



# 计算机视觉

## 3D结构与运动



中国传媒大学

COMMUNICATION UNIVERSITY OF CHINA

# 上节课

从图像中恢复运动



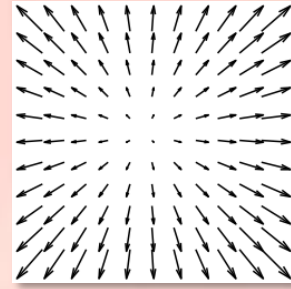
回顾

# 输入序列

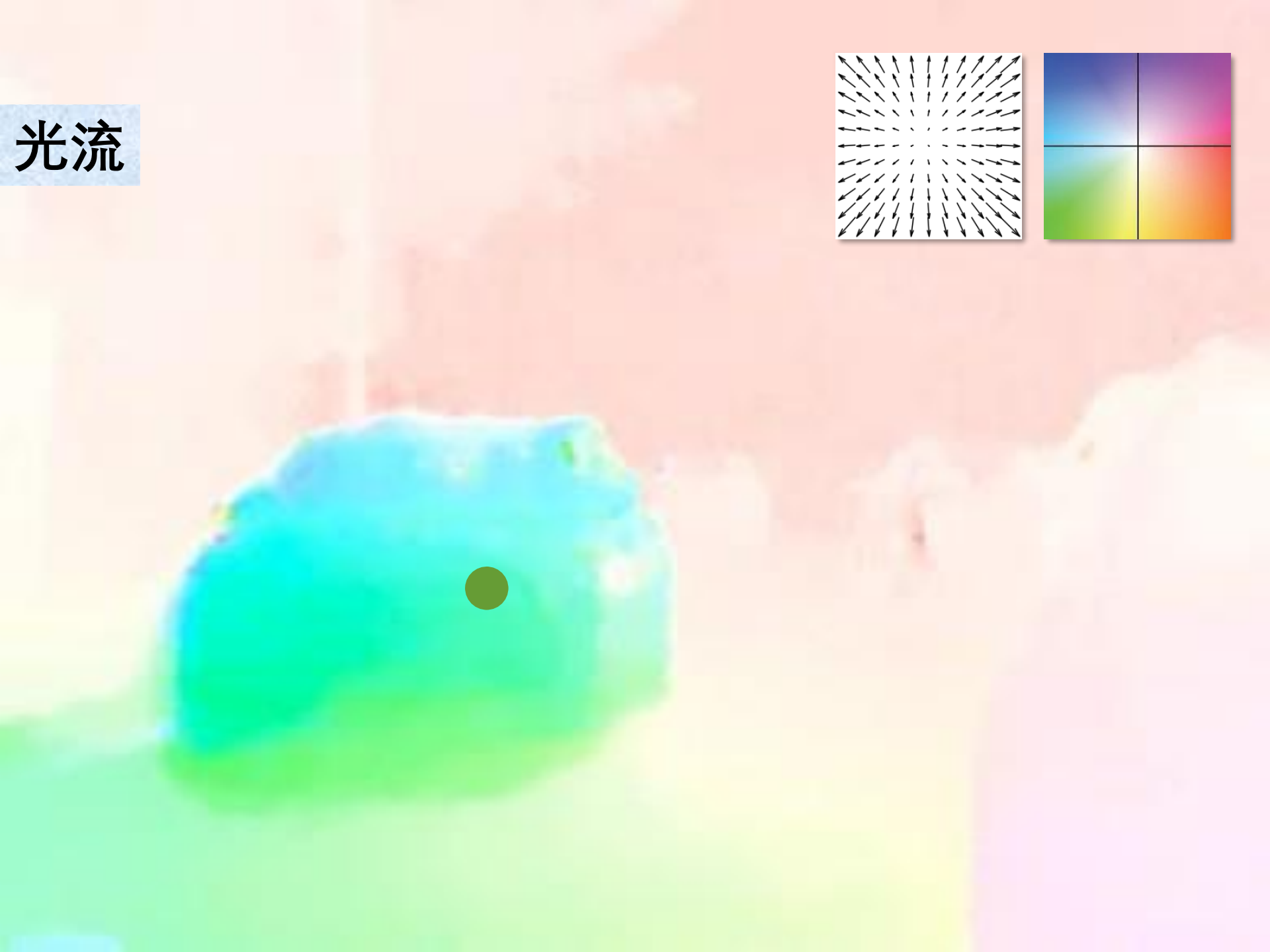
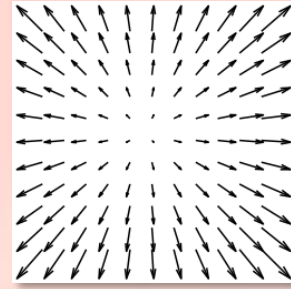




