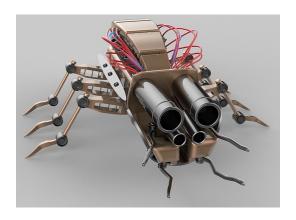
#### COMS W4733: Computational Aspects of Robotics

Lecture 11: Bug Algorithms 1



Slide materials from H. Choset, G. D. Hager, and Z. Dodds
Instructor: Tony Dear

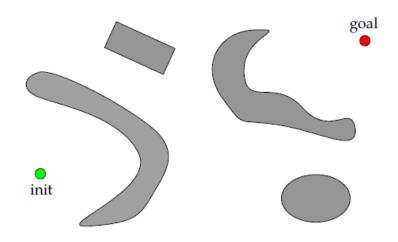
#### Planning Algorithms

- Up to now: Continuous trajectories represented as mathematical functions
- Easy to formulate, guaranteed solution given initial and final conditions
- But extremely limited to obstacle-free, static, fully observable environments!
- Robots operate in the real world
- Full of obstacles (possibly dynamic), oftentimes not fully observable
- Plans and trajectories need to update in response to environment feedback
- Choice of algorithms will depend on what we know and what we don't

#### **Bug Algorithms**

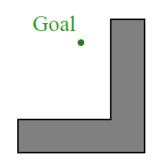
- How do bugs traverse the environment?
- Assume only local knowledge of surroundings
  - Tactile sensing
  - Finite distance sensing
- Behaviors are simple and can be enumerated
  - Follow a wall
  - Move toward a goal





#### **Environment Setup**

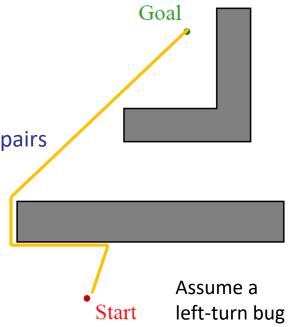
- Assume point robot—not worrying about kinematics or constraints here!
- Environment is bounded, finite number of obstacles
- Robot knows its global position
- Robot is able to measure distance between points
  - Does not know layout of obstacles
- Workspace: (x, y) or  $(x, y, \theta) \in W$
- Set of obstacles:  $WO_i$
- Free workspace:  $W_{free} = W \cup_i WO_i$



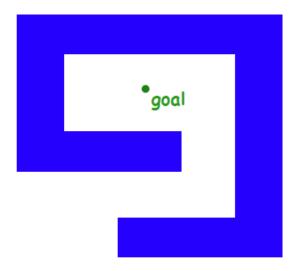




- If no obstacles, best path to the goal is a simple straight line
- May encounter obstacles between  $q_{start}$  and  $q_{goal}$ 
  - *Hit point* on obstacle  $i: q_i^H$
  - Leave point on obstacle  $i: q_i^L$
- Path can be represented as a sequence of hit-leave point pairs
- While not at goal:
  - If at obstacle according to sensors:
    - Follow obstacle until we can head toward goal
  - Else: Head toward goal

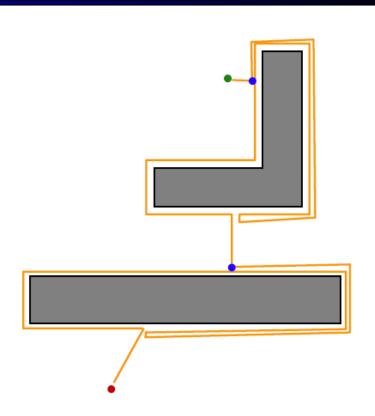


- When does bug 0 fail?
- Drawback: Bug 0 has no memory
- Going around in loops can be a problem
- Can we improve Bug 0 without adding any features?
- What if we always turn right rather than left?
- Unfortunately we wouldn't know when to switch

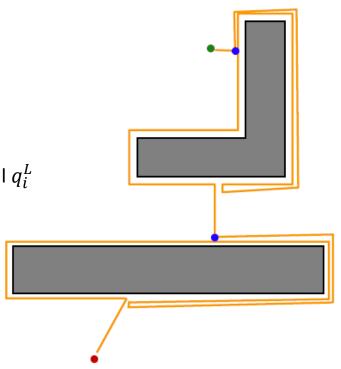


• star

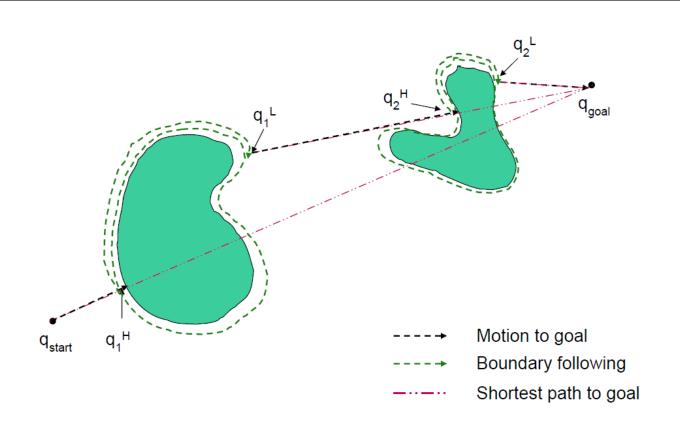
- How to improve Bug 0 if we had memory?
- We should realize if we have circumnavigated an obstacle—remember  $q_i^H$
- What else should we keep track of?
- If we have seen the obstacle's entire perimeter, we would also know the best point to leave it
- Once we reach  $q_i^H$  again, return to that closest point and move forward



