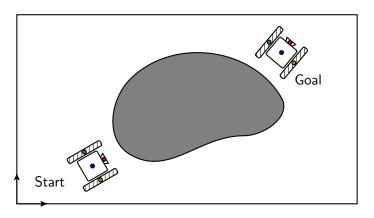
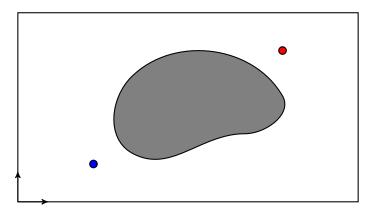
# ME 599/699 Robot Modeling & Control

# **Motion Planning II**

Spring 2020 Hasan Poonawala

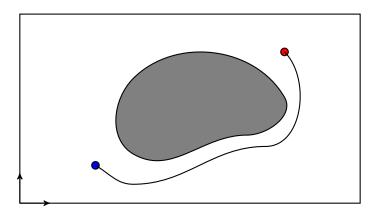


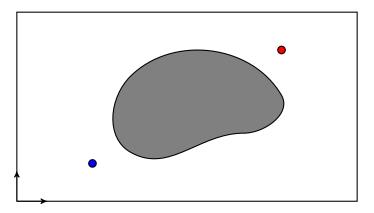
Motion Planning Problem



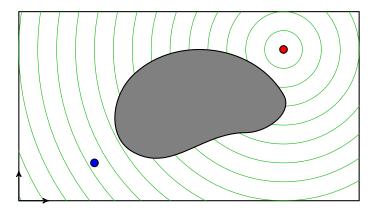
Simplified Problem



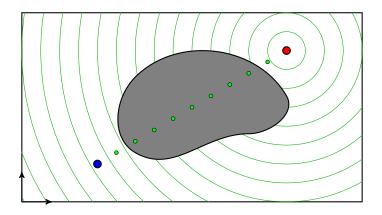




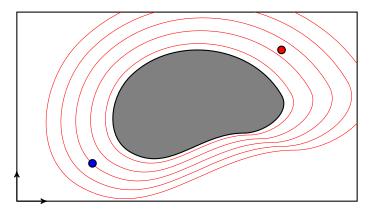
Choose potential function  $U(q) = \|q - q_g\|^2$ 



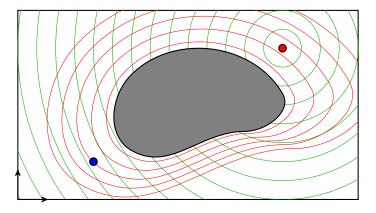
Level sets of U(q) are circles, gradients are perpendicular to level sets



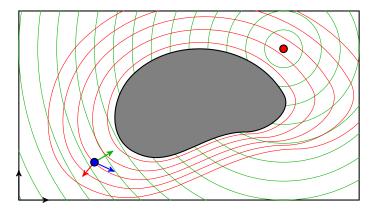
Gradient steps generate a sequence of points



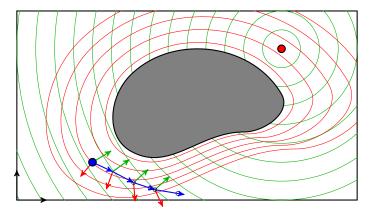
Clearly this solution is invalid. Need to add a term to handle obstacles



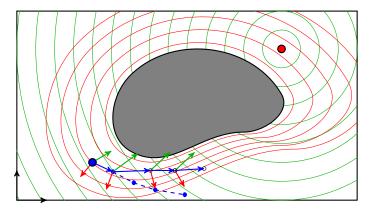
Our potential is the sum of the potential  $U_{attr}(q)$  due to the goal and  $U_{rep}(q)$  due to the obstacle



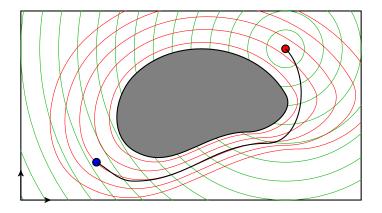
The negative gradient  $-\nabla U_{attr}(q)$  pulls us to goal,  $-\nabla U_{rep}(q)$  pushes us away from obstacle, their sum is the blue arrow.



Repeating this process after every step along the blue arrows generates a sequence.



Scaling  $U_{attr}(q)$ , which scales its gradient, pulls path closer to the obstacle.



Next step: convert sequence of nodes/configurations into a trajectory.

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### **Full Trajectory**

- ▶ PRM, RRT, Potential-functions etc generate a sequence of configurations/nodes; a path in a graph.
- ► To get a full trajectory, we need to use a local planner to convert an edge in the graph to a trajectory.
- Essentially, we will fit parametrized functions of time to pairs of points.

Let two nodes in the sequence by  $q_1$  and  $q_2$ , where we want the trajectory to pass through them at  $t_1$  and  $t_2$  ( $> t_1$ ) respectively

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Linear interpolation in time provides a simply trajectory

$$q(t) = q_1 + \frac{t - t_1}{t_2 - t_1}(q_2 - q_1) = a_1t + a_0$$

where

$$a_0 = \frac{q_1t_2 - q_2t_1}{t_2 - t_1}, \quad a_1 = \frac{q_2 - q_1}{t_2 - t_1}.$$

This interpolation satisfies  $q(t_1) = q_1$ ,  $q(t_2) = q_2$ 

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For 
$$t \in [t_1, t_2]$$
,

$$\dot{q}(t) = a_1 = \frac{q_2 - q_1}{t_2 - t_1}.$$

The velocity is constant during this time interval.



Take three configurations  $q_1$ ,  $q_2$ , and  $q_3$ . Let times be  $t_1$ ,  $t_2$ ,  $t_3$ .

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Use linear interpolation for  $q_1$  and  $q_2$  to get a function  $q^a(t)$ , and also for  $q_2$  and  $q_3$  to get  $q^b(t)$ .

We know that we will achieve  $q^a(t_1)=q_1$ ,  $q^a(t_2)=q_2=q^b(t_2)$ , and  $q^b(t_3)=q_3$ 

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However, for  $t \in [t_1, t_2]$ ,

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Generally,  $\dot{q}^a(t_2) \neq \dot{q}^b(t_2)$ . [Why is this bad?]



To make the velocity continuous at  $t_2$ , maybe we should use quadratic functions for  $q^a(t)$  and  $q^b(t)$ , and make sure that  $\dot{q}^a(t_2) = \dot{q}^b(t_2)$ .

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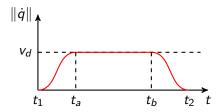
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We use all these polynomials to define q(t) over the time interval  $[t_0, t_N]$  where there are N+1 nodes.

# Other Approaches

Parabolic blends: assume we have to be stopped at node (sensor task/way-station task).
Divide time interval into three intervals: middle has a given velocity v<sub>d</sub>, first and third represent smooth transition from 0 to v<sub>d</sub> and v<sub>d</sub> back to 0.



- Minimum-time parabolic blends: make the transition times  $t_a t_1$  and  $t_2 t_b$  as short as possible, and  $v_d$  as high as possible.
- ► B-Splines, Bezier Curves etc.



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- Challenge: implementing continuous trajectory (feedback control & state estimation)