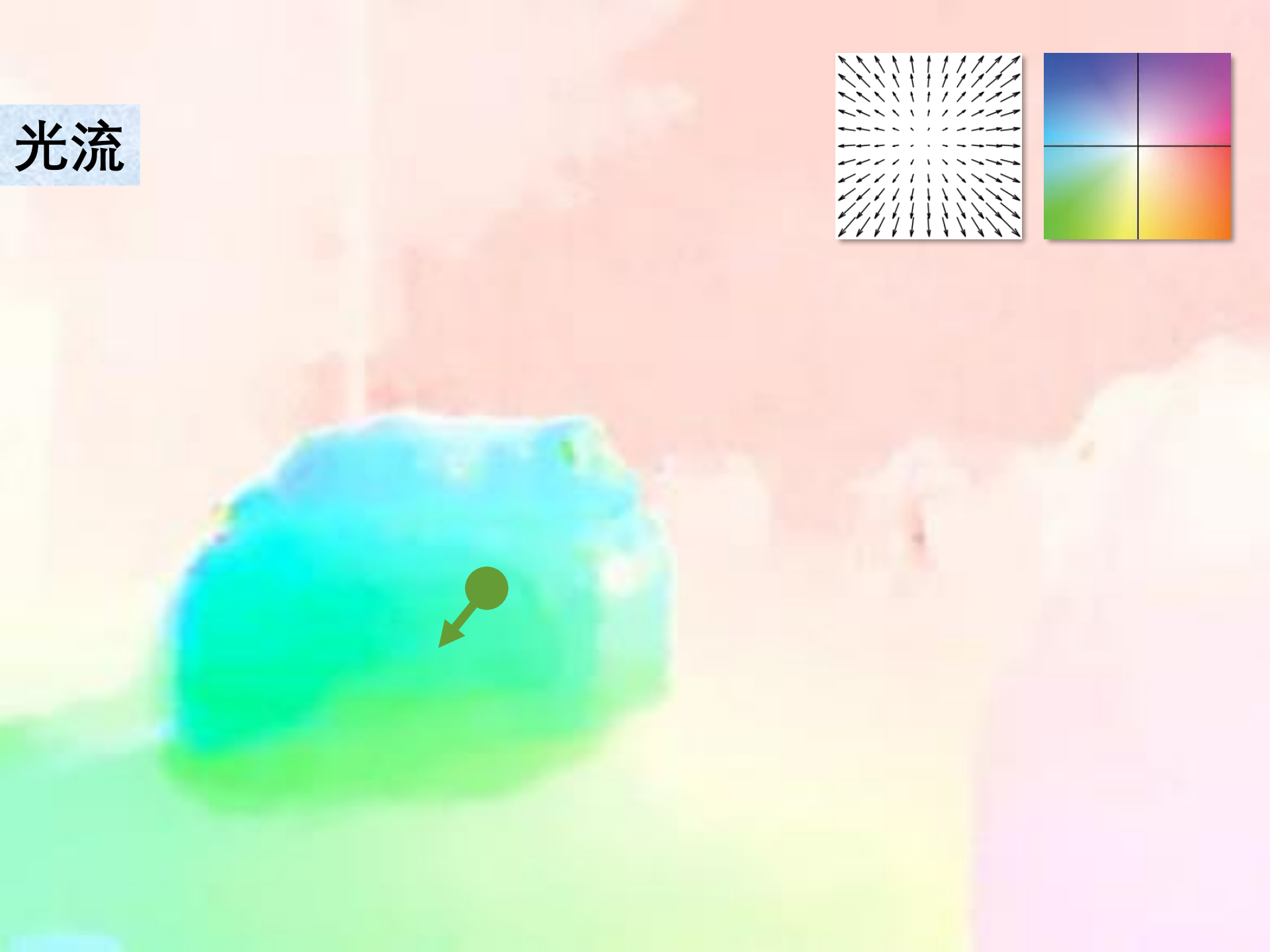
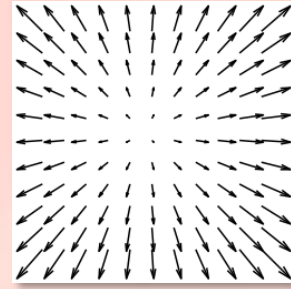
# 光流



# 光流



# 光流



**运动场**

**VS.**

**光流**

几何结构

运动场

VS.

光流



几何结构

运动场

VS.

