

# CMPE-633. Topics in Robotics and Control

Lecture 5

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# Discrete Planning

- **Planning** (robotics) or **Problem Solving** (AI) ?
- We will study
  - Discrete **configuration spaces** or **state spaces**
  - Modeling planning problems as graph search algorithms (feasible planning)
  - Optimal planning (dynamic programming)
- No geometric models or differential equations
- Key towards a unified approach towards planning problems
- Reference: Planning Algorithms by LaValle Ch 2

# State Space Models

- A distinct situation is a **state**, say  $x$
- Set of all possible states is **State Space**  $X$
- World is transformed through **actions** (controls)
- Actions are chosen by a planner
- Each action  $u$ , when applied to state  $x$ , produces a new state  $x'$ , via **State transition function**  $f$

$$x' = f(x, u)$$

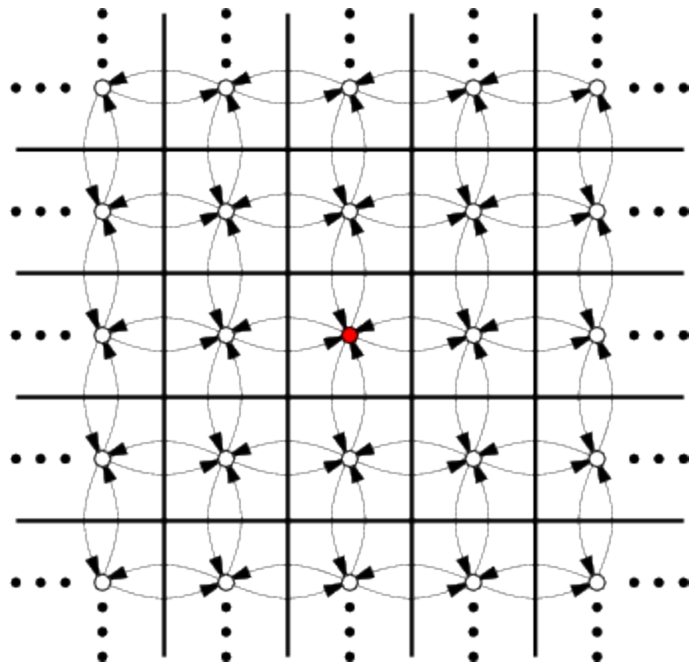
# Discrete Feasible Planning

## Formulation 2..1 (Discrete Feasible Planning)

1. A nonempty *state space*  $X$ , which is a finite or countably infinite set of *states*.
  2. For each state  $x \in X$ , a finite *action space*  $U(x)$ .
  3. A *state transition function*  $f$  that produces a state  $f(x, u) \in X$  for every  $x \in X$  and  $u \in U(x)$ .
  4. An *initial state*  $x_I \in X$ .
  5. A *goal set*  $X_G \subset X$ .
- $U(x)$  : set of all actions that can be applied from state  $x$ .
  - Choose controls to steer state to the goal.



# Example: An infinite tiled floor



# Example 2: Puzzle games

15	6	12	11
5	9	3	2
	13	10	1
7	14	4	8



15	6	12	11
5	9	3	2
7	13	10	1
	14	4	8



15	6	12	11
5	9	3	2
7	13	10	1
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# Sounds familiar?

- When state space is finite
  - Finite state machines (Mealy/Moore machines)
  - Deterministic Finite automata (DFA)



# How to solve? Search algorithms

- Graph search algorithms
- Requirement: systematic (keep track of visited states; visit every reachable state)

# General forward search

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## FORWARD\_SEARCH

```
1   $Q.Insert(x_I)$  and mark  $x_I$  as visited
2  while  $Q$  not empty do
3       $x \leftarrow Q.GetFirst()$ 
4      if  $x \in X_G$ 
5          return SUCCESS
6      forall  $u \in U(x)$ 
7           $x' \leftarrow f(x, u)$ 
8          if  $x'$  not visited
9              Mark  $x'$  as visited
10              $Q.Insert(x')$ 
11         else
12             Resolve duplicate  $x'$ 
13 return FAILURE
```

