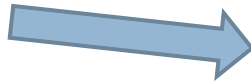
□ A **method** that is capable of finding a solution **for every initial state and goal**

What is a planning problem?

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□ Given:

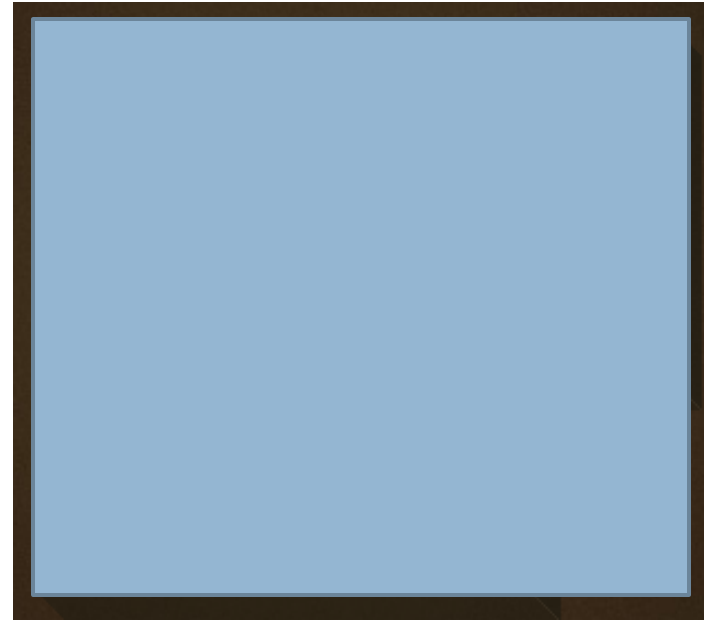
□ Initial state



□ Goal



□ Available actions



□ Find:

□ A **sequence of actions** that achieves the goal

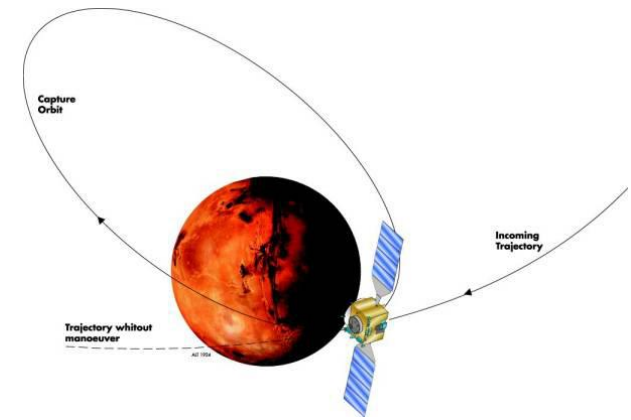
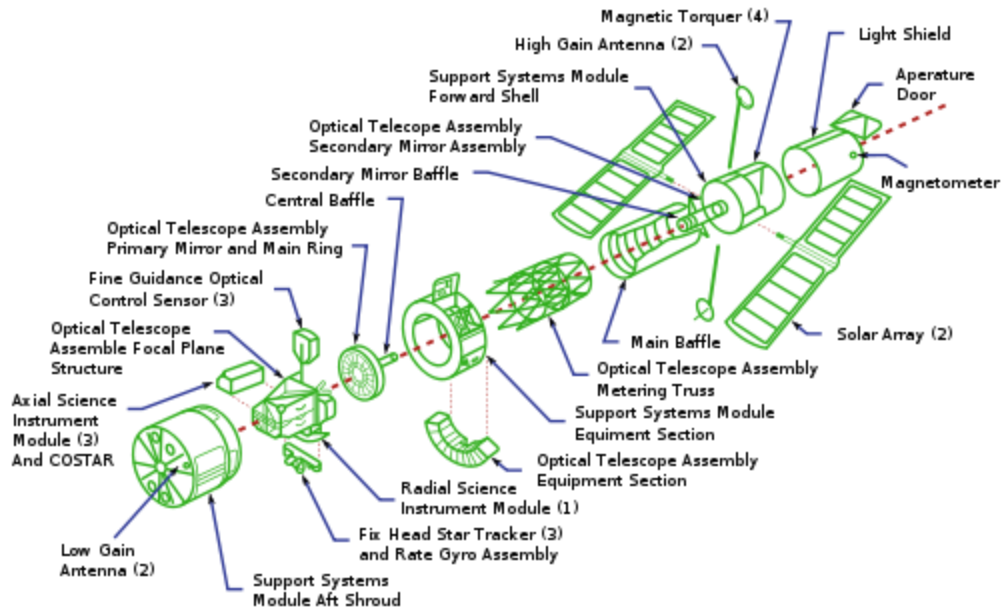
□ A **method** that is capable of finding a solution **for every application domain**



Use of planning in real applications

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- Scheduling
- Hubble Space Telescope



Use of planning in real applications

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- KIVA Robots: robots make inventory isles move instead of workers



[youtube link](#)

Use of planning in real applications

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- Autonomous agents with planning capabilities for specifying the behavior (Intelligent Agents/ Cognitive Robots)
- UAV DARPA Grand/Urban Challenge, Honda ASIMO



STRIPS planning

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- Typical description of a planning problem:
 - Initial state
 - Goal
 - Available actions

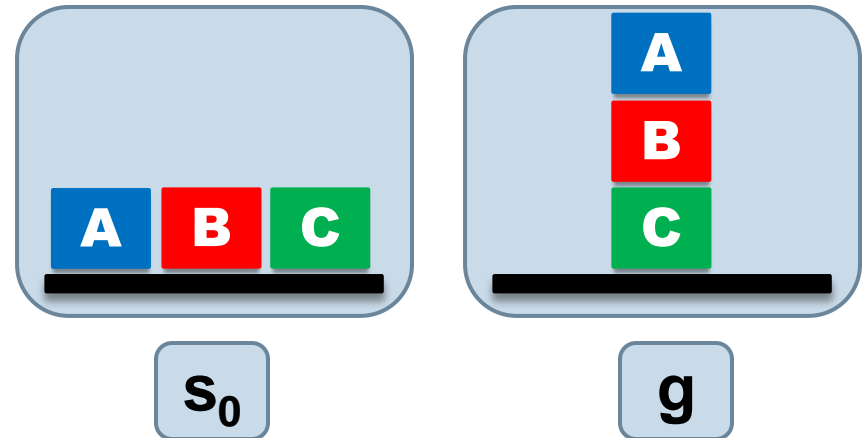
STRIPS planning

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□ Blocks world domain

□ Initial state: s_0

□ Goal: g



□ Available actions: moving a block

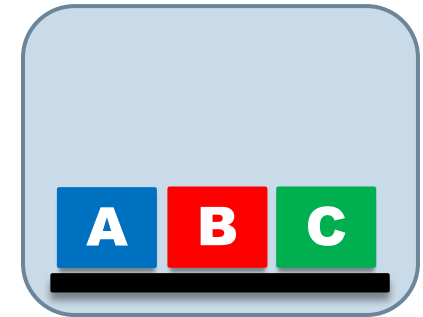
- from the table to the top of another block
- from the top of another block to the table
- from the top of one block to the top of another block

STRIPS planning

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□ Initial state

- Representation of the properties of the domain using first order logic literals



□ Blocks world

□ On(b,x):

- block b is on top of x, where x is another block or the table

□ Clear(x):

