
数学基础

向量、矩阵、变换

北京大学 前沿计算研究中心

刘利斌

本节主要内容

- CG/CGI的数学基础
- 线性代数回顾
 - 三维向量与向量运算
 - 矩阵与矩阵运算
 - 坐标系与坐标变换
 - 三维旋转与表示

CG/CGI的数学基础

- 线性代数
- 微积分
- 优化
- 常微分方程
- 偏微分方程
- 数值计算
- 概率与统计
- 随机过程

CG/CGI的数学基础

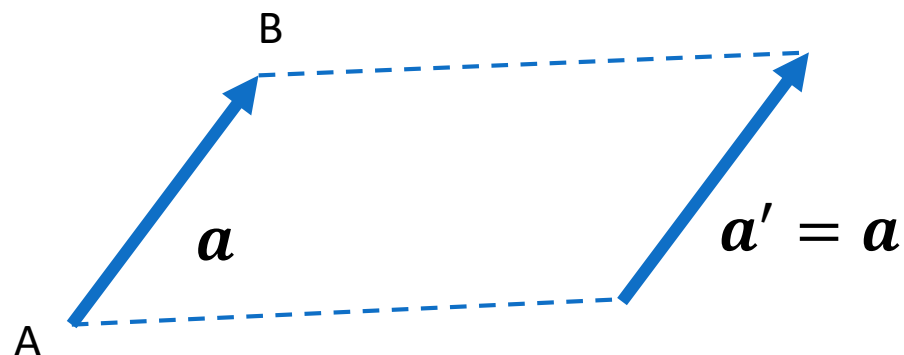
- 线性代数
- 微积分
- 优化
- 常微分方程
- 偏微分方程
- 数值计算
- 概率与统计
- 随机过程

向量

Vector

向量

- 具有大小（长度）和方向的量



表示位置、方向、速度等

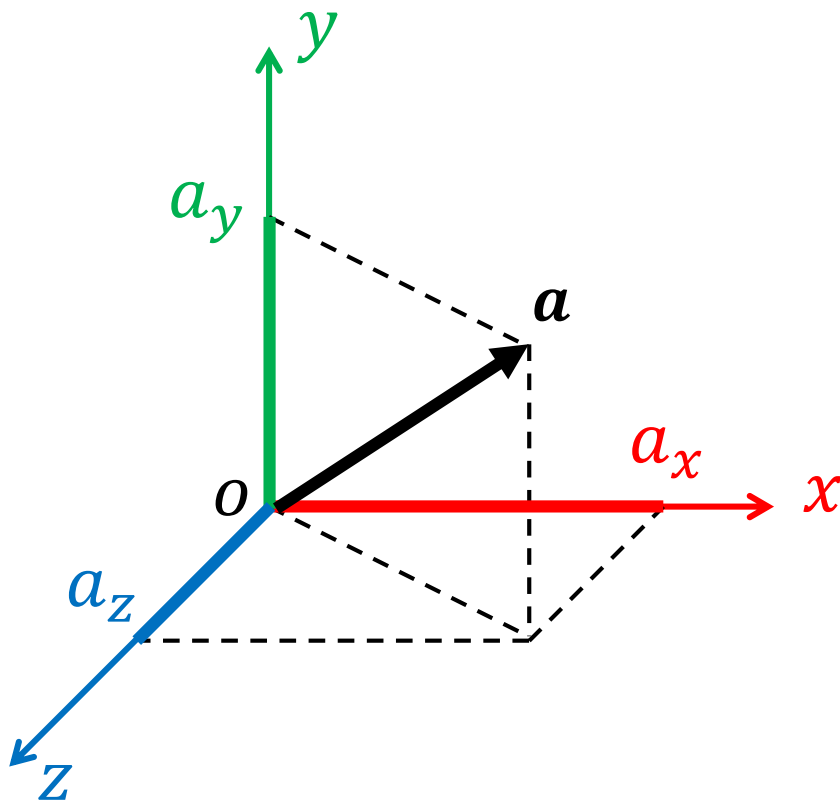
向量长度： $\|a\|$

单位向量： 长度为1的向量

$$\frac{a}{\|a\|}$$

向量的表示

- 笛卡尔坐标系



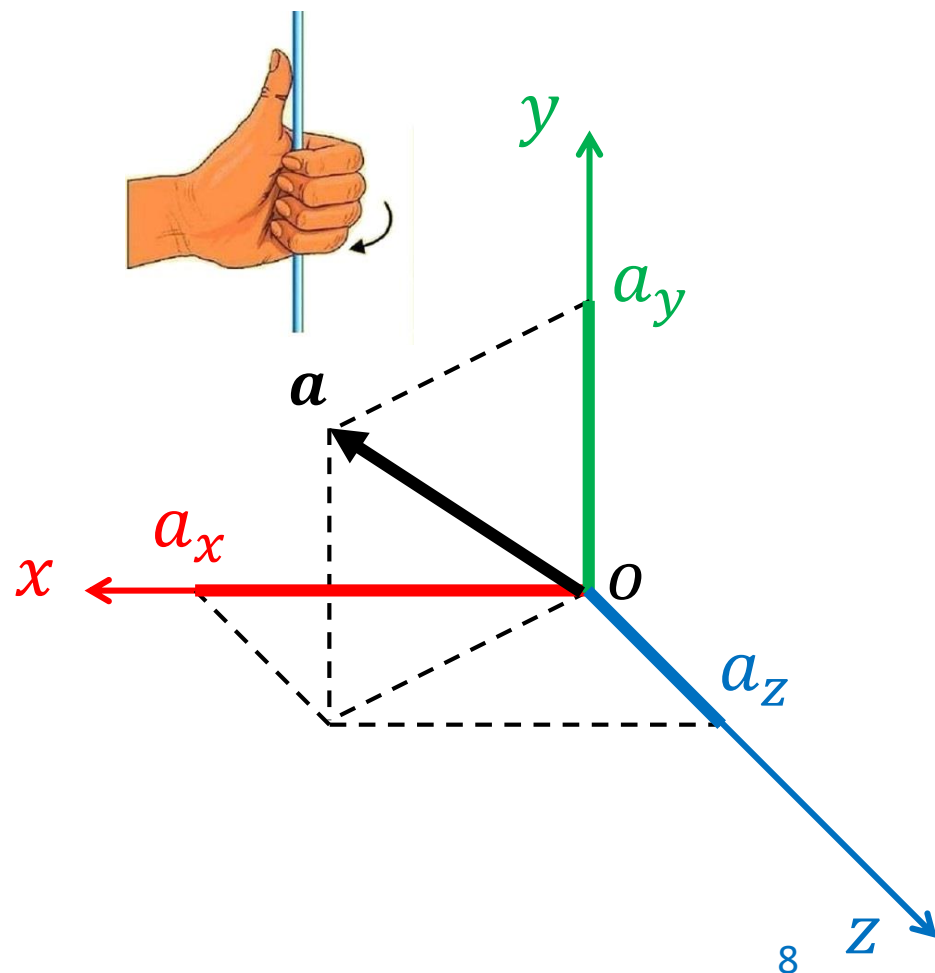
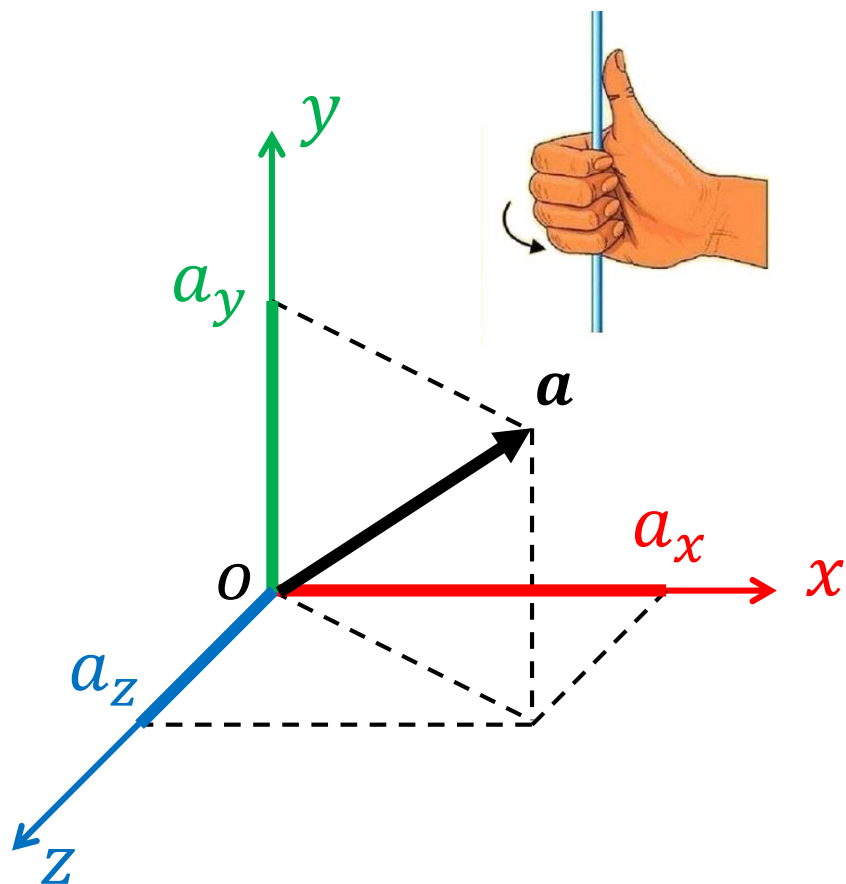
$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

$$\|\mathbf{a}\| = \sqrt{a_x^2 + a_y^2 + a_z^2}$$

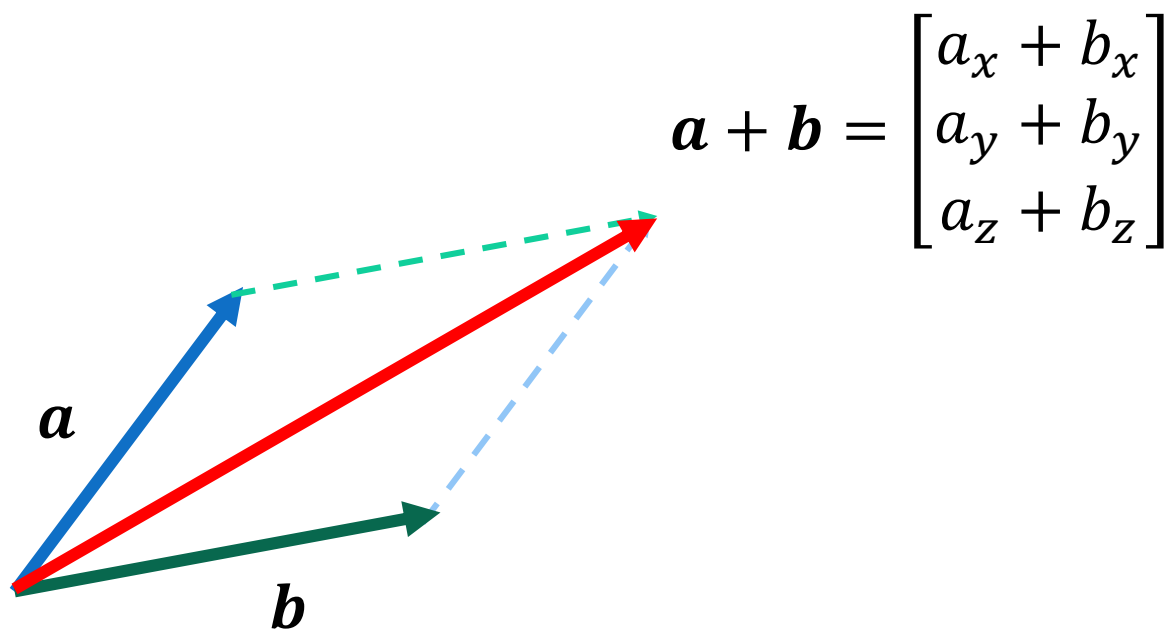
$$\mathbf{o} = \begin{bmatrix} 0 \\ 0 \\ 0 \end{bmatrix} \in \mathbb{R}^3$$

向量的表示

- 右手坐标系与左手坐标系

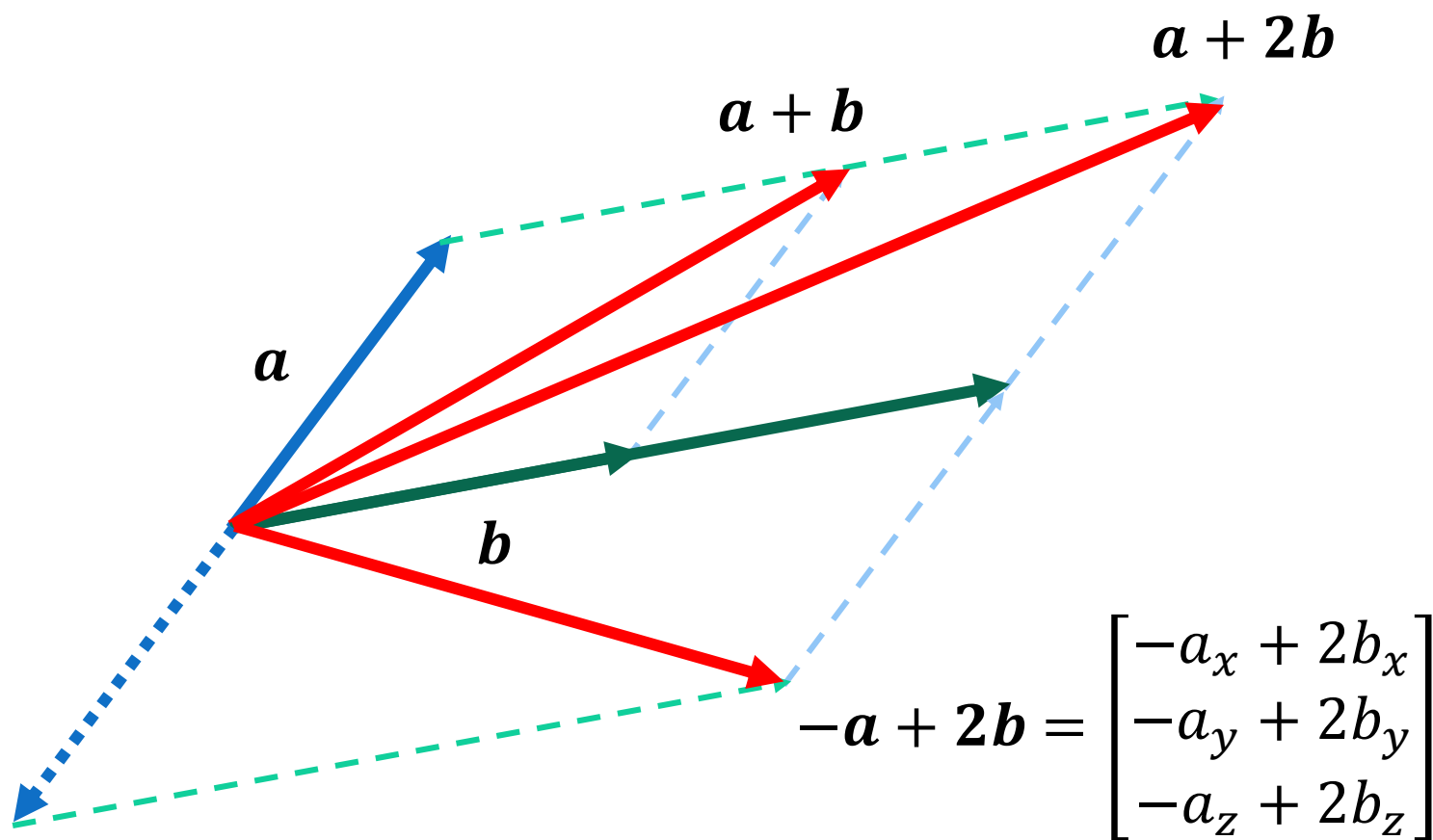


向量的数学运算



向量的数学运算

$$\mathbf{a} + 2\mathbf{b} = \begin{bmatrix} a_x + 2b_x \\ a_y + 2b_y \\ a_z + 2b_z \end{bmatrix}$$

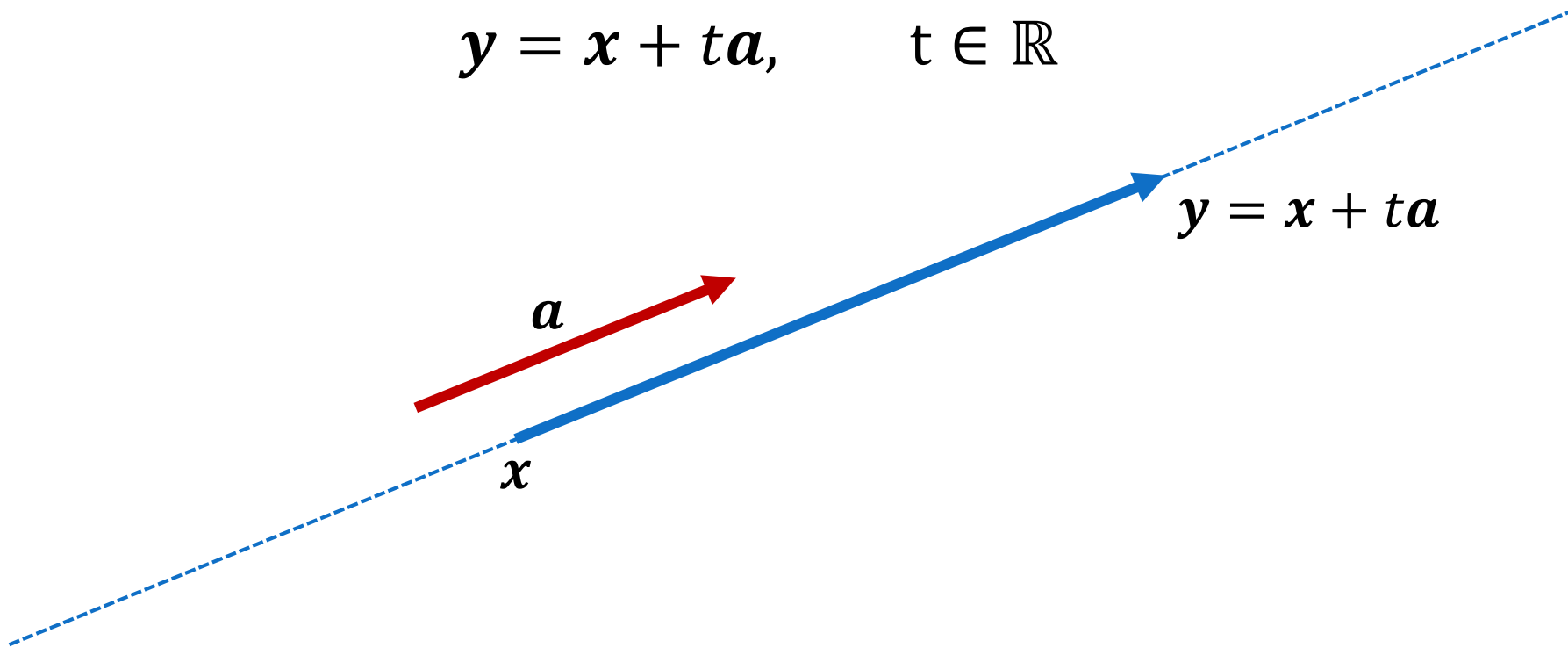


向量的数学运算

- 直线的表示

- 已知线上一点 x , 方向 a , 则线上任意一点 y 可表示为

$$y = x + ta, \quad t \in \mathbb{R}$$



向量的点乘

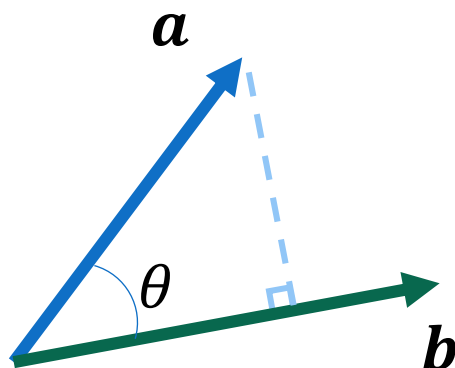
- 内积、标量积

$$\mathbf{a} \cdot \mathbf{b} = a_x b_x + a_y b_y + a_z b_z$$

- $\mathbf{a} \cdot \mathbf{b} = \mathbf{b} \cdot \mathbf{a}$
- $\mathbf{a} \cdot (\mathbf{b} + \mathbf{c}) = \mathbf{a} \cdot \mathbf{b} + \mathbf{a} \cdot \mathbf{c}$
- $\mathbf{a} \cdot \mathbf{a} = a_x a_x + a_y a_y + a_z a_z = \|\mathbf{a}\|^2$

