

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

STRIPS planning

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- What we have seen so far
 - ▣ The STRIPS formalism for specifying planning problems
 - ▣ Solving planning problems using state-based search
 - ▣ Progression planning
 - ▣ Simple heuristics for progression planning
- Can we take advantage of the information that action schemas hold to do better?

Planning graphs

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- Action schemas provide useful information about the **interaction** between actions
- E.g., action A cannot take place right after B because A cancels a precondition of B
- There are many more (and more complex) conditions that would be valuable to identify!

Course overview

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- Lecture 5: Employing STRIPS planning in games: SimpleFPS, iThinkUnity3D, SmartWorkersRTS
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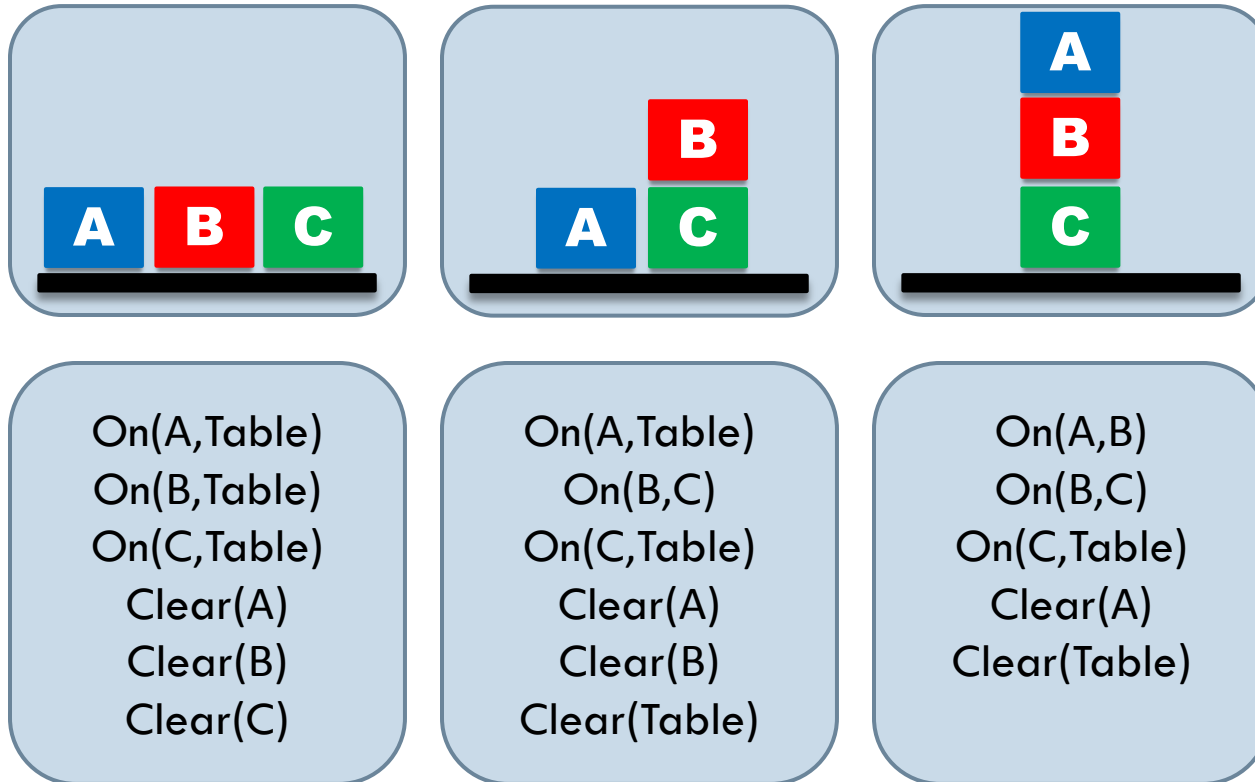
Planning graphs

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- Planning graph
 - ▣ Special data structure
 - ▣ Consists of a sequence of **levels**
 - ▣ Stores the effects of **all applicable actions** at every level as if they were all happening **concurrently**
 - ▣ Stores some basic **mutual exclusion** constraints between actions and literals

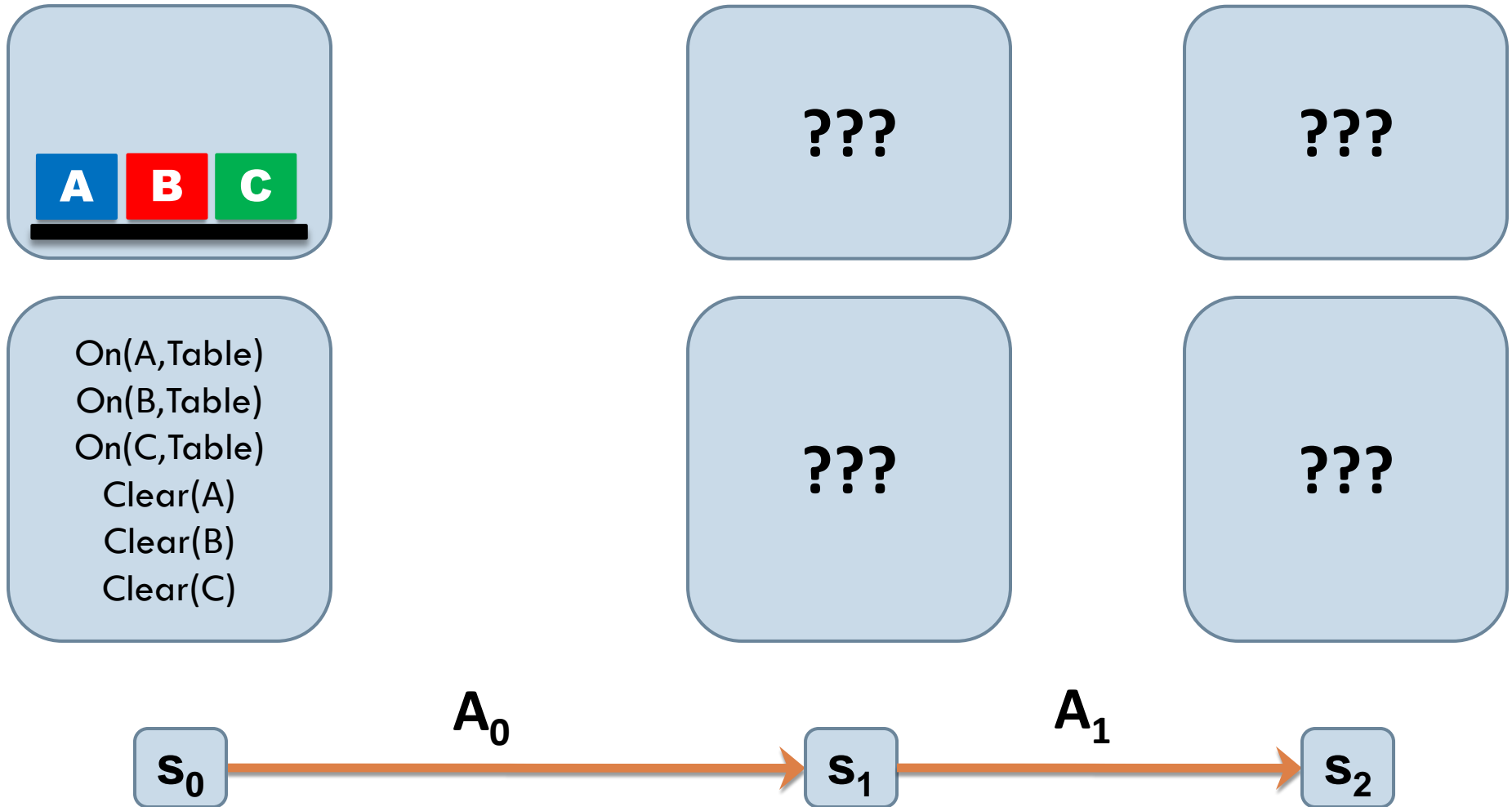
Planning graphs

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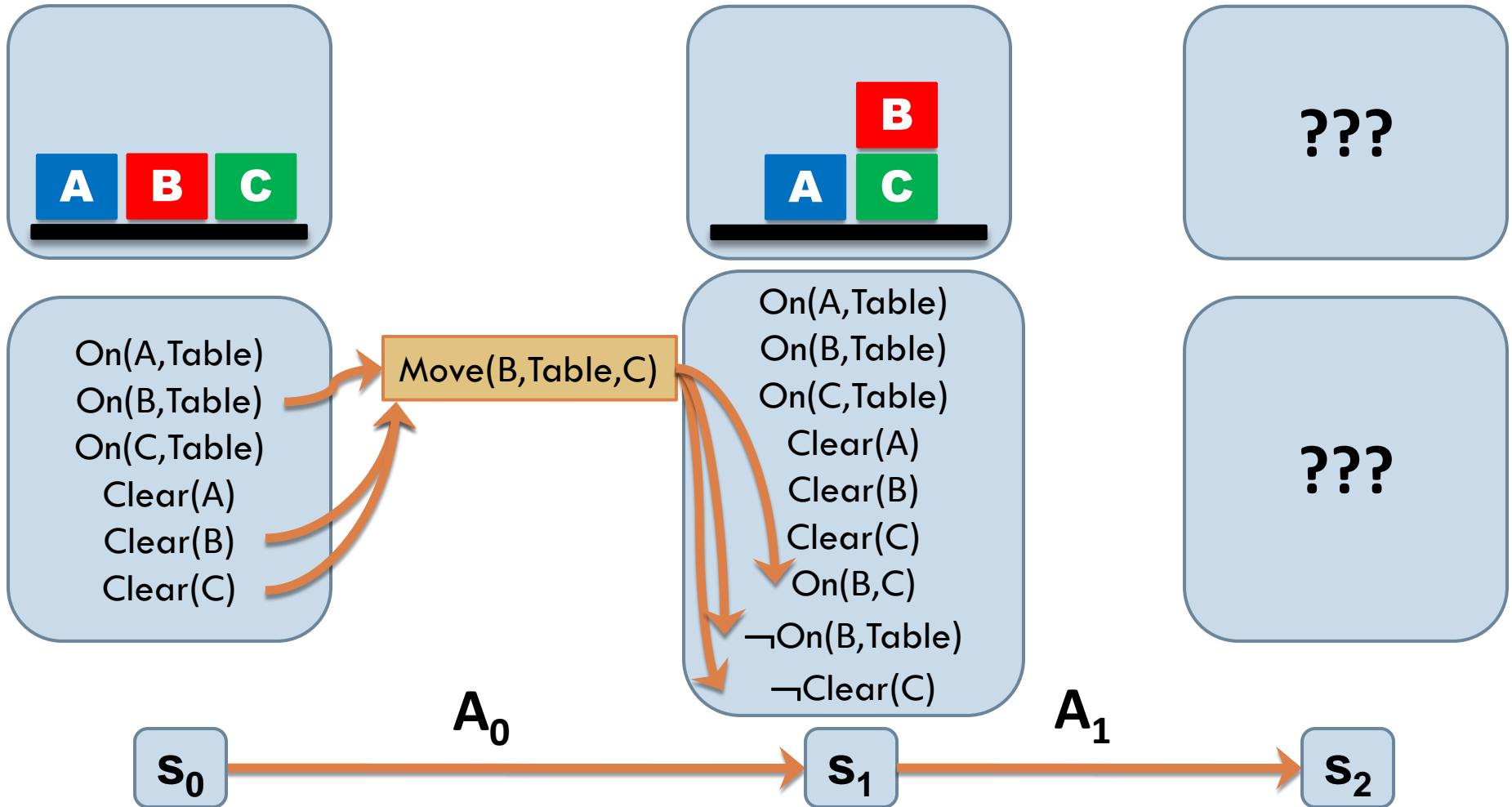
Planning graphs

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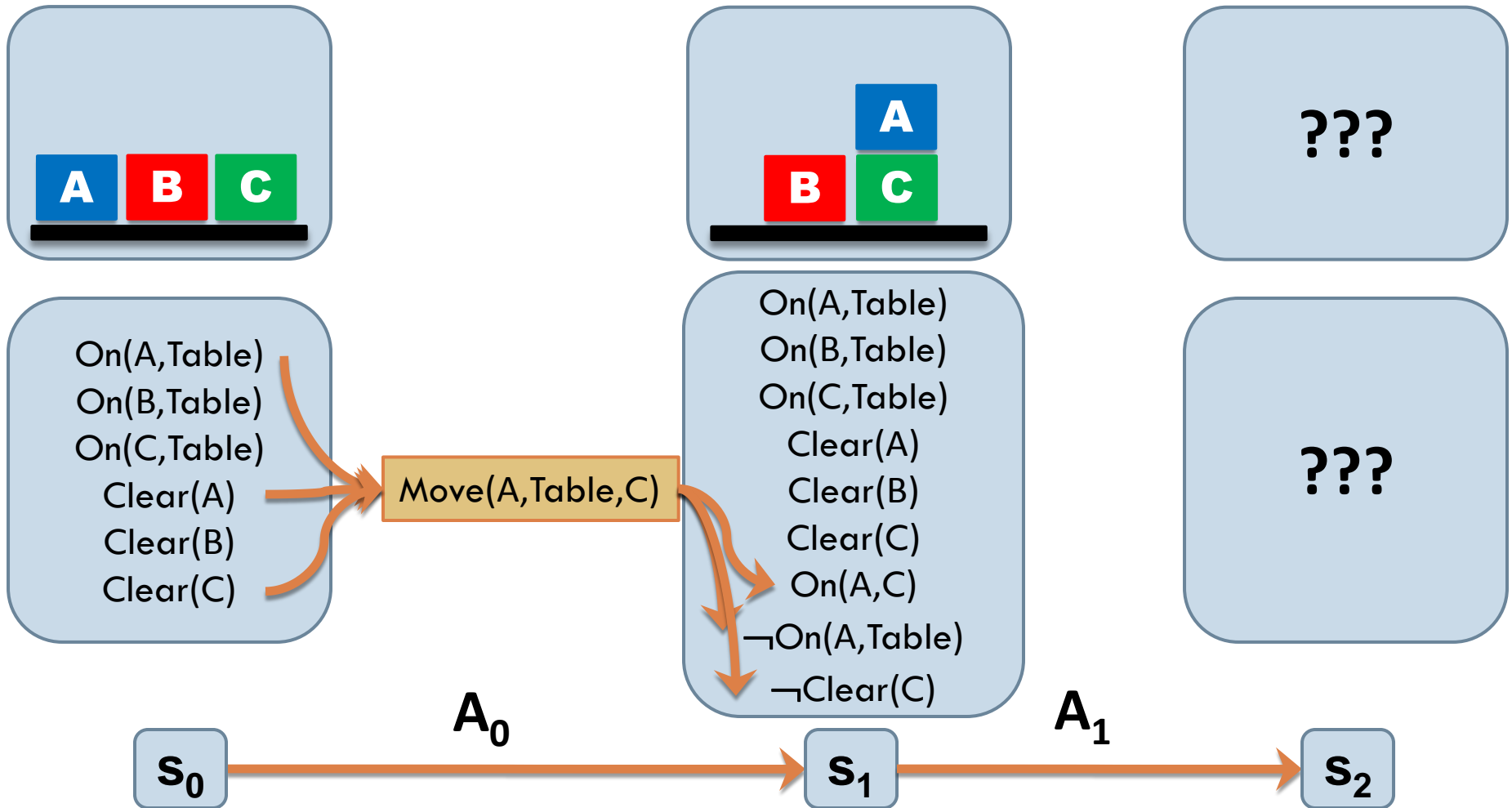
Planning graphs

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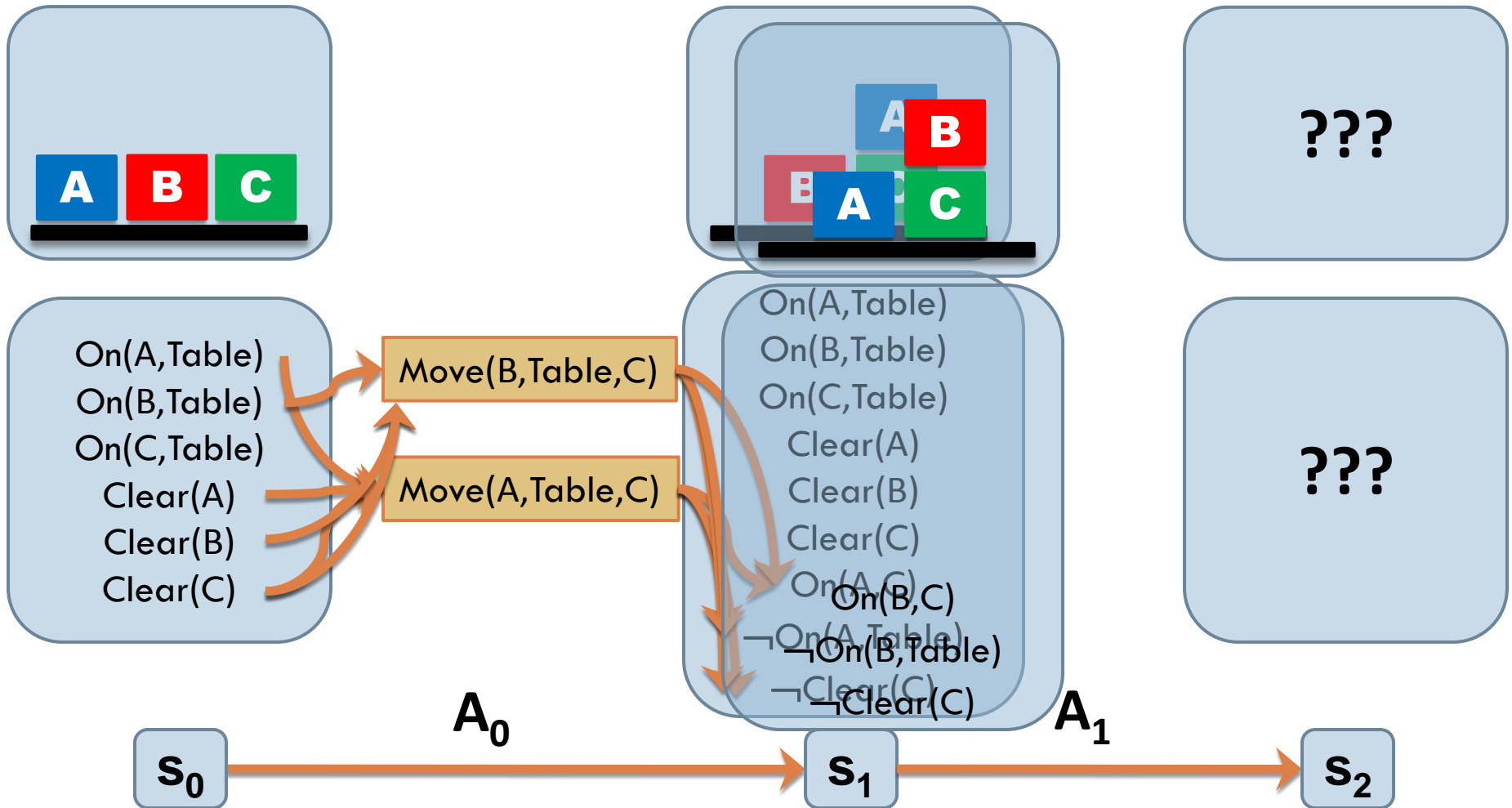
Planning graphs