光流

光度概念

运动场

≠

光流

# 运动场

≠

# 光流

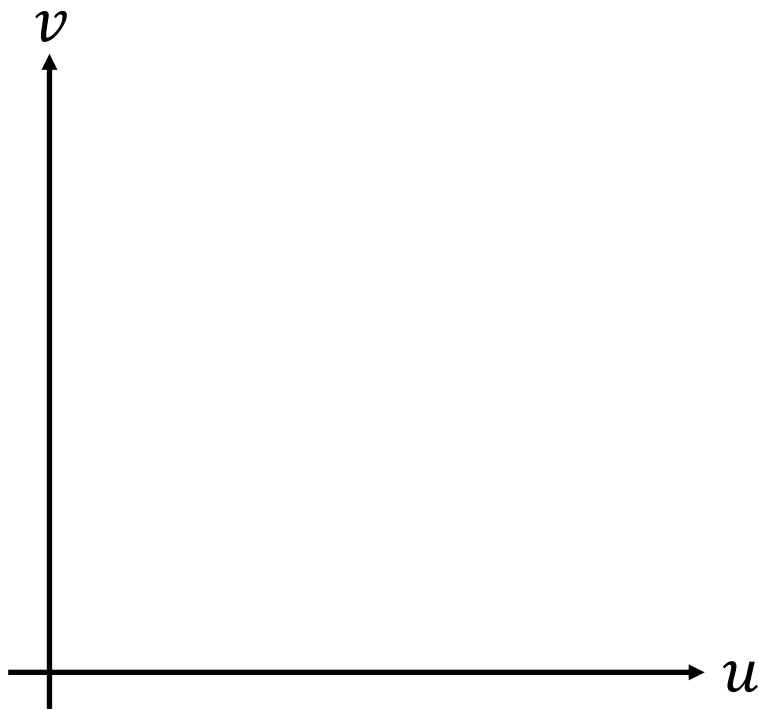
光流近似运动场

亮度恒常  
假设

$$I(x, y, t) = I(x + u\Delta t, y + v\Delta t, t + \Delta t)$$

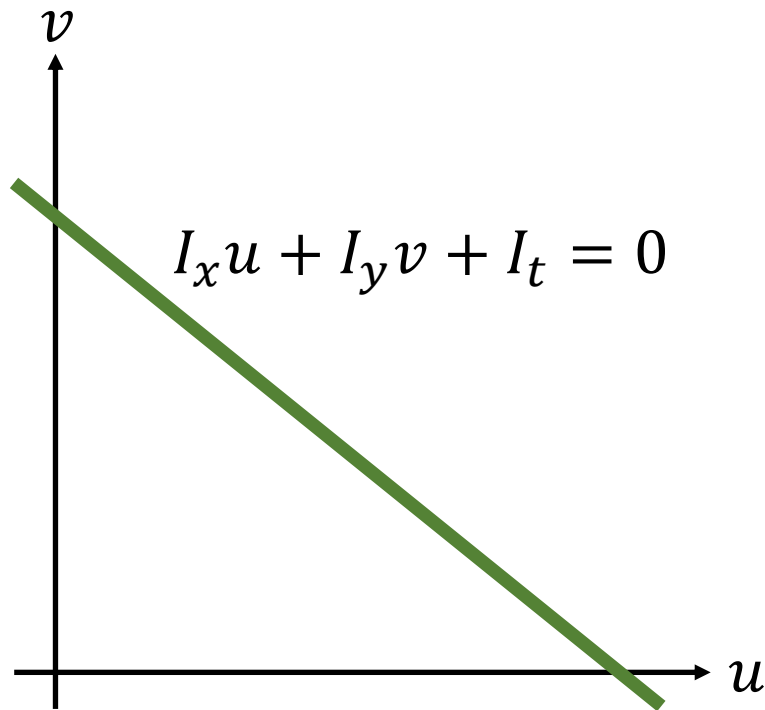
亮度恒常约束： $I_x u + I_y v + I_t = 0$

亮度恒常约束： $I_x u + I_y v + I_t = 0$





亮度恒常约束： $I_x u + I_y v + I_t = 0$



解决方案：引入其他约束



An Iterative Image Registration Technique  
with an Application to Stereo Vision

*Bruce D. Lucas*

*Takeo Kanade*

*Computer Science Department  
Carnegie-Mellon University  
Pittsburgh, Pennsylvania 15213*

局部方法


# Determining Optical Flow

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**Berthold K.P. Horn and Brian G. Schunck**  
*Artificial Intelligence Laboratory, Massachusetts Institute of  
Technology, Cambridge, MA 02139, U.S.A.*

全局方法

# 由运动恢复 结构 无穷小方法



## 问题陈述


给定一个由相机运动产生的光流场



问题陈述

给定一个由相机运动产生的光流场

恢复相机的3D旋转和平移速度

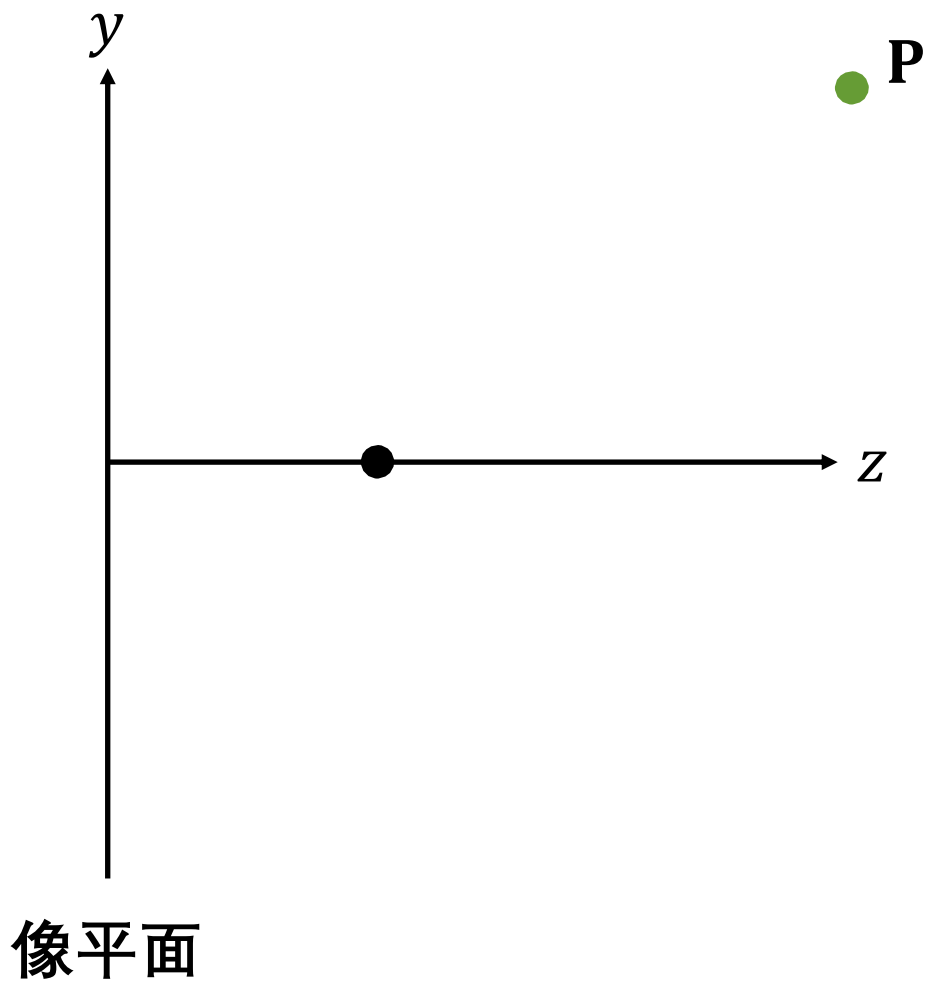
A yellow sticky note is attached to the top right corner of the slide. It has the text '问题陈述' written on it in black, bold, sans-serif font. The note is slightly tilted and has a white paper strip at the top edge.