向量的点乘的几何含义

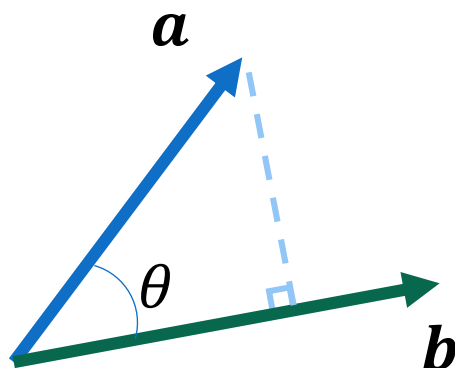
$$\mathbf{a} \cdot \mathbf{b} = a_x b_x + a_y b_y + a_z b_z = \mathbf{a}^T \mathbf{b}$$



$$\mathbf{a} \cdot \mathbf{b} = \|\mathbf{a}\| \|\mathbf{b}\| \cos \theta$$

向量的点乘的几何含义

$$\mathbf{a} \cdot \mathbf{b} = a_x b_x + a_y b_y + a_z b_z = \mathbf{a}^T \mathbf{b}$$



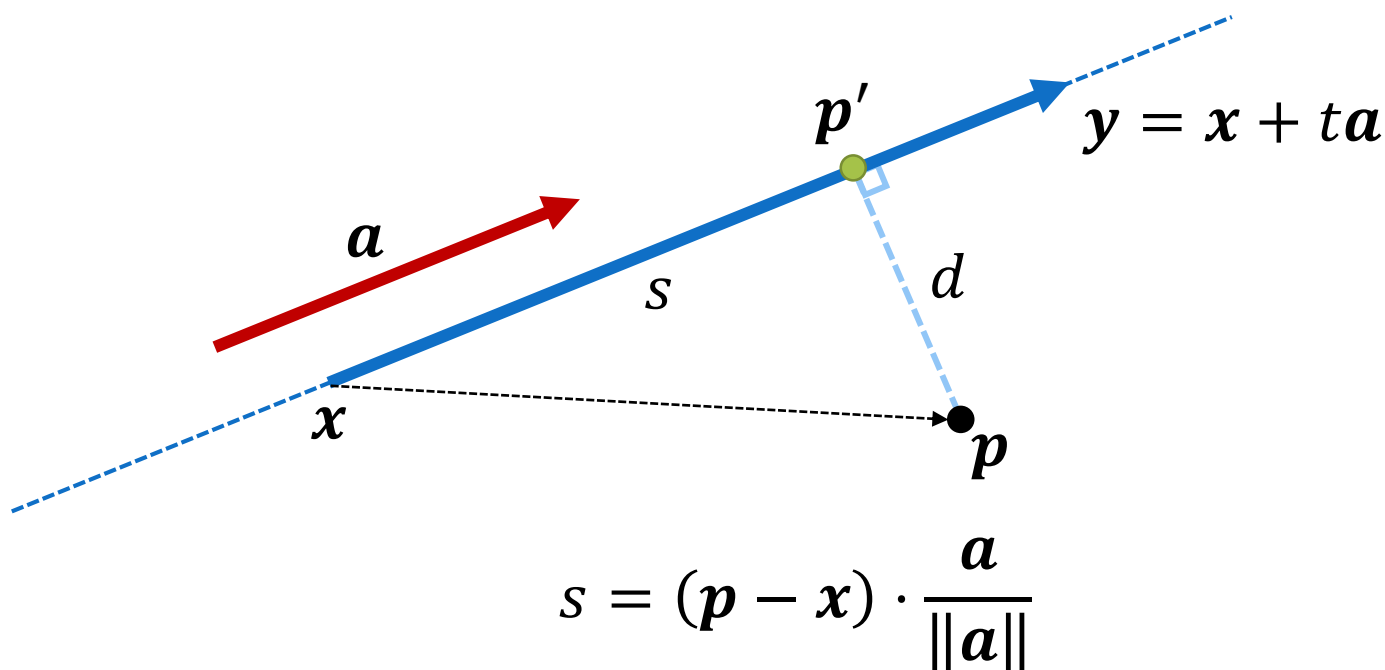
$$\mathbf{a} \cdot \mathbf{b} = \|\mathbf{a}\| \|\mathbf{b}\| \cos \theta$$

$$\theta = \arccos \frac{\mathbf{a} \cdot \mathbf{b}}{\|\mathbf{a}\| \|\mathbf{b}\|}$$

$$\begin{aligned} \mathbf{a} \cdot \mathbf{b} &= 0 \\ \Rightarrow \cos \theta &= 0 \Rightarrow \theta = 90^\circ \\ \Rightarrow \mathbf{a}, \mathbf{b} &\text{ 垂直/正交} \end{aligned}$$

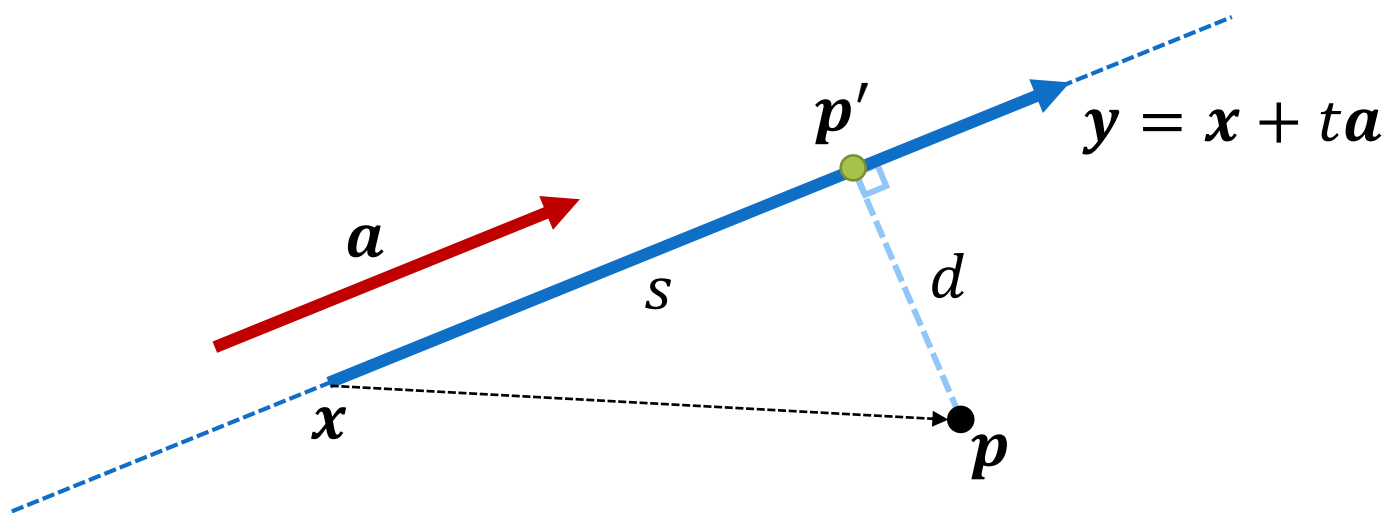
向量的点乘

- 点乘的应用：点在线上的投影 - 最近点



向量的点乘

- 点乘的应用：点在线上的投影 - 最近点

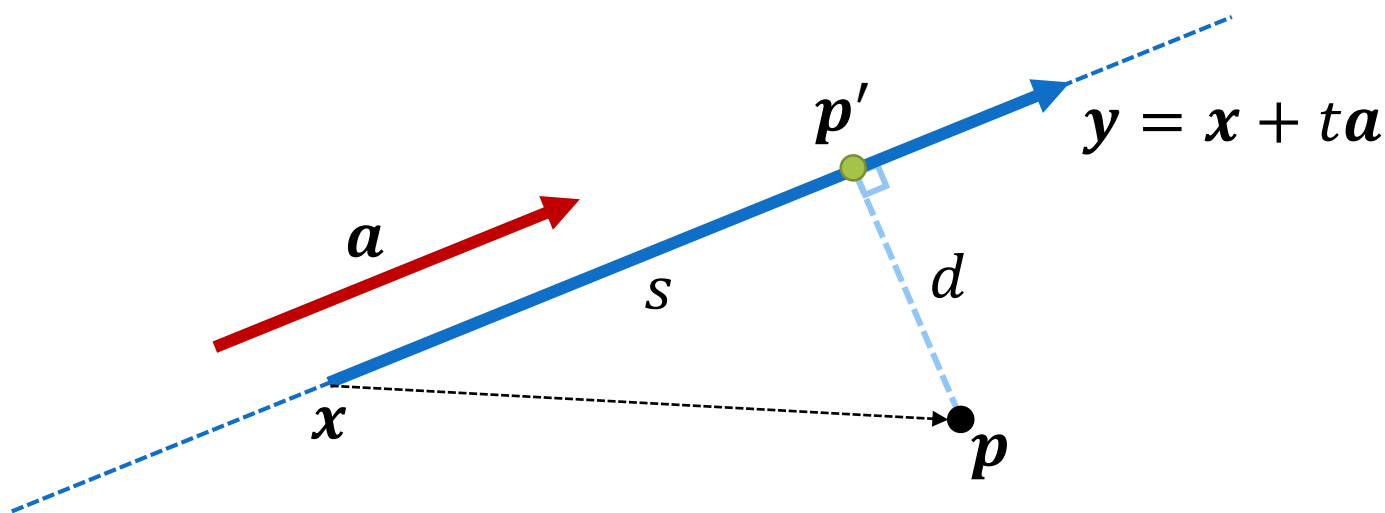


$$s = (p - x) \cdot \frac{a}{\|a\|}$$

$$p' = x + sa$$

向量的点乘

- 点乘的应用：点在线上的投影 - 最近点



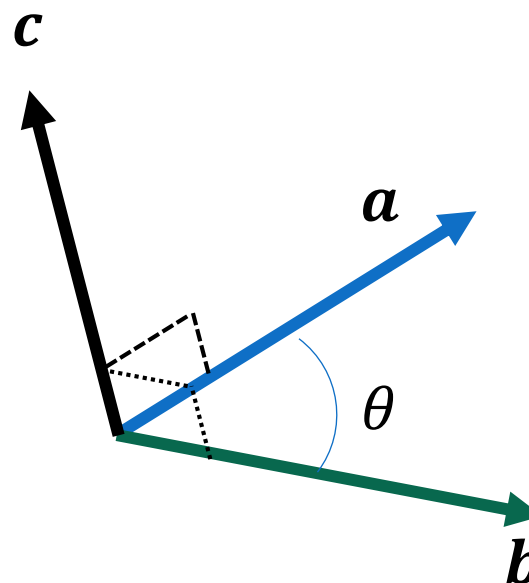
$$s = (p - x) \cdot \frac{a}{\|a\|}$$

$$p' = x + sa$$

$$d = ?$$

向量的叉乘

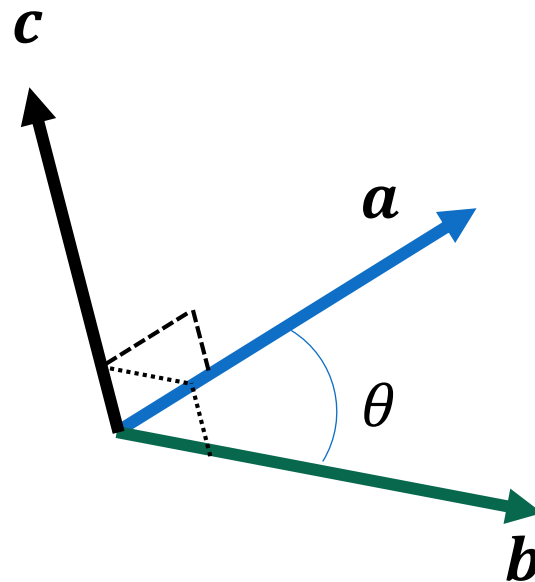
$$\mathbf{c} = \mathbf{a} \times \mathbf{b} = \begin{bmatrix} a_y b_z - a_z b_y \\ a_z b_x - a_x b_z \\ a_x b_y - a_y b_x \end{bmatrix}$$



向量的叉乘

$$\mathbf{c} = \mathbf{a} \times \mathbf{b} = \begin{bmatrix} a_y b_z - a_z b_y \\ a_z b_x - a_x b_z \\ a_x b_y - a_y b_x \end{bmatrix}$$

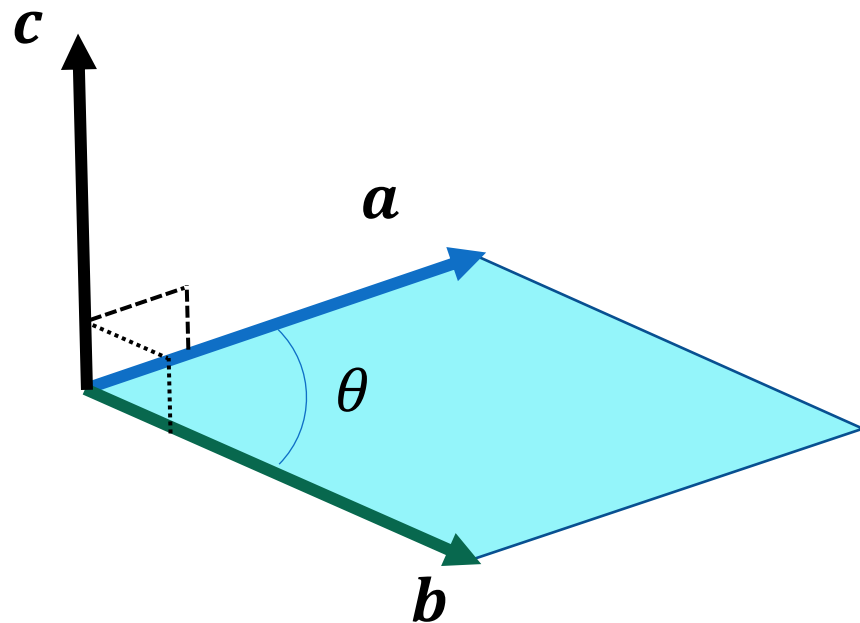
- $\mathbf{c} \cdot \mathbf{a} = \mathbf{c} \cdot \mathbf{b} = 0$
 - 即 \mathbf{c} 同时与 \mathbf{a} , \mathbf{b} 垂直
- $\mathbf{a} \times \mathbf{b} = -\mathbf{b} \times \mathbf{a}$
- $\mathbf{a} \times (\mathbf{b} + \mathbf{d}) = \mathbf{a} \times \mathbf{b} + \mathbf{a} \times \mathbf{d}$



向量叉乘的几何意义

$$\mathbf{c} = \mathbf{a} \times \mathbf{b} = \begin{bmatrix} a_y b_z - a_z b_y \\ a_z b_x - a_x b_z \\ a_x b_y - a_y b_x \end{bmatrix}$$

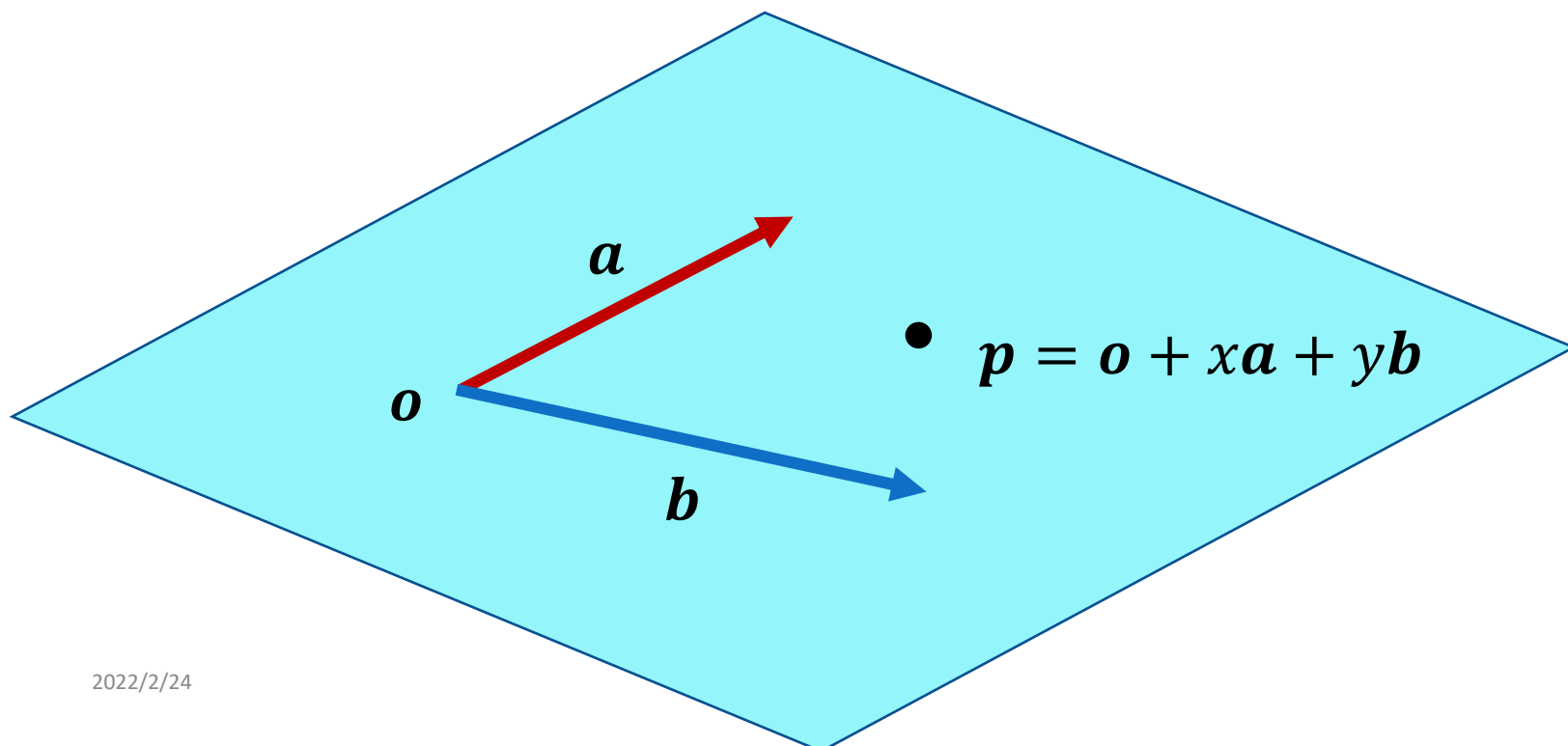
- $\|\mathbf{c}\| = \|\mathbf{a}\| \|\mathbf{b}\| \sin\theta$
- 平行四边形的面积
- $\mathbf{a} \times \mathbf{b} = \mathbf{0} \Rightarrow \mathbf{a}, \mathbf{b}$ 共线