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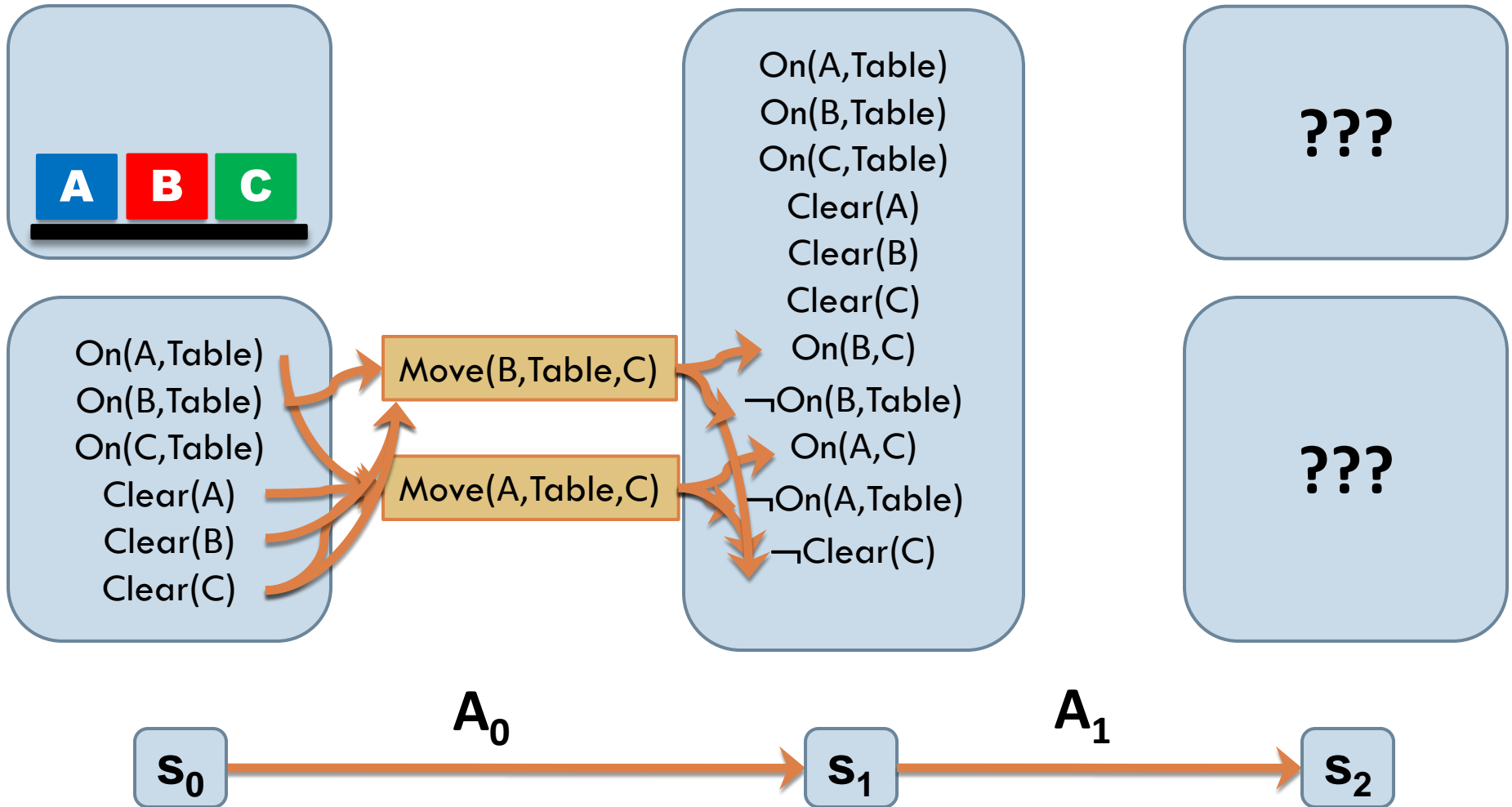
Planning graphs

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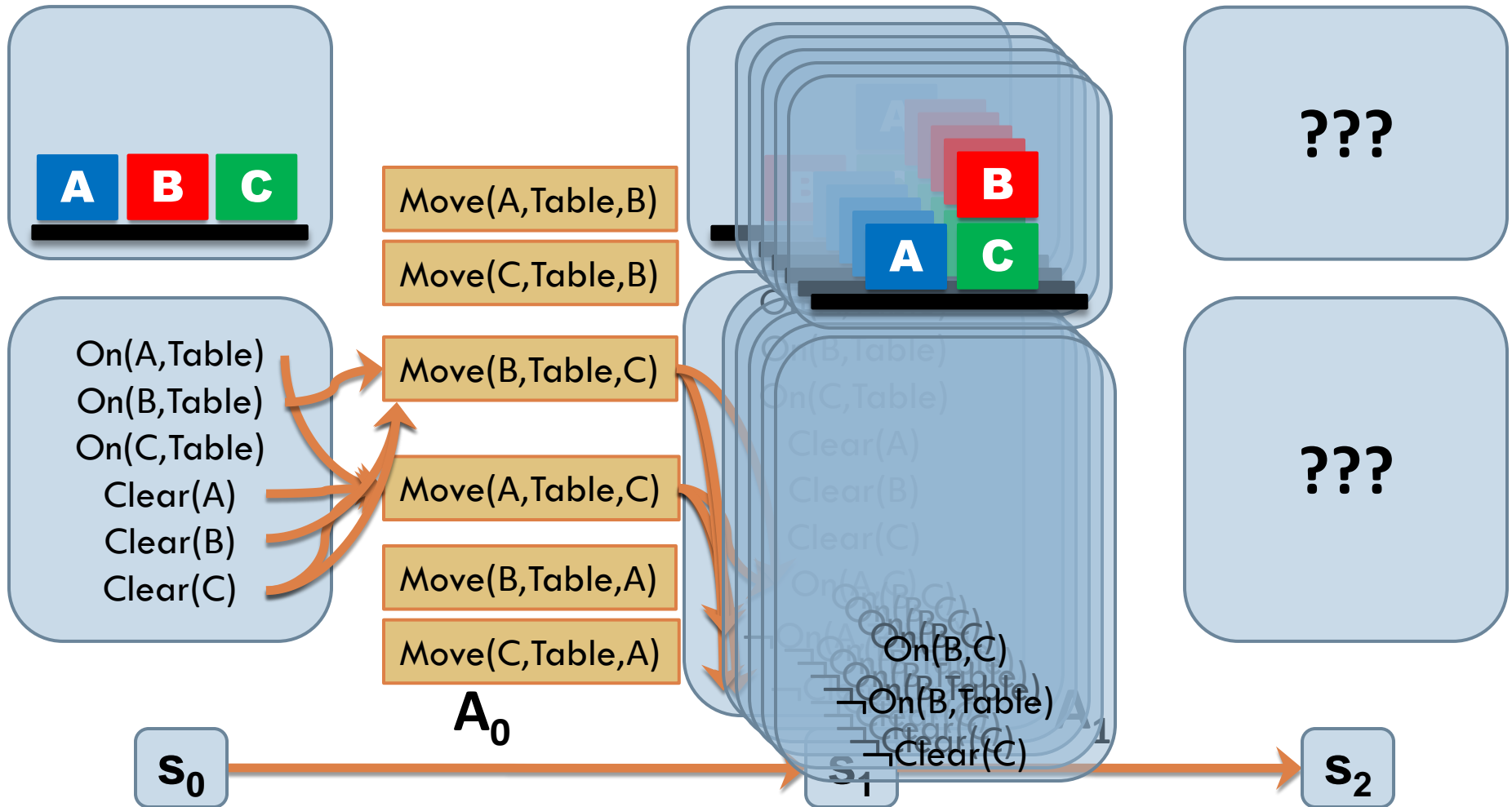
Planning graphs

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Planning graphs

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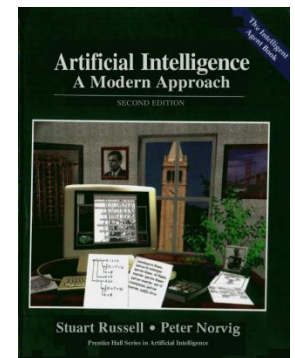


Planning graphs

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- Planning graph
 - Special **data structure**
 - Consists of a **sequence of levels**
 - Stores the effects of **all applicable actions** at every level as if they were all happening **concurrently**
 - Stores some basic **mutual exclusion** constraints between actions and literals

□ .. **Let's see an (even) simpler example!**



Planning graphs

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- Init(Have(Cake))
- Goal(Have(Cake) \wedge Eaten(Cake))
- Action(Eat(Cake)
PRECONDITIONS: Have(Cake)
EFFECTS: \neg Have(Cake) \wedge Eaten(Cake))
- Action(Bake(Cake),
PRECONDITIONS: \neg Have(Cake)
EFFECTS: Have(Cake))

Planning graphs

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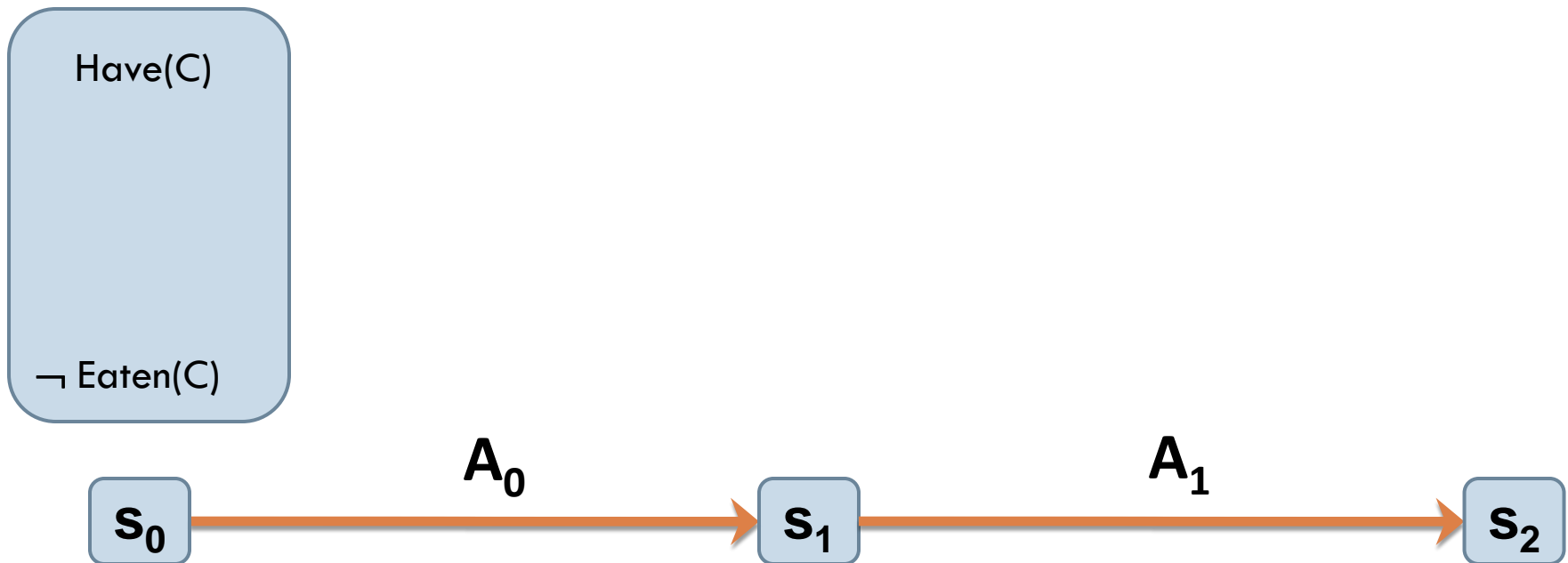
- Planning graph
 - ▣ Consists of a sequence of levels that specify how the initial state is transformed under the effects of actions

 - ▣ At each level i we specify
 - A list of literals S_i
 - A list of actions A_i
 - 4 kinds of constraints or mutual exclusion links between literals in S_i and actions in A_i

Planning graphs

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- Level 0
 - S_0 : the **positive literals** of the initial state **as well** as the **negative literals** implied by the closed world assumption

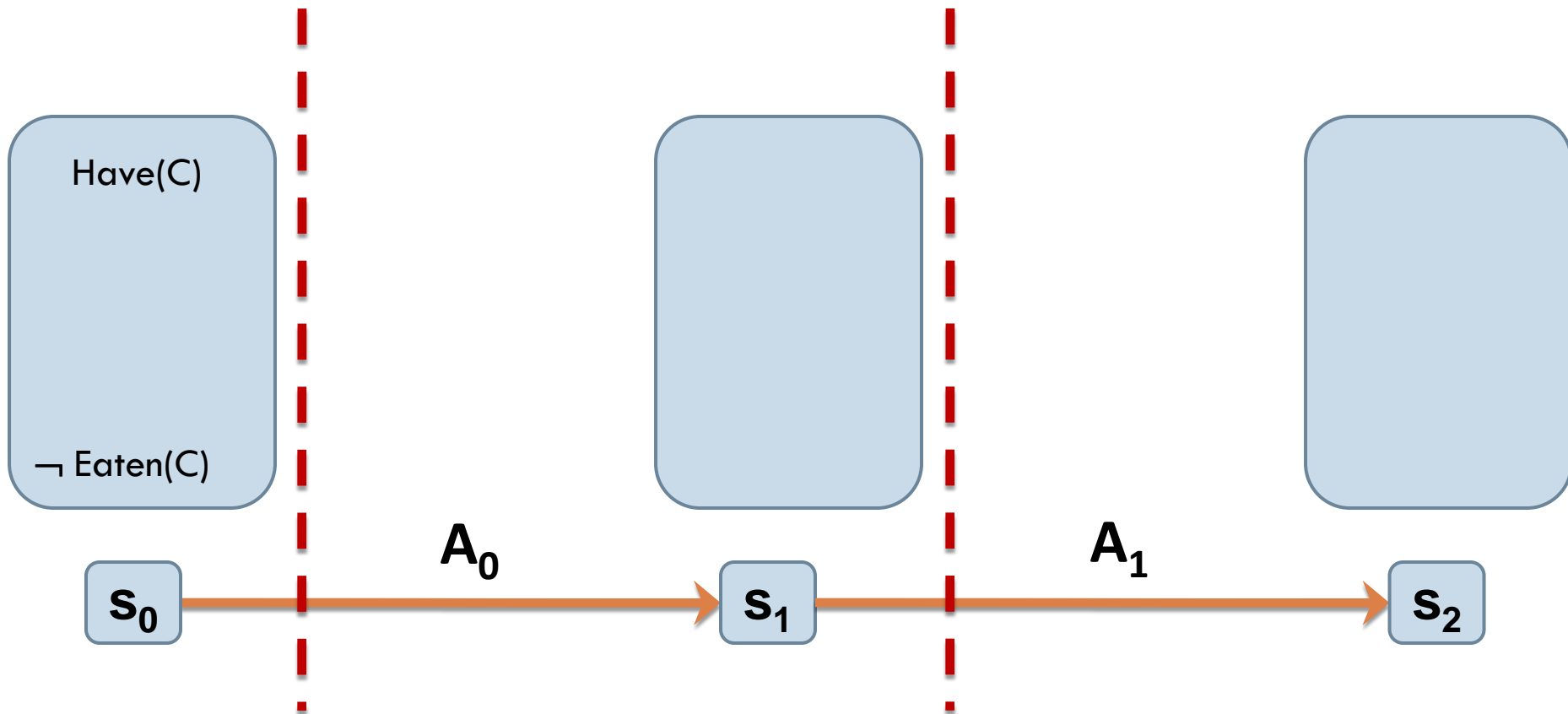


Planning graphs

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□ Level 0

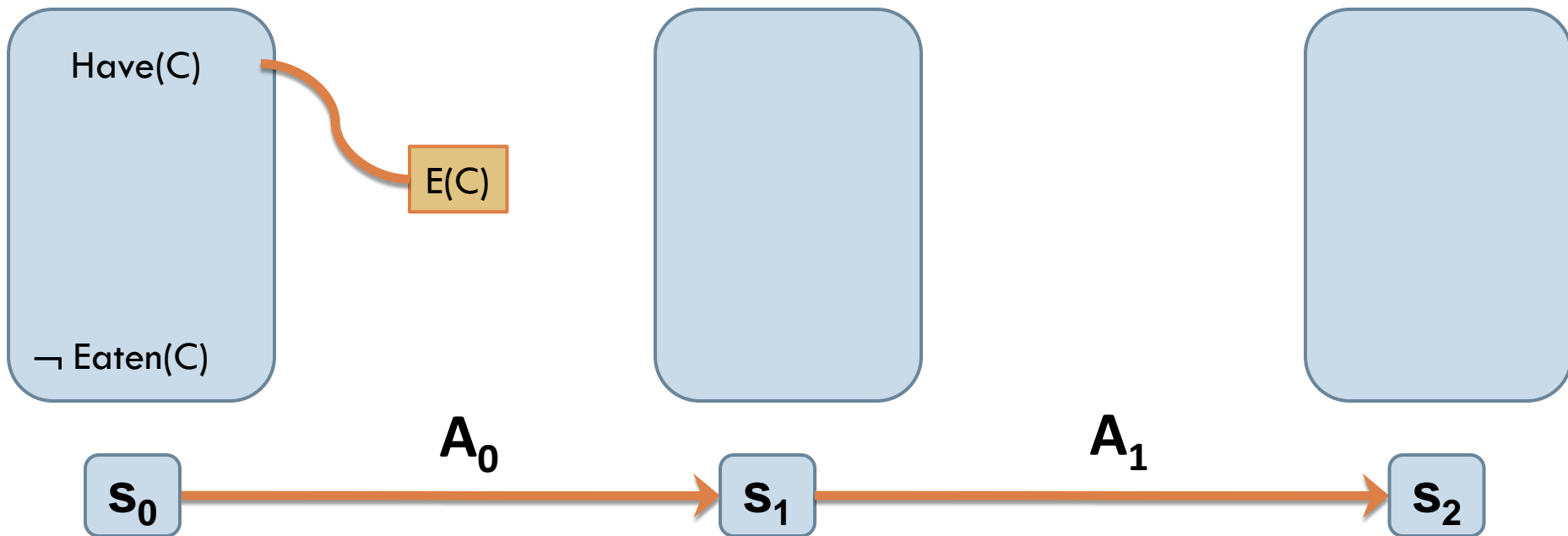
- We will see now how to specify A_0 and S_1