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# Backward Search

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```
BACKWARD_SEARCH
1   $Q.Insert(x_G)$  and mark  $x_G$  as visited
2  while  $Q$  not empty do
3       $x' \leftarrow Q.GetFirst()$ 
4      if  $x = x_I$ 
5          return SUCCESS
6      forall  $u^{-1} \in U^{-1}(x)$ 
7           $x \leftarrow f^{-1}(x', u^{-1})$ 
8          if  $x$  not visited
9              Mark  $x$  as visited
10              $Q.Insert(x)$ 
11         else
12             Resolve duplicate  $x$ 
13 return FAILURE
```

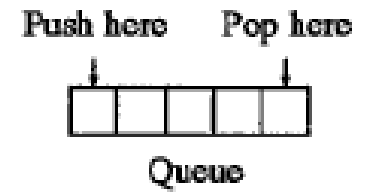
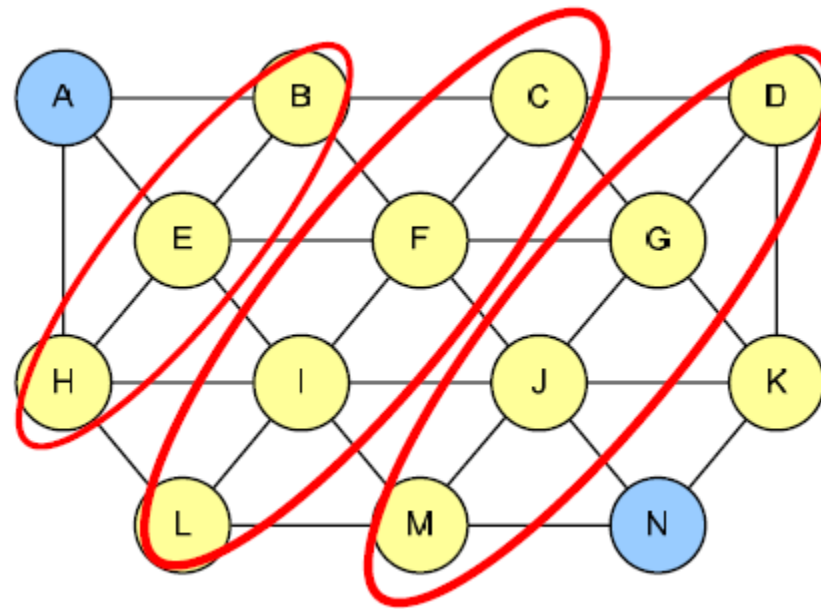
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**Figure 2.6:** A general template for backward search.

# General forward search

- States
  - Unvisited
  - Dead
  - Alive
- Set of alive states kept in a **priority queue**
- Implementation details (omitted)
  - How to determine whether  $x$  is in  $X_G$  (representation) [Line 4]
  - How to verify whether  $x$  has been visited? (lookup tables? Hashing?) [Line 8]
  - How to sort the queue?

# Breadth First Search

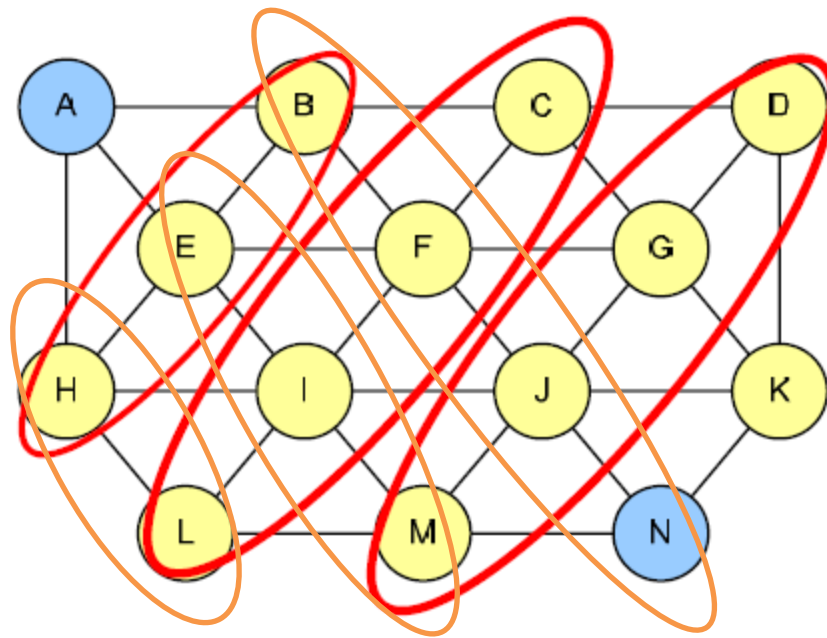


# Depth First Search

Push and pop here



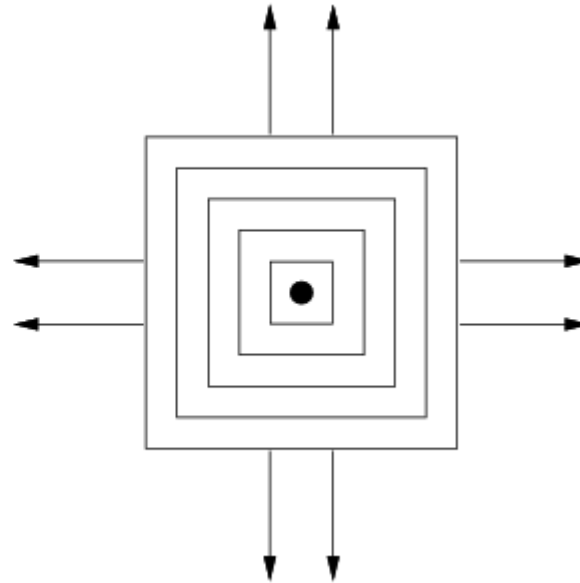
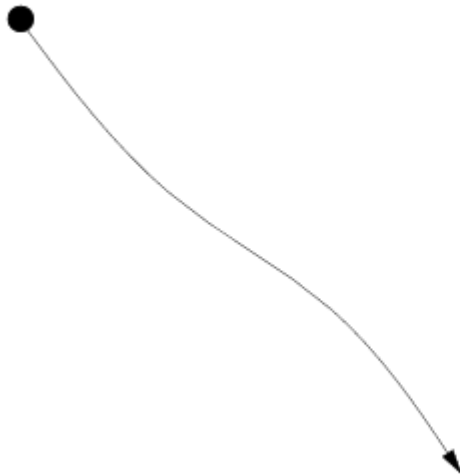
Stack



# Systematic searches

Requirement: systematic

- keep track of visited states
- visit every reachable state)



BFS is systematic

DFS is systematic for finite graphs

For finite graphs all searches are systematic

# Dijkstra's algorithm

- Optimal feasible paths
- Cost associated to each edge  $l(e) = l(x,u)$
- Total cost of plan = sum of edge costs
- **Cost to come**  $C: X \rightarrow [0, \infty]$
- Optimal cost to come  $C^*(x)$



# Dijkstra's algorithm

- Algorithm
  - Initially  $C^*(x_1) = 0$
  - Generate new state  $x' = f(x,u)$
  - For each new state  $C(x') = C^*(x) + l(x,u)$
  - If  $x'$  already exists then update  $C^*(x)$
  - Reorder queue according to costs