- a block can be placed on top of x

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

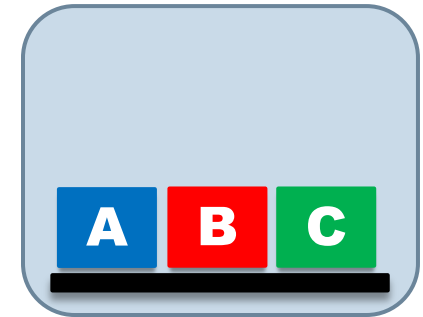
S₀

STRIPS planning

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□ Initial state

- Representation of the properties of the domain using first order logic literals
- Ground and function-free
- **Completely specified**
based on a **closed-world assumption**



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

S_0

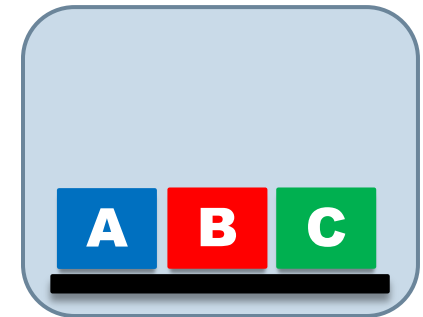
STRIPS planning

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□ Initial state

- Closed-world assumption
- Any literal not mentioned in the description of the state are assumed to be false!

\neg On(A,A)
 \neg On(A,B)
 \neg On(A,C)
 \neg On(B,A)
 \neg On(B,B)
 \neg On(B,C)
 \neg On(C,A)
 \neg On(C,B)
 \neg On(C,C)
 \neg On(A,A)
 \neg On(A,B)
 \neg On(A,C)
 \neg On(Table,A)
 \neg On(Table,B)
 \neg On(Table,C)
 \neg On(Table,Table)
 \neg Clear(Table)



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

S_0

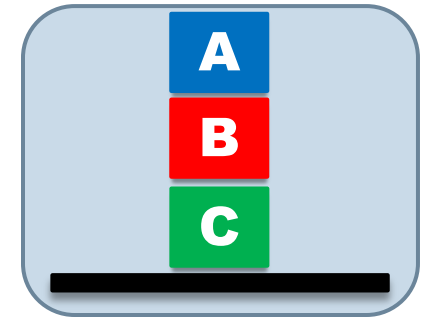
STRIPS planning

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□ Goal

- Representation of the properties of the domain using first order logic literals
- Ground and function-free
- **Partially specified**
(no closed-world assumption)

A state s satisfies goal g if it contains all literals in g (more literals may be in s)



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

g

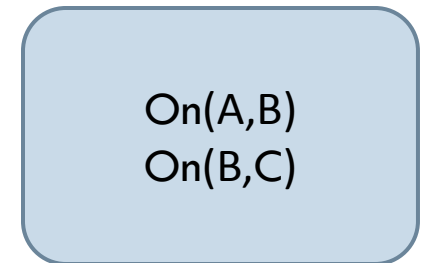
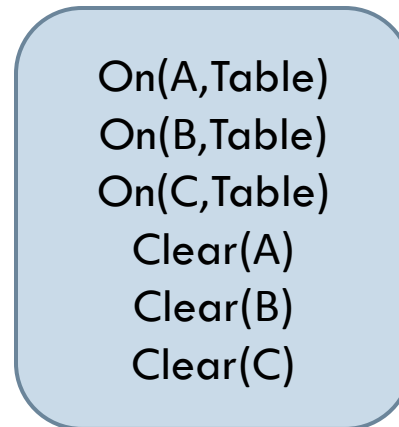
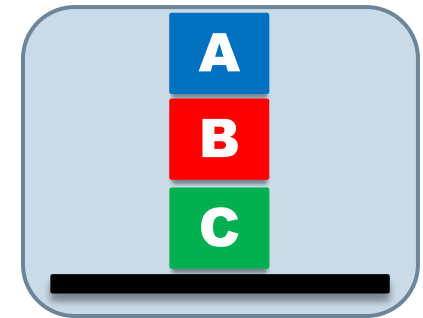
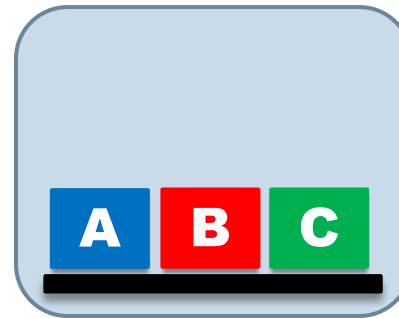
STRIPS planning

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- The initial state and goal condition are described using first-order logic literals:

- ground
- function-free
- positive

* (the list of literals typically forms a logical conjunction)



s_0

g

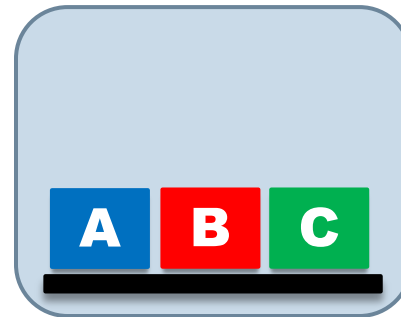
STRIPS planning

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□ Available actions

Move:

- from the table to the top of another block
- from the top of another block to the table
- from the top of one block to the top of another block



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

S_0

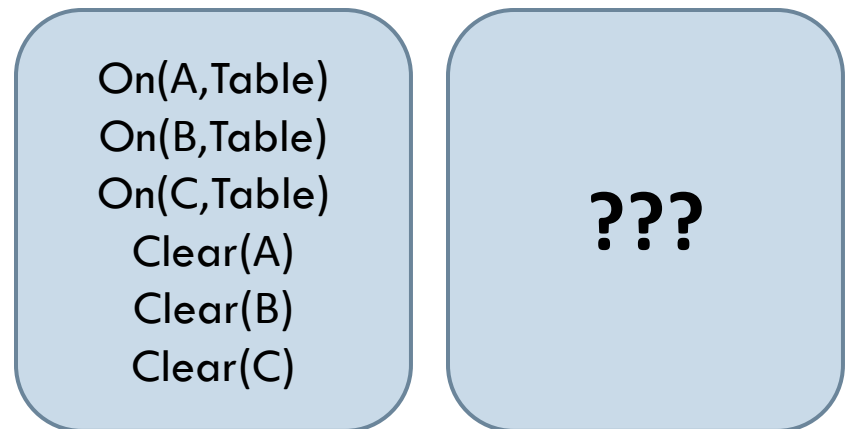
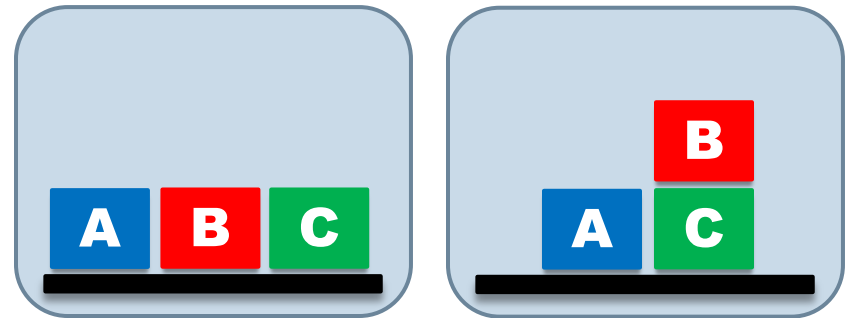
STRIPS planning