Planning graphs

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- Level 0
 - A_0 : the **applicable actions** in the initial state

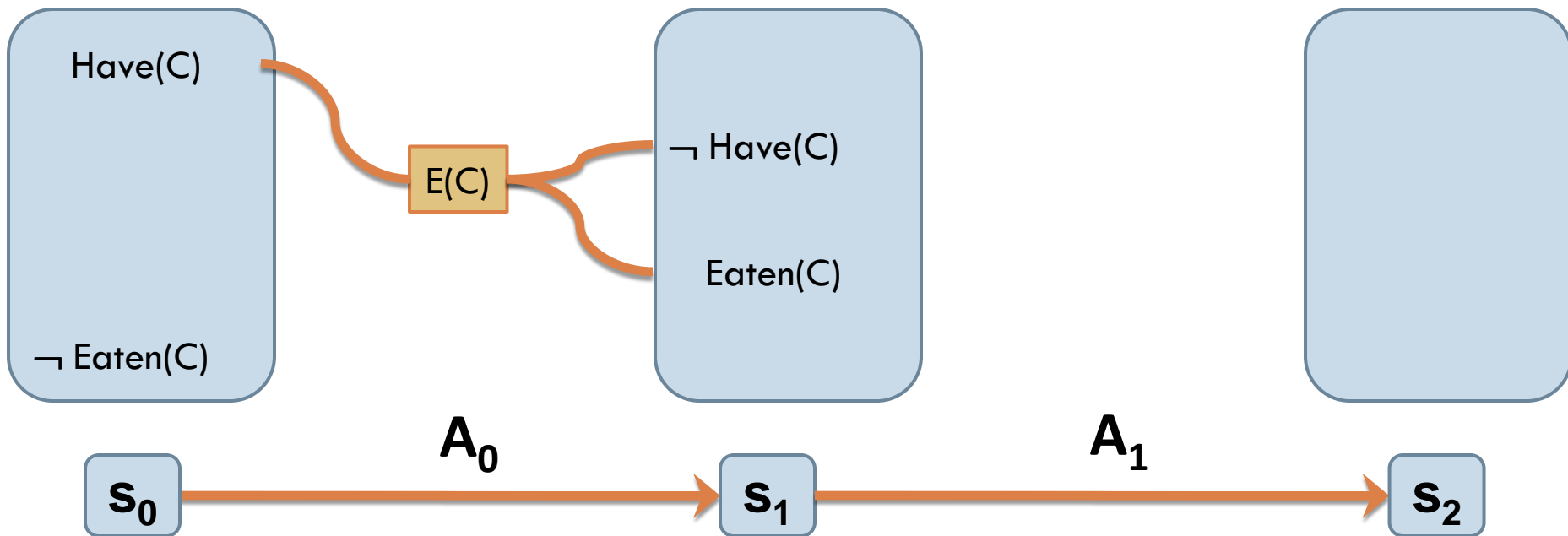


Planning graphs

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□ Level 0

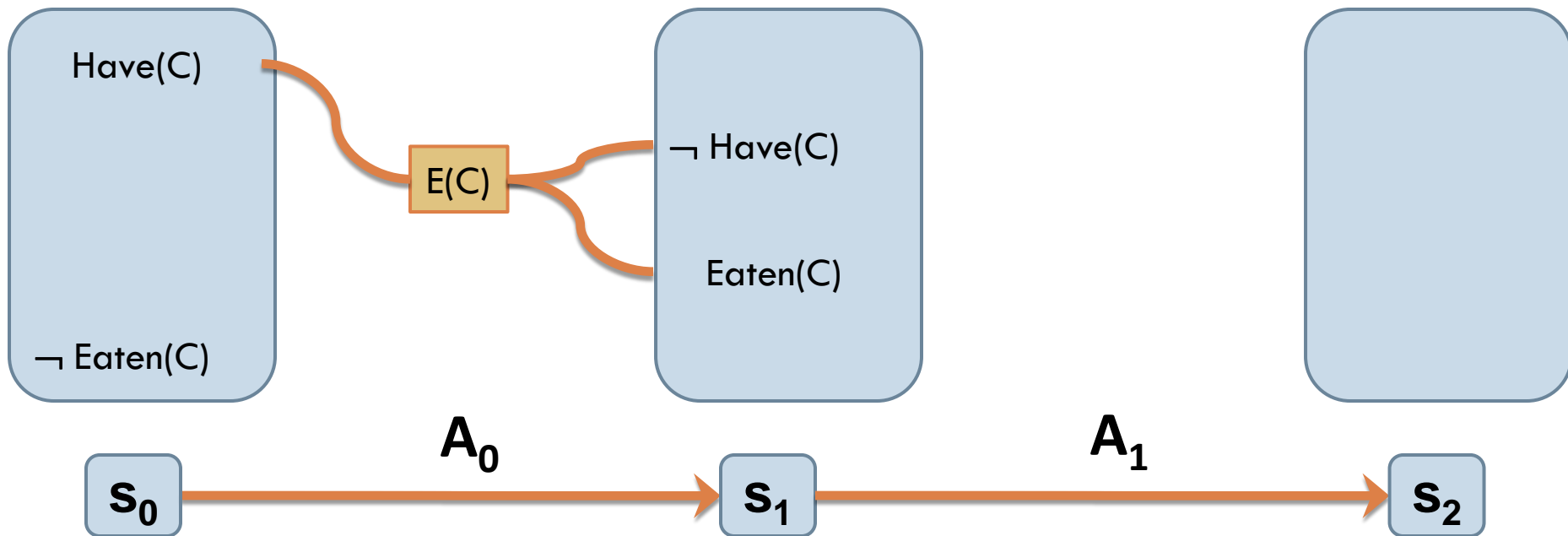
- S_1 : the **effects** of actions that appear in A_0



Planning graphs

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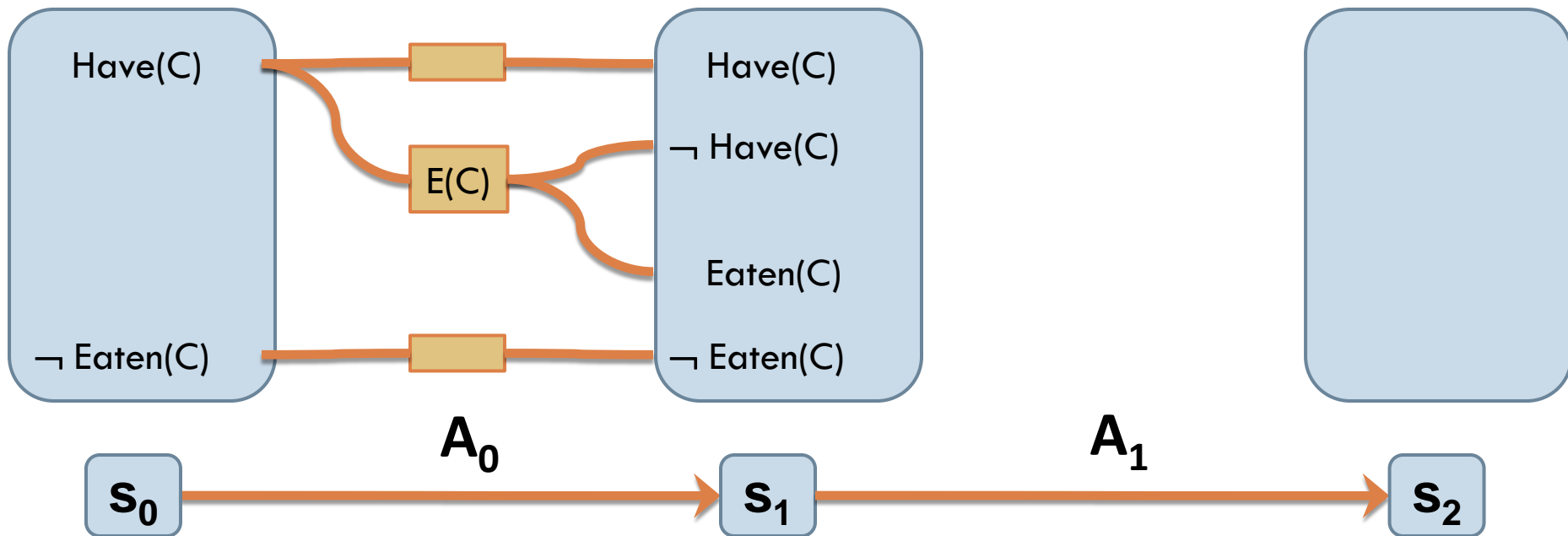
- Level 0
 - We're not done yet!



Planning graphs

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- Level 0
 - We're not done yet!
 - Also add **persistence actions** that denote “inaction”

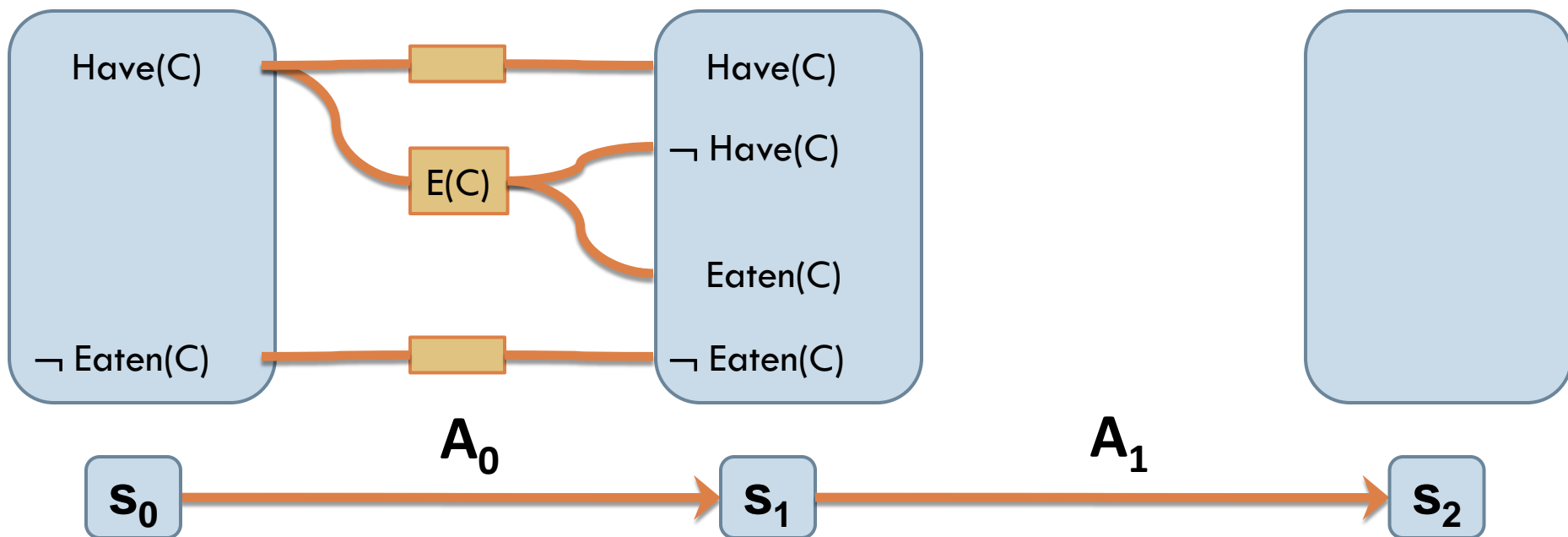


Planning graphs

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□ Level 0

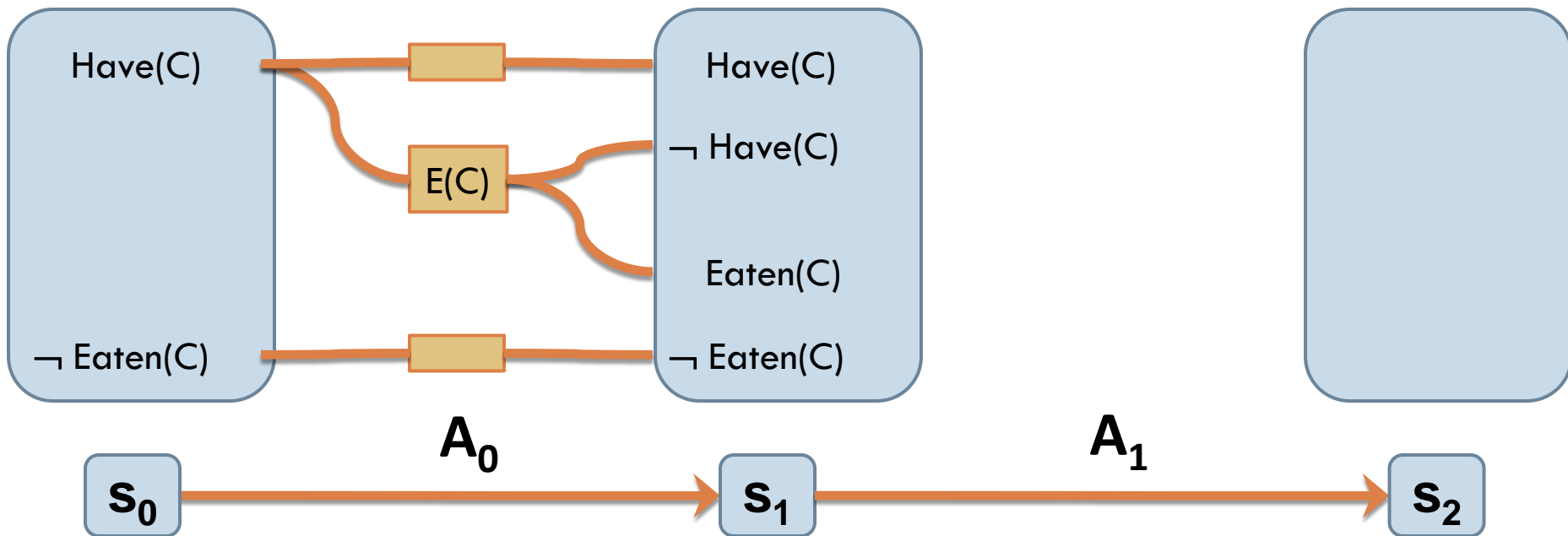
- A persistent action specifies that a literal **does not change truth value** between levels, e.g., here $\neg \text{Eaten}(C)$



Planning graphs

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- Level 0
 - We're not done yet!
 - **Mutual exclusion links**



Planning graphs

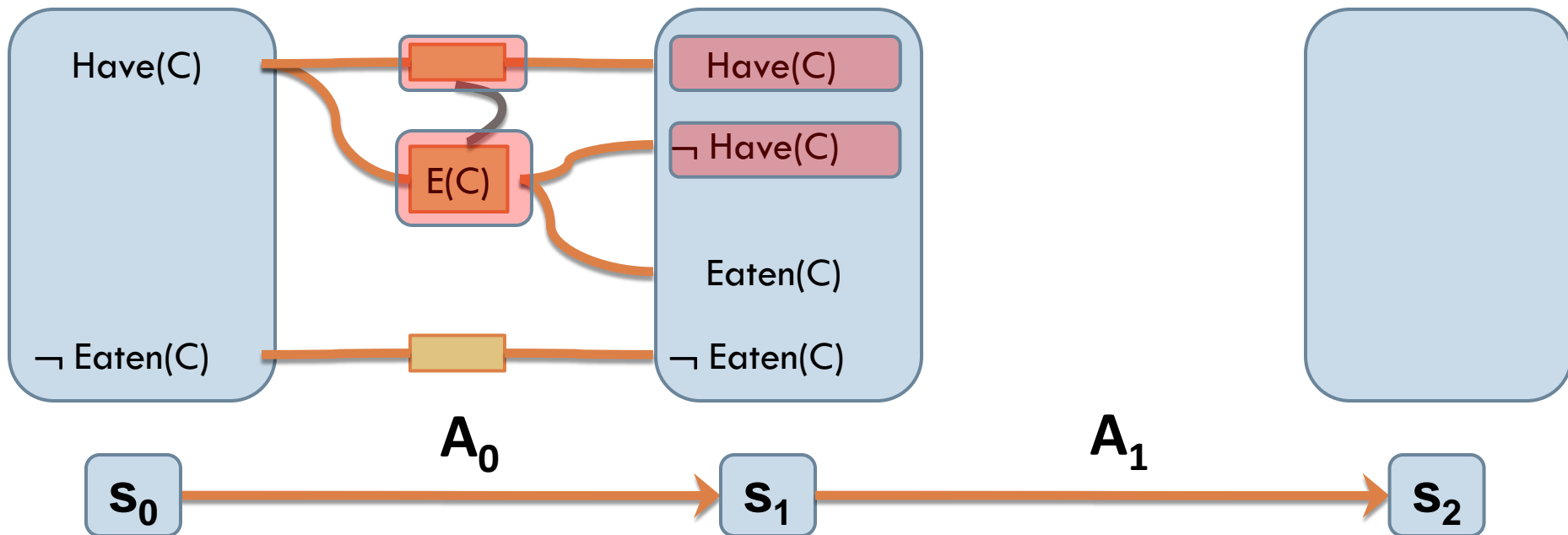
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- Mutual exclusion links (mutex)
 - Inconsistent effects
 - Interference
 - Inconsistent support
 - Competing needs

