



Potential fields

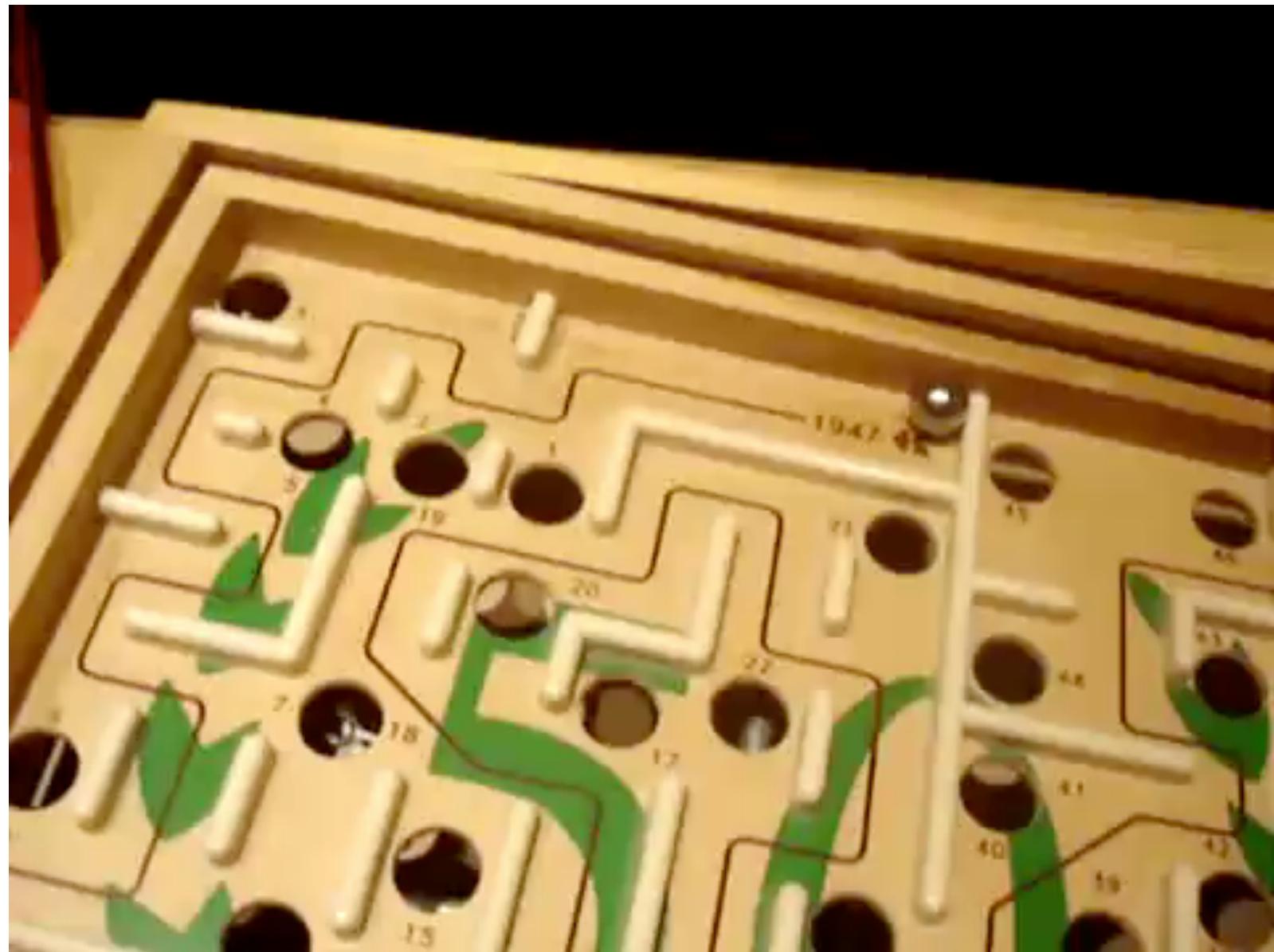
follow your
potential

Approaches to motion planning

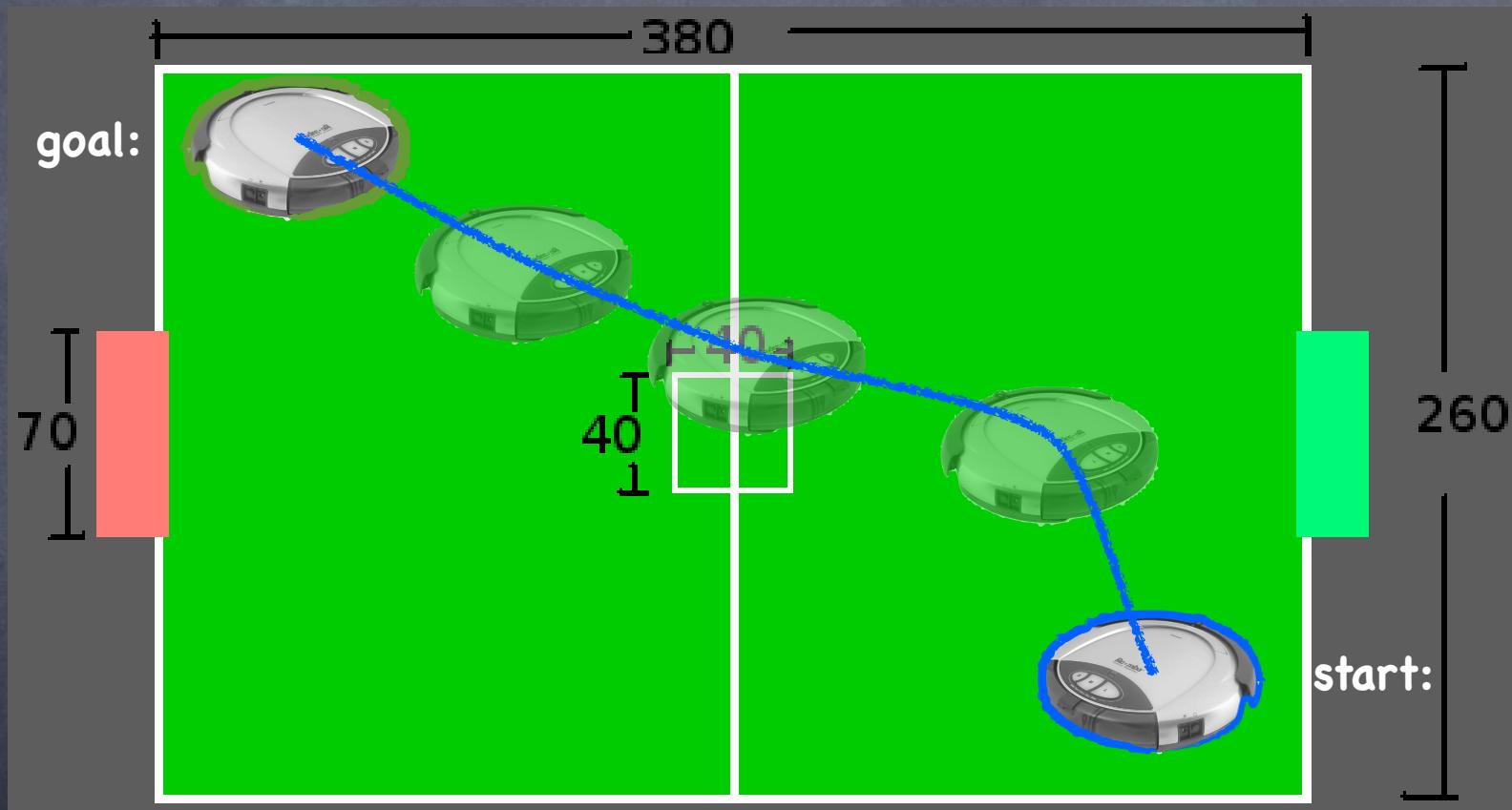
- Bug algorithms: Bug[0-2], Tangent Bug
- Graph Search (fixed graph)
 - Depth-first, Breadth-first, Dijkstra, A-star, Greedy best-first
- Sampling-based Search (build graph):
 - Probabilistic Road Maps, Rapidly-exploring Random Trees
- **Optimization and local search:**
 - **Gradient descent, Potential fields, Simulated annealing, Wavefront**



Michigan E360 Society, RoboCup 10 - autorob.org

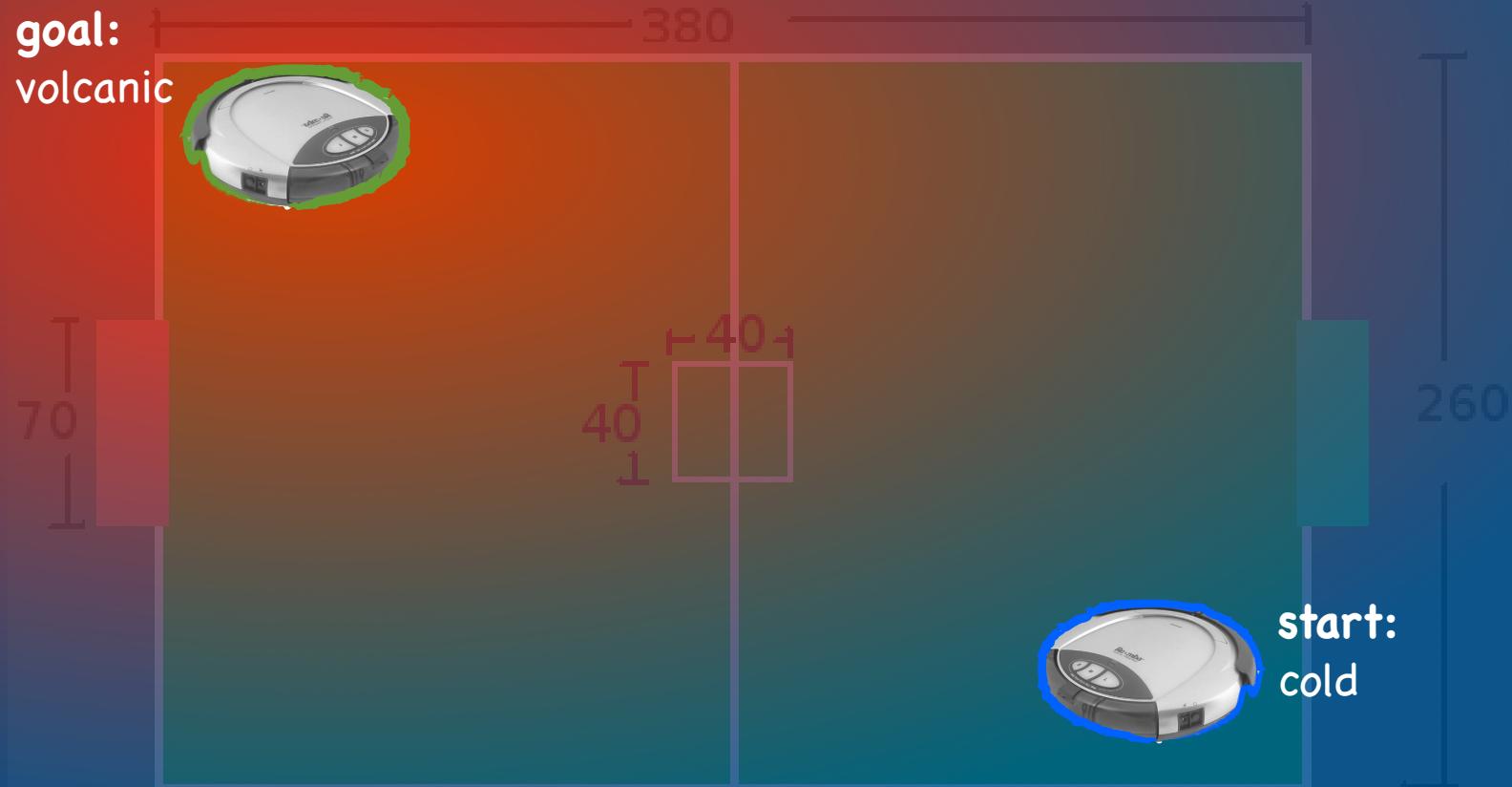


Navigation (again)



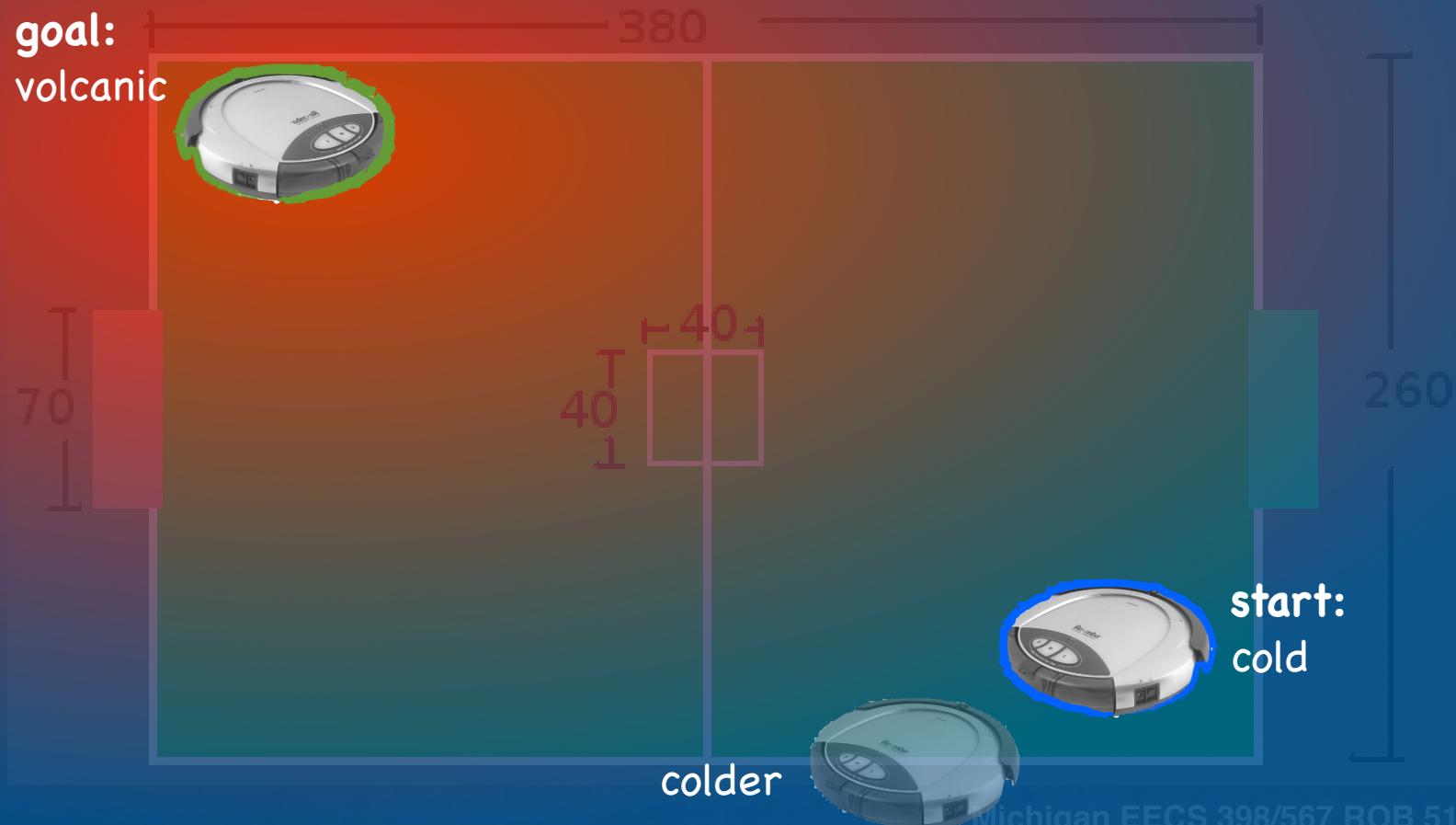
Potential field

(like a game of “warmer-colder”)



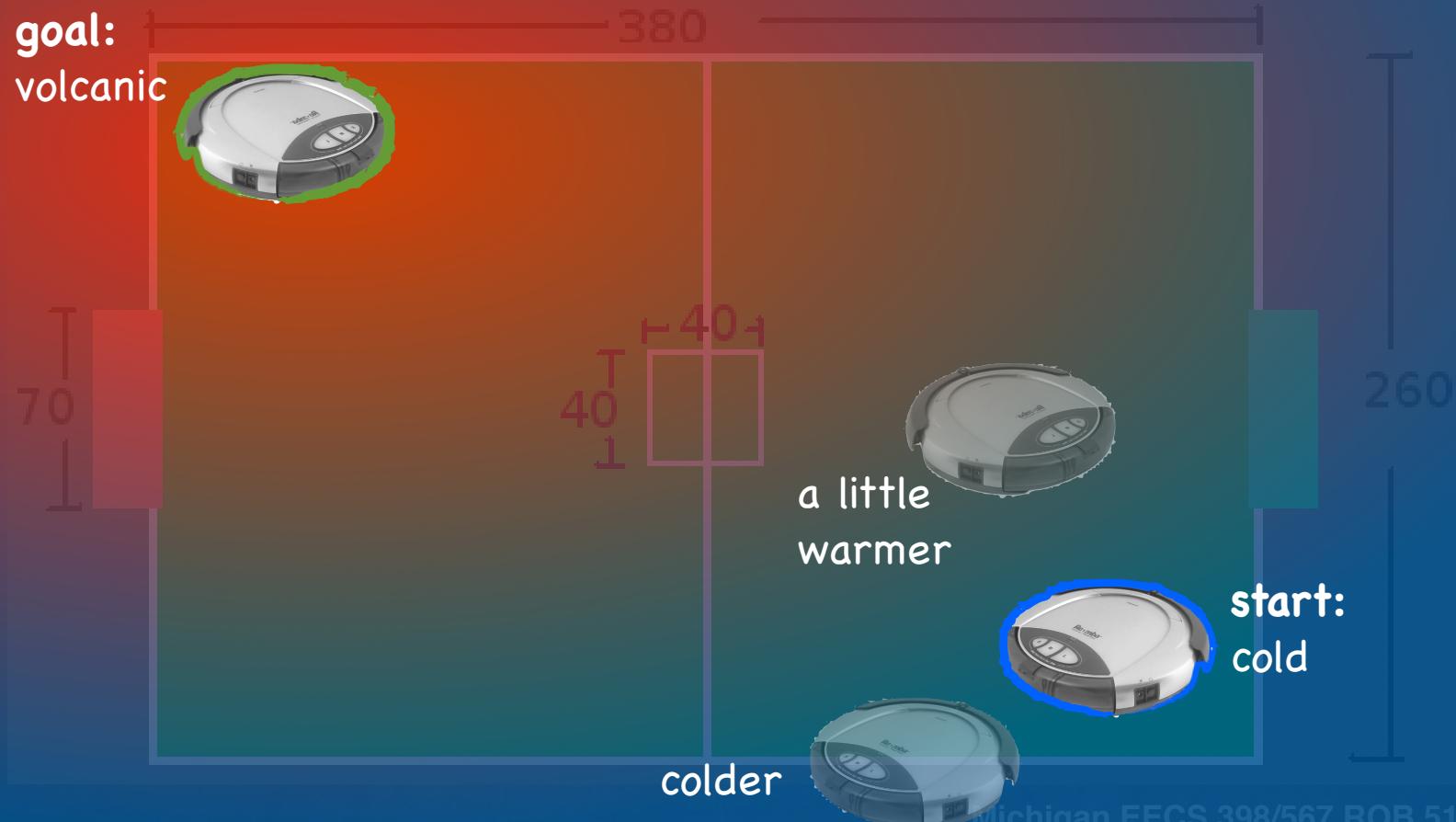
Potential field

(like a game of “warmer-colder”)



Potential field

(like a game of “warmer-colder”)



Potential field

(like a game of “warmer-colder”)

goal:
volcanic

380

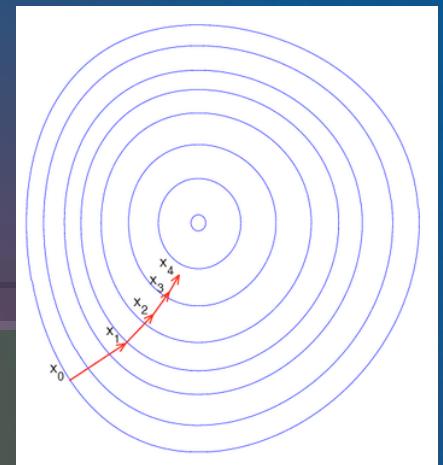
70

40
1

colder

a little
warmer

start:
cold

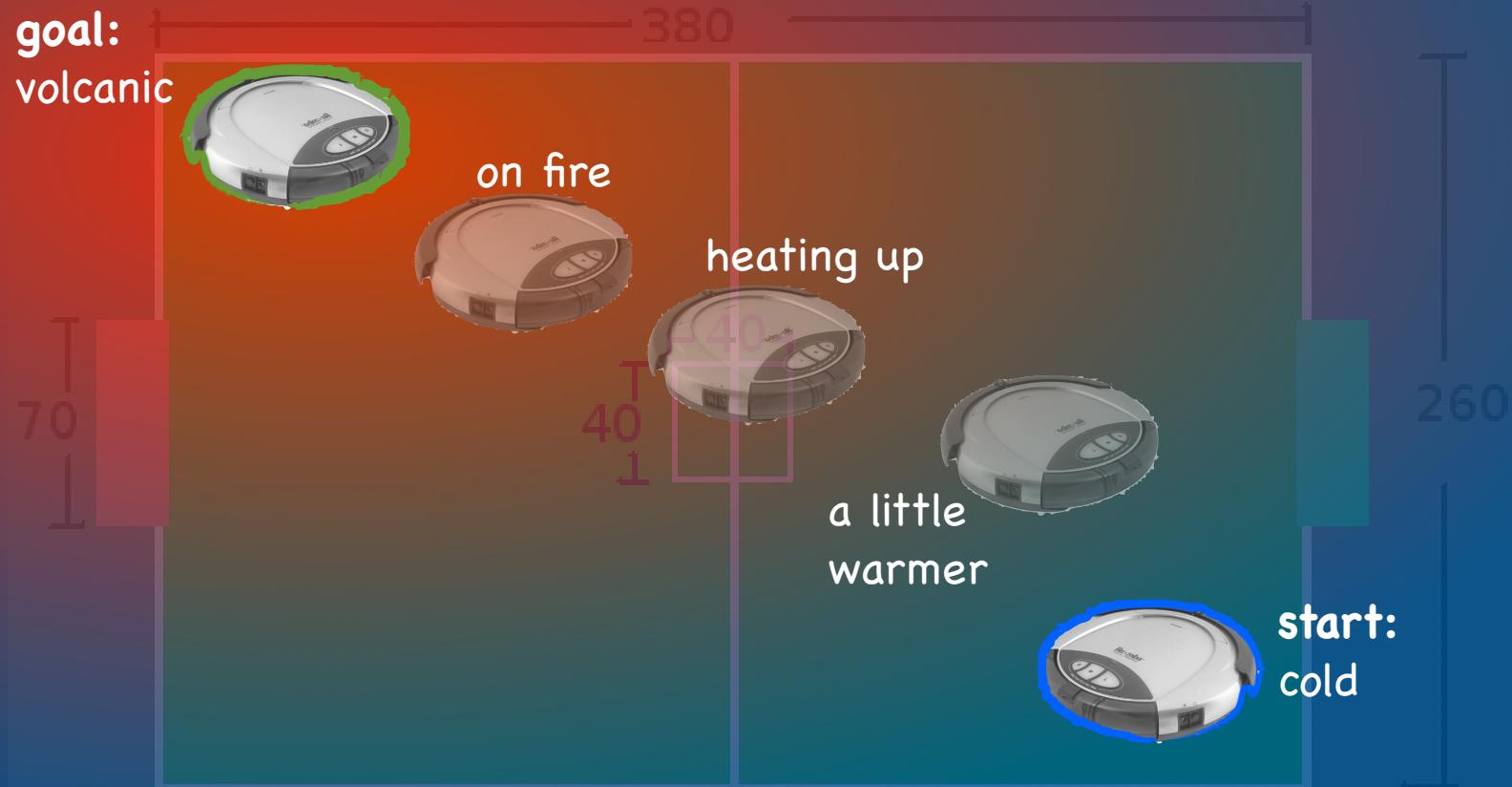


Gradient descent:
Energy potential
converges at goal

260

Potential field

(like a game of “warmer-colder”)



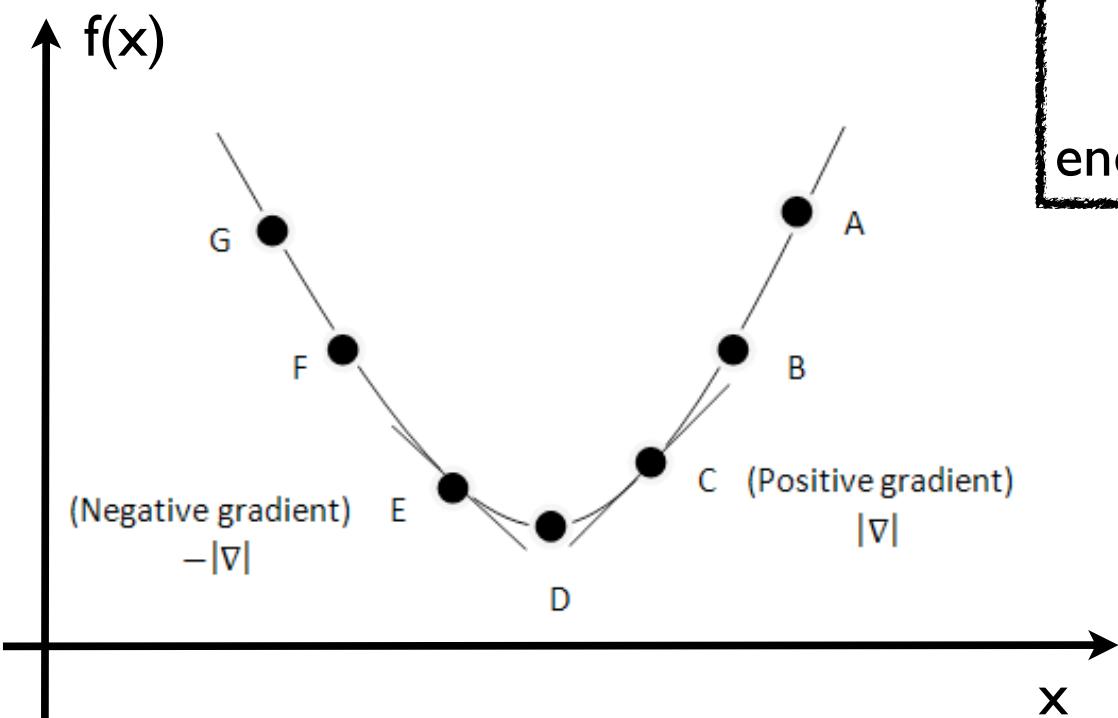
How do we define a
potential field?

