

# Autonomous Vehicle Simulation Using Reinforcement Learning (Avoid Obstacles)

BY

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```
load exampleMaps.mat simpleMap
load exampleHelperOfficeAreaMap.mat office_area_map
mapMatrix = simpleMap;
mapScale = 1;
```

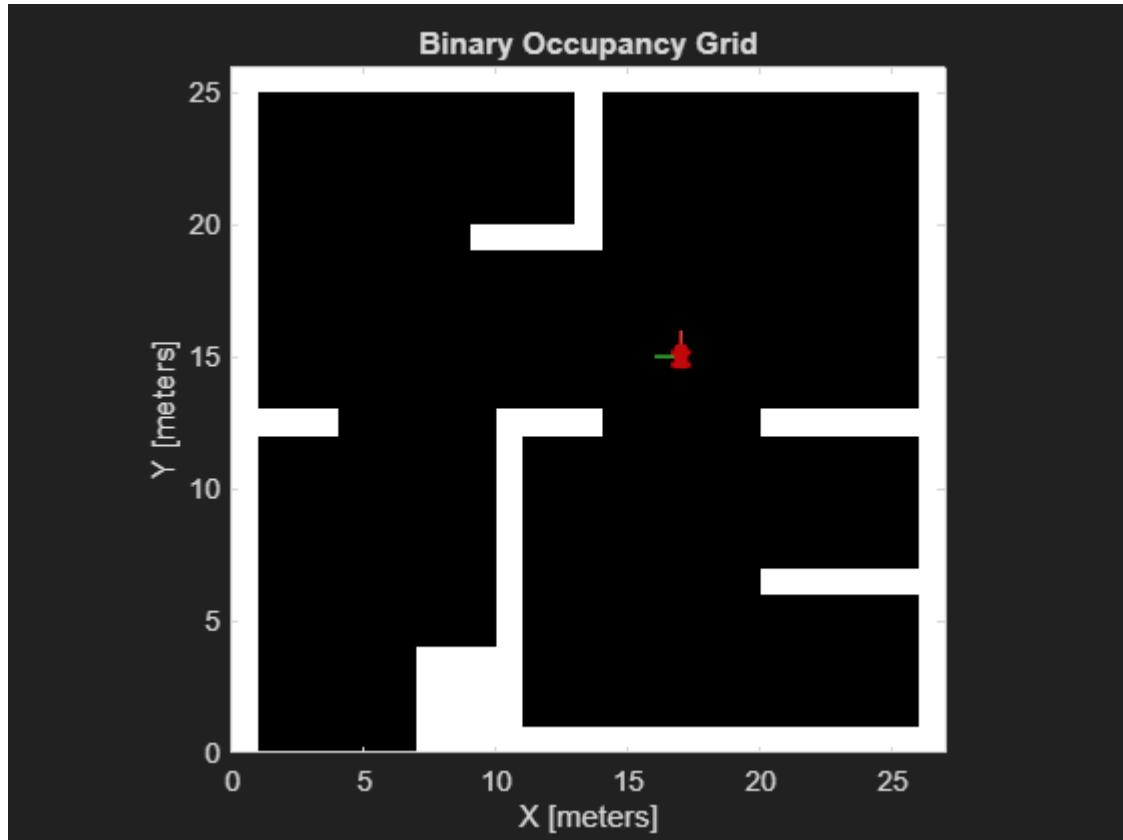
```
scanAngles = -3*pi/8:pi/8:3*pi/8;
maxRange = 12;
lidarNoiseVariance = 0.1^2;
lidarNoiseSeeds = randi(intmax,size(scanAngles));
```

```
% Max speed parameters
maxLinSpeed = 0.3;
maxAngSpeed = 0.3;

% Initial pose of the robot
initX = 17;
initY = 15;
initTheta = pi/2;
```

```
fig = figure("Name","simpleMap");
set(fig, "Visible","on");
ax = axes(fig);

show(binaryOccupancyMap(mapMatrix), "Parent", ax);
hold on
plotTransforms([initX,initY,0],eul2quat([initTheta,0,0]), "MeshFilePath", "groupvehicle.stl", "View", "2D");
light;
hold off
```



```
mdl = "HelperAvoidObstaclesMobileRobot";
Tfinal = 100;
sampleTime = 0.1;

agentBlk = mdl + "/Agent";
```

Open the model.