Planning graphs

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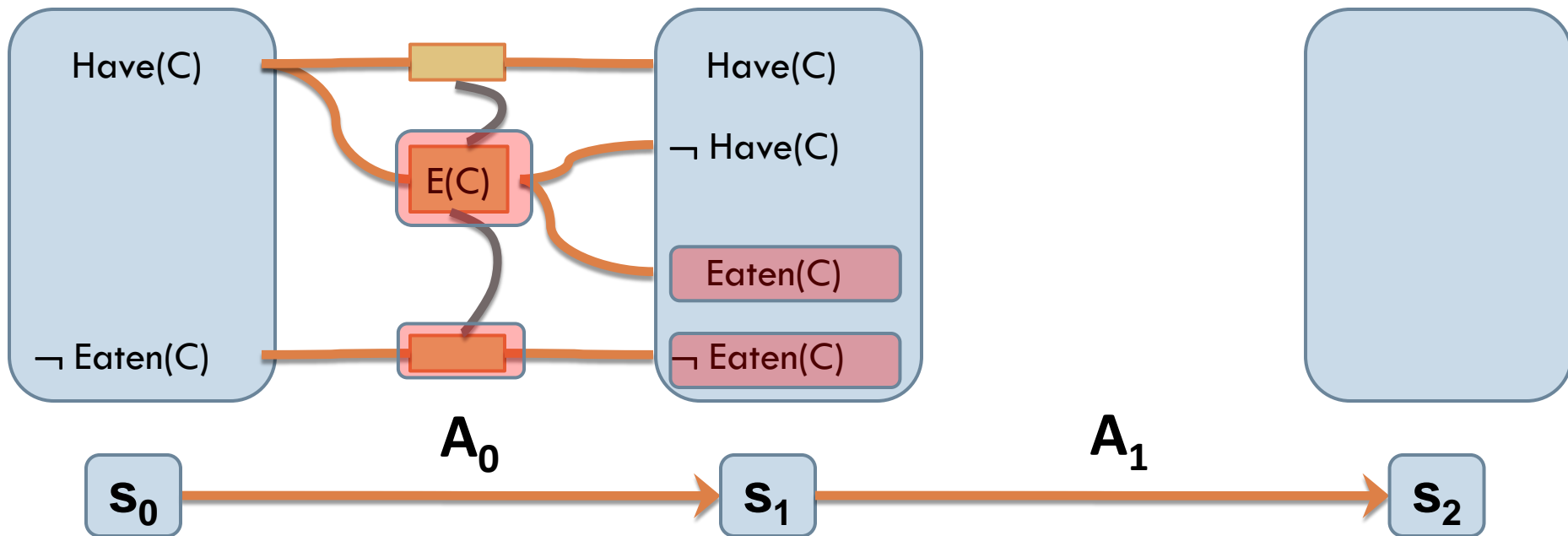
- Two actions have inconsistent effects when:
 - One action cancels the effect of the other action
 - E.g., action $E(C)$ and the persistent action for $\text{Have}(\text{Cake})$ have inconsistent effects



Planning graphs

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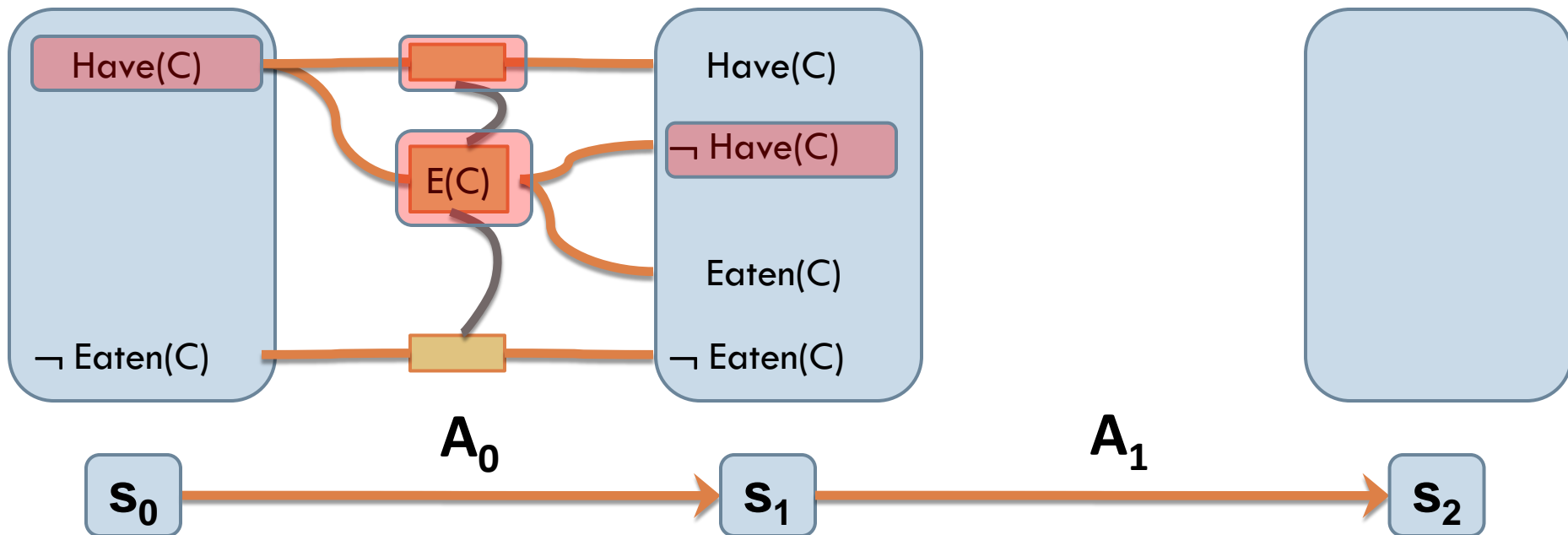
- Two actions have inconsistent effects when:
 - ▣ One action cancels the effect of the other action
 - Same for action $E(C)$ and the persistent action for $\neg\text{Eaten}(C)$



Planning graphs

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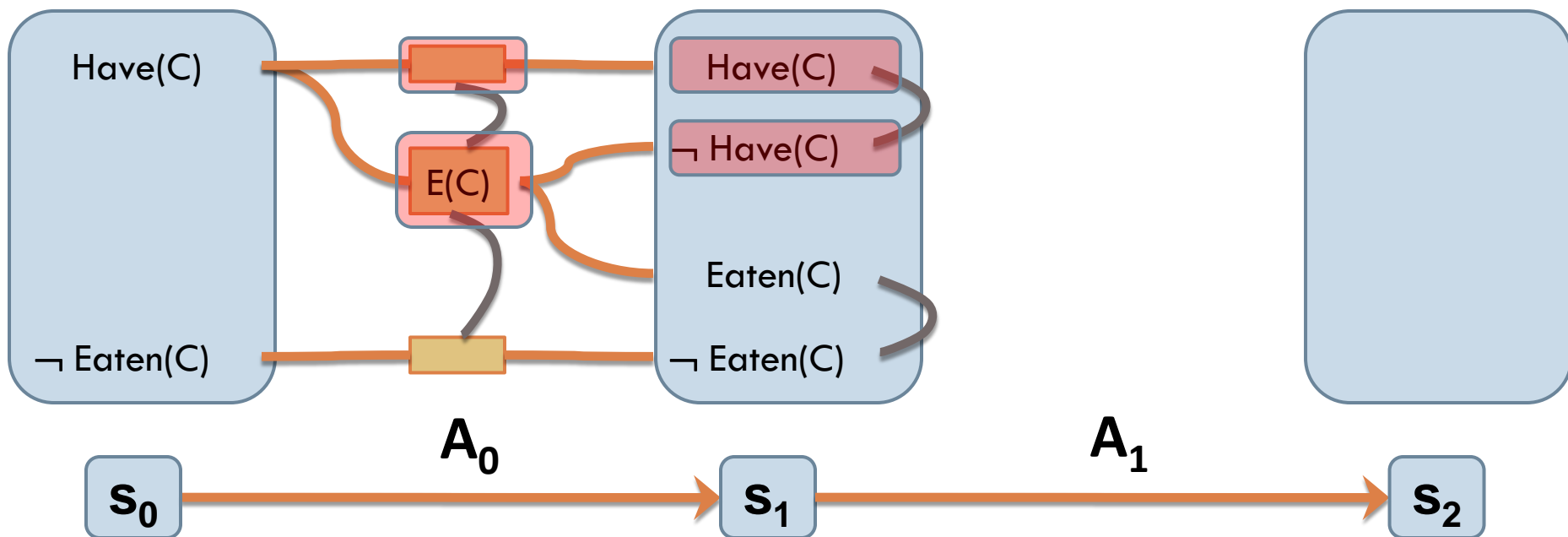
- Two actions have an interference when:
 - ▣ One effect of one action is the negation of a precondition for the other action
 - E.g., action $E(C)$ and the persistent action for $\text{Have}(C)$



Planning graphs

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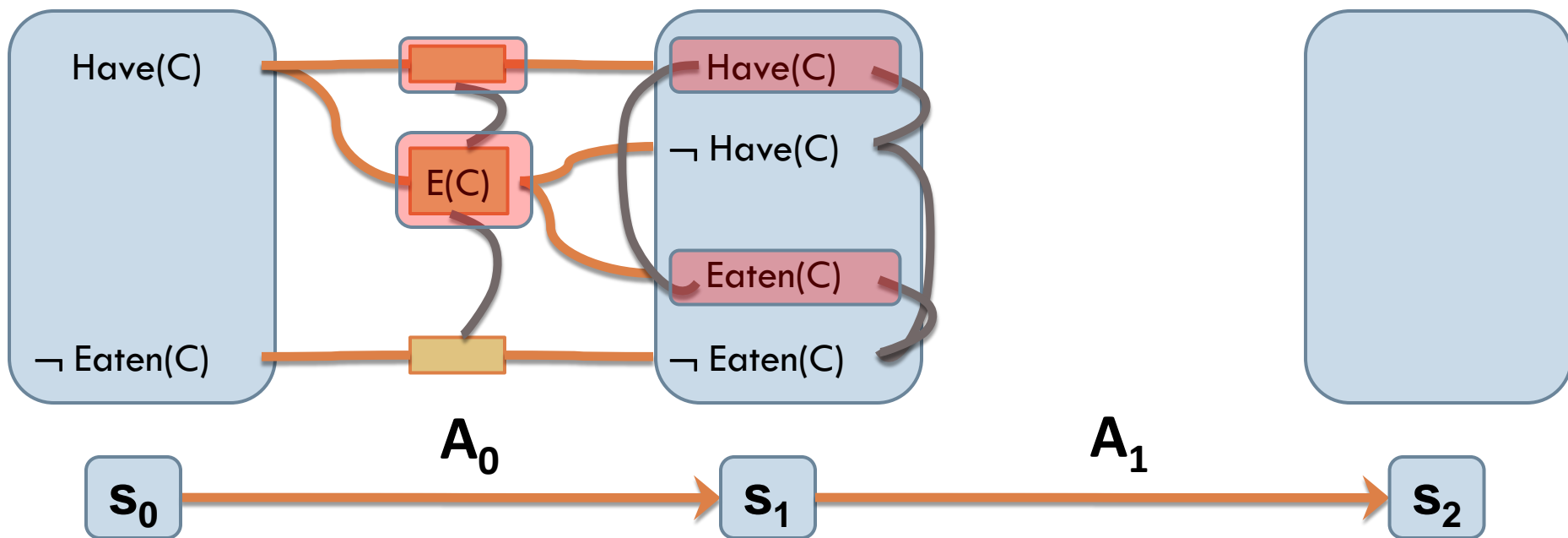
- Two **literals** have inconsistent support when:
 - One literal is the negation of the other literal
 - E.g., $\neg\text{Have}(C)$ and $\text{Have}(C)$



Planning graphs

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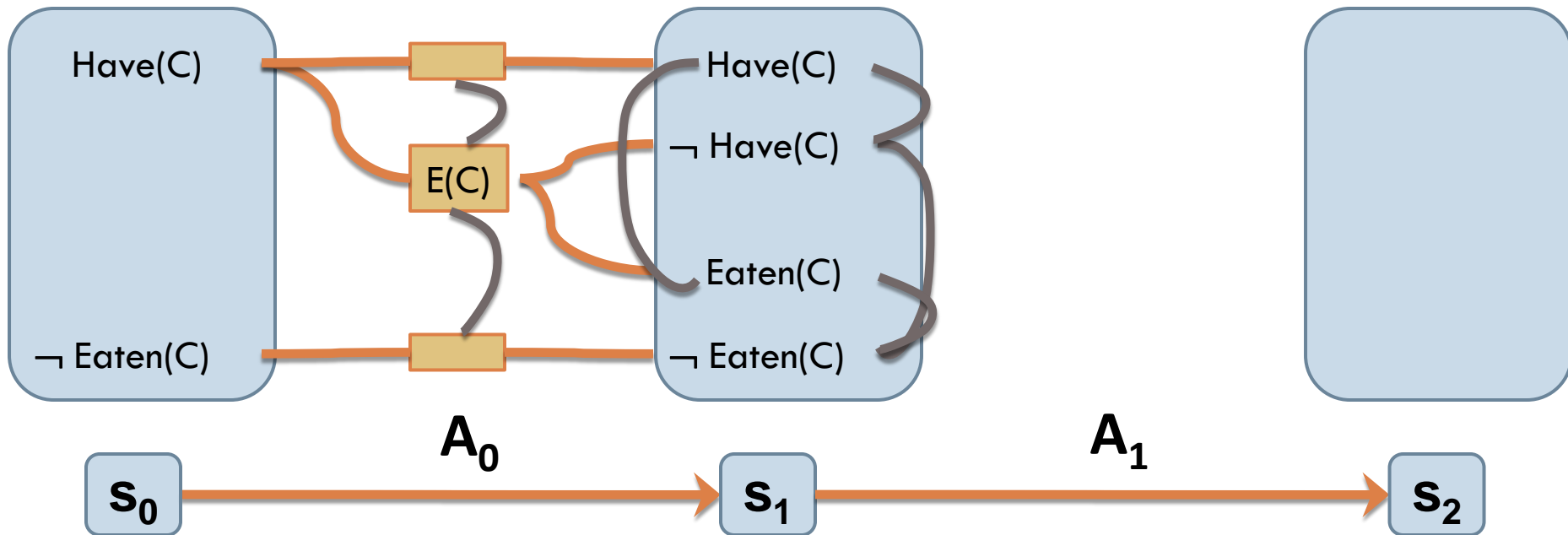
- Two **literals** have inconsistent support when:
 - Every possible pair of action that have these literals as effects are marked as mutually exclusive



Planning graphs

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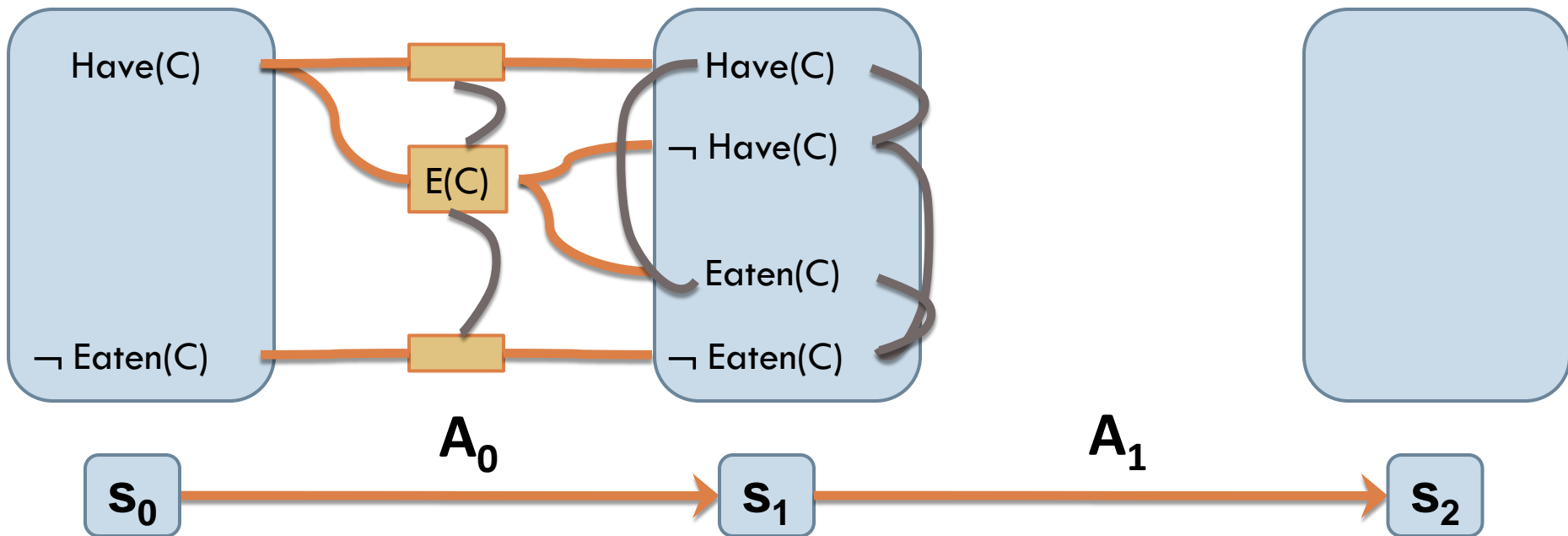
- Two actions have competing needs when:
 - ▣ A precondition of one action is mutually exclusive with a precondition of the other action
 - Does not arise in this domain



Planning graphs

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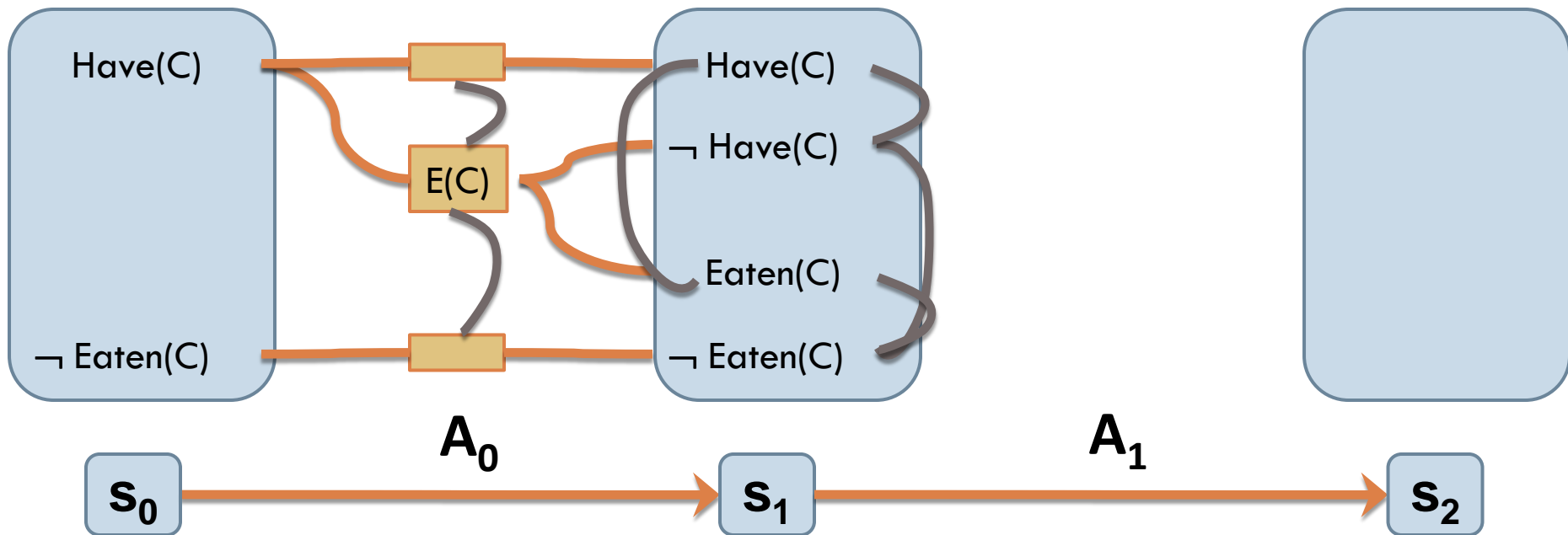
- Level 0
 - ▣ We are (finally) done!