Potential Field

- A potential field is a differentiable function $U(q)$ that maps configurations to scalar “energy” value
- At any q , gradient $\nabla U(q)$ is the vector that maximally increases U
- At goal q_{goal} , energy is minimized such that $\nabla U(q_{goal}) = 0$
- Navigation by descending field $-\nabla U(q)$ to goal

Gradient descent

From Wikipedia, the free encyclopedia



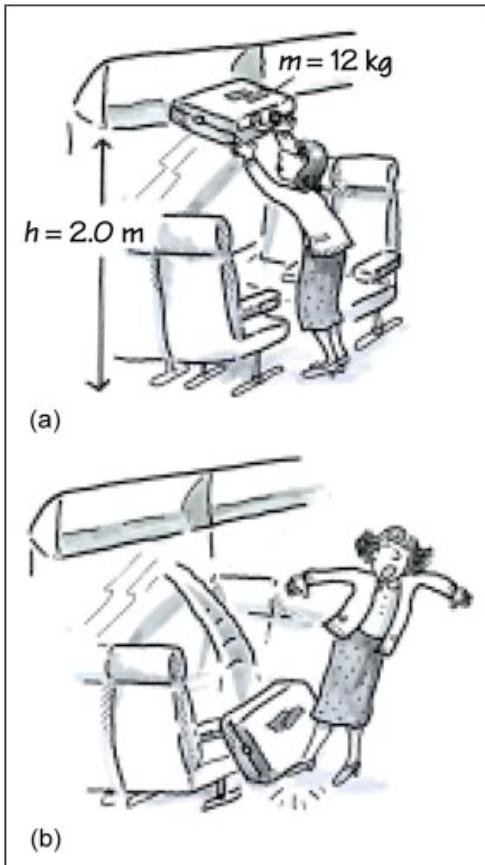
Gradient Descent Algorithm:

```
qpath[0] ← qstart
i ← 0
while (||∇U(q[i])|| > ε)
    qpath[i+1] ← qpath[i] - α ∇U(qpath[i])
    i ← i+1
end
```

Derivative assumed to be direction
of steepest ascent away from goal

$$\mathbf{x}_{n+1} = \mathbf{x}_n - \gamma_n \boxed{\nabla F(\mathbf{x}_n)}$$

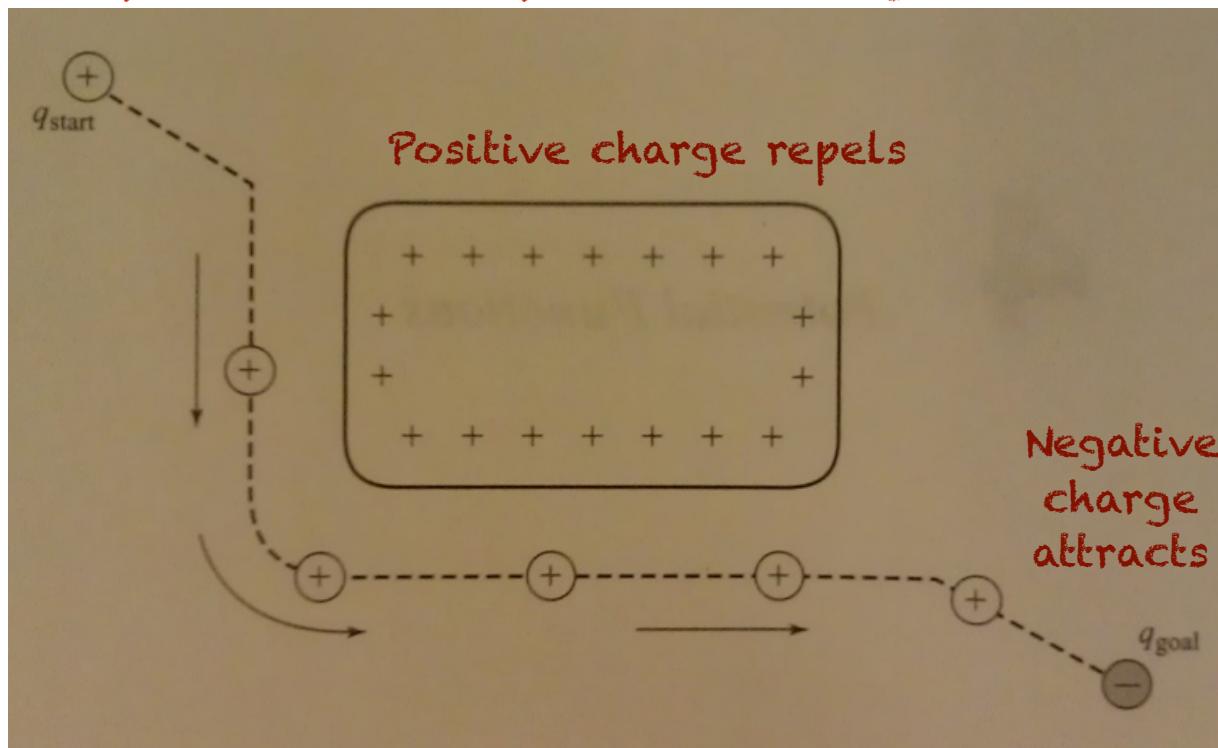
Potential Energy



- Energy stored in a physical system
- Kinetic motion caused by system moving to lower energy state
- For objects acting only w.r.t. gravity
- $\text{potential_energy} = \text{mass} * \text{height} * \text{gravity}$

Charged Particle Example

Positively charged particle follows potential energy to goal



Convergent Potentials

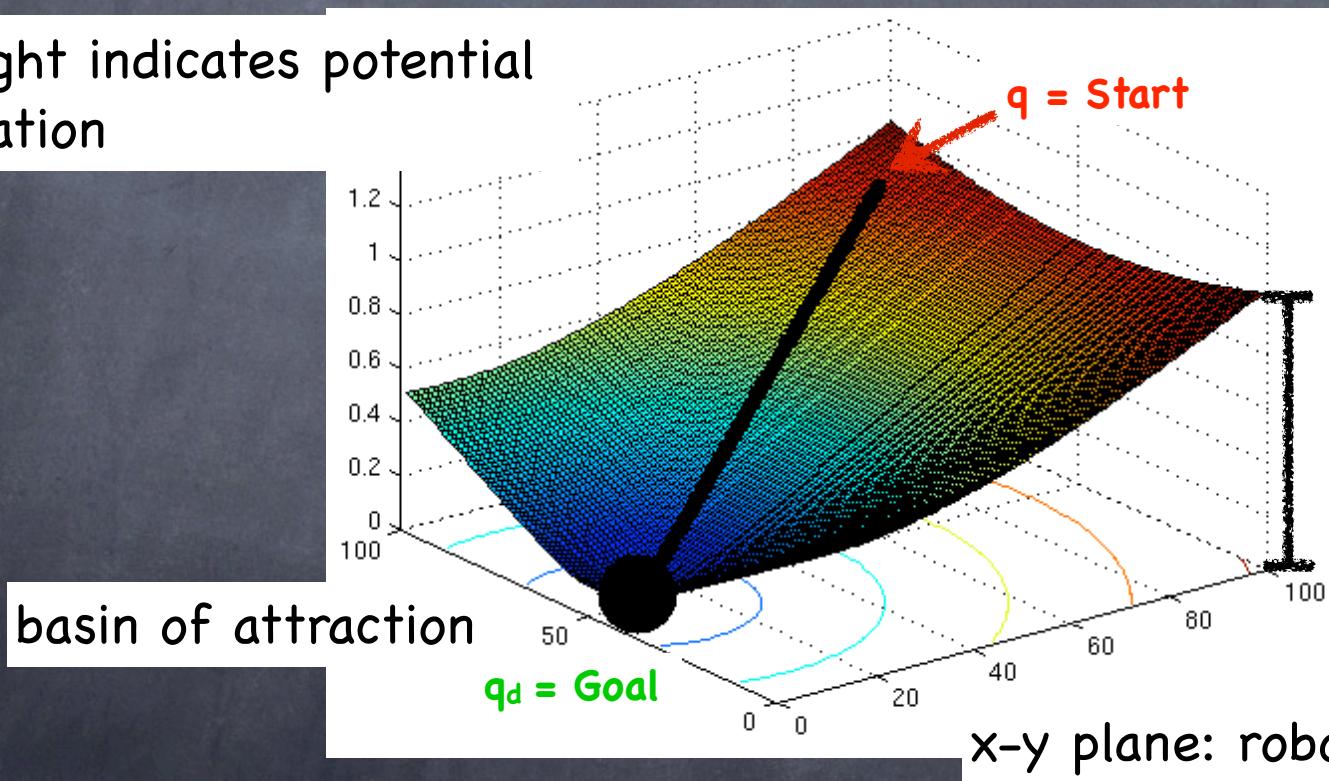
let's call these "attractor landscapes"



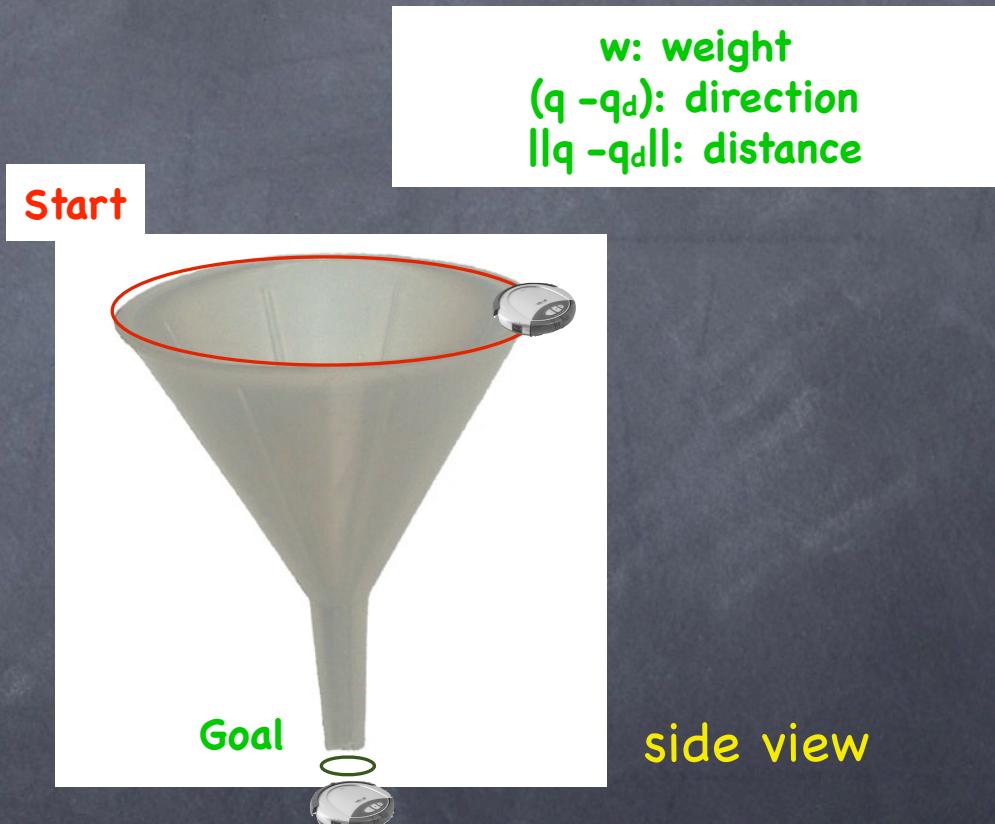
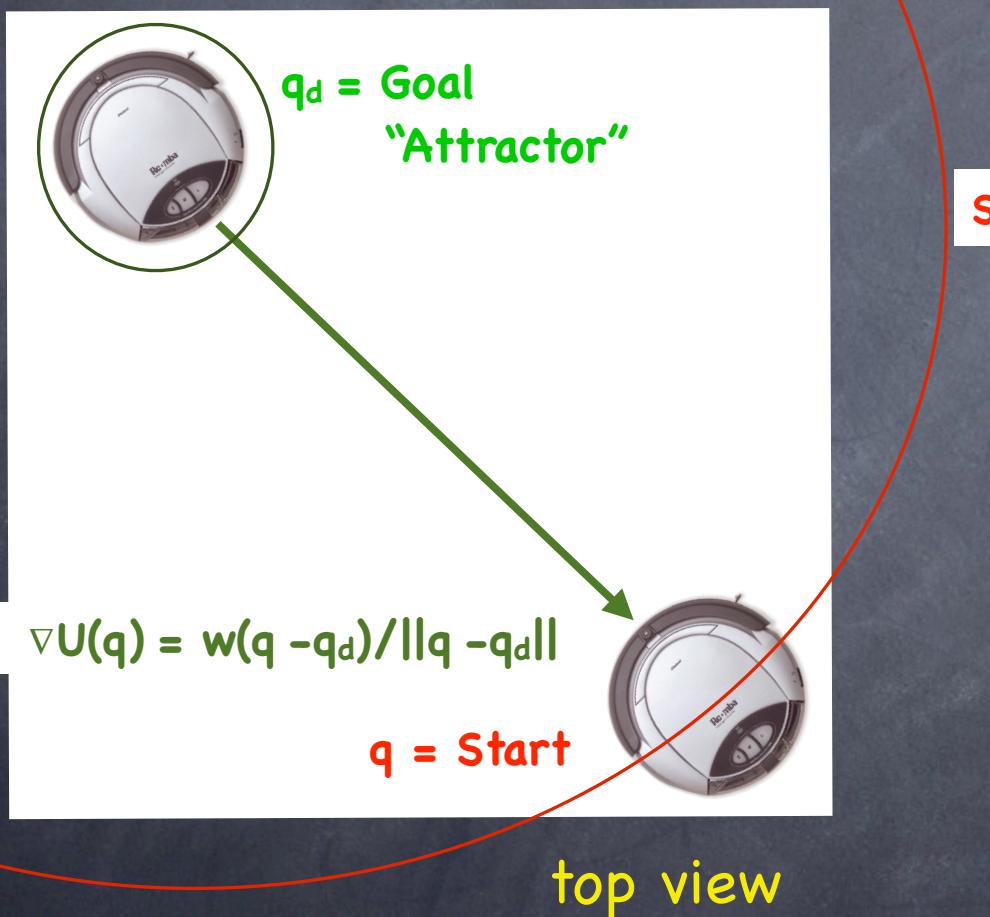
basin of attraction

2D potential navigation

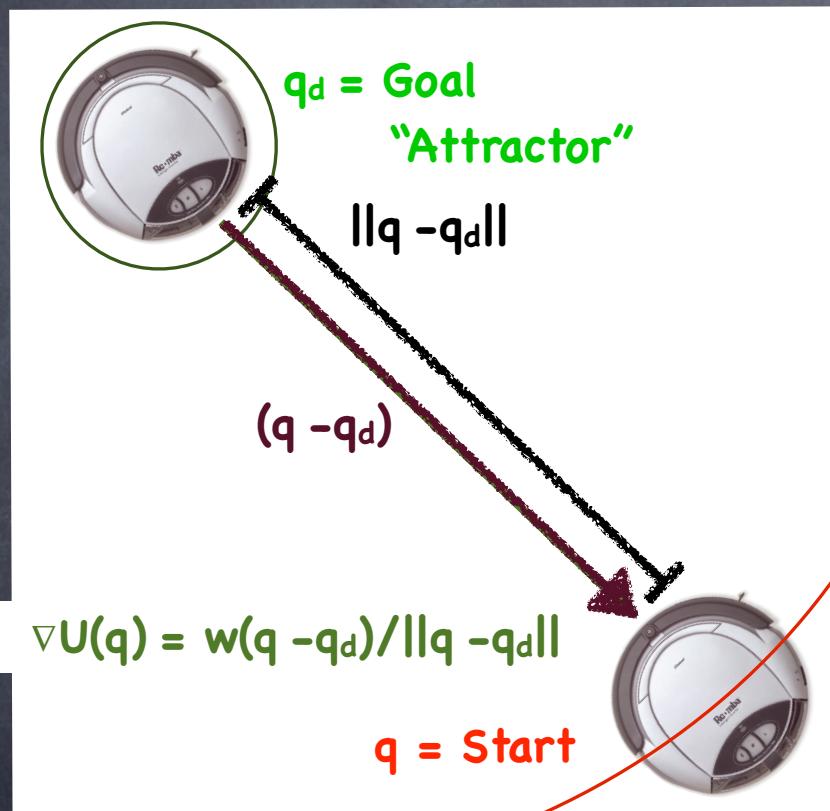
z : height indicates potential at location



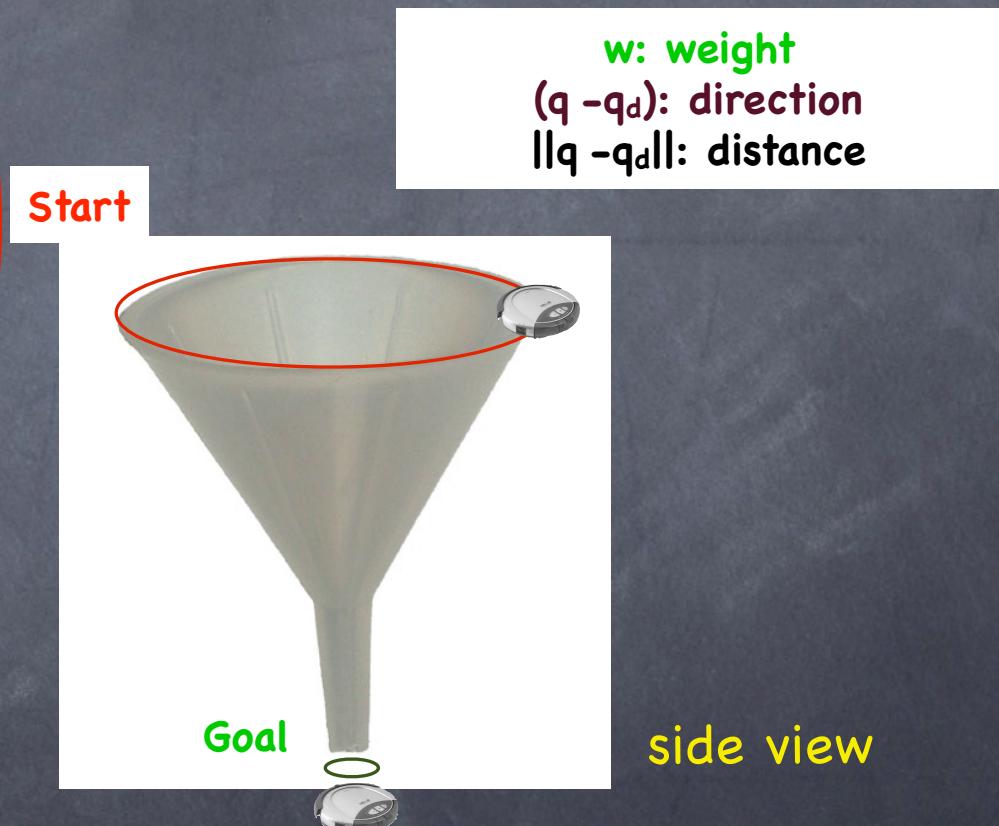
“Cone” Attractor



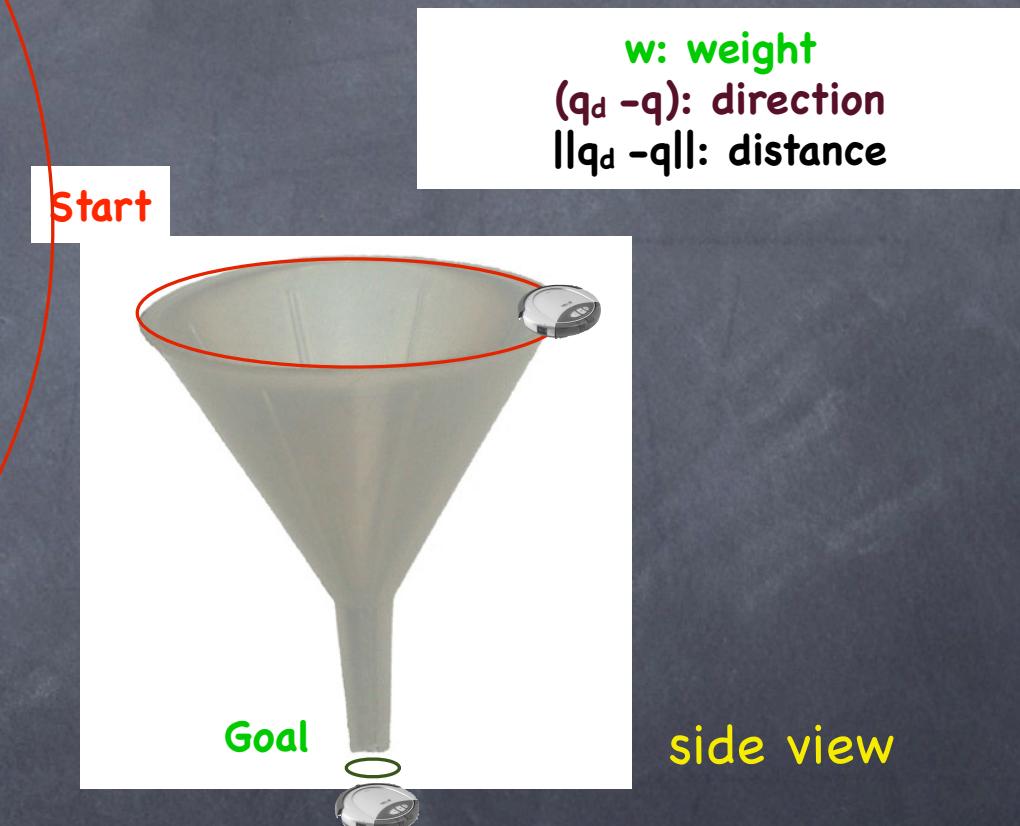
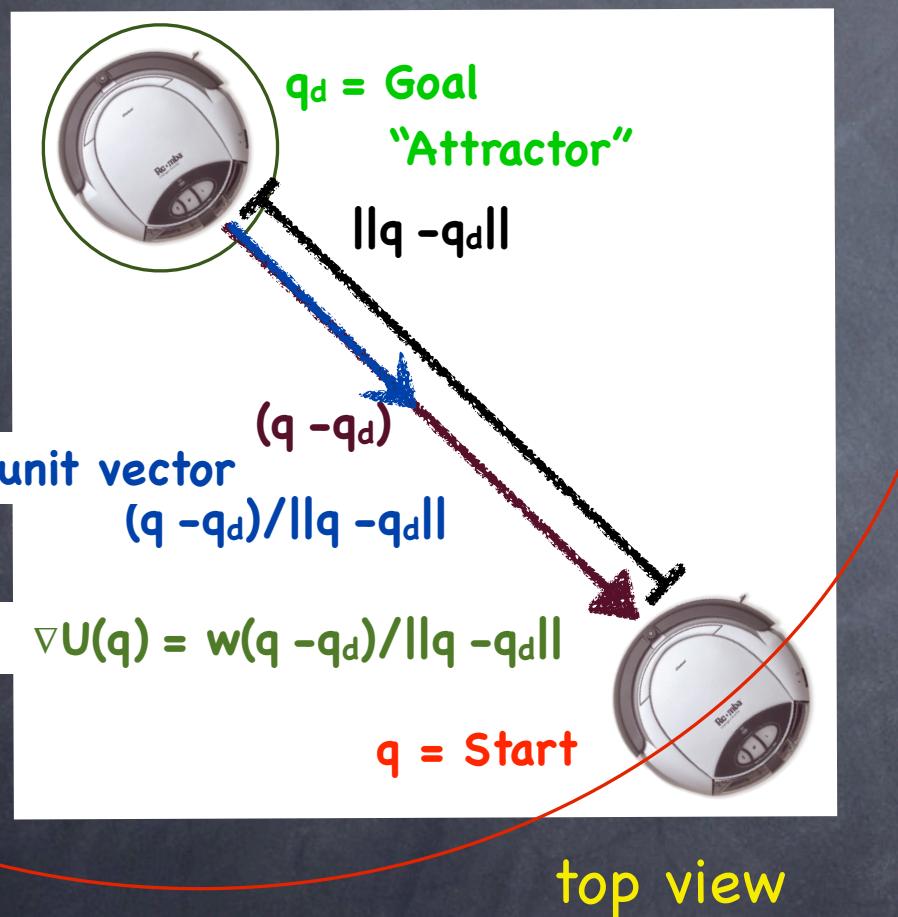
“Cone” Attractor



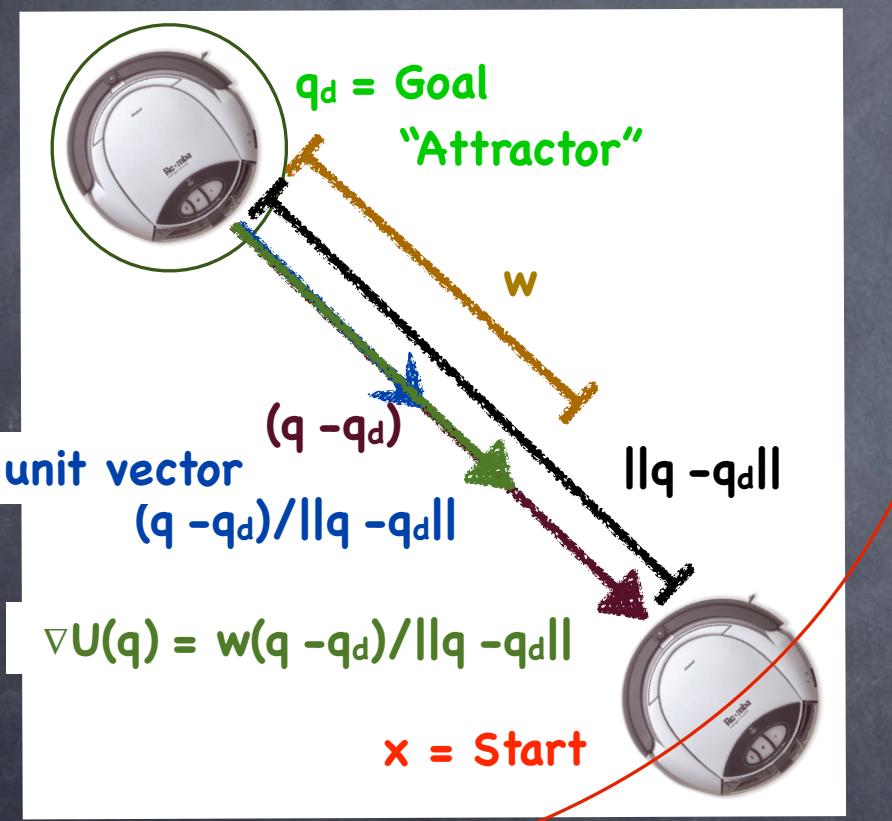
top view



“Cone” Attractor

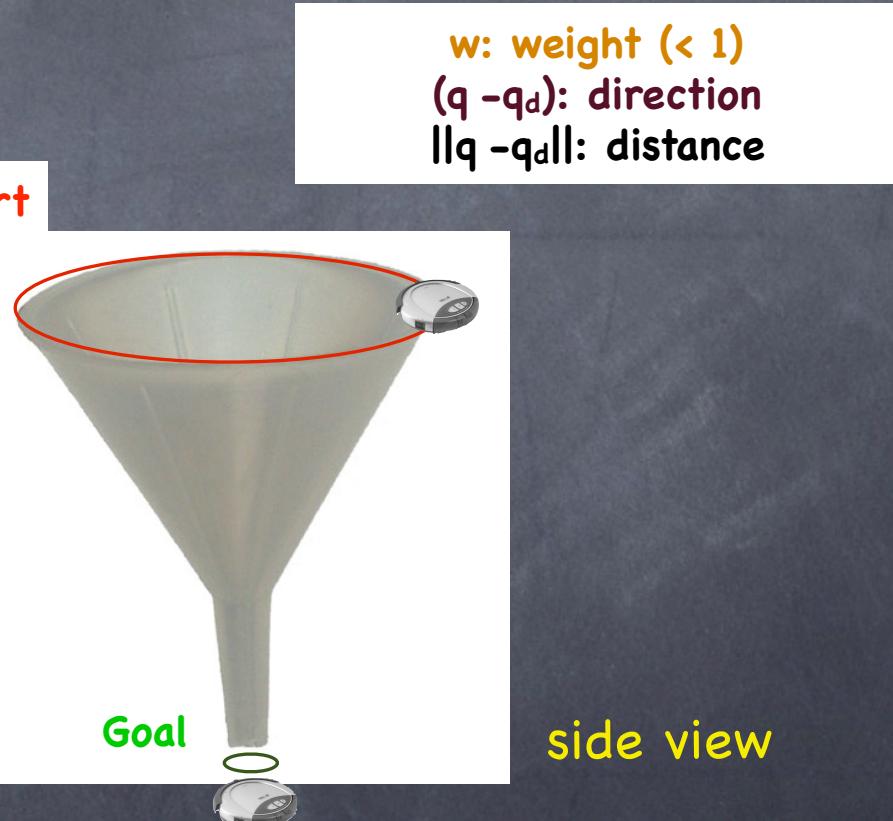


“Cone” Attractor



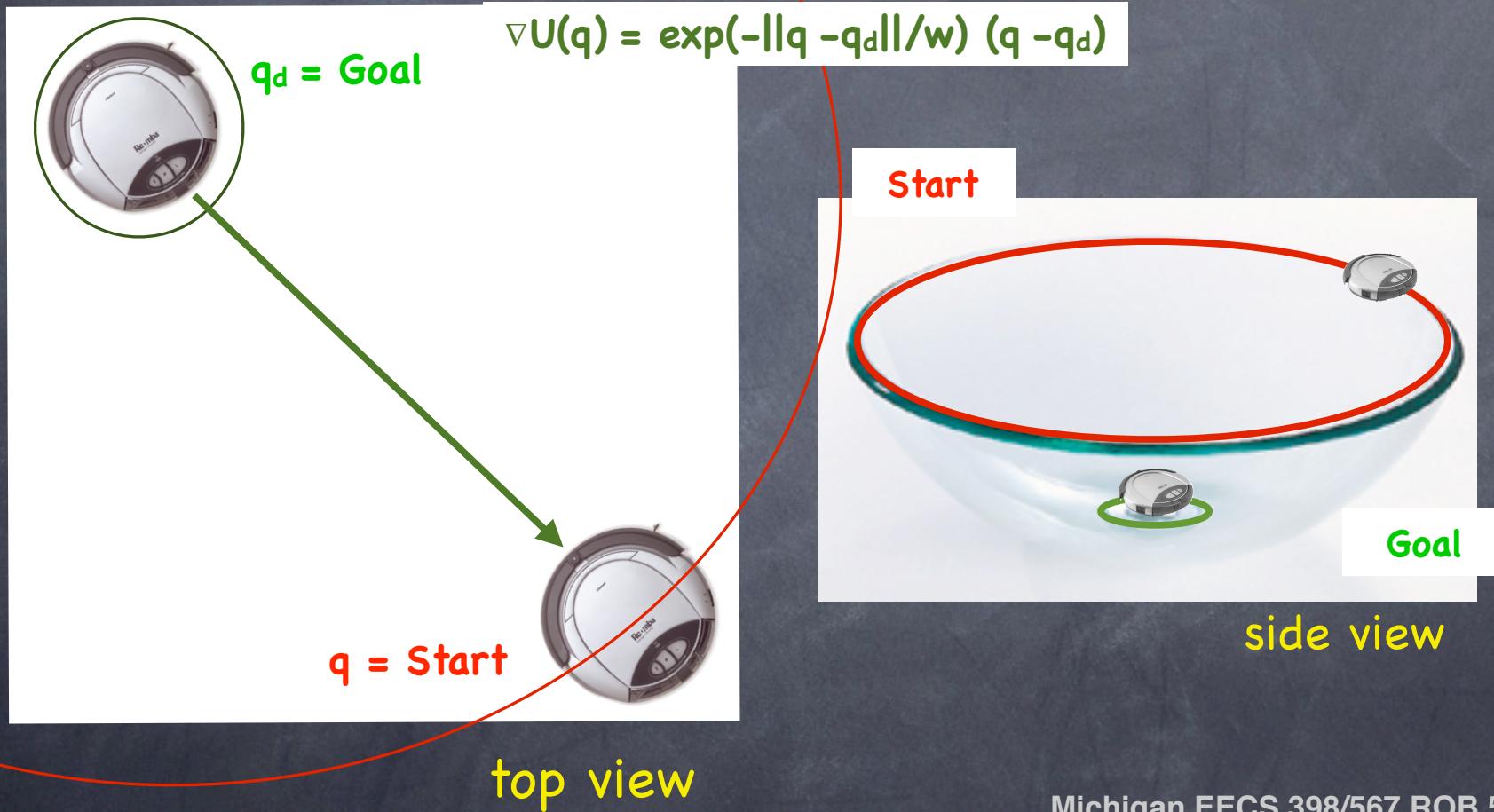
top view

Start



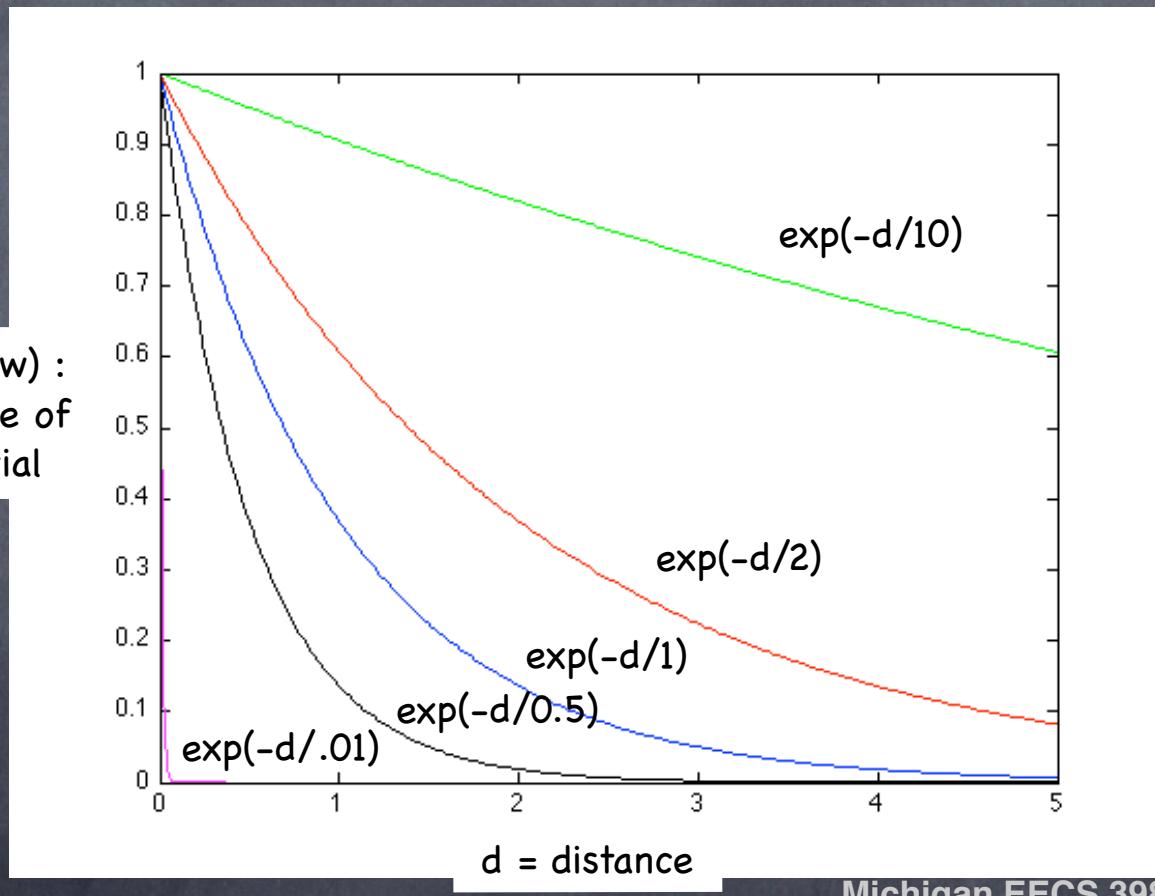
side view

“Bowl” Attractor

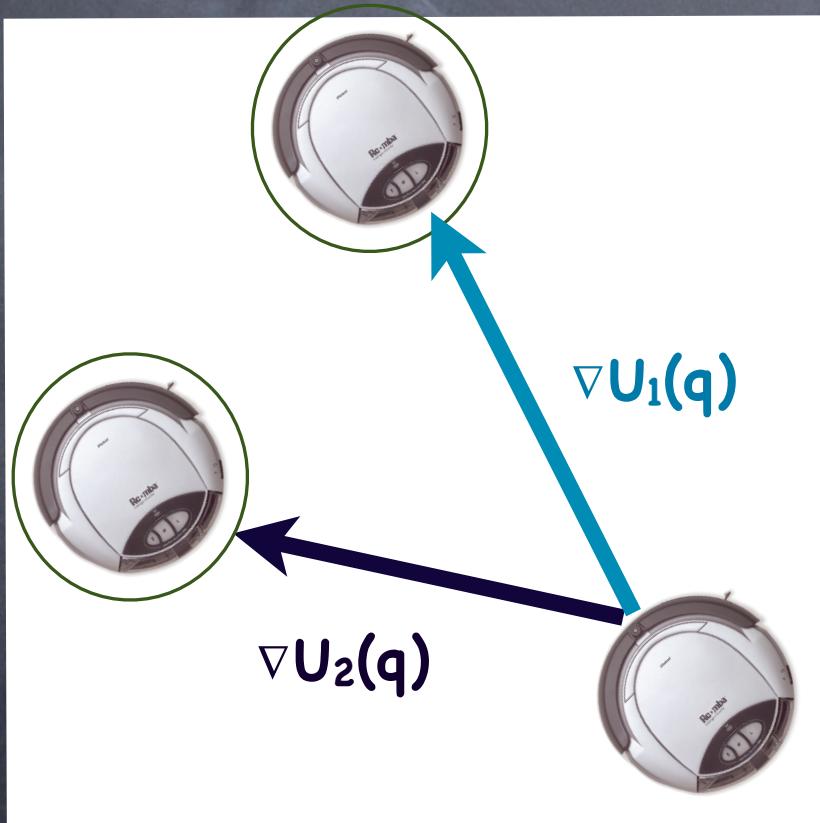


$\exp(-d/w)$

$\exp(-d/w)$:
influence of
potential

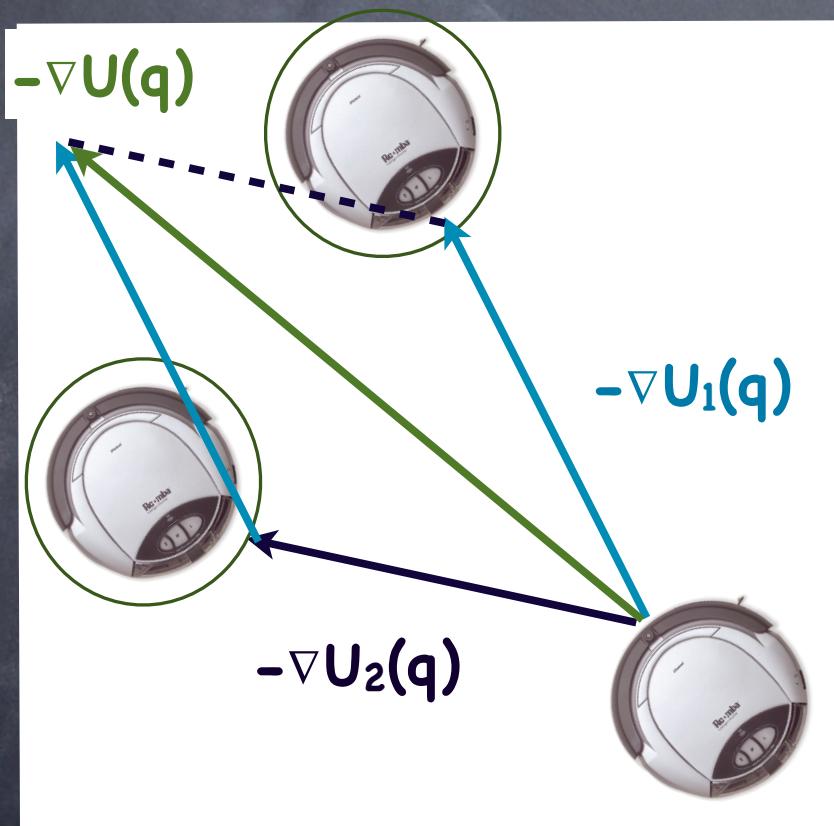


Multiple potentials



- Output of potential field is a vector
- How to combine or select between multiple potentials?

