

# Homework

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## Question1

### Assumption

Assume  $x = \begin{bmatrix} d \\ \theta \end{bmatrix}$ , accordingly  $x_t = \begin{bmatrix} d_t \\ \theta_t \end{bmatrix}$

### State Space

d range from 0 to 0.5m, divided in to 200 units

Theta range from 0 to 360 degree, divided into 180 units

The State space have  $180 \times 200$  grids

### Initial Value

$$Bel(\theta_0 = 0, d = 0) = \frac{1}{180 \times 200}$$

$$Bel(\theta_0 = \frac{2\pi}{180} \times 1, d = \frac{0.5}{200}) = \frac{1}{180 \times 200}$$

...

$$Bel(\theta_0 = \frac{2\pi}{180} \times 180, d = \frac{0.5}{200} \times 200) = \frac{1}{180 \times 200}$$

### Prediction step

for  $\theta$

$$\overline{bel(\theta_{t+0.2})} = bel(\theta_t)$$

,where  $bel(\theta_{t+0.2})$  and  $bel(\theta_t)$  is  $360 \times 1$  matrix

$\overline{bel(\theta_{t+0.2})}$  remain the same after curve

for  $d$

$$\overline{bel(d_{t+0.2})} = bel(d_t)$$

### Update Step

$$\overline{bel(X_{t+0.2})} = p(z_t | X_t) bel(X_t) = p(z_t | d_t, \theta_t) bel(X_t)$$

$$\text{,where } p(z_t | d_t, \theta_t) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{1}{2} \frac{(z_t^k - d_{t+0.2})^2}{\sigma^2}}$$

$$\sigma = 0.2$$

$$\text{,among which } \Delta\theta = \frac{1m / s \times 0.2s}{0.5m} = 0.4 \text{radian}$$

$$d_{t+0.2} = r \cos(\theta_t + \Delta\theta) - r \cos(\theta_t)$$

Beam function reference: *ProbabilisticRobotics* Page 125-126, (a)Gaussian distribution related

In practice, the values measured by the range sensor are limited to the interval  $[0; z_{\max}]$ , where  $z_{\max}$  denotes the maximum sensor range. Thus, the measurement probability is given by

$$p_{\text{hit}}(z_t^k | x_t, m) = \begin{cases} \eta \mathcal{N}(z_t^k; z_t^{k*}, \sigma_{\text{hit}}^2) & \text{if } 0 \leq z_t^k \leq z_{\max} \\ 0 & \text{otherwise} \end{cases} \quad (6.4)$$

where  $z_t^{k*}$  is calculated from  $x_t$  and  $m$  via ray tracing, and  $\mathcal{N}(z_t^k; z_t^{k*}, \sigma_{\text{hit}}^2)$  denotes the univariate normal distribution with mean  $z_t^{k*}$  and variance  $\sigma_{\text{hit}}^2$ :

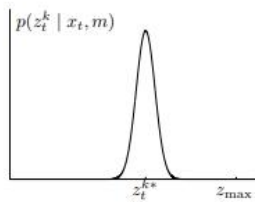
$$\mathcal{N}(z_t^k; z_t^{k*}, \sigma_{\text{hit}}^2) = \frac{1}{\sqrt{2\pi\sigma_{\text{hit}}^2}} e^{-\frac{1}{2} \frac{(z_t^k - z_t^{k*})^2}{\sigma_{\text{hit}}^2}} \quad (6.5)$$

The normalizer  $\eta$  evaluates to

$$\eta = \left( \int_0^{z_{\max}} \mathcal{N}(z_t^k; z_t^{k*}, \sigma_{\text{hit}}^2) dz_t^k \right)^{-1} \quad (6.6)$$

The variance  $\sigma_{\text{hit}}$  is an intrinsic noise parameter of the measurement model. Below we will discuss strategies for setting this parameter.

(a) Gaussian distribution  $p_{\text{hit}}$



## Result

- Plot the estimate at those 6 time-steps

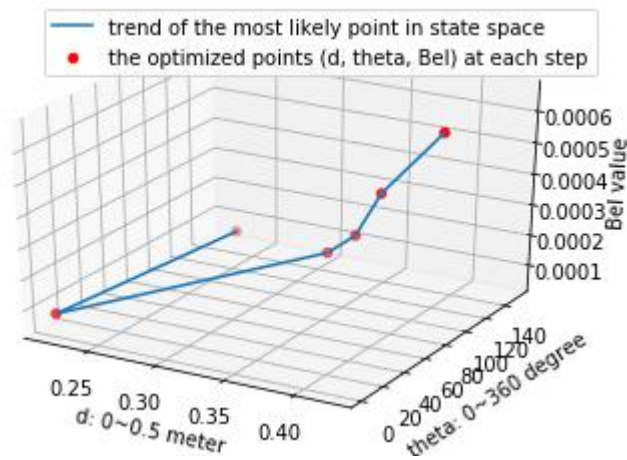


Fig1 3d plot of each optimized point at each step

Axis-x represents for the distance from the point to the wall. (unit: meter)

Axis-y represents for the angle.(unit: degree)

Axis-z represents for the distance from the point to the wall. (unit: meter)

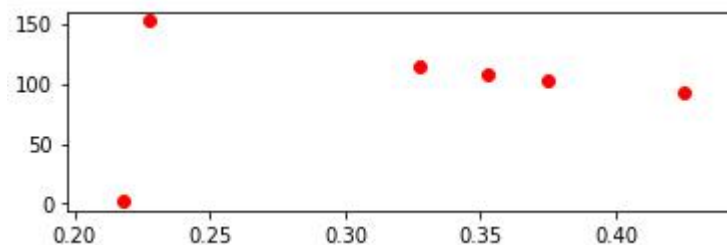


Fig2 2d plot of each optimized point at each step

|              |                         |                      |   |
|--------------|-------------------------|----------------------|---|
| Step1        | distance = 0.2275       | degree = 152.        | Bel_value = 5.5408650043099036e-05        |
| Step2        | distance = 0.2175       | degree = 2.          | Bel_value = 8.339012147323719e-05         |
| Step3        | distance = 0.3275       | degree = 114.        | Bel_value = 0.0001458040047563614         |
| Step4        | distance = 0.3525       | degree = 108.        | Bel_value = 0.00023685848635039           |
| <u>Step5</u> | <u>distance = 0.375</u> | <u>degree = 102.</u> | <u>Bel_value = 0.00040340493973957907</u> |
| Step6        | distance = 0.425        | degree = 92.         | Bel_value = 0.0006512483741328149         |

- What is the most likely states at time =1

Time=1 means the 5<sup>th</sup> step above.

Underlined stuff demonstrate the state of optimized point at time=0

After

The most likely states is:

$d = 0.0776\text{m}$

Theta = 216.60 degree

## Question2

Beam function change