

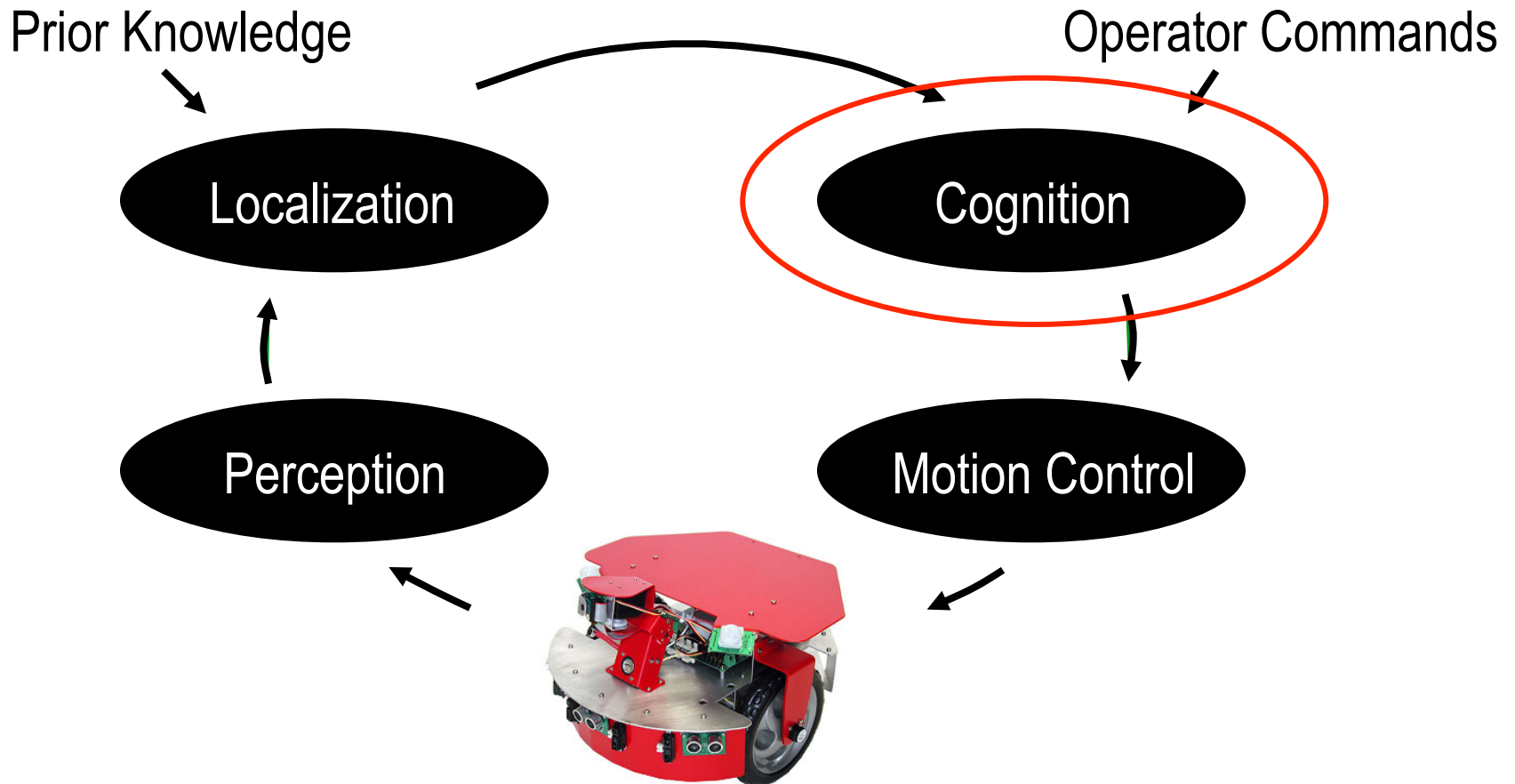


COS 495 – Lecture 22

Autonomous Robot Navigation

Instructor: Chris Clark
Semester: Fall 2011

Control Structure

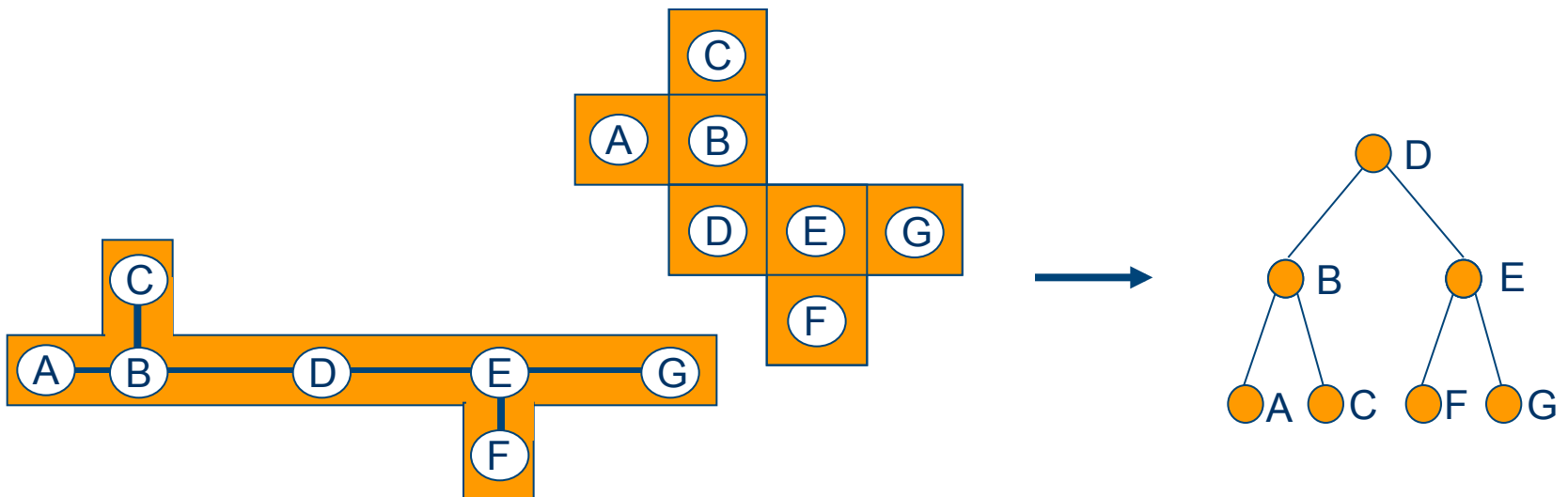


Graph Search: Outline

- **Search Algorithms**
 1. Breadth First Search
 2. Depth First Search
 3. A*

Motion Planning: Tree Search

- Once the configuration space is discretized, we can perform a tree search
 - Note: we know the connections, not the whole tree!
 - Example: How do we get from D to G?



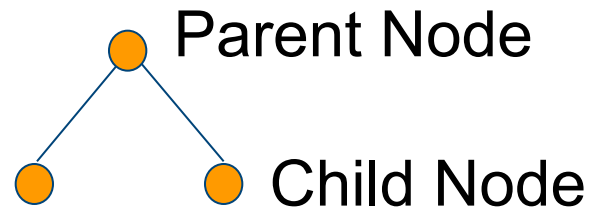


Motion Planning: Search Algorithms

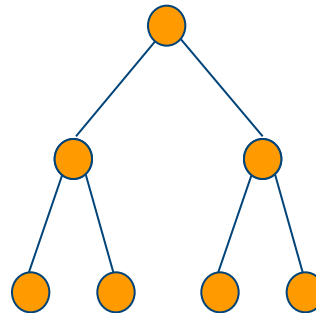
- There are many tree searches available, but how are they different?
 1. Breadth First Search
 2. Depth First Search
 3. Depth limited search
 4. A*
 5. ...