```
open_system(mdl)
```

```
Unable to find system or file 'HelperAvoidObstaclesMobileRobot'.
```

```
open_system(mdl + "/Environment")
```

```
obsInfo = rlNumericSpec([numel(scanAngles) 1],...
    "LowerLimit",zeros(numel(scanAngles),1),...
    "UpperLimit",ones(numel(scanAngles),1)*maxRange);
numObservations = obsInfo.Dimension(1);
```

```

numActions = 2;
actInfo = rlNumericSpec([numActions 1],...
    "LowerLimit", -1, ...
    "UpperLimit", 1);

```

```

env = rlSimulinkEnv(mdl, agentBlk, obsInfo, actInfo);
env.ResetFcn =
@(in) EHelperRLAvoidObstaclesResetFcn(in, scanAngles, maxRange, mapMatrix);
env.UseFastRestart = "Off";

```

```

statePath = [
    featureInputLayer(numObservations, "Normalization", "none", "Name", "State")
    fullyConnectedLayer(50, "Name", "CriticStateFC1")
    reluLayer("Name", "CriticRelu1")
    fullyConnectedLayer(25, "Name", "CriticStateFC2")];
actionPath = [
    featureInputLayer(numActions, "Normalization", "none", "Name", "Action")
    fullyConnectedLayer(25, "Name", "CriticActionFC1")];
commonPath = [
    additionLayer(2, "Name", "add")
    reluLayer("Name", "CriticCommonRelu")
    fullyConnectedLayer(1, "Name", "CriticOutput")];

criticNetwork = layerGraph();
criticNetwork = addLayers(criticNetwork, statePath);
criticNetwork = addLayers(criticNetwork, actionPath);
criticNetwork = addLayers(criticNetwork, commonPath);
criticNetwork = connectLayers(criticNetwork, "CriticStateFC2", "add/in1");
criticNetwork = connectLayers(criticNetwork, "CriticActionFC1", "add/in2");
criticNetwork = dlnetwork(criticNetwork);

```

```

criticOptions =
rlOptimizerOptions("LearnRate", 1e-3, "L2RegularizationFactor", 1e-4, "GradientThreshold", 1);
critic =
rlQValueFunction(criticNetwork, obsInfo, actInfo, "ObservationInputNames", "State"
    , "ActionInputNames", "Action");
actorNetwork = [
    featureInputLayer(numObservations, "Normalization", "none", "Name", "State")
    fullyConnectedLayer(50, "Name", "actorFC1")
    reluLayer("Name", "actorReLU1")]

```

```

fullyConnectedLayer(50, "Name", "actorFC2")
reluLayer("Name", "actorReLU2")
fullyConnectedLayer(2, "Name", "actorFC3")
tanhLayer("Name", "Action")];
actorNetwork = dlnetwork(actorNetwork);

actorOptions =
rlOptimizerOptions("LearnRate", 1e-4, "L2RegularizationFactor", 1e-4, "GradientThreshold", 1);
actor = rlContinuousDeterministicActor(actorNetwork, obsInfo, actInfo);

```

```

agentOpts = rlDDPGAgentOptions(
    "SampleTime", sampleTime, ...
    "ActorOptimizerOptions", actorOptions, ...
    "CriticOptimizerOptions", criticOptions, ...
    "DiscountFactor", 0.995, ...
    "MiniBatchSize", 128, ...
    "ExperienceBufferLength", 1e6);

agentOpts.NoiseOptions.Variance = 0.1;
agentOpts.NoiseOptions.VarianceDecayRate = 1e-5;

```

```

obstacleAvoidanceAgent = rlDDPGAgent(actor, critic, agentOpts);
open_system(mdl + "/Agent")

```

```

maxEpisodes = 10000;
maxSteps = ceil(Tfinal/sampleTime);
trainOpts = rlTrainingOptions(
    "MaxEpisodes", maxEpisodes, ...
    "MaxStepsPerEpisode", maxSteps, ...
    "ScoreAveragingWindowLength", 50, ...
    "StopTrainingCriteria", "AverageReward", ...
    "StopTrainingValue", 400, ...
    "Verbose", true, ...
    "Plots", "training-progress");

```

```

doTraining = false; % Toggle this to true for training.

if doTraining

```

```

% Train the agent.
trainingStats = train(obstacleAvoidanceAgent,env,trainOpts);
else
    % Load pretrained agent for the example.
    load HelperAvoidObstaclesAgent obstacleAvoidanceAgent
end

```

```

set_param("HelperAvoidObstaclesMobileRobot","StopTime","200");
out = sim("HelperAvoidObstaclesMobileRobot.slx");

```

```

for i = 1:5:size(out.range,3)
    u = out.pose(i,:);
    r = out.range(:,:,i);
    HelperAvoidObstaclesPosePlot(u,mapMatrix,mapScale,r,scanAngles,ax);
end

```

```

mapMatrix = office_area_map.occupancyMatrix > 0.5;
mapScale = 10;
initX = 20;
initY = 30;
initTheta = 0;
fig = figure("Name","office_area_map");
set(fig,"Visible","on");
ax = axes(fig);
show(binaryOccupancyMap(mapMatrix,mapScale),"Parent",ax);
hold on
plotTransforms([initX,initY,0],eul2quat([initTheta, 0, 0]),"MeshFilePath","groundvehicle.stl","View","2D");
light;
hold off
out = sim("HelperAvoidObstaclesMobileRobot.slx");
set_param("HelperAvoidObstaclesMobileRobot","StopTime","inf");

```

## Visualize

```

for i = 1:5:size(out.range,3)
    u = out.pose(i,:);
    r = out.range(:,:,i);
    HelperAvoidObstaclesPosePlot(u,mapMatrix,mapScale,r,scanAngles,ax);
end

```