平面表示

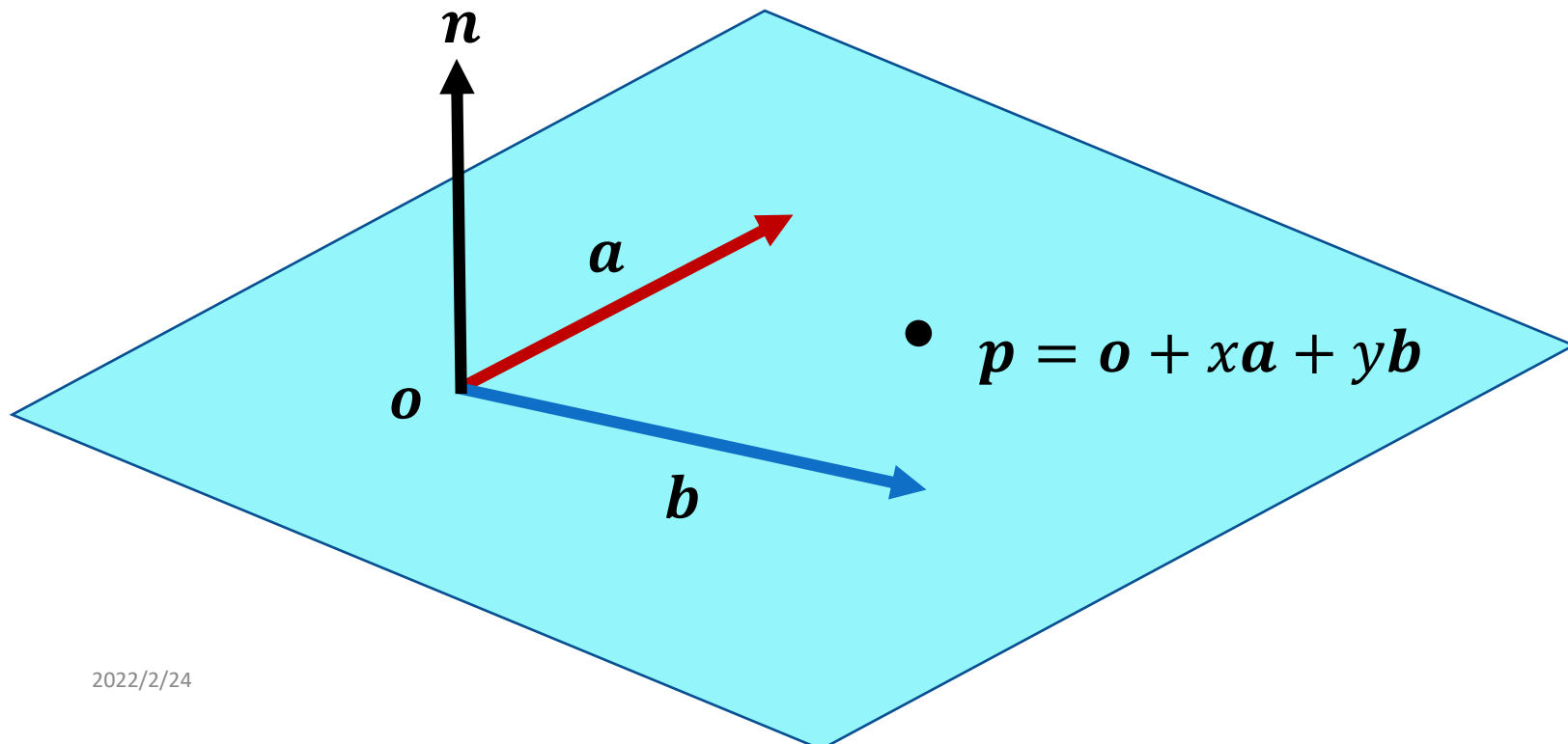
- 给出平面上一点 \mathbf{o} ，以及两个不共线的向量 \mathbf{a}, \mathbf{b} 则平面上任意一点 \mathbf{p} 可表示为

$$\mathbf{p} = \mathbf{o} + x\mathbf{a} + y\mathbf{b}, \quad x, y \in \mathbb{R}$$



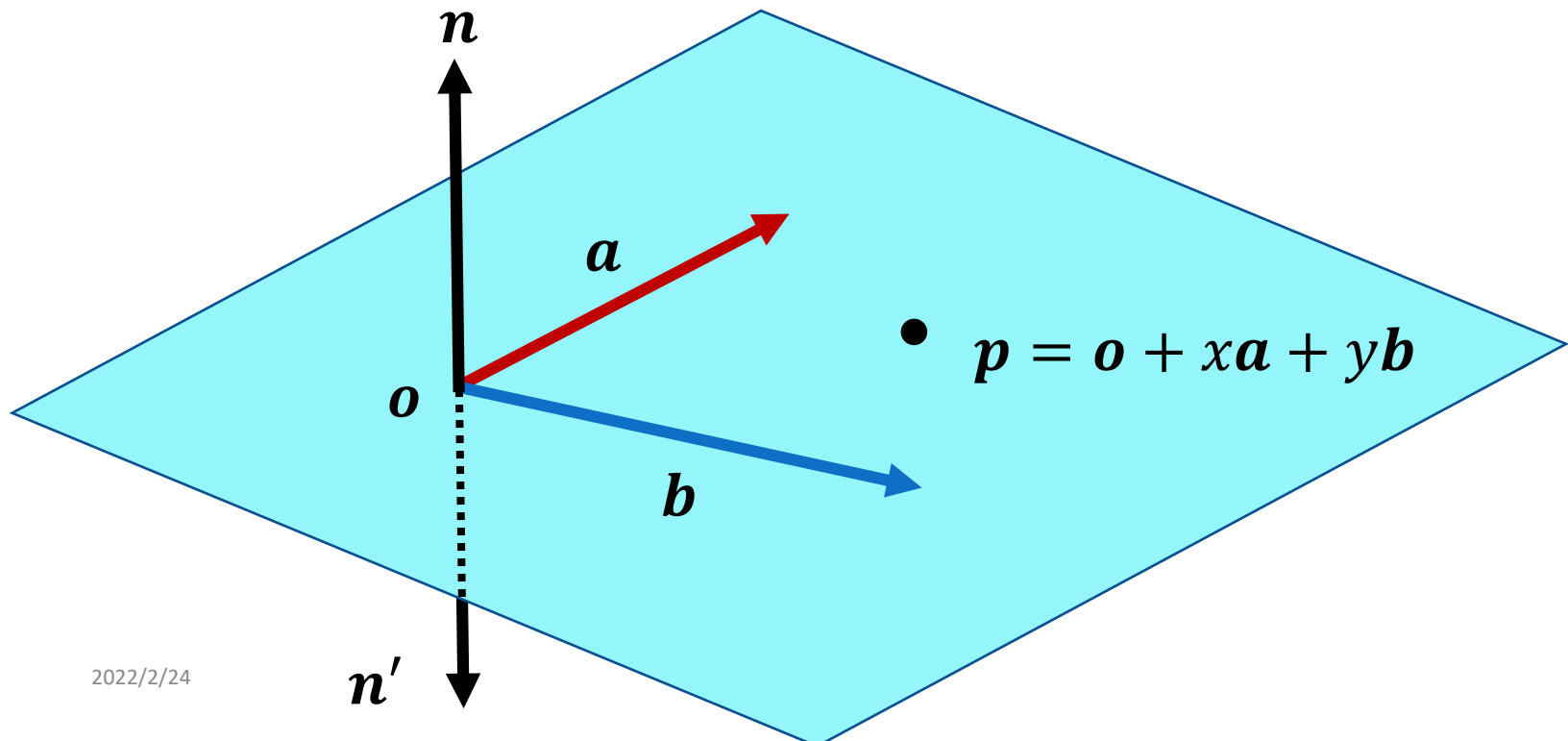
平面表示

- 平面法向 $\mathbf{n} = \mathbf{a} \times \mathbf{b} / \|\mathbf{a} \times \mathbf{b}\|$
- $\mathbf{n} \cdot (\mathbf{p} - \mathbf{o}) = 0, \forall \mathbf{p}$



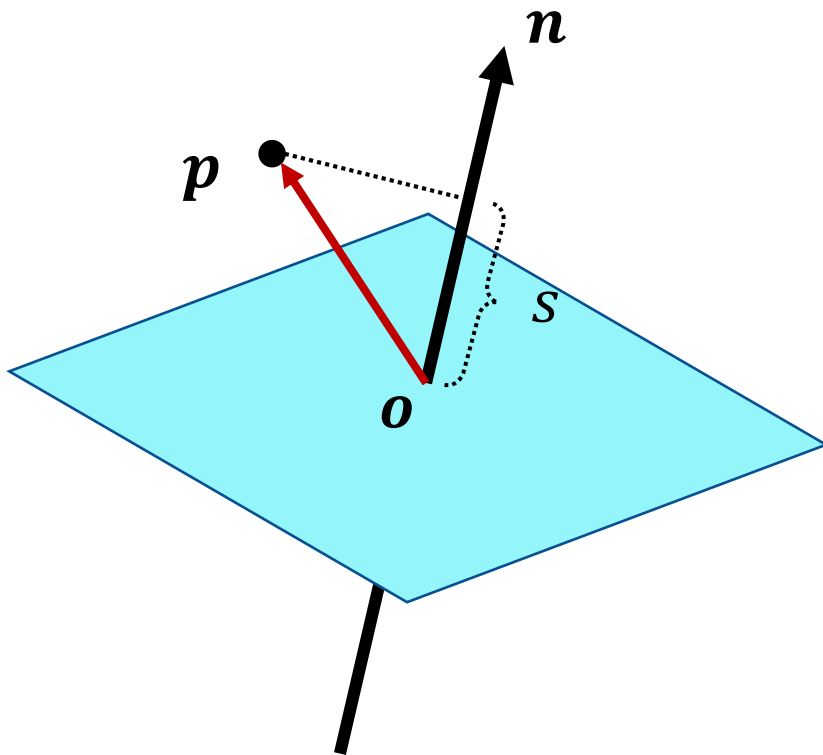
平面表示

- 平面法向 $\mathbf{n} = \mathbf{a} \times \mathbf{b} / \|\mathbf{a} \times \mathbf{b}\|$
- $\mathbf{n} \cdot (\mathbf{p} - \mathbf{o}) = 0, \forall \mathbf{p}$



平面表示

- 判断空间一点 p 与平面的关系

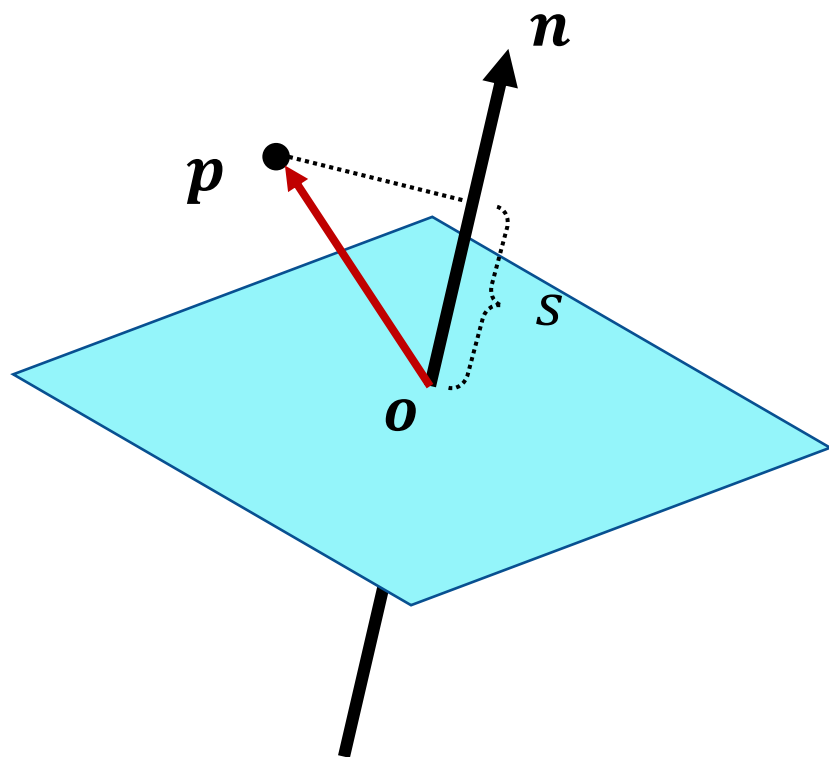


$$s = \mathbf{n} \cdot (\mathbf{p} - \mathbf{o})$$

$$= \begin{cases} s > 0, & \mathbf{p} \text{ 在平面上方} \\ s = 0, & \mathbf{p} \text{ 在平面中} \\ s < 0, & \mathbf{p} \text{ 在平面下方} \end{cases}$$

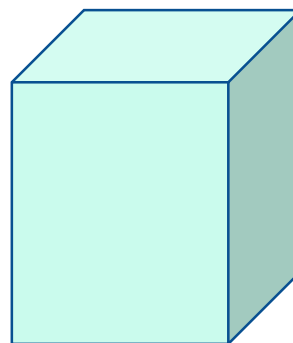
平面表示

- 判断空间一点 p 与平面的关系



$$s = \mathbf{n} \cdot (\mathbf{p} - \mathbf{o})$$

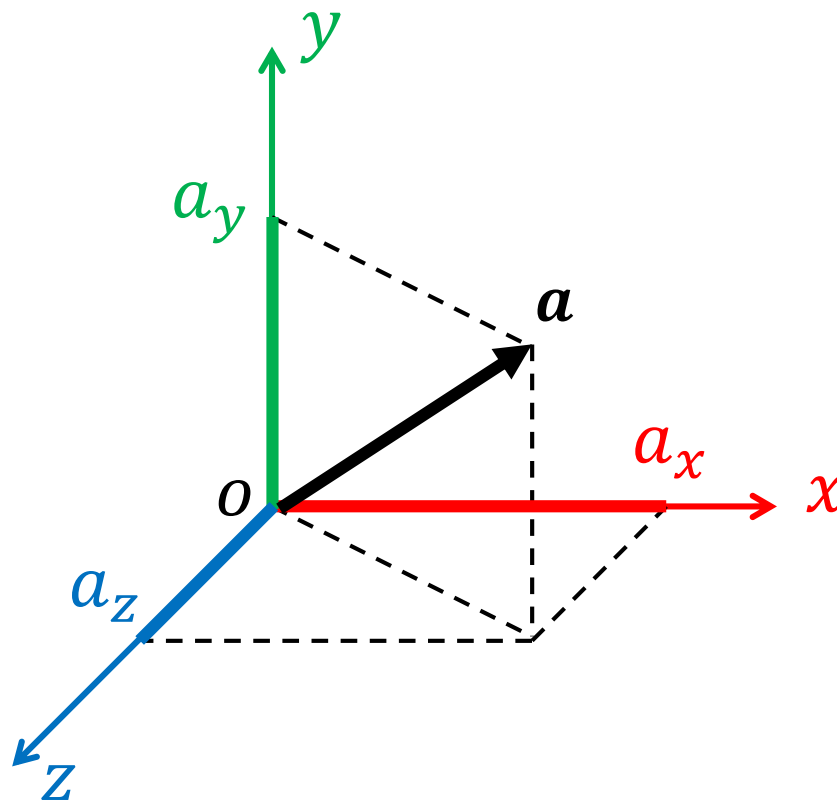
$$= \begin{cases} s > 0, & \mathbf{p} \text{ 在平面上方} \\ s = 0, & \mathbf{p} \text{ 在平面中} \\ s < 0, & \mathbf{p} \text{ 在平面下方} \end{cases}$$



如何判断一点是否在立方体内部？

直角坐标系与正交基

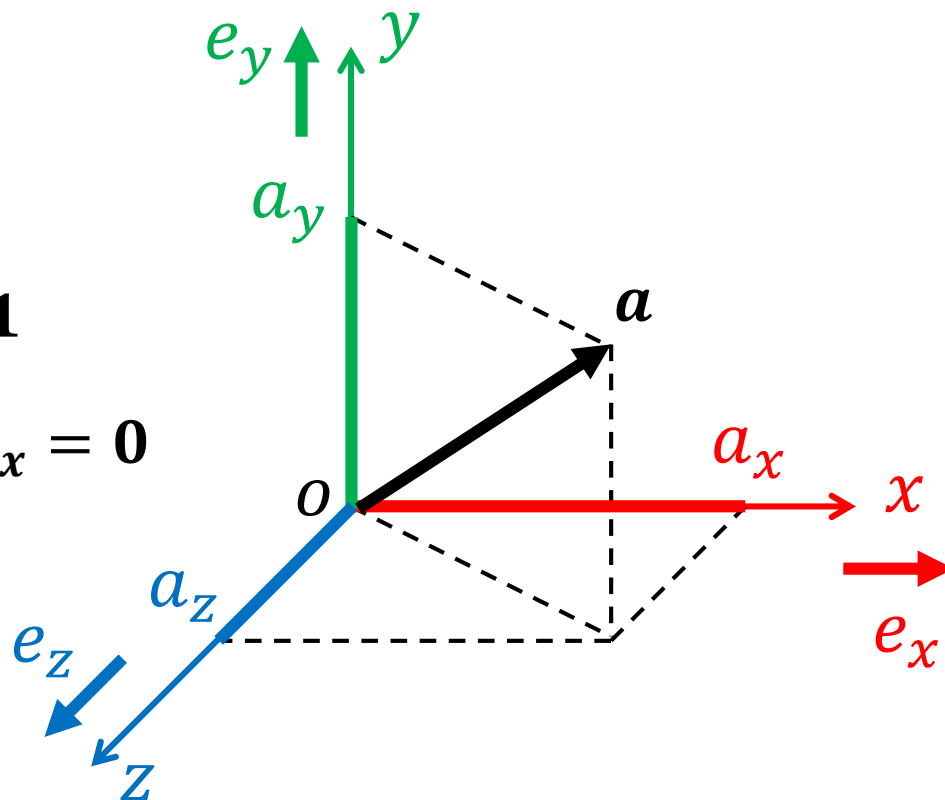
$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$



