# Sheet 2 Motion Models and Robot Odometry

 Group 4 Urs Borrmann, Caner Hazirbas, Fang<br/>Yi Zhi May 22, 2013

# Exercise 1

# c) Group Picture



Figure 1: Group Photo

# d) Graph Visualization

Figure 2 is the screenshot taken on rxgraph, shows the running nodes and topics.

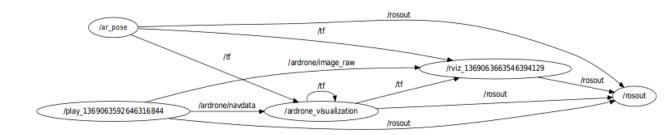


Figure 2: Running nodes and published topics

### Exercise 2

# d) Kalman Filter Covariance Ellipse Screenshot

Figure 3 is the screen shot of the covariance ellipse from the original Q matrix visualized by  ${\rm rviz.}^1$ 

Figure 4 shows the screenshot of the estimated two-dimensional trajectory from the given bag file.

#### e) Kalman Filter with Higher Noise Screenshots

Figure 5 shows the screenshot of the covariance ellipse from the modified Q matrix, which drifts two times more in the global x-direction.

Figure 6 shows the screen shot of the estimated two-dimensional trajectory from the bag file with modified  ${\bf Q}$  matrix.

#### f) Noise Prediction for Experimental Setup

One can fly the quadracopter proportional to the marker located on the ground and read the values from sensors. After a while without changing position or

 $<sup>^{1}</sup>$ In order to easily compare the difference between the effect of the two different Q matrices, we took both screenshots at the last moment of the given bagfile.

<sup>&</sup>lt;sup>2</sup>There is no difference of the trajectories between the two different Q matrix, since until now, the Q matrix just adjusts the covariance ellipse but not the state vector, hence the trajectory.

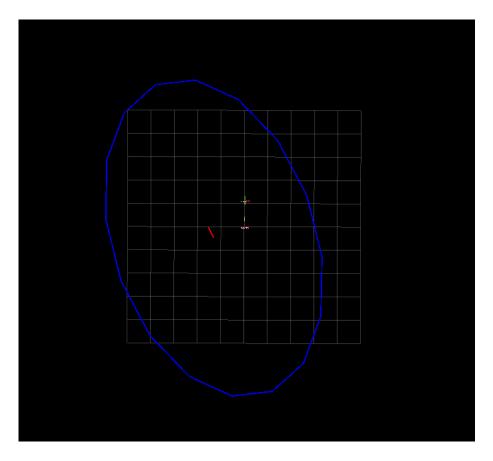


Figure 3: Covariance ellipse with the original Q matrix

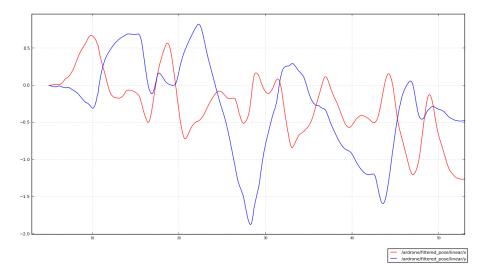


Figure 4: Estimated two-dimensional trajectory from the given bag file

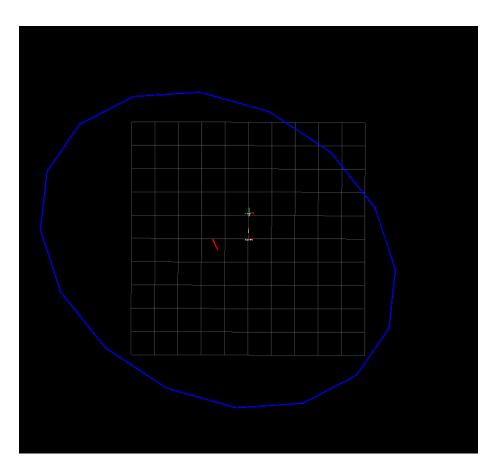


Figure 5: Covariance ellipse with the modified Q matrix  $\,$ 

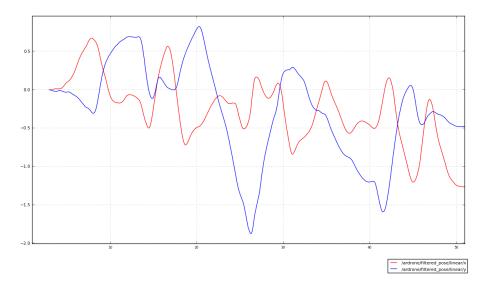


Figure 6: Estimated two-dimensional trajectory from the bag file with modified Q matrix.

orientation of quadracopter, we can observe how much drift we are having. Using observed amount of drift and waited time, one can estimate the noise.