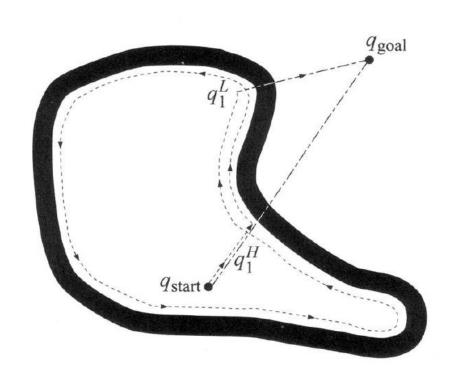
- $q_0^L \leftarrow q_{start}, i = 1$
- Loop:
  - Repeat: From  $q_{i-1}^L$  move toward  $q_{goal}$
  - If goal reached: Exit and return success
  - If obstacle  $WO_i$  encountered at  $q_i^H$ :
    - lacktriangle Circumnavigate  $WO_i$  and record closest point to goal  $q_i^L$
    - If goal reached: Return success
    - If  $q_i^H$  re-encountered: return to  $q_i^L$
  - If move toward  $q_{goal}$  encounters obstacle:
    - Return failure
  - Else:  $i \leftarrow i + 1$



# Bug 1 Examples



# Bug 1 Examples

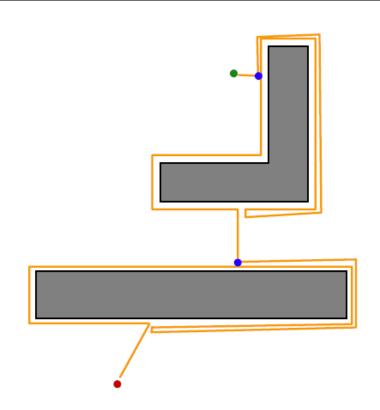


### Bug 1 Completeness

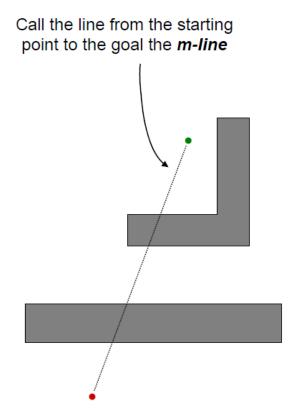
- Suppose Bug 1 never terminates...
  - But each leave point is closer to the goal than the hit point, since we pick  $q_i^L$  to be the closest point on the obstacle:  $d(q_i^L, q_{goal}) < d(q_i^H, q_{goal})$
  - Each hit point is also closer to the goal than the last hit point, since the robot moved toward the obstacle from  $q_{i-1}^L$  to arrive at  $q_i^H$
  - There a finite number of hit/leave point pairs, which the robot will eventually exhaust
- Suppose Bug 1 incorrectly returns failure...
  - Then it will attempt to leave from the closest leave point  $q_i^L$  that will run into an obstacle
  - lacktriangle But there must be at least one other possible leave point  ${q_i^L}^*$  on the obstacle along line to goal
  - Since a path exists, robot would have encountered  $q_i^{L^*}$  while circumnavigating obstacle and would not leave from  $q_i^L$

#### Bug 1 Performance

- What are the best- and worst-case scenarios?
- Best case: Robot goes straight to goal
- Distance = D (distance from start to goal)
- Worst case: Robot travels D distance, plus completely circumnavigating all obstacles
- Distance =  $D + 1.5 \sum_{i} P_{i}$
- $P_i$  = perimeter of  $WO_i$

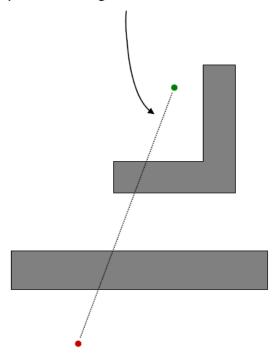


- Do we really need to explore every obstacle's perimeter all the time?
- We already had some idea of the "shortest path" to the goal from the start!
- New idea: Just follow the m-line whenever we are able to instead of computing new shortest paths
- Only need to remember m-line and hit points

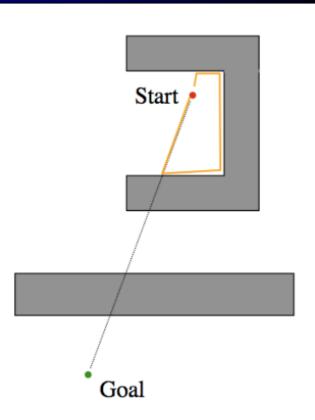


- $q_0^L \leftarrow q_{start}$ , i = 1
- Loop:
  - Repeat: From  $q_{i-1}^L$  move toward  $q_{goal}$  along m-line
  - If goal reached: Exit and return success
  - If obstacle  $WO_i$  encountered at  $q_i^H$ :
    - Repeat: Turn left or right and follow boundary of WO<sub>i</sub>
      - If goal reached: Return success
      - If  $q_i^H$  re-encountered: Return failure
      - If m-line encountered at m s.t.  $d(m, q_{goal}) < d(q_i^H, q_{goal})$  and line $(m, q_{goal})$  does not encounter obstacle:
        - Stop following  $WO_i$
  - $q_i^L \leftarrow m; i \leftarrow i + 1$