直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

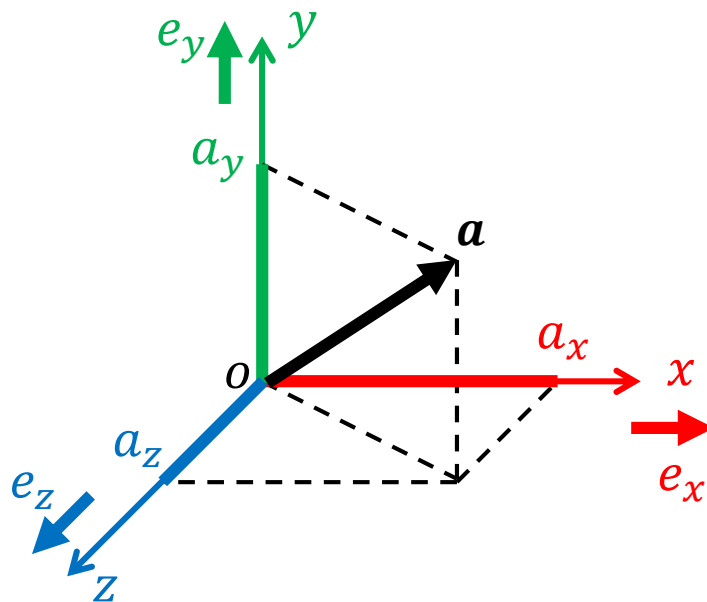
- $\|\mathbf{e}_x\| = \|\mathbf{e}_y\| = \|\mathbf{e}_z\| = 1$
- $\mathbf{e}_x \cdot \mathbf{e}_y = \mathbf{e}_y \cdot \mathbf{e}_z = \mathbf{e}_z \cdot \mathbf{e}_x = 0$
- $\mathbf{e}_x \times \mathbf{e}_y = \mathbf{e}_z$



直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

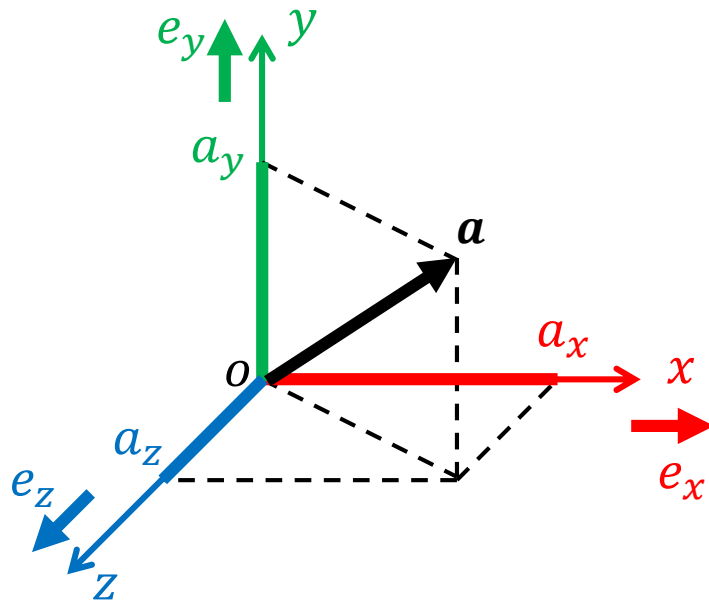
$$\mathbf{a} = a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z$$



直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

$$\mathbf{a} = a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z$$

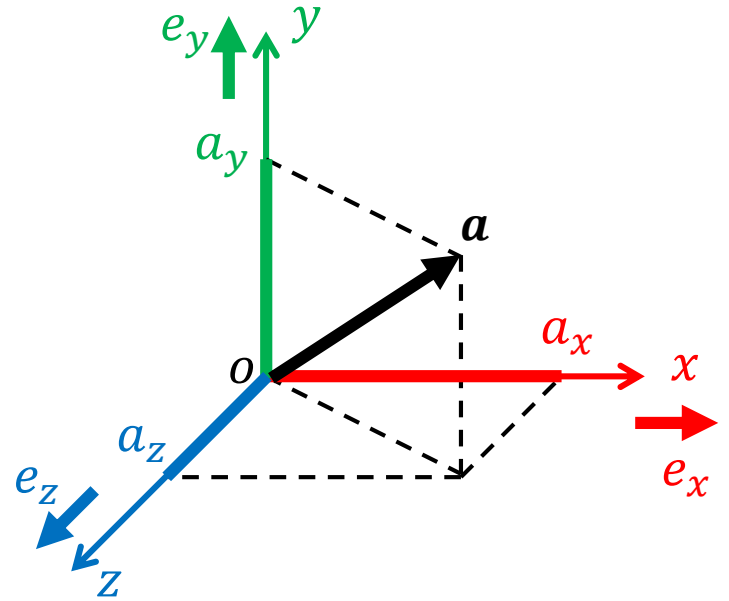


$$\begin{aligned} \mathbf{a} \cdot \mathbf{b} &= (a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z) \cdot (b_x \mathbf{e}_x + b_y \mathbf{e}_y + b_z \mathbf{e}_z) \\ &= a_x b_x \mathbf{e}_x \cdot \mathbf{e}_x + a_y b_y \mathbf{e}_y \cdot \mathbf{e}_y + a_z b_z \mathbf{e}_z \cdot \mathbf{e}_z \\ &\quad + \sum_{i \neq j} a_i b_j \mathbf{e}_i \cdot \mathbf{e}_j \end{aligned}$$

直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

$$\mathbf{a} = a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z$$



$$\mathbf{a} \cdot \mathbf{b} = (a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z) \cdot (b_x \mathbf{e}_x + b_y \mathbf{e}_y + b_z \mathbf{e}_z)$$

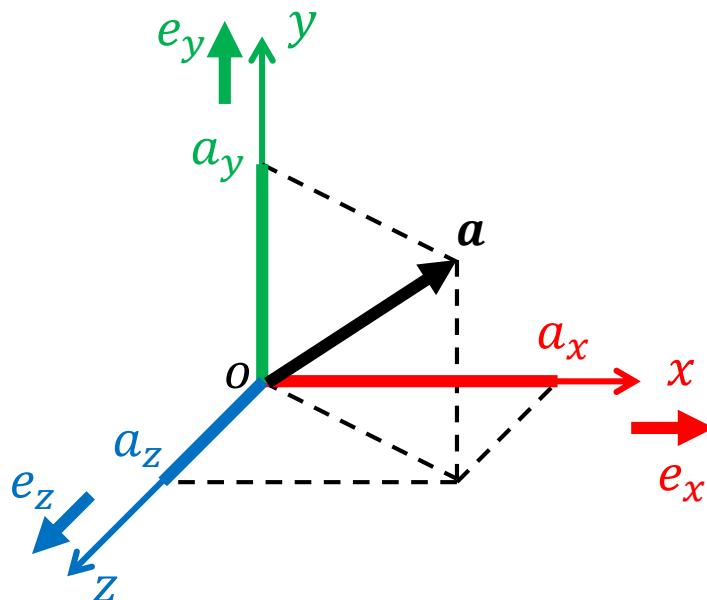
$$= a_x b_x \mathbf{e}_x \cdot \mathbf{e}_x + a_y b_y \mathbf{e}_y \cdot \mathbf{e}_y + a_z b_z \mathbf{e}_z \cdot \mathbf{e}_z$$

$$+ \sum_{i \neq j} a_i b_j \mathbf{e}_i \cdot \mathbf{e}_j$$

直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

$$\mathbf{a} = a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z$$

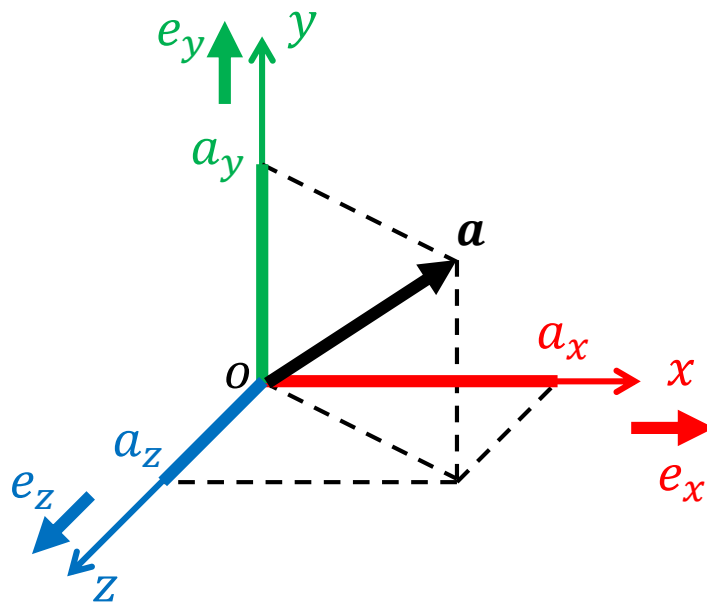


$$\begin{aligned} \mathbf{a} \times \mathbf{b} &= a_x b_x \mathbf{e}_x \times \mathbf{e}_x + a_x b_y \mathbf{e}_x \times \mathbf{e}_y + a_x b_z \mathbf{e}_x \times \mathbf{e}_z \\ &\quad + a_y b_x \mathbf{e}_y \times \mathbf{e}_x + a_y b_y \mathbf{e}_y \times \mathbf{e}_y + a_y b_z \mathbf{e}_y \times \mathbf{e}_z \\ &\quad + a_z b_x \mathbf{e}_z \times \mathbf{e}_x + a_z b_y \mathbf{e}_z \times \mathbf{e}_y + a_z b_z \mathbf{e}_z \times \mathbf{e}_z \end{aligned}$$

直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

$$\mathbf{a} = a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z$$

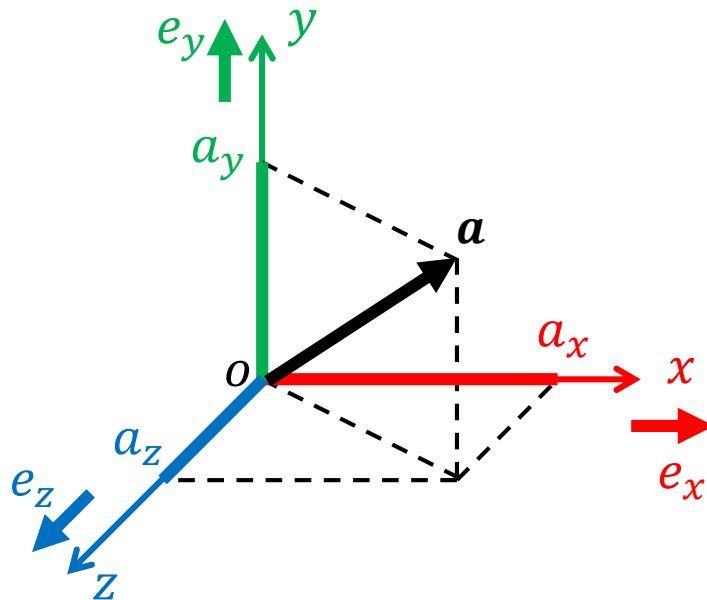


$$\begin{aligned} \mathbf{a} \times \mathbf{b} = & \cancel{a_x b_x \mathbf{e}_x \times \mathbf{e}_x} + a_x b_y \mathbf{e}_x \times \mathbf{e}_y + a_x b_z \mathbf{e}_x \times \mathbf{e}_z \\ & + a_y b_x \mathbf{e}_y \times \mathbf{e}_x + \cancel{a_y b_y \mathbf{e}_y \times \mathbf{e}_y} + a_y b_z \mathbf{e}_y \times \mathbf{e}_z \\ & + a_z b_x \mathbf{e}_z \times \mathbf{e}_x + a_z b_y \mathbf{e}_z \times \mathbf{e}_y + \cancel{a_z b_z \mathbf{e}_z \times \mathbf{e}_z} \end{aligned}$$

直角坐标系与正交基

$$\mathbf{a} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} \in \mathbb{R}^3$$

$$\mathbf{a} = a_x \mathbf{e}_x + a_y \mathbf{e}_y + a_z \mathbf{e}_z$$

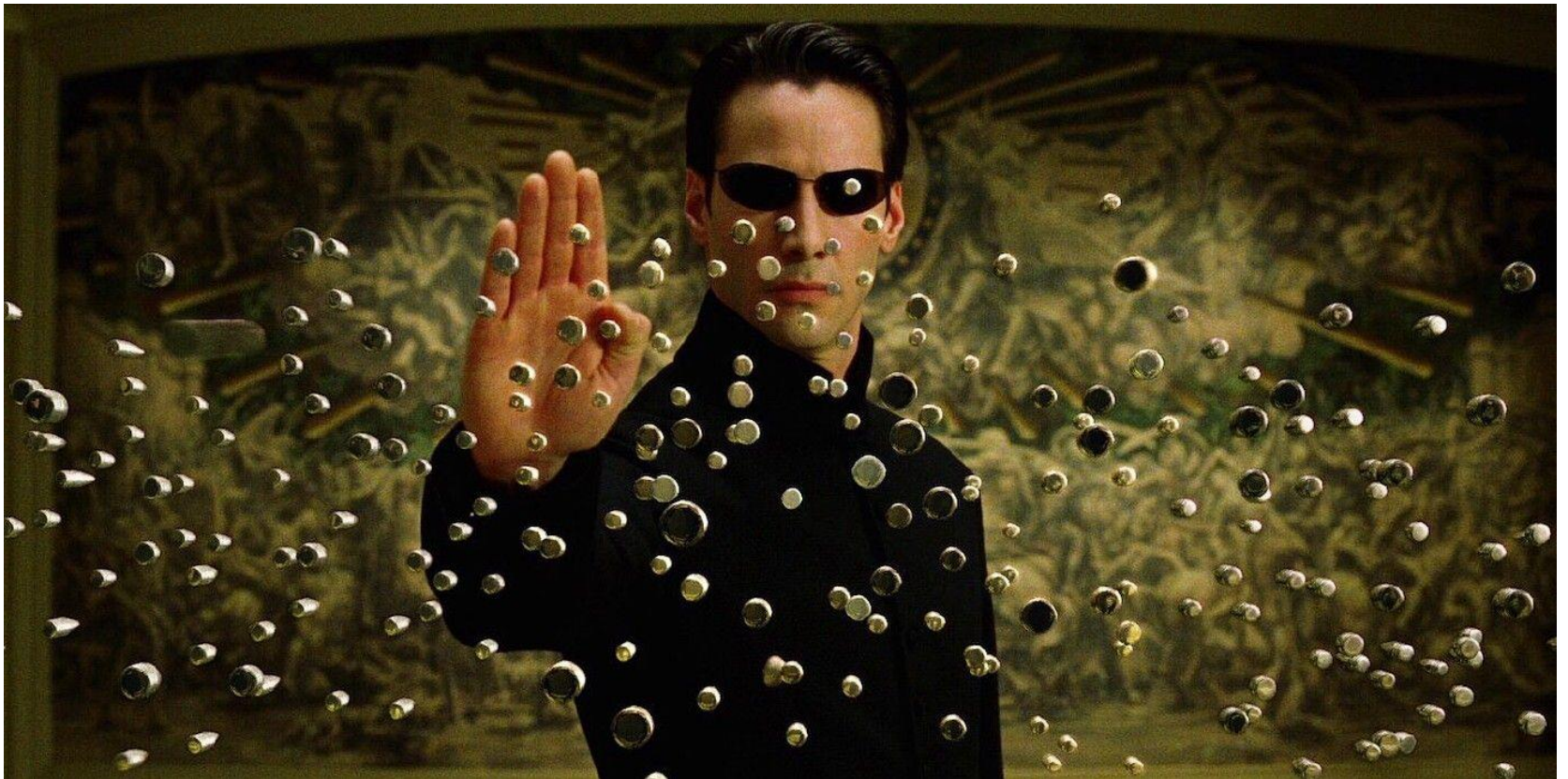


$$\begin{aligned} \mathbf{a} \times \mathbf{b} &= (a_y b_z - a_z b_y) \mathbf{e}_x \\ &\quad + (a_z b_x - a_x b_z) \mathbf{e}_y \\ &\quad + (a_x b_y - a_y b_x) \mathbf{e}_z \end{aligned}$$

矩阵

Matrix

矩阵



The Matrix

矩阵

- 二维矩形的数字阵列

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$$= [\mathbf{a}_0 \quad \mathbf{a}_1 \quad \mathbf{a}_2]$$

$$\mathbf{x} = \begin{bmatrix} x_0 \\ x_1 \\ x_2 \end{bmatrix} \in \mathbb{R}^{3 \times 1}$$

矩阵

- 二维矩形的数字阵列

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$$= [\mathbf{a}_0 \quad \mathbf{a}_1 \quad \mathbf{a}_2]$$

转置

$$A^T = \begin{bmatrix} a_{00} & a_{10} & a_{20} \\ a_{01} & a_{11} & a_{21} \\ a_{02} & a_{12} & a_{22} \end{bmatrix} = \begin{bmatrix} \mathbf{a}_0^T \\ \mathbf{a}_1^T \\ \mathbf{a}_2^T \end{bmatrix}$$

矩阵

- 二维矩形的数字阵列

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$$\begin{bmatrix} a_{00} & 0 & 0 \\ 0 & a_{11} & 0 \\ 0 & 0 & a_{22} \end{bmatrix}$$

对角阵

$$I = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

单位阵

$$\begin{bmatrix} a & d & e \\ d & b & f \\ e & f & c \end{bmatrix}$$

对称阵

$$A^T = A$$

矩阵运算

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$$sA = \begin{bmatrix} sa_{00} & sa_{01} & sa_{02} \\ sa_{10} & sa_{11} & sa_{12} \\ sa_{20} & sa_{21} & sa_{22} \end{bmatrix}$$

$$A + B = \begin{bmatrix} a_{00} + b_{00} & a_{01} + b_{01} & a_{02} + b_{02} \\ a_{10} + b_{10} & a_{11} + b_{11} & a_{12} + b_{12} \\ a_{20} + b_{20} & a_{21} + b_{21} & a_{22} + b_{22} \end{bmatrix}$$

