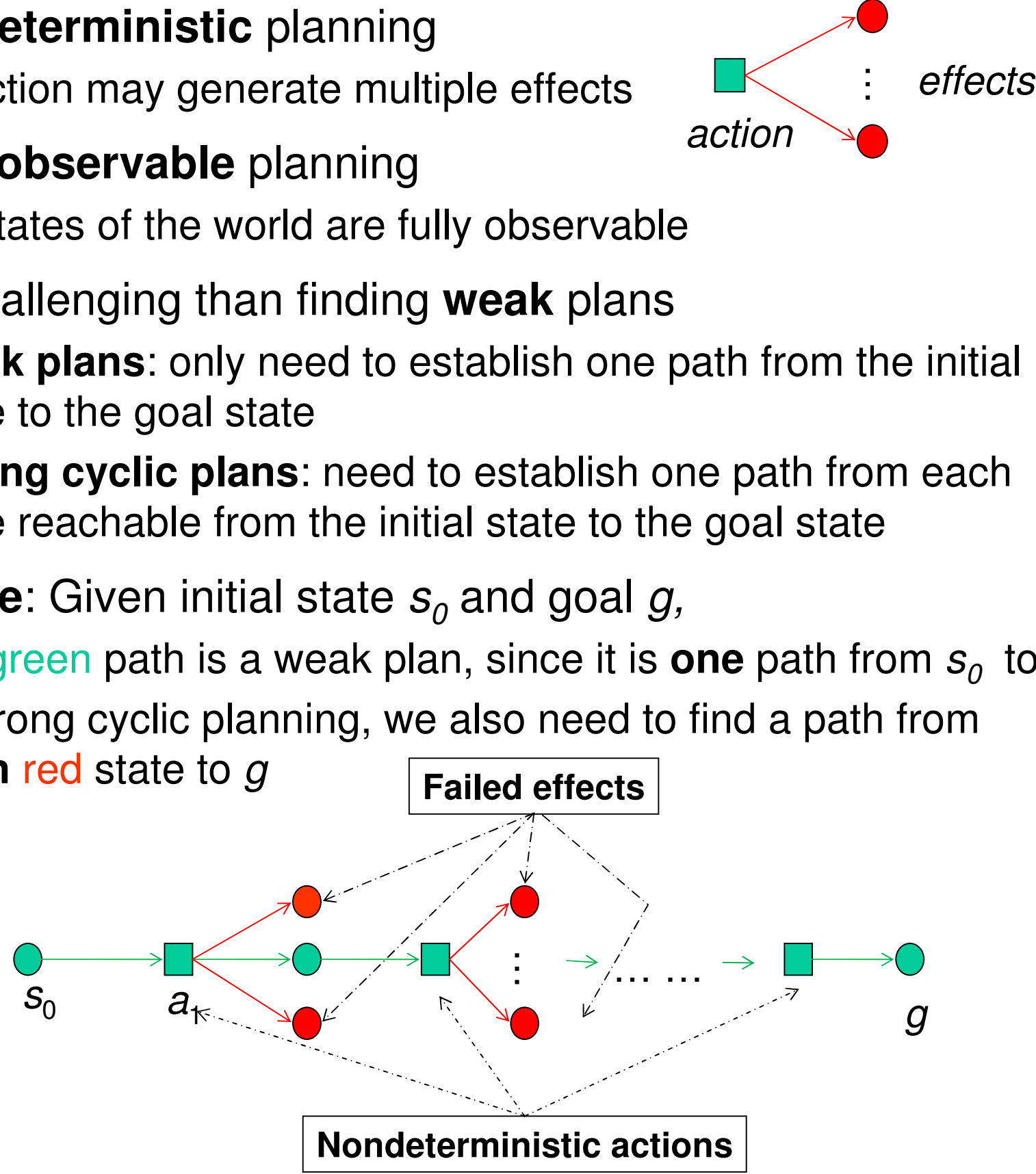


Problem

- Find strong cyclic solutions to Fully-Observable Nondeterministic (FOND) planning problems

Related Concepts

- In **nondeterministic** planning
 - an action may generate multiple effects
- In **fully-observable** planning
 - the states of the world are fully observable
- More challenging than finding **weak** plans
 - Weak plans:** only need to establish one path from the initial state to the goal state
 - Strong cyclic plans:** need to establish one path from each state reachable from the initial state to the goal state
- Example:** Given initial state s_0 and goal g ,
 - the **green** path is a weak plan, since it is **one** path from s_0 to g
 - in strong cyclic planning, we also need to find a path from **each red** state to g

