

# Raport Kalman

Szymon

## MPU9250 Settings

### Gyroscope

Scale:  $\pm 250 \frac{\text{rad}}{\text{s}}$

Sample rate: 3.6 kSa/s Can be set to 8.8 kSa/s

Internal DLPF off.

### Accelerometer

Scale:  $\pm 2$  g. *The ecompass algorithm operates under no acceleration assumption*

Sample rate: 1.13 kSa/s

Noise density:  $250 \frac{\mu\text{g}}{\text{rt Hz}}$

### Magnetometer

Scale is fixed at  $\pm 4800 \mu\text{T}$ .

Sample rate is 100 Sa/s (MODE2).

## Filtering schemes

### Extended Kalman Filter

*In case the magnetometer is not used, the yaw angle is estimated from the gyroscope measurements only.*  
That is, the observation of the yaw angle is taken from the state vector. The equations remain unchanged.

State:

$$x(k) = \begin{bmatrix} q \\ \omega_w \\ \omega_u \\ \omega_v \end{bmatrix}$$

The angular velocities refer to the local frame.

Update equation

$$x_{k+1|k} = F(t)x_k = \begin{bmatrix} q \\ \omega_w \\ \omega_u \\ \omega_v \end{bmatrix} = \begin{bmatrix} 1 & \omega_w & -\omega_v & \omega_u & 0 & 0 & 0 \\ -\omega_w & 1 & \omega_u & \omega_v & 0 & 0 & 0 \\ \omega_v & -\omega_u & 1 & \omega_w & 0 & 0 & 0 \\ -\omega_u & -\omega_v & -\omega_w & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} q_w \\ q_x \\ q_y \\ q_z \\ \omega_w \\ \omega_u \\ \omega_v \end{bmatrix}$$

### Dealing with different sample rates for the sensors

Since the gyroscope could be sampled much more quickly, it has a separate update equation to allow for sampling and updating independently of the accelerometer/magnetometer pair.

Additionally, since the accelerometer is also sampled much more quickly than the magnetometer, the magnetometer data is interpolated.

Interpolation scheme:

- assumption of being constant inbetween measurements
- linear interpolation (?)
- separate LKF for the magnetometer (?)

Measurements vector:

$$y = \begin{bmatrix} \omega_w \\ \omega_u \\ \omega_v \\ a_x \\ a_y \\ a_z \\ M_x \\ M_y \end{bmatrix}$$

Magnetometer measures the magnetic field strength in the global frame  $M$ . The magnetic field strength in the local frame is denoted as  $m$ .

$M_Z$  is not estimated. It is dependent on the exact location on Earth.

### Mapping the state space to the measurement space: the observation equations

$$\omega_w = \omega_w$$

$$\omega_u = \omega_u$$

$$\omega_v = \omega_v$$

Using the Euler angles:

$$\psi = \arctan\left(\frac{2q_w q_x + q_y q_z}{1 - 2(q_x^2 + q_y^2)}\right)$$

$$\theta = \frac{-\pi}{2} + 2 \arctan\left(\frac{\sqrt{1 + 2(q_w q_y - q_x q_z)}}{\sqrt{1 - 2(q_w q_y - q_x q_z)}}\right)$$

$$\phi = \arctan\left(\frac{2(q_w q_z + q_x q_y)}{1 - 2(q_y^2 + q_z^2)}\right)$$

Numerical problems around 0 and 1.

$$a_x = \sin(\theta)$$

$$a_y = -\cos(\theta) \sin(\psi)$$

$$a_z = \cos(\theta) \cos(\psi)$$

$$m_x =$$

$$m_y =$$

jac =

3

[illegible]