矩阵乘法

$$C = AB = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \begin{bmatrix} b_{00} & b_{01} & b_{02} \\ b_{10} & b_{11} & b_{12} \\ b_{20} & b_{21} & b_{22} \end{bmatrix}$$

The diagram illustrates the calculation of the element c_{11} in the resulting matrix C . Two red arrows originate from the first row of matrix A (specifically a_{00}, a_{01}, a_{02}) and the second column of matrix B (specifically b_{10}, b_{11}, b_{21}). These arrows point to the element c_{11} in the resulting matrix C , which is represented by a yellow box containing a question mark. The resulting matrix C is shown as a 3x3 matrix with all elements except c_{11} marked with asterisks.

$$= \begin{bmatrix} * & ? & * \\ * & * & * \\ * & * & * \end{bmatrix}$$

c_{ij} = 矩阵 A 的第 i 行与矩阵 B 的第 j 列的点积

矩阵乘法

- 矩阵乘法规则

$$AB \neq BA$$

$$ABC = (AB)C = A(BC)$$

$$A(B + C) = AB + AC$$

$$(AB)^T = B^T A^T \quad IA = A$$

- 矩阵的逆

$$M = A^{-1} \Leftrightarrow AM = MA = I$$

$$(AB)^{-1} = B^{-1}A^{-1}$$

向量点乘

$$\begin{aligned}\boldsymbol{a} \cdot \boldsymbol{b} &= a_x b_x + a_y b_y + a_z b_z \\ &= \boldsymbol{a}^T \boldsymbol{b} \\ &= \boldsymbol{b}^T \boldsymbol{a}\end{aligned}$$

叉乘的矩阵表示

$$\mathbf{c} = \mathbf{a} \times \mathbf{b} = \begin{bmatrix} a_y b_z - a_z b_y \\ a_z b_x - a_x b_z \\ a_x b_y - a_y b_x \end{bmatrix}$$

$$= \begin{bmatrix} 0 & -a_z & a_y \\ a_z & 0 & -a_x \\ -a_y & a_x & 0 \end{bmatrix} \begin{bmatrix} b_x \\ b_y \\ b_z \end{bmatrix}$$
$$= [\mathbf{a}]_{\times} \mathbf{b}$$

$$[\mathbf{a}]_{\times} + [\mathbf{a}]_{\times}^T = \mathbf{0} \quad \text{反对称阵}$$

正交阵

- 由相互正交的单位向量构成的方阵

$$A = [\mathbf{a}_0 \quad \mathbf{a}_1 \quad \mathbf{a}_2] \quad \mathbf{a}_i^T \mathbf{a}_j = \begin{cases} 1, & \text{if } i = j \\ 0, & \text{if } i \neq j \end{cases}$$

$$A^T A = \begin{bmatrix} \mathbf{a}_0^T \\ \mathbf{a}_1^T \\ \mathbf{a}_2^T \end{bmatrix} [\mathbf{a}_0 \quad \mathbf{a}_1 \quad \mathbf{a}_2] = \begin{bmatrix} \mathbf{a}_0^T \mathbf{a}_0 & \mathbf{a}_0^T \mathbf{a}_1 & \mathbf{a}_0^T \mathbf{a}_2 \\ \mathbf{a}_1^T \mathbf{a}_0 & \mathbf{a}_1^T \mathbf{a}_1 & \mathbf{a}_1^T \mathbf{a}_2 \\ \mathbf{a}_2^T \mathbf{a}_0 & \mathbf{a}_2^T \mathbf{a}_1 & \mathbf{a}_2^T \mathbf{a}_2 \end{bmatrix} = \mathbf{I}$$

$$A^T = A^{-1}$$

三维正交矩阵的自由度

- 三维矩阵, 9个变量

$$\begin{pmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{pmatrix}$$

三维正交矩阵的自由度

- 三维矩阵, 9个变量

$$\begin{pmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{pmatrix}$$

约束: 每个列向量长度为1

$$\bullet \begin{cases} a_{11}^2 + a_{21}^2 + a_{31}^2 = 1 \\ a_{12}^2 + a_{22}^2 + a_{32}^2 = 1 \\ a_{13}^2 + a_{23}^2 + a_{33}^2 = 1 \end{cases}$$

约束: 列向量两两正交

$$\bullet \begin{cases} a_{11}a_{12} + a_{21}a_{22} + a_{31}a_{32} = 0 \\ a_{11}a_{13} + a_{21}a_{23} + a_{31}a_{33} = 0 \\ a_{12}a_{13} + a_{22}a_{23} + a_{32}a_{33} = 0 \end{cases}$$

三维正交矩阵的自由度

- 三维矩阵, 9个变量

$$\begin{pmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{pmatrix}$$

约束: 每个列向量长度为1

$$\bullet \begin{cases} a_{11}^2 + a_{21}^2 + a_{31}^2 = 1 \\ a_{12}^2 + a_{22}^2 + a_{32}^2 = 1 \\ a_{13}^2 + a_{23}^2 + a_{33}^2 = 1 \end{cases}$$

约束: 列向量两两正交

$$\bullet \begin{cases} a_{11}a_{12} + a_{21}a_{22} + a_{31}a_{32} = 0 \\ a_{11}a_{13} + a_{21}a_{23} + a_{31}a_{33} = 0 \\ a_{12}a_{13} + a_{22}a_{23} + a_{32}a_{33} = 0 \end{cases}$$

自由度 = 3

矩阵的行列式

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$$\det A = \begin{vmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{vmatrix}$$

determinant

矩阵的行列式

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$\det A = \begin{vmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{vmatrix}$

$a_{00} \quad a_{01} \quad a_{02}$

$a_{10} \quad a_{11} \quad a_{12}$

$a_{20} \quad a_{21} \quad a_{22}$

矩阵的行列式

$$A = \begin{bmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{bmatrix} \in \mathbb{R}^{3 \times 3}$$

$\det A = \begin{vmatrix} a_{00} & a_{01} & a_{02} \\ a_{10} & a_{11} & a_{12} \\ a_{20} & a_{21} & a_{22} \end{vmatrix}$

The diagram shows the matrix elements a_{ij} with blue arrows indicating the positive terms and red arrows indicating the negative terms in the determinant calculation.

矩阵的行列式

- $\det I = 1$
- $\det A * B = \det A * \det B$
- $\det A^T = \det A$
- 当 A 可逆时, $\det A^{-1} = (\det A)^{-1}$
- 当 U 是正交阵时, $\det U = \pm 1$

向量叉乘与行列式

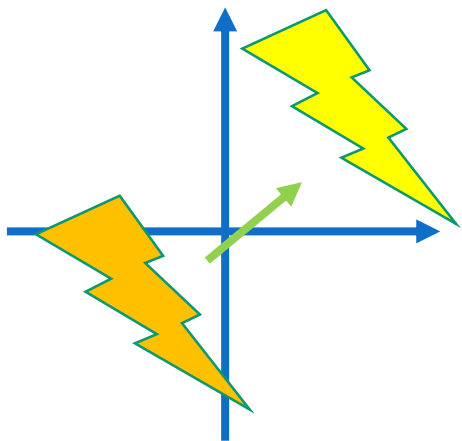
$$\mathbf{c} = \mathbf{a} \times \mathbf{b} = \begin{bmatrix} a_y b_z - a_z b_y \\ a_z b_x - a_x b_z \\ a_x b_y - a_y b_x \end{bmatrix}$$

$$= \det \begin{bmatrix} \mathbf{i} & \mathbf{j} & \mathbf{k} \\ a_x & a_y & a_z \\ b_x & b_y & b_z \end{bmatrix}$$

