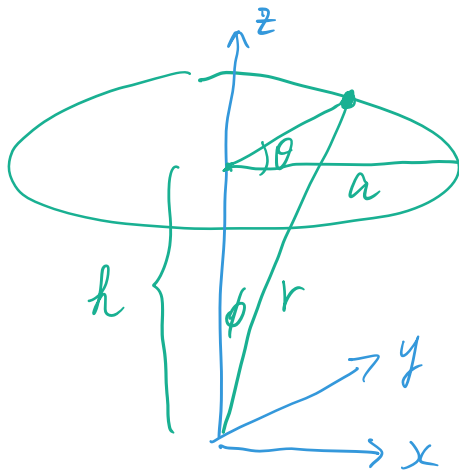


旋转运动学:



粒子坐标  $r = (a \cos \theta, a \sin \theta, h)^T$

对坐标求导:

$$\begin{aligned} \dot{r} &= (-a \dot{\theta} \sin \theta, a \dot{\theta} \cos \theta, 0)^T \\ &= \begin{bmatrix} 0 & -\dot{\theta} & 0 \\ \dot{\theta} & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} a \cos \theta \\ a \sin \theta \\ h \end{bmatrix} \\ &= \omega \times r \end{aligned} \quad (1)$$

$\omega = \dot{\theta} z$ ,  $|\dot{\theta}|$  是角速度

$$\omega = \begin{bmatrix} 0 \\ 0 \\ \dot{\theta} \end{bmatrix}$$

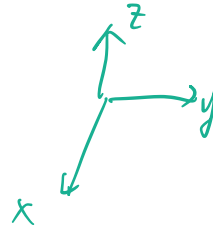
$$|r| \sin \phi = a$$

对(1)取模,  $|\dot{r}| = |\omega| |r| \sin \phi = a |\dot{\theta}|$

线速度 = 半径  $\times$  角速度.

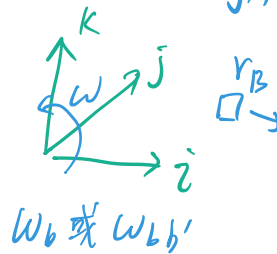
当坐标系由静止不动变为旋转时:

世界坐标系/惯性系: 静止.



$i, j, k$  是世界系下的表示.

Body frame: 旋转的坐标系.



质量块在 body 下坐标:

$$r_B = (x_1, x_2, x_3)^T.$$

旋转回惯性系下:

$$r_I(t) = x_1(t)i + x_2(t)j + x_3(t)k = R_{IB} r_B$$

忽略两个坐标系间的平移.

简写为:

$$r_I = x_i e_i$$

对时间求导:

$$\dot{r}_I = R_{IB} \dot{r}_B + \dot{R}_{IB} r_B$$

$$= R_{IB} \dot{r}_B + [R_{IB} \omega_b]_{\times} r_I$$

(\*) 推导见后面.



$$= R_{IB} V_B + \omega \times r_I$$

extra item.

$$V_I \equiv R_{IB} V_B + \omega \times r_I \Rightarrow R_{IB} V_B \equiv V_I - \omega \times r_I \quad (2)$$

$\omega = R_{IB} \omega_b$ , 表示 body 系角速度在 I 系表示.

(\*) 推导:

$$\dot{R}_{IB} r_B = \lim_{\Delta t \rightarrow 0} \frac{R_{IB'} \exp([W_{BB'} \Delta t])^{\wedge} r_B - R_{IB} r_B}{\Delta t}$$

$$\begin{aligned} R_{IB} \exp([W_{BB'} \Delta t])^{\wedge} &= R_{IB} (I + [W_b \Delta t]_{\times}) - R_{IB} r_B \\ &= R_{IB} [W_b \Delta t]_{\times} \end{aligned}$$

$$\therefore R[a]_{\times} = [Ra]_{\times} R$$

$$\begin{aligned} \therefore R_{IB} [W_b \Delta t]_{\times} &= [R_{IB} W_{BB'}]_{\times} R_{IB} r_B \\ &= \omega \times r_I \end{aligned}$$

对速度求导:

$$\begin{aligned} V_I &\equiv R_{IB} V_B + \omega \times r_I \\ \dot{V}_I &= (R_{IB} \dot{V}_B + \dot{R}_{IB} V_B) + (\omega \times \dot{r}_I + [\dot{R}_{IB} \omega_b + R_{IB} \dot{\omega}_b]_{\times} r_I) \end{aligned}$$