Planning graphs

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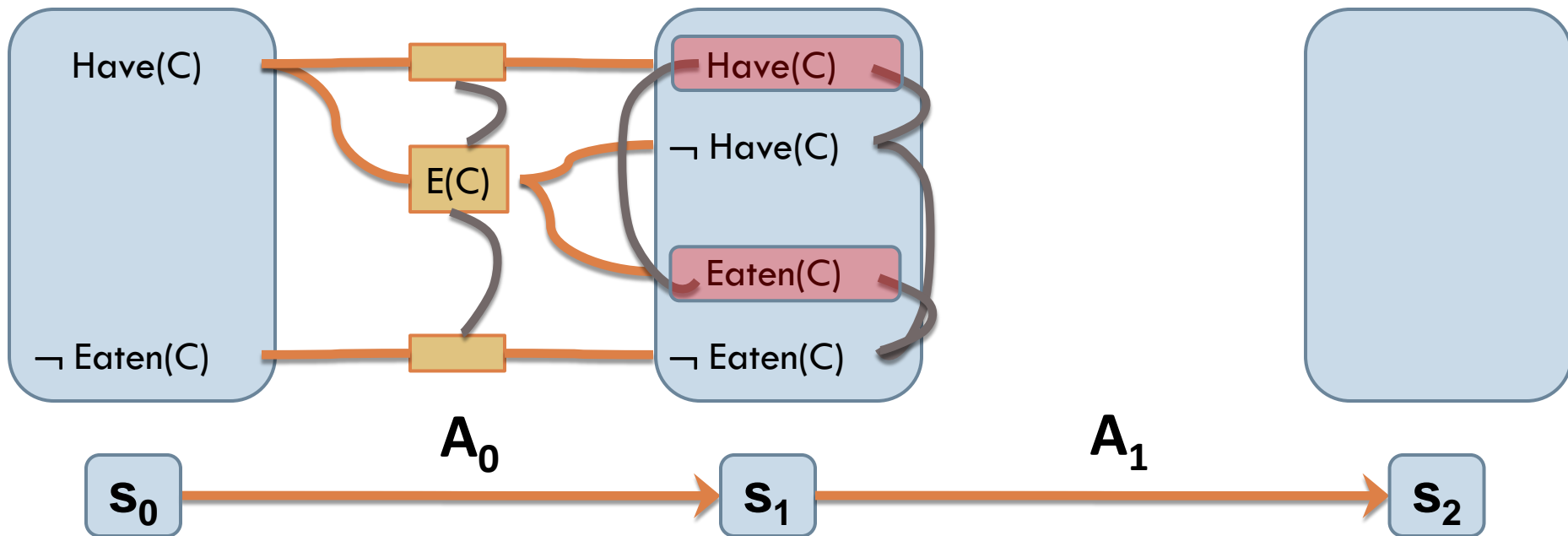
- What kind of information does the graph provide so far?



Planning graphs

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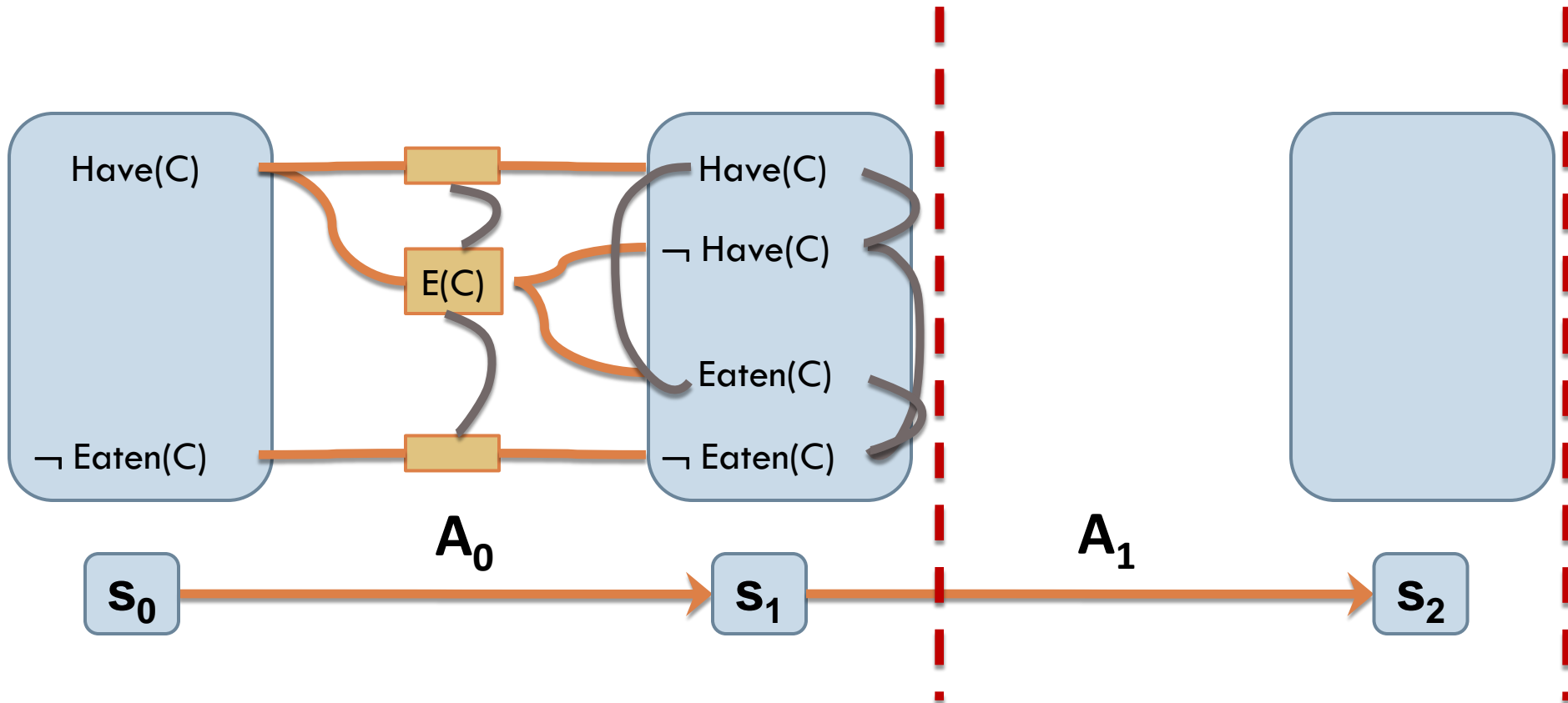
- A pair of mutually exclusive literals cannot be realized from the actions of Level 0!
- E.g., the goal cannot be achieved with these actions



Planning graphs

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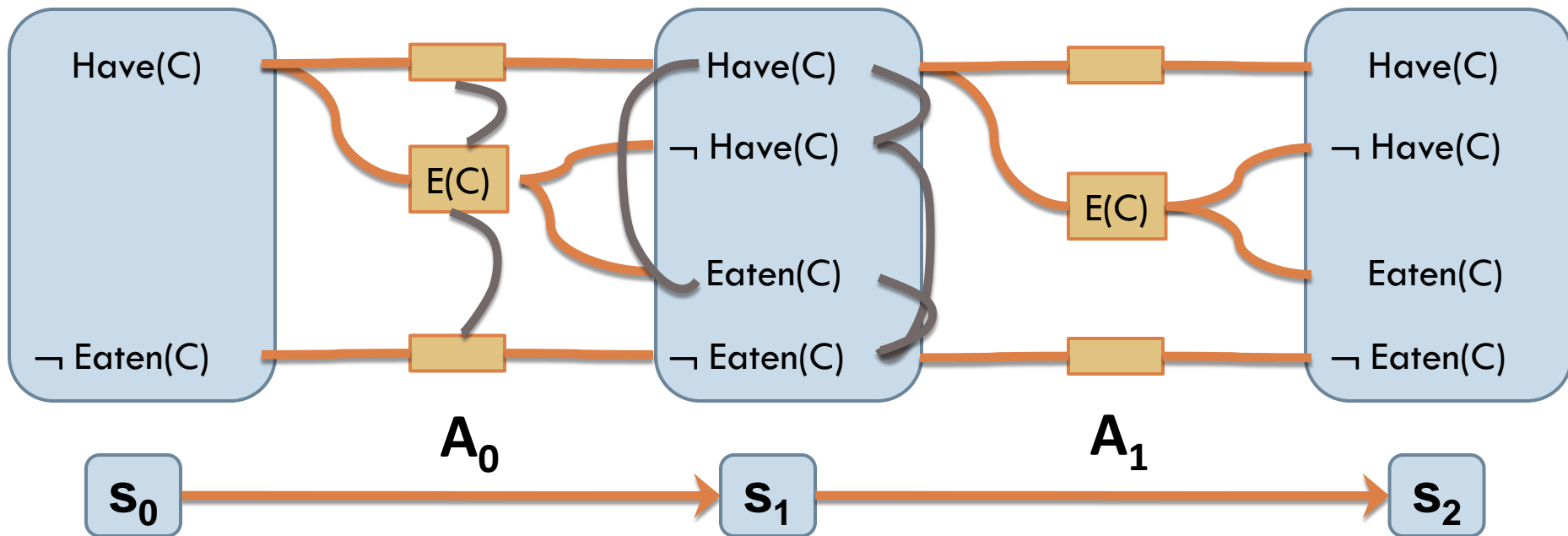
- Level 1
 - We will specify A_1 and S_2



Planning graphs

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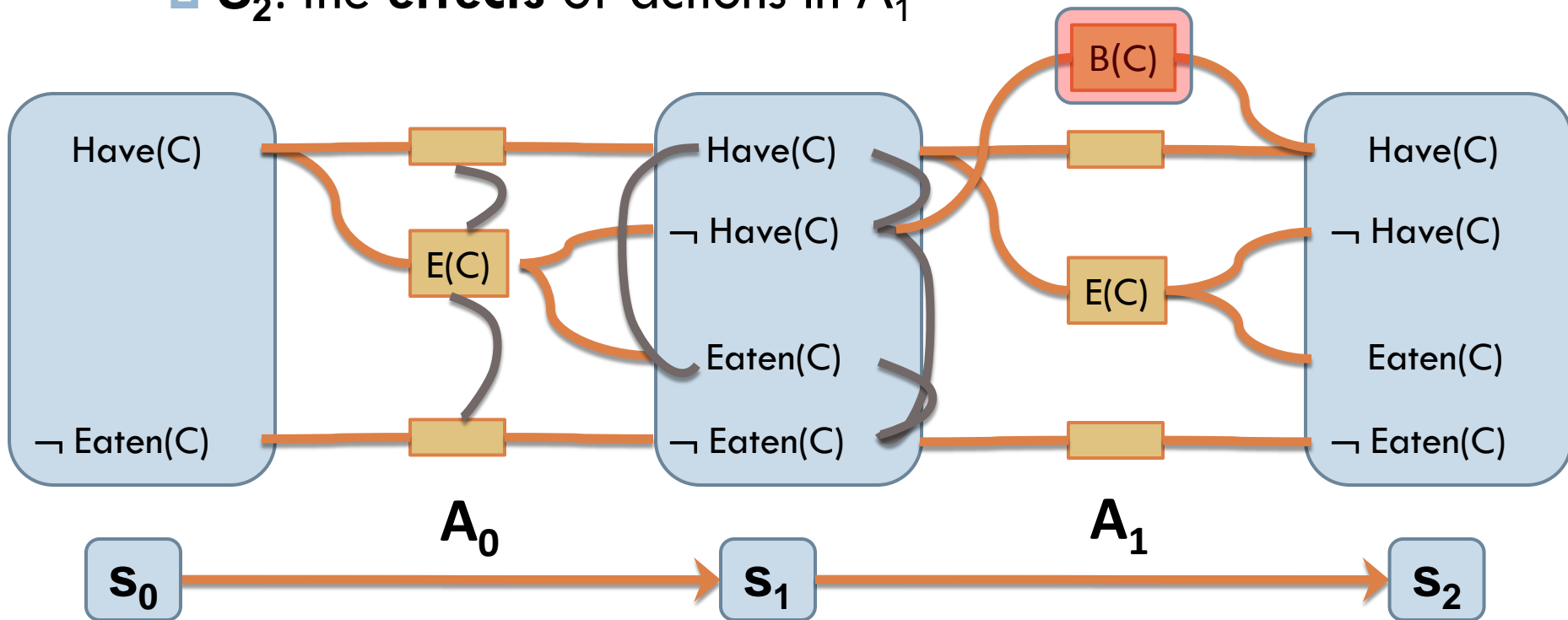
- Level 1
 - A_1 : the **applicable actions** in S_1 (at least those in A_0)
 - S_2 : the **effects** of actions in A_1 (at least those in S_1)



Planning graphs

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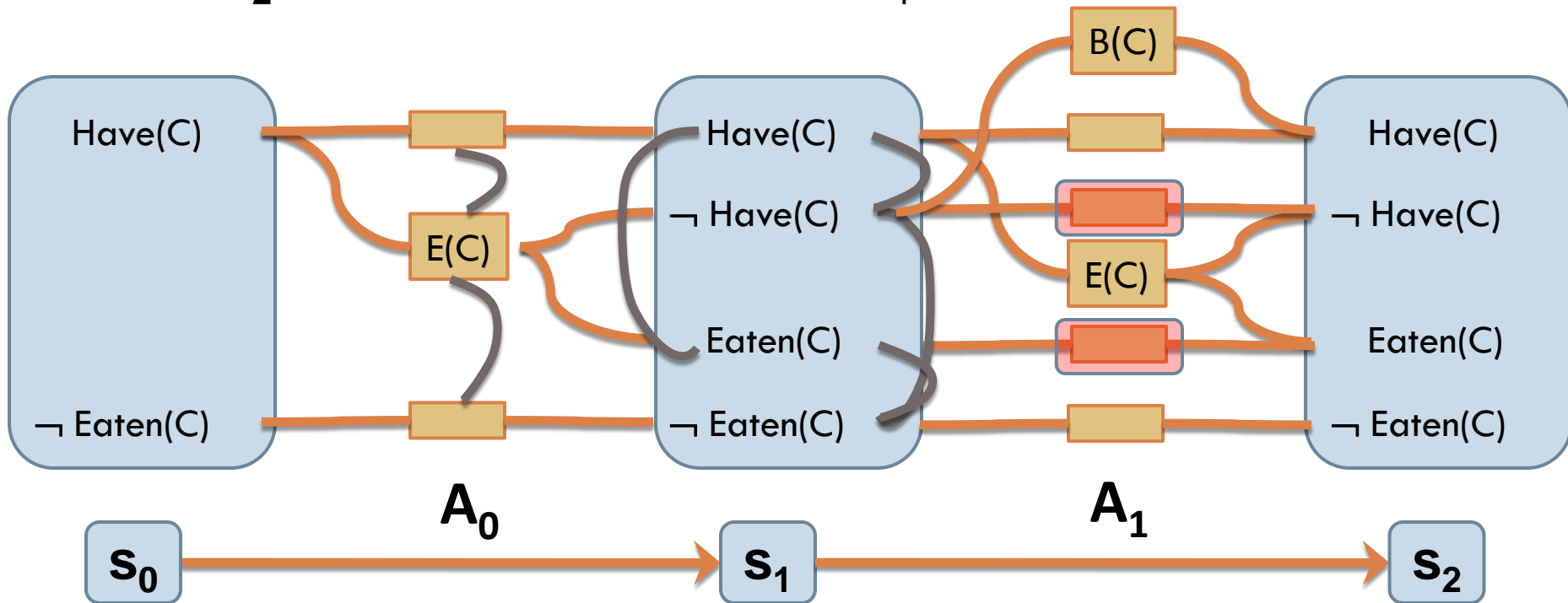
- Level 1
 - A_1 : the **applicable actions** in S_1 (and more!)
 - S_2 : the **effects** of actions in A_1