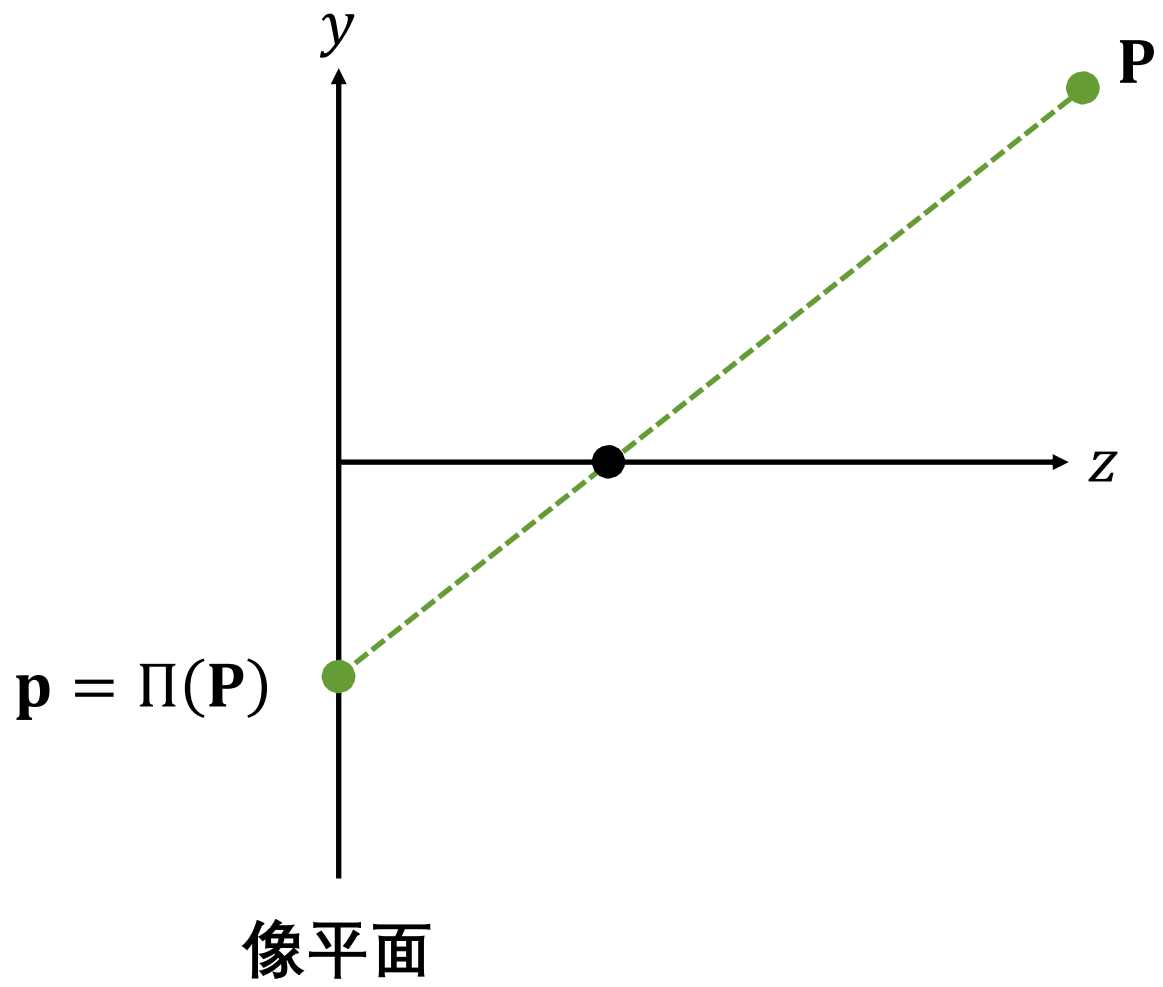
问题陈述

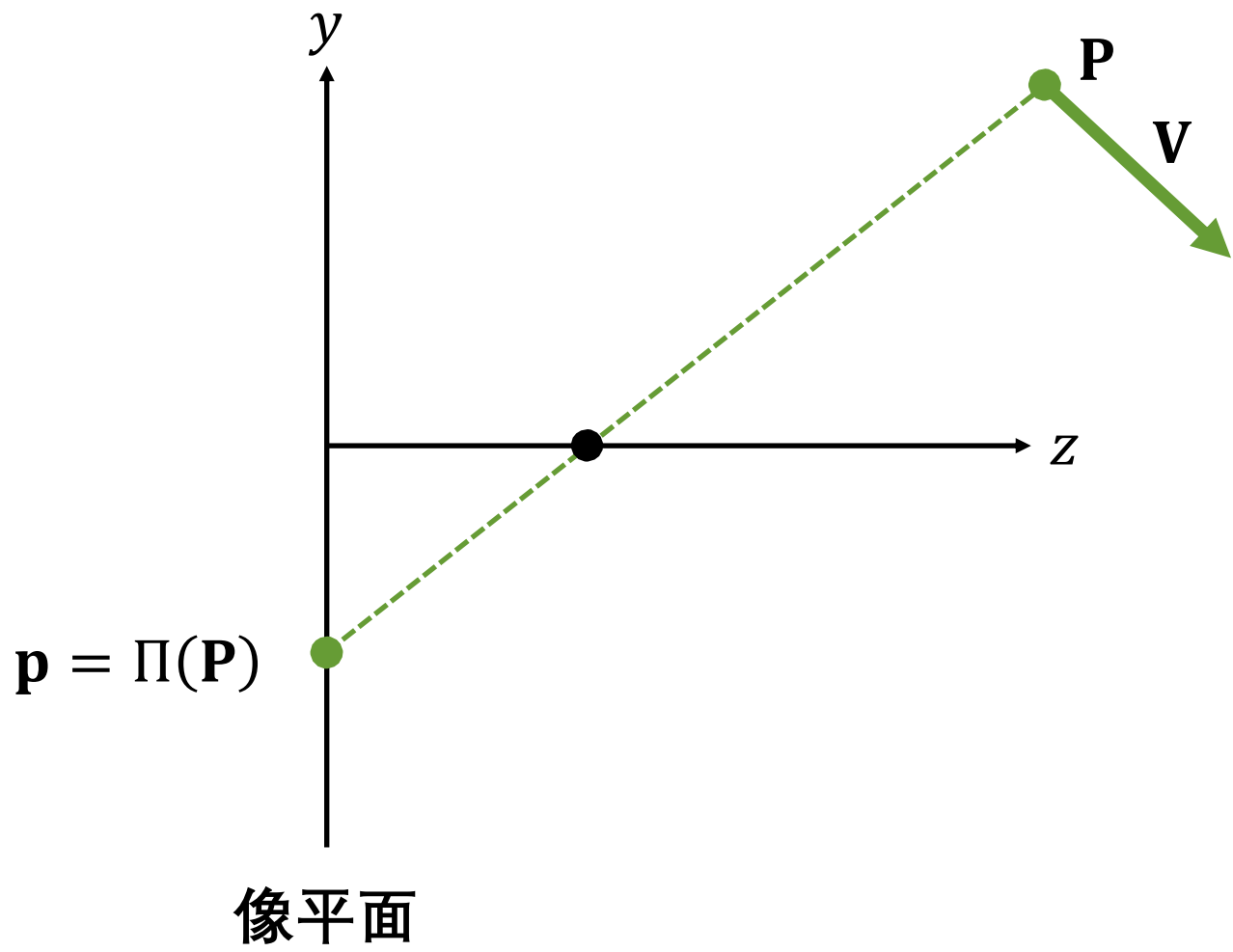
