

Mobile robot short Project

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Link: <https://drive.matlab.com/sharing/49eb5fa6-0641-425c-a130-9cf41b2e1058>

Link Videos: <https://drive.google.com/drive/folders/12hRJl6bwnyQormSw4NueEOiBiISbIFel?usp=sharing>

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```
clear
close all
clf
```

Given the known workspace: Sensors_Data.mat, Laser_Data_CV__d_b.mat and Enviroment.png

Answer the following question:

Pose estimation (10%)

Base on the Simulink model EKF_Pose_estimation.slx

(1) Implement in this mlx file:

```
load('Sensors_Data.mat')
load('Encoder_Data.mat')
load('Laser_Data_CV__d_b.mat')
```

a) Pose_theoric, asumme no noise.

```
L_speed = left_angular_speed; L_speed(:,2) = L_speed(:,2) .* r_w ./ 100;
R_speed = right_angular_speed; R_speed(:,2) = R_speed(:,2) .* r_w ./ 100;
```

```

L_displ = L_speed; L_displ(:,2) = L_displ(:,2) .* Ts;
R_displ = R_speed; R_displ(:,2) = R_displ(:,2) .* Ts;

S = 0.26;
delta_d = (L_displ(:,2) + R_displ(:,2)) / 2;
delta_th = (R_displ(:,2) - L_displ(:,2)) / (2*S);

tx = 8.65; ty = 17.2; alpha = -pi/2;
Pose_theoric(:,1) = transl(tx,ty,0) * trotz(alpha); % initial pose
for i = 2:length(delta_th)
    Pose_theoric(:,i) = Pose_theoric(:,i-1) * transl(delta_d(i-1),0,0) * trotz(delta_th(i-1));
    Position_theoric(:,i) = transl(Pose_theoric(:,i-1));
    Orientation_theoric(:,i) = tr2rpy(Pose_theoric(:,i-1));
end

```

b) Pose_estimation by adding noise in odometry.

```

ProcNoiseD = 0.025^2; % testing with some values to have more difference between theoretic and noisy
ProcNoiseTheta = 0.009^2; % testing with some values to have more difference between theoretic and noisy

V = ...
    [ ProcNoiseD  0; ...
      0          ProcNoiseTheta];

noised = rand*V(1,1);
noiseTheta = rand*V(2,2);

Position_estimation(:,1) = zeros(size(Position_theoric(:,1)));
Position_estimation(:,2) = Position_theoric(:,2);

Orientation_estimation = zeros(3004,1);
Orientation_estimation(2) = Orientation_theoric(3,2);

for i=3:length(delta_th)
    Position_estimation(1,i) = Position_estimation(1,i-1) + (delta_d(i)+noised)*cos(Orientation_theoric(3,i-1));
    Position_estimation(2,i) = Position_estimation(2,i-1) + (delta_d(i)+noised)*sin(Orientation_theoric(3,i-1));
    Orientation_estimation(i) = mod(Orientation_estimation(i-1) + delta_th(i) + noiseTheta, 2*pi);
end

```

c) Ricatti equation for estimating the covariance matrix representing the uncertainty in the robot pose.

```

% Calculating the Jacobians

F_x = zeros([3,3,3004]);
F_x(1,1,:) = 1; F_x(2,2,:) = 1; F_x(3,3,:) = 1;
F_x(1,3,:) = -delta_d .* sin(Orientation_theoric(3,:))';
F_x(2,3,:) = delta_d .* cos(Orientation_theoric(3,:))';

F_v = zeros([3 2 3004]);
F_v(3,2,:) = 1;
F_v(1,1,:) = cos(Orientation_theoric(3,:))';
F_v(2,1,:) = sin(Orientation_theoric(3,:))';

Pk1 = zeros([3 3 3004]);

```

```

Pk1(:, :, 1) = eye(3) * 0.0001;

for i=2:3004
    Pk1(:, :, i) = F_x(:, :, i)*Pk1(:, :, i-1)*F_x(:, :, i)' + F_v(:, :, i)*[V(1) 0; 0 V(2)]*F_v(:, :, i)';
end

```

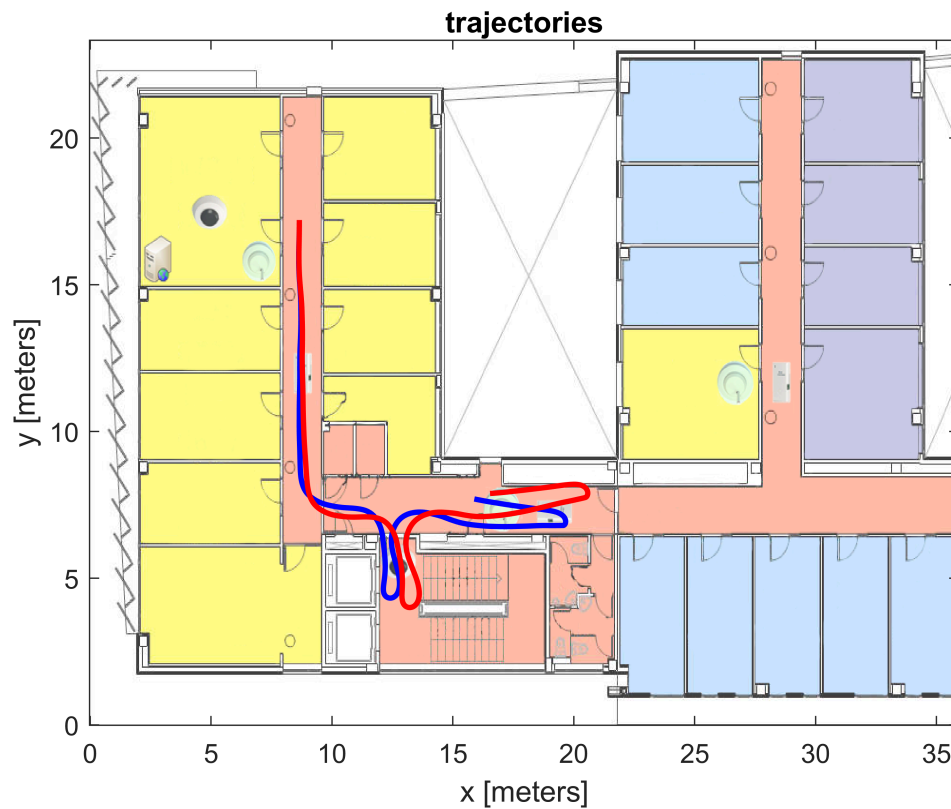
(2) Display in a figure

a) x,y poses for both trajectories: theoretic and estimated