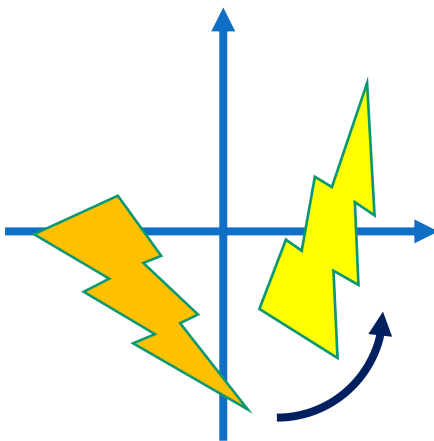
变换

Transform

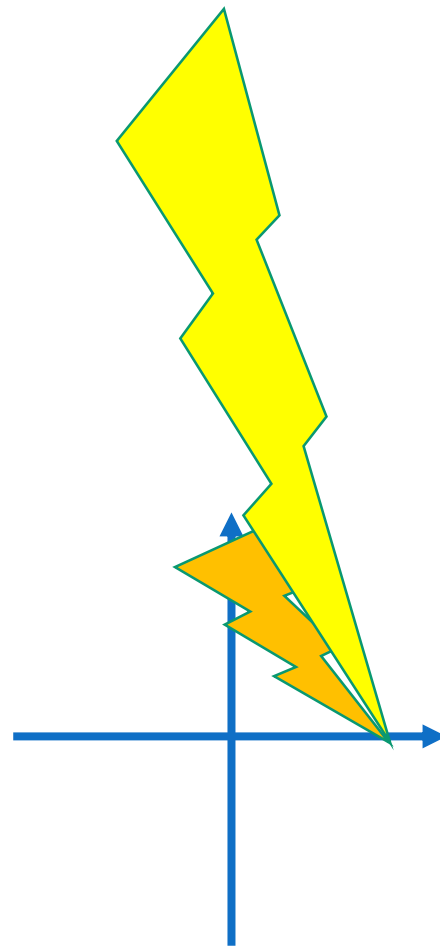
变换 = 平移 + 旋转 + 伸缩



平移

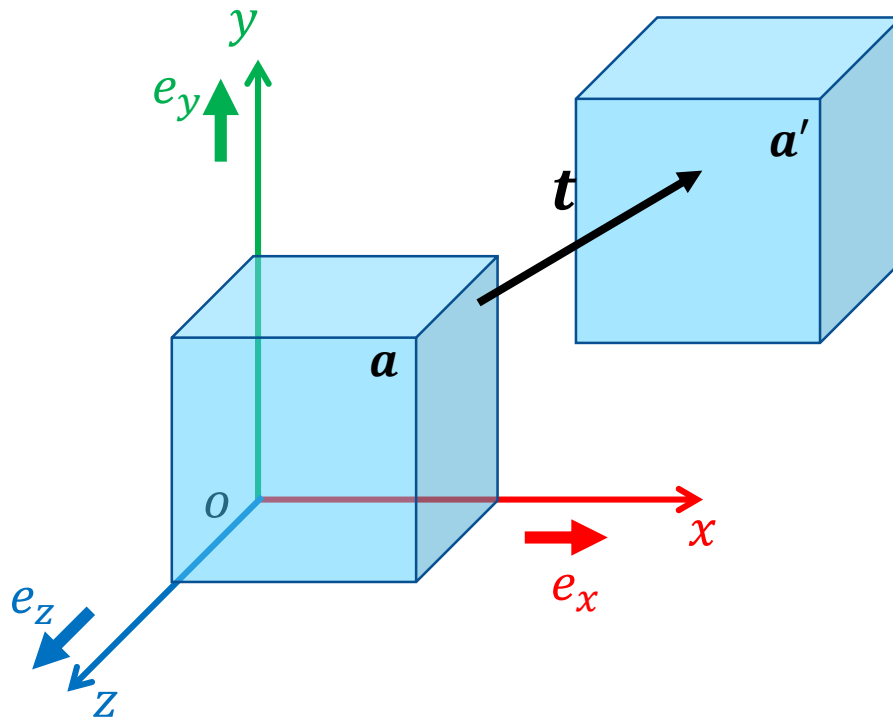


旋转



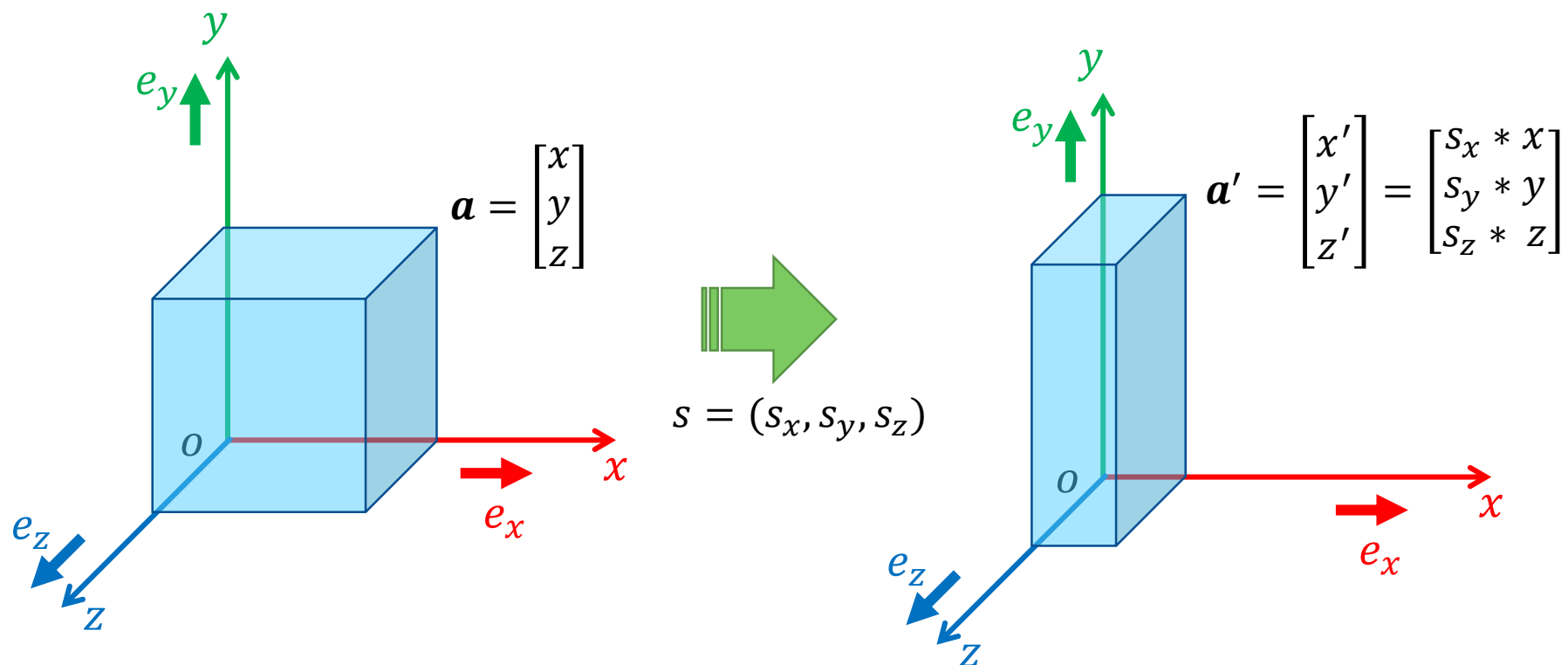
伸缩

平移

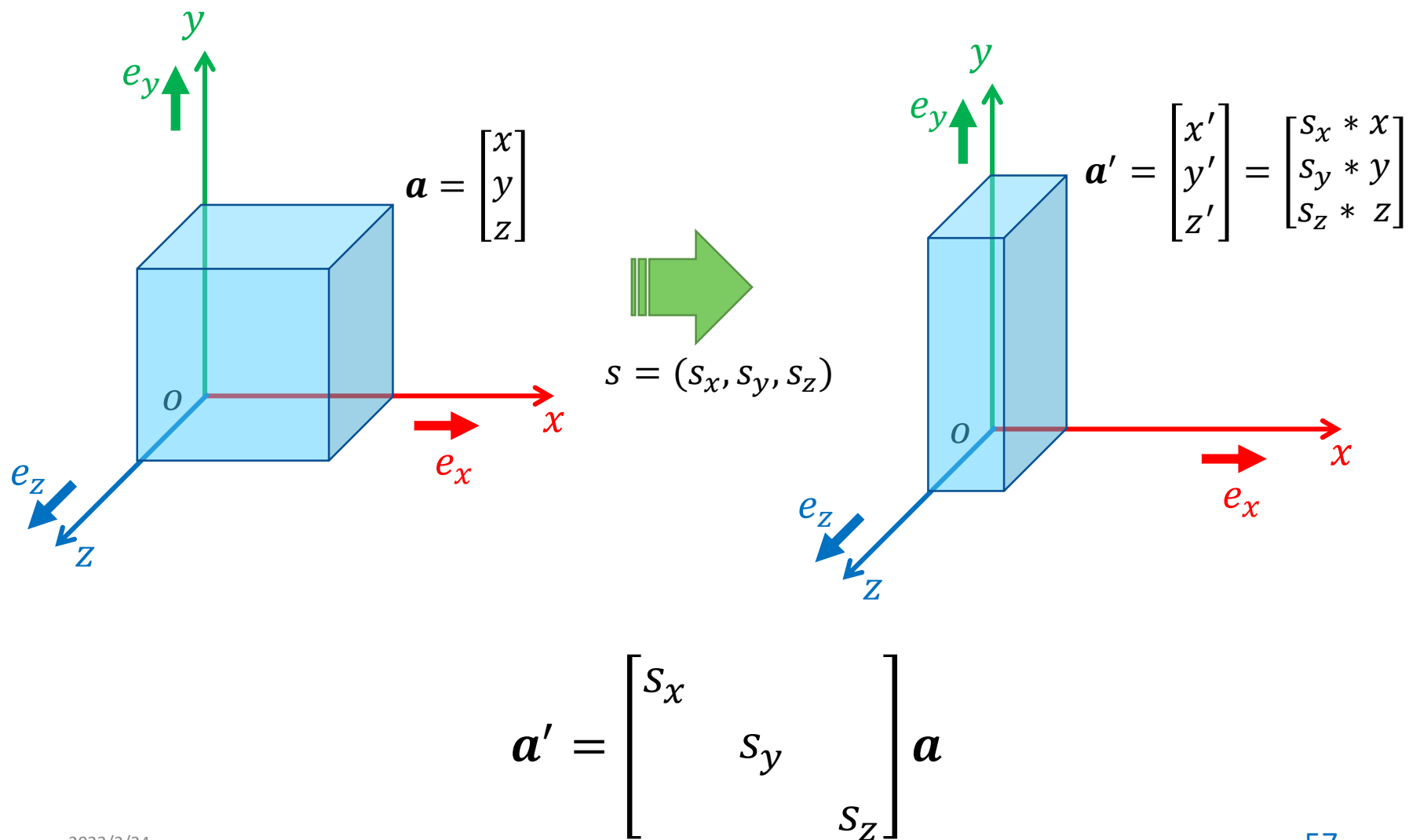


$$a' = a + t$$

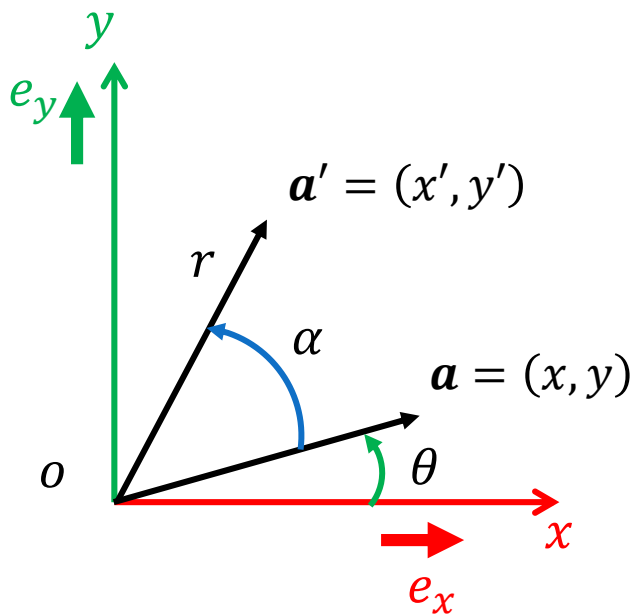
伸缩



伸缩



二维旋转

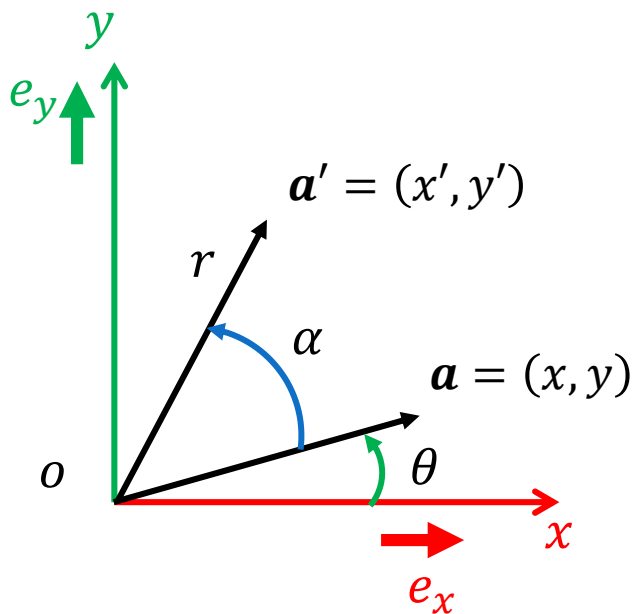


- 平面上向量 $\mathbf{a} = (x, y)$, 绕原点逆时针旋转 α , 得到 $\mathbf{a}' = (x', y')$
- 旋转前后坐标

$$\begin{cases} x = r \cos \theta \\ y = r \sin \theta \end{cases}$$

$$\begin{cases} x' = r \cos(\theta + \alpha) \\ y' = r \sin(\theta + \alpha) \end{cases}$$

二维旋转

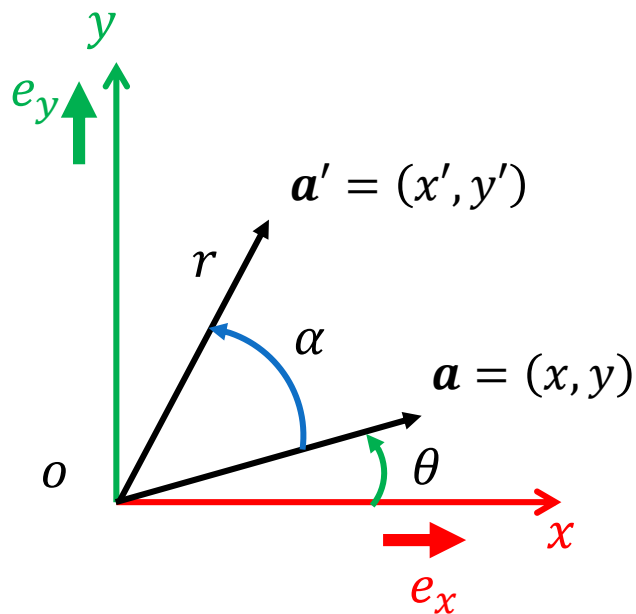


- 平面上向量 $\mathbf{a} = (x, y)$, 绕原点逆时针旋转 α , 得到 $\mathbf{a}' = (x', y')$
- 考虑到三角公式

$$\begin{aligned}x' &= r \cos \theta \cos \alpha - r \sin \theta \sin \alpha \\ &= x \cos \alpha - y \sin \alpha\end{aligned}$$

$$\begin{aligned}y' &= r \sin \theta \cos \alpha + r \cos \theta \sin \alpha \\ &= x \sin \alpha + y \cos \alpha\end{aligned}$$

二维旋转



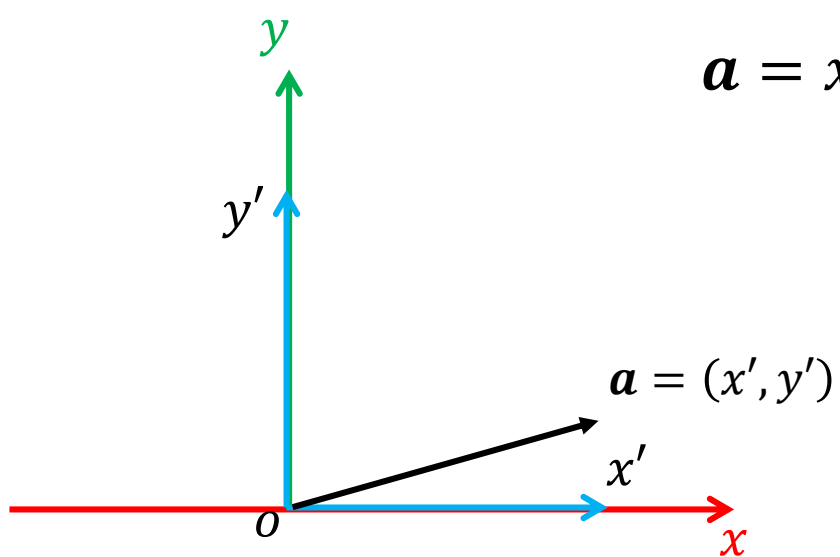
- 平面上向量 $\mathbf{a} = (x, y)$, 绕原点逆时针旋转 α , 得到 $\mathbf{a}' = (x', y')$
- 写成矩阵

$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} \cos \alpha & -\sin \alpha \\ \sin \alpha & \cos \alpha \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix}$$

或者

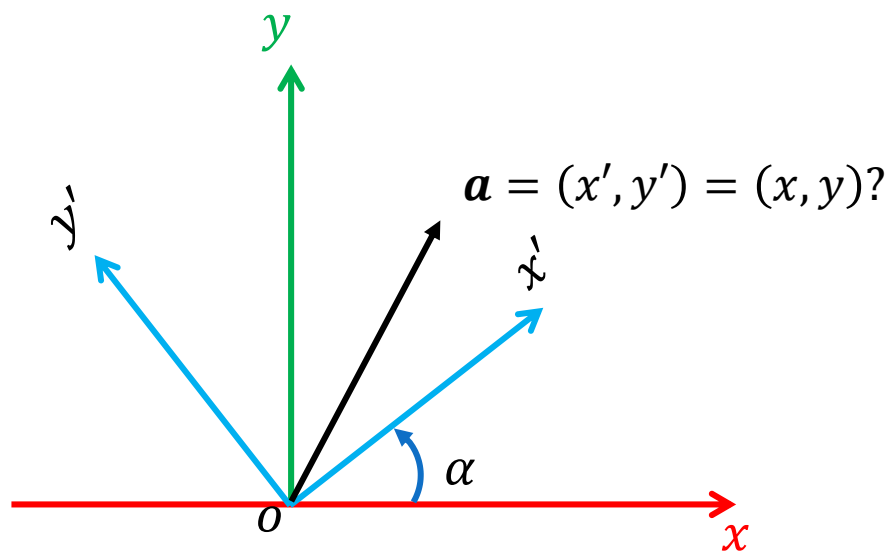
$$\mathbf{a}' = \mathbf{R}\mathbf{a}$$

二维旋转：坐标变换

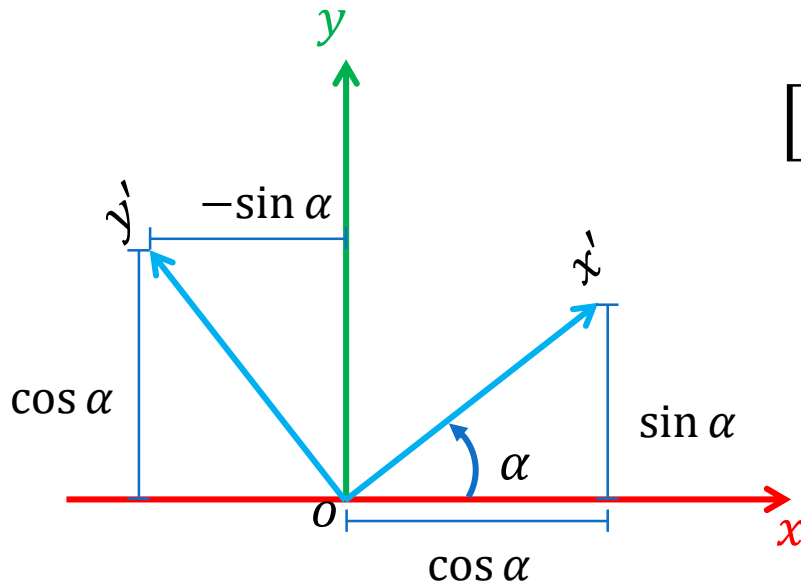


$$\mathbf{a} = x' \mathbf{e}_{x'} + y' \mathbf{e}_{y'} = [\mathbf{e}_{x'}, \mathbf{e}_{y'}] \begin{bmatrix} x' \\ y' \end{bmatrix}$$

二维旋转：坐标变换

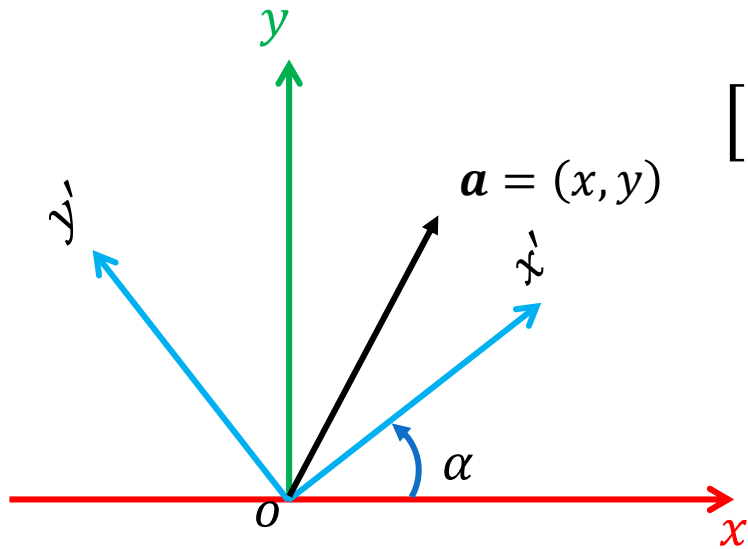


二维旋转：坐标变换



$$[e'_{x'}, e'_{y'}] = [e_x, e_y] \begin{bmatrix} \cos \alpha & -\sin \alpha \\ \sin \alpha & \cos \alpha \end{bmatrix}$$

二维旋转：坐标变换



$$[\mathbf{e}'_x, \mathbf{e}'_y] = [\mathbf{e}_x, \mathbf{e}_y] \begin{bmatrix} \cos \alpha & -\sin \alpha \\ \sin \alpha & \cos \alpha \end{bmatrix}$$

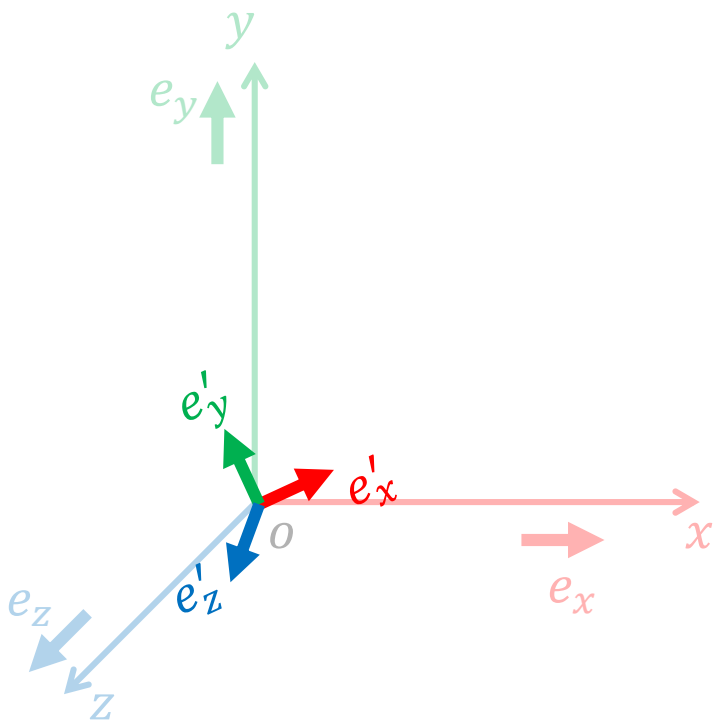
$$\begin{aligned} \mathbf{a} &= [\mathbf{e}'_x, \mathbf{e}'_y] \begin{bmatrix} x' \\ y' \end{bmatrix} \\ &= [\mathbf{e}_x, \mathbf{e}_y] \begin{bmatrix} \cos \alpha & -\sin \alpha \\ \sin \alpha & \cos \alpha \end{bmatrix} \begin{bmatrix} x' \\ y' \end{bmatrix} \end{aligned}$$

三维旋转: 坐标变换

$$[e'_x, e'_y, e'_z] = [e_x, e_y, e_z] \begin{bmatrix} \text{red} & \text{green} & \text{blue} \\ \text{red} & \text{green} & \text{blue} \\ \text{red} & \text{green} & \text{blue} \end{bmatrix}$$

$$= [e_x, e_y, e_z] R$$

- 每一列代表变换后的坐标轴在原坐标系下的坐标值
- 每一个列向量都是单位向量
- 向量之间两两正交
- 旋转矩阵是正交矩阵
- $\det R = 1$

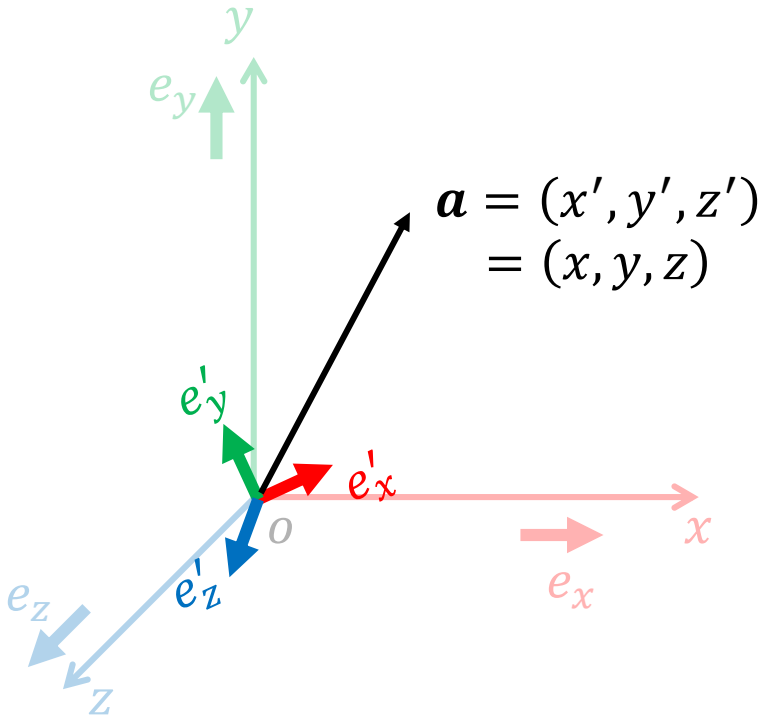


三维旋转: 坐标变换

$$[e'_x, e'_y, e'_z] = [e_x, e_y, e_z] \begin{bmatrix} \text{red} & \text{green} & \text{blue} \\ \text{red} & \text{green} & \text{blue} \\ \text{red} & \text{green} & \text{blue} \end{bmatrix}$$

$$= [e_x, e_y, e_z] R$$

$$\begin{bmatrix} x \\ y \\ z \end{bmatrix} = R \begin{bmatrix} x' \\ y' \\ z' \end{bmatrix}$$

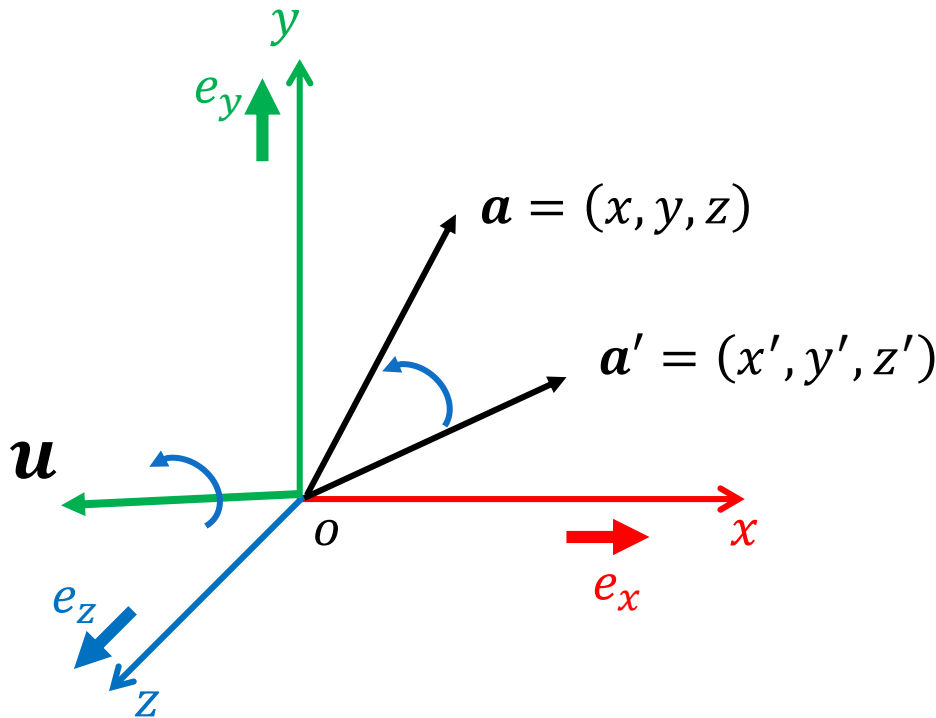


三维旋转: 坐标变换

$$[e'_x, e'_y, e'_z] = [e_x, e_y, e_z] \begin{bmatrix} \text{red} & \text{green} & \text{blue} \\ \text{red} & \text{green} & \text{blue} \\ \text{red} & \text{green} & \text{blue} \end{bmatrix}$$

$$= [e_x, e_y, e_z] R$$

$$\begin{bmatrix} x \\ y \\ z \end{bmatrix} = R \begin{bmatrix} x' \\ y' \\ z' \end{bmatrix}$$