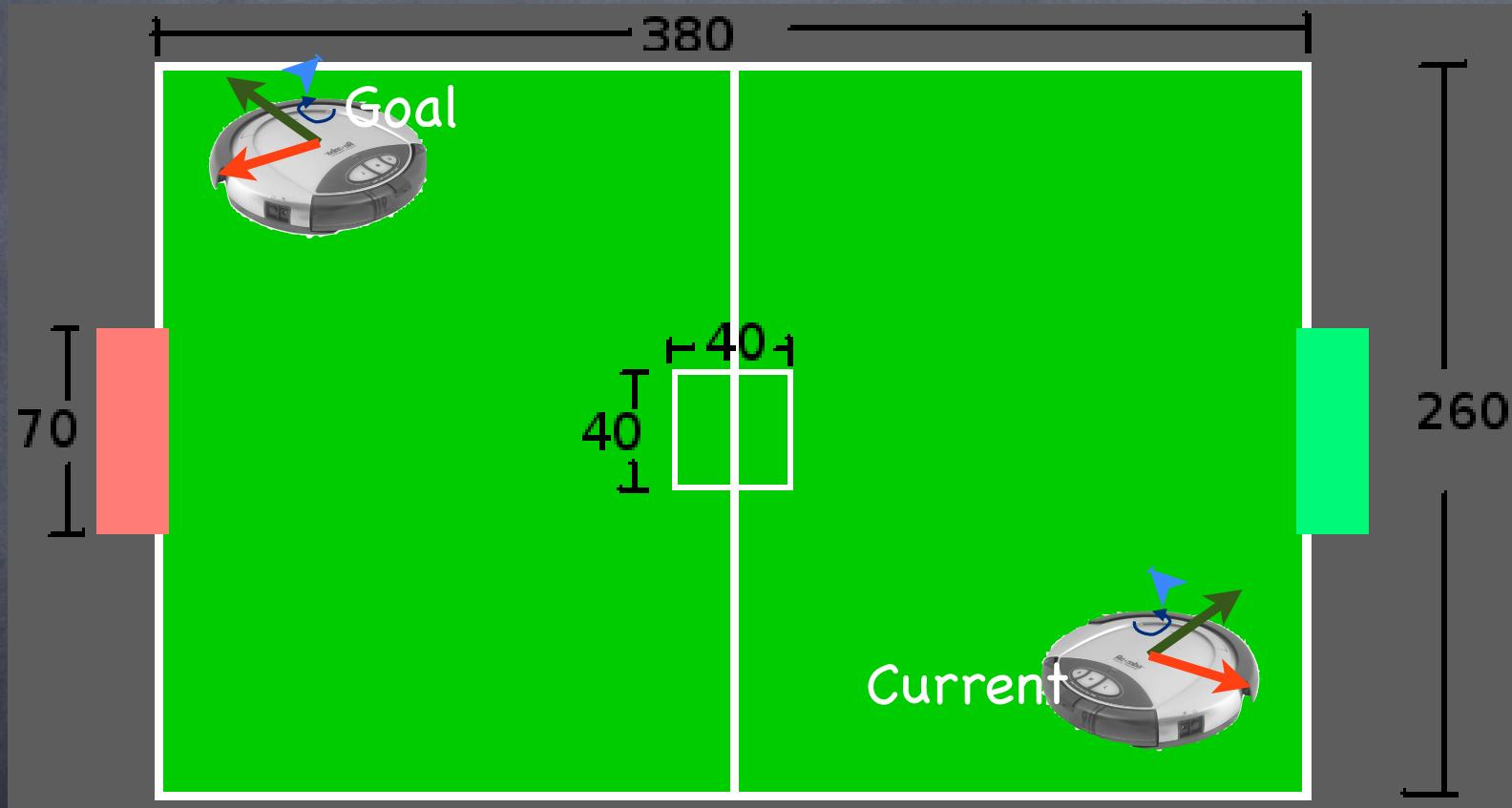
Multiple potentials



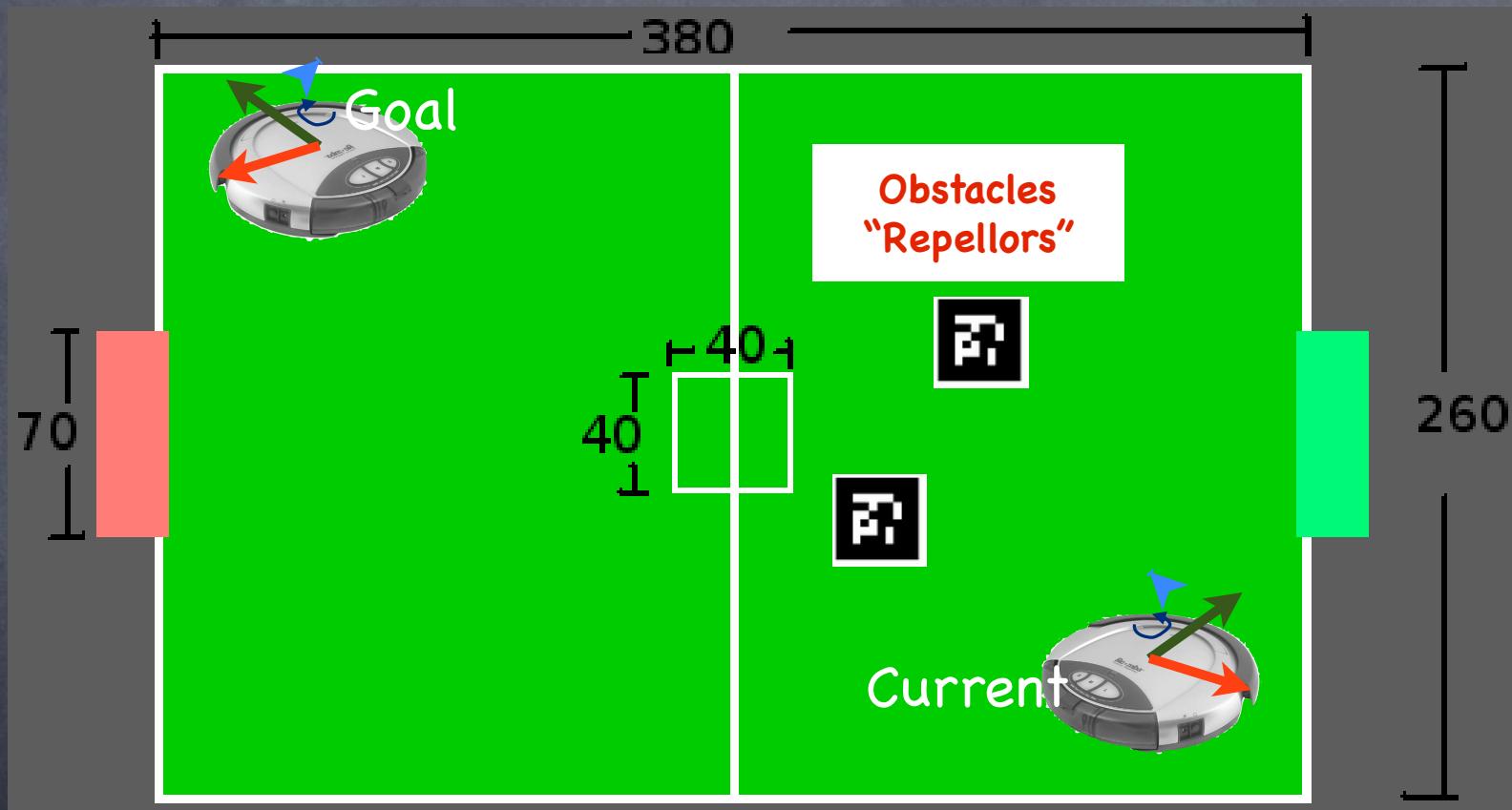
- Output of potential field is a vector
- Combine multiple potentials through vector summation

$$U(q) = \sum_i U_i(q)$$

describe performance for this case

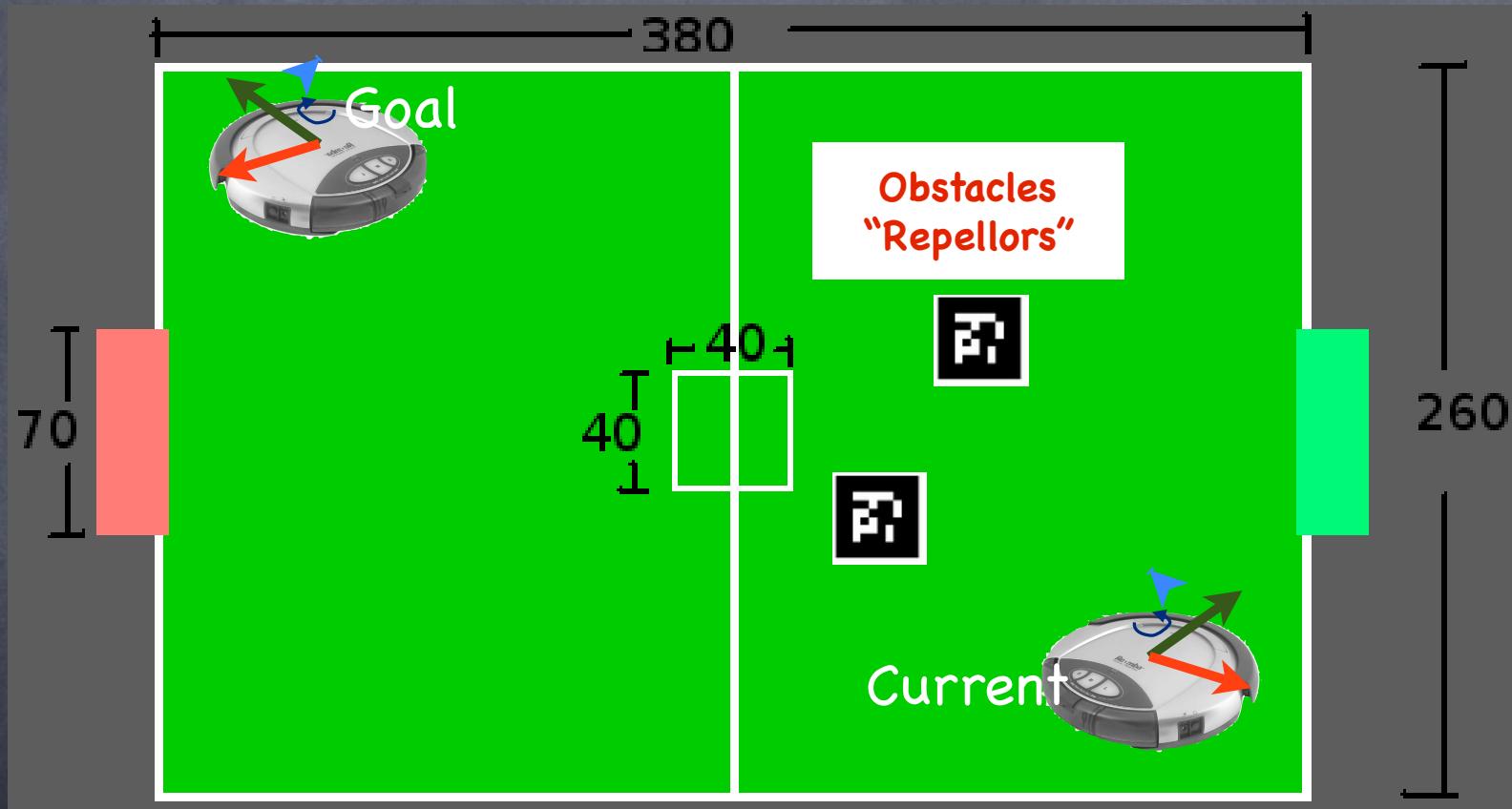


describe performance for this case



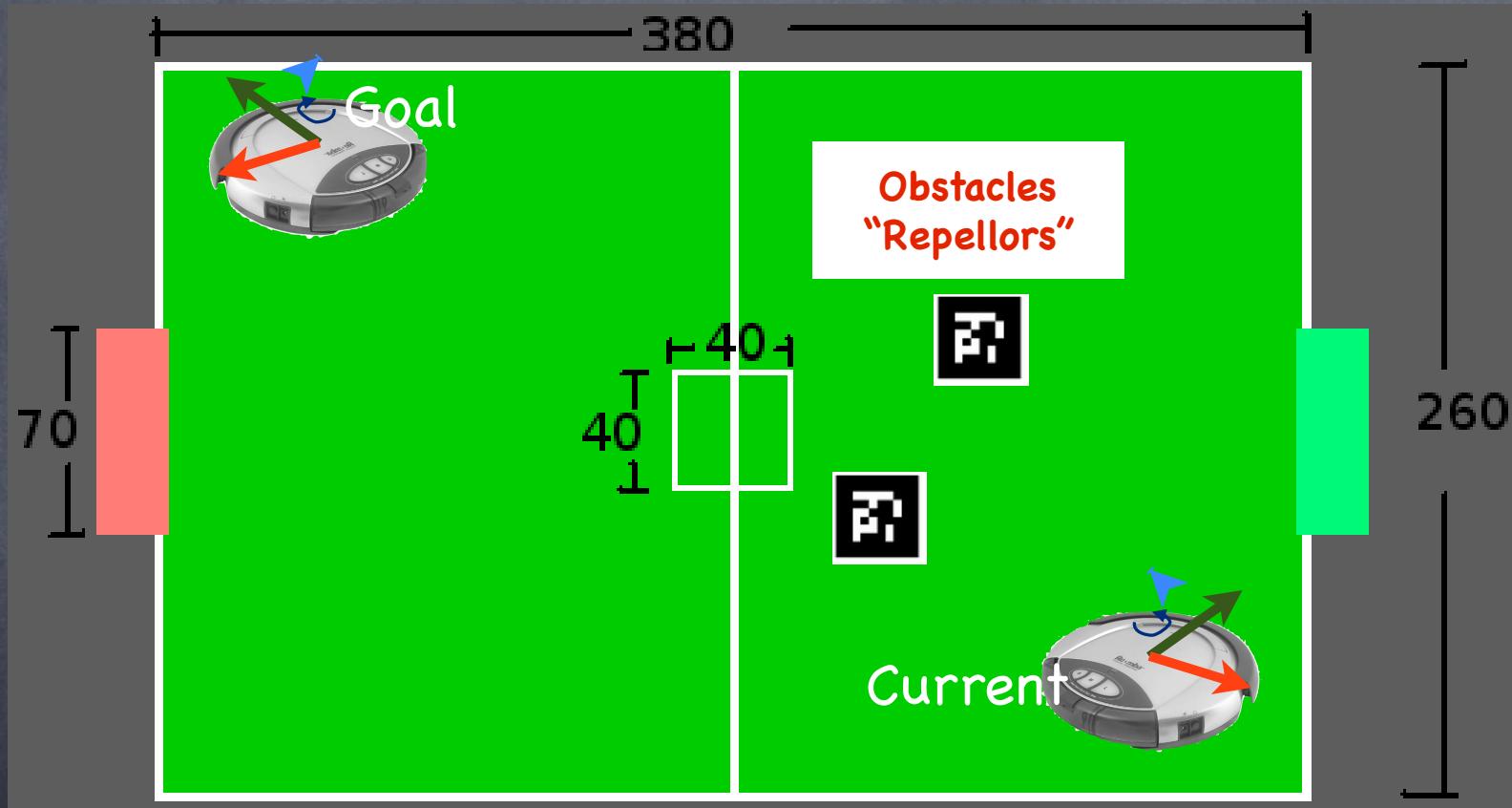
describe performance for this case

how do we deal with repellors?



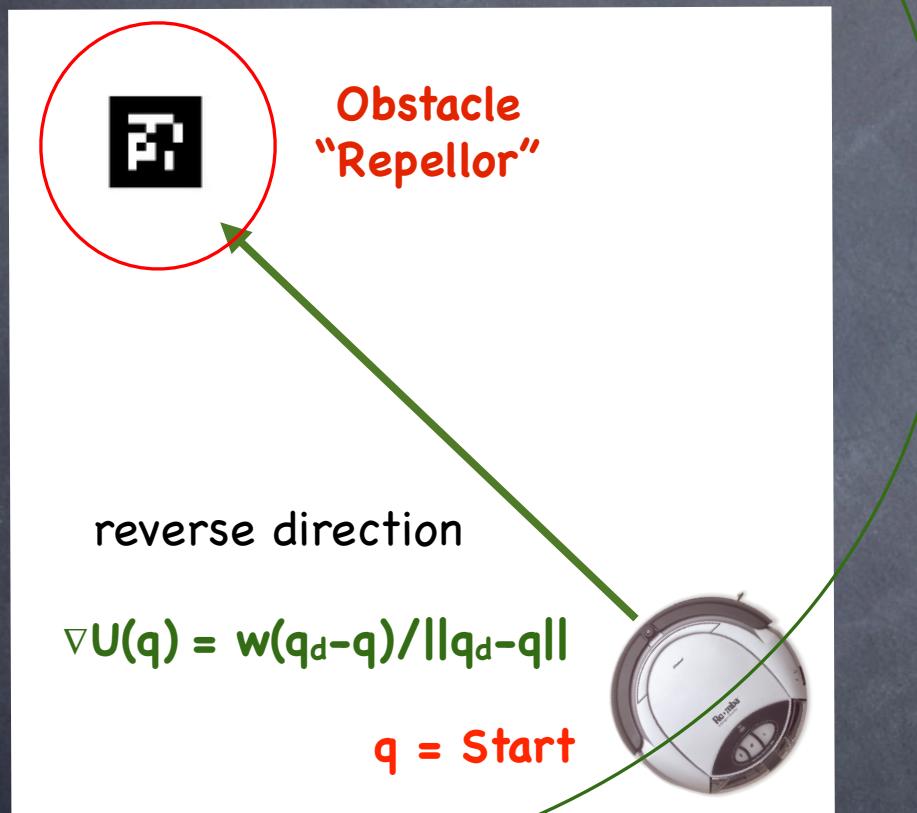
add sum of repulsive potentials

$$U(q) = U_{\text{attracts}}(q) + U_{\text{repellors}}(q)$$



“Cone” Repellor

potential problems?

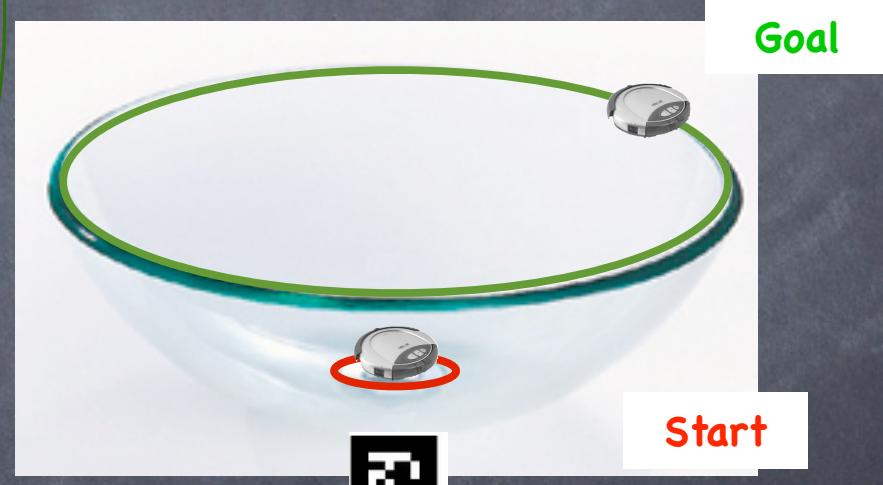
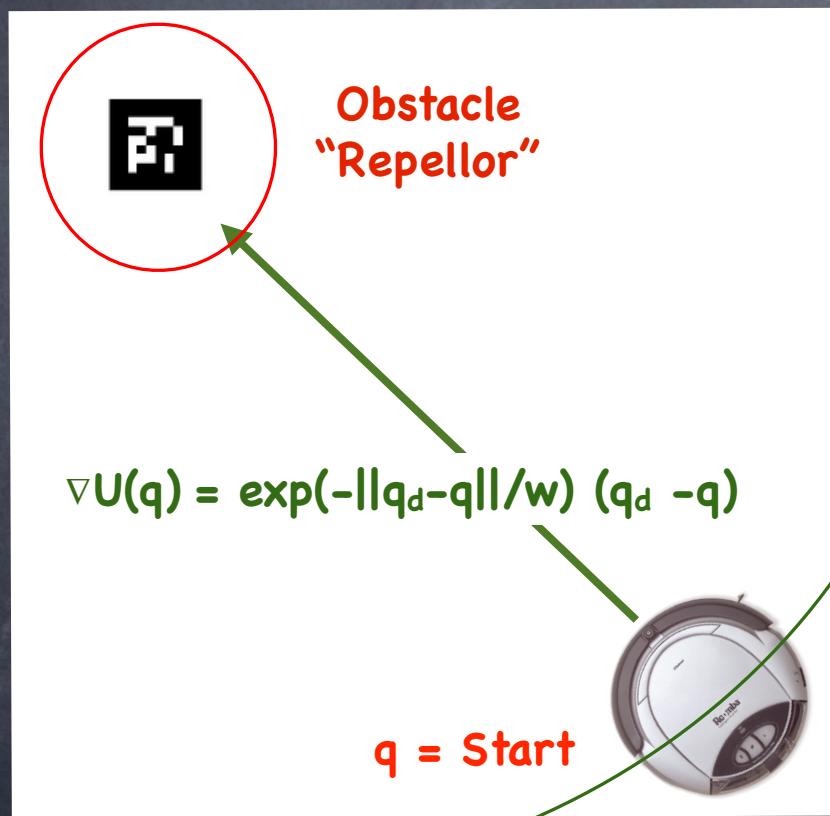


top view

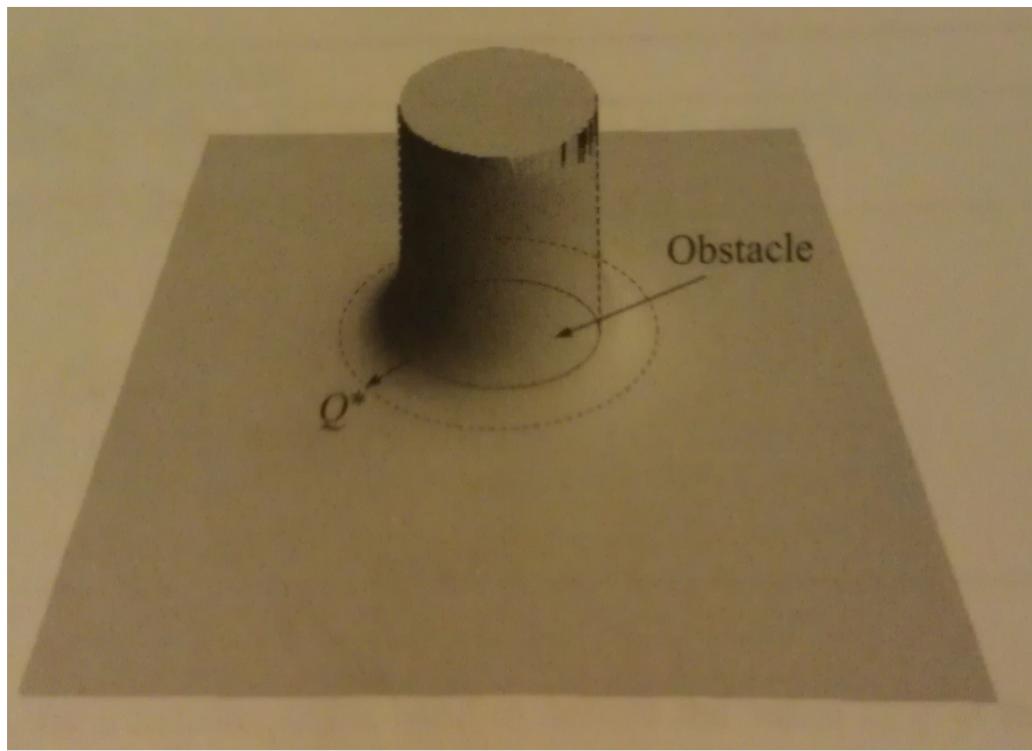


side view

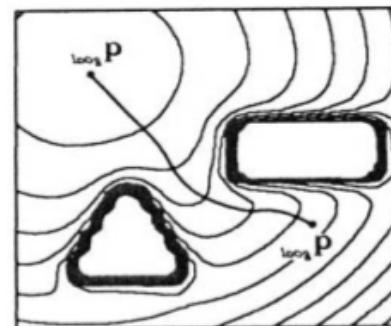
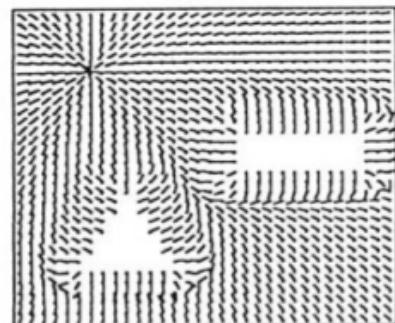
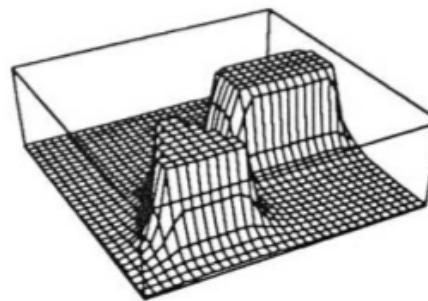
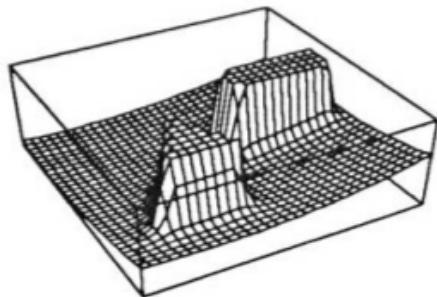
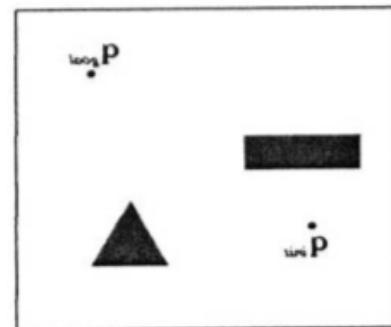
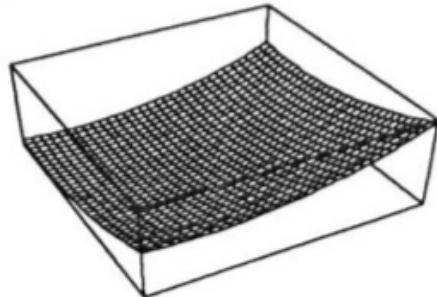
“Bowl” Repellor