```

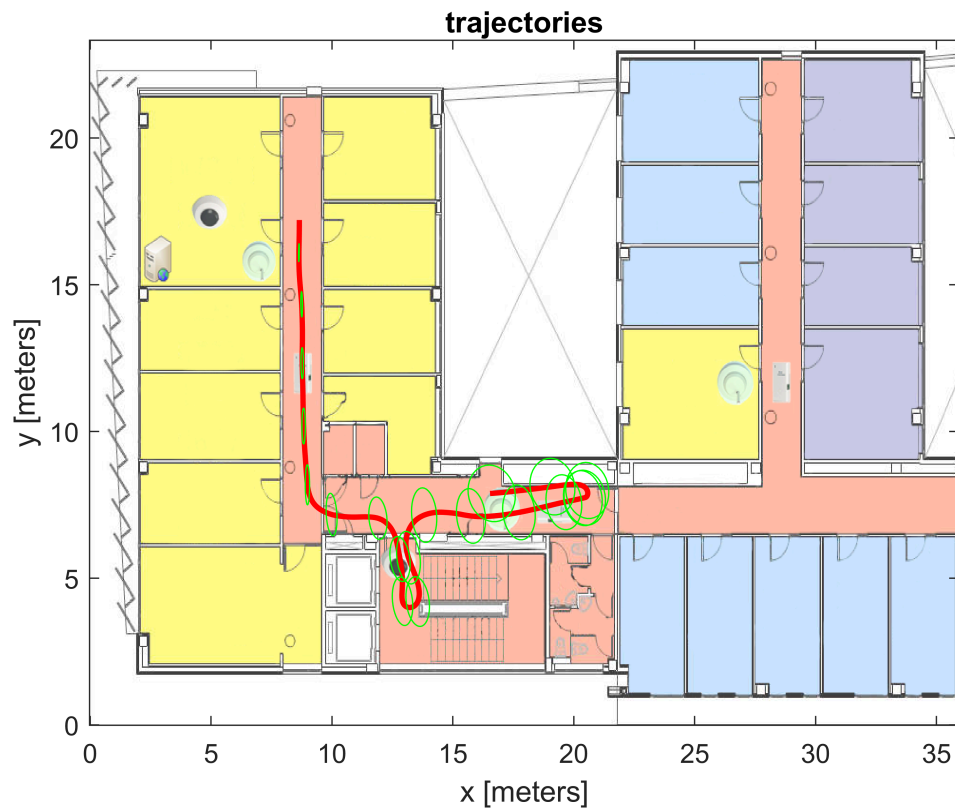
I=imread('Enviroment.png');
x_ima=[0 35.9];
y_ima=[23.31 0];
image(I, 'XData', x_ima, 'YData', y_ima, "AlphaData", 0.75);
axis xy
hold on
    plot( ...
        Position_theoric(1,2:end), ...
        Position_theoric(2,2:end), ...
        'k', ...
        'Color', 'b', ...
        "LineWidth", 2 ...
    )
title('trajectories'); xlabel ('x [meters]'); ylabel ('y [meters]')
plot( ...
    Position_estimation(1,2:end), ...
    Position_estimation(2,2:end), ...
    'k', ...
    'Color', 'r', ...
    "LineWidth", 2 ...
)
hold off

```

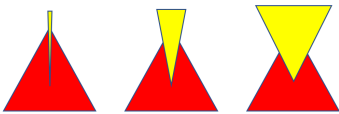


b) ellipses representing x,y uncertainty. don't do it for all poses (every 15-20 poses could be nice).