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□ Available actions

Move:

- from the table to the top of another block
- from the top of another block to the table
- from the top of one block to the top of another block



Move(B,Table,C)



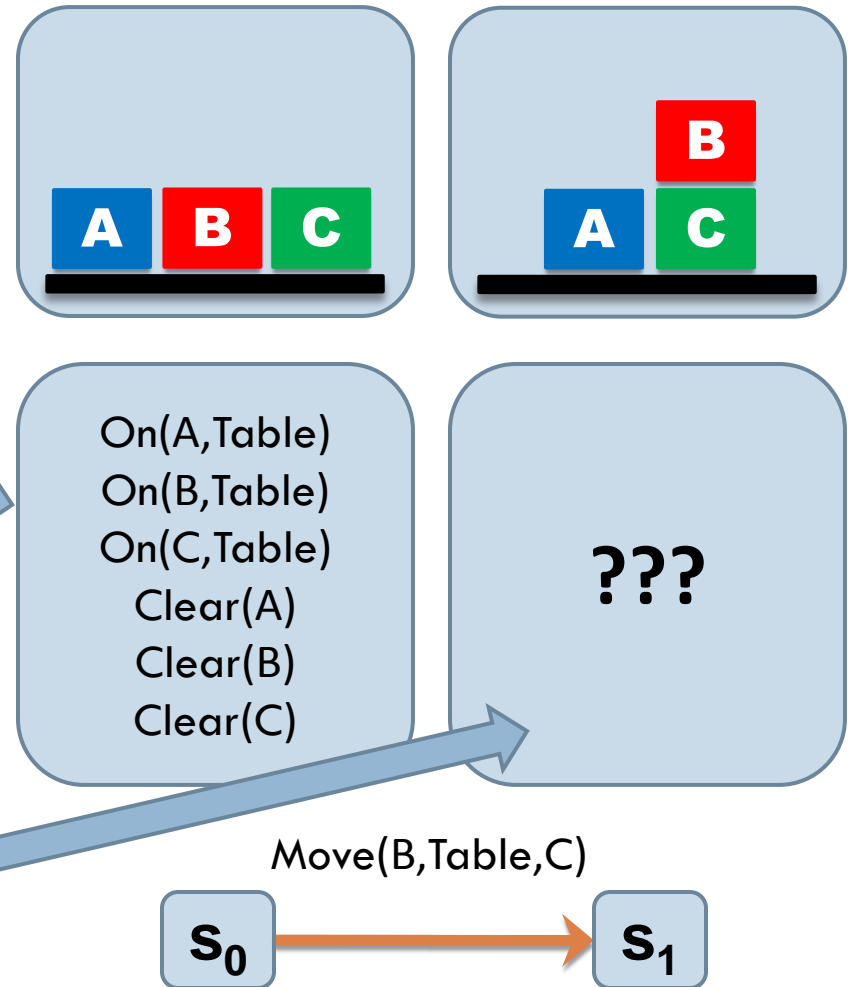
STRIPS planning

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□ Available actions

Move(b,x,y)

- Preconditions: literals denoting what needs to be in the state for the action to be applicable
- Effects: literals denoting how the state is transformed when the action is applied.



STRIPS planning

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□ Available actions

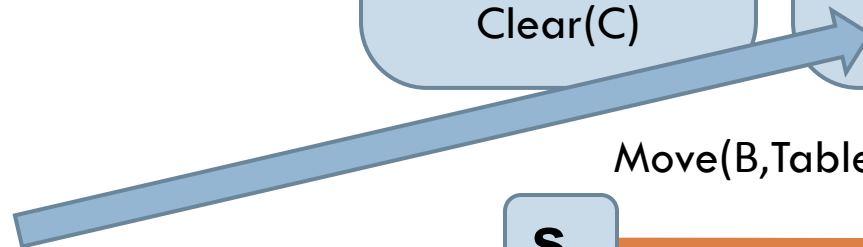
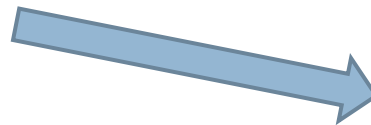
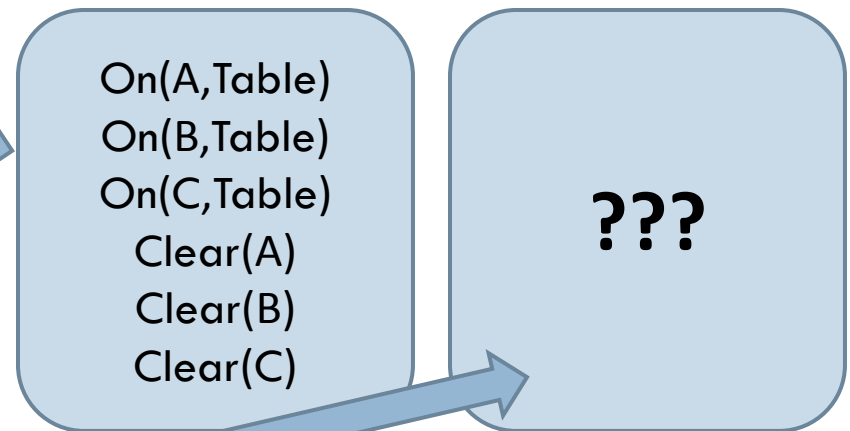
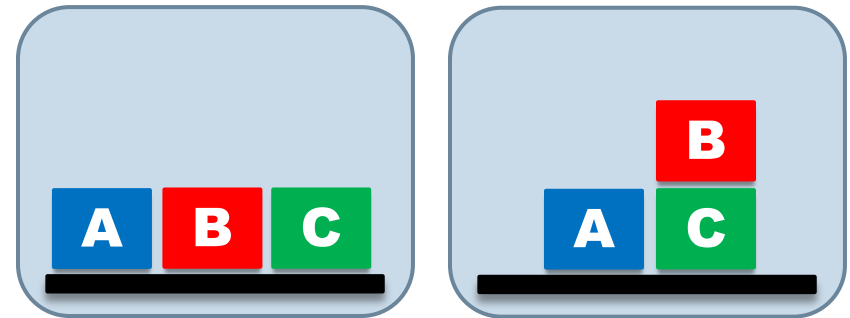
Move(b,x,y)

□ Preconditions:

- On(b,x)
- Clear(b)
- Clear(y)

□ Effects:

- On(b,y)
- Clear(x)
- \neg On(b,x)
- \neg Clear(y)



STRIPS planning

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□ Available actions

Move(B,Table,C)

□ Preconditions:

OK! ■ On(B,Table)

OK! ■ Clear(B)

OK! ■ Clear(C)