**给定一个由相机运动产生的光流场**

**恢复相机的3D旋转和平移速度  
恢复3D场景结构**

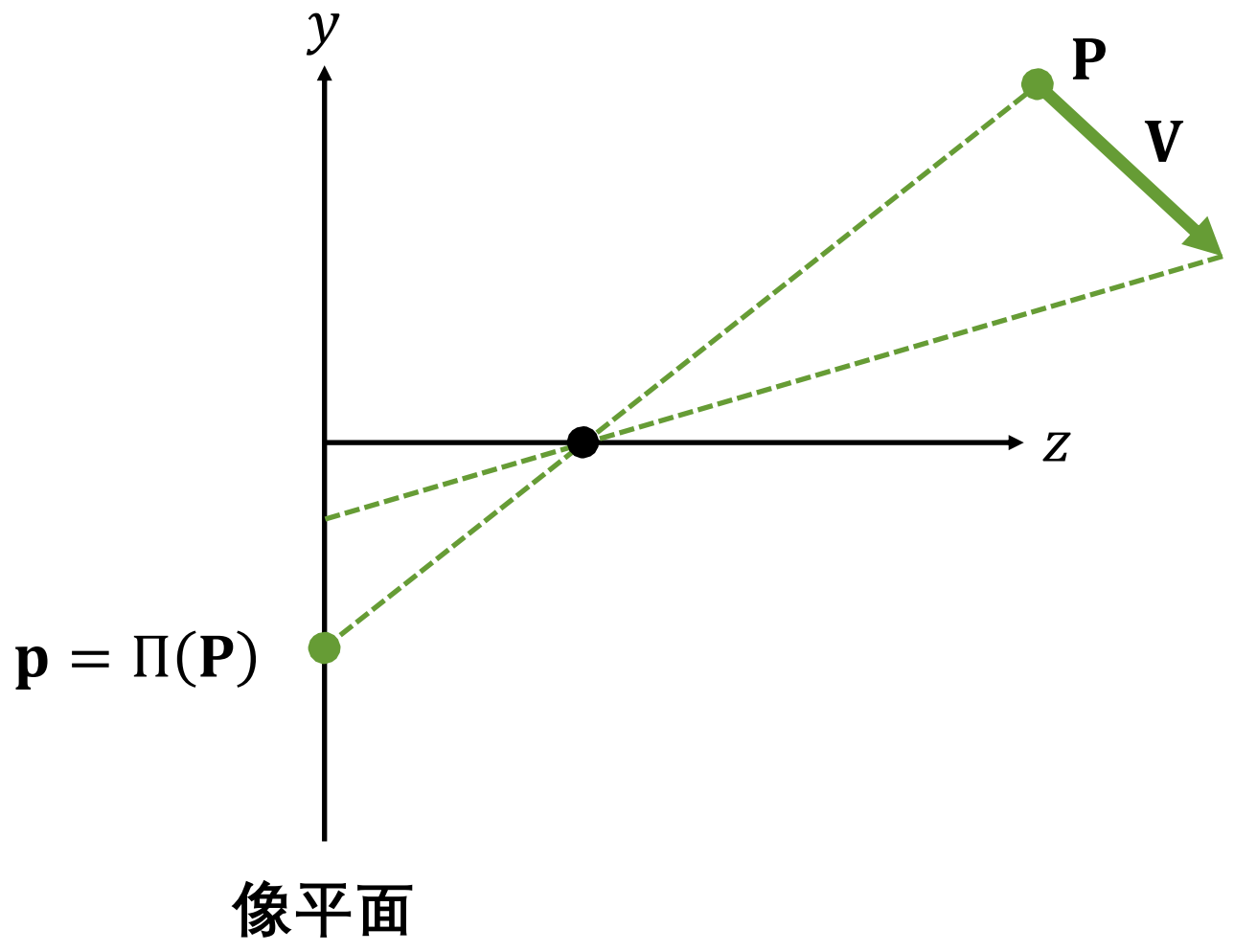


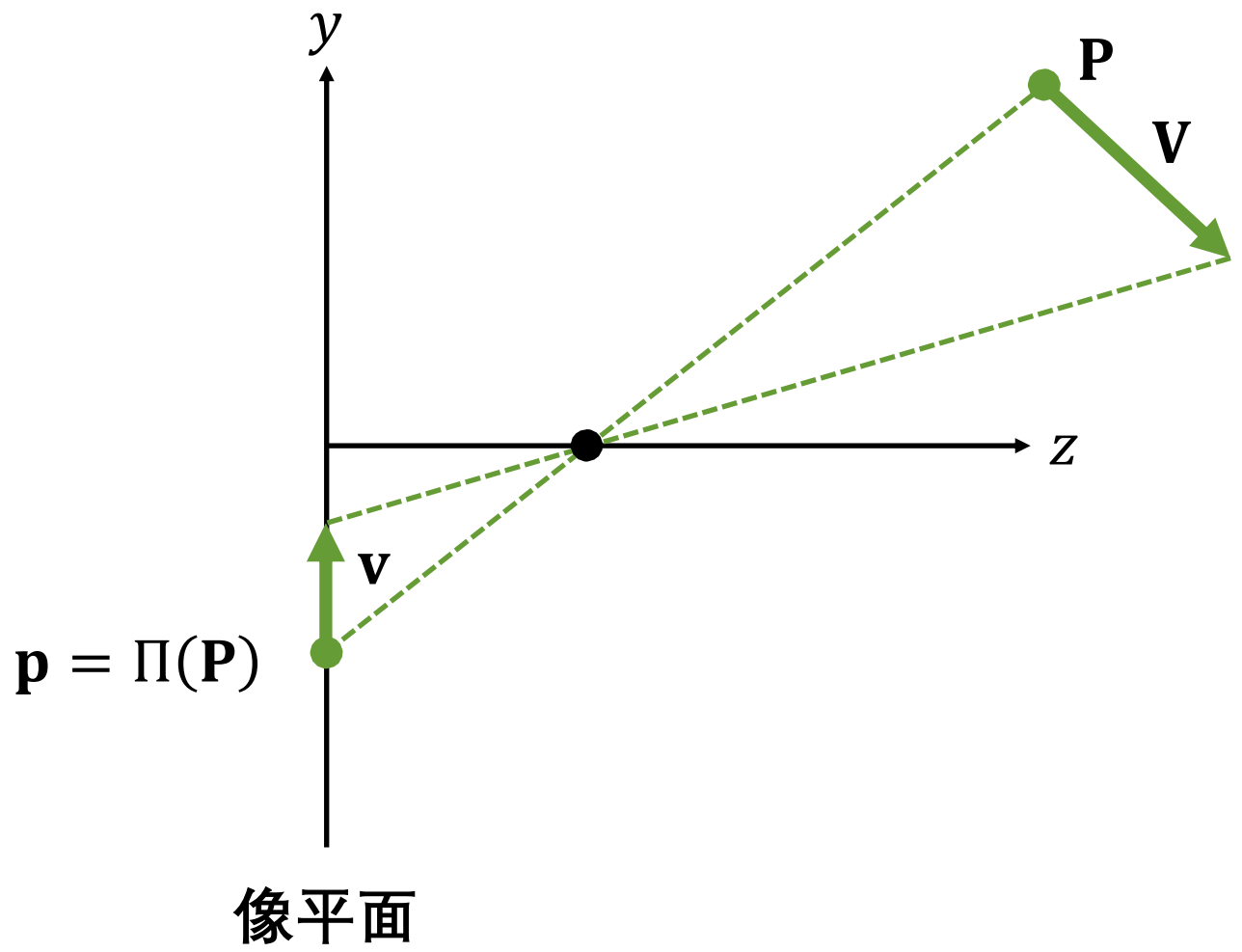