```
image(I, 'XData', x_ima, 'YData', y_ima, "AlphaData", 0.75);
axis xy
hold on
plot( ...
    Position_estimation(1,2:end), ...
    Position_estimation(2,2:end), ...
    'k', ...
    'Color', 'r', ...
    "LineWidth", 2 ...
)
title('trajectories'); xlabel ('x [meters]'); ylabel ('y [meters]')
for i=1:length(delta_th)
    if (mod(i,150)==0)
        plot_ellipse( ...
            Pk1(1:2,1:2,i), ...
            [Position_estimation(1,i), Position_estimation(2,i)], ...
            'g'...
        );
    end
end
hold off
```



c) represent uncertainty in orientation by adding a isosceles triangle in front of the robot the base



The robot will be represented by a triangle: Robot= [0 -0.2 0 1;0.4 0 0 1;0 0.2 0 1]

Record a movie of the robot moving along the corridor displaying both trajectories.

See: help VideoWriter to get familiar with the matlab functions

```
Robot= [ ...
    0 -0.2 0 1; ...
    0.4 0 0 1; ...
    0 0.2 0 1 ...
]';
Laser_Range=3.9; % meters
w=linspace(-30*pi/180,210*pi/180,20); %Laser foot print
s_x=Laser_Range*sin(w); s_y=Laser_Range*cos(w);
Lfp.v=[[s_x 0];[s_y 0]]';
Lfp.f= [1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 1];
r_patch=[];s_patch=[];
speed = 5;

Robot_video = VideoWriter('Robot_Video.avi');
Robot_video.FrameRate = 45;
Robot_video.Quality = 100;
```

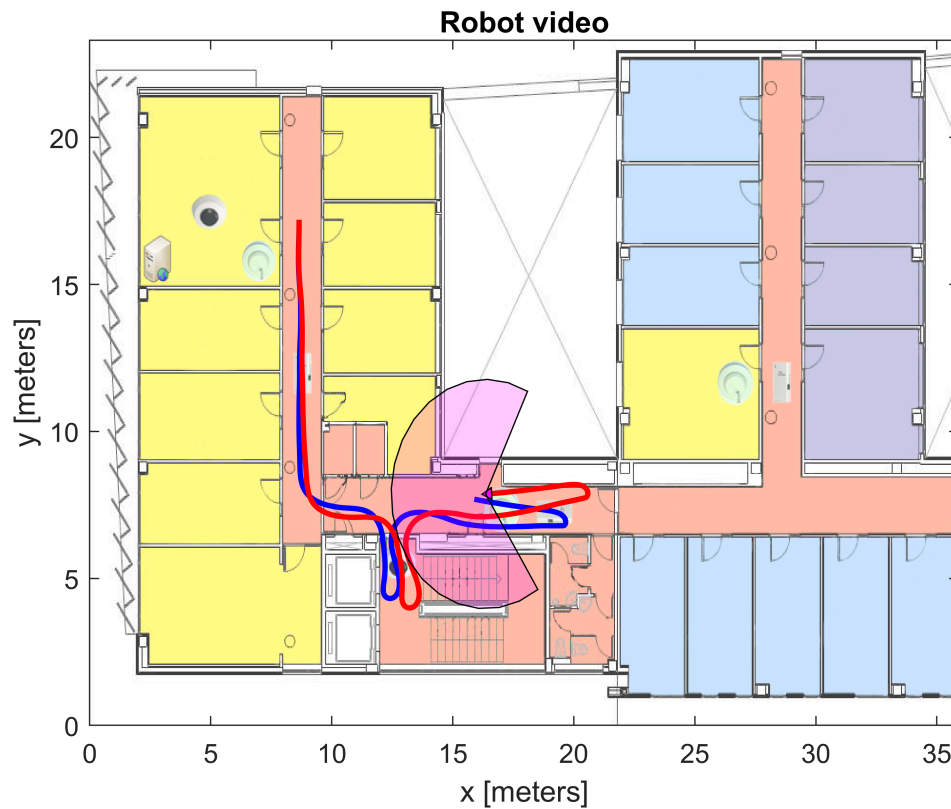
```

open(Robot_video);
image(I, 'XData', x_ima, 'YData', y_ima, "AlphaData", 0.75);
axis xy
hold on
    plot( ...
        Position_theoric(1,2:end), ...
        Position_theoric(2,2:end), ...
        'k', ...
        'Color', 'b', ...
        "LineWidth", 2 ...
    )
title('Robot video'); xlabel ('x [meters]'); ylabel ('y [meters]')
plot( ...
    Position_estimation(1,2:end), ...
    Position_estimation(2,2:end), ...
    'k', ...
    'Color', 'r', ...
    "LineWidth", 2 ...
)

for i=2:length(delta_th)
    k_m=mod(i,speed);
    if k_m==0
        delete(r_patch);
        delete(s_patch);
        Robot_pose=transl(Position_estimation(1,i),Position_estimation(2,i),0)*trotz(Orient
        Robot_tr=Robot_pose*Robot; % moving the robot
        Laser_fp=Robot_pose*transl(0.25,0,0)*[Lfp.v zeros(21,1) ones(21,1)'];
        axis([0 35.9 0 23.31]);
        r_patch = patch(Robot_tr(1,:), Robot_tr(2,:), 'm');
        s_patch = patch('Faces', Lfp.f, 'Vertices', Laser_fp(1:2,:), 'FaceColor', 'm', 'FaceAlpha
        %pause(0.01);

        frame=getframe(gcf);
        writeVideo(Robot_video, frame);
    end
end
hold off

```



```
close(Robot_video)
```

Laser data (10%)

Make a movie of laser data in Robot reference frame.