Motion Planning: Breadth First Search

- Tree nomenclature:



- Algorithms differ in the order in which they search the branches (edges) of the tree

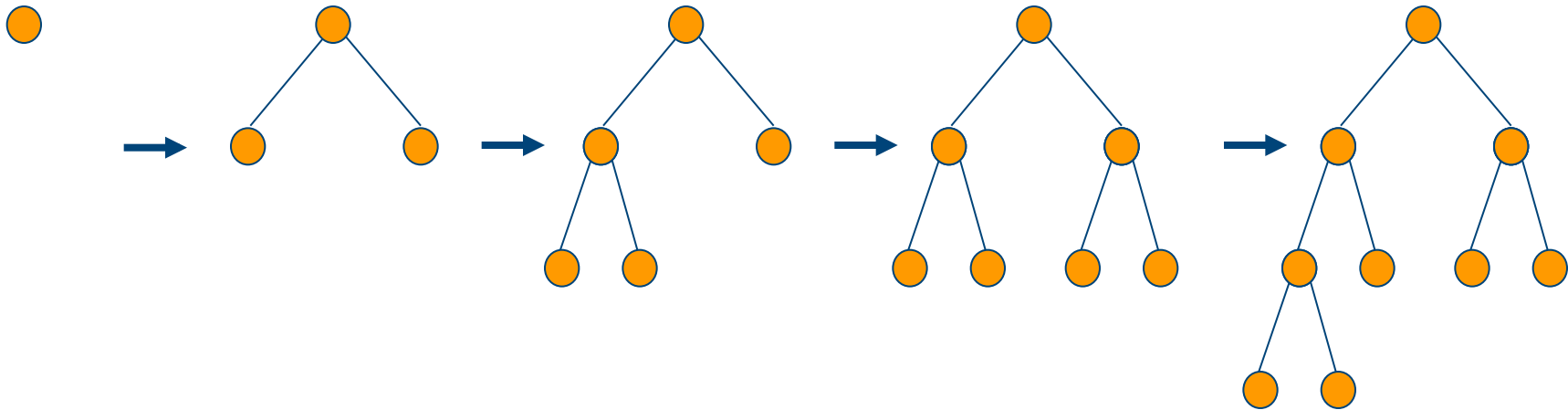


Graph Search: Outline

- Search Algorithms
 1. Breadth First Search
 2. Depth First Search
 3. A*

Motion Planning: Breadth First Search

- Search a tree, one level at a time.



Motion Planning: Breadth First Search

- Complete
- Optimal if cost is increasing with path depth.
- Computational complexity $O(b^d)$, where b is the branching factor and d is the depth
- Space (memory) complexity $O(b^d)$

