

# Autonomous agents

## Lecture 6, 20160204

Approaches to robot intelligence  
Basic robotic brain processes

# Additional information, HP1.1

- In HP1.1 (a) the parentheses do *not* represent function arguments. Thus, the parentheses can safely be removed, so that

$$v_L(t) = v_0 t / t_1$$

... and similarly (but with  $t_2$ ) for the speed of the other (right) wheel.

# About HP1

- The home problem(s) should be solved individually!
- HP1.2 and HP1.3 illustrate the difficulties in generating behaviors for a robot with very limited sensor capability.
- As stated before, you may (of course) **not** make use (in the robotic brain) of any information that a real robot (with the same sensors as our simulated robots) would not have.
- Specifically, you may **not** use the exact pose (position and heading) of the robot.

# About HP1

- In HP1.3 (but *not* in HP1.2), you may use the odometric *estimate* of the pose, but you may not recalibrate it (the problem is supposed to illustrate odometric drift – calibration will be considered in a later home problem).
- Even though the absolute pose of the robot will drift quite strongly, the odometer can still be used for a making a local 90-degree turn.

# About HP1

## Notes:

(1) In order to follow a wall using a single sensor, one may take several readings (to reduced noise effects), then move a bit, take several readings again, and compare.

If constant  $\Leftrightarrow$  moving parallel to the wall.

If increasing  $\Leftrightarrow$  moving towards the wall etc.

(2) The IR sensor readings (`RayBasedSensors(k).Reading`) are not linear functions of the distance. In order to estimate the reading at a given distance, place the robot at that distance from a wall, and take several measurements.

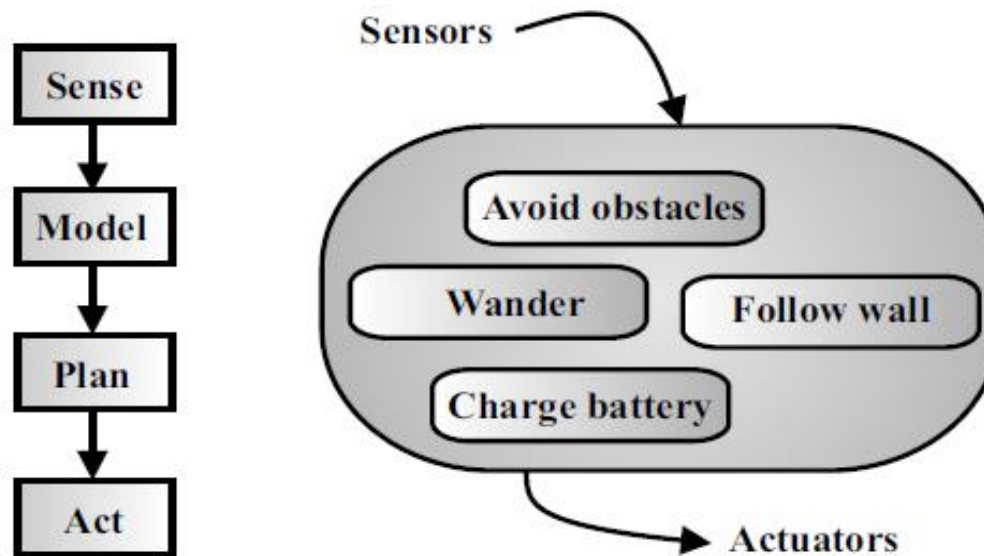
# Today's learning goals

- After this lecture you should be able to
  - Explain the difference between classical artificial intelligence and behavior-based robotics
  - Describe the basic ideas behind behavior-based robotics in detail
  - Implement simple robotic behaviors in the form of finite-state machines

# Approaches to machine intelligence

- Classical artificial intelligence (AI)
  - 1950s –
  - Focused on high-level (human) reasoning
- Behavior-based robotics (BBR)
  - 1980s-
  - Focused on basic survival-related behaviors

# Approaches to machine intelligence



**Figure 5.1:** A comparison of the information flow in classical AI (left panel) and in BBR (right panel). For BBR, any number of behaviors may be involved, and the figure only shows an example involving four behaviors.