# g) Observation Function and Its Jacobian

#### **Observation Function**

Observed marker pose is calculated with function h(x) (eq. 1). This h(x) observation function predicts the marker pose  $z_{pre}$  given x, estimated robot world state(eq 2), and  $z_g$ , the marker pose in global frame(eq. 3).

1. 
$$z_{pre} = h(x)$$
$$z_{pre} = (x_{pre} \quad y_{pre} \quad \psi_{pre})^{T}$$

$$2. x = (x_w \quad y_w \quad \psi_w)^T$$

$$3. z_g = (x_g y_g \psi_g)^T$$

In order to find the observation, we need to transform the global marker pose to local frame.

If X is homogeneous transformation matrix of x, robot pose,

$$X = \begin{pmatrix} R & t \\ 0 & 1 \end{pmatrix} = \begin{pmatrix} \cos \psi_w & -\sin \psi_w & x_w \\ \sin \psi_w & \cos \psi_w & y_w \\ 0 & 0 & 1 \end{pmatrix}$$

then we can transform any local frame to global frame as follows;

$$\vec{t_q} = X \vec{t_{pre}}$$

We want to transform from global to local. In order to do that we should take inverse of X transformation matrix;

$$X^{-1} = \begin{pmatrix} R^{-1} & -R^{-1}t \\ 0 & 1 \end{pmatrix} = \begin{pmatrix} \cos \psi_w & \sin \psi_w & -x_w \cos \psi_w - y_w \sin \psi_w \\ -\sin \psi_w & \cos \psi_w & x_w \sin \psi_w - y_w \cos \psi_w \\ 0 & 0 & 1 \end{pmatrix}$$

Now we can compute the local marker position from global marker position;

$$\vec{t_g} = \begin{pmatrix} x_g \\ y_g \end{pmatrix}$$

$$\vec{t_{pre}} = X^{-1} \tilde{t_g} = \begin{pmatrix} (x_g - x_w) \cos \psi_w + (y_g - y_w) \sin \psi_w \\ -(x_g - x_w) \sin \psi_w + (y_g - y_w) \cos \psi_w \\ 1 \end{pmatrix}$$

Since yaw angle is always in the global frame, observed yaw angle is

$$\psi_{pre} = (\psi_w - \psi_g)$$

At the end we get following observation function

$$h(x) = \begin{pmatrix} (x_g - x_w) \cos \psi_w + (y_g - y_w) \sin \psi_w \\ -(x_g - x_w) \sin \psi_w + (y_g - y_w) \cos \psi_w \\ (\psi_w - \psi_g) \end{pmatrix}$$

#### Jacobian of Observation Function

Now we can compute the jacobian of observation function as following;

$$H = \frac{\partial h(x)}{\partial x} = \begin{pmatrix} \frac{\partial h(x)}{\partial x_w} & \frac{\partial h(x)}{\partial y_w} & \frac{\partial h(x)}{\partial \psi_w} \end{pmatrix}$$

$$= \begin{pmatrix} -\cos\psi_w & -\sin\psi_w & -(x_g - x_w)\sin\psi_w + (y_g - y_w)\cos\psi_w \\ \sin\psi_w & -\cos\psi_w & -(x_g - x_w)\cos\psi_w - (y_g - y_w)\sin\psi_w \\ 0 & 0 & -1 \end{pmatrix}$$

# i) Trajectory

Figure 7 shows the screenshot of the EKF corrected two-dimensional trajectory from the given bag file.

# j) Drift on Pose Estimation

At the end of the 48th second, roughly we have 1.5m drift in x direction and 1m in y direction.

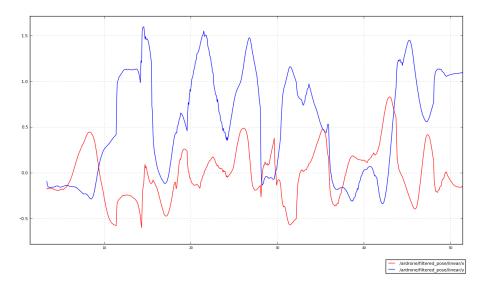


Figure 7: From the EKF corrected two-dimensional trajectory from the given bag file  $\,$