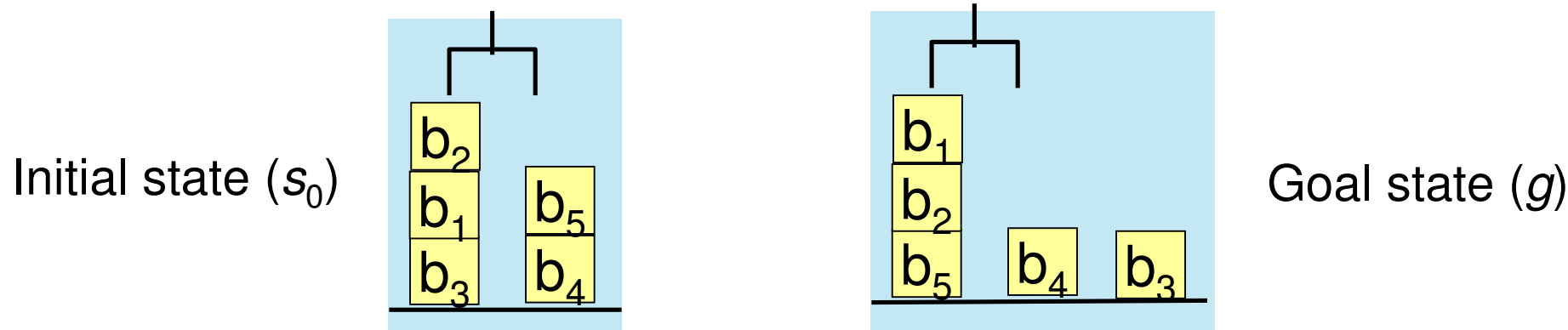


- An outcome of an action that is included in the weak plan (i.e., a **green** state) is its **intended effect**
- An outcome of an action that is not included in the weak plan (i.e., a **red** state) is a **failed effect** of the action

Basic Strong Cyclic Algorithm

- 3 steps**
 - Generate a weak plan from s_0 to g .
 - For each failed effect e , recursively find a weak plan from e to g .
 - If a dead end is met (i.e., no path leads to g from it), then *backtrack* (i.e., disable the action that leads to the dead end and try another path)

- Example: Blockworld**



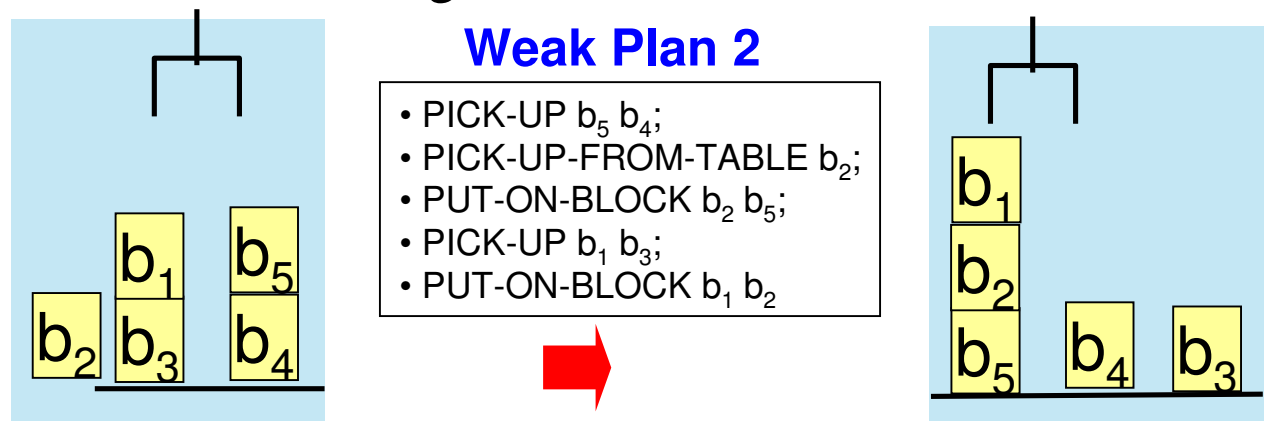
- To generate a strong cyclic plan:

Step 1: Find a weak plan from s_0 to g

Weak Plan 1

- PICK-UP b_2 b_1 ;
- PUT-ON-BLOCK b_2 b_5 ;
- PICK-TOWER b_2 b_5 b_4 ;
- PUT-TOWER-DOWN b_2 b_5 ;
- PICK-UP b_1 b_3 ;
- PUT-ON-BLOCK b_1 b_2

Step 2: Since action PICK-UP b_2 b_1 may generate the failed effect of dropping b_2 onto the table, we generate a weak plan from this failed effect to g