$$\begin{aligned}
& + 1)^{(1/2)}) + \text{real}(q_x/(2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * (\text{imag}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)})))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2)/((\text{imag}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}))^2 + (\text{imag}((2*q_w*q_y - 2*q_x*q_z \\
& + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2), 0, 0, 0] \\
& [- (2*\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)})) * \text{imag}(q_x))/\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1) \\
& - (\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y + \\
& 1)^{(1/2)})) * (q_x * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i + 2 * \text{conj}(q_x)^2 + \\
& 2 * \text{conj}(q_y)^2 - 1) * 2i + \text{conj}(q_x) * (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + \\
& 1) * 2i) * (2 * \text{real}(q_x^2) + 2 * \text{real}(q_y^2) + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) - 1))/ (2 * \text{abs}(- \\
& 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1)^2 * (- (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 \\
& + q_z*q_y*1i + 1) * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i + 2 * \text{conj}(q_x)^2 + \\
& 2 * \text{conj}(q_y)^2 - 1))^{(1/2)}) - (\sin(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, \\
& (2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * ((\text{imag}(q_y/(2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) - \\
& \text{real}(q_y/(2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) \\
& - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) + ((\text{imag}(q_y/(2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) + \text{real}(q_y/(2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * (\text{imag}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)})))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (2 * \text{real}(q_x^2) + 2 * \text{real}(q_y^2) \\
& + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) - 1))/(\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + \\
& q_z*q_y*1i + 1) * ((\text{imag}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z \\
& + 1)^{(1/2)}))^2 + (\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}))^2)), - (\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - \\
& 2*q_w*q_y + 1)^{(1/2)})) * (2 * \text{imag}(q_w) + 4 * \text{real}(q_x)))/\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 \\
& + q_z*q_y*1i + 1) - (\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - \\
& 2*q_w*q_y + 1)^{(1/2)})) * ((\text{conj}(q_w) * 2i + 4 * \text{conj}(q_x)) * (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 \\
& + q_z*q_y*1i + 1) + (q_w*2i - 4*q_x) * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i \\
& + 2 * \text{conj}(q_x)^2 + 2 * \text{conj}(q_y)^2 - 1)) * (2 * \text{real}(q_x^2) + 2 * \text{real}(q_y^2) + \text{imag}(q_y*q_z) \\
& - \text{real}(q_w*q_x*2i) - 1))/ (2 * \text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + \\
& 1)^2 * (- (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1) * (\text{conj}(q_w) * \text{conj}(q_x) * 2i \\
& + \text{conj}(q_y) * \text{conj}(q_z) * 1i + 2 * \text{conj}(q_x)^2 + 2 * \text{conj}(q_y)^2 - 1))^{(1/2)}) + (\sin(\pi/2 - \\
& \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * ((\text{imag}(q_z/ \\
& (2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) - \text{real}(q_z/(2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}))/ \\
& (\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) \\
& + ((\text{imag}(q_z/(2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) + \text{real}(q_z/(2*q_x*q_z - 2*q_w*q_y + \\
& 1)^{(1/2)})) * (\text{imag}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)})))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + \\
& 1)^{(1/2)}))^2 * (\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}))^2 * (2 * \text{real}(q_x^2) + 2 * \text{real}(q_y^2) + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) - \\
& 1))/(\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1) * ((\text{imag}((2*q_x*q_z - \\
& 2*q_w*q_y + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}))^2 + (\text{imag}((2*q_w*q_y \\
& - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2)), - (\cos(\pi/2 - \\
& \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * (\text{imag}(q_z) \\
& + 4 * \text{real}(q_y)))/\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1) - \\
& (\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y + \\
& 1)^{(1/2)})) * ((4 * \text{conj}(q_y) + \text{conj}(q_z) * 1i) * (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i \\
& + 1) - (4*q_y - q_z*1i) * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i + 2 * \text{conj}(q_x)^2 \\
& + 2 * \text{conj}(q_y)^2 - 1)) * (2 * \text{real}(q_x^2) + 2 * \text{real}(q_y^2) + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) \\
& - 1))/ (2 * \text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1)^2 * (- (- 2*q_x^2 + \\
& q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1) * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i \\
& + 2 * \text{conj}(q_x)^2 + 2 * \text{conj}(q_y)^2 - 1))^{(1/2)}) - (\sin(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z \\
& + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * ((\text{imag}(q_w/(2*q_x*q_z - 2*q_w*q_y + \\
& 1)^{(1/2)}) - \text{real}(q_w/(2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z +
\end{aligned}$$

$$\begin{aligned}
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) + ((\text{imag}(q_w/(2*q_w*q_y - 2*q_x*q_z \\
& + 1)^{(1/2)}) + \text{real}(q_w/(2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * (\text{imag}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)})))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (2*\text{real}(q_x^2) + 2*\text{real}(q_y^2) \\
& + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) - 1))/(\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + \\
& q_z*q_y*1i + 1) * ((\text{imag}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z \\
& + 1)^{(1/2)}))^2 + (\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}))^2)), - (\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z \\
& - 2*q_w*q_y + 1)^{(1/2)})) * \text{imag}(q_y))/\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i \\
& + 1) - (\cos(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, (2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)})) * (q_y * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i + 2*\text{conj}(q_x)^2 + \\
& 2*\text{conj}(q_y)^2 - 1) * 1i + \text{conj}(q_y) * (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + \\
& 1) * 1i) * (2*\text{real}(q_x^2) + 2*\text{real}(q_y^2) + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) - 1))/ (2*\text{abs}(- \\
& 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + q_z*q_y*1i + 1)^2 * (- (- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 \\
& + q_z*q_y*1i + 1) * (\text{conj}(q_w) * \text{conj}(q_x) * 2i + \text{conj}(q_y) * \text{conj}(q_z) * 1i + 2*\text{conj}(q_x)^2 + \\
& 2*\text{conj}(q_y)^2 - 1))^{(1/2)}) + (\sin(\pi/2 - \text{atan2}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}, \\
& (2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * ((\text{imag}(q_x/(2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) - \\
& \text{real}(q_x/(2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) \\
& - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) + ((\text{imag}(q_x/(2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) + \text{real}(q_x/(2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)})) * (\text{imag}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)})))/(\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (\text{imag}((2*q_w*q_y - 2*q_x*q_z + \\
& 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}))^2 * (2*\text{real}(q_x^2) + 2*\text{real}(q_y^2) \\
& + \text{imag}(q_y*q_z) - \text{real}(q_w*q_x*2i) - 1))/(\text{abs}(- 2*q_x^2 + q_w*q_x*2i - 2*q_y^2 + \\
& q_z*q_y*1i + 1) * ((\text{imag}((2*q_x*q_z - 2*q_w*q_y + 1)^{(1/2)}) + \text{real}((2*q_w*q_y - 2*q_x*q_z \\
& + 1)^{(1/2)}))^2 + (\text{imag}((2*q_w*q_y - 2*q_x*q_z + 1)^{(1/2)}) - \text{real}((2*q_x*q_z - 2*q_w*q_y \\
& + 1)^{(1/2)}))^2)), 0, 0, 0]
\end{aligned}$$

## Error-State Extended Kalman Filter

### Dealing with gyroscope bias

Commonly, there is a thermal model that is used to estimate the gyroscope bias. However, Machony et al. proved, that since the bias is a DC component of the measurements, it can be estimated via integration:

$$b_i = \int_0^t \omega_i dt$$

To allow the sensor to change environments rapidly, I (plan to) use the so-called leaky integrator:

$$b_i = \int_{t-T}^t \omega_i dt$$

The time constant  $T$  can be used to tune the filter. Additionally, the leaky integrator is trivial to implement.

### Magdwick filter