

# CPE 485 - Autonomous Mobile Robots

## Final Exam

Winter Quarter, 2011

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**Duration:** 2 hours  
**Total Marks:** 70  
**Closed Book**

**Start Time:**

**End Time:**

**By signing this exam, I agree to not discuss this exam with any other classmates until after Monday March 14, 2011. I also agree to use a maximum of 2 continuous hours to write the exam.**

**Name:**

**Signature:**

**Multiple-Choice – 2 marks awarded for each correct answer, 1 mark deducted for each incorrect answer, 0 marks if no answer. Circle the answer that BEST completes the sentence.**

1. Different types of robot locomotion include
  - a) Sliding.
  - b) Rolling.
  - c) Flying.
  - d) All of the above.
  
2. In Proportional feedback control, adjusting the gain  $K$ 
  - a) Will always reduce the error.
  - b) Can lead to unstable behavior in the system being controlled.
  - c) By decreasing it will always decrease the error more quickly.
  - d) All of the above.
  
3. Markov localization, the Markovian assumption is made which assumes that
  - a) The probability that a robot's state estimate equals the actual robot state is maximized.
  - b) The current state is only dependent on the previous state, and not the entire history of states.
  - c) Only current sensor measurements are required for accurate localization.
  - d) None of the above.
  
4. Particle Filtering should be used instead of Kalman Filtering
  - a) When 100000 particles minimum are needed.
  - b) When the initial robot position is unknown.
  - c) When the robot is operating in an environment without any locations that produce identical sensor measurements.
  - d) None of the above
  
5. A motion planning algorithm will be good for many applications if
  - a) The algorithm is slow and a sub-optimal.
  - b) It is not complete.
  - c) It might not create a feasible trajectory.
  - d) None of the above
  
6. A robot will have better localization capabilities if it uses encoder measurements instead of control inputs in the prediction step because:
  - a) Encoders have no errors.
  - b) Encoders always model slipping perfectly.
  - c) The model that calculates wheel motion from the control inputs is not perfect.
  - d) All of the above

7. Markov Localization can be used instead of Particle Filter localization when:
- a) The environment is large enough.
  - b) There are only 10 possible values for each of the 3 degrees of freedom of the state vector.
  - c) The sensor model is unknown.
  - d) All of the above
8. If a robot localized itself using a particle filter with 5 particles, but had no knowledge of its start location,
- a) The localization algorithm could run slowly because it uses so many particles.
  - b) The localization algorithm would perform extremely well because it has 5 particles and therefore 5 estimates of the state instead of one.
  - c) All 5 particles would go through a prediction step.
  - d) None of the above.
9. The X80 is equipped with:
- a) No active sensors
  - b) No passive sensors.
  - c) All active sensors.
  - d) None of the above.
10. If automobiles were build with 4 swedish wheels,
- a) The automobile would be able to move sideways.
  - b) Parallel parking would be much easier.
  - c) We would have trouble driving quickly on curved roads.
  - d) All of the above

**Question 11:** (10 marks)

- a. Write the pseudo code for a single-query Probabilistic Road Map motion planning algorithm.
- b. How can “clustering” occur when randomly selecting new nodes for expansion.
- c. Describe an algorithm to avoid clustering.
- d. Describe how iterative collision checking may be accomplished. Use a diagram.
- e. What is probabilistic completeness?

**Question 12: (10 marks)**

The range sensors used on the X80 must be useful sensors but must be used with care. Answer the following questions regarding these sensors

- a) Explain the basic principles on how the ultrasonic range sensor works in 4 sentences or less. Be sure to use a diagram, labeling variables on the diagram. Give the equation used to calculate range.
- b) Explain the basic principles on how the IR range sensor works in 4 sentences or less. Be sure to use a diagram, labeling variables on the diagram. Give the equation used to calculate range.

**Question 13: (10 marks)**

An Autonomous Underwater Vehicle can surface to receive GPS measurements  $x$ ,  $y$  and  $z_{GPS}$  with measurement standard deviation  $(\sigma_x \sigma_y \sigma_z)$ . The GPS sampling rate is 1 Hz. While underwater, the AUV uses a Doppler Velocimetry Log (DVL) that measure forward speed  $v$ , (with standard deviation  $\sigma_v$ ) and a compass measurement  $z_\theta$  (with standard deviation  $\sigma_\theta$ ) to estimate its state. A particle filter is used to fuse these two measurements to produce the state estimates of  $[x \ y \ \theta]$ . The depth of the AUV is considered known using a highly accurate pressure sensor.