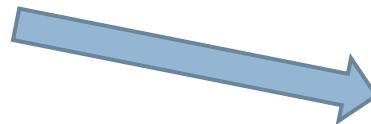
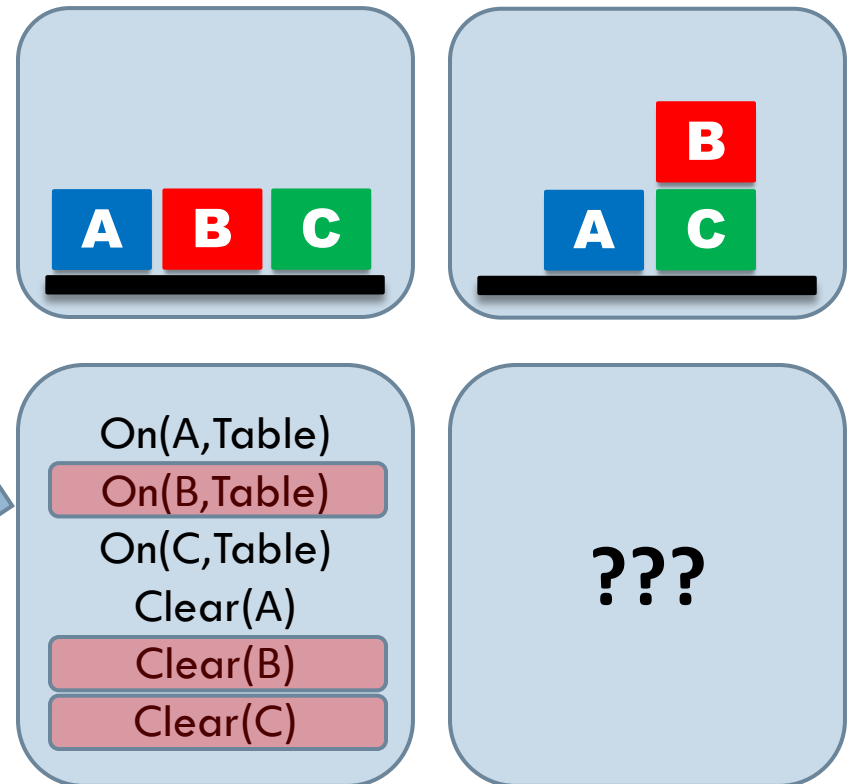
□ Effects:

■ On(B,C)

■ Clear(Table)

■ \neg On(B,Table)

■ \neg Clear(C)



Move(B,Table,C)



STRIPS planning

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□ Available actions

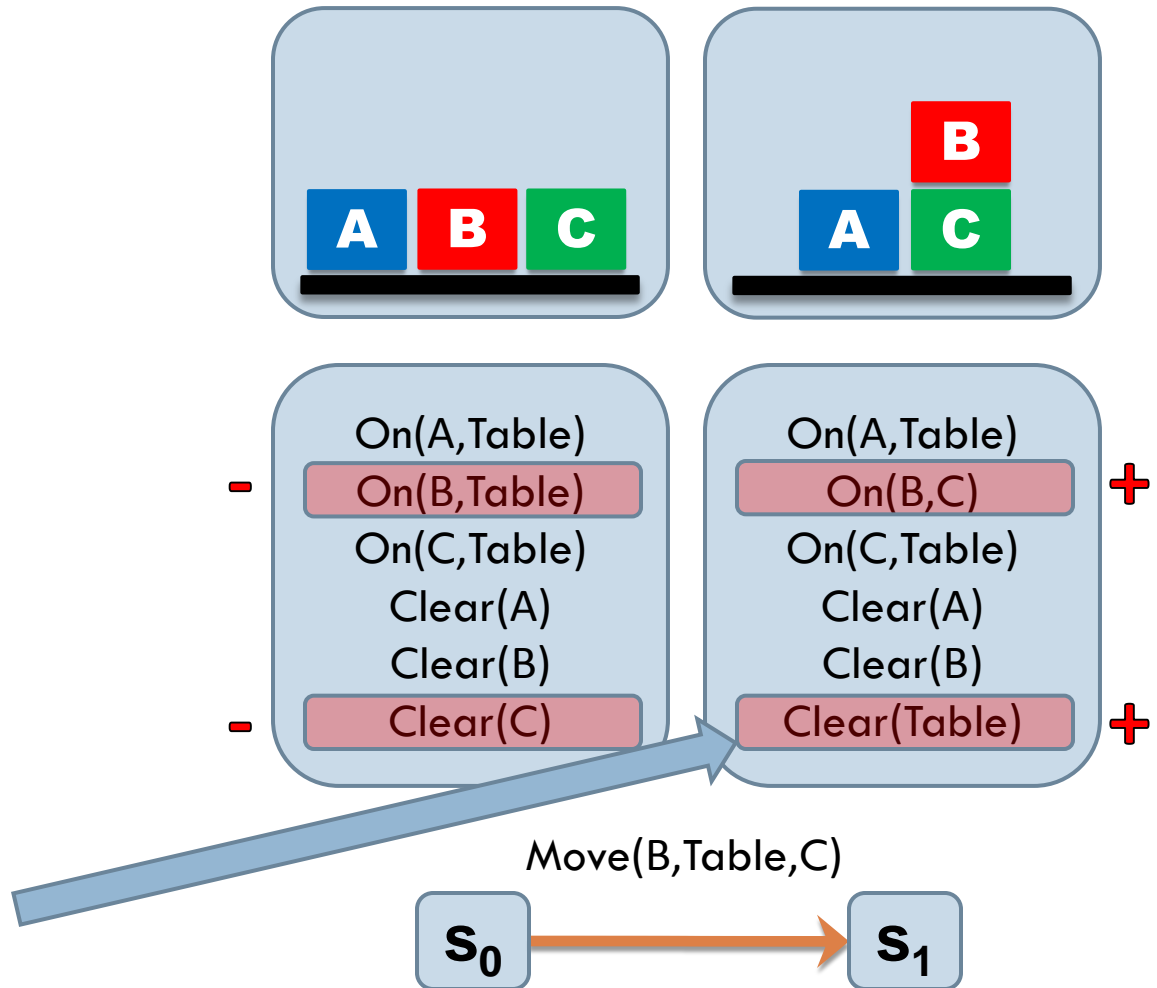
Move(B,Table,C)

□ Preconditions:

- On(B,Table)
- Clear(B)
- Clear(C)

□ Effects:

- + ■ On(B,C)
- + ■ Clear(Table)
- ■ \neg On(B,Table)
- ■ \neg Clear(C)