```
Ts_laser=0.4;
laser_data = polar_laser_data(:,2:683) / 1000;

n_data_by_sampling = size(laser_data,2);
n_sampling = size(laser_data,1);

plotted_barrier = [];
Laser_video = VideoWriter('Laser_Data_Video.avi');
Laser_video.FrameRate = 10;
Laser_video.Quality = 100;
open(Laser_video);
laser_points_L=[];
laser_points_R=[];
figure
hold on
title("Movie of laser data in Robot reference frame", 'FontSize',15);
axis([-4 4 -1 5]);
xlabel('X[meters]');ylabel('Y[meters]');

ang_res = 0.3515;
ang = [1:length(laser_data)]*ang_res - 30;
ang = ang * pi/180;
```

```

[x,y] = pol2cart(ang,laser_data);
T_R_L = transl(0.6,0,0)*trotz(deg2rad(-90));

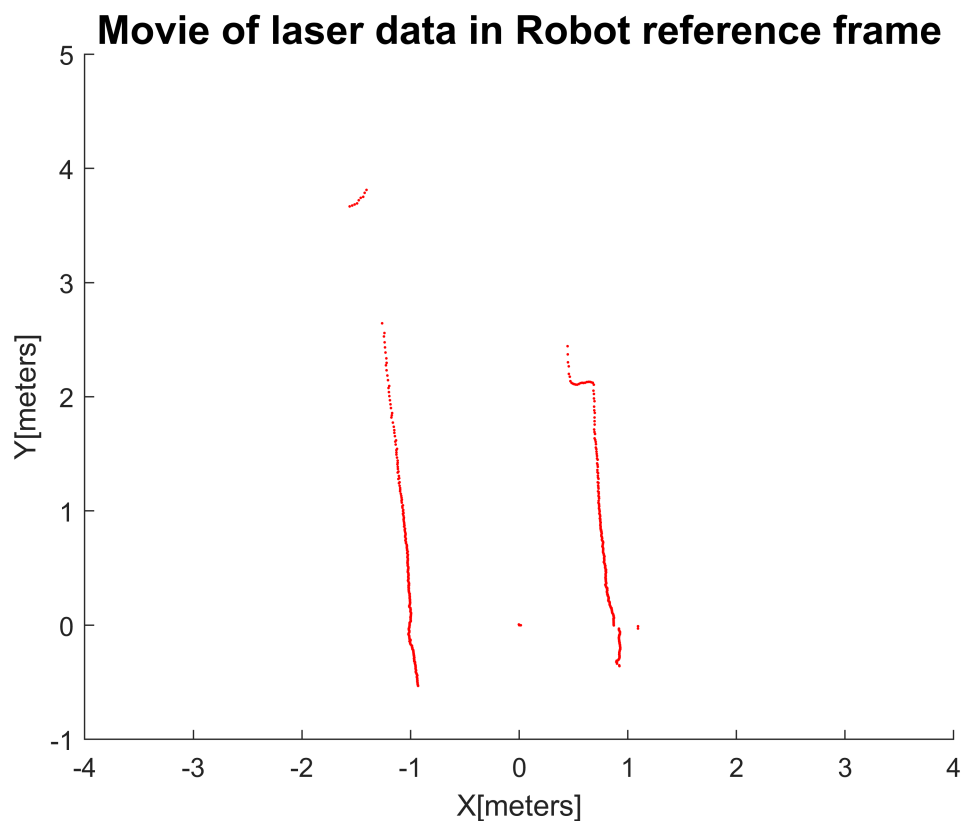
for i = 1:n_sampling
    delete(ploted_barrier);

    laser_points_R(1,:,i) = x(i,:);
    laser_points_R(2,:,i) = y(i,:);
    laser_points_R(3,:,i) = zeros(1,n_data_by_sampling);
    laser_points_R(4,:,i) = ones(1,n_data_by_sampling);

    plotted_barrier=scatter( ...
        laser_points_R(1,:,i), ...
        laser_points_R(2,:,i), ...
        1, ...
        'red', ...
        'filled' ...
    );

    frame=getframe(gcf);
    writeVideo(Laser_video,frame);
end
hold off

```



```
close(Laser_video)
```


Localization (40%)

Localize the Robot by using the Similarity Transform.

There are two assumptions :

(1) No correction of the trajectory is done.

1.- Make a 'log' with the following columns: time stamp, estimated noisy pose, corrected position, number of Land-marks, and the errors.

2.- Display in a figure: the map, the noisy trajectory with a visible 'mark' of the corrected position when Land-Mark are available.