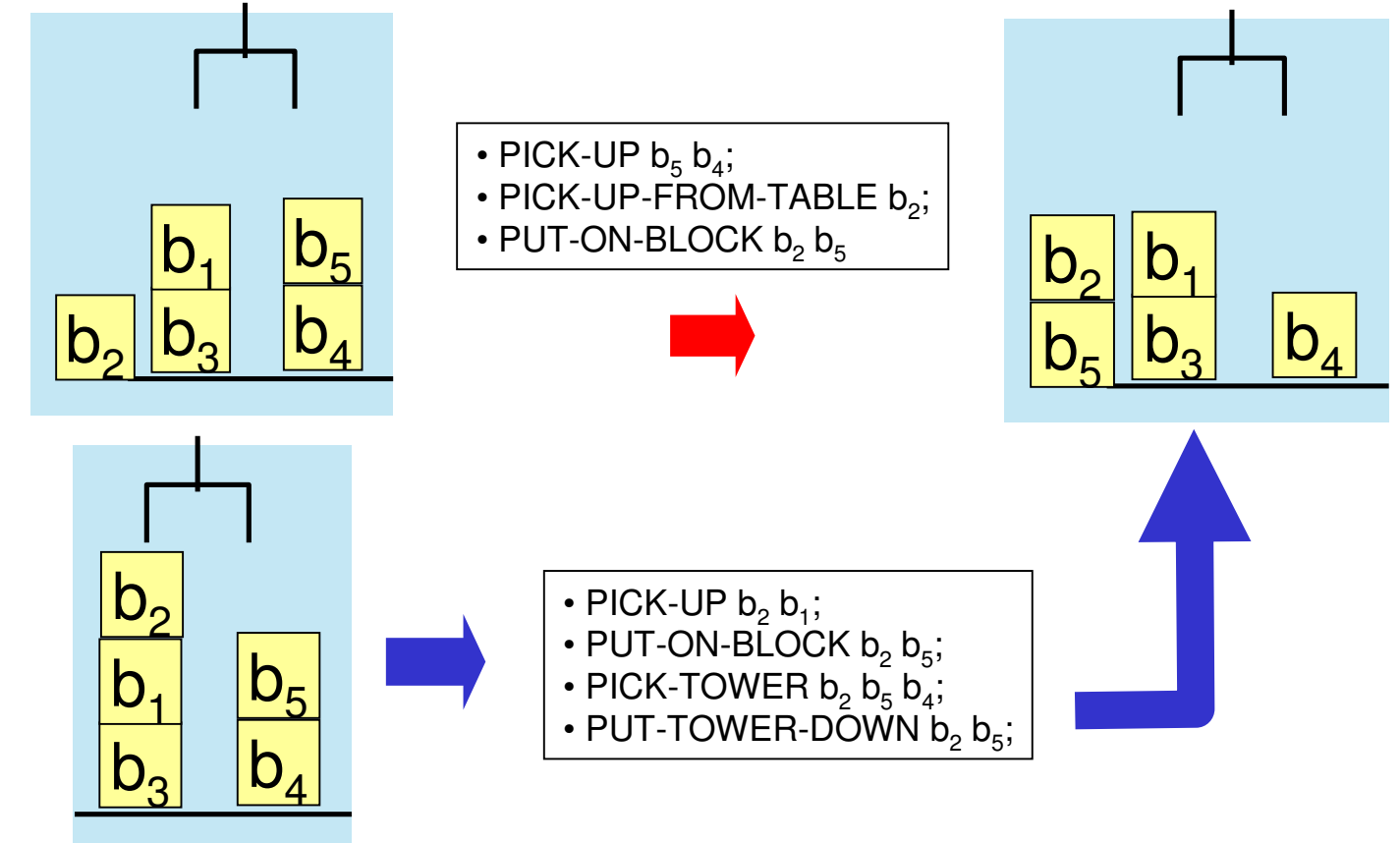
Step 3: Since no dead-ends are found, no backtrack is needed

- This Basic algorithm is **inefficient**
 - Certain states are repeatedly explored: the last two actions of Weak Plan 1 and Weak Plan 2 are identical.
- Goal:** Improve the efficiency of the Basic algorithm by proposing **two extensions**