STRIPS planning

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□ Available actions

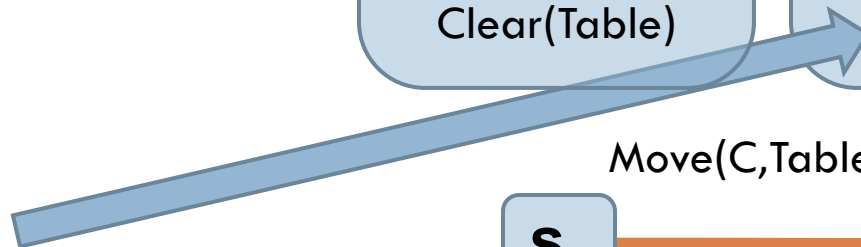
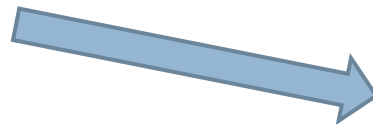
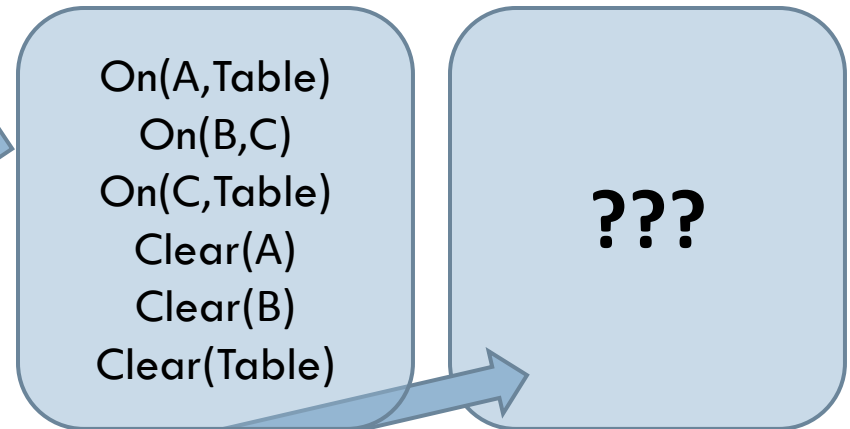
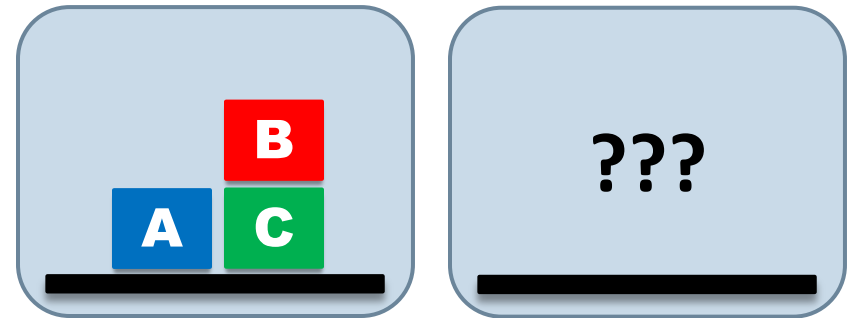
Move(b,x,y)

□ Preconditions:

- On(b,x)
- Clear(b)
- Clear(y)

□ Effects:

- On(b,y)
- Clear(x)
- \neg On(b,x)
- \neg Clear(y)



Move(C, Table, A)



STRIPS planning

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□ Available actions

Move(C,Table,A)

□ Preconditions:

OK! ■ On(C,Table)

X ■ Clear(C)

OK! ■ Clear(A)

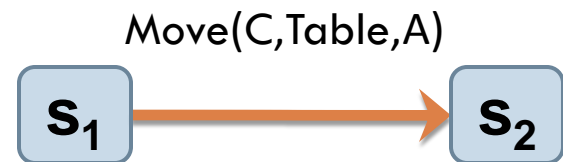
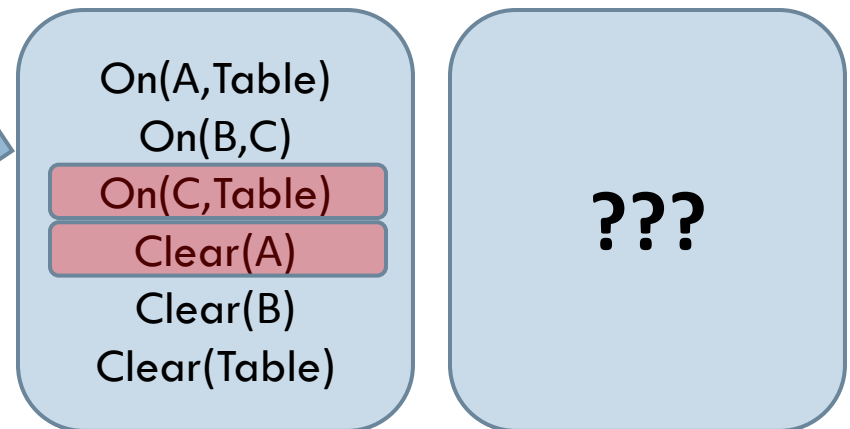
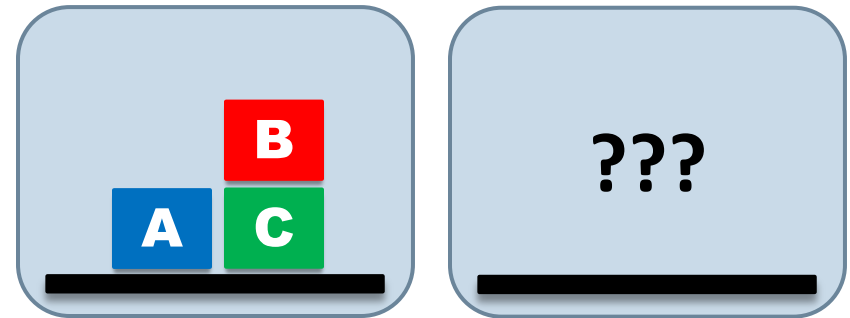
□ Effects:

■ On(C,A)

■ Clear(Table)

■ \neg On(C,Table)

■ \neg Clear(A)



STRIPS planning

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□ Available actions

Move(A,Table,B)

□ Preconditions:

OK! ■ On(A,Table)

OK! ■ Clear(A)

OK! ■ Clear(B)

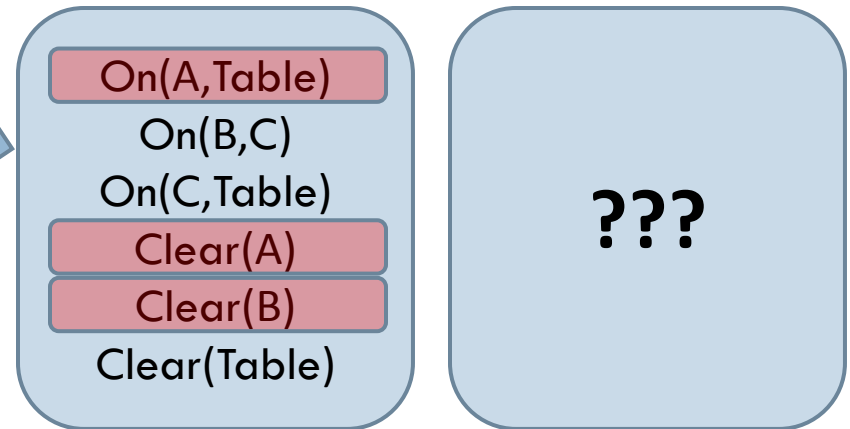
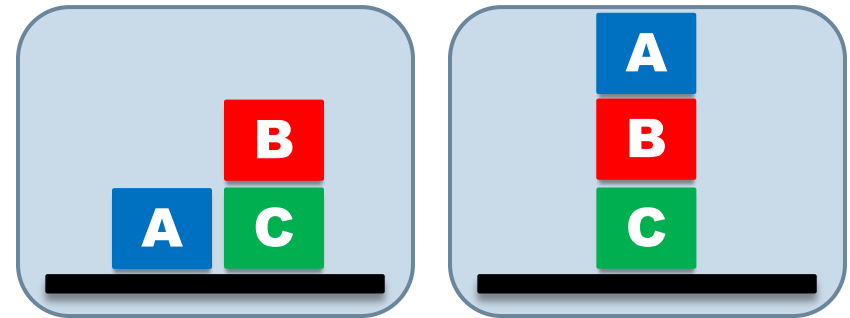
□ Effects:

■ On(A,B)