Planning graphs

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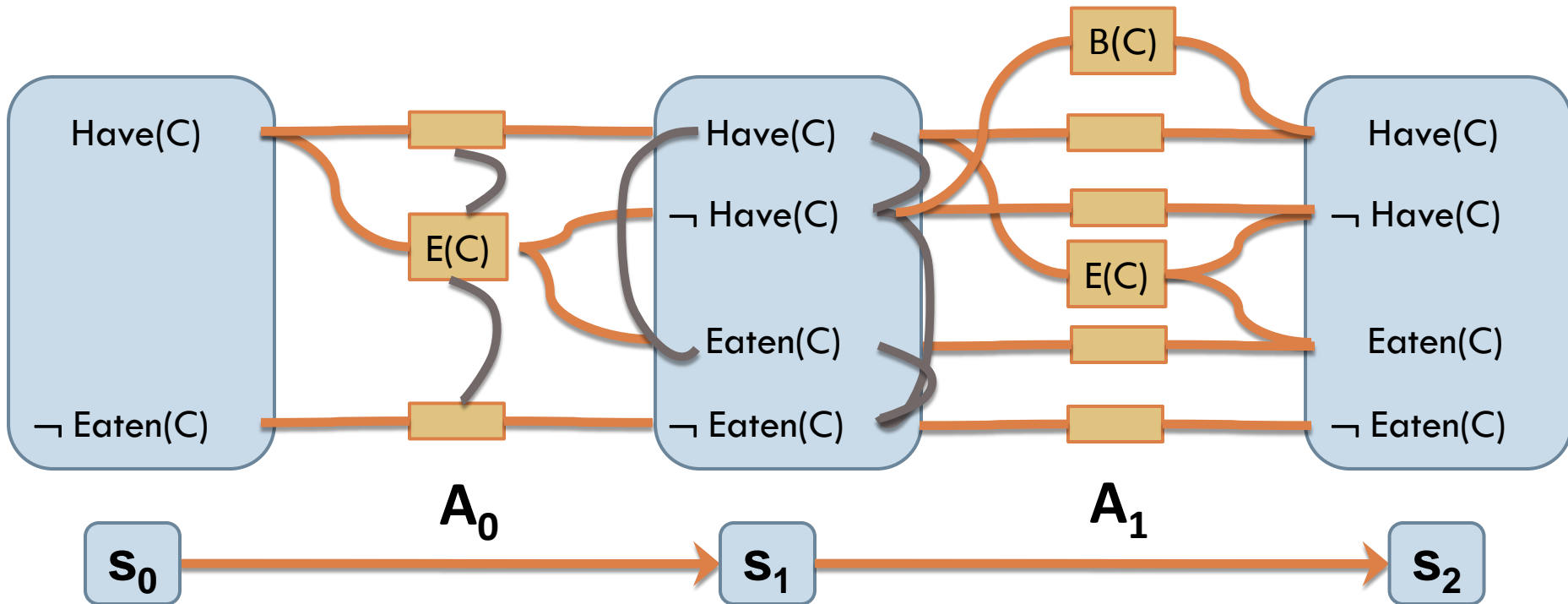
- Level 1
 - ▣ A_1 : the **applicable actions** in S_1 (and more!)
 - ▣ S_2 : the **effects** of actions in A_1



Planning graphs

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- Level 1
 - Mutual exclusive links

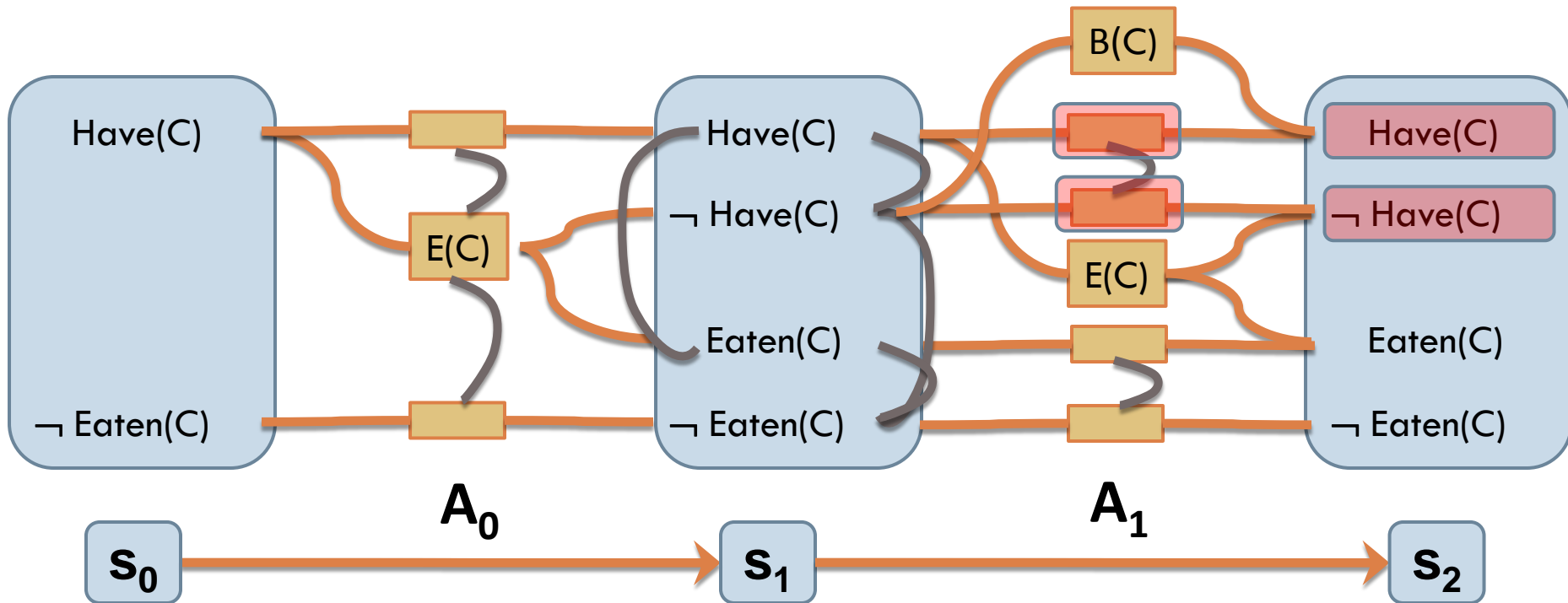


Planning graphs

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□ Level 1

- Mutual exclusive links
- Inconsistent effects between persistence actions



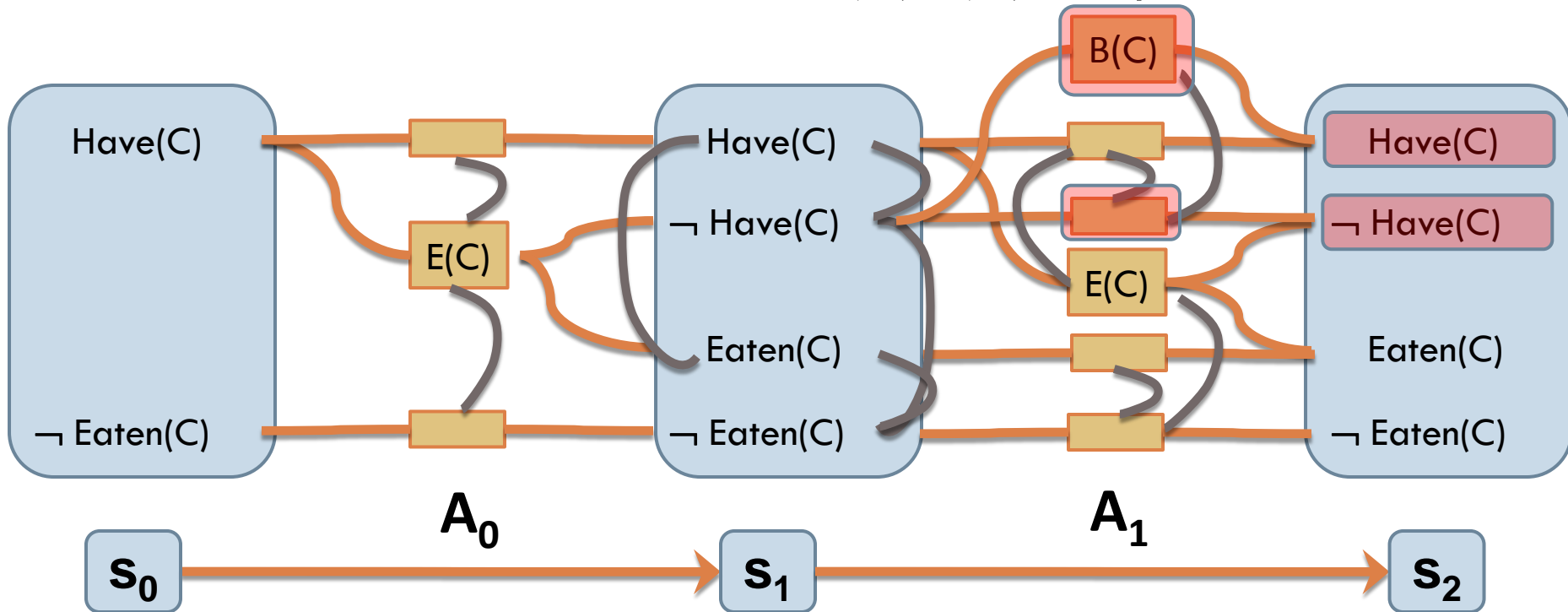
Planning graphs

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□ Level 1

▣ Mutual exclusive links

▣ Inconsistent effects between $B(C)$, $E(C)$ and persistence actions



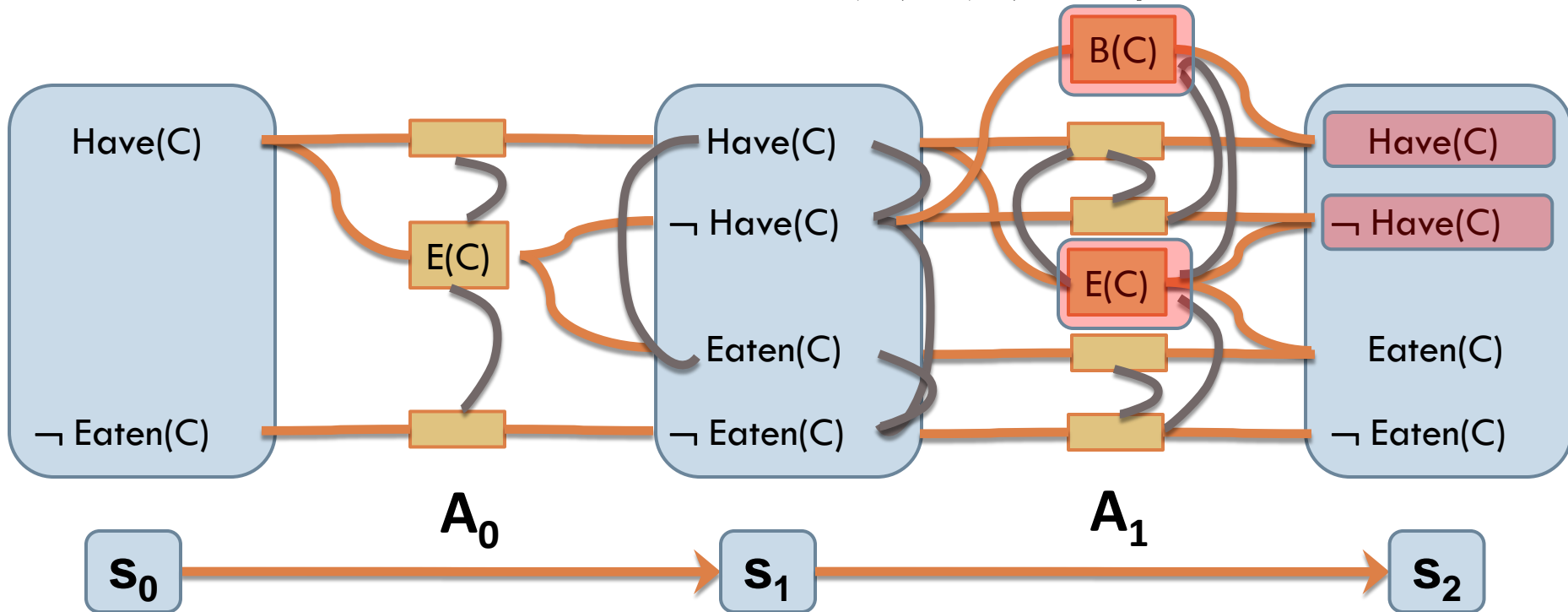
Planning graphs

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□ Level 1

□ Mutual exclusive links

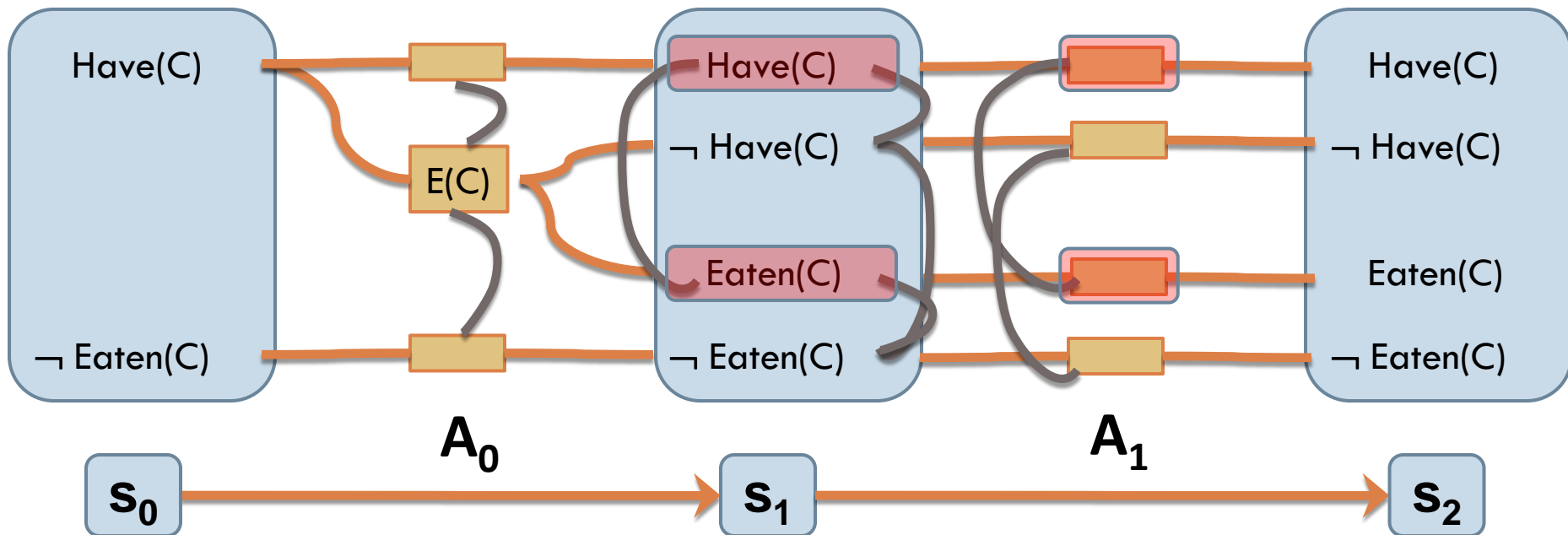
□ Inconsistent effects between $B(C)$, $E(C)$ and persistence actions



Planning graphs

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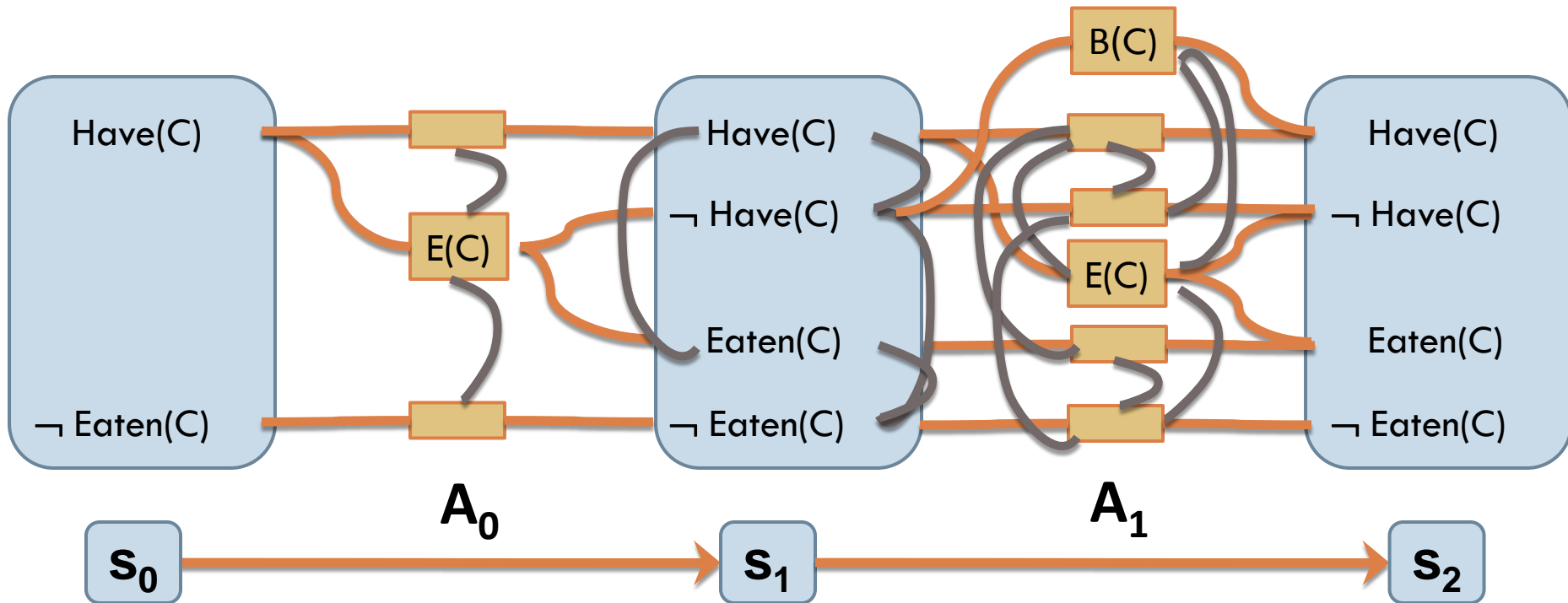
- Level 1
 - ▣ Mutual exclusive links
 - ▣ Competing needs between persistence actions!