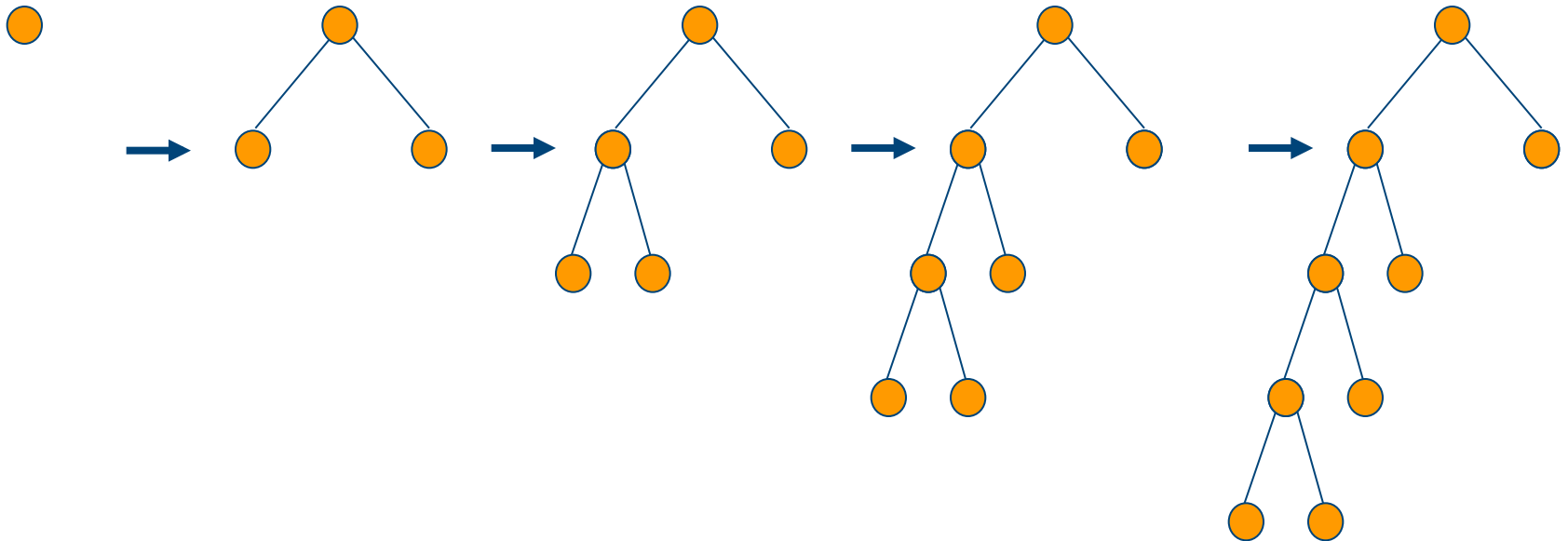


Graph Search: Outline

- Search Algorithms
 1. Breadth First Search
 2. **Depth First Search**
 3. A*

Motion Planning: Depth First Search

- Search a tree, always expand to deepest level until final depth is reached.





Motion Planning: Depth First Search

- NOT Complete if infinite depth
- NOT Optimal
- Computational complexity $O(b^m)$, where b is the branching factor and m is the depth
- Space (memory) complexity $O(bm)$
- Good if there are many GOOD solutions

Graph Search: Outline

- Search Algorithms
 1. Breadth First Search
 2. Depth First Search
 3. A^*



Motion Planning: A* Search

- There are a set of algorithms called “Best-First Search”
- They try to search the children of the “best” node to expand.
- A* has become incredibly popular because it attempts to make the best node the one that will find the optimal solution and do so in less time.



Motion Planning: A* Search

- A* is optimal and complete, but can take time...
- Its complexity depends on the heuristic, but is exponential with the size of the graph.

Motion Planning: A* Search

- We evaluate a node n for expansion based on the function:

$$f(n) = g(n) + h(n)$$

- Where

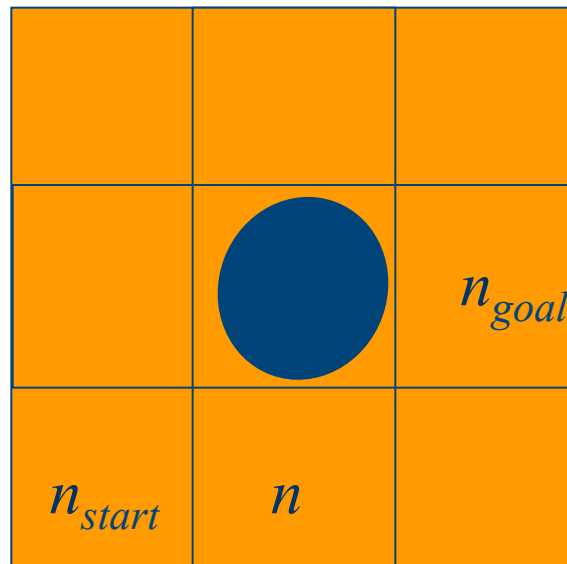
$g(n)$ = path cost from the start node to n