■ Clear(Table)

■ \neg On(A,Table)

■ \neg Clear(B)



Move(A,Table,B)



STRIPS planning

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□ Available actions

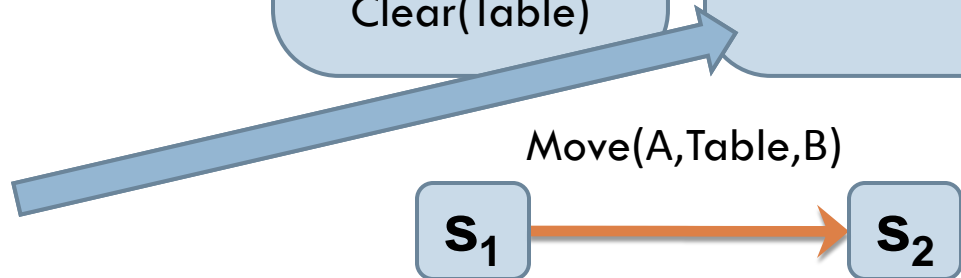
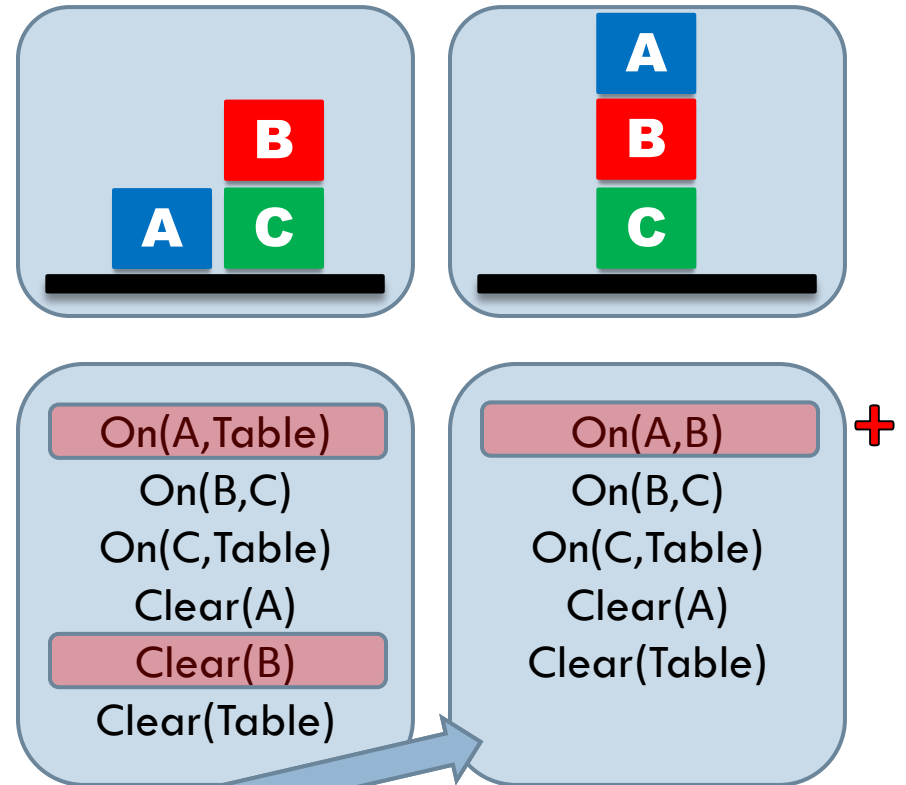
Move(A,Table,B)

□ Preconditions:

- On(A,Table)
- Clear(A)
- Clear(B)

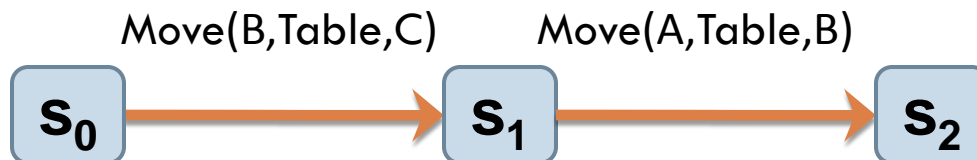
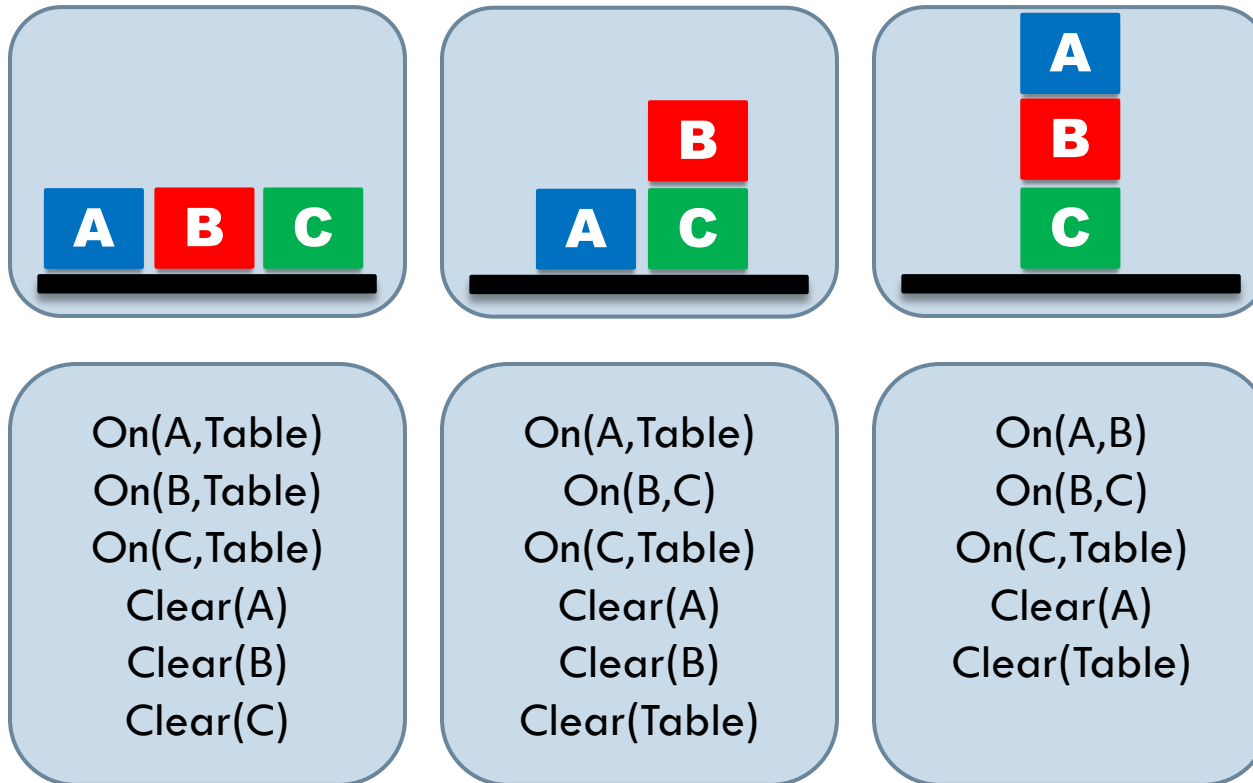
□ Effects:

- + ■ On(A,B)
- + ■ Clear(Table)
- ■ \neg On(A,Table)
- ■ \neg Clear(B)