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# Behavior-based robotics

- Mostly applied to mobile robots.
- Strongly influenced by (the brains of) relatively simple biological organisms (e.g. Insects).
- Robots are first provided with simple, survival-related behaviors, then more complex behaviors. For a robot, survival entails
  - Avoiding collisions
  - Avoiding to run out of battery energy

# Behavior-based robotics

- **Reactivity:** Quick reactions, without too much deliberation (even though internal states are required for more complex behaviors).
- Basic behaviors form a behavioral repertoire.
- Decision-making system needed to select between behaviors.

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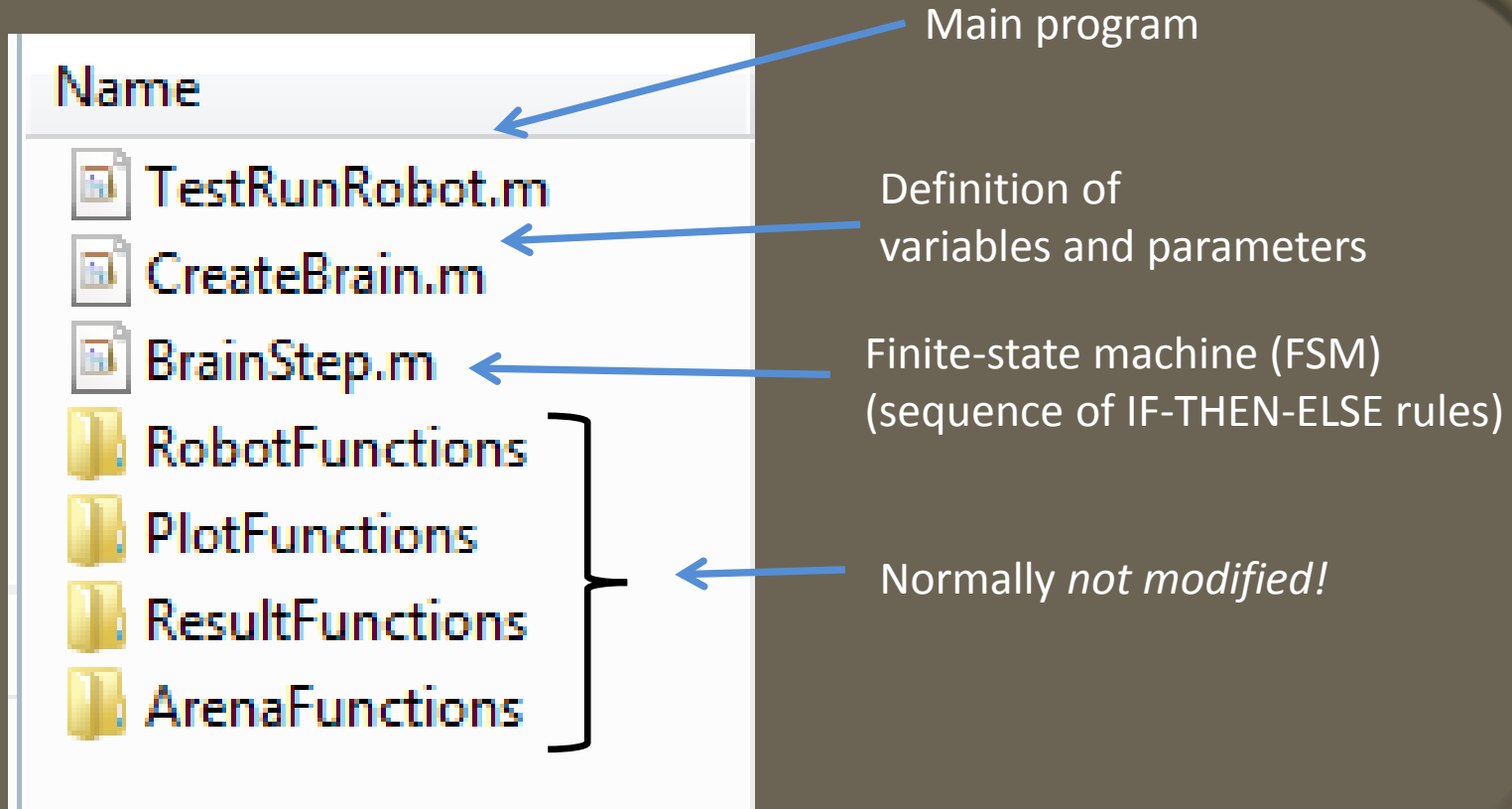
# Implementing robot behaviors