三维旋转: 绕x, y, z轴旋转矩阵

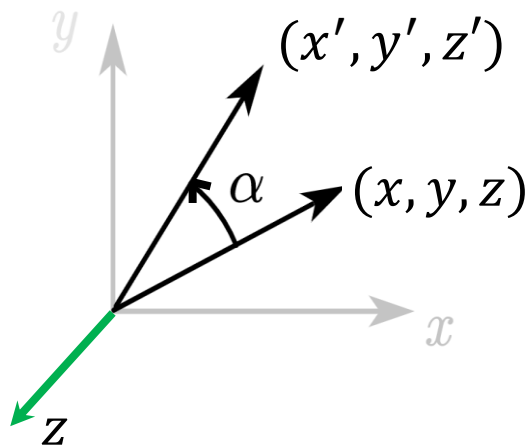


图: 绕z轴旋转

二维旋转
$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} \cos \alpha & -\sin \alpha \\ \sin \alpha & \cos \alpha \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix}$$



绕z轴旋转
$$R_z(\alpha) = \begin{pmatrix} \cos \alpha & -\sin \alpha & 0 \\ \sin \alpha & \cos \alpha & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

三维旋转: 绕x, y, z轴旋转矩阵

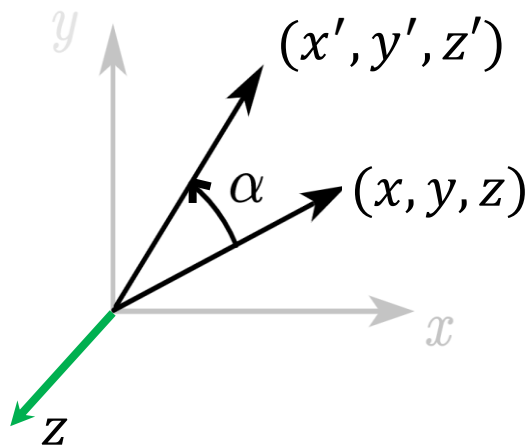


图: 绕z轴旋转

绕x轴旋转 $R_x(\alpha) = \begin{pmatrix} 1 & 0 & 0 \\ 0 & \cos \alpha & -\sin \alpha \\ 0 & \sin \alpha & \cos \alpha \end{pmatrix}$

绕y轴旋转 $R_y(\alpha) = \begin{pmatrix} \cos \alpha & 0 & \sin \alpha \\ 0 & 1 & 0 \\ -\sin \alpha & 0 & \cos \alpha \end{pmatrix}$

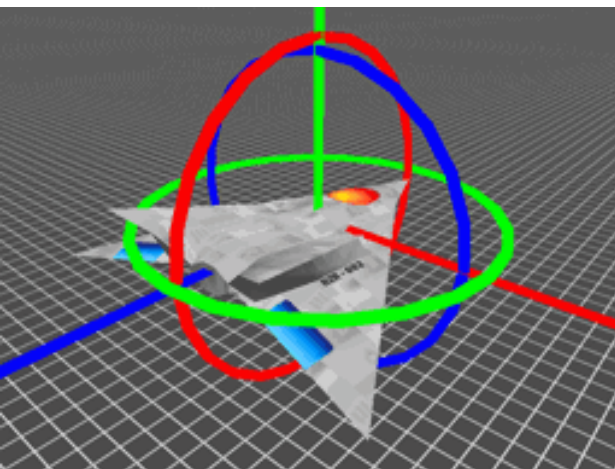
绕z轴旋转 $R_z(\alpha) = \begin{pmatrix} \cos \alpha & -\sin \alpha & 0 \\ \sin \alpha & \cos \alpha & 0 \\ 0 & 0 & 1 \end{pmatrix}$

三维旋转的表示

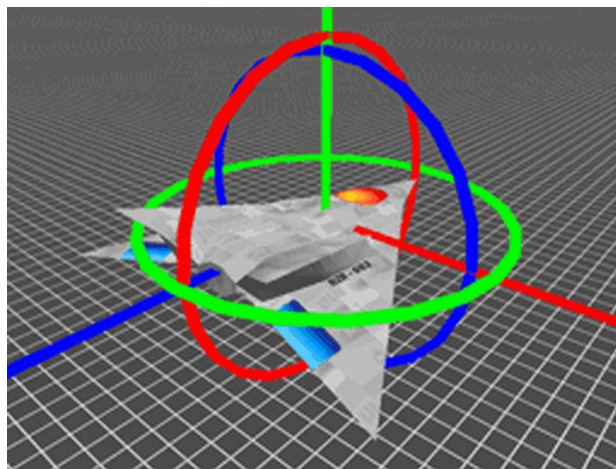
- 旋转矩阵 (Rotation Matrix)
- 欧拉角 (Euler Angle)
- 轴角表示法 (Axis-Angle)
- 四元数 (Quaternion)

欧拉角 (Euler Angle)

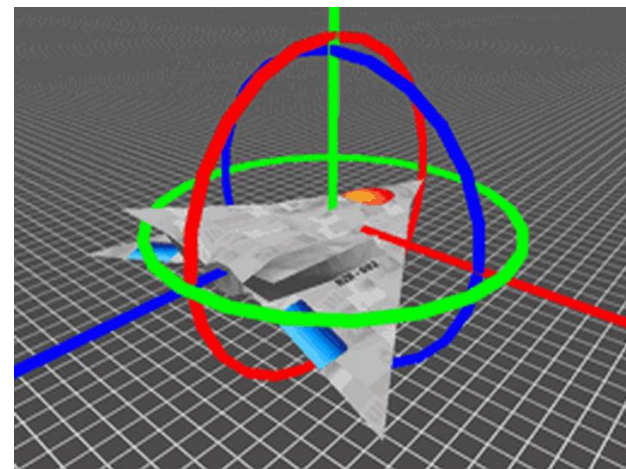
- 任何三维旋转可以分解成三个基本旋转的叠加
- 例如：



Pitch(俯仰)
绕 x 轴旋转 $R_x(\alpha)$



Yaw(偏航)
绕 y 轴旋转 $R_y(\beta)$



Roll(翻滚)
绕 z 轴旋转, $R_z(\gamma)$

可以用三个角度表示旋转, 叫做欧拉角

欧拉角有不同旋转顺序

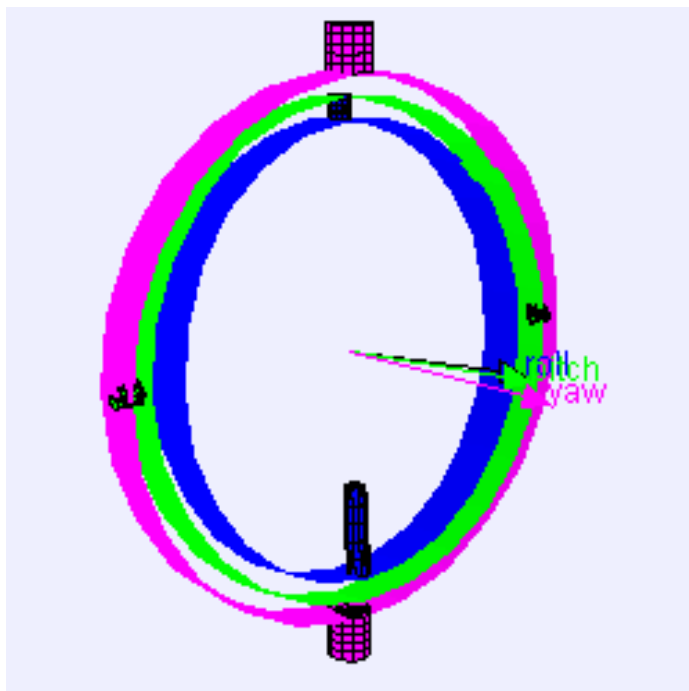
- 先绕 x 轴旋转,
再绕 y 轴旋转,
最后绕 z 轴旋转

$$\mathbf{p}' = R_z(\gamma) R_y(\beta) R_x(\alpha) \mathbf{p}$$

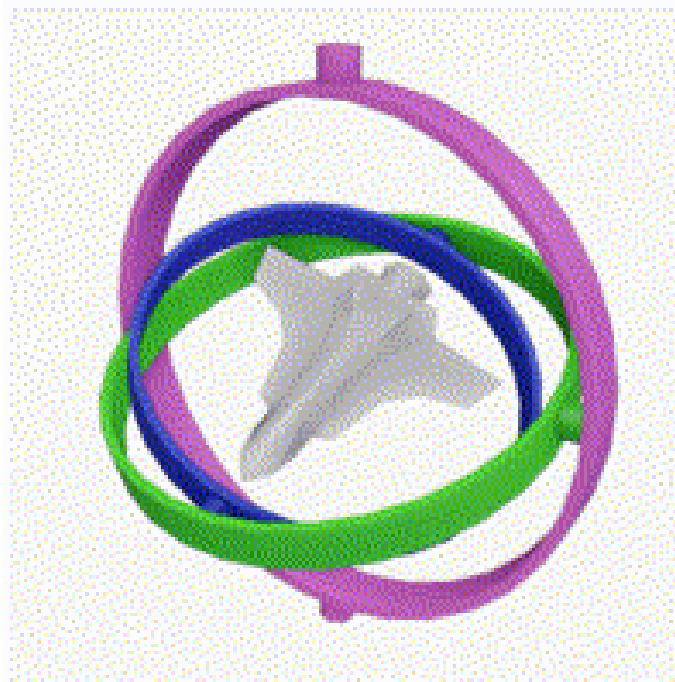
- 先绕 z 轴旋转,
再绕 x 轴旋转,
最后绕 y 轴旋转

$$\mathbf{p}'' = R_y(\beta) R_x(\alpha) R_z(\gamma) \mathbf{p}$$

欧拉角的万向锁(Gimbal lock)现象



正常旋转



两个轴平行，
丢失一个自由度

三维旋转的欧拉角表示

- 三个角度, 三个自由度
- 万向锁问题
- 同一个旋转可以由多组不同的欧拉角表示
 - 要求连续两次旋转不共轴
 - 共12种组合 XYZ, ZYX, XYX, ...

三维旋转的表示

- 旋转矩阵 (Rotation Matrix)
- 欧拉角 (Euler Angle)
- 轴角表示法 (Axis-Angle)
- 四元数 (Quaternion)

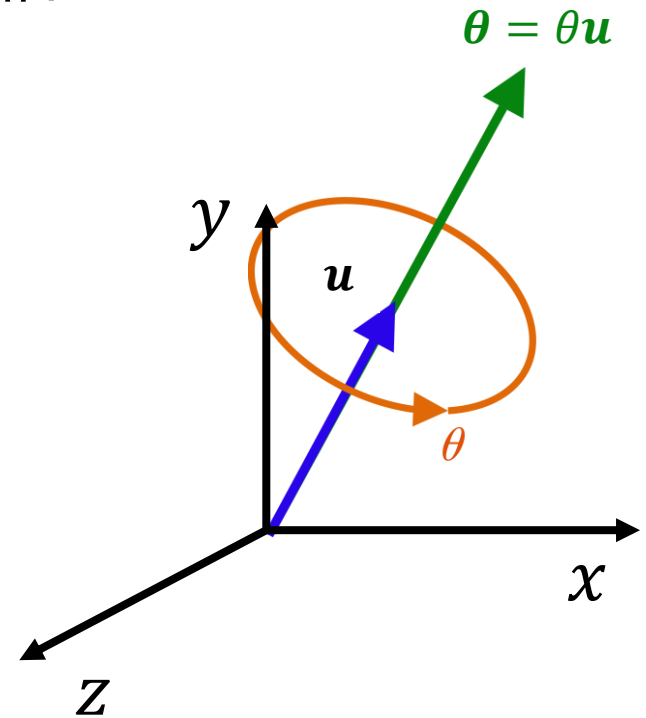
轴角表示

- 任意三维旋转可以表示成
 - 一个单位向量 \mathbf{u} ，代表旋转轴
 - 一个数 θ ，代表旋转角度

的组合 (\mathbf{u}, θ)

- 旋转向量 (rotation vector)

$$\boldsymbol{\theta} = \theta \mathbf{u}$$



轴角表示下的旋转

- Rodrigues' Rotation Formula
- 对于轴角表示 (\mathbf{u}, θ)

$$\mathbf{R} = \mathbf{I} + \sin \theta [\mathbf{u}]_{\times} + (1 - \cos \theta) [\mathbf{u}]_{\times}^2$$

$$[\mathbf{u}]_{\times} = \begin{bmatrix} 0 & -u_z & u_y \\ u_z & 0 & -u_x \\ -u_y & u_x & 0 \end{bmatrix}$$

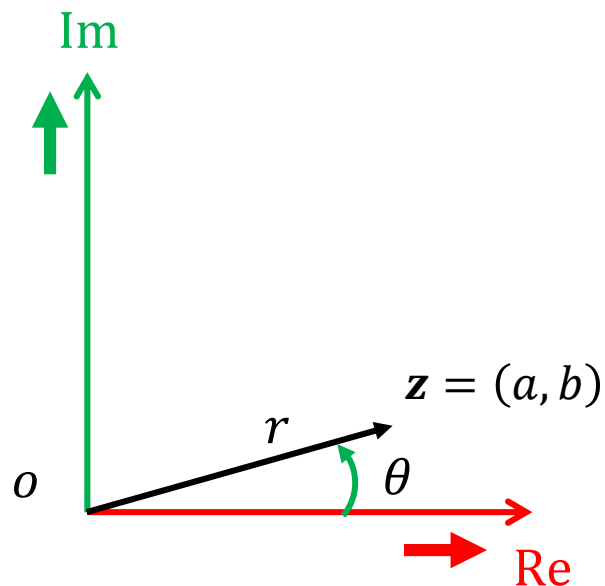
三维旋转的轴角表示

- 没有万向锁问题
- 同一个旋转可能有多种表示方式
 - (\mathbf{u}, θ) , $(-\mathbf{u}, -\theta)$, $(\mathbf{u}, \theta + 2n\pi)$
- 多次旋转叠加, 旋转轴较难直接计算

三维旋转的表示

- 旋转矩阵 (Rotation Matrix)
- 欧拉角 (Euler Angle)
- 轴角表示法 (Axis-Angle)
- 四元数 (Quaternion)

复数与二维旋转

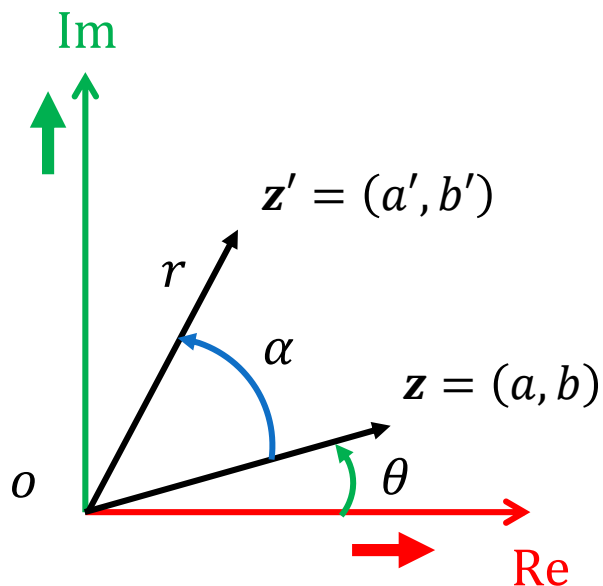


- 复数 $z = a + bi \in \mathbb{C}$
- 其中 $a, b \in \mathbb{R}$, 且 $i^2 = -1$
- 欧拉公式

$$z = re^{i\theta} = r(\cos \theta + i \sin \theta)$$

$$r = \sqrt{a^2 + b^2}$$
$$\theta = \arctan \frac{b}{a}$$

复数与二维旋转



- 复数 $z = a + bi \in \mathbb{C}$

- 旋转 α , $z' = a' + b'i$

- 欧拉公式

$$\begin{aligned} z' &= r e^{i(\theta+\alpha)} \\ &= e^{i\alpha} \times r e^{i\theta} \\ &= e^{i\alpha} z \end{aligned}$$

单位复数 \rightarrow 二维旋转

四元数 (Quaternion)

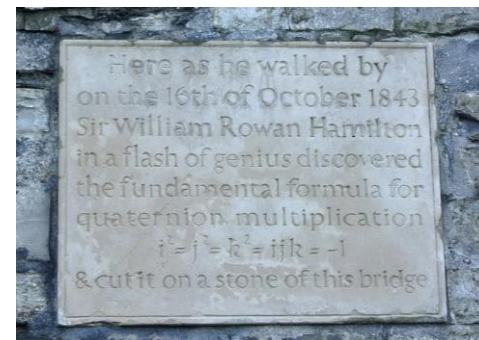
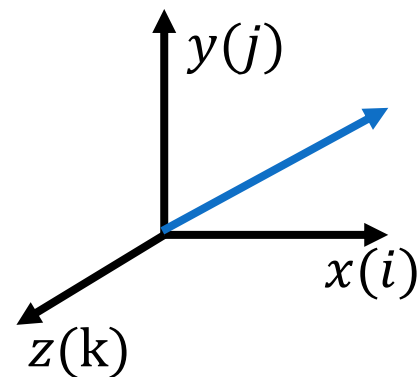
- “扩展”的复数

- 定义 $q = a + bi + cj + dk \in \mathbb{H}$, $a, b, c, d \in \mathbb{R}$

- 其中 $i^2 = j^2 = k^2 = ijk = -1$
- $ij = k, ji = -k$ (单位向量叉乘)
- $jk = i, kj = -i$
- $ki = j, ik = -j$

- 可以用一个三维的向量来表示虚部

- $q = [w, \mathbf{v}]$, $\mathbf{v} = (x, y, z)^T$
- 纯四元数 $q = [0, \mathbf{v}]$ 实部为0, 只有虚部三维向量



William Rowan Hamilton
发明了四元数

四元数的性质

- 模长 $\|q\| = \sqrt{a^2 + b^2 + c^2 + d^2} = \sqrt{w^2 + v \cdot v}$

- 加法

$$q_1 = a_1 + b_1i + c_1j + d_1k = w_1 + v_1$$

$$q_2 = a_2 + b_2i + c_2j + d_2k = w_2 + v_2$$

$$\begin{aligned} q_1 + q_2 &= (a_1 + a_2) + (b_1 + b_2)i + (c_1 + c_2)j + (d_1 + d_2)k \\ &= (w_1 + w_2) + (v_1 + v_2) \end{aligned}$$