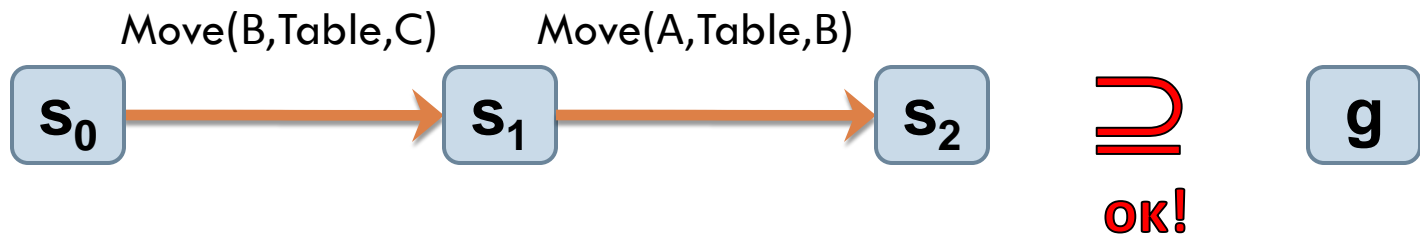
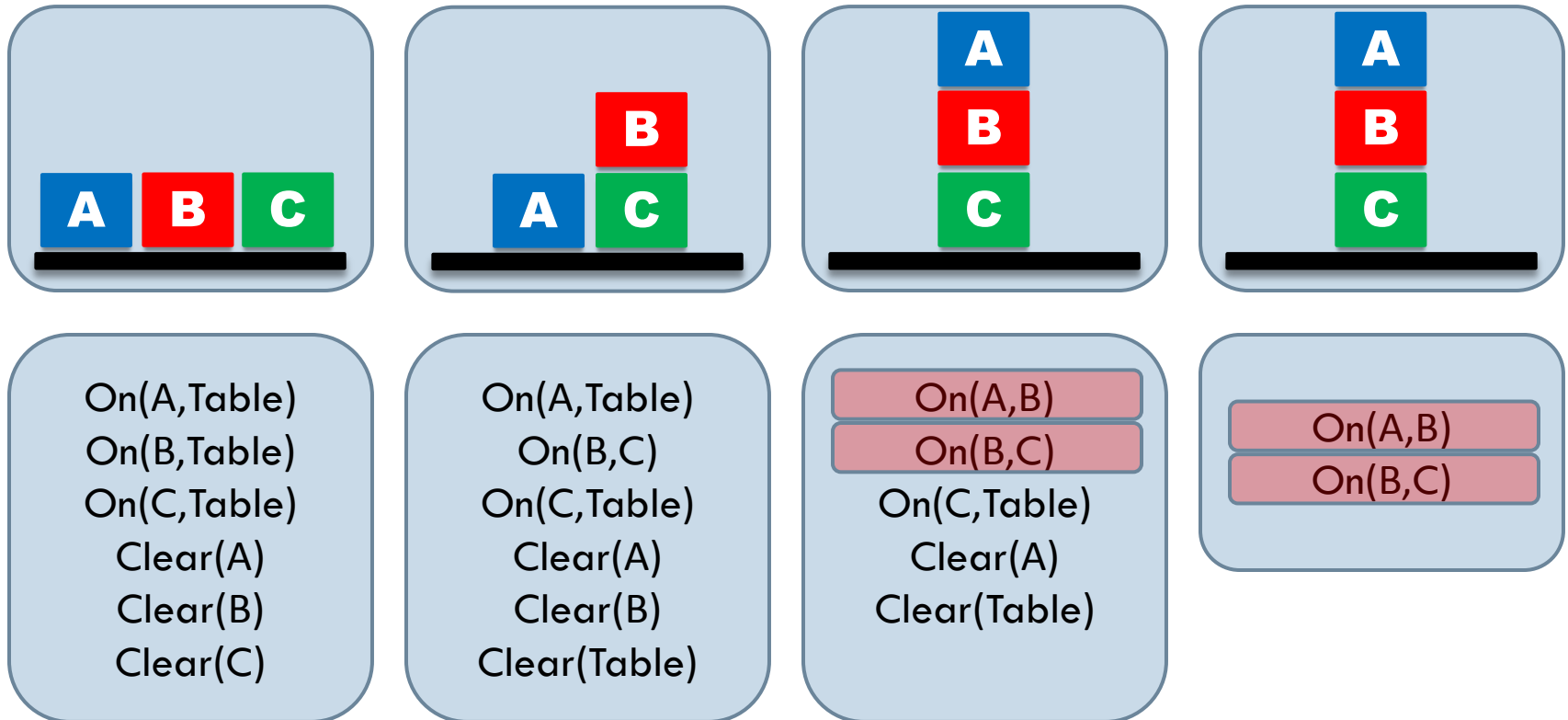
STRIPS planning

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STRIPS planning

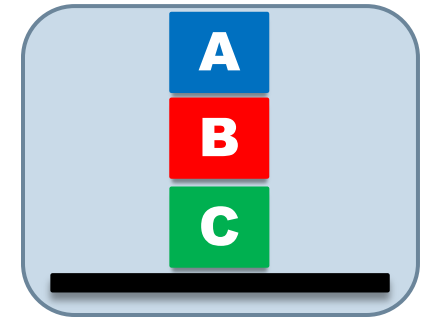
36



STRIPS planning

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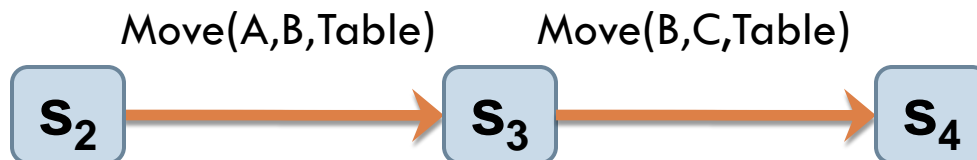
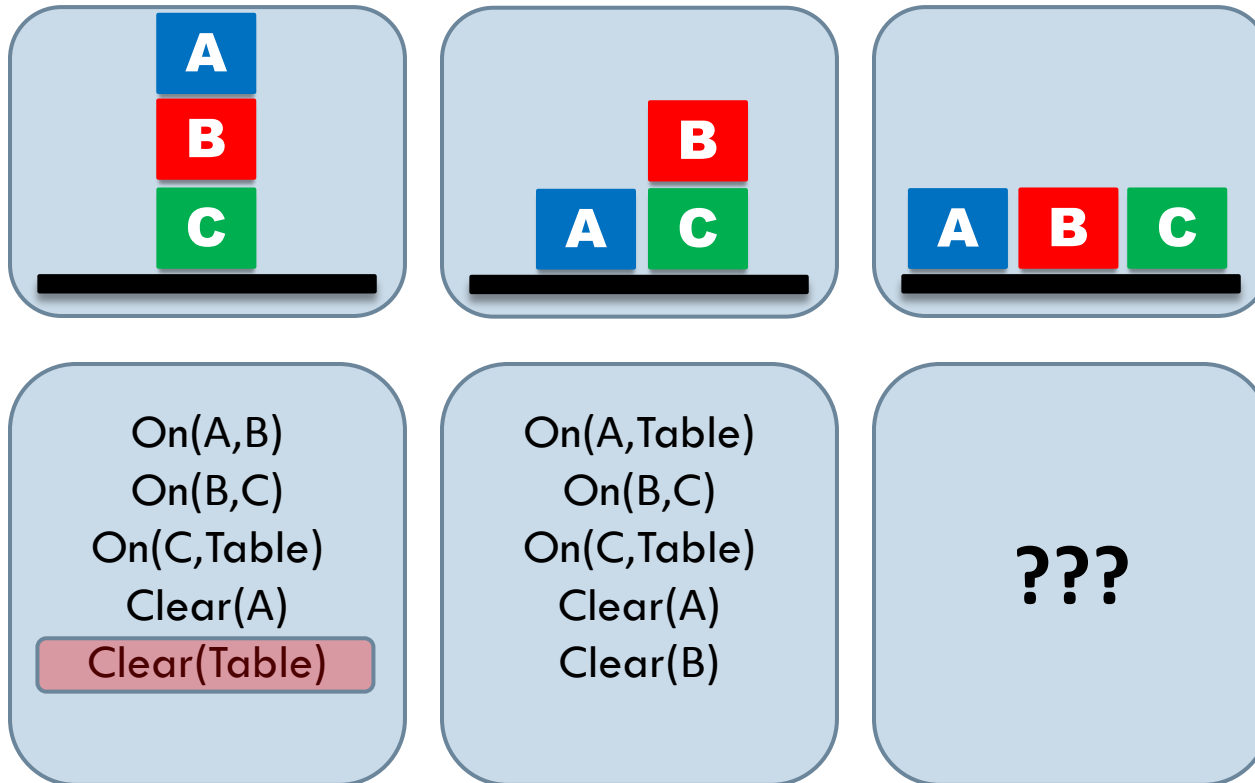
- Is our STRIPS representation of the blocks world correct?
- Consider moving back blocks A and B back to the table