- Behavioral architectures
  - Artificial neural networks (ANNs)
  - Finite-state machines (FSMs)
  - Other
- Many architectures have been suggested.
- Some behaviors require a high degree of clarity (as obtained with FSMs), while others are more suitable as black-box units (e.g. ANNs).
- Here we will use FSMs.

# ARSim

- The simulator is available on the web page.
- Implement and run the two ARSim examples (code available in Chapter 5)
  - *Wandering*
  - *Navigation*
- Study the various parts of ARSim carefully.

# ARSim



# ARSim

```
1  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
2  %
3  % TestRunRobot: a sample program, illustrating the use
4  % of the ARSim functions (v1.1.9)
5  %
6  % (c) Mattias Wahde, 2006, 2007, 2011
7  %
8  % Send bug reports to: mattias.wahde@chalmers.se
9  %
10 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
11
12 - clear all;
13
14 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
15 % Add ARSim to the search path:
16 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
17 - if strcmp(computer,'PCWIN')
18 -     path(path, './RobotFunctions');
19 -     path(path, './ResultFunctions');
20 -     path(path, './PlotFunctions');
21 -     path(path, './ArenaFunctions');
22 - else
23 -     path(path, './RobotFunctions');
24 -     path(path, './ResultFunctions');
25 -     path(path, './PlotFunctions');
26 -     path(path, './ArenaFunctions');
27 - end
28
29
```

Main program  
(TestRunRobot.m)



# ARSim

```

28
29
30 *****
31 % Generate arena:
32 *****
33 - arenaSize = [-2 2 -2 2];
34 - arenaObject1 = CreateArenaObject('arenaObject1', [[-1 1]; [-1 0.7]; [-0.7 0.7]; [-0.7 1]]);
35 - arenaObject2 = CreateArenaObject('arenaObject2', [[-2.0 -2.0]; [-1.8 -2.0]; [-1.8 2.0]; [-2.0 2.0]]);
36 - arenaObject3 = CreateArenaObject('arenaObject3', [[-1.8 -2.0]; [1.8 -2.0]; [1.8 -1.8]; [-1.8 -1.8]]);
37 - arenaObject4 = CreateArenaObject('arenaObject4', [[2.0 -2.0]; [1.8 -2.0]; [1.8 2.0]; [2.0 2.0]]);
38 - arenaObject5 = CreateArenaObject('arenaObject5', [[-1.8 2.0]; [1.8 2.0]; [1.8 1.8]; [-1.8 1.8]]);
39 - arenaObject6 = CreateArenaObject('arenaObject6', [[1 -1]; [1 -0.7]; [0.7 -0.7]; [0.7 -1]]);
40 - testArena = CreateArena('arena', arenaSize, [arenaObject1; arenaObject2; arenaObject3; ...
41             arenaObject4; arenaObject5; arenaObject6]);
42
43 *****
44 *****
45 % Generate robot:
46 *****
47 *****
48
49 *****
50 % Brain:
51 *****
52 - brain = CreateBrain;
53

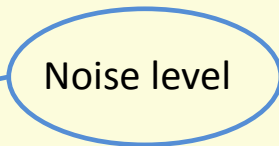
```