- 标量乘法 $tq_1 = ta_1 + tb_1i + tc_1j + td_1k$

- 点乘 $q_1 \cdot q_2 = a_1a_2 + b_1b_2 + c_1c_2 + d_1d_2$ (类比向量点乘)

四元数乘法

$$\begin{aligned} \mathbf{q}_1 \mathbf{q}_2 &= (a_1 + b_1 i + c_1 j + d_1 k) \\ &\quad * (a_2 + b_2 i + c_2 j + d_2 k) \end{aligned}$$

展开一共 $4 \times 4 = 16$ 项

$$\begin{aligned} \mathbf{q}_1 \mathbf{q}_2 &= a_1 a_2 - b_1 b_2 - c_1 c_2 - d_1 d_2 \\ &\quad + (b_1 a_2 + a_1 b_2 - d_1 c_2 + c_1 d_2) i \\ &\quad + (c_1 a_2 + d_1 b_2 + a_1 c_2 - b_1 d_2) j \\ &\quad + (d_1 a_2 - c_1 b_2 + b_1 c_2 + a_1 d_2) k \end{aligned}$$

注意：

$$i^2 = j^2 = k^2 = ijk = -1$$

$$ij = k, ji = -k \text{ (单位向量叉乘)}$$

$$jk = i, kj = -i$$

$$ki = j, ik = -j$$

四元数乘法

$$\begin{aligned} \mathbf{q}_1 \mathbf{q}_2 &= (a_1 + b_1 i + c_1 j + d_1 k) \\ &\quad * (a_2 + b_2 i + c_2 j + d_2 k) \end{aligned}$$

- 写成矩阵形式

$$\mathbf{q}_1 \mathbf{q}_2 = \begin{pmatrix} a_1 & -b_1 & -c_1 & -d_1 \\ b_1 & a_1 & -d_1 & c_1 \\ c_1 & d_1 & a_1 & -b_1 \\ d_1 & -c_1 & b_1 & a_1 \end{pmatrix} \begin{pmatrix} a_1 \\ b_1 \\ c_1 \\ d_1 \end{pmatrix}$$

四元数乘法

$$\begin{aligned} \mathbf{q}_1 \mathbf{q}_2 &= (a_1 + b_1 i + c_1 j + d_1 k) \\ &\quad * (a_2 + b_2 i + c_2 j + d_2 k) \end{aligned}$$

- 或者 (Grassmann Inner Product)

$$\mathbf{q} = [w, \mathbf{v}], \mathbf{v} = (x, y, z)^\top$$

$$\begin{aligned} \mathbf{q}_1 \mathbf{q}_2 &= [w_1 w_2 - \mathbf{v}_1 \cdot \mathbf{v}_2, \\ &\quad w_1 \mathbf{v}_2 + w_2 \mathbf{v}_1 + \mathbf{v}_1 \times \mathbf{v}_2] \end{aligned}$$

四元数性质

- $\mathbf{q}_1 \mathbf{q}_2 \neq \mathbf{q}_2 \mathbf{q}_1$, 与矩阵乘法类似, 不满足交换律
- 四元数的逆 $\mathbf{q} \mathbf{q}^{-1} = \mathbf{q}^{-1} \mathbf{q} = 1$, 也即 $[1, (0, 0, 0)]$
- 四元数 $\mathbf{q} = a + bi + ck + dj$ 的共轭四元数
$$\mathbf{q}^* = a - bi - cj - dk$$
 - $\mathbf{q} = [w, \mathbf{v}]$ 的共轭可以写成 $\mathbf{q}^* = [w, -\mathbf{v}]$
- $\mathbf{q} \mathbf{q}^* = \mathbf{q}^* \mathbf{q} = \|\mathbf{q}\|^2$, 也即 $[\|\mathbf{q}\|^2, (0, 0, 0)]$
- 四元数的逆 $\mathbf{q}^{-1} = \frac{\mathbf{q}^*}{\|\mathbf{q}\|^2}$

单位四元数

- 模长为 **1** 的四元数

$$\boldsymbol{q} = \frac{\tilde{\boldsymbol{q}}}{\|\tilde{\boldsymbol{q}}\|}$$

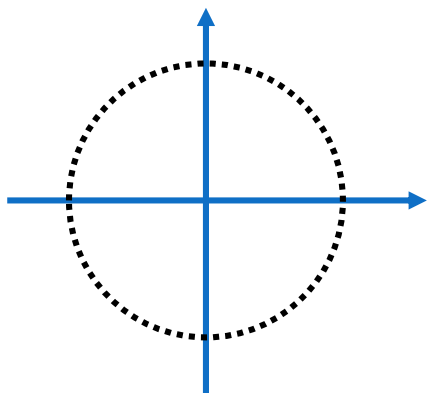
- 可记为 $\boldsymbol{q} = [w, \boldsymbol{v}] = [\cos \frac{\theta}{2}, \boldsymbol{u} \sin \frac{\theta}{2}]$, $\|\boldsymbol{u}\| = 1, \theta \in \mathbb{R}$
- 单位四元数的逆 $\boldsymbol{q}^{-1} = \boldsymbol{q}^*$

单位四元数

- 模长为 **1** 的四元数

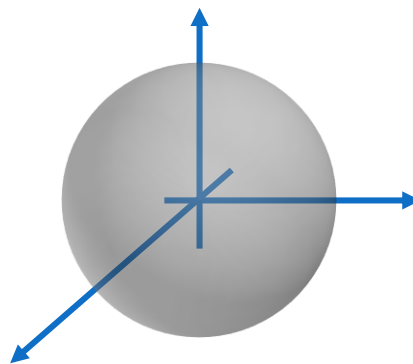
$$q = \frac{\tilde{q}}{\|\tilde{q}\|}$$

- 可记为 $q = [w, \boldsymbol{v}] = [\cos \frac{\theta}{2}, \boldsymbol{u} \sin \frac{\theta}{2}]$, $\|\boldsymbol{u}\| = 1, \theta \in \mathbb{R}$



单位复数

$$z = \cos \theta + i \sin \theta$$



单位四元数

$$q = [\cos \frac{\theta}{2}, \boldsymbol{u} \sin \frac{\theta}{2}]$$

用单位四元数表示旋转

- 任意三维旋转可以表示为**单位四元数**

$$\mathbf{q} = [w, \mathbf{v}] = [\cos \frac{\theta}{2}, \mathbf{u} \sin \frac{\theta}{2}]$$

- \mathbf{u} 为旋转轴, θ 为旋转角
- 对应轴角表示 (\mathbf{u}, θ) 或 $\boldsymbol{\theta} = \theta \mathbf{u}$

用单位四元数表示旋转

- 任意三维旋转可以表示为**单位四元数**

$$\mathbf{q} = [w, \mathbf{v}] = [\cos \frac{\theta}{2}, \mathbf{u} \sin \frac{\theta}{2}]$$

- \mathbf{u} 为旋转轴, θ 为旋转角
- 对应轴角表示 (\mathbf{u}, θ) 或 $\boldsymbol{\theta} = \theta \mathbf{u}$
- 单位四元数 \mathbf{q} 与 $-\mathbf{q}$ 代表相同的旋转

四元数表示下的旋转

- 给出单位四元数 q 和任意三维向量 v , 则 v 在 q 作用下的旋转可以写为

$$\hat{v}' = q \hat{v} q^*$$

其中 \hat{v} 为纯四元数 $\hat{v} = [0, v]$

运算结果仍为纯四元数 $\hat{v}' = [0, v']$

v' 即为旋转后的向量

两个旋转的复合

- 对于旋转 q_1, q_2 , 向量 v

$$\begin{aligned} v' &= q_2(q_1 v q_1^*) q_2^* = (q_2 q_1) v (q_2 q_1)^* \\ &= q v q^* \end{aligned}$$

其中 $q = q_2 q_1$ 表示 q_2, q_1 的复合旋转

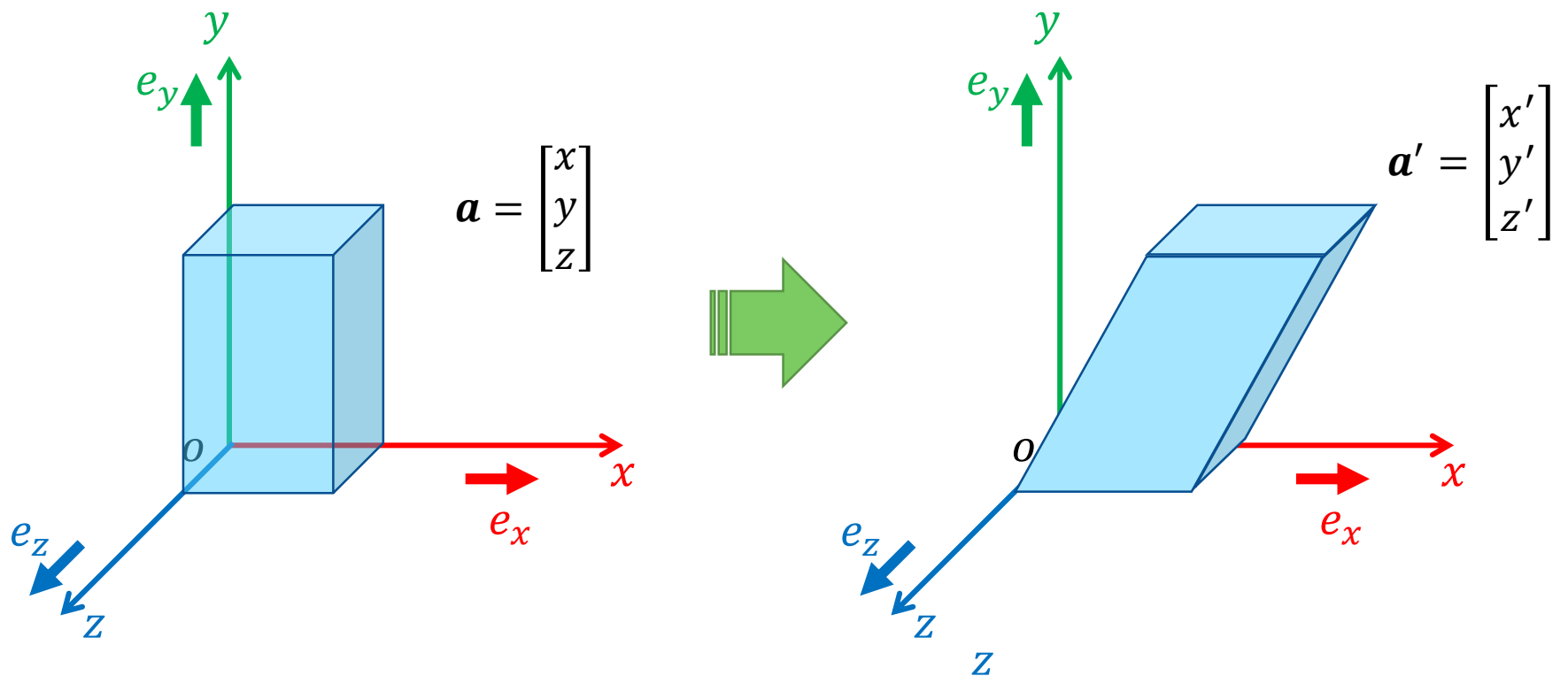
四元数总结

- 只有单位四元数才表示旋转
- $v' = qvq$
- 方便在运算时做归一化
- q 与 $-q$ 代表相同的旋转
- 插值, 求逆等操作方便
- 较为常用(物理仿真等)

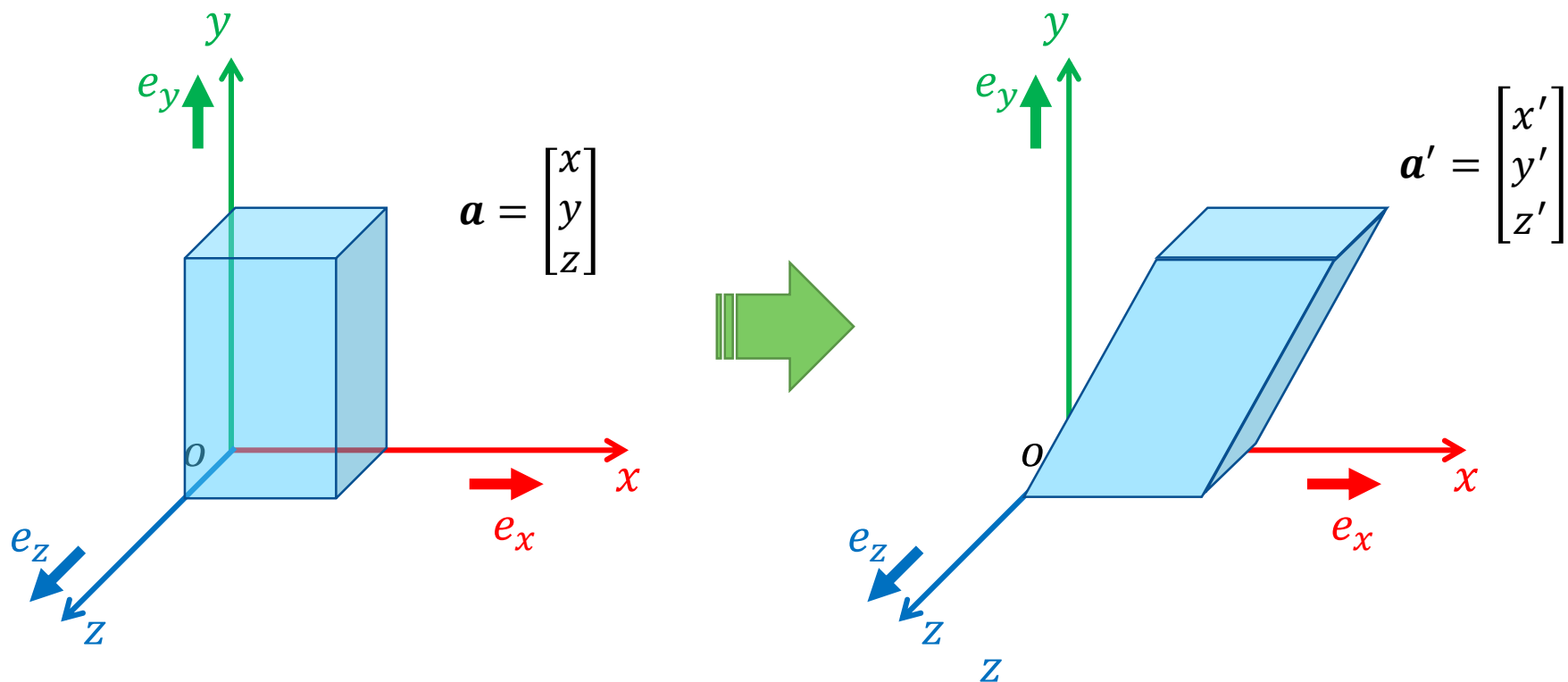
其他旋转表示

- 旋转表示的间断点问题
 - [Zhou et al. 2018 - *On the Continuity of Rotation Representations in Neural Networks*]
- 6D-vector
 - 使用旋转矩阵的前两列表示旋转
 - 第三列 \leftarrow 叉乘
 - 没有不连续点
 - 与旋转矩阵相似， 较难直接修改

切变

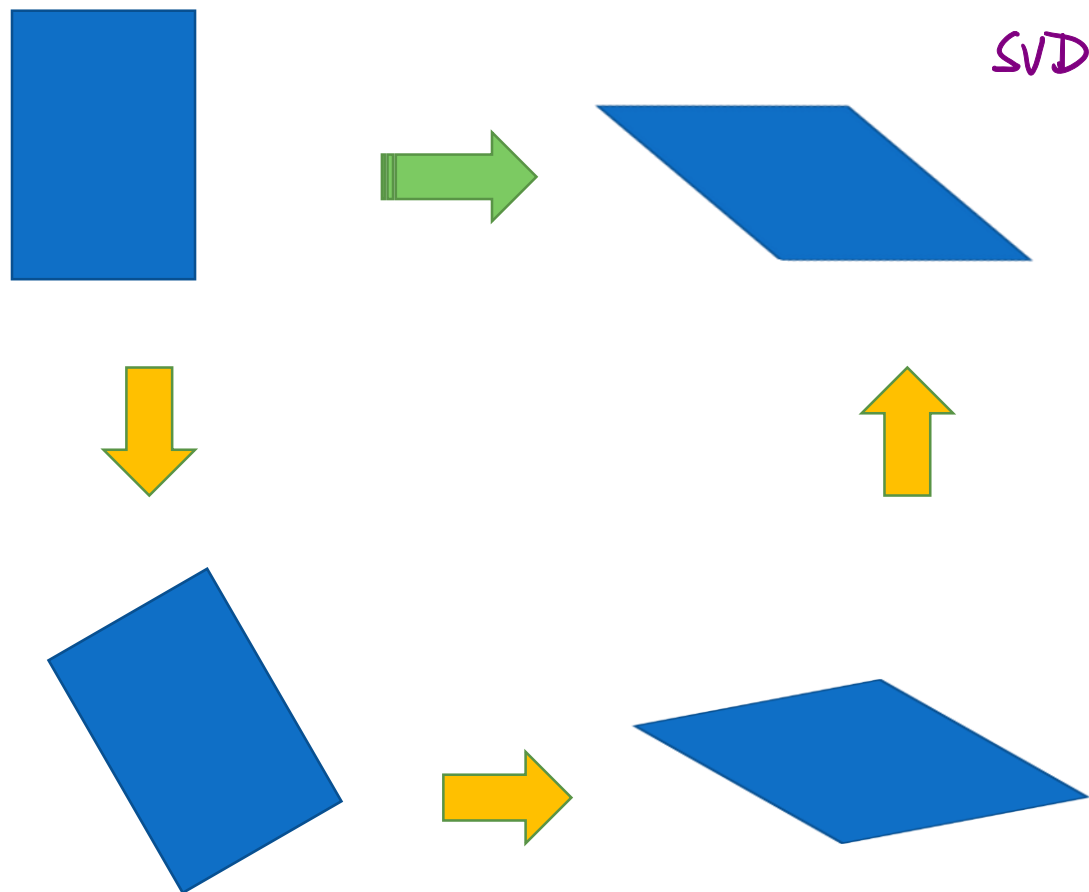


切变



$$\mathbf{a}' = \begin{bmatrix} 1 & h_{yx} & h_{zx} \\ h_{xy} & 1 & h_{zy} \\ h_{xz} & h_{yz} & 1 \end{bmatrix} \mathbf{a}$$

切变 \leftarrow 旋转 + 伸缩



本节主要内容

- CG/CGI的数学基础
- 线性代数回顾
 - 三维向量与向量运算
 - 矩阵与矩阵运算
 - 坐标系与坐标变换
 - 三维旋转与表示



Questions?