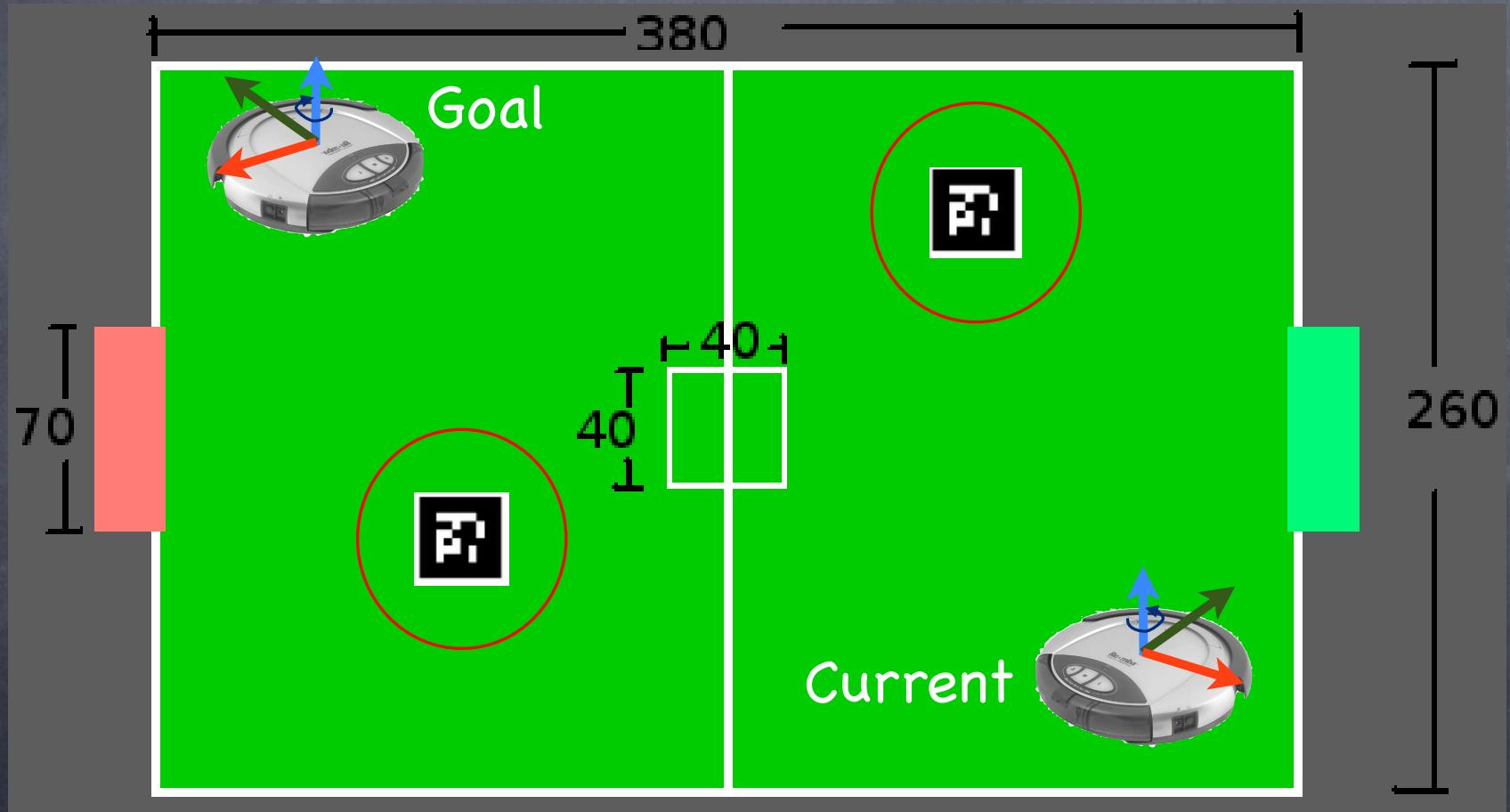
repellor should only have local influence,
repelling only around boundary improves path



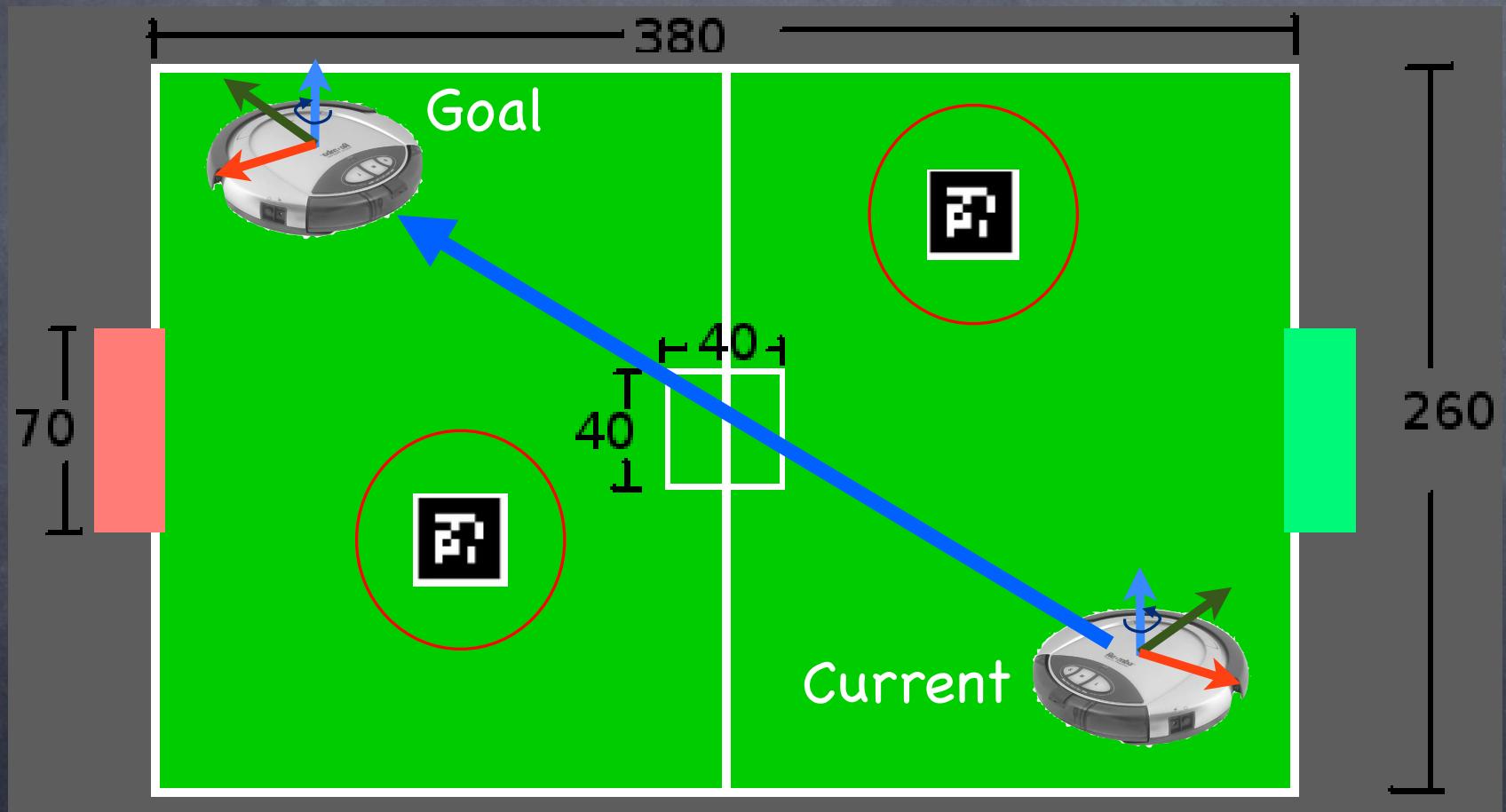
2 Obstacle example



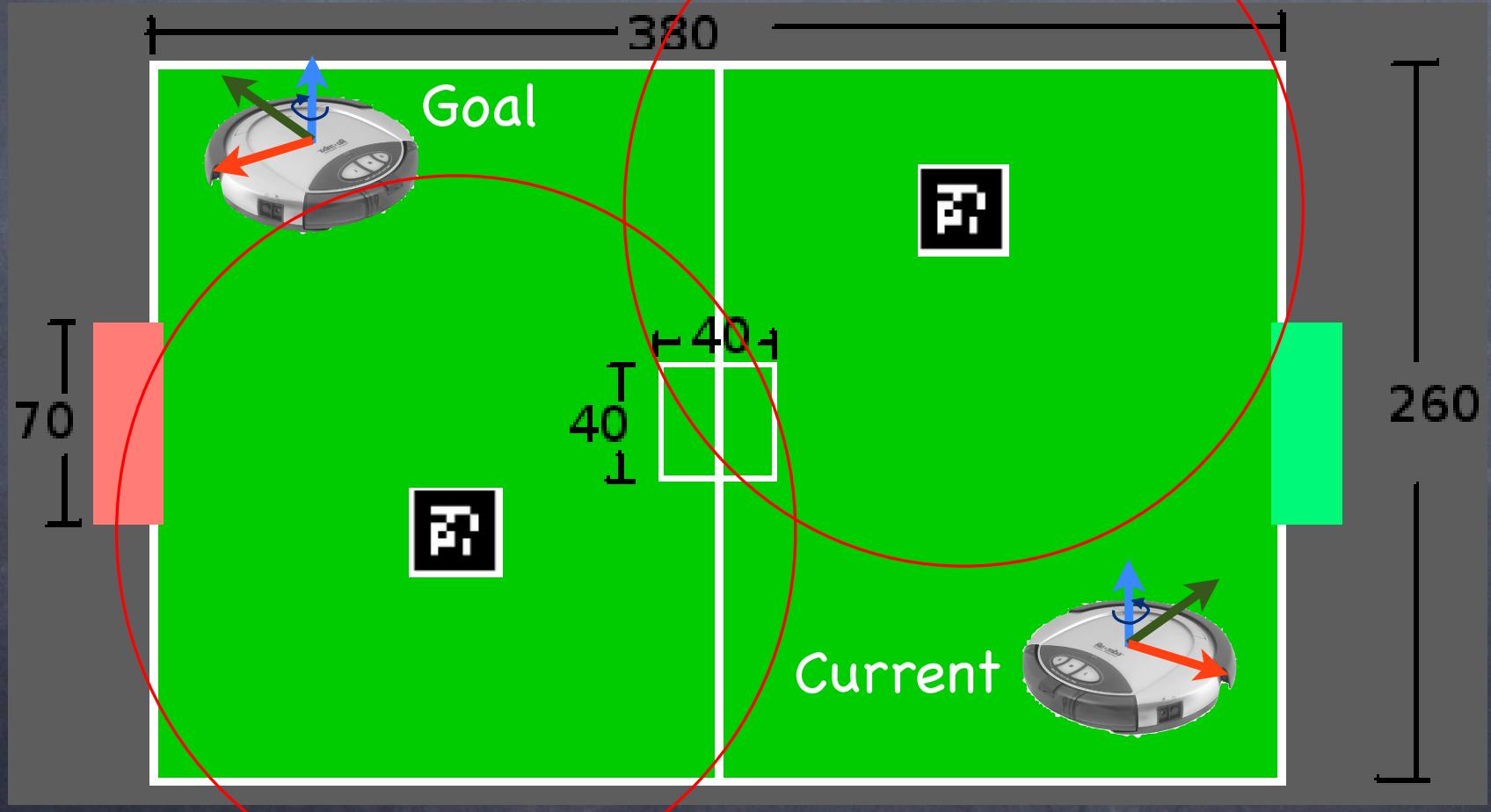
describe performance for this case
with cone attractor to goal and bowl repellors
with limited weight



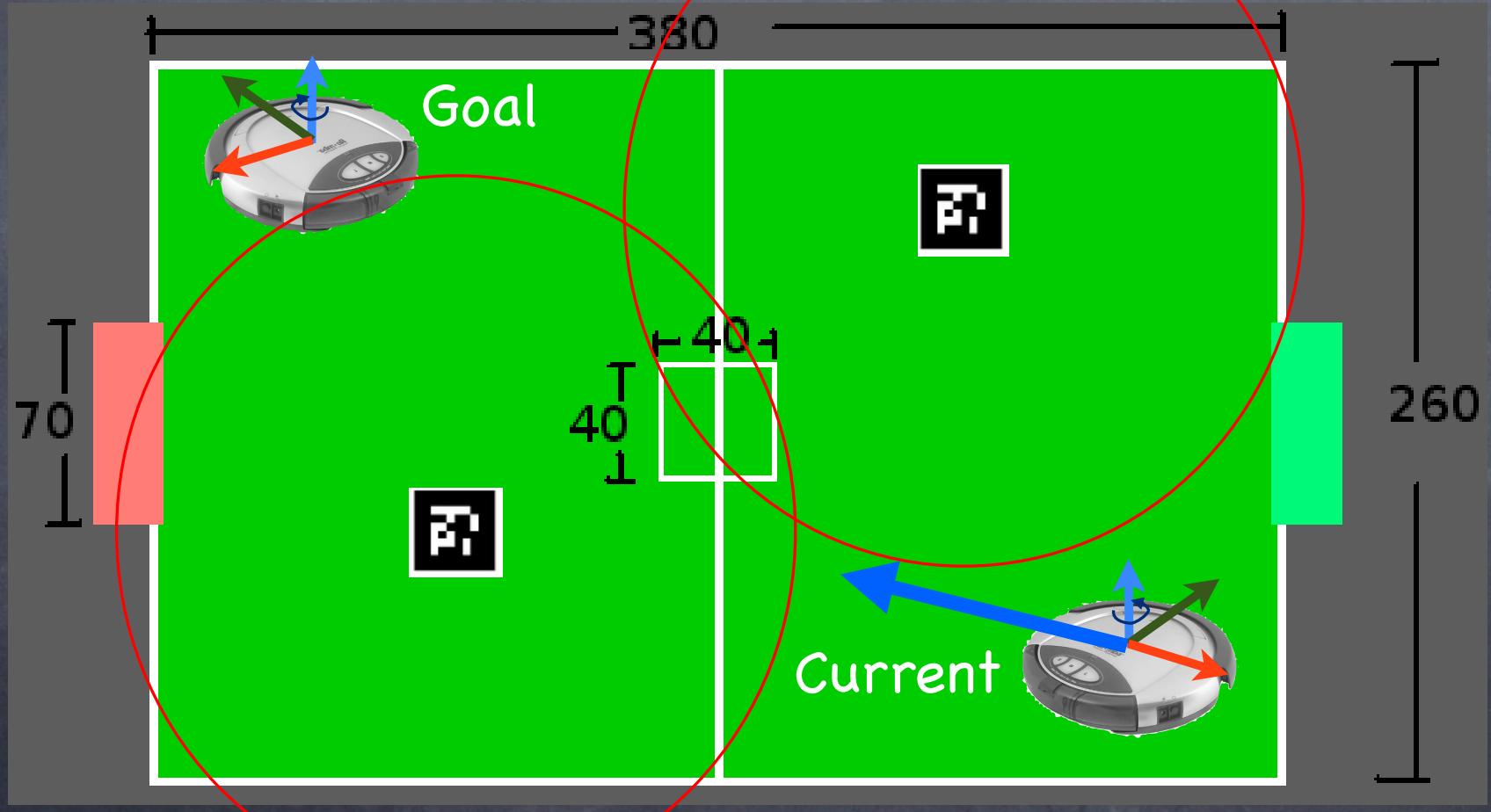
describe performance for this case
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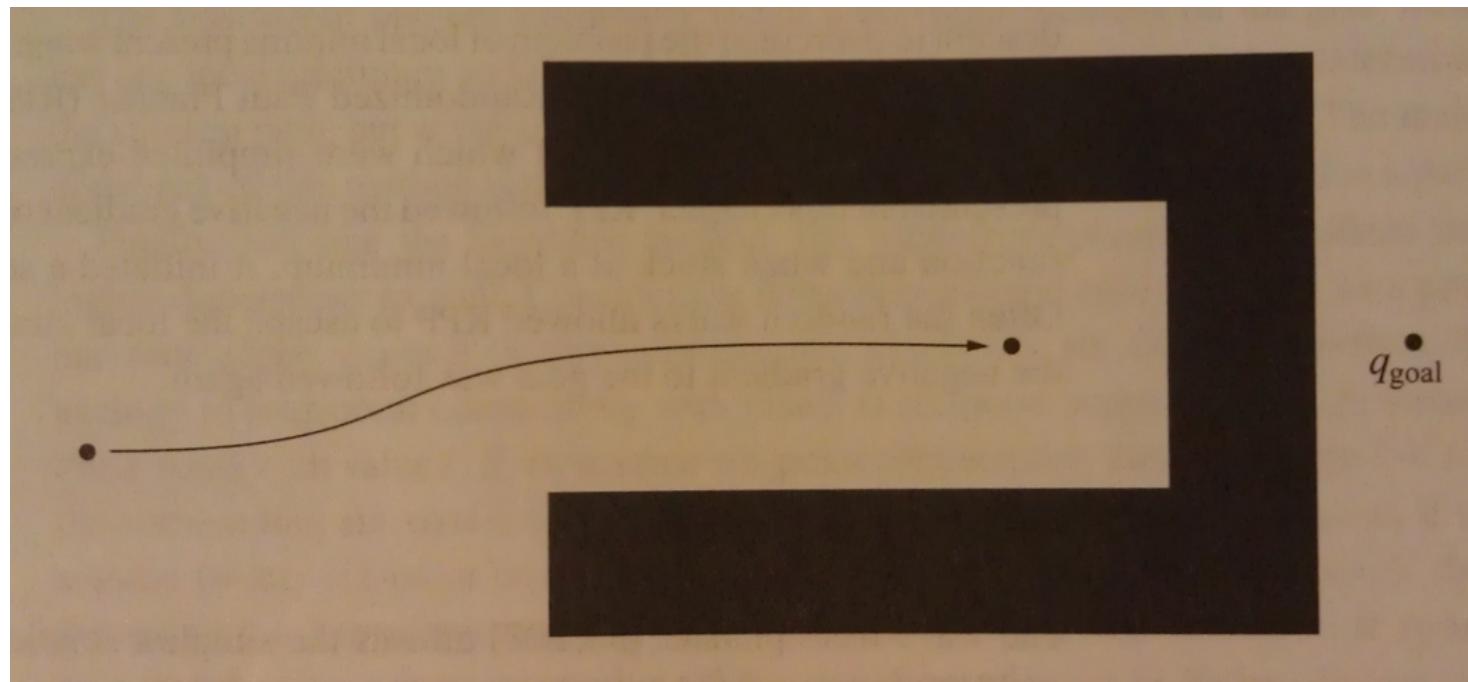
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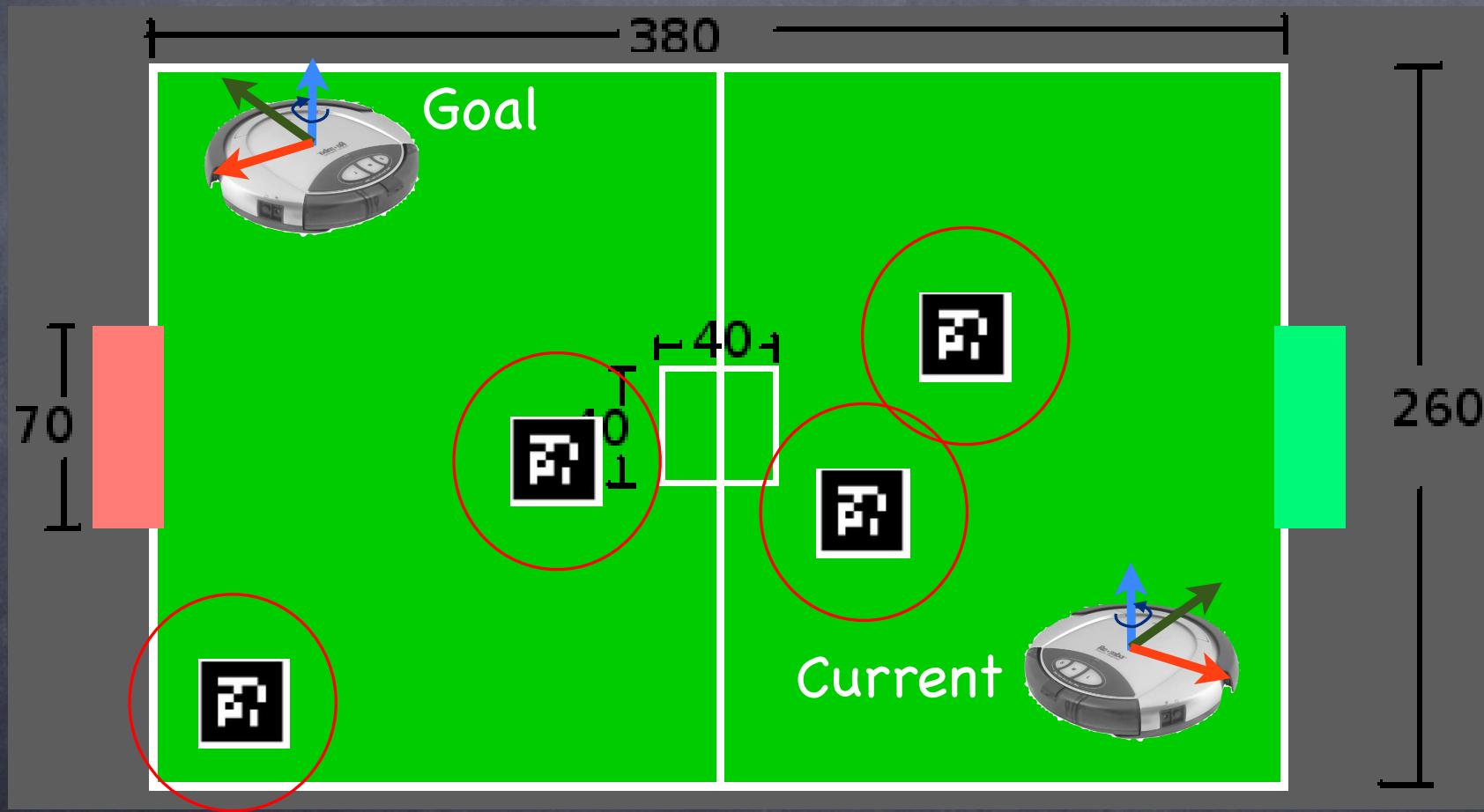
describe performance for this case
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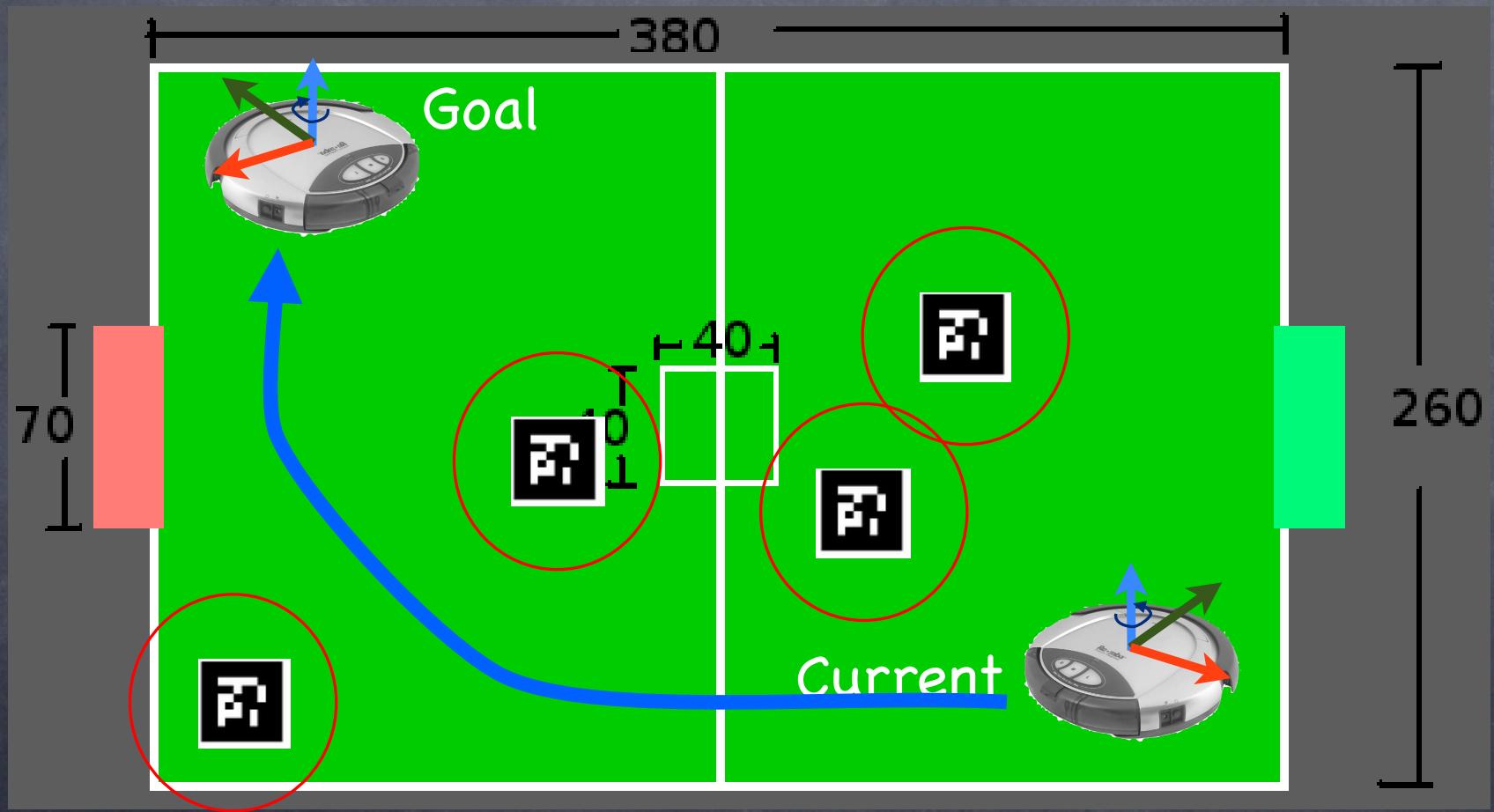
Local Minima