Two Extensions

Extension 1: State Reuse

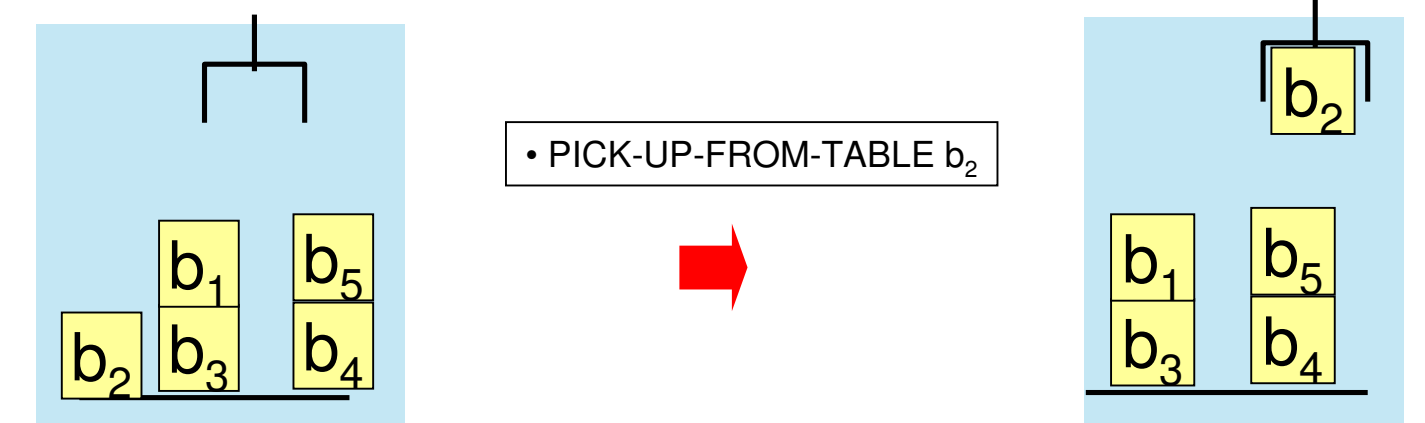
- Observation 1:** the first three actions in Weak Plan 2 yield the same state (call it s) as the first four actions in Weak Plan 1



- Observation 2:** since s is already solved in Weak Plan 1, there is no need to try to find a path from s to g in Weak Plan 2
- Given these observations, state reuse aims to improve efficiency by **stopping the search** as soon as a solved state is reached

Extension 2: Goal Alternative

- Observation:** To handle a failed effect (e.g., b_2 falling onto the table for action PICK-UP b_2 b_1), instead of establishing a path to the ultimate goal g (as in the Basic algorithm), we can try to establish a path to **intended effect** of PICK-UP b_2 b_1 , i.e., **holding b_2**



- The plan contains a **single** action, PICK-UP-FROM-TABLE b_2
 - Planning efficiency is improved and plan size is reduced!**
- However, if a path to the intended effect cannot be found, we can then try to establish a path to the original goal g .
- This is the **goal alternative** heuristic: it aims to improve planning efficiency and reduce plan size by searching for an **alternative, presumably closer goal**, the **intended effect** of an action, and backing off to the original goal if needed

Evaluation

- Goal:** Evaluate FIP, which implements the Basic algorithm together with our two extensions, on problem instances from 4 domains in the IPC2008 FOND track
 - Blockworld, faults, first-responders, forest
 - Compared against two state-of-the-art planners: Gamer & MBP
- Results and Discussion**
 - FIP has a better problem coverage than Gamer & MBP [Table 1]
 - Gamer & MBP cannot solve more than 10 problems in Blockworld
 - FIP can solve all problems efficiently (cutoff time 1,200 seconds)
 - FIP outperforms other planners w.r.t. CPU time t (expressed in seconds) and solution size s (expressed in the number of states in the solution policy) [Table 2]

Domain	Gamer		MBP		Basic		FIP	
	t	s	t	s	t	s	t	s
blockworld (30)	10	1	30	30				
faults (55)	38	16	55	55				
first-responders (100)	21	11	75	75				
forest(90)	7	0	7	7				
Total (275)	76	28	167	167				

Table 1

Problem	Gamer		MBP		Basic		FIP	
	t	s	t	s	t	s	t	s
bw-1	38.748	10	3556.577	0.011	12	0.007	8	
bw-5	37.506	13	---	0.020	12	0.010	12	
bw-10	28.650	13	---	0.015	22	0.009	10	
bw-12	---	---	---	3.507	225	0.285	45	
bw-25	---	---	---	452.642	537	59.230	312	
bw-30	---	---	---	42.755	102	3.126	48	
faults-7-7	90.996	235	---	0.043	258	0.005	23	
faults-8-8	1106.105	325	---	0.101	514	0.007	26	
faults-9-9	830.272	511	---	0.217	848	0.007	29	
faults-10-10	---	---	---	0.859	2050	0.009	32	
f-r-2-3	0.142	12	63.388	0.003	11	0.003	11	
f-r-4-2	0.118	8	---	0.003	6	0.003	6	
f-r-6-2	1.016	7	---	0.003	7	0.003	7	
forest-2-6	4.769	50	---	0.008	50	0.008	50	
forest-2-7	8.122	44	---	0.007	44	0.008	44	
forest-2-8	0.638	56	---	0.007	56	0.008	56	
forest-2-9	0.607	42	---	0.006	42	0.007	42	
forest-2-10	0.927	44	---	0.007	44	0.008	44	

Table 2