```
landmarks = [...  
    7.934 16.431 0 1;...  
    9.583 16.431 0 1;...  
    9.584 13.444 0 1;...  
    9.584 10.461 0 1;...  
    7.973 10.534 0 1;...  
    7.934 7.547 0 1;...  
    9.584 6.654 0 1;...  
    13.001 6.525 0 1;...  
    17.007 8.136 0 1 ...  
]';  
  
Detected_landmarks = [];  
Reference_landmarks = [];  
Log_no_correction = [];  
  
image(I, 'XData', x_ima, 'YData', y_ima, "AlphaData", 0.75);  
axis xy  
hold on  
  
plot( ...  
    Position_theoric(1,2:end), ...  
    Position_theoric(2,2:end), ...  
    'k', ...  
    'Color','b', ...  
    "LineWidth",2 ...  
)  
plot( ...  
    Position_estimation(1,2:end), ...  
    Position_estimation(2,2:end), ...  
    'k', ...  
    'Color','r', ...  
    "LineWidth",2 ...  
)  
title('trajectories'); xlabel ('x [meters]'); ylabel ('y [meters]')  
  
for time=3:length(l_s_b(:,1))  
  
    Robot_pose = transl(Position_estimation(1,time),Position_estimation(2,time),0)*trotz(Or
```

```

for landmark_index=1:length(landmarks(1,:))
    if l_s_b(time,landmark_index) ~= 0

        d=l_s_d(time,landmark_index);
        b=l_s_b(time,landmark_index);

        [x,y]=pol2cart(b(1,1),d(1,1));

        L_w=Robot_pose*[x y 0 1]';

        Detected_landmarks = [Detected_landmarks L_w];
        Reference_landmarks = [Reference_landmarks landmarks(1:2,landmark_index)];
    end
end

if ~isempty(Detected_landmarks)

    scatter(Reference_landmarks(1,:),Reference_landmarks(2,:), 50, 'c','filled');
    scatter(Detected_landmarks(1,:),Detected_landmarks(2,:), 50, 'g','filled');

    A = [];
    for i=1:size(Reference_landmarks, 2)
        A = [A;[Reference_landmarks(1,i),Reference_landmarks(2,i),1,0]];
        A = [A;[Reference_landmarks(2,i),-Reference_landmarks(1,i),0,1]];
    end

    B = [];
    for i=1:size(Detected_landmarks, 2)
        B = [B; Detected_landmarks(1,i); Detected_landmarks(2,i)];
    end

    Similarity_transform = linsolve(A,B);
    tx_ST = Similarity_transform(3);
    ty_ST = Similarity_transform(4);
    alpha_ST = atan2(Similarity_transform(2),Similarity_transform(1));

    Error = transl(-tx_ST,-ty_ST,0)*trotz(alpha_ST);
    Corrected_robot = Error * [transl(Robot_pose); 1];
    scatter(Corrected_robot(1),Corrected_robot(2), 50, 'black','filled');

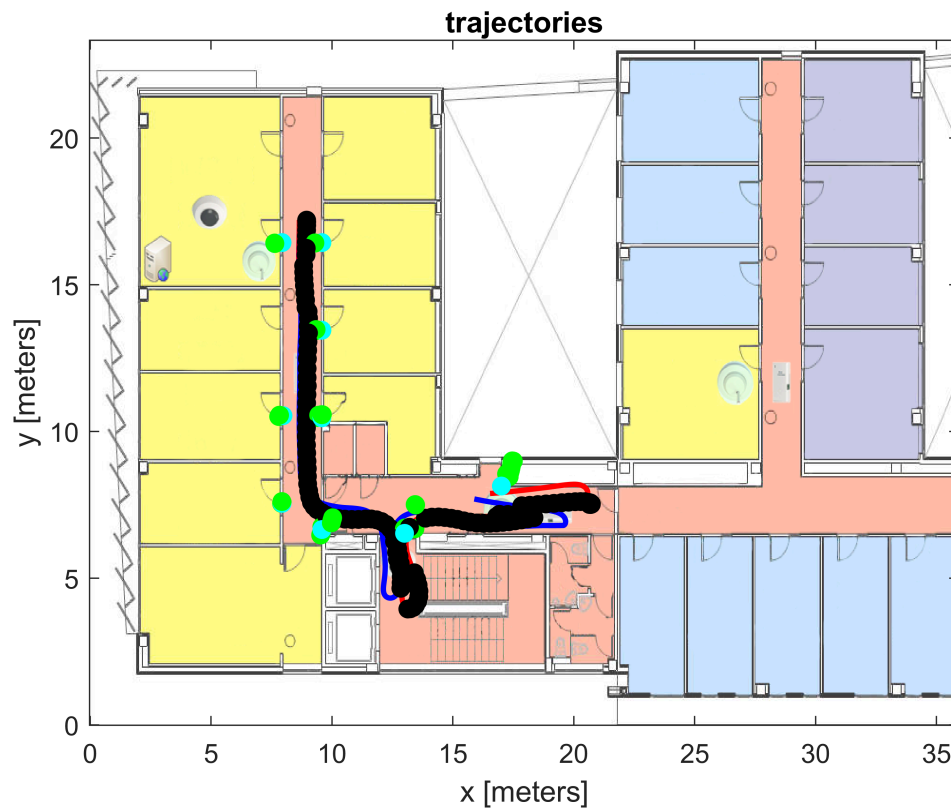
    % time stamp, estimated noisy pose, corrected position, number of Land-marks, and t
    Single_log.Time_stamp = time; % timestamp is
    Single_log.Robot_pose = Robot_pose; % estimated noi
    Single_log.Corrected_robot = Corrected_robot; % corrected pos
    Single_log.Number_of_landmarks = length(Detected_landmarks(1,:)); % number of lan
    Single_log.Error = Error; % errors