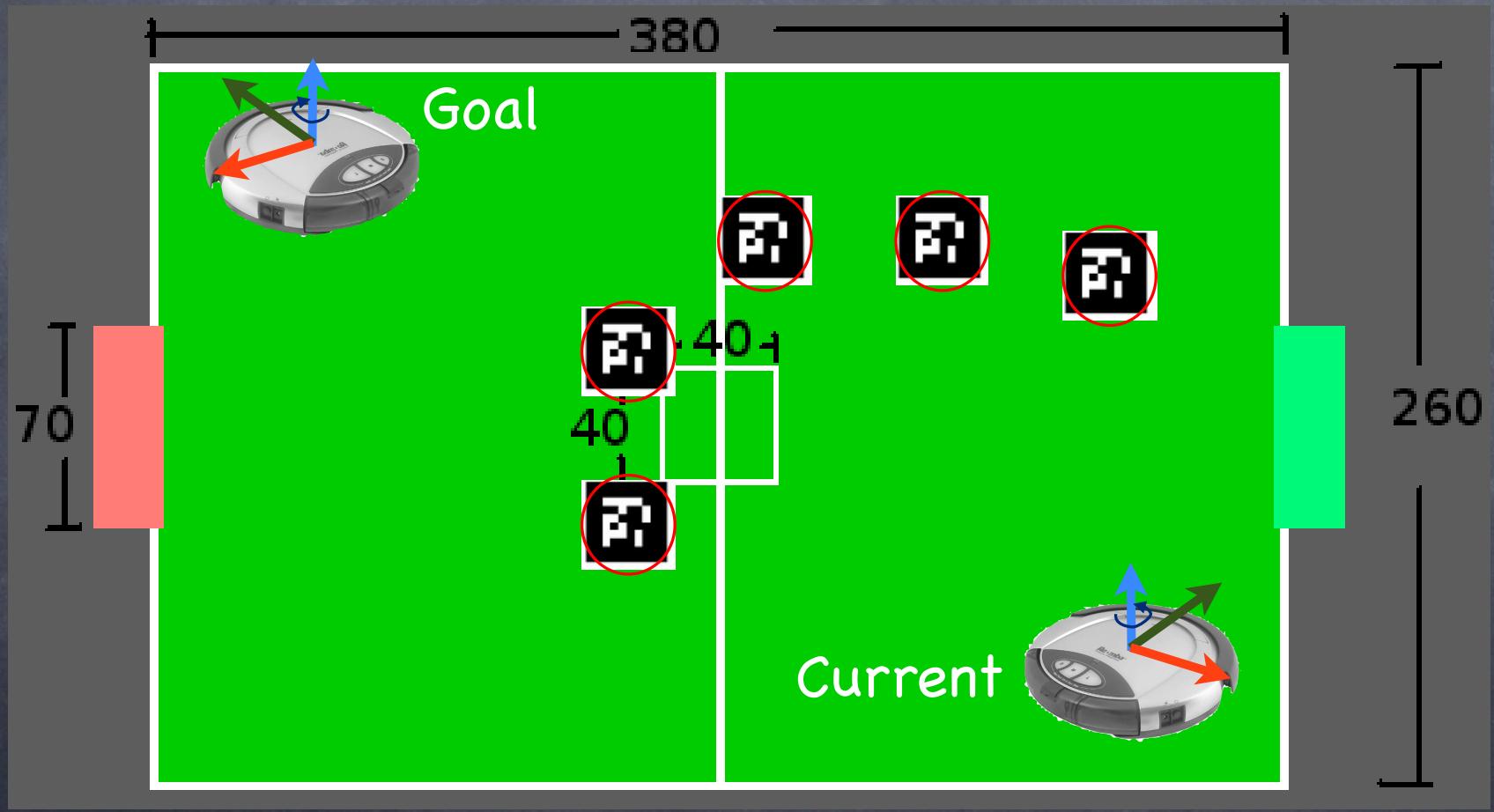
describe performance for this case



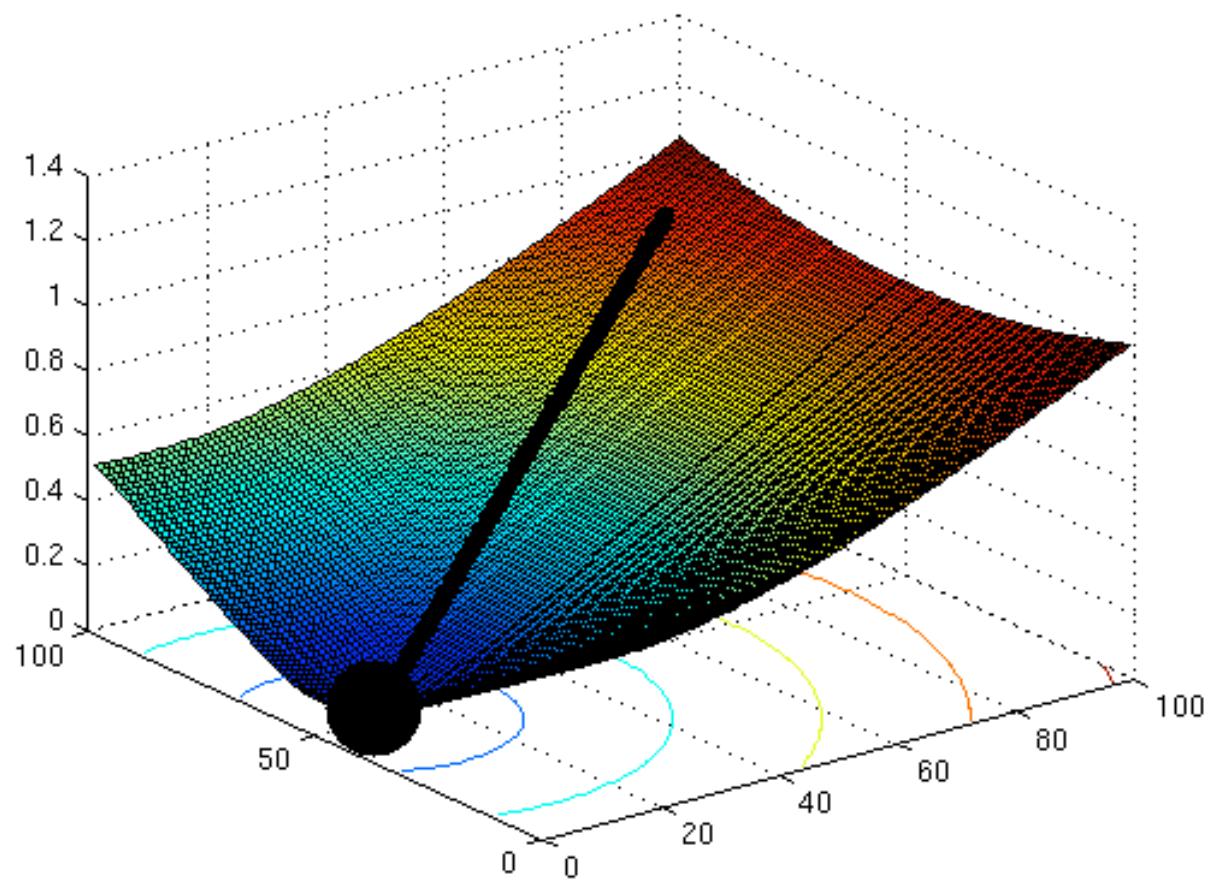
describe performance for this case



describe performance for this case



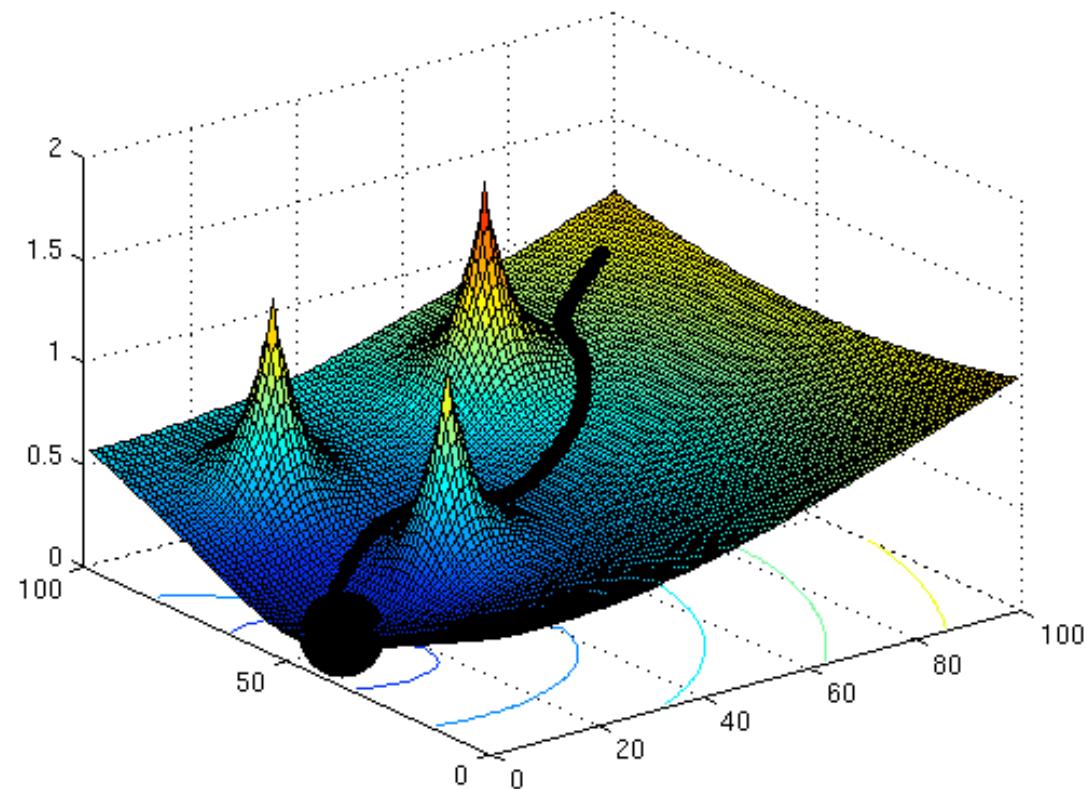
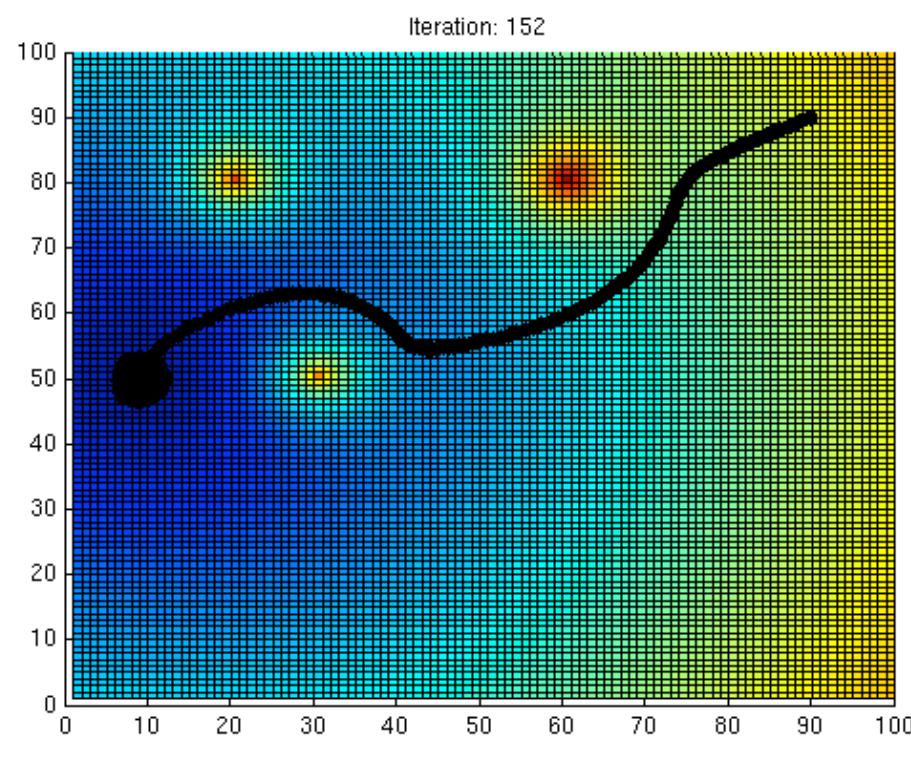
matlab example



pfield.m [1 5 8 12]

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matlab example

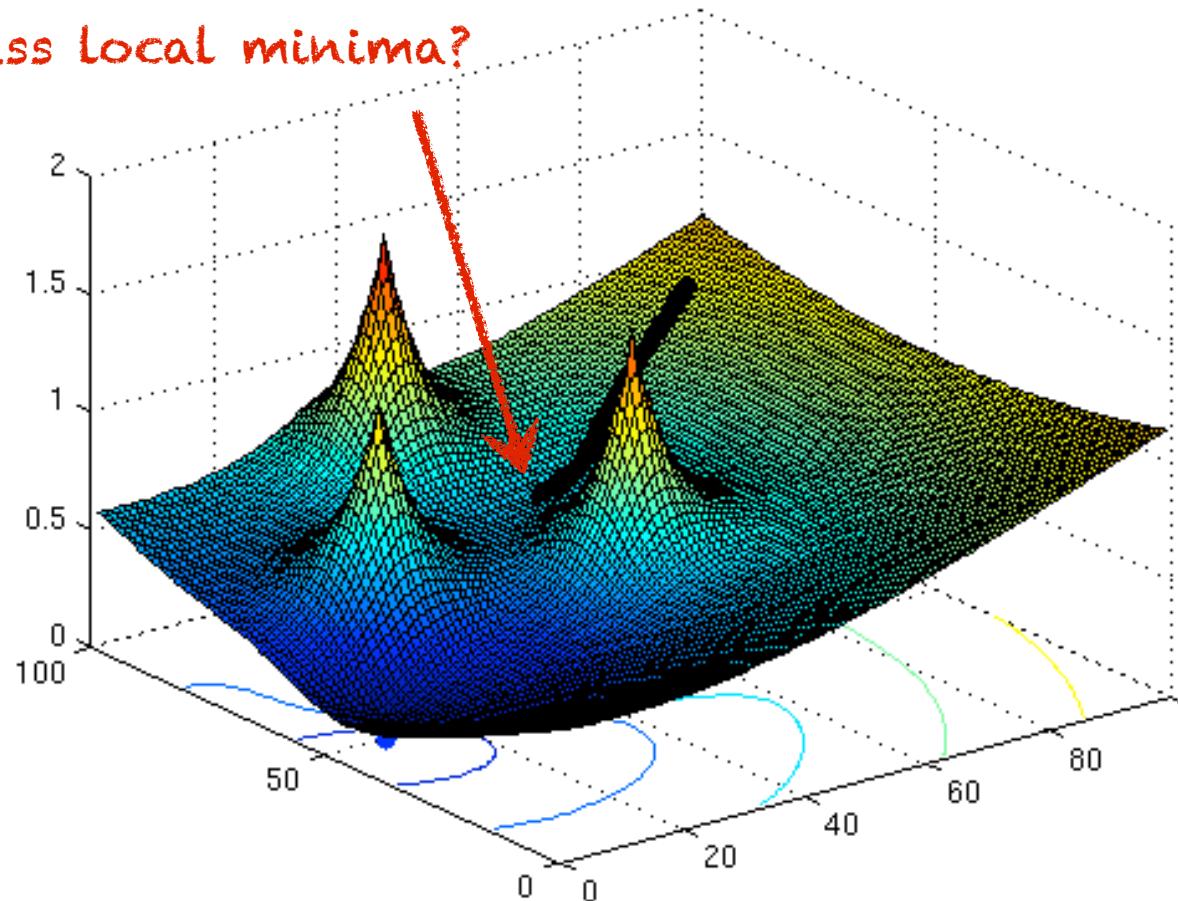


pfield.m [1 5 8 12]

Michigan EECS 398/567 ROB 510 - autorob.org

matlab example

How to address Local minima?



pfield.m [1 5 8 12]

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How can we get out of
local minima?

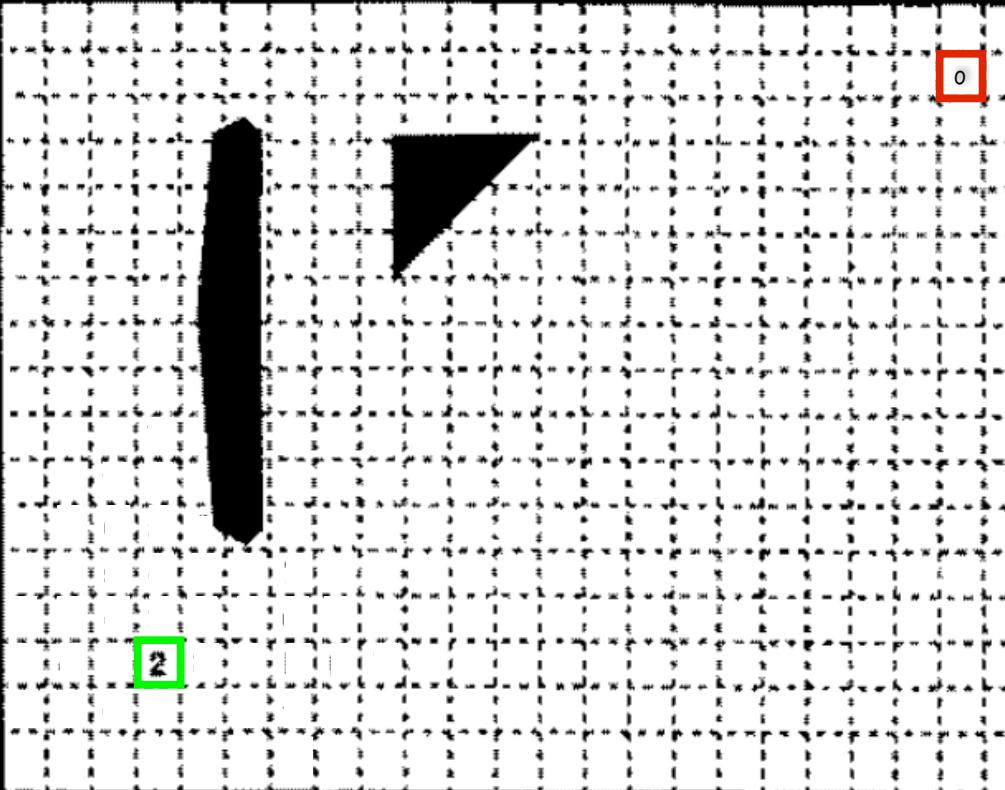
How can we get out of
local minima?

Go back to planning.

Wavefront Planning

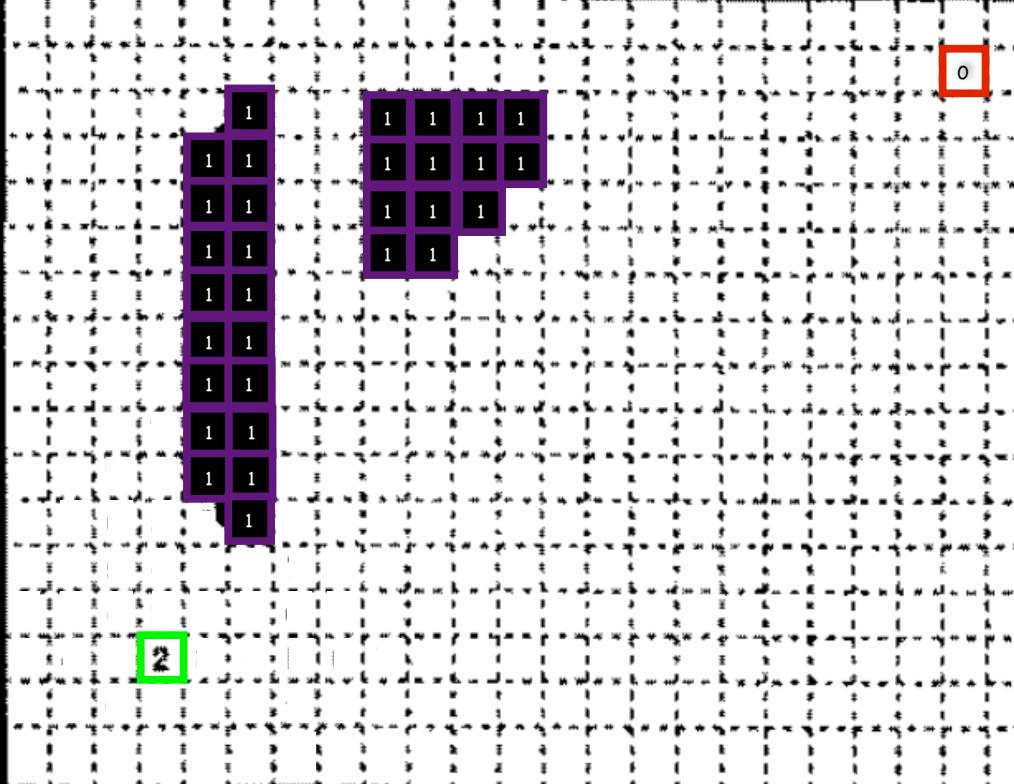
- Discretize potential field into grid
 - Cells store cost to goal with respect to potential field
 - Computed by Brushfire algorithm (essentially BFS)
- Grid search to find navigation path to goal