$h(n)$ = estimated cost of the cheapest path from node n to the goal

Motion Planning: A* Search

- Example: Cost for one particular node

$$f(n) = g(n) + h(n)$$



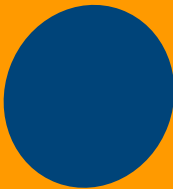
$$g(n) = 1$$

$$h(n) = \sqrt{2}$$

Motion Planning: A* Search

- Example: Cost for each node

$$f(n) = g(n) + h(n)$$

g=2 h= $\sqrt{3}$	g=3 h= $\sqrt{2}$	g=4 h=1
g=1 h=2		n_{goal}
n_{start}	g=1 h= $\sqrt{2}$	g=2 h=1



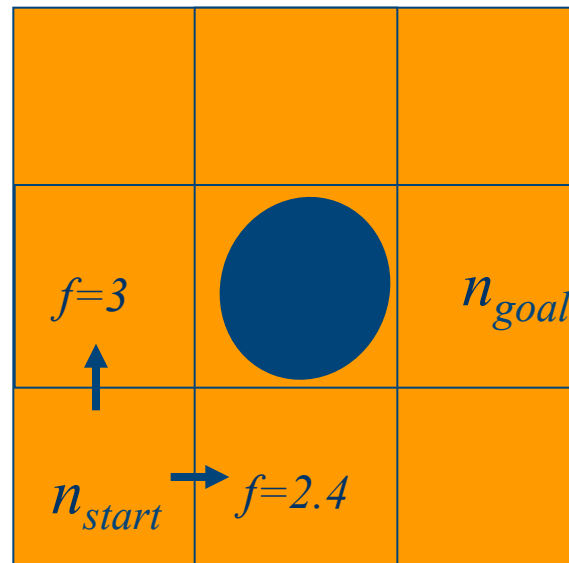
Motion Planning: A* Search

- The strategy is to expand the node with the cheapest path (lowest f).
- This is proven to be complete and optimal, if $h(n)$ is an *admissible* heuristic.
- Here, an admissible heuristic is one that never *overestimates* the cost to the goal
 - Example: the Euclidean distance.

Motion Planning: A* Search

- Search example: Iteration 1

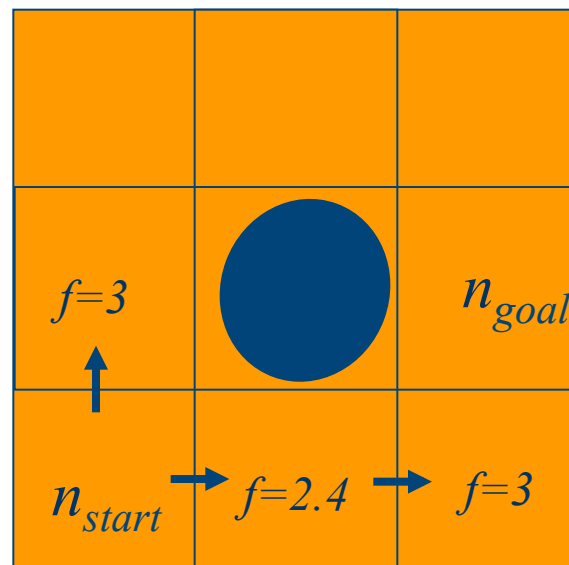
$$\text{Fringe set} = \{f_1 = 2.4, f_2 = 3\}$$



Motion Planning: A* Search

- Search example: Iteration 2

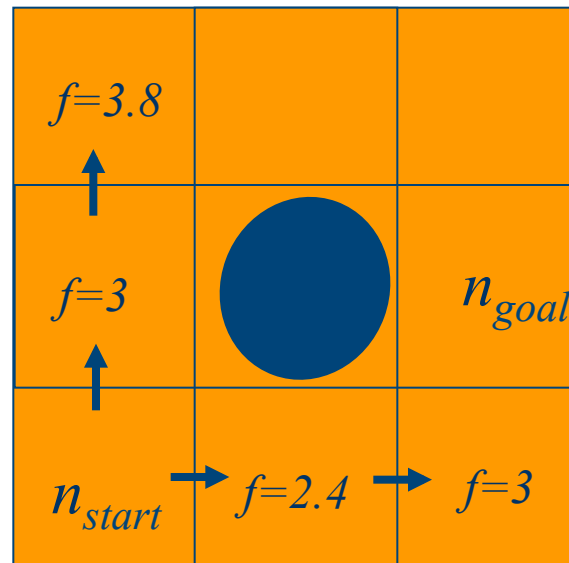
$$\text{Fringe set} = \{f_2 = 3, f_3 = 3\}$$