Written by the user.  
Problem-specific

# ARSim

```
54  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
55  % IR Sensors:
56  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
57 - sensor1RelativeAngle = 0.7854;
58 - sensor2RelativeAngle = -0.7854;
59 - size = 0.0500;
60 - numberOfRays = 3;
61 - openingAngle = 0.5000;
62 - range = 1.0000;
63 - c1 = 0.0300;
64 - c2 = 0.1000;
65 - sigma = 0.0100;
66 - sensor1 = CreateIRSensor('sensor1',sensor1RelativeAngle,size,...
67 -                           numberOfRays,openingAngle,range,c1,c2,sigma);
68 - sensor2 = CreateIRSensor('sensor2',sensor2RelativeAngle,size,...
69 -                           numberOfRays,openingAngle,range,c1,c2,sigma);
70
71  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
72  % Odometer:
73  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
74 - sigma = 0.0001;    % Measures the odometric drift
75 - odometer = CreateOdometer('odometer',sigma);
76
77  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
78  % Compass:
79  %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
80 - sigma = 0.0500;
81 - compass = CreateCompass('compass',sigma);
82
```

Noise level



# ARSim

```
82
83 *****
84 % Motors:
85 *****
86 - leftMotor = CreateMotor('leftMotor');
87 - rightMotor = CreateMotor('rightMotor');
88 - mass = 3.0000;
89 - momentOfInertia = 0.2000;
90 - radius = 0.2000;
91 - wheelRadius = 0.1000;
92
93 %% Robot with IR sensors:
94 % testRobot = CreateRobot('TestRobot',mass,momentOfInertia,radius,wheelRadius, ...
95 % [sensor1 sensor2],[leftMotor rightMotor],[],[],brain);
96
97 %% Robot with IR sensors and odometer:
98 % testRobot = CreateRobot('TestRobot',mass,momentOfInertia,radius,wheelRadius, ...
99 % [sensor1 sensor2],[leftMotor rightMotor],odometer,[],brain);
100
101 %% Robot with IR sensors, odometer, and compass:
102 - testRobot = CreateRobot('TestRobot',mass,momentOfInertia,radius,wheelRadius, ...
103 % [sensor1 sensor2],[leftMotor rightMotor],odometer,compass,brain);
104
```

# ARSim

```
105
106 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
107 % Miscellaneous simulation parameters
108 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
109 - showPlot = true;
110 - plotStep = 10;
111 - recordResults = true;
112 - testRobot.ShowSensorRays = false;
113 - testRobot.ShowOdometricGhost = false;
114
115 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
116 % Initialization:
117 %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
118
119 - position = [-0.2000 0.0000];
120 - heading = 0.0000;
121 - velocity = [0.0000 0.0000];
122 - angularSpeed = 0.0000;
123
124 - testRobot = SetPositionAndVelocity(testRobot, position, heading, velocity, angularSpeed);
125 - if (~isempty(testRobot.Odometer))
126 -     testRobot.Odometer = CalibrateOdometer(testRobot);
127 - end
128
129 - if (showPlot)
130 -     plotHandle = InitializePlot(testRobot, testArena);
131 - end
132 - if (recordResults)
133 -     motionResults = InitializeMotionResults(testRobot);
134 - end
135
136 - maxSteps = 1000;
137 - dt = 0.01;
138 - time = 0.0;
139 - collided = false;
```