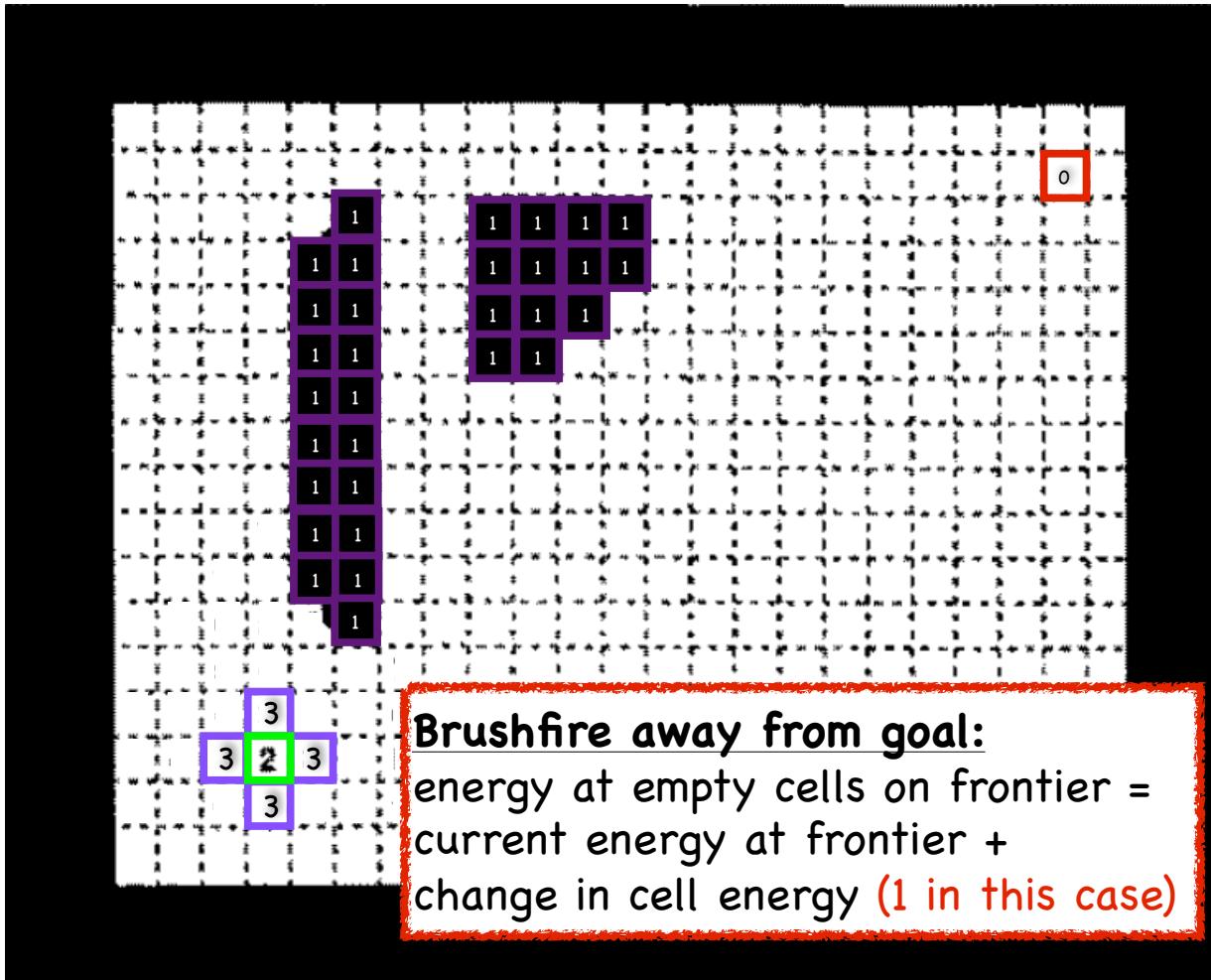
Start: mark with 0

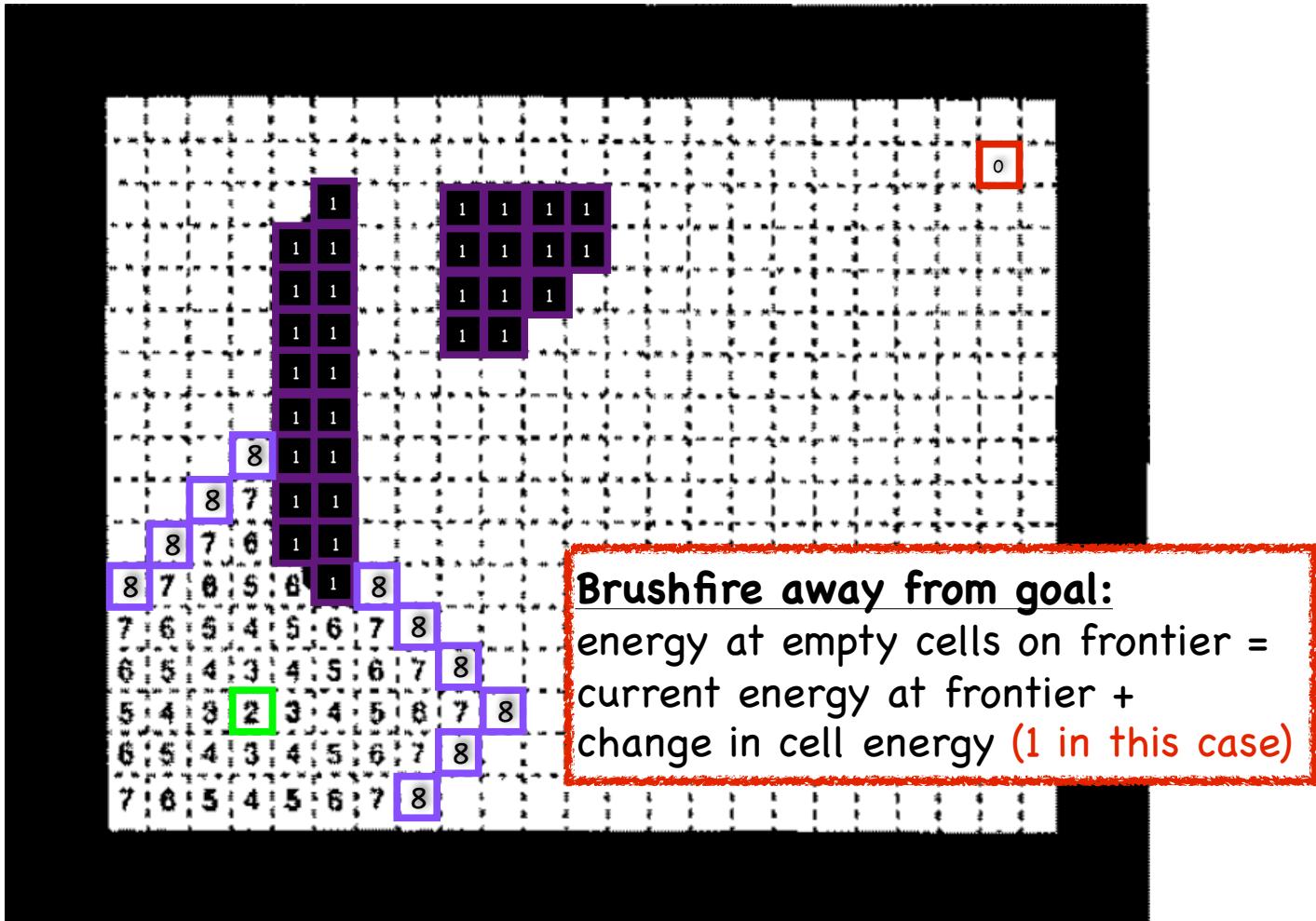


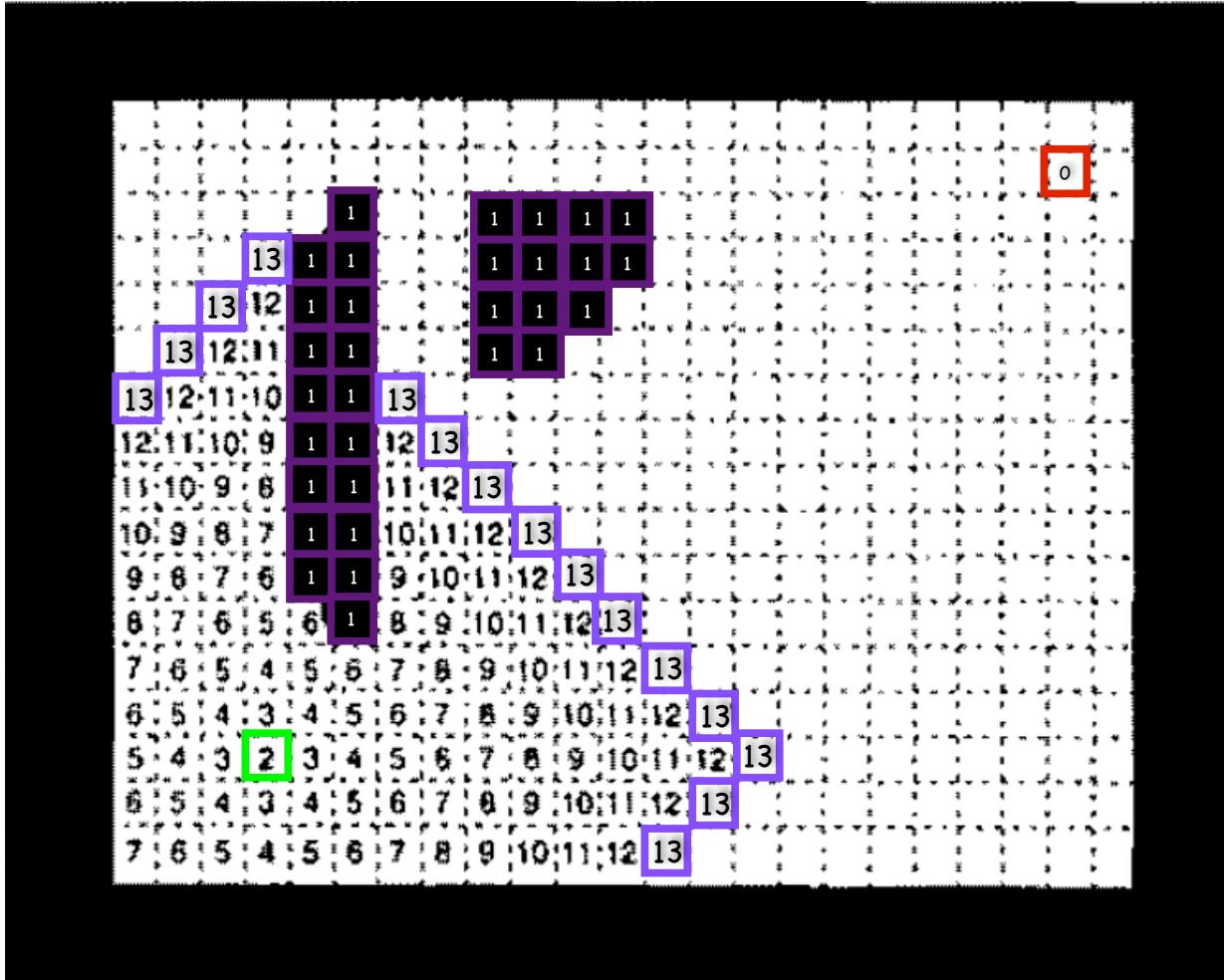
Goal: mark with 2

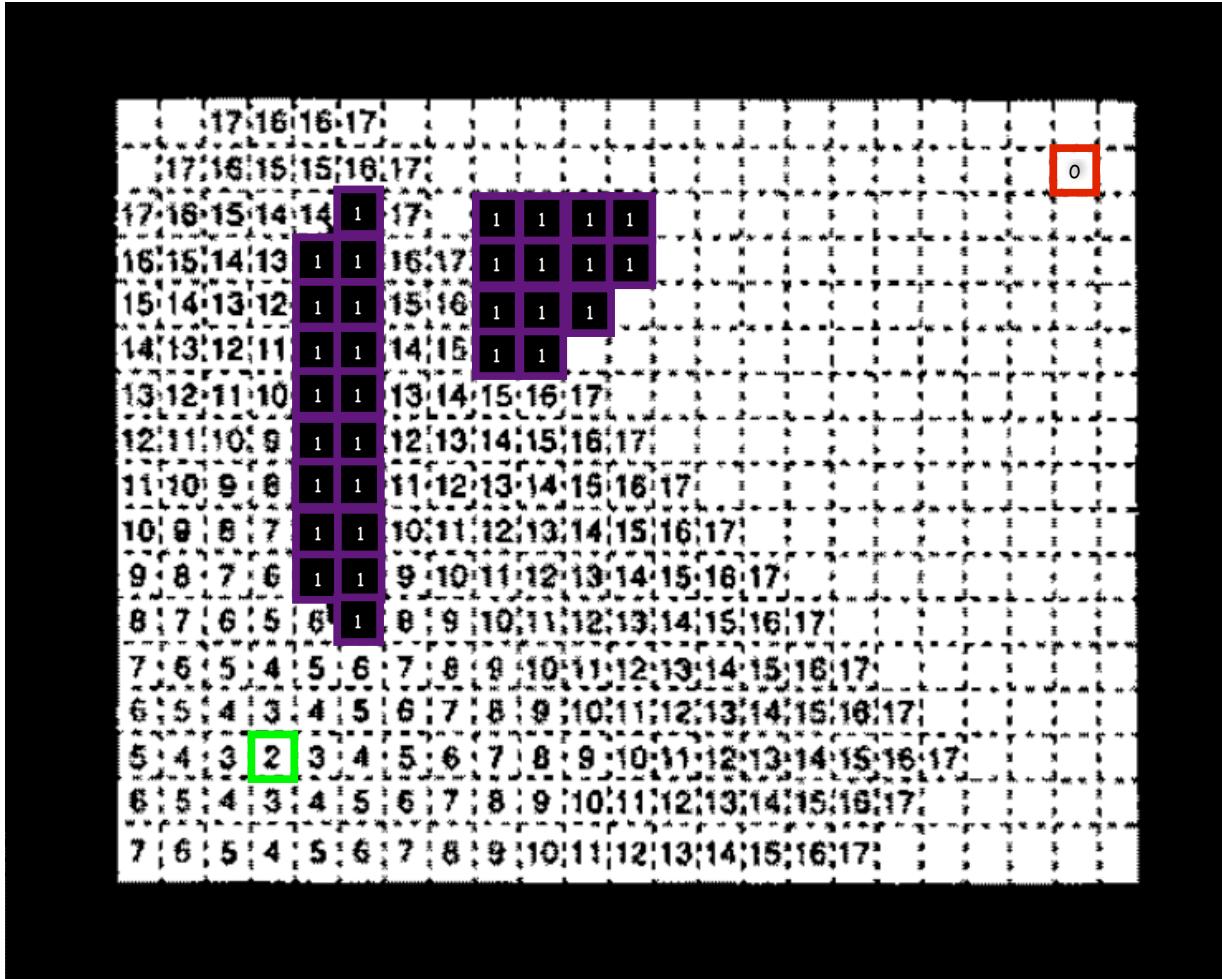
Obstacles: mark with 1

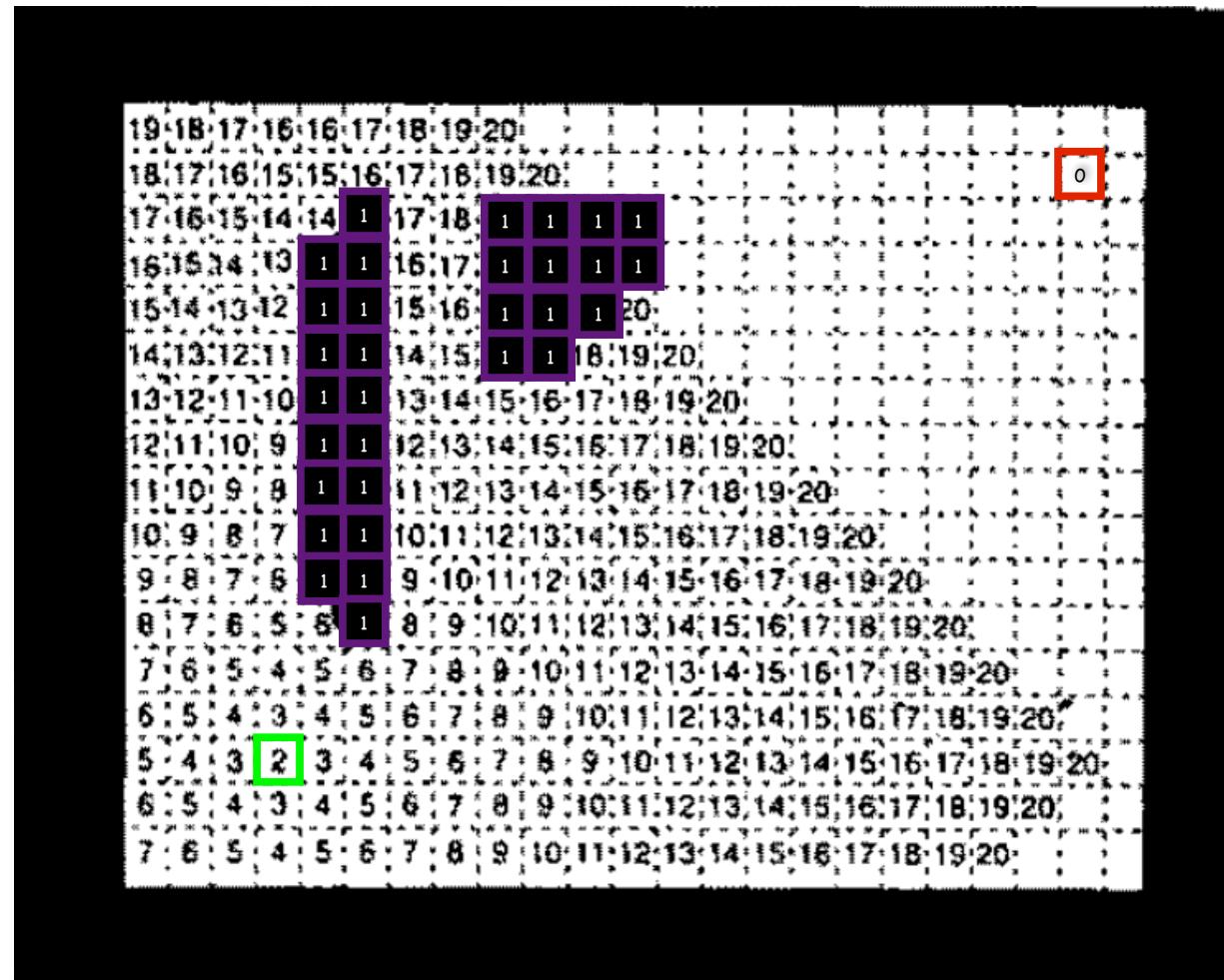


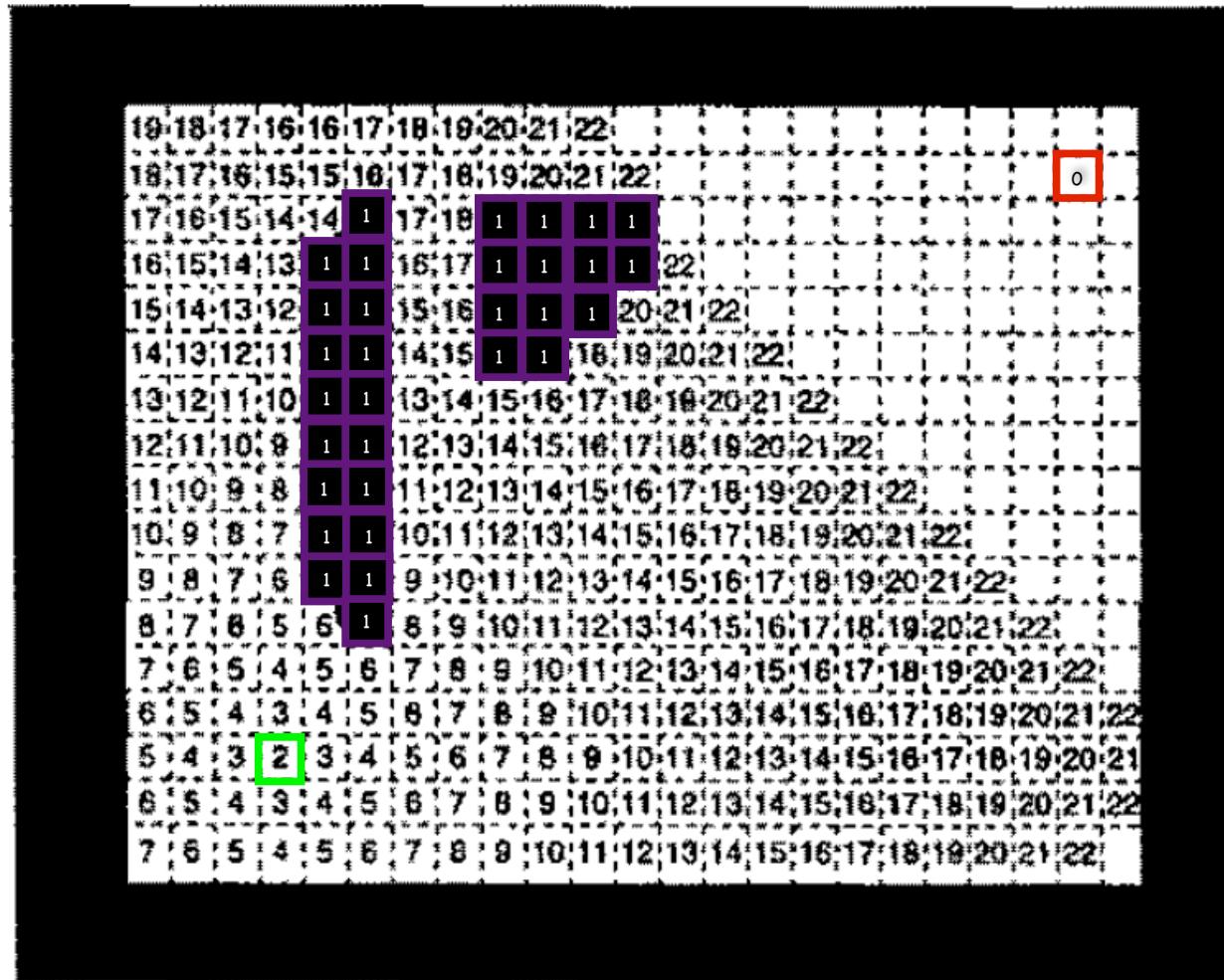


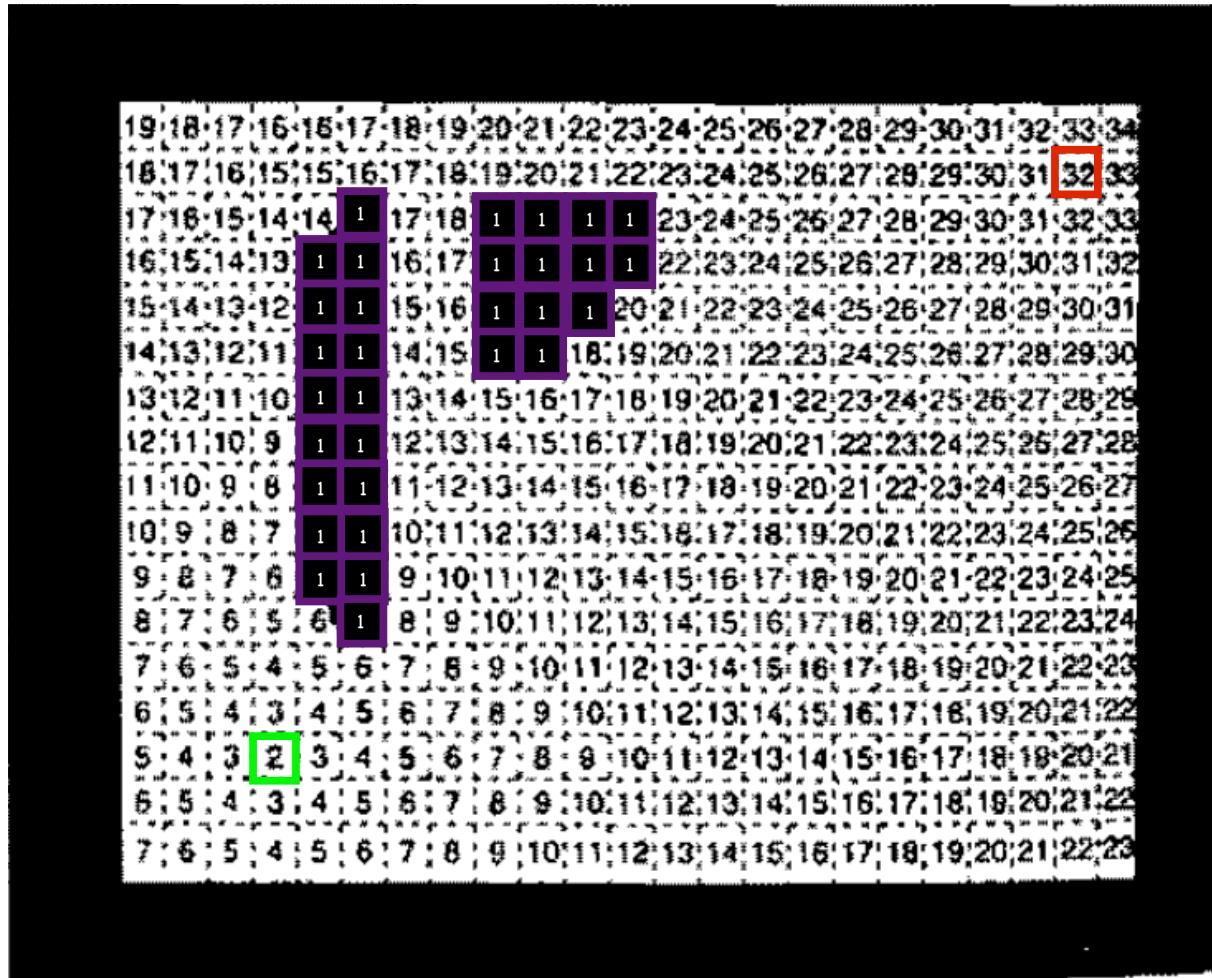




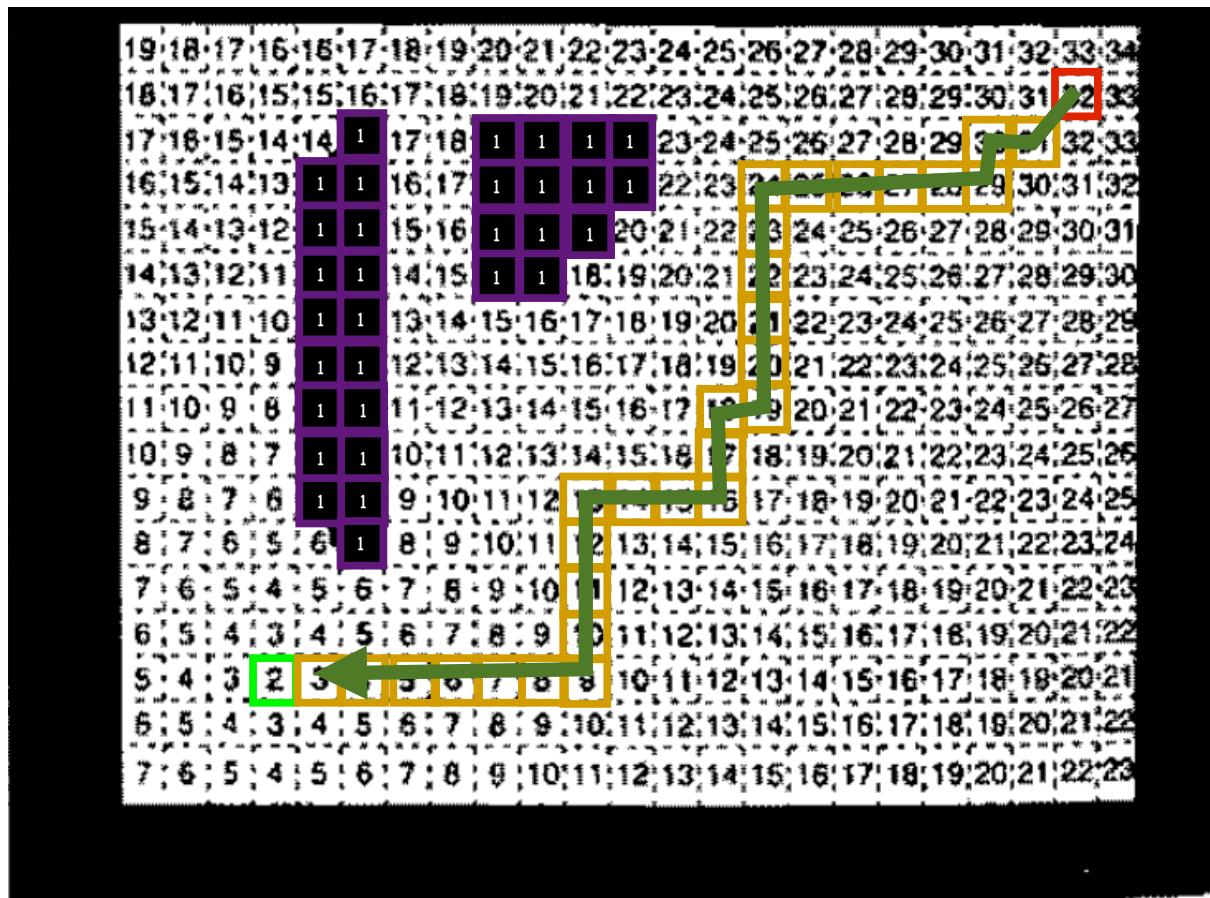






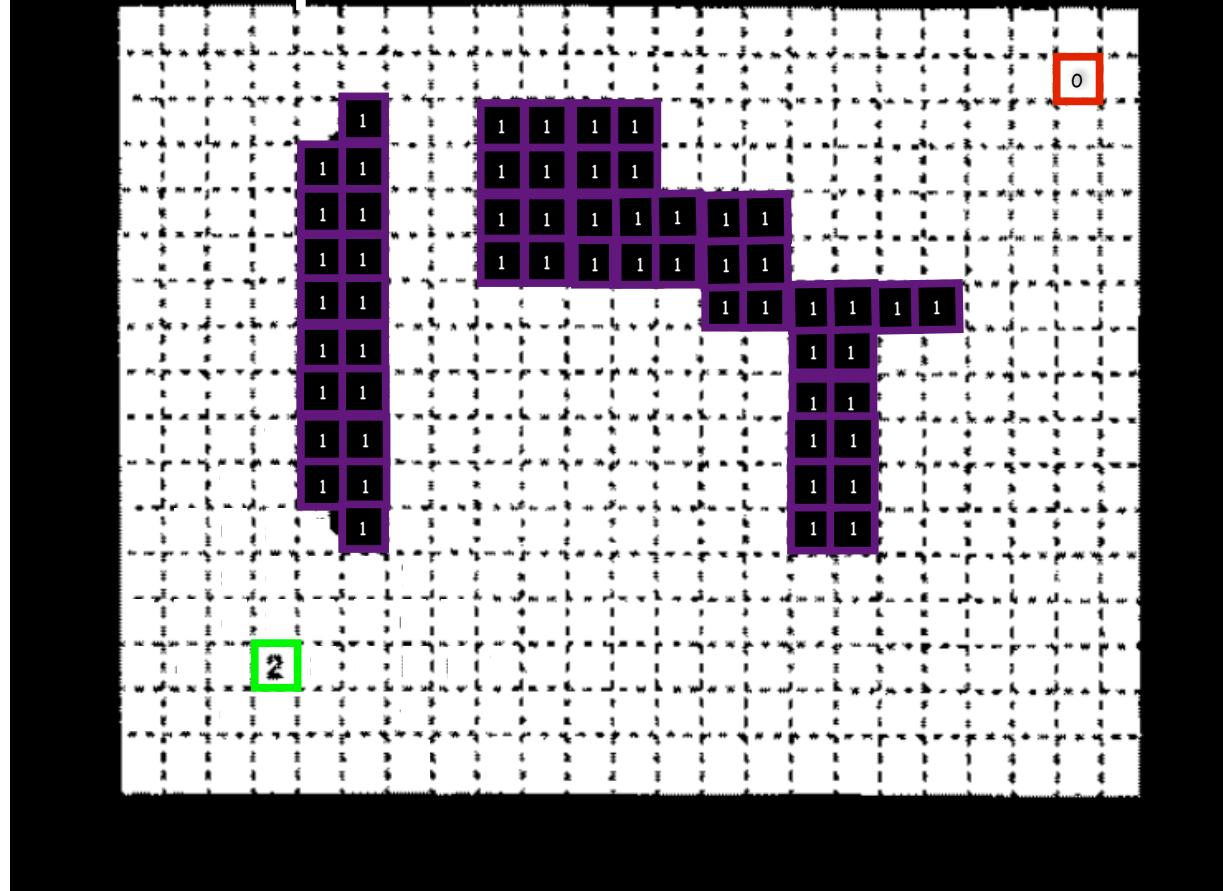


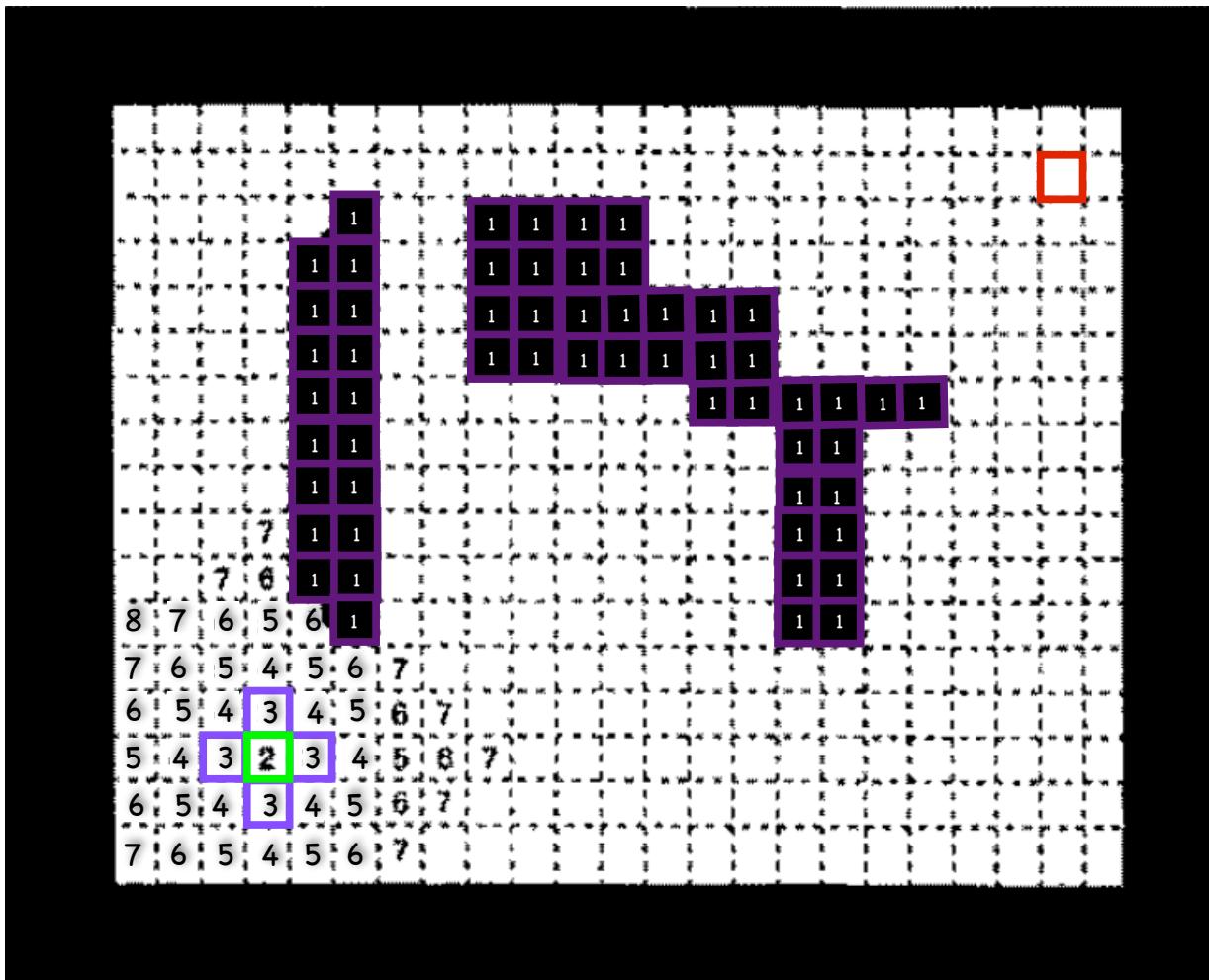
Once start reached,
follow brushfire potential to goal

