

Motion Planning for a Point Robot (2/2)

1

- Class scribing
- Position paper

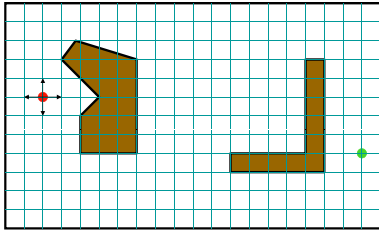
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Planning requires models

- The Bug algorithms are "reactive motion strategies"; they are not motion planners
- To plan its actions, a robot needs a (possibly imperfect) **predictive model** of its actions, so that it can choose among several possible courses of action

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Point Robot on a Grid

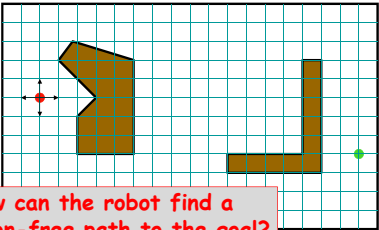


Assumptions:

- The robot perfectly controls its actions
- It has an accurate geometric model of the environment (i.e., the obstacles)

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Point Robot on a Grid



How can the robot find a collision-free path to the goal?

Assumptions:

- The robot perfectly controls its actions
- It has an accurate geometric model of the environment (i.e., the obstacles)

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8-Puzzle Game

8	2	
3	4	7
5	1	6

Initial state

1	2	3
4	5	6
7	8	

Goal state

State: Any arrangement of 8 numbered tiles and an empty tile on a 3x3 board

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8-Puzzle: Successor Function

8	2	7
3	4	
5	1	6

SUCC(state) → subset of states

The **successor function** is knowledge about the 8-puzzle game, but it does not tell us which outcome to use, nor to which state of the board to apply it.

8	2	
3	4	7
5	1	6

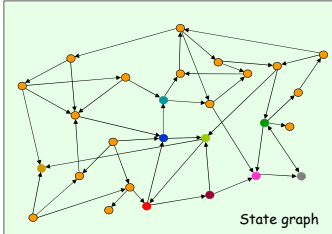
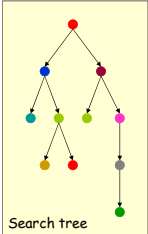
8	2	7
3	4	6
5	1	

8	2	7
3		4
5	1	6

Search is about the exploration of alternatives

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State Graph and Search Tree

Note that some states may be visited multiple times

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Search Nodes and States

8	2	
3	4	7
5	1	6

8	2	7
3	4	
5	1	6

If states are allowed to be duplicated, the search tree may be infinite even when the state space is finite

8	2	
3	4	7
5	1	6

8	2	
3	4	7
5	1	6

8	4	2
3		7
5	1	6

8	2	
3	4	7
5	1	6

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Node expansion

The **expansion** of a node N of the search tree consists of:

- 1) Evaluating the successor function on STATE(N)
- 2) Generating a child of N for each state returned by the function

8		2
3	4	7
5	1	6

N

	8	2
3	4	7
5	1	6

8	4	2
3		7
5	1	6

8	2	
3	4	7
5	1	6

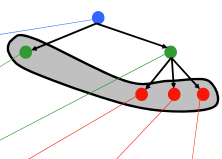
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Fringe of Search Tree

- The **fringe** is the set of all search nodes that haven't been expanded yet

8	2	
3	4	7
5	1	6

8	2	7
3	4	
5	1	6



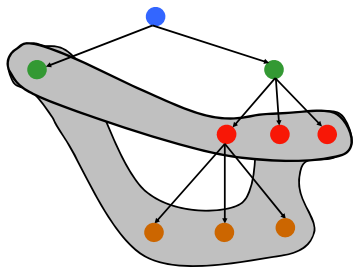
8	2	
3	4	7
5	1	6

8	2	
3	4	7
5	1	6

8	4	2
3		7
5	1	6

8	2	
3	4	7
5	1	6

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Search Strategy

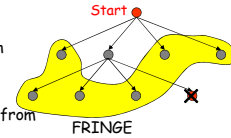
- The **fringe** is the set of all search nodes that haven't been expanded yet
- The fringe is implemented as a **priority queue** FRINGE
 - INSERT(node,FRINGE)
 - REMOVE(FRINGE)
- The ordering of the nodes in FRINGE defines the **search strategy**