$\omega = R_{IB} \omega_b$

把  $R_{IB} V_B$  记作  $v$ .

$$\dot{R}_{IB} \omega_b = \omega \times \omega = 0.$$

$$\dot{V}_I = \dot{v} + \omega \times r_I$$

$$\therefore \dot{V}_I = R_{IB} \dot{V}_B + \dot{R}_{IB} V_B + \omega \times (v + \omega \times r_I) + [R_{IB} \dot{\omega}_b]_{\times} r_I$$

$$= R_{IB} a_B + 2\omega \times v + \omega \times (\omega \times r_I) + \dot{\omega} \times r_I$$

$$R_{IB} v_B + \omega \times v = 2\omega \times v$$

把  $R_{IB} a_B$  记作  $a$ .

$$a = a_I - 2\omega \times v - \dot{\omega} \times r_I - \omega \times (\omega \times r_I)$$

科氏力      欧拉力      离心力.

IMU 测量模型.

加速度计测量值  $a_m$ :

$$a_m = \frac{f}{m} = a - g.$$

$a$  物体在惯性系下的加速度.

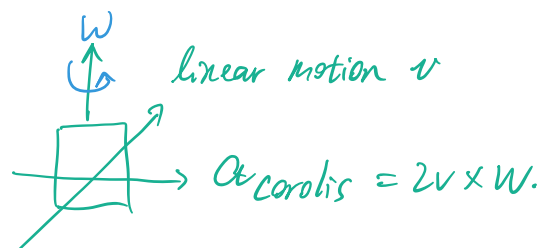
$$ma = f + mg. \rightarrow a = \frac{f}{m} + g.$$

东北天坐标系:  $g = (0, 0, -9.81)^T$

IMU 静止:  $a_m = 0 - g = -g.$

自由落体:  $a = g, a_m = g - g = 0.$

MEMS 陀螺仪:

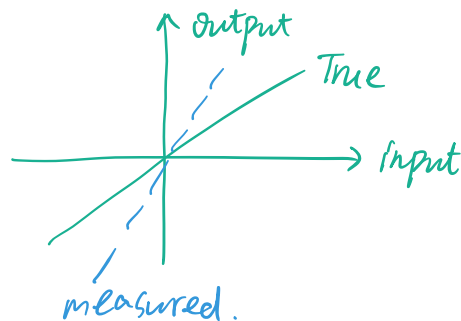


误差模型:

理论上没有外力作用时, IMU 输出为 0, 但实际存在一个偏置  $b$ ,

$$V_{err} = b \Delta t, \quad P_{err} = \frac{1}{2} b a \Delta t^2.$$

Scale: 实际数值和传感器输出之间的比值.



随机误差.

IMU 数据在连续时间上受到一个均值为 0, 方差为  $\sigma^2$ , 各时刻间互相独立的高斯过程  $n(t)$ :

$$E[n(t)] = 0$$

$$E[n(t_1) n(t_2)] = \sigma^2 \delta(t_1 - t_2)$$

实际上, IMU 传感器获取的数据为离散采样, 离散和连续高斯

白噪声的方差之间存在如下转换关系:

$$n_d[k] \triangleq n(t_0 + \Delta t) \simeq \sqrt{\Delta t} \cdot n_c(t_0 + \Delta t) \dots$$

$$-\Delta t \int_{t_0}^{t_0+\Delta t} n(\tau) d\tau$$

$$\begin{aligned} E(n_d[k]^2) &= E\left(\frac{1}{\Delta t^2} \int_{t_0}^{t_0+\Delta t} \int_{t_0}^{t_0+\Delta t} n(\tau) n(t) d\tau dt\right) \\ &= E\left(\frac{\sigma^2}{\Delta t^2} \int_{t_0}^{t_0+\Delta t} \int_{t_0}^{t_0+\Delta t} \delta(t-\tau) d\tau dt\right) \\ &= E\left(\frac{\sigma^2}{\Delta t}\right) \end{aligned}$$

$\therefore \sigma_d = \frac{\sigma}{\sqrt{\Delta t}}$ ,  $\sigma_d$  是离散采样的标准差.