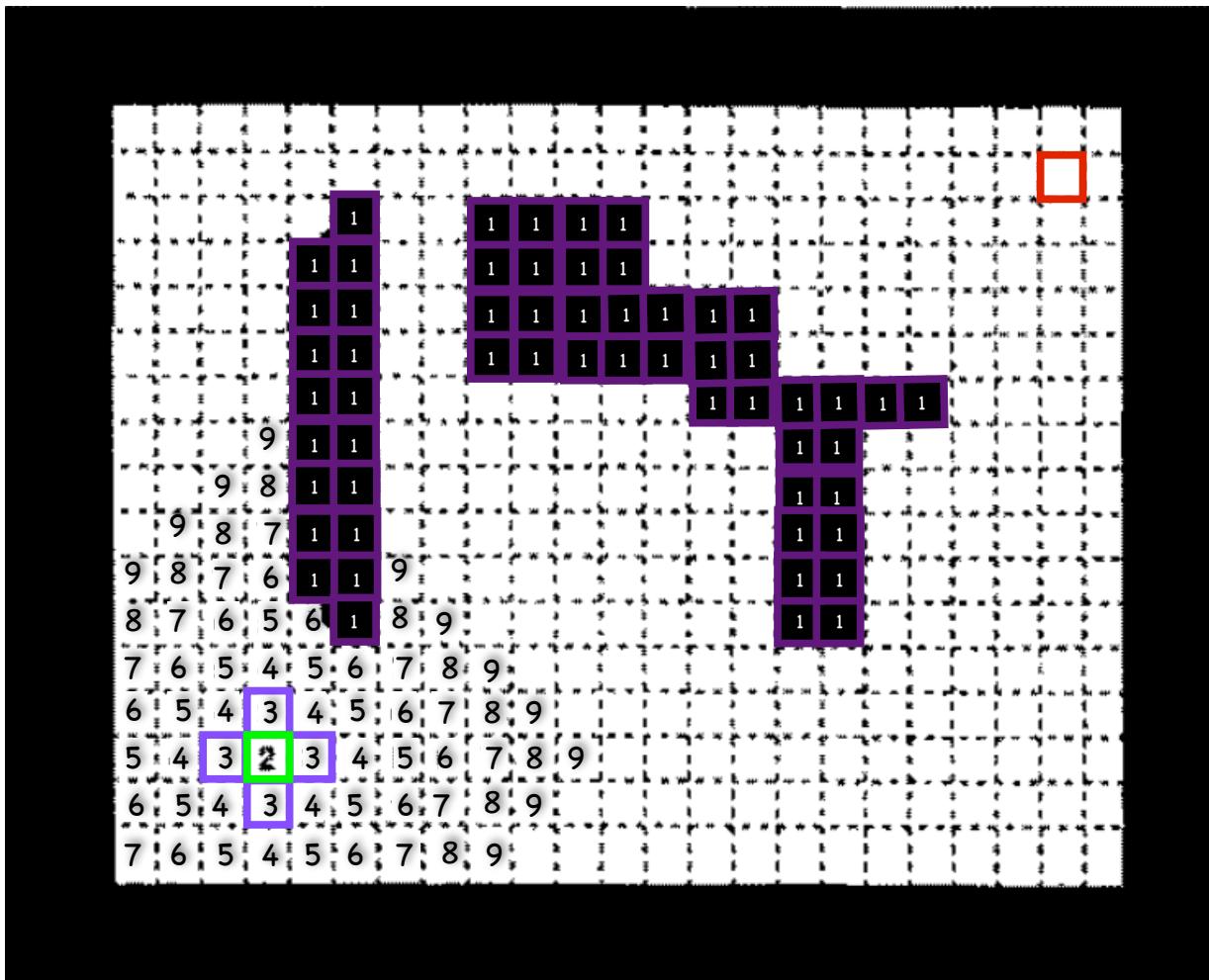


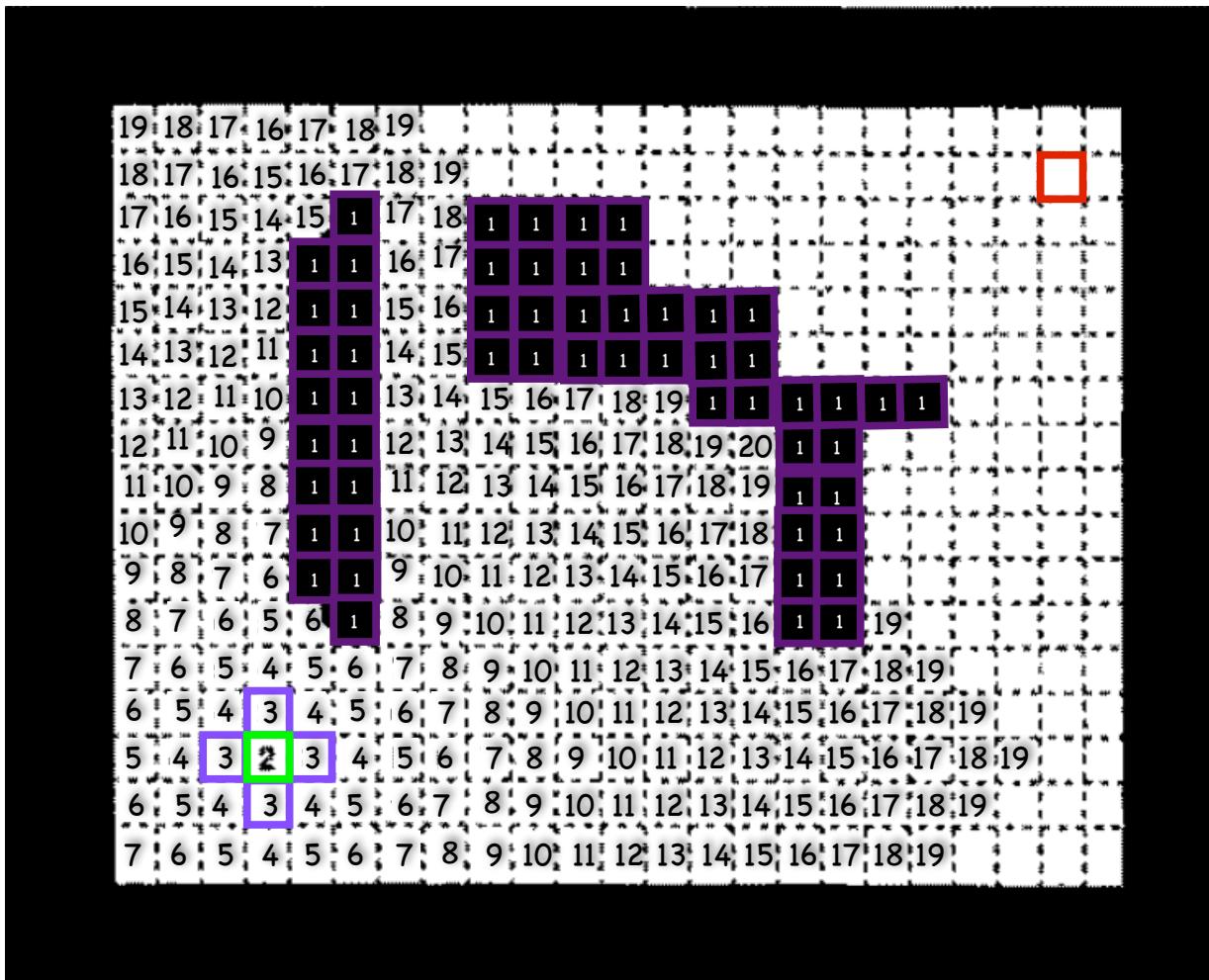
Example with Local Minima

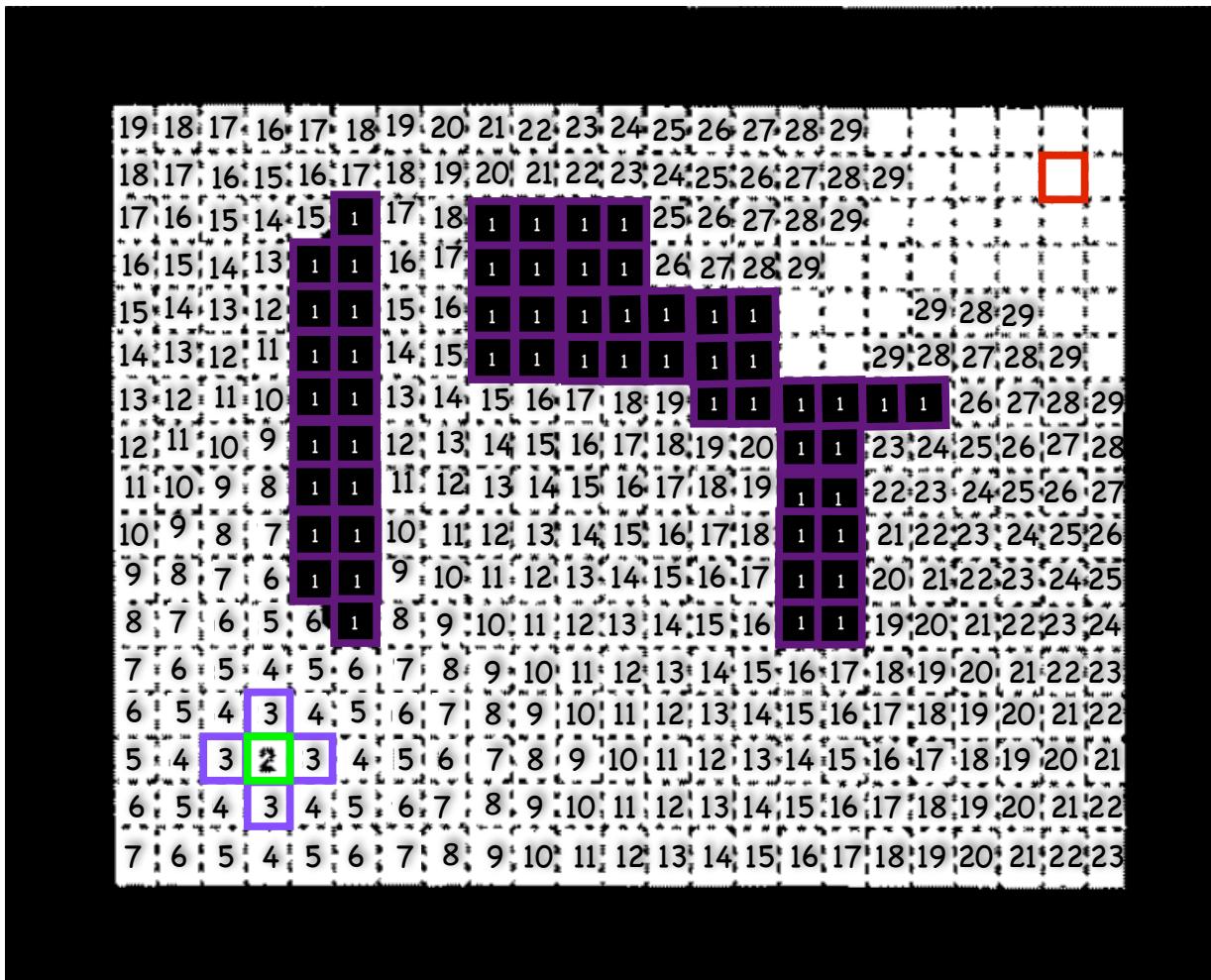
Example with Local Minima



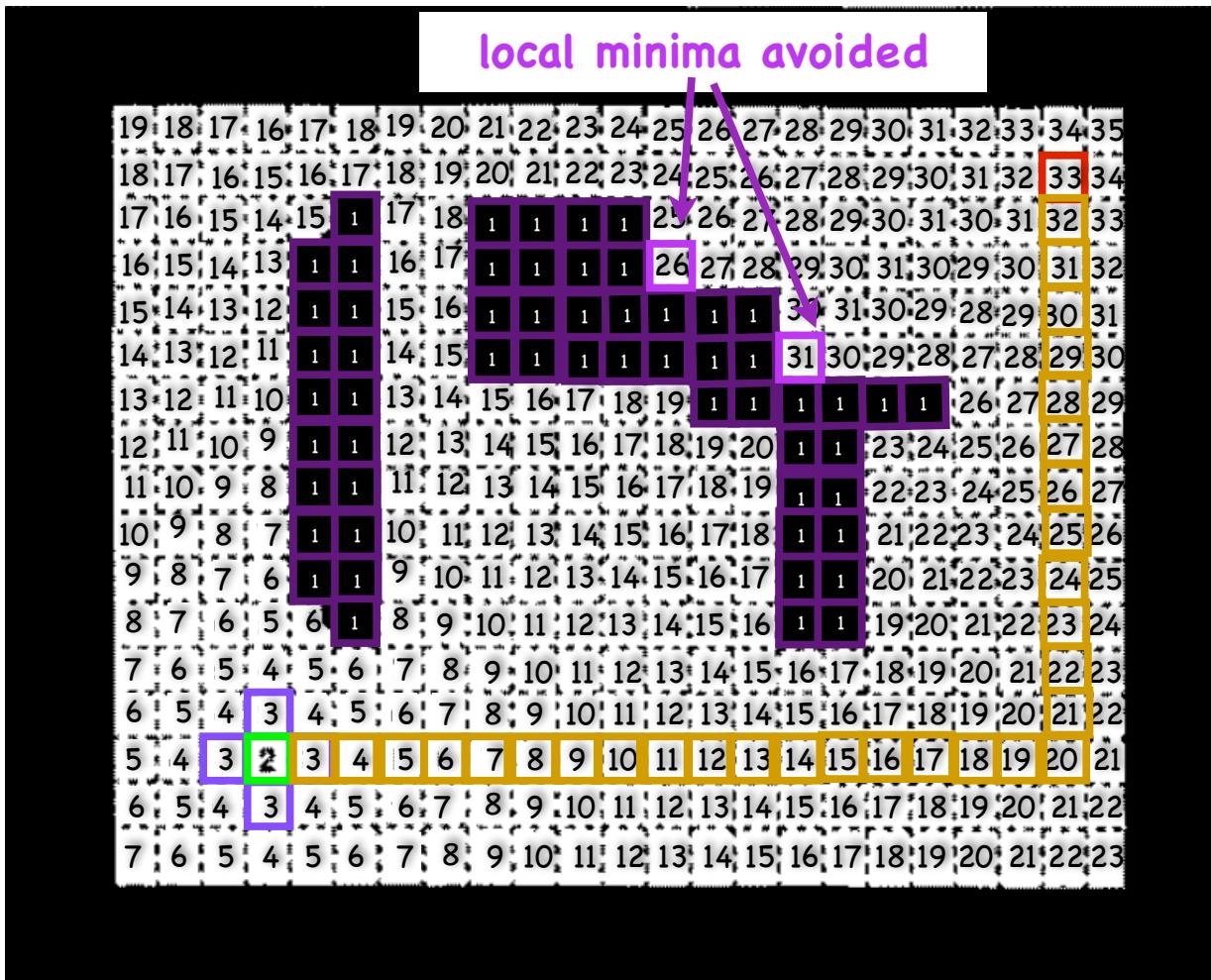






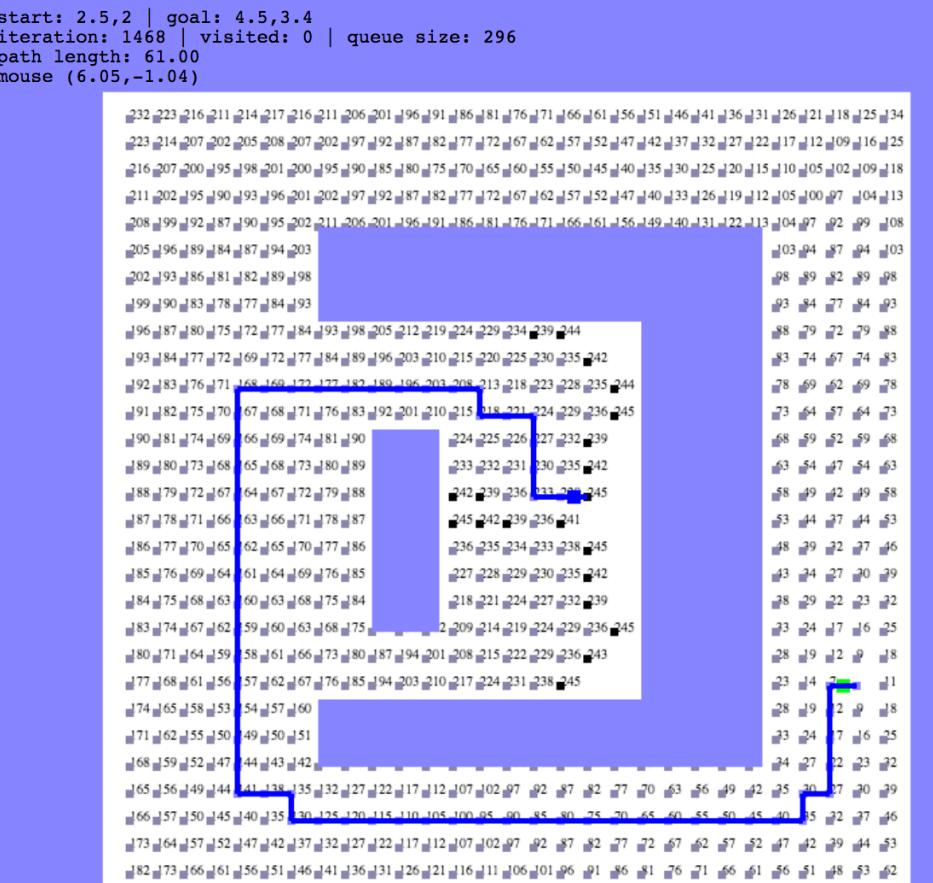


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17	16	15	14	15	1	17	18	1	1	1	1	25	26	27	28	29	30	31	30	31	32	33	
16	15	14	13	13	1	1	16	17	1	1	1	1	26	27	28	29	30	31	30	29	30	31	
15	14	13	12	12	1	1	15	16	1	1	1	1	1	1	30	31	30	29	28	29	30	31	
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13	12	11	10	10	1	1	13	14	15	16	17	18	19	1	1	1	1	1	1	26	27	28	29
12	11	10	9	9	1	1	12	13	14	15	16	17	18	19	20	1	1	23	24	25	26	27	28
11	10	9	8	8	1	1	11	12	13	14	15	16	17	18	19	1	1	22	23	24	25	26	27
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7	6	5	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	



Maithili's wavefront planner

My 2D planner



Can we extend potential fields
for arm navigation?

Potential Fields for Robot Arm

- Define endeffector goal as the attractive potential with cone potential
- Define repulsive potentials wrt. collision objects
 - Select points on robot links with “bowl” potential from nearest object
- Use manipulator Jacobian to transform potential at each point into velocities at robot joints
- Weighted sum of transformed velocities to generate control

Navigation Recap

Navigation Recap

Bug X

- Complete
- Non-optimal
- Planar

Subsumption and FSMs

- Fast but not adaptive
- Emphasis on good design

Potential Fields

- Complete in special cases
- Non-optimal
- General C-spaces
- Scales w/dimensionality

Grid Search/Wavefront

- Complete
- General C-spaces
- Limited dimensionality

Random walk

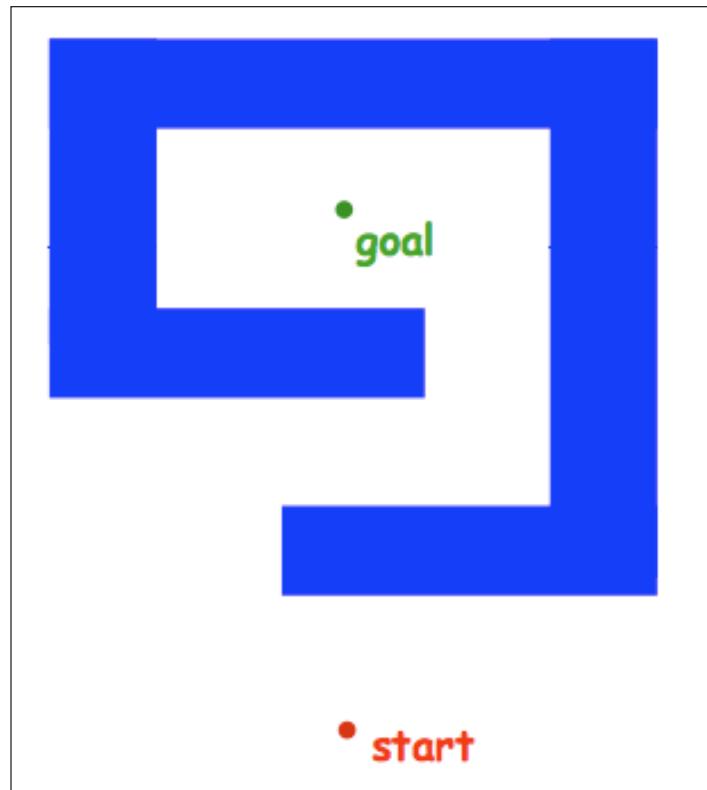
- Will find path eventually

Sampling roadmaps/RRT

- Probabilistically complete
- General
- Tractable (with good sampling)
- Scales w/dimensionality
- Not necessarily optimal

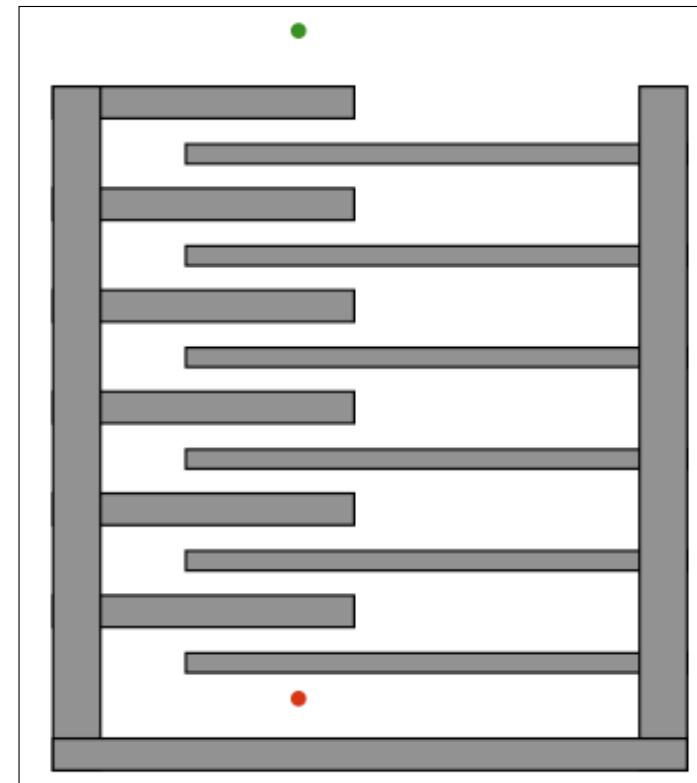
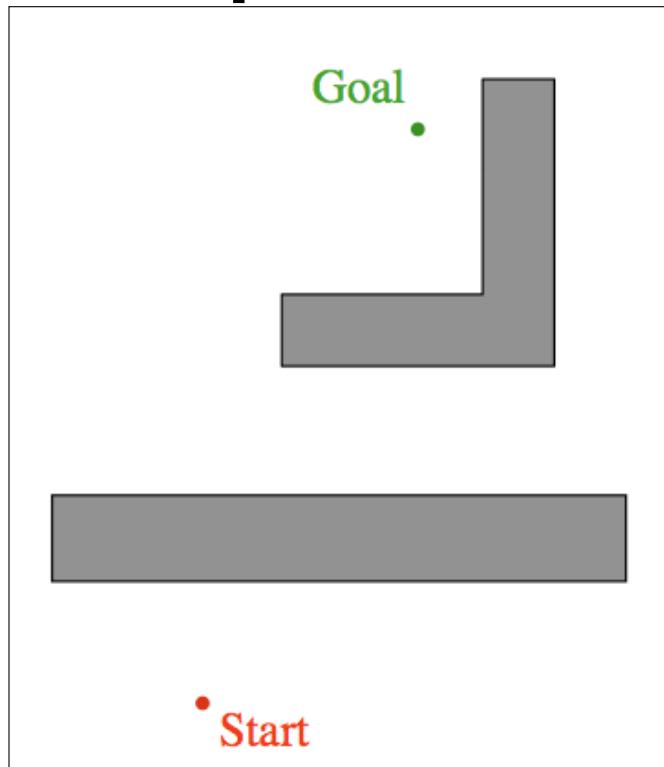
Compare: BugX examples

Describe likely paths from potential field and wavefront planners



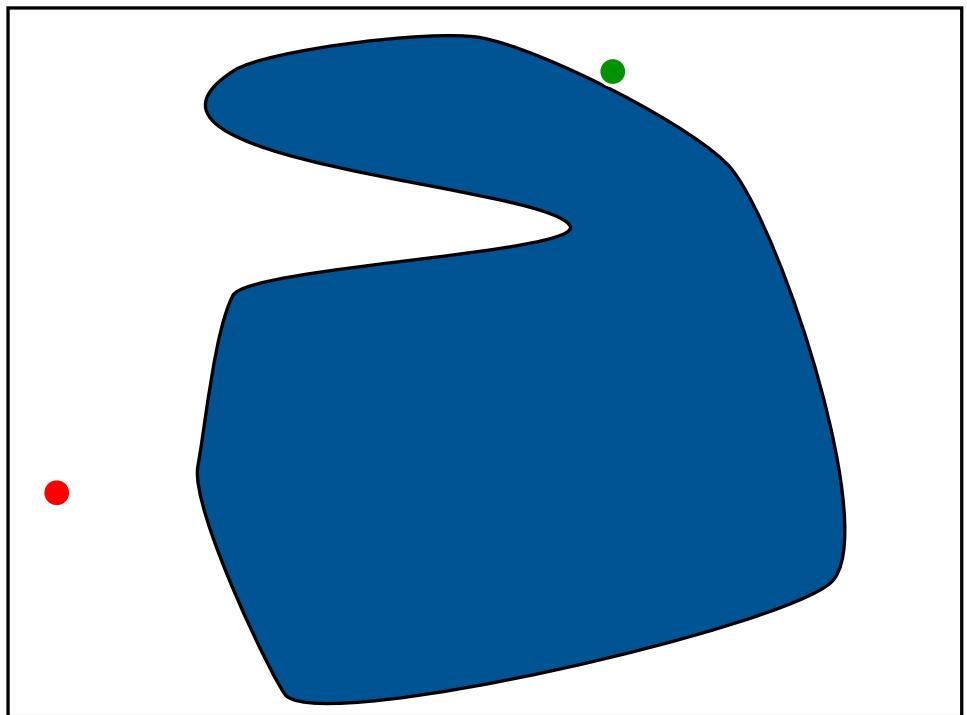
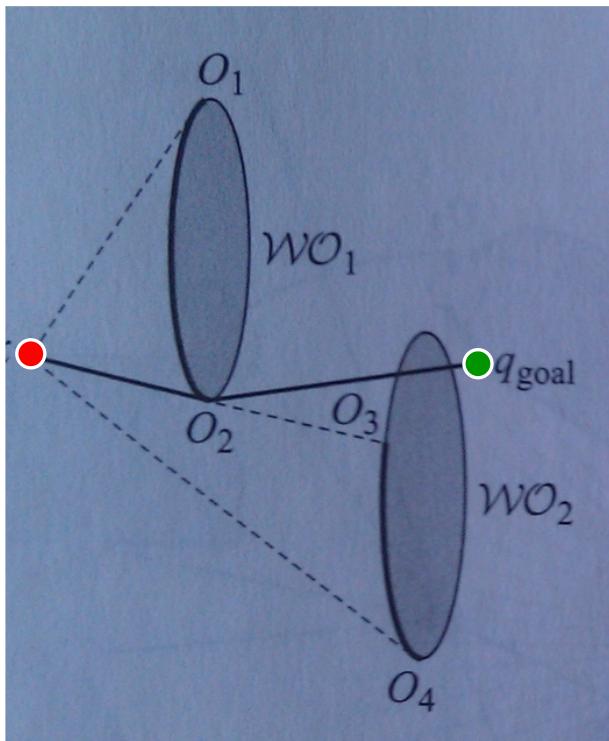
Compare: BugX examples

Describe likely paths from potential field and wavefront planners



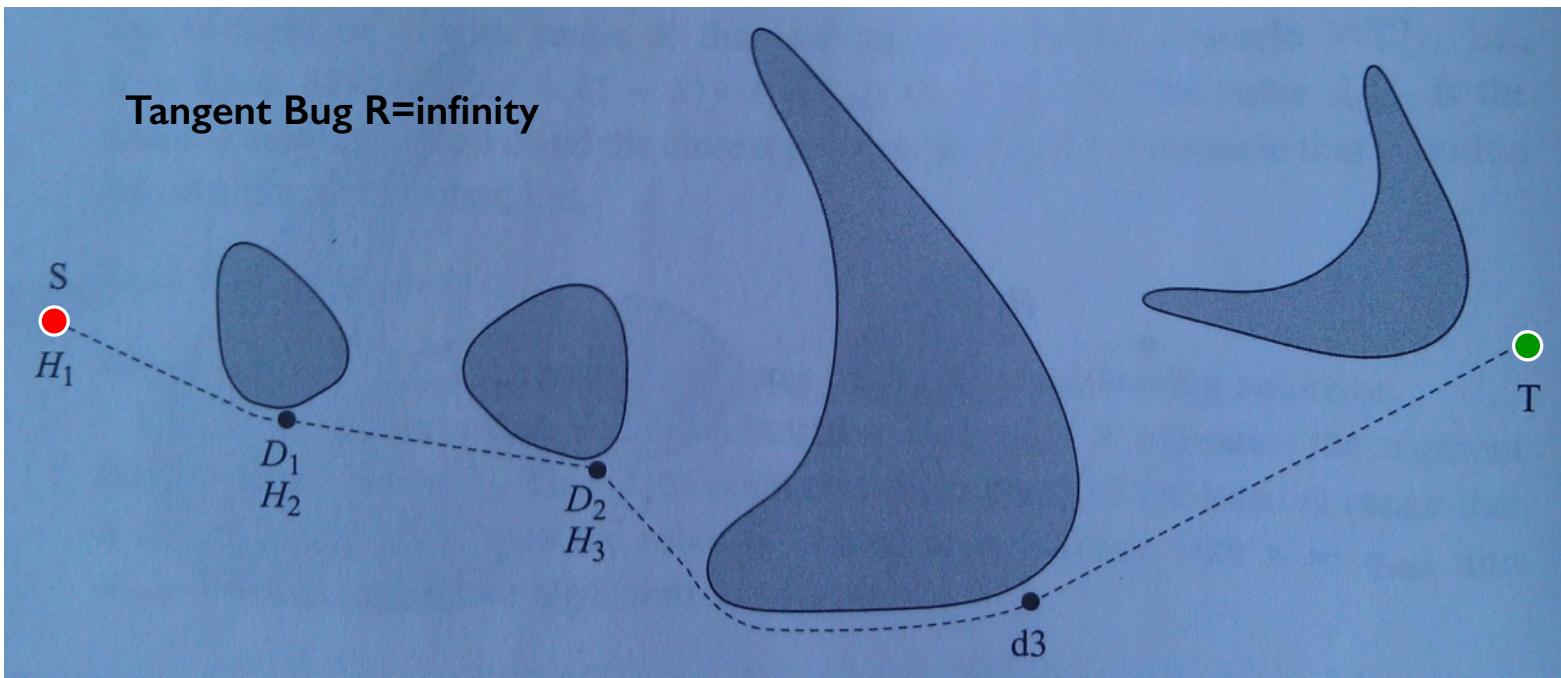
Compare: BugX examples

Describe likely paths from potential field and wavefront planners



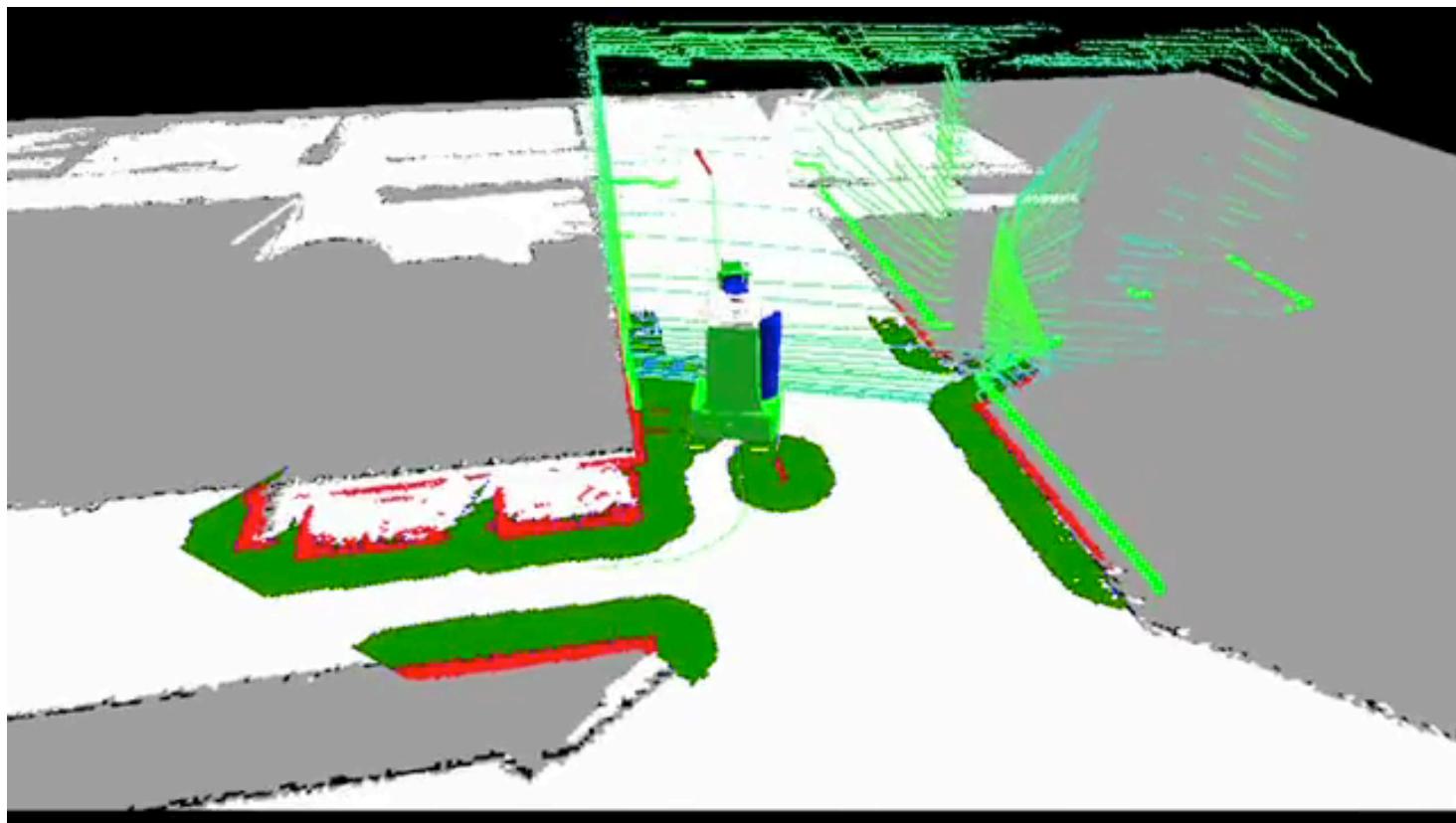
Compare: BugX examples

Describe likely paths from potential field and wavefront planners



Navigation in ROS

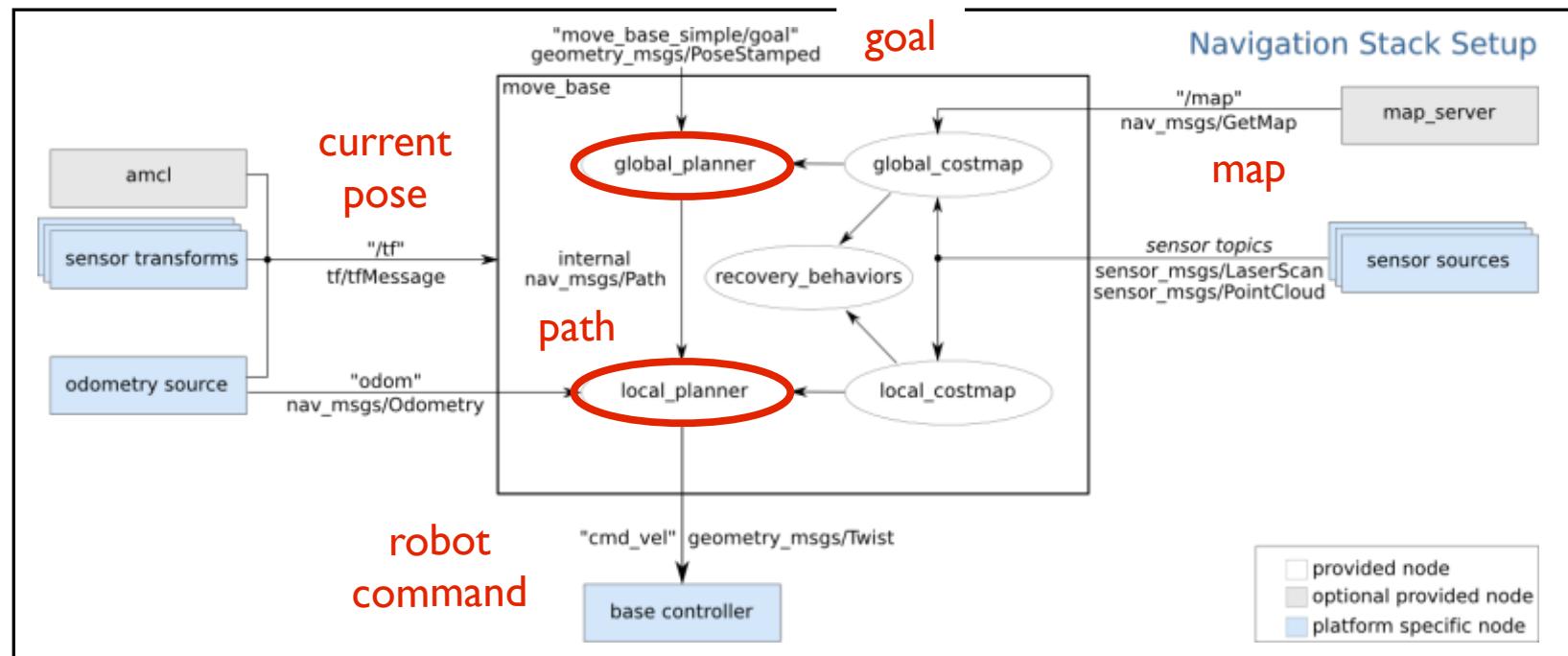
ROS Navigation Stack



<http://www.ros.org/wiki/navigation>

Michigan EECS 398/567 ROB 510 - autorob.org

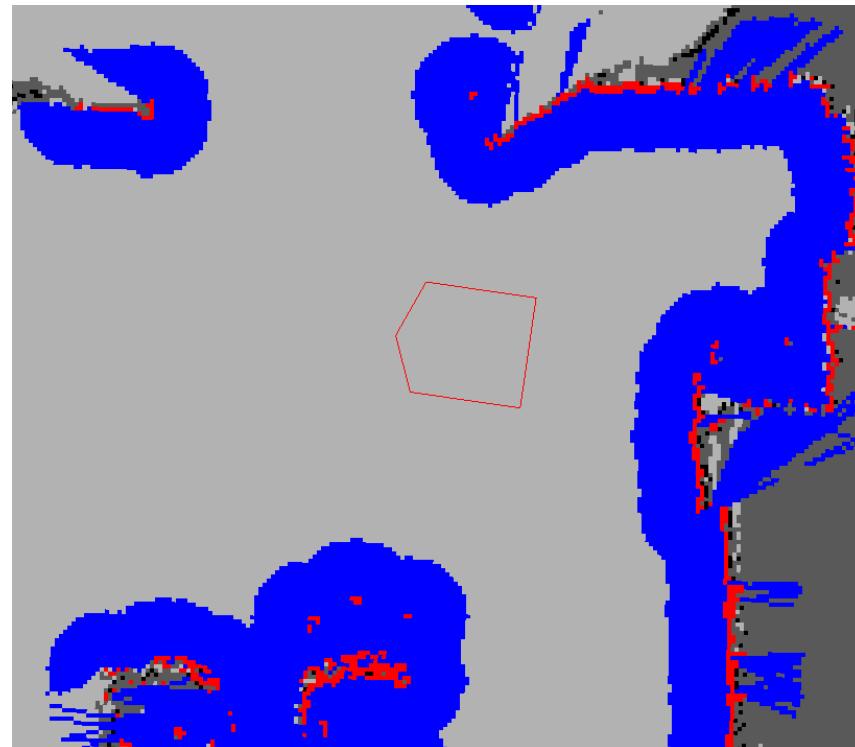
move_base



- ④ Core of nav_stack for planning and motion control

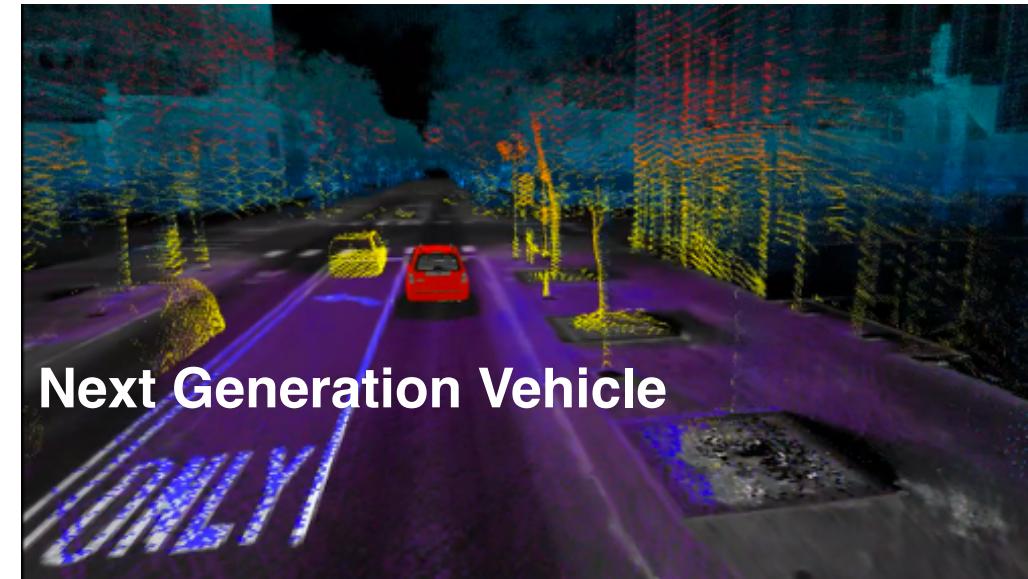
Costmap in ROS

- Treat as a Minkowski sum over the given map



http://www.ros.org/wiki/costmap_2d

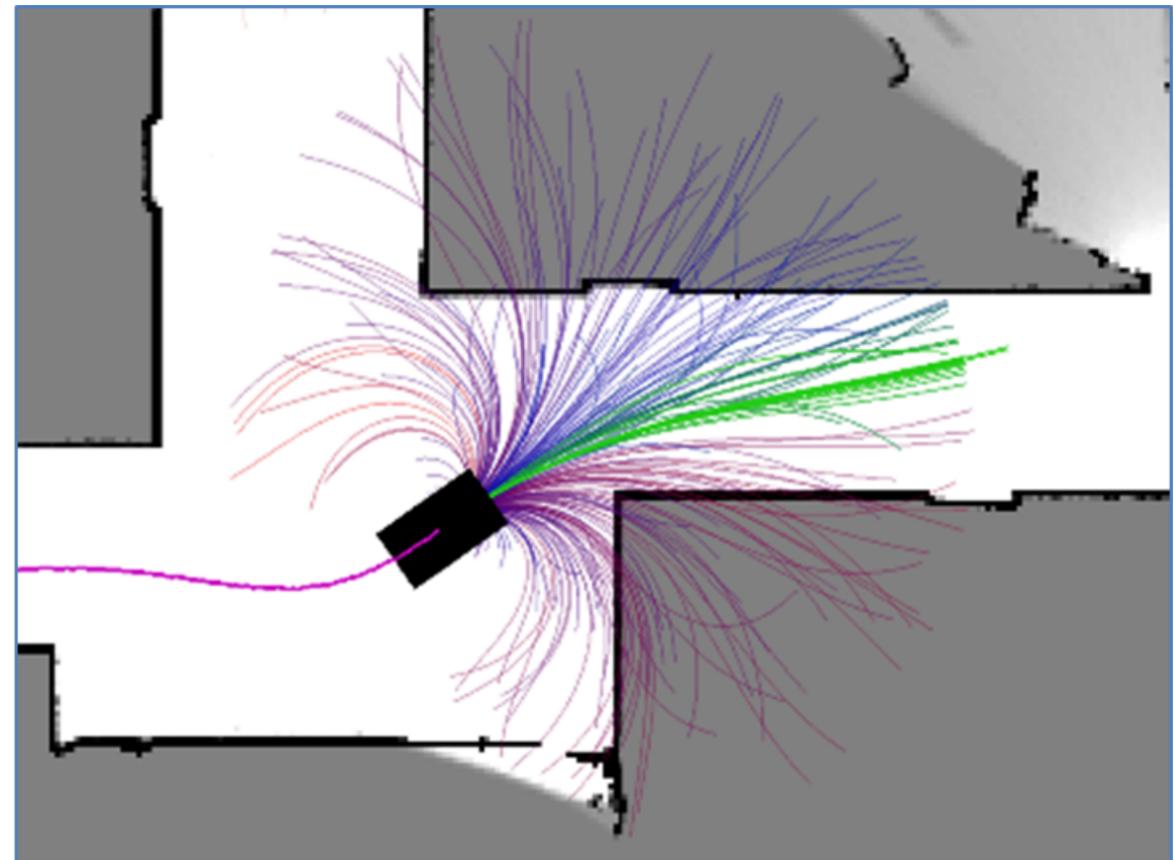
Navigation in LCM



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[Park, Johnson, Kuipers 2012]