Planning graphs

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- Level 1
 - ▣ Mutual exclusive links
 - ▣ No more mutexes between actions



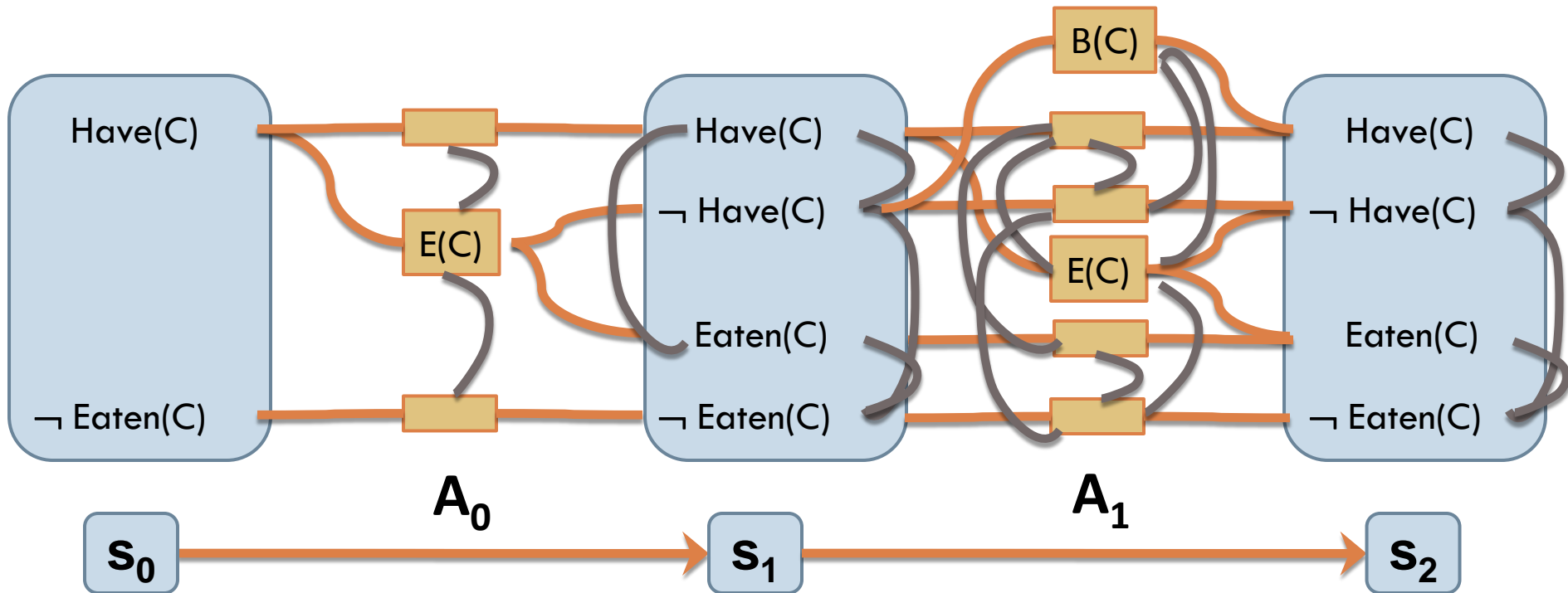
Planning graphs

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□ Level 1

□ Mutual exclusive links

□ There are mutexes between literals in S_2 though



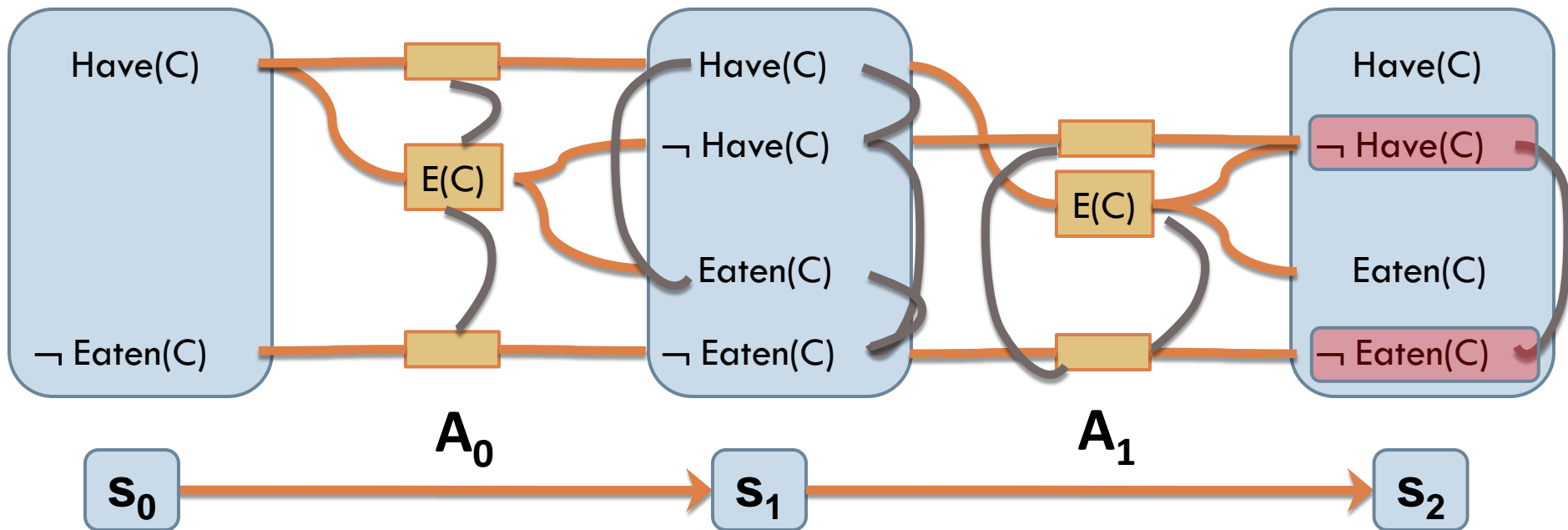
Planning graphs

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□ Level 1

□ Mutual exclusive links

□ Between literals $\neg\text{Have}(C)$ and $\neg\text{Eaten}(C)$ in S_2



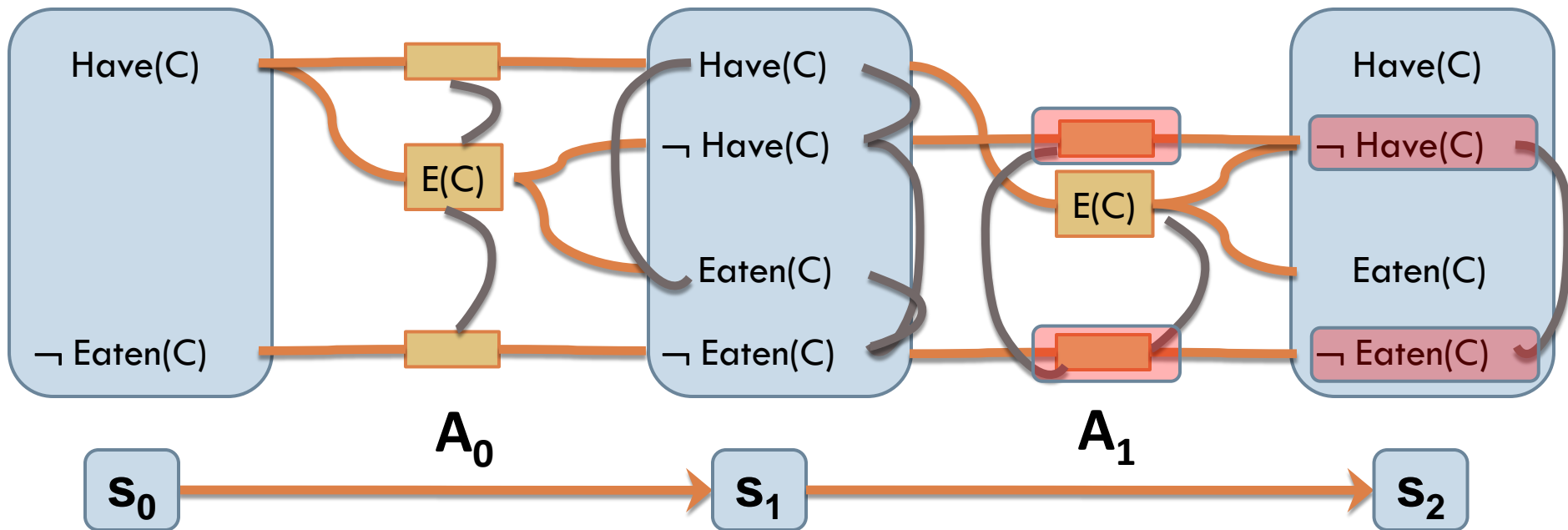
Planning graphs

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□ Level 1

▣ Mutual exclusive links

▣ Between literals $\neg\text{Have}(C)$ and $\neg\text{Eaten}(C)$ in S_2



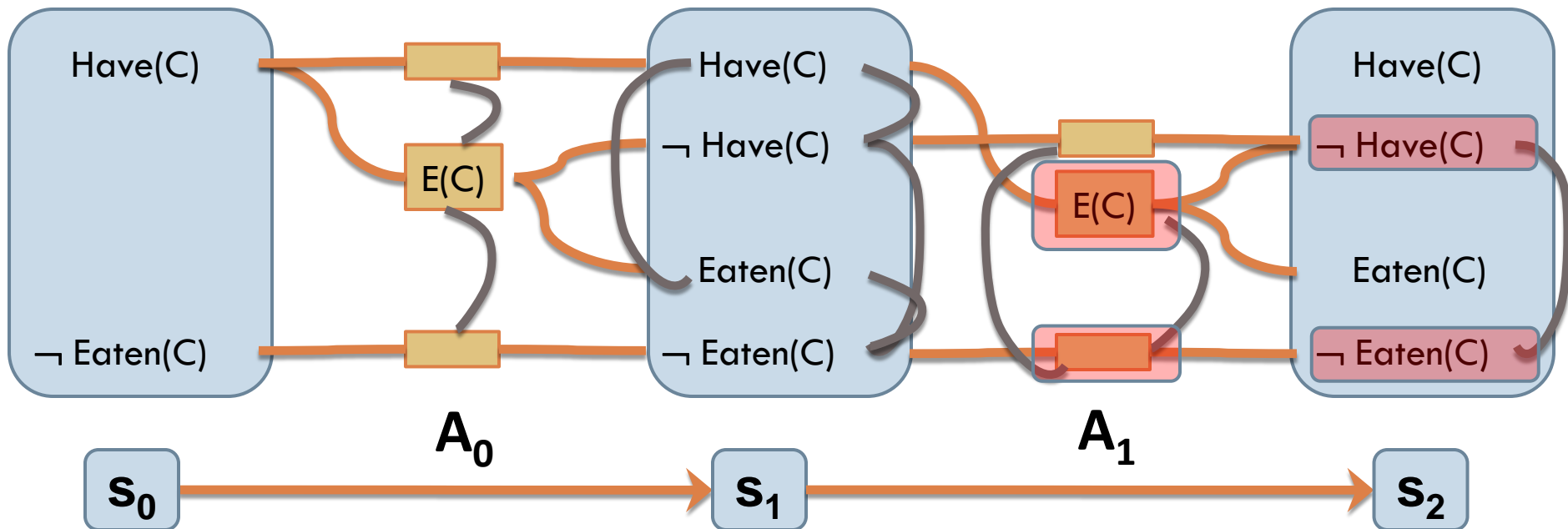
Planning graphs

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□ Level 1

□ Mutual exclusive links

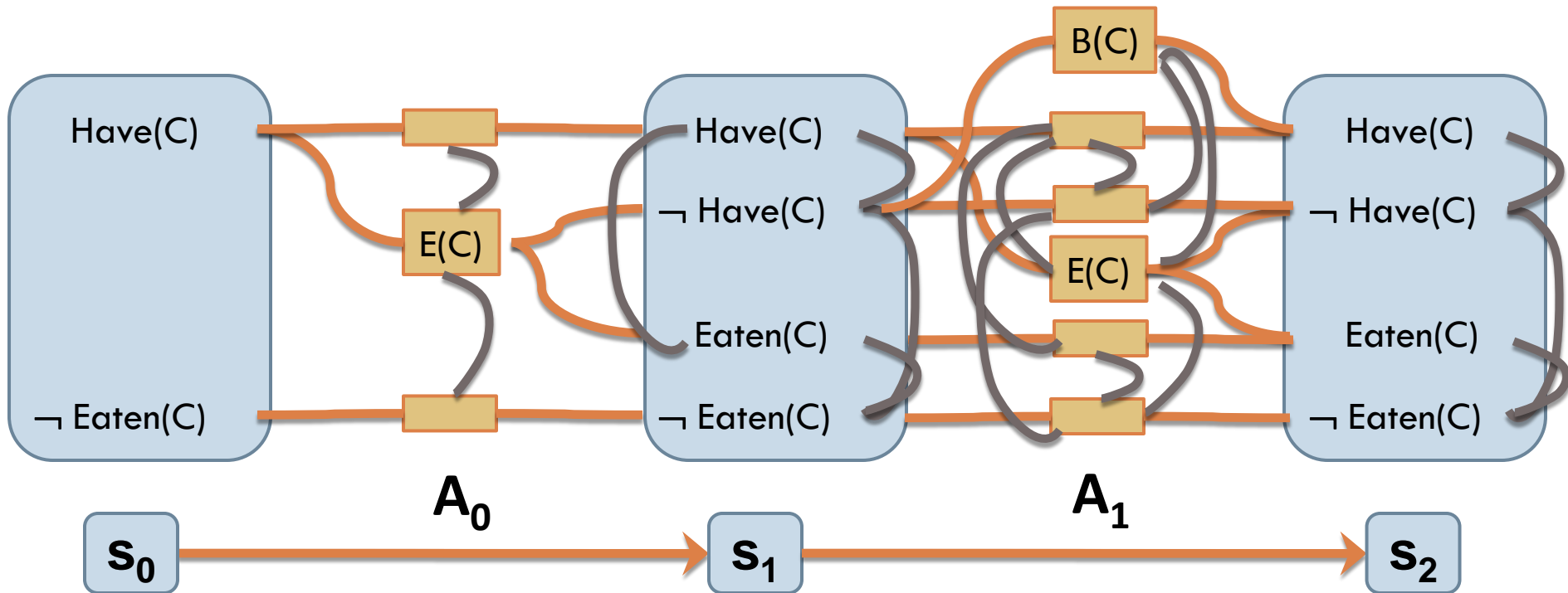
□ Between literals $\neg\text{Have}(C)$ and $\neg\text{Eaten}(C)$ in S_2



Planning graphs

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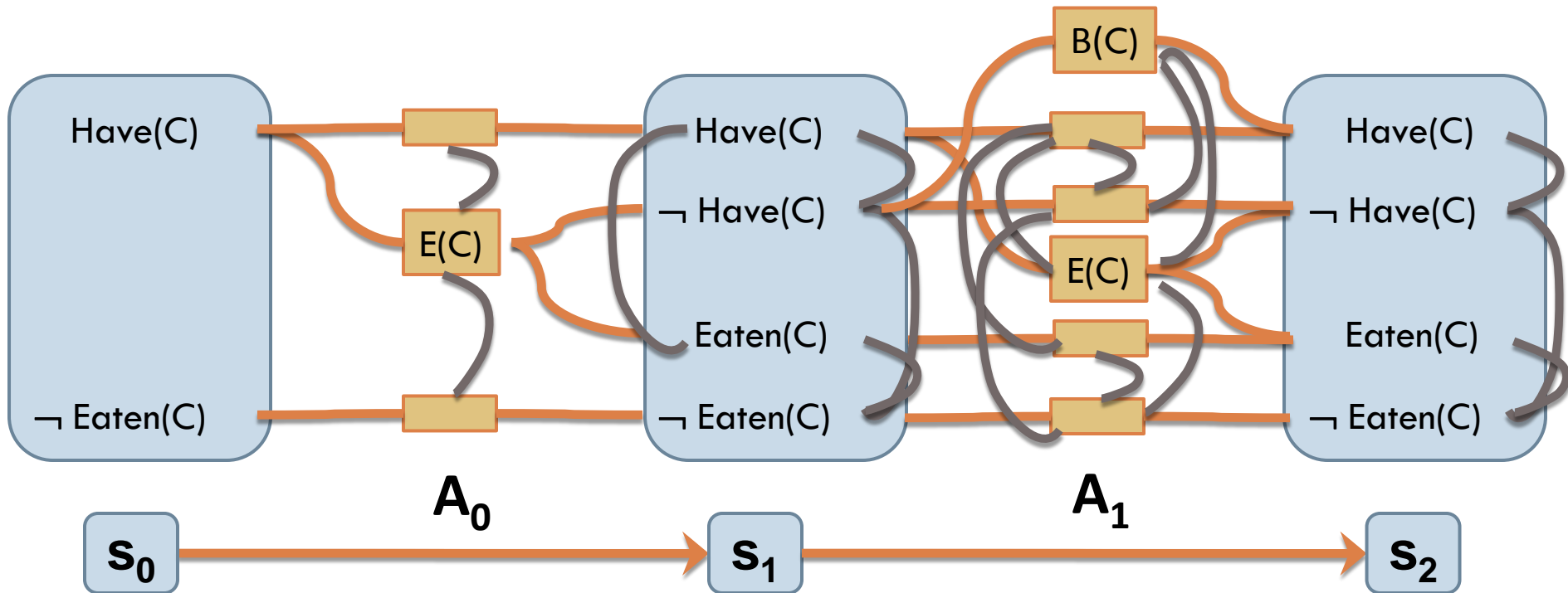
- Level 1
 - ▣ We are (finally) done!



Planning graphs

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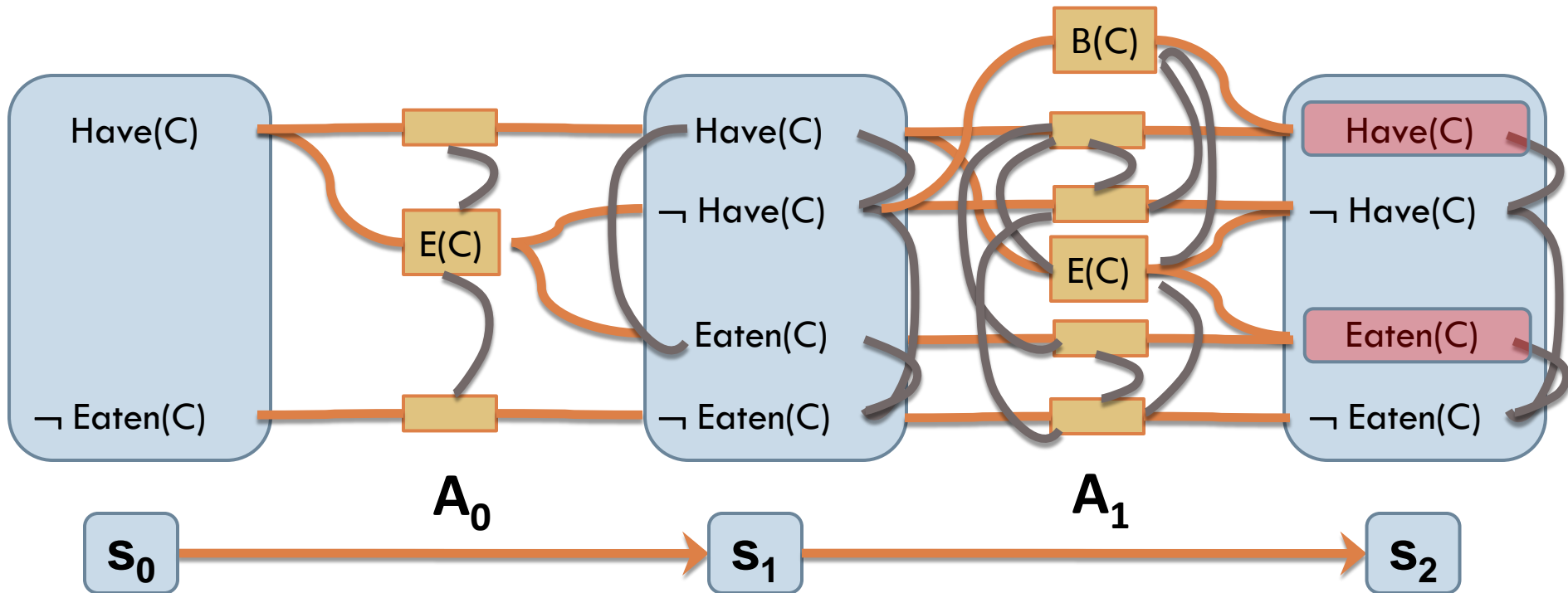
- What information can we get from the graph now?