    Log_no_correction = [Log_no_correction Single_log];
end

Detected_landmarks = [];
Reference_landmarks = [];
end

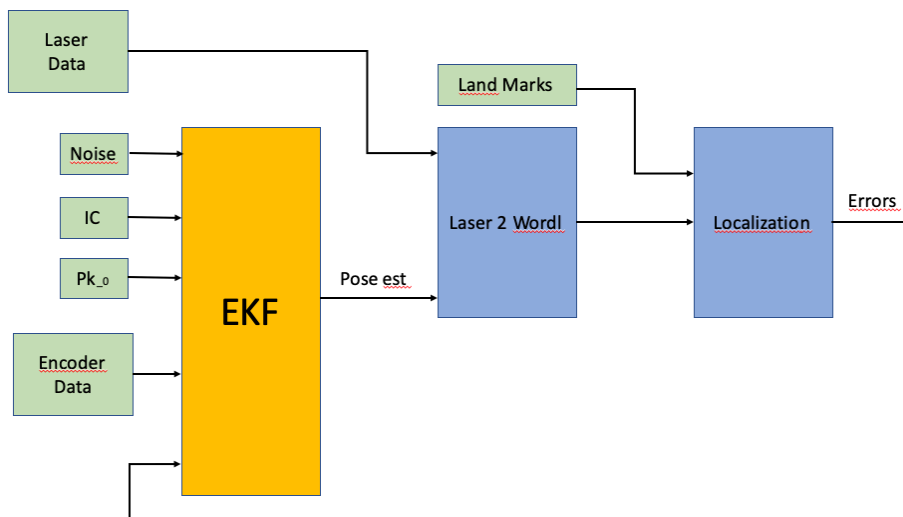
```

hold off



(2) Correct the noisy trajectory.

Pay attention to the relationship of the variables



Make the data fusion of the PDF's, knowing that the Laser scanner has an accuracy 4 mm with a standard deviation of 0.2 mm.

1.- Display in a figure: the map, theoretic trajectory (no noise) the noisy trajectory and the corrected trajectory.

2.- Make a 'log' with the following columns: time stamp, estimated noisy pose, corrected position, number of Land-marks, and the errors.

```

Detected_landmarks = [];
Reference_landmarks = [];
Log_with_correction = [];

Position_with_correction(:,1) = zeros(size(Position_theoric(:,1)));
Position_with_correction(:,2) = Position_theoric(:,2);

Orientation_with_correction = zeros(3004,1);
Orientation_with_correction(2) = Orientation_theoric(3,2);

Orientation_estimation;

mu_noise = 0;
mu_laser = 0;
mu_fused = 0;

image(I, 'XData',x_ima, 'YData',y_ima, "AlphaData",0.75);
axis xy
hold on

plot( ...
    Position_theoric(1,2:end), ...
    Position_theoric(2,2:end), ...
    'k', ...
    'Color','b', ...
    "LineWidth",2 ...
)
plot( ...
    Position_estimation(1,2:end), ...
    Position_estimation(2,2:end), ...
    'k', ...
    'Color','r', ...
    "LineWidth",2 ...
)
title('trajectories'); xlabel ('x [meters]'); ylabel ('y [meters]')

for time=3:length(l_s_b(:,1))

    Position_with_correction(1,time) = Position_with_correction(1,time-1) + (delta_d(time)
    Position_with_correction(2,time) = Position_with_correction(2,time-1) + (delta_d(time)
    Orientation_with_correction(time) = mod(Orientation_with_correction(time-1) + delta_th

    Robot_pose = transl(Position_with_correction(1,time),Position_with_correction(2,time),0

    for landmark_index=1:length(landmarks(1,:))
        if l_s_b(time,landmark_index) > 0

            d=l_s_d(time,landmark_index);

```

```

        b=l_s_b(time,landmark_index);

        [x,y]=pol2cart(b(1,1),d(1,1));

        L_w=Robot_pose*[x y 0 1]';

        Detected_landmarks = [Detected_landmarks L_w];
        Reference_landmarks = [Reference_landmarks landmarks(1:2,landmark_index)];
    end
end

if ~isempty(Detected_landmarks)

    scatter(Reference_landmarks(1,:),Reference_landmarks(2,:), 50, 'c','filled');
    scatter(Detected_landmarks(1,:),Detected_landmarks(2,:), 50, 'g','filled');

    A = [];
    for i=1:size(Reference_landmarks, 2)
        A = [A;[Reference_landmarks(1,i),Reference_landmarks(2,i),1,0]];
        A = [A;[Reference_landmarks(2,i),-Reference_landmarks(1,i),0,1]];
    end

    B = [];
    for i=1:size(Detected_landmarks, 2)
        B = [B; Detected_landmarks(1,i); Detected_landmarks(2,i)];
    end

    Similarity_transform = linsolve(A,B);
    tx_ST = Similarity_transform(3);
    ty_ST = Similarity_transform(4);
    alpha_ST = atan2(Similarity_transform(2),Similarity_transform(1));