Vulcan Navigation



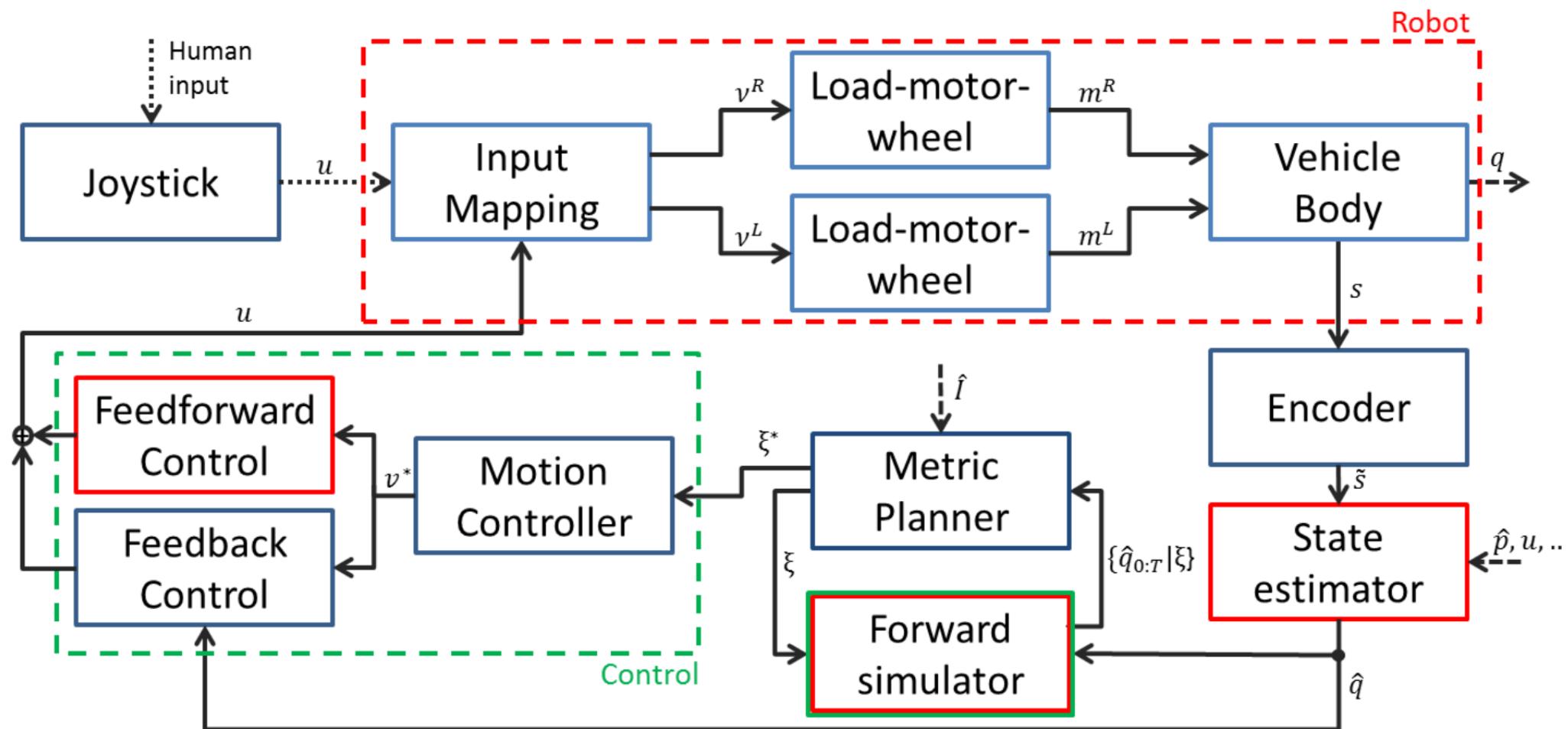


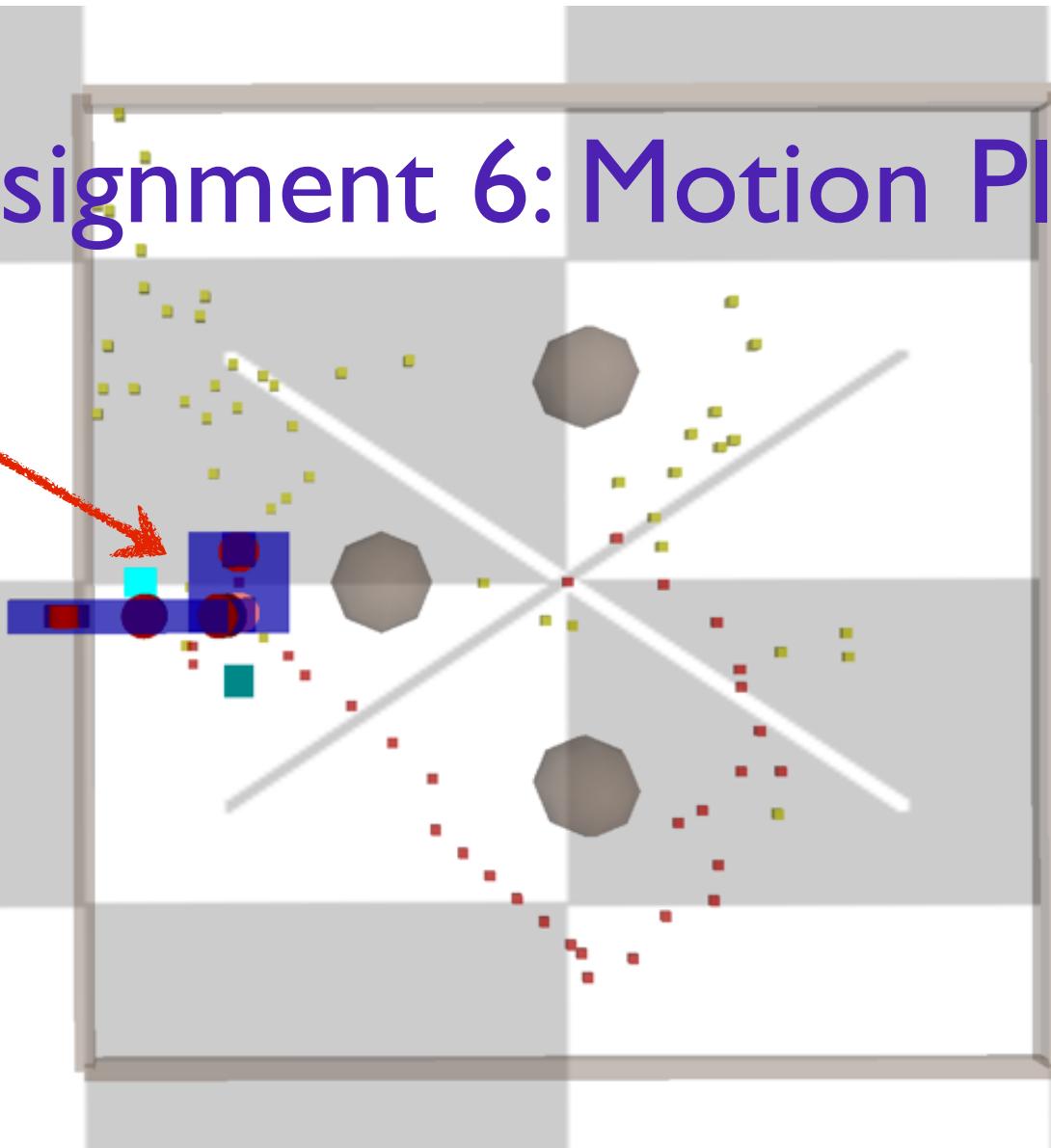
Figure A.1: Vulcan system diagram.

Assignment 6: Motion Planning

- Generate a collision free motion plan to the world origin and zero joint angle configuration

Assignment 6: Motion Planning

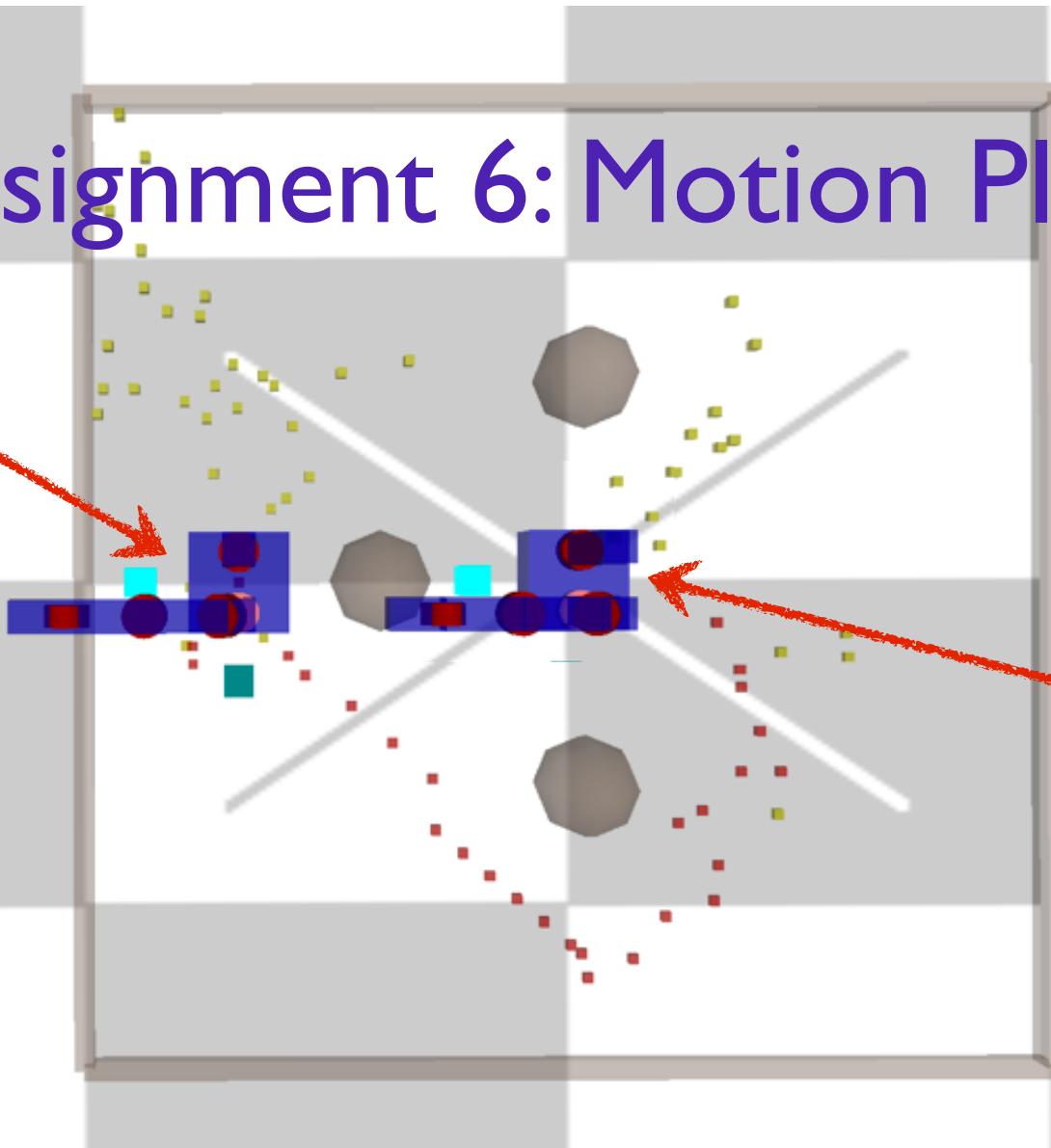
Start: random
non-colliding
configuration



Assignment 6: Motion Planning

Start: random
non-colliding
configuration

Goal: zero
configuration at
world origin

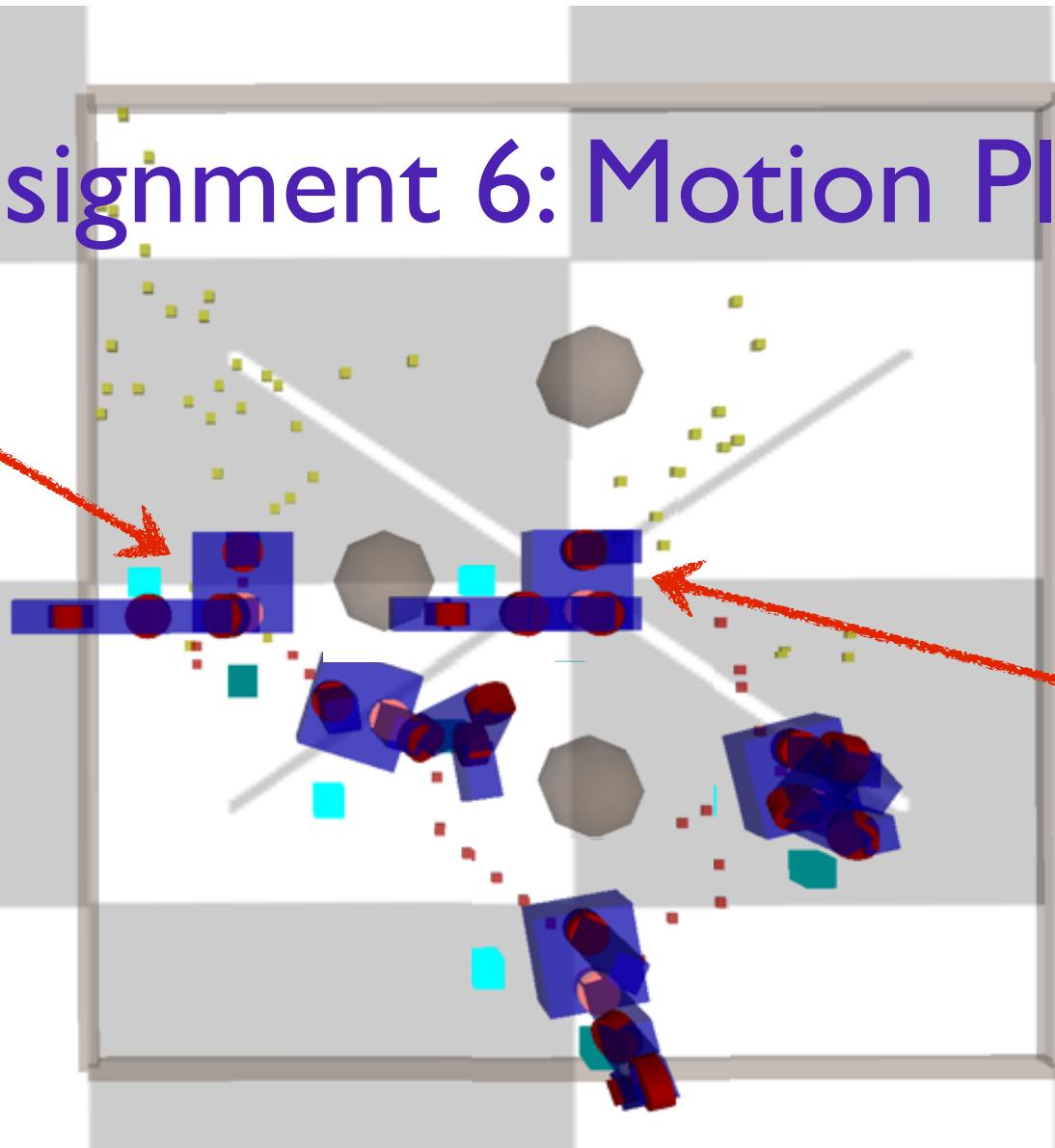


Assignment 6: Motion Planning

Start: random
non-colliding
configuration

Goal: zero
configuration at
world origin

Generate
collision-free
motion plan



<https://github.com/ohseejay/kineval-stencil-fall16>

ohseejay / kineval-stencil-fall16

Stencil code for KinEval (Kinematic Evaluator) for robots

Recommended starting point:
Update code stencil from Path Planning project

2 commits 1 branch
Branch: master ▾ New pull request

odestcj initial commit
js
kineval
project_pathplan
project_pendularm
robots
tutorial_heapsort
tutorial_js
worlds

Initial commit
initial commit

2 contributors
Upload files Find file Clone or download ▾
Latest commit 5fd521e 26 days ago
26 days ago
26 days ago
26 days ago

various 3D worlds for testing robots included by:
`home.html?world=worlds/world_local_minima.js`

rob.org

GitHub, Inc. (US) | https://github.com/ohseejay/kineval-stencil | rrt connect

ohseejay / kineval-stencil

Code Issues 0 Pull requests 0 Wiki Pulse Graphs

Stencil code for KinEval (Kinematic Evaluator) for robot control

2 commits 1 branch

Branch: master New pull request New file Upload

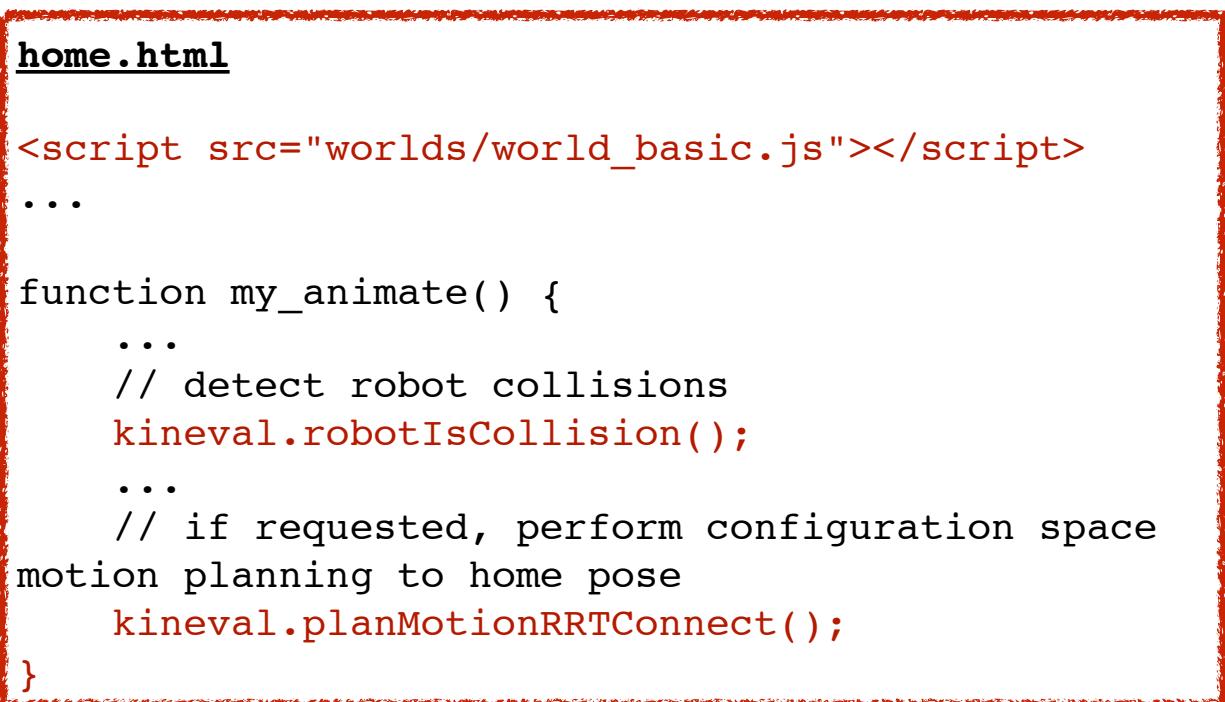
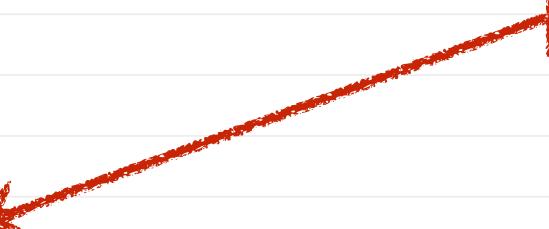
odestcj initial commit

- js
- kineval
- pendularm
- robots
- rrt
- tutorial_js
- worlds
- README.md
- home.html

home.html

```
<script src="worlds/world_basic.js"></script>
...
function my_animate() {
    ...
    // detect robot collisions
    kineval.robotIsCollision();
    ...
    // if requested, perform configuration space
    motion planning to home pose
    kineval.planMotionRRTConnect();
}
```

initial commit 2 months ago
initial commit 2 months ago
initial commit 2 months ago



world file can be alternatively
loaded by a script tag

home.html

```
<script src="worlds/world_basic.js"></script>
```

```
...
```

```
function my_animate() {
```

```
...
```

```
// detect robot collisions
```

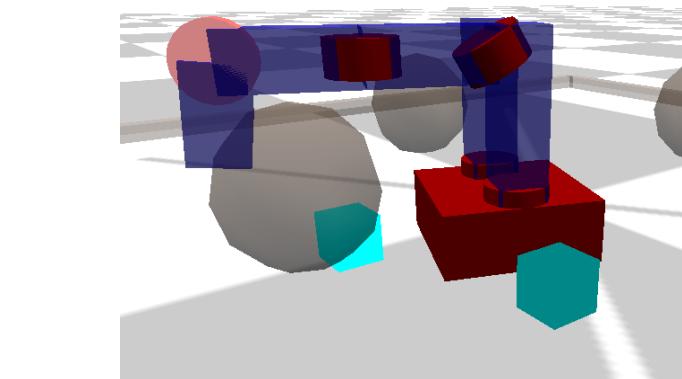
```
kineval.robotIsCollision();
```

```
...
```

```
// if requested, perform configuration space motion planning to home pose
```

```
kineval.planMotionRRTConnect();
```

```
}
```



detect if current
configuration is in collision
(colliding link turns red)

iterate motion planner

Branch: master **kineval-stencil / kineval /**

New file Upload files Find file History

 **odestcj** initial commit

Latest commit 2a1bd6e on Jan 11

..		
kineval.js	initial commit	2 months ago
kineval_collision.js	initial commit	2 months ago
kineval_controls.js	initial commit	2 months ago
kineval_forward_kinematics.js	initial commit	2 months ago
kineval_inverse_kinematics.js	initial commit	2 months ago
kineval_matrix.js	initial commit	2 months ago
kineval_quaternion.js	initial commit	2 months ago
kineval_robot_init.js	initial commit	2 months ago
kineval_rosbridge.js	initial commit	2 months ago
kineval_rrt_connect.js	initial commit	2 months ago
kineval_servo_control.js	initial commit	2 months ago
kineval_startingpoint.js	initial commit	2 months ago
kineval_threejs.js	initial commit	2 months ago
kineval_userinput.js	initial commit	2 months ago

Update collision detection with your forward kinematics



Implement RRT-Connect planner



kineval_collision.js

```
kineval.poseIsCollision = function robot_collision_test(q) {  
    // perform collision test of robot geometry against planning world  
  
    // test base origin (not extents) against world boundary extents  
    if ((q[0]<robot_boundary[0][0])||(q[0]>robot_boundary[1][0])||  
        (q[2]<robot_boundary[0][2])||(q[2]>robot_boundary[1][2]))  
        return robot.base;  
  
    // traverse robot kinematics to test each body for collision  
    // STENCIL: implement forward kinematics for collision detection  
    return robot_collision_forward_kinematics(q);  
}
```

input: q (robot configuration)
output: false (for no collision)
or name of link in collision



"electric fence"
world boundary
detection is
provided

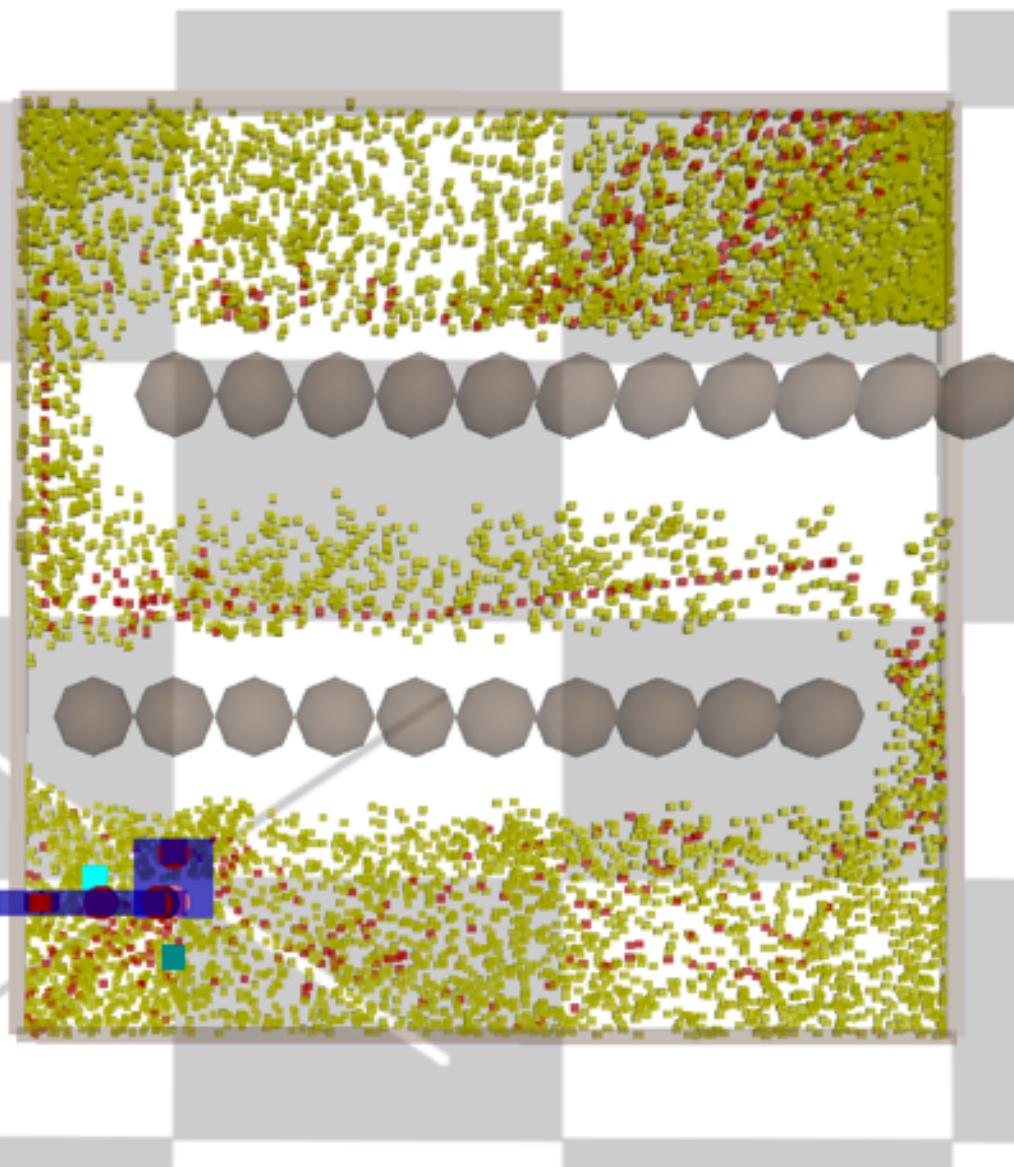
Uncomment this call; and

Implement this function to traverse forward kinematics for collisions;
Use provided link collision function for AABB test of each link

kineval_rrt_connect.js

```
kineval.robotRRTPlannerInit = function robot_rrt_planner_init() {  
    // set start (q_init) and goal (q_goal) configurations  
}  
  
function robot_rrt_planner_iterate() {  
  
    var i;  
    rrt_alg = 1; // 0: basic rrt (OPTIONAL), 1: rrt_connect (REQUIRED)  
  
    if (rrt_iterate && (Date.now()-cur_time > 10)) {  
        cur_time = Date.now();  
  
        // implement one planning iteration here with calls to rrt_extend, etc.  
  
        // if plan found, store configuration sequence in kineval.motion_plan  
        //   kineval.motion_plan[kineval.motion_plan_traversal_index]  
    }  
}
```

make sure to test
against all provided
worlds!



Next Lecture:
Collision Detection