Try changing both parameters to *true*

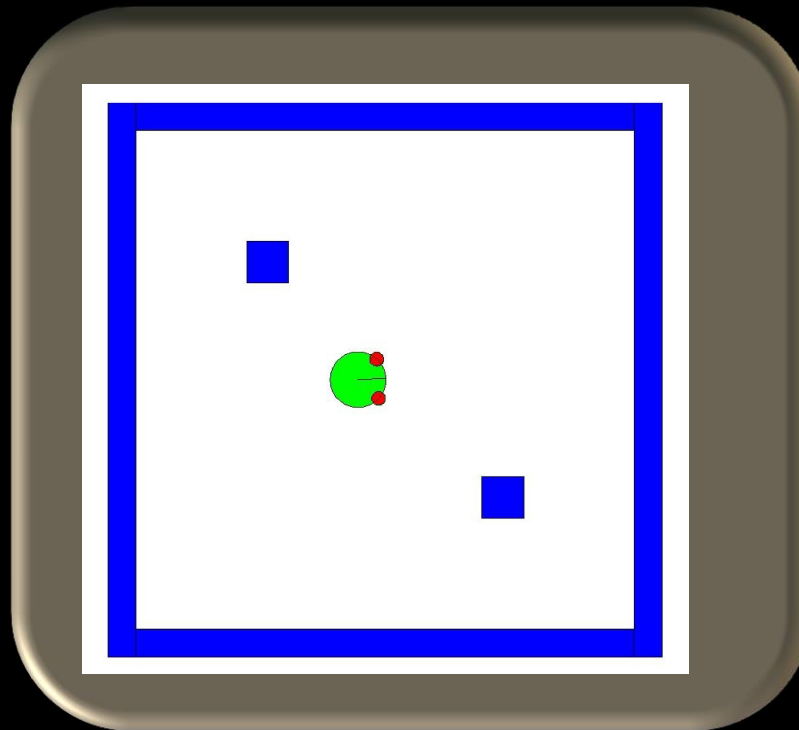
# ARSim

```
142 *****
143 % Main loop:
144 *****
145
146 i=1;
147 while ((i < maxSteps) & (~collided))
148     testRobot.RayBasedSensors = GetRayBasedSensorReadings(testRobot,testArena);
149     if (~isempty(testRobot.Odometer))
150         testRobot.Odometer = GetOdometerReading(testRobot,dt);
151     end
152     if (~isempty(testRobot.Compass))
153         testRobot.Compass = GetCompassReading(testRobot,dt);
154     end
155     testRobot.Brain = BrainStep(testRobot, time);
156     testRobot = MoveRobot(testRobot,dt);
157
158     time = i*dt;
159     if (recordResults)
160         motionResults = AddMotionResults(motionResults,time,testRobot);
161     end
162
163     i = i + 1;
164
165     collided = CheckForCollisions(testArena, testRobot);
166
167     if ((mod(i,plotStep)==0) && showPlot)
168         ShowRobot(plotHandle,testRobot);
169     end
170 end
```

Written by the user.  
Problem-specific!

# Example 1: Wandering

- Simple behavior: Aimless exploration of an arena
- Implemented as a finite-state machine



# Example 1: Wandering

Code listing 5.1: *The CreateBrain function for the wandering example.*

```
1 function b = CreateBrain;
2
3 %% Variables
4 leftMotorSignal = 0;
5 rightMotorSignal = 0;
6 currentState = 0;
7
8 %% Parameters:
9 forwardMotorSignal = 0.5;
10 turnMotorSignal = 0.7;
11 turnProbability = 0.01;
12 stopTurnProbability = 0.03;
13 leftTurnProbability = 0.50;
14
15
16 b = struct('LeftMotorSignal',leftMotorSignal,...
17           'RightMotorSignal',rightMotorSignal,...
18           'CurrentState',currentState,...
19           'ForwardMotorSignal',forwardMotorSignal,...
20           'TurnMotorSignal',turnMotorSignal,...
21           'TurnProbability',turnProbability,...
22           'StopTurnProbability',stopTurnProbability,...
23           'LeftTurnProbability',leftTurnProbability);
```

Set all numerical parameters (related to the robotic brain) here. Do NOT set parameters at many different places (e.g. in BrainStep).