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

STRIPS planning

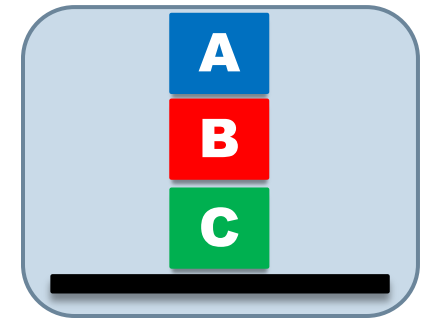
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STRIPS planning

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- Is our STRIPS representation of the blocks world correct?
- Consider moving back blocks A and B back to the table
- Clear(Table) needs to be treated differently
 - Move(b,x,y)
 - MoveToTable(b,x)



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

STRIPS planning

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- $\text{Init}(\text{On}(A, \text{Table}) \wedge \text{On}(B, \text{Table}) \wedge \text{On}(C, \text{Table})$
 $\wedge \text{Clear}(A) \wedge \text{Clear}(B) \wedge \text{Clear}(C))$
- $\text{Goal}(\text{On}(A, B) \wedge \text{On}(B, C))$
- $\text{Action}(\text{Move}(b, x, y),$
PRECONDITIONS: $\text{On}(b, x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$
EFFECTS: $\text{On}(b, y) \wedge \text{Clear}(x) \wedge \neg \text{On}(b, x)$
 $\wedge \neg \text{Clear}(y))$
- $\text{Action}(\text{MoveToTable}(b, x),$
PRECONDITIONS: $\text{On}(b, x) \wedge \text{Clear}(b)$
EFFECTS: $\text{On}(b, \text{Table}) \wedge \text{Clear}(x) \wedge \neg \text{On}(b, x))$

STRIPS planning

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! Variables that appear in preconditions and effects need to be parameters of the action schema

- Action(Move(b,x,y),
PRECONDITIONS: $\text{On}(b,x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$
EFFECTS: $\text{On}(b,y) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x)$
 $\wedge \neg\text{Clear}(y)$)
 - Action(MoveToTable(b,x),
PRECONDITIONS: $\text{On}(b,x) \wedge \text{Clear}(b)$
EFFECTS: $\text{On}(b,\text{Table}) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x)$)
-

STRIPS planning

42

! Variables that appear in preconditions and effects need to be parameters of the action schema

- Action(Move(b,x,y),
PRECONDITIONS: $\text{On}(b,x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$
EFFECTS: $\text{On}(b,y) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x)$
 $\wedge \neg\text{Clear}(y)$)
 - Action(MoveToTable(b,x),
PRECONDITIONS: $\text{On}(b,x) \wedge \text{Clear}(b)$
EFFECTS: $\text{On}(b,\text{Table}) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x)$)
-

STRIPS planning

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! Variables that appear in preconditions and effects need to be parameters of the action schema

- Action(Move(b,x,y),
PRECONDITIONS: $\text{On}(b,x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$
EFFECTS: $\text{On}(b,y) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x)$
 $\wedge \neg\text{Clear}(y)$)
- Action(MoveToTable(b,x),
PRECONDITIONS: $\text{On}(b,x) \wedge \text{Clear}(b)$
EFFECTS: $\text{On}(b,\text{Table}) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x)$)

STRIPS planning

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- $\text{Init}(\text{On}(A, \text{Table}) \wedge \text{On}(B, \text{Table}) \wedge \text{On}(C, \text{Table})$
 $\wedge \text{Clear}(A) \wedge \text{Clear}(B) \wedge \text{Clear}(C))$
- $\text{Goal}(\text{On}(A, B) \wedge \text{On}(B, C))$
- $\text{Action}(\text{Move}(b, x, y),$
PRECONDITIONS: $\text{On}(b, x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$
EFFECTS: $\text{On}(b, y) \wedge \text{Clear}(x) \wedge \neg \text{On}(b, x)$
 $\wedge \neg \text{Clear}(y))$
- $\text{Action}(\text{MoveToTable}(b, x),$
PRECONDITIONS: $\text{On}(b, x) \wedge \text{Clear}(b)$
EFFECTS: $\text{On}(b, \text{Table}) \wedge \text{Clear}(x) \wedge \neg \text{On}(b, x))$

! Simplified STRIPS version of Figure 11.4 in AIMA 2nd Ed.

STRIPS planning

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□ Gripper domain

- $\text{Init}(\text{On-Table}(A) \wedge \text{On-Table}(B) \wedge \text{On-table}(C) \wedge \text{Clear}(A) \wedge \text{Clear}(B) \wedge \text{Clear}(C) \wedge \text{Grip-Empty})$
- $\text{Goal}(\text{On}(A,B) \wedge \text{On}(B,C))$
- $\text{Action}(\text{Pick-up}(x), \dots)$
- $\text{Action}(\text{Put-down}(x), \dots)$
- $\text{Action}(\text{Stack}(top,below), \dots)$
- $\text{Action}(\text{Unstack}(top,below), \dots)$

STRIPS planning

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- Reasoning about action and change
- Since 1971 that STRIPS planning was proposed by R. E. Fikes and N. J. Nilsson, more expressive planning formalisms have been developed based on STRIPS!
 - ▣ ADL allows open worlds, conditional effects, quantifiers [Pednault 1988]
- Situation calculus [McCarthy, Hayes 1969] [Reiter 2001] is based on first-order logic allowing rich representations
 - ▣ Action languages A, Fluent calculus, Event calculus, ...

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▣ Material

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