    % ----- %
    % ---- trying to apply kalman's algorithm ---- %
    % ----- %

    % NOTA: no es la primera prueba que hacemos, pero lo hemos
    % dejado así porque el código se entendía mejor de esta manera.
    % Somos conscientes de que no funciona la parte fused.
    %
    % sigma_noise_x = ProcNoiseD;
    % sigma_noise_y = ProcNoiseTheta;
    % sigma_noise_theta = ProcNoiseTheta;
    % sigma_laser = (0.2 * 10^-3)^2;
    %
    % sigma_fused = (sigma_noise_x*sigma_laser)/(sigma_noise_x+sigma_laser);
    % sigma_fused_t = (sigma_noise_theta*sigma_laser)/(sigma_noise_theta+sigma_laser);
    %
    % error_fused_x = ((sqrt(2*pi*sigma_fused))^-1) * (exp(-((tx_ST-mu_fused)^2) /
    % error_fused_y = ((sqrt(2*pi*sigma_fused))^-1) * (exp(-((ty_ST-mu_fused)^2) /
    % error_fused_theta = ((sqrt(2*pi*sigma_fused_t))^-1) * (exp(-((alpha_ST-mu_fused)^2) /
    %
    % RotzTxy = [ ...
    % cos(error_fused_theta) sin(error_fused_theta) 0 error_fused_x; ...

```

```

% -sin(error_fused_theta) cos(error_fused_theta) 0 error_fused_y; ...
%      0      0      1      0; ...
%      0      0      0      1 ...
% ];
%
% cp(:,time) = RotzTxy * [Position_estimation(1,time) Position_estimation(2,time) ...
% Position_estimation(1,time)
% Position_estimation(2,time)
% Position_with_correction(1,time) = cp(1,time);
% Position_with_correction(2,time) = cp(2,time);

Error = transl(-tx_ST,-ty_ST,0)*trotz(alpha_ST);
Corrected_robot = Error * [transl(Robot_pose); 1];
scatter(Corrected_robot(1),Corrected_robot(2), 50, 'black','filled');
Position_with_correction(1,time) = Corrected_robot(1);
Position_with_correction(2,time) = Corrected_robot(2);

%time stamp, estimated noisy pose, corrected position, number of Land-marks, and the errors

Single_log.Time_stamp = time; % timestamp is
Single_log.Robot_pose = Robot_pose; % estimated noisy pose
Single_log.Corrected_robot = Corrected_robot; % corrected position
Single_log.Number_of_landmarks = length(Detected_landmarks(1,:)); % number of landmarks
Single_log.Error = Error; % errors

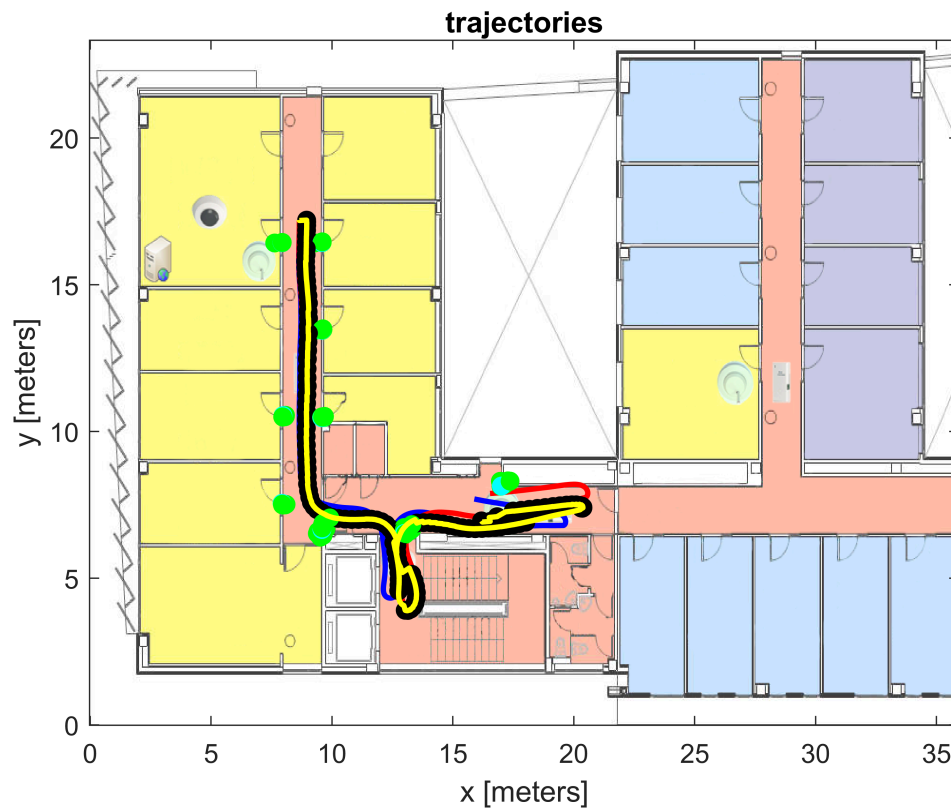
Log_with_correction = [Log_with_correction Single_log];
end

Detected_landmarks = [];
Reference_landmarks = [];
end

plot( ...
    Position_with_correction(1,2:end), ...
    Position_with_correction(2,2:end), ...
    'k', ...
    'Color','y', ...
    "LineWidth",2 ...
)

hold off

```



Mapping (40%)

(1) Walls

Draw the 'walls/obstacles' seeing by the laser data. Do it only when Land Marks are available and the trajectory have been corrected.

Make a movie erasing the previous walls after 200ms for better understanding.