# Example 1: Wandering

Code listing 5.2: *The BrainStep function for the wandering example.*

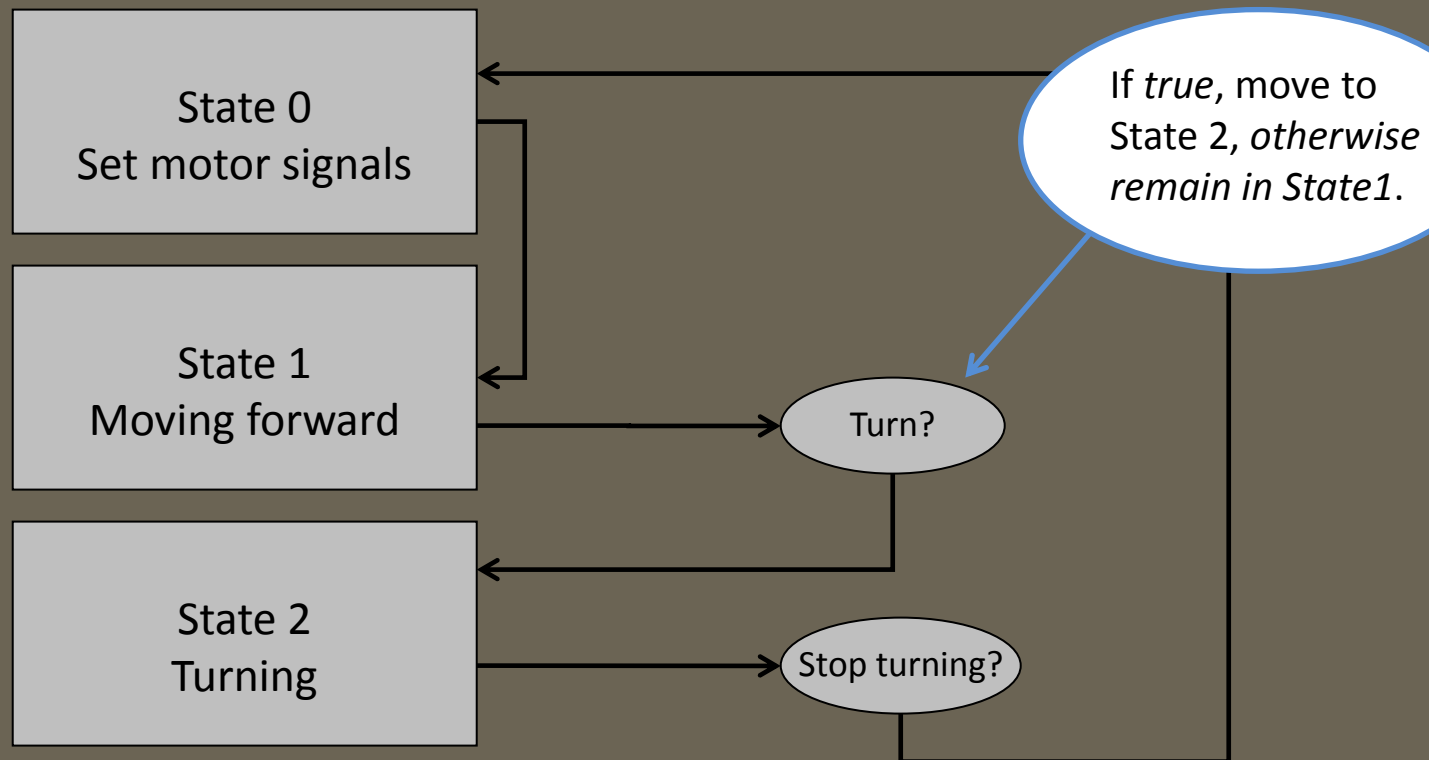
```

1 function b = BrainStep(robot, time);
2
3 b = robot.Brain;
4
5 ##### FSM: #####
6 if (b.CurrentState == 0) % Forward motion
7   b.LeftMotorSignal = b.ForwardMotorSignal;
8   b.RightMotorSignal = b.ForwardMotorSignal;
9   b.CurrentState = 1;
10 elseif (b.CurrentState == 1) % Time to turn?
11   r = rand;
12   if (r < b.TurnProbability)
13     s = rand;
14     if (s < b.LeftTurnProbability)
15       b.LeftMotorSignal = b.TurnMotorSignal;
16       b.RightMotorSignal = -b.TurnMotorSignal;
17     else
18       b.LeftMotorSignal = -b.TurnMotorSignal;
19       b.RightMotorSignal = b.TurnMotorSignal;
20     end
21     b.CurrentState = 2;
22   end
23 elseif (b.CurrentState == 2) % Time to stop turning?
24   r = rand;
25   if (r < b.StopTurnProbability)
26     b.CurrentState = 0;
27   end
28 end