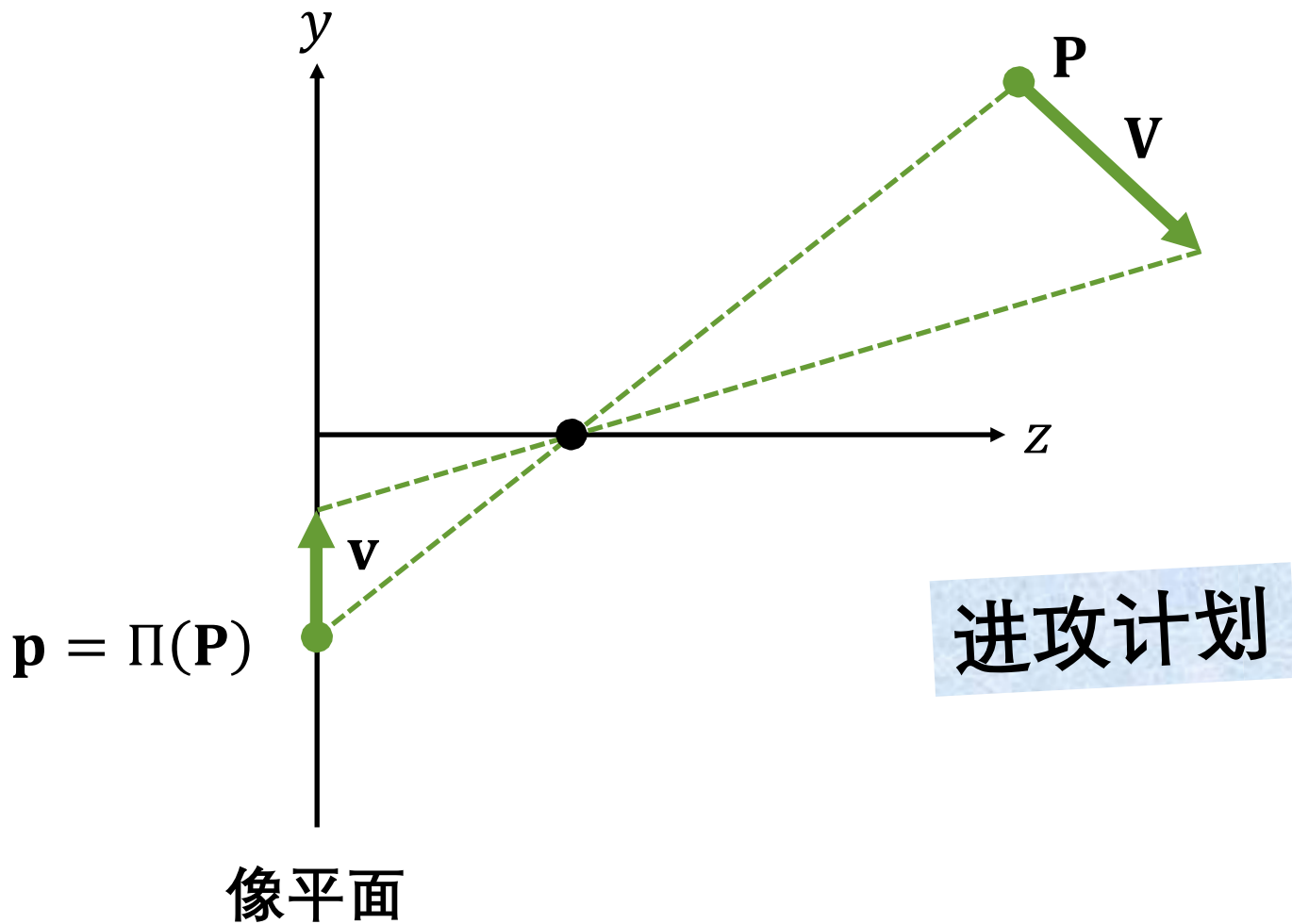


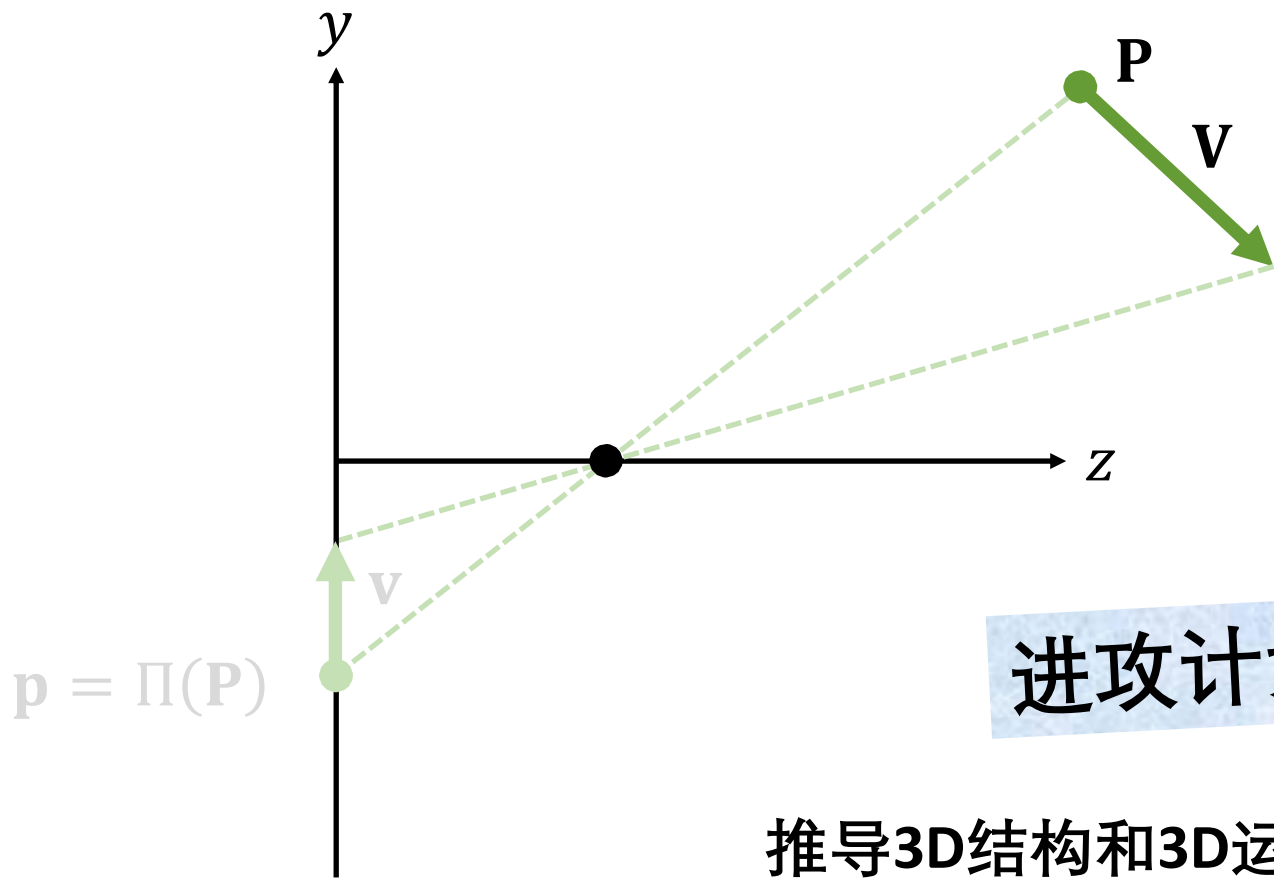