$$n_d[k] = \sigma_d w[k].$$

$$w[k] \sim N(0,1)$$

$$\sigma_d = \sigma \frac{1}{\sqrt{\Delta t}}.$$

bias 用 wiener process 建模, 即随机游走:

$$\dot{b}(t) = n(t) = \sigma_b w(t).$$

$$w \sim N(0,1)$$

离散和连续之间的变换:

$$b_d[k] \triangleq b(t_0) + \int_{t_0}^{t_0+\Delta t} n(t) dt$$

$$E((b_d[k] - b_d[k-1])^2) =$$

$$\int_{t_0}^{t_0+\Delta t} \int_{t_0}^{t_0+\Delta t} n(t) n(t) dt$$

$$E\left(\int_{t_0+\Delta t}^{t_0} n(t) n(\tau) d\tau dt\right) =$$

$$E\left(\sigma_b^2 \int_{t_0}^{t_0+\Delta t} \int_{t_0}^{t_0+\Delta t} \delta(t-\tau) d\tau dt\right) =$$

$$E(\sigma_b^2 \Delta t)$$

$$\therefore b_d[k] = b_d[k-1] + \sigma_{bd} w[k]$$

$$w[k] \sim N(0, 1)$$

$$\sigma_{bd} = \sigma_b \sqrt{\Delta t}$$

加速度计数学模型.

导航系  $G$  为 ENU.  $g^G = (0, 0, -9.81)^T$ .

$$a_m^B = R_{BG}(a^G - g^G) \quad (16)$$

考虑高斯白噪声, bias, 及尺度因子:

$$a_m^B = S_a R_{BG}(a^G - g^G) + n_a + b_a. \quad (17)$$

$n_a \sim N(0, \sigma_n^2)$        $b_a \sim N(0, \sigma_{b_a}^2)$

陀螺仪误差:

$$\omega_m^B = S_g \omega^B + n_g + b_g.$$

运动模型离散时间处理: body frame

$$\begin{bmatrix} \tilde{w}_b \\ \tilde{a}^b \end{bmatrix} = w^b + b^g + n^g \quad w = \text{world frame}$$

$$\tilde{a}^b = q_{bw} (a^w + g^w) + b^a + n^a$$

测量值

PVQ对时间的导数:

$$\dot{P}_{wbt} = v_t^w$$

$$\dot{v}_t^w = a_t^w$$

$$\dot{q}_{wbt} = q_{wbt} \otimes \begin{bmatrix} 0 \\ \frac{1}{2} w^{bt} \end{bmatrix} \quad (\text{需要归一化 } q_{wbt})$$

$$\dot{R}_{wbt} = R_{wbt} w_x^{bt}$$

根据导数关系, 可以从第  $i$  时刻的 PVQ 通过对 IMU 测量值积分, 得到  $j$  时刻 PVQ:

$$P_{wbj} = P_{wbi} + v_i^w \Delta t + \int_{t \in [i, j]} (q_{wbt} a^{bt} - g^w) \Delta t^2$$

$$v_j^w = v_i^w + \int_{t \in [i, j]} (q_{wbt} a^{bt} - g^w) \Delta t$$

$$q_{wbj} = \int_{t \in [i, j]} q_{wbt} \otimes \begin{bmatrix} 0 \\ \frac{1}{2} w^{bt} \end{bmatrix} \Delta t.$$

使用欧拉法, 即两个相邻时刻  $k$  到  $k+1$  的姿态是用  $k$  时刻的测量值  $a, w$  来计算

$$P_{wb_{k+1}} = P_{wb_k} + V_k^w \Delta t + \frac{1}{2} a \Delta t^2$$

$$V_{k+1}^w = V_k^w + a \Delta t$$

$$q_{wb_{k+1}} = q_{wb_k} \otimes \begin{bmatrix} 1 \\ \frac{1}{2} w \Delta t \end{bmatrix}$$

$$\begin{cases} a = q_{wb_k} (a^{b_k} - b_k^a) - g^w \\ w = w^{b_k} - b_k^g \end{cases}$$

$$\dot{q} = q \otimes \begin{bmatrix} 0 \\ \frac{1}{2} w \end{bmatrix}$$

$$q_{k+1} = q_k + \dot{q}_k \Delta t$$

$$= q_k + q_k \otimes \begin{bmatrix} 0 \\ \frac{1}{2} w \end{bmatrix} \Delta t$$

$$= q_k \otimes \begin{bmatrix} 1 \\ 0 \end{bmatrix} + q_k \otimes \begin{bmatrix} 0 \\ \frac{1}{2} w \end{bmatrix} \Delta t$$

$$= q_k \otimes \begin{bmatrix} 1 \\ \frac{1}{2} w \Delta t \end{bmatrix}$$

中值法：即两个时刻  $k$  到  $k+1$  位姿是用两时刻测量值  $a, w$  均值计算

$$P_{wb_{k+1}} = P_{wb_k} + V_k^w \Delta t + \frac{1}{2} a \Delta t^2$$

$$V_{k+1}^w = V_k^w + a \Delta t$$

$$q_{wb_{k+1}} = q_{wb_k} \otimes \begin{bmatrix} 1 \\ \frac{1}{2} w \Delta t \end{bmatrix}$$