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Search Algorithm

SEARCH(Start, Finish)

1. INSERT(Start,FRINGE)
2. Repeat:
 - a. If FRINGE is empty then return **failure**
 - b. $q \leftarrow$ REMOVE(FRINGE)
 - c. If $q =$ Finish then return a **path** from Start to Finish
 - d. For every **new** state q' in SUCCESSORS(q)
 - i. Install q' as a child of q in the search tree
 - ii. INSERT(q' ,FRINGE)



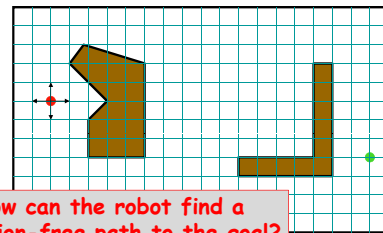
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Blind Search Strategies

- **Breadth-first**
New positions are inserted at the end of FRINGE *What is the effect?*
- **Depth-first**
New positions are inserted at the beginning of FRINGE *What is the effect?*

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Point Robot on a Grid

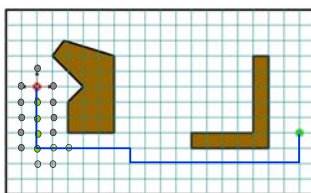


How can the robot find a collision-free path to the goal?

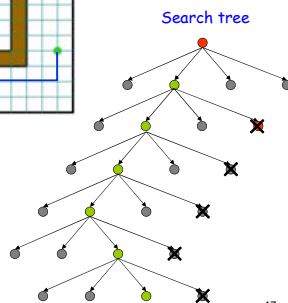
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- The robot perfectly controls its actions
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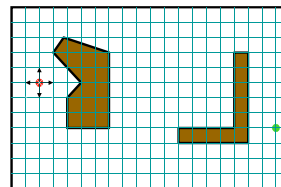
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Now, the robot can **search** its model for a collision-free path to the goal



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1000x1000 grid \rightarrow 1,000,000 configurations
 In 3-D $\rightarrow 10^9$ configurations
 In 6-D $\rightarrow 10^{18}$ configurations!!!

\rightarrow Need for smart search techniques
 or sparse discretization

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Smart Search

SEARCH(Start,Finish)

1. INSERT(q_{start} ,FRINGE)
2. Repeat:
 - a. If FRINGE is empty then return **failure**
 - b. $q \leftarrow$ REMOVE(FRINGE)
 - c. If $q =$ Finish then return a **path** from Start to Finish
 - d. For every **new** state q' in SUCCESSORS(q)
 - i. Install q' as a child of q in the search tree
 - ii. INSERT(q' ,FRINGE)

What can smart search be? How can it be done?

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Smart Search

SEARCH(Start,Finish)

1. INSERT(q_{start} ,FRINGE)
2. Repeat:
 - a. If FRINGE is empty then return **failure**
 - b. $q \leftarrow$ REMOVE(FRINGE)
 - c. If $q =$ Finish then return a **path** from Start to Finish
 - d. For every **new** state q' in SUCCESSORS(q)
 - i. Install q' as a child of q in the search tree
 - ii. INSERT(q' ,FRINGE)

→ Smart ordering of the configurations in FRINGE
(**best-first search**)

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Evaluation function

- f : node $N \rightarrow$ real positive number $f(N)$
- For instance $f(N)$ may be the Euclidean distance (straight-line distance) to the goal
- Sort the fringe by increasing value of f

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Application

$f(N) =$ Euclidean distance to the goal

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Application

$f(N) =$ Manhattan distance to the goal

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Another Example

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Another Example

$f(N) = h(N)$, with $h(N) =$ Manhattan distance to the goal

8	7	6	5	4	3	2	3	4	5	6
7		5	4	3						5
6			3	2	1	0	1	2		4
7	6									5
8	7	6	5	4	3	2	3	4	5	6