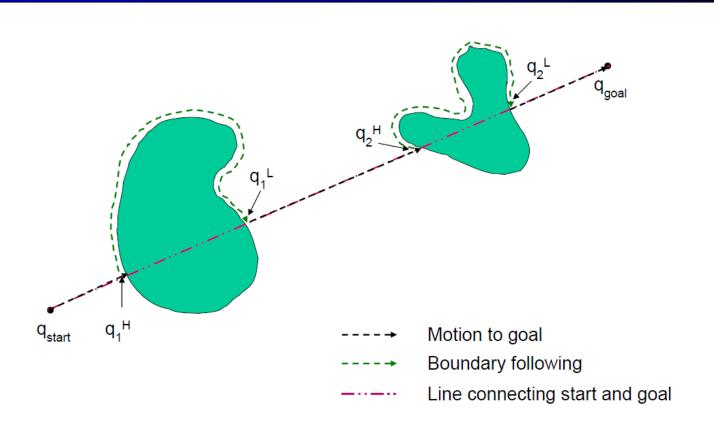
Call the line from the starting point to the goal the *m-line* 



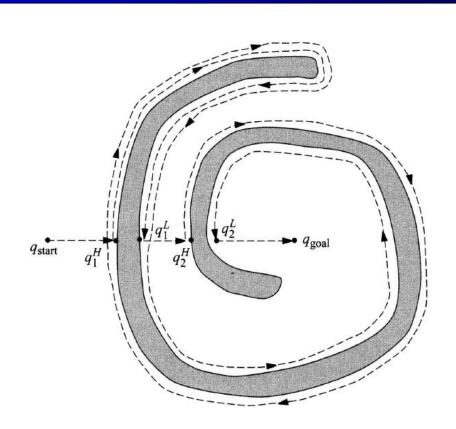
- Why do we need the distance condition when circling  $WO_i$ ?
- If m-line encountered at m s.t.  $d(m, q_{goal}) < d(q_i^H, q_{goal})$  and line $(m, q_{goal})$  does not encounter obstacle
- Is it possible to re-encounter m-line such that we're actually farther away from the goal than when we started?
- In other words, can we somehow follow an obstacle to move behind the start or hit point?
- Distance condition ensures we don't get stuck in infinite loop!



# Bug 2 Examples

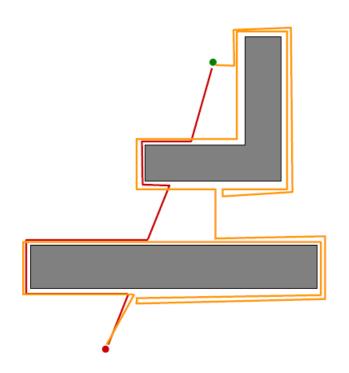


# Bug 2 Examples

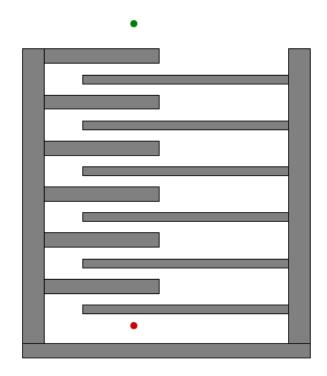


### Bug 1 vs Bug 2

Bug 2 beats Bug 1?

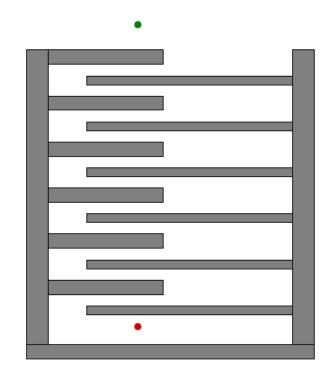


Bug 1 beats Bug 2?



#### Bug 2 Performance

- Best case: Robot goes straight to goal, distance = D
- Same as Bug 1
- What is the worst case?
- Each time we follow the m-line and find a hit point  $q_i^H$ , we could potentially traverse the perimeter!
- Suppose  $n_i$  = number of intersections with  $WO_i$
- Worst case: distance =  $D + \frac{1}{2}\sum_{i} n_{i}P_{i}$



#### **Bug Algorithm Properties**

- Bug 1 is an exhaustive search algorithm
- Circumnavigate every obstacle, check all options before choosing the best one
- Bug 2 is a greedy search algorithm
- Takes the first thing that looks good—leave points along stored m-line
- Bug 2 can outperform Bug 1 in many situations, but not always
- Bug 1 has more predictable performance and results
- Both algorithms are complete—either return a path or failure if none exists