- a) What is a particle?
- b) Provide an outline of the PF algorithm
- c) Explain using mathematical equations how the prediction step in the algorithm could use the compass and speed measurements. Assume the DVL and compass have a sampling rate of 30 Hz.
- d) Explain which step in the algorithm would use the GPS measurements. How would they be used? Assume the AUV will surface every 5 minutes.

**Question 14:** (10 marks)

A particle filter is used to localize a differential-drive robot within an indoor environment. The robot's state is defined by  $[x\ y\ \theta]$ .

- a) Consider the 3 particles below, determine the robot's position  $[x\ y]$ .

$x\ (m)$	$y\ (m)$	$\theta\ (rad)$	$W$
5.4	7.5	0.31	0.399
5.2	7.7	0.28	0.399
1.1	4.4	0.99	0.002

- b) Consider the 3 particles below, determine the robot's orientation  $[\theta]$ . You can assume that  $\pi = 3.14$ .

$x\ (m)$	$y\ (m)$	$\theta\ (rad)$	$w$
5.4	7.7	3.13	0.333
5.2	7.7	-3.10	0.333
5.5	7.6	3.11	0.333

- c) While conducting localization with the X80 in lab, comparing an actual measurement of 40cm with a particle's expected measurement of 41cm, could produce the same weight as when comparing an actual measurement of 70cm with a particle's expected measurement of 69cm.

Explain why this is a problem in 2 or fewer sentences.

- d) Why might it be a good idea to only resample particles when moving?  
Explain in 2 or fewer sentences.

**Question 15:** (10 marks)

In the file storage floor of a law firm, an autonomous robot is used to move boxes of files. For correct operation, the robot must be able to know within which of 4 rooms it is located.

To accomplish this, the robot is equipped with wheel encoders which measure the right and left wheel rotations ( $\varphi_r, \varphi_l$ ), and a laser scanner that outputs a set of range measurements ( $z_t$ ).

From experiments, the probability of being in a particular room has been determined, given it is known which room it was previously in, as well as the robot's odometry. More specifically, we know the probability functions:

$$\begin{aligned} p(l_t=1 \mid \varphi_r, \varphi_l, l_{t-1}=1) &= f_{11} \\ p(l_t=1 \mid \varphi_r, \varphi_l, l_{t-1}=2) &= f_{21} \\ p(l_t=1 \mid \varphi_r, \varphi_l, l_{t-1}=3) &= f_{31} \\ p(l_t=1 \mid \varphi_r, \varphi_l, l_{t-1}=4) &= f_{41} \\ p(l_t=2 \mid \varphi_r, \varphi_l, l_{t-1}=1) &= f_{12} \\ p(l_t=2 \mid \varphi_r, \varphi_l, l_{t-1}=2) &= f_{22} \\ p(l_t=2 \mid \varphi_r, \varphi_l, l_{t-1}=3) &= f_{32} \\ &\dots \\ p(l_t=4 \mid \varphi_r, \varphi_l, l_{t-1}=4) &= f_{44} \end{aligned}$$

Markov localization will be used determine which room the robot is residing in.

- a. Design a prediction step that determines the probability of being in each room. That is, give the equations for  $p(l_t' = 1)$ ,  $p(l_t' = 2)$ ,  $p(l_t' = 3)$ , and  $p(l_t' = 4)$ .
- b. Design a correction step for the algorithm. That is, give the equations for  $p(l_t = 1)$ ,  $p(l_t = 2)$ ,  $p(l_t = 3)$ , and  $p(l_t = 4)$ . State any assumptions necessary.



**Some Equations that might be useful:**

$$d = c t / 2$$

$$\lambda = c/f$$

$$D = fl/x$$

$$p(A \wedge B) = p(A | B) p(B)$$

$$E[X_1 X_2] = E[X_1] E[X_2]$$

$$\Delta\theta = (\Delta s_{right} - \Delta s_{left}) / b$$

$$\Delta s = (\Delta s_{right} + \Delta s_{left}) / 2$$

$$p(x_t | o_t) = \sum_{x'} p(x_t | x'_{t-1}, o_t) p(x'_{t-1})$$

$$p(x_t | z_t) = \frac{p(z_t | x_t) p(x_t)}{p(z_t)}$$

$$x = \frac{b(x_l + x_r)/2}{(x_l - x_r)}$$

$$y = \frac{b(y_l + y_r)/2}{(x_l - x_r)}$$

$$z = bf/(x_l - x_r)$$

$$p(x'_{i,t}) = \sum p(x_{i,t} | x_{j,t-1}, o_t) p(x_{j,t-1})$$