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Another Example

$f(N) =$ Manhattan distance to the goal

8	7	6	5	4	3	2	3	4	5	6
7		5	4	3						5
6			3	2	1	0	1	2		4
7	6									5
8	7	6	5	4	3	2	3	4	5	6

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Another Example

$f(N) = g(N) + h(N)$, with $h(N) =$ Manhattan distance to goal and $g(N) =$ distance traveled to reach N

8+3	7+4	6+3	5+6	4+7	3+8	2+9	3+10	4	5	6
7+2		5+6	4+7	3+8						5
6+1			3	2+9	1+10	0+11	1	2		4
7+0	6+1									5
8+1	7+2	6+3	5+4	4+5	3+6	2+7	3+8	4	5	6

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A* Search

$f(N) = g(N) + h(N)$, where $g(N)$ is the length of the path reaching N and $0 \leq h(N) \leq$ length of the shortest path from N to goal [h is called the heuristic function]

FRINGE is a priority queue sorted in increasing order of f

A*(Start,Finish)

1. Insert the initial-node (state = Start) into FRINGE
2. Repeat:
 - a. If FRINGE is empty then return failure
 - b. Let N be the first node in FRINGE, remove N from FRINGE
 - c. Let s be the state of N and mark s as closed
 - d. If s = Finish then return the path found between Start and Finish and exit
 - e. For every state s' in SUCCESSORS(s)
 - i. If s' is closed then do nothing
 - ii. Else
 - Create a node N' with state s' as a successor of N
 - If there is a node N'' in FRINGE with state s' then
 - If $g(N') < g(N'')$ then do nothing, else remove N'' from FRINGE and insert N' in FRINGE.
 - Else insert N' in FRINGE

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A* Search

$f(N) = g(N) + h(N)$, where $g(N)$ is the length of the path reaching N and $0 \leq h(N) \leq$ length of the shortest path from N to goal [h is called the heuristic function]

FRINGE

A*{

1. Both
 - $h(N) =$ Euclidean distance from N to goal
 - and
 - $h(N) =$ Manhattan distance from N to goal
2. verify $0 \leq h(N) \leq$ length of the shortest path from N to the goal
- e. For every state s' in SUCCESSORS(s)
 - If $g(N') < g(N'')$ do nothing, else remove N'' from FRINGE and insert N' in FRINGE
 - Else insert N' in FRINGE

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How to Choose h ?

- $f(N) = g(N) + h(N)$, where $0 \leq h(N) \leq$ length $h^*(N)$ of the shortest path from N to goal
- Would $h(N) \equiv 0$ be a good choice?
- Would $h(N) \equiv h^*(N)$ be a good choice?

- Which one is better:
 - $h(N) =$ Euclidean distance to goal?
 - $h(N) =$ Manhattan distance to goal?

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Attractive/Repulsive Potential Fields

$$U_{att}(q) = |q - q_{goal}|^2$$

$$U_{rep}(q) = \left(\frac{1}{d_{obst}(q)} - \frac{1}{d_{min}} \right)^2$$

Equipotential contours

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Attractive/Repulsive Potential Fields

$$U_{att}(q) = |q - q_{goal}|^2$$

**Best-first search with potential fields:
Sort positions in FRINGE in increasing order of potential**

**What could be a Bug motion strategy with potential fields?
What would be its drawback?**

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1000x1000 grid → 1,000,000 configurations
 In 3-D → 10⁹ configurations
 In 6-D → 10¹⁸ configurations!!!