```
Mapping_video = VideoWriter('Mapping_Video.avi');
Mapping_video.FrameRate = 10;
Mapping_video.Quality = 100;
open(Mapping_video);
```

```
figure
hold on
title("Mapping", 'FontSize',15);
```

```
Ts_laser=0.4;
laser_data = log_urg(:,2:681) / 1000;

n_data_by_sampling = size(laser_data,2);
n_sampling = size(laser_data,1);
```

```
plotted_barrier = [];
```

```
ang_res = 0.3515;
```

```

ang = [1:length(laser_data)] * ang_res-30;
ang = ang * pi/180;

[x,y] = pol2cart(ang,laser_data);
T_R_L = transl(0.6,0,0)*trotz(deg2rad(-90));

laser_points_L = [];

for landmark_i = 1:length(Log_with_correction)
    log = Log_with_correction(landmark_i);
    i = log.Time_stamp / 20;
    if i < 150
        delete(ploted_barrier);
        mapping = [];

        laser_points_L(1,:,i) = x(i,:);
        laser_points_L(2,:,i) = y(i,:);
        laser_points_L(3,:,i) = zeros(1,n_data_by_sampling);
        laser_points_L(4,:,i) = ones(1,n_data_by_sampling);

        for j = 1:length(laser_points_L(1,:,i))
            final_pose= log.Robot_pose * T_R_L * laser_points_L(:,j,i);
            mapping = [mapping; final_pose(1) final_pose(2)];
        end

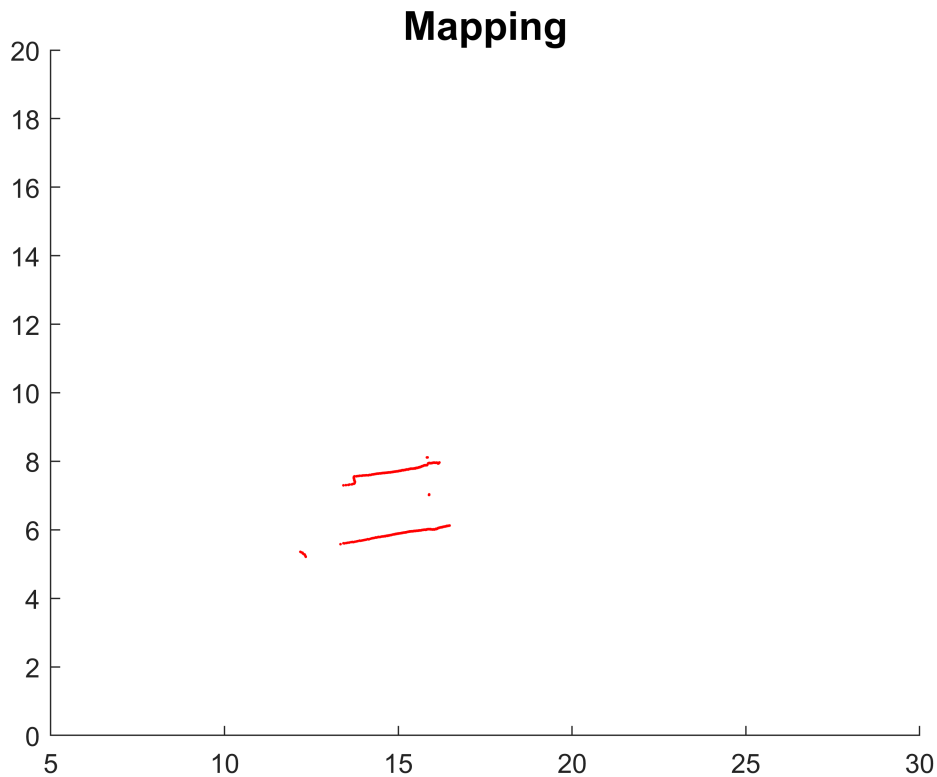
        plotted_barrier = scatter( ...
            mapping(:,1), ...
            mapping(:,2), ...
            1, ...
            'red', ...
            'filled' ...
        );

        axis ([5 30 0 20])

        frame=getframe(gcf);
        writeVideo(Mapping_video,frame);
    end
end

% end
hold off

```

```
close(Mapping_video);
```

(2) Occupancy grid

Use Bresenham algorithm to build the map. Do it only when Land Marks are available and the trajectory have been corrected.

Use the idea behind the line tracing: Visit: https://es.wikipedia.org/wiki/Algoritmo_de_Bresenham

See: Mapping.mlx for inspiration

```
figure
hold on
title("Occupancy Grid", 'FontSize',15);

A = ones(100,100);
s=pcolor (A);
colormap(gray(2))
s.EdgeColor = [0.9 0.9 1];
axis ([0 30 0 30]);
drawnow;

for landmark_i = 1:length(Log_with_correction)
    log = Log_with_correction(landmark_i);
    i = log.Time_stamp / 20;

    if i < 150
        robot_position = transl(log.Robot_pose);
```

```

for j = 1:length(laser_points_L(1,:,i))
    final_pose= log.Robot_pose * T_R_L * laser_points_L(:,j,i);
    l_xy=bresenham([robot_position(1) robot_position(2)], [final_pose(1) final_pose(2)]);

    for j = 1:length(l_xy(:,1))
        A(l_xy(j,2),l_xy(j,1))=0; % Hemos tenido que poner las x e y rotadas para que s
    end
end
s = pcolor (A);
s.EdgeColor = [0.9 0.9 1];
colormap(gray(2));
drawnow;

end
end
hold off

```