Planning graphs

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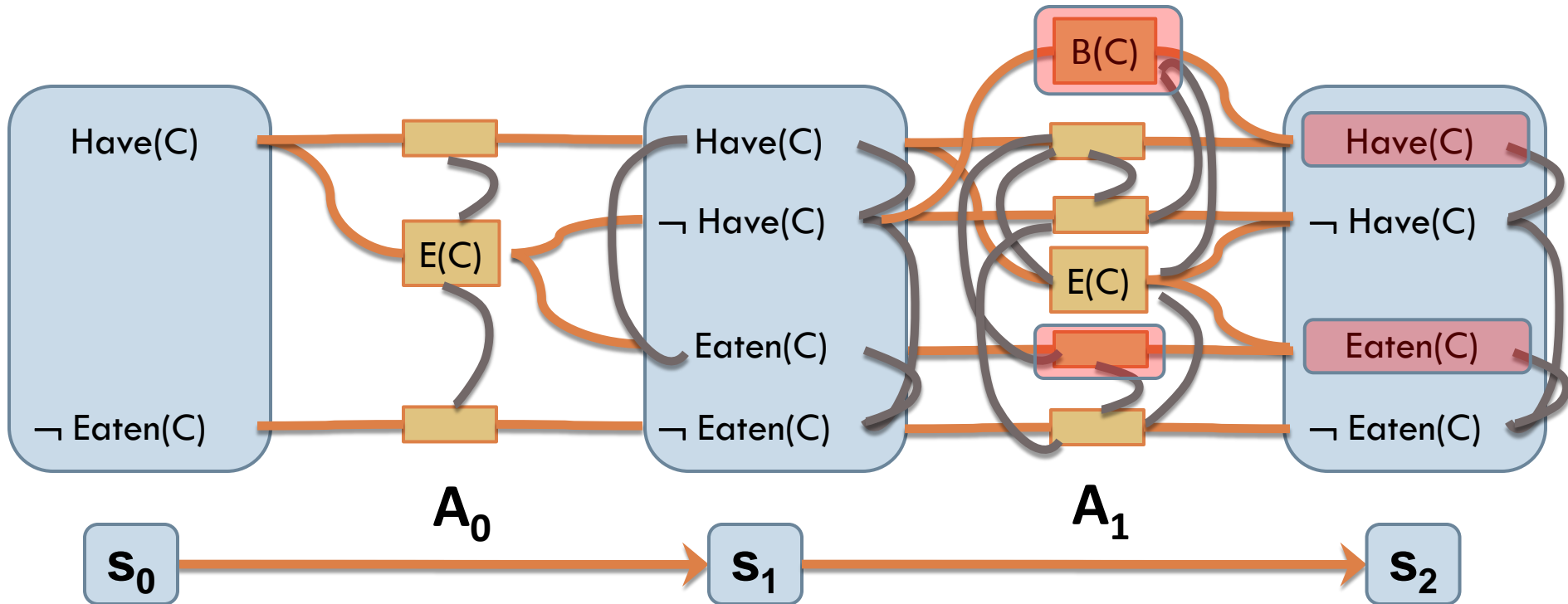
- What information can we get from the graph now?
 - ▣ Note that literals $\text{Have}(C)$ and $\text{Eaten}(C)$ **are not mutually exclusive** in S_2 !!!



Planning graphs

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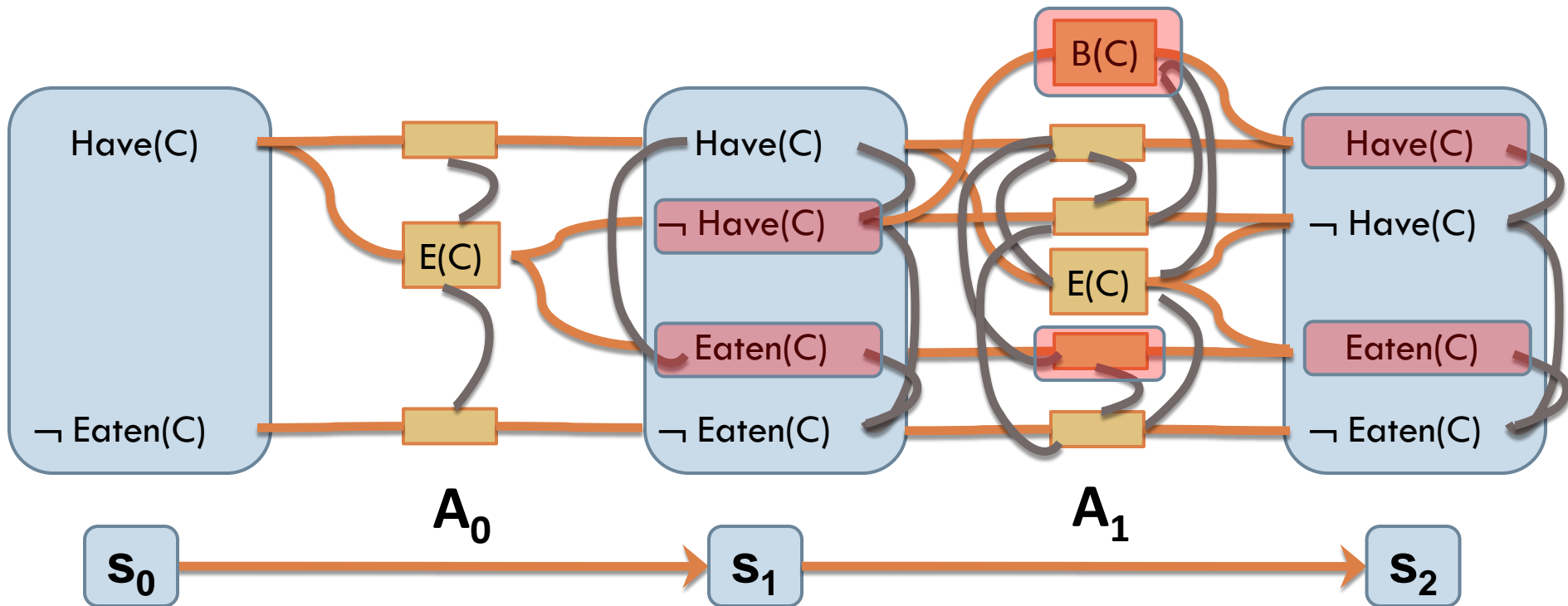
- What information can we get from the graph now?
 - ▣ Note that literals $\text{Have}(C)$ and $\text{Eaten}(C)$ **can be realized** in A_1 by the actions $\{\text{B}(C), \text{persistence of } \text{Eaten}(C)\}$



Planning graphs

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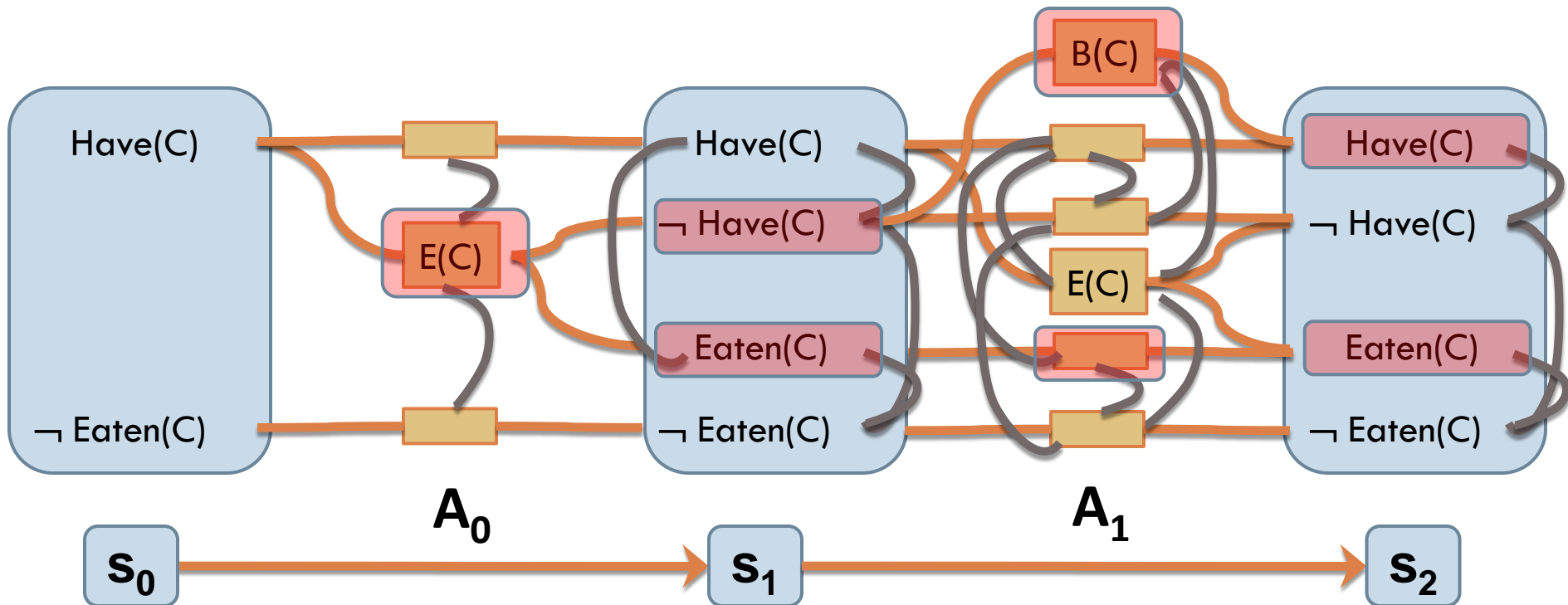
- What information can we get from the graph now?
 - ▣ In turn actions $\{B(C), \text{persistence of Eaten}(C)\}$ **require** that $\neg \text{Have}(C)$ and $\text{Eaten}(C)$ hold in S_1



Planning graphs

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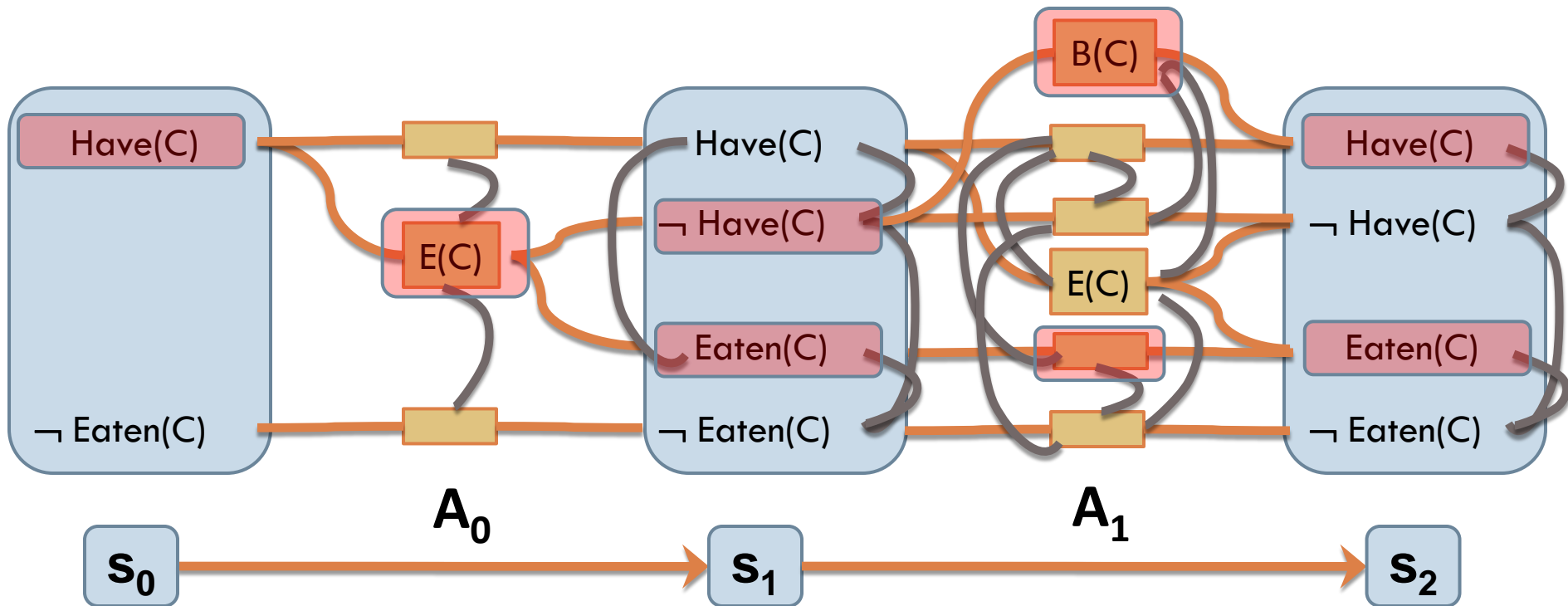
- What information can we get from the graph now?
 - ▣ Note that literals $\text{Have}(C)$ and $\text{Eaten}(C)$ **can be realized** in A_0 by the action $E(C)$



Planning graphs

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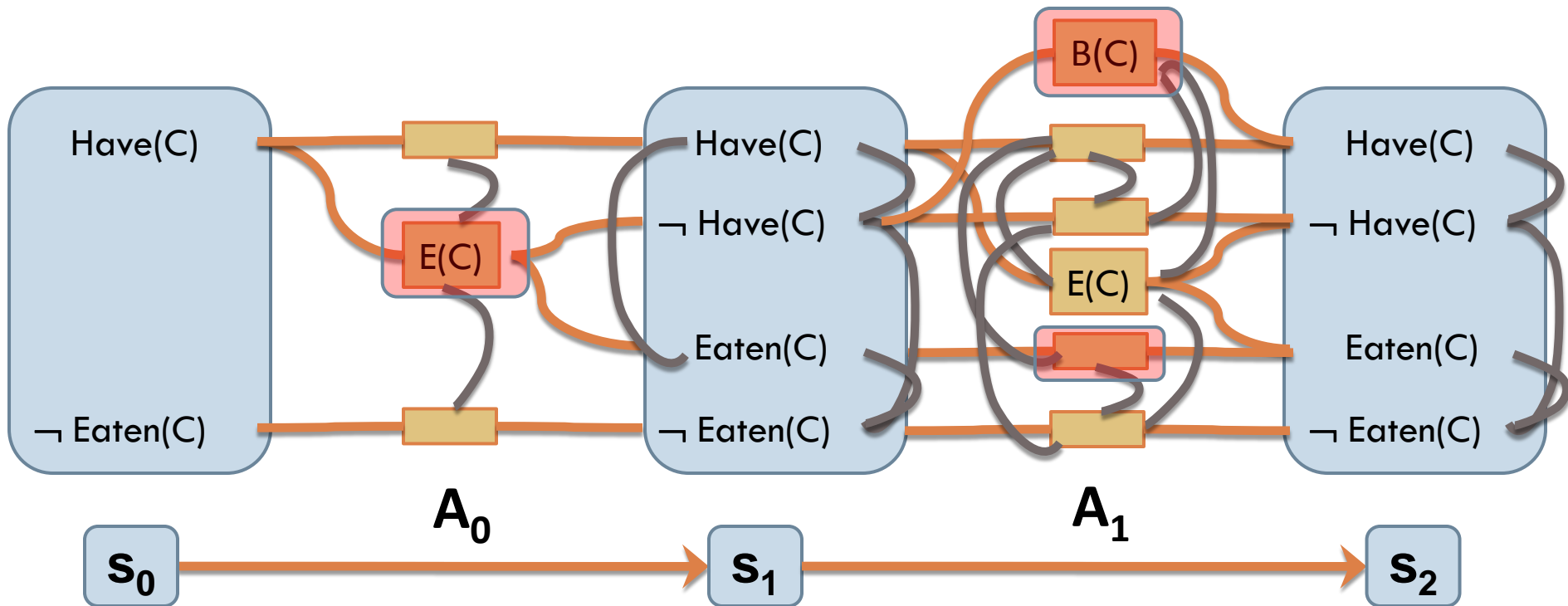
- What information can we get from the graph now?
 - ▣ In turn $E(C)$ requires that $\text{Have}(C)$ holds in S_0 which is true!



Planning graphs

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- What information can we get from the graph now?
 - ▣ So, actions $\{E(C)\}$ and $\{B(C), \text{persistence of Eaten}(C)\}$ can actually **achieve the goal!**



Planning graphs

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- Planning graph

Planning graphs

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□ Planning graph

- **When do we stop calculating levels?**
- When two consecutive levels are identical *

- **How do we know this will happen at some point?**
- Literals and actions increase monotonically, while mutexes decrease monotonically (why is this so?)

Planning graphs

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- Planning graph
 - ▣ Special **data structure**
 - ▣ Easy to compute: **polynomial complexity!**
 - ▣ Can be used by the **GRAPHPLAN** algorithm to **search for a solution** (following similar reasoning as in the example)
 - ▣ Can be used as a **guideline for heuristic functions** for progressive planning that are more accurate than the ones we sketched in Lecture 2

Bibliography

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▣ Material

- Artificial Intelligence: A Modern Approach 2nd Ed. Stuart Russell, Peter Norvig. Prentice Hall, 2003 Section 11.4