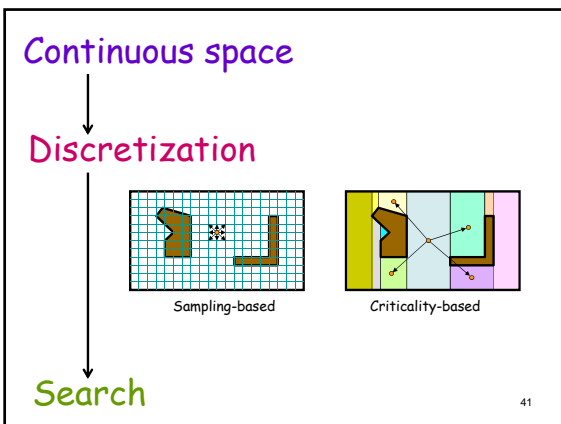
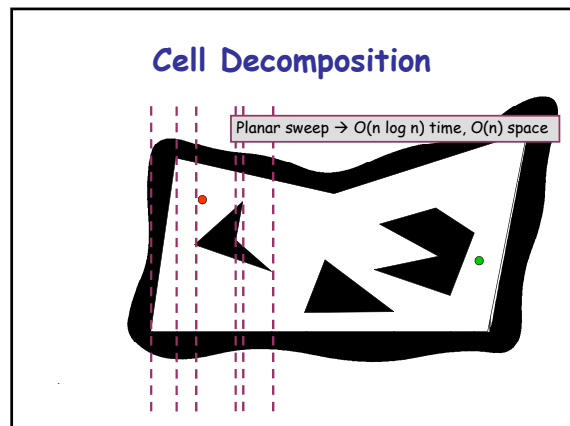
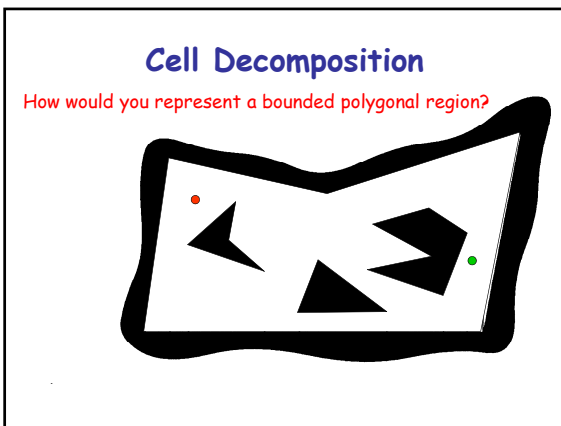
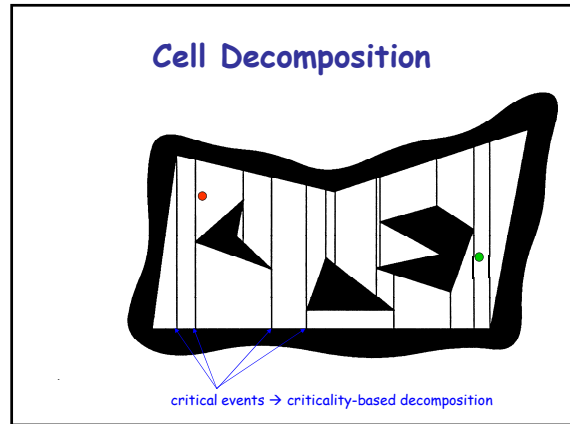
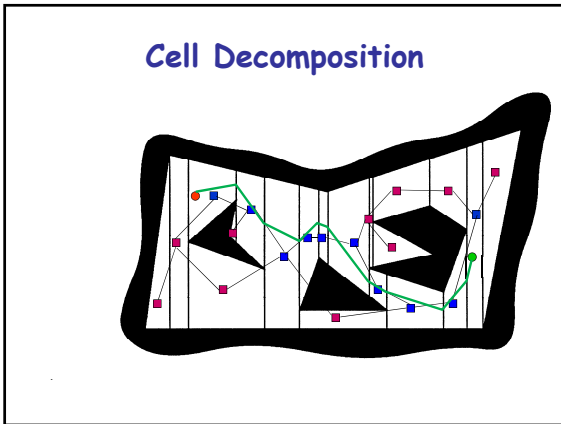
→ Need for smart search techniques
or **sparse discretization**

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Cell Decomposition

Cell Decomposition

Cell Decomposition



- ### Tradeoffs
- Cell decomposition: precomputation of data structure
 - Path planning: query processing for a given (Start, Finish) pair using this data structure
 - Can the precomputation cost be amortized over several queries?
 - What if the world changes frequently?
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Visibility Graph

SHAKEY (SRI, 1969)

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Visibility Graph

Computational complexity?

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How would you check whether two line segments intersect?

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Voronoi Diagram

What is this?

Advantages/drawbacks relative to visibility graph method?

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