Motion Planning: A* Search

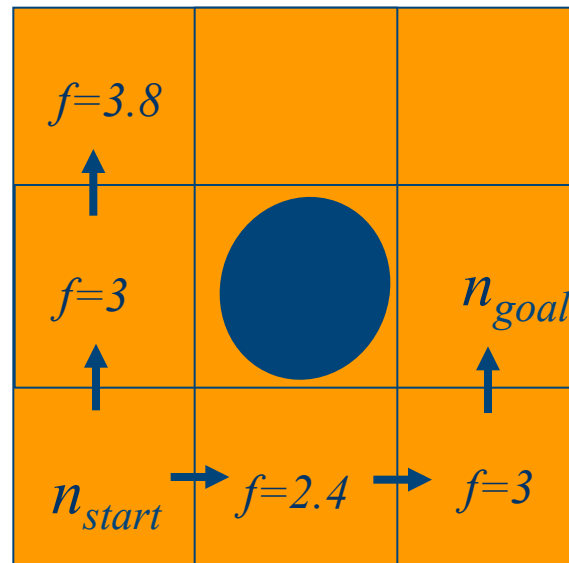
- Search example: Iteration 3

$$\text{Fringe set} = \{f_3 = 3, f_4 = 3.8\}$$



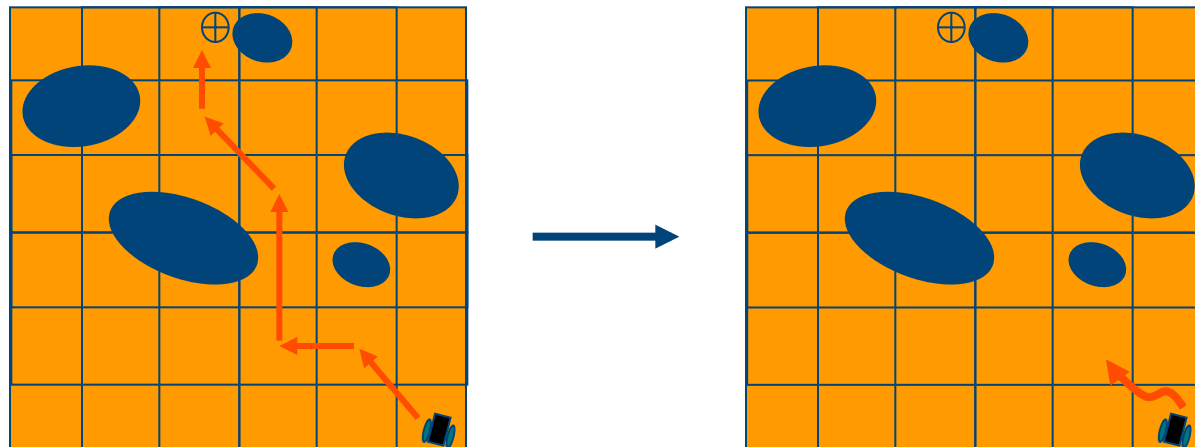
Motion Planning: A* Search

- Search example: Iteration 4



Motion Planning: Final Note

- A robot is often implemented with two planners:
 - Global Planner: A planner that plans an optimal plan with respect to some course discretization of a map.
 - Local Planner: A reactive planner for obstacle avoidance and kinematic considerations.





Motion Planning: Final Note

- A* is often used as a global planner
- Planner that considers kinematic/dynamic constraints is used for local planning.