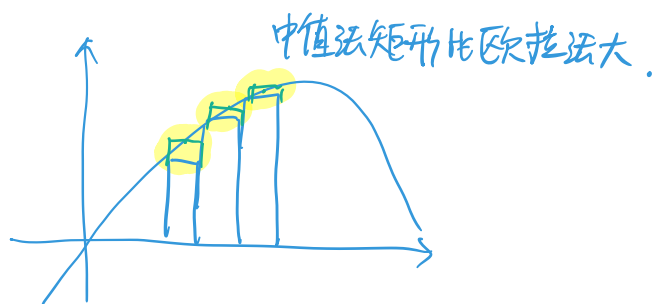
和欧拉法一样。

其中

和欧拉法不同。

$$a = \frac{1}{2} [q_{wbk} (a^{bk} - b_k^a) - g^w + q_{wbk+1} (a^{bk+1} - b_k^a) - g^w]$$

$$\omega = \frac{1}{2} [(\omega^{bk} - b_k^g) + (\omega^{bk+1} - b_k^g)]$$



旋转积分:

$$q_{wb'} = q_{wb} \otimes \left[ \frac{1}{2} \omega \Delta t \right]$$

$$R_{wb'} = R_{wb} \exp(\omega \cdot \Delta t)$$

欧拉角:  $\Delta q_{wb'} = \Delta q_{wb} + E_{wb} \cdot \omega \Delta t$

$\theta = (\phi_{roll}, \phi_{pitch}, \phi_{yaw})^T$  ↖  $E_{wb}$  将 IMU body 系下角速度换成欧拉角速度.

欧拉角:

Step 1: 绕惯性系 z 轴, 得到新坐标  $b^1$

$$x_b^1 = \begin{bmatrix} \cos\phi & \sin\phi & 0 \\ -\sin\phi & \cos\phi & 0 \\ 0 & 0 & 1 \end{bmatrix} x_b^0 = R(\phi) x_b^0$$

Step 2: 绕新坐标系  $b^1$  的 y 轴旋转得到坐标系  $b^2$ .

$$X_b^2 = \begin{bmatrix} \cos\theta & 0 & -\sin\theta \\ 0 & 1 & 0 \\ \sin\theta & 0 & \cos\theta \end{bmatrix} X_b^1 = R(\theta) X_b^1.$$

Step 3: 绕  $b^2$  的  $x$  轴转得到  $b^3$ .

$$X_b^3 = \begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos\psi & \sin\psi \\ 0 & -\sin\psi & \cos\psi \end{bmatrix} X_b^2 = R(\psi) X_b^2$$

$$\therefore X_b = R(\psi) R(\theta) R(\phi) X = R(\phi, \theta, \psi) X.$$

↑  
body 系下的  $X$

↑  
惯性系下的  $X$ .

角速度:

$$\omega = R(\psi) R(\theta) \begin{Bmatrix} 0 \\ 0 \\ \frac{d\phi}{dt} \end{Bmatrix} + R(\psi) \begin{Bmatrix} 0 \\ \frac{d\theta}{dt} \\ 0 \end{Bmatrix} + \begin{Bmatrix} \frac{d\psi}{dt} \\ 0 \\ 0 \end{Bmatrix}$$

$$\omega^b = \begin{bmatrix} 1 & 0 & -\sin\theta \\ 0 & \cos\psi & \sin\psi \cos\theta \\ 0 & -\sin\psi & \cos\psi \cos\theta \end{bmatrix} \begin{bmatrix} \frac{d\psi}{dt} \\ \frac{d\theta}{dt} \\ \frac{d\phi}{dt} \end{bmatrix} \quad (31)$$

(31) 取逆, 得到 body rate to euler rate 的变换:

$$\frac{d\theta}{dt} = \begin{bmatrix} 1 & \sin\psi \tan\theta & \cos\psi \tan\theta \\ 0 & \cos\psi & -\sin\psi \\ 0 & \frac{\sin\psi}{\cos\theta} & \frac{\cos\psi}{\cos\theta} \end{bmatrix} \omega$$

$t_{wb}$