```

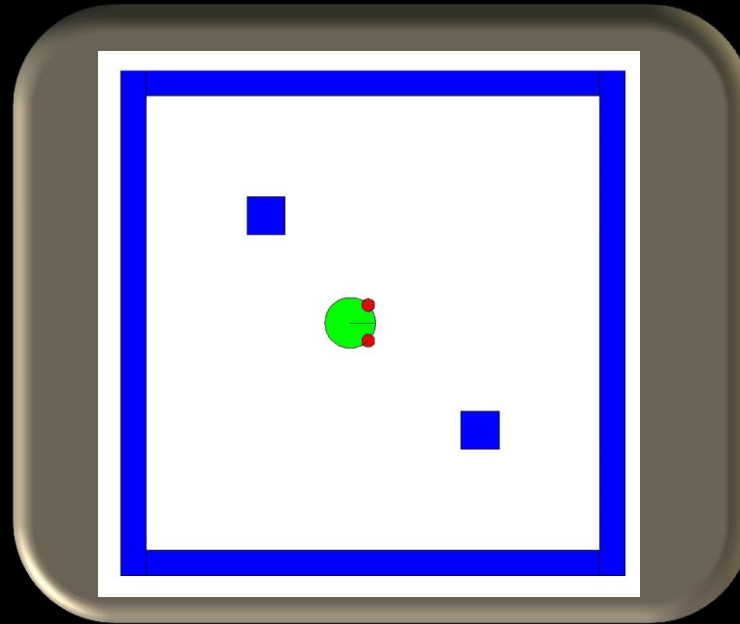


# Example 1: Wandering



## Example 2: Navigation

- Very simple part of (purposeful) navigation:
  - move a given distance, then stop.
- Can easily be generalized (waypoint sequences, turning...)



# Example 2: Navigation

Code listing 5.3: *The CreateBrain function for the navigation example.*

```
1 function b = CreateBrain;
2
3 %% Variables:
4
5 leftMotorSignal = 0;
6 rightMotorSignal = 0;
7 currentState = 0;
8 initialPositionX = 0; % Arbitrary value here - set in state 0.
9 initialPositionY = 0; % Arbitrary value here - set in state 0.
10
11 %% Parameters:
12 desiredMovementDistance = 1;
13 motorSignalConstant = 0.90;
14 atDestinationThreshold = 0.02;
15
16
17 b = struct('LeftMotorSignal',leftMotorSignal,...
18           'RightMotorSignal',rightMotorSignal,...
19           'CurrentState',currentState,...
20           'InitialPositionX',initialPositionX,...
21           'InitialPositionY',initialPositionY,...
22           'DesiredMovementDistance',desiredMovementDistance,...
23           'MotorSignalConstant',motorSignalConstant,...
24           'AtDestinationThreshold',atDestinationThreshold);
```

# Example 2: Navigation

```

1 function b = BrainStep(robot, time);
2
3     b = robot.Brain;
4
5     if (b.CurrentState ~= 0)
6         deltaX = robot.Odometer.EstimatedPosition(1) - b.InitialPositionX;
7         deltaY = robot.Odometer.EstimatedPosition(2) - b.InitialPositionY;
8         distanceTravelled = sqrt(deltaX*deltaX + deltaY*deltaY);
9     end
10
11     %%%%%%%%%%% FSM: %%%%%%%%%%%
12     if (b.CurrentState == 0) % Initialization
13         b.InitialPositionX = robot.Odometer.EstimatedPosition(1);
14         b.InitialPositionY = robot.Odometer.EstimatedPosition(2);
15         b.CurrentState = 1;
16     elseif (b.CurrentState == 1) % Adaptive motion
17         motorSignal = b.MotorSignalConstant*(b.DesiredMovementDistance-distanceTravelled)/...
18             b.DesiredMovementDistance;
19         b.LeftMotorSignal = motorSignal;
20         b.RightMotorSignal = motorSignal;
21         if (abs(b.DesiredMovementDistance - distanceTravelled) < ...
22             b.AtDestinationThreshold*b.DesiredMovementDistance)
23             b.CurrentState = 2;
24             % 'At destination' % Output for debugging
25         end
26     elseif (b.CurrentState == 2) % At destination
27         b.LeftMotorSignal = 0;
28         b.RightMotorSignal = 0;
29     end

```

Computed in every state, except state 0.

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- After this lecture you should be able to
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