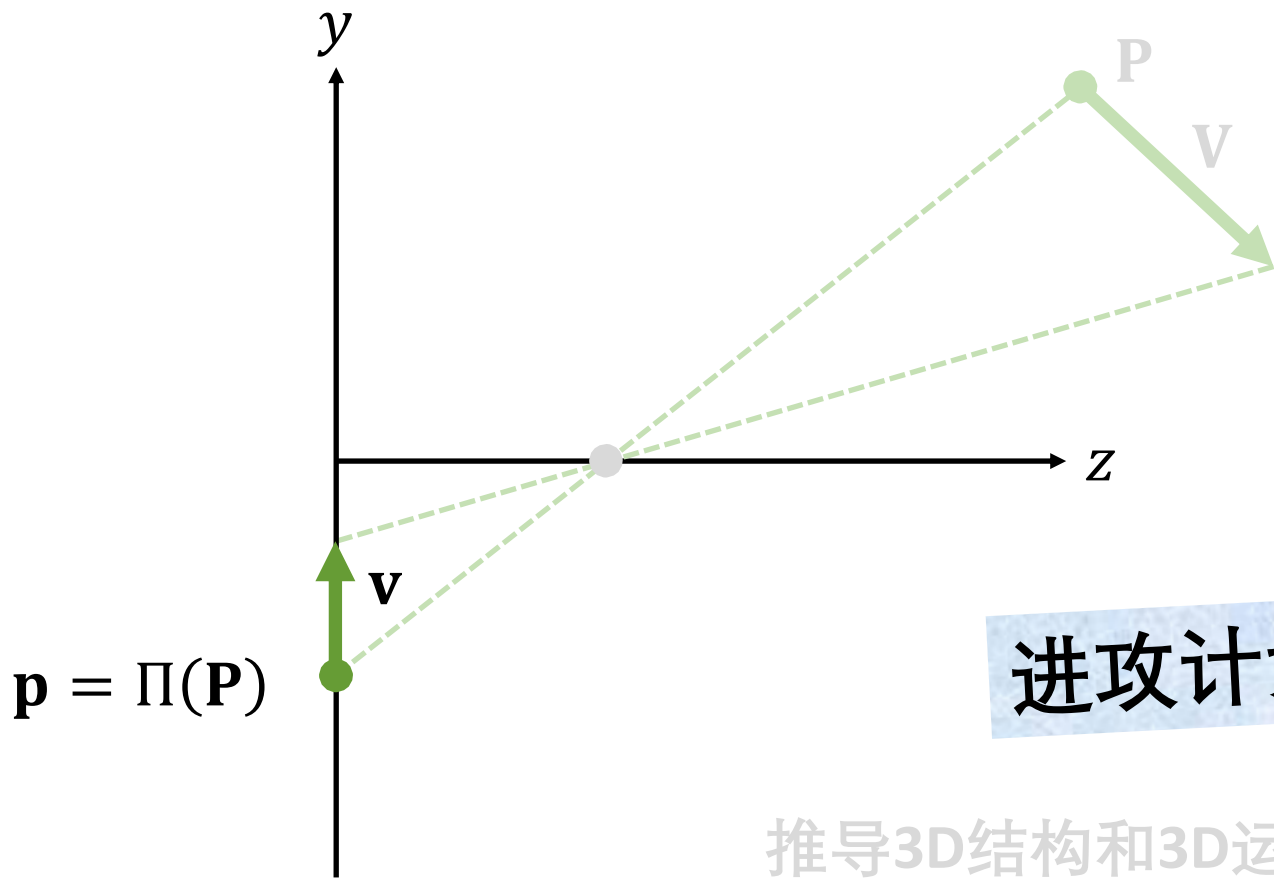




进攻计划

推导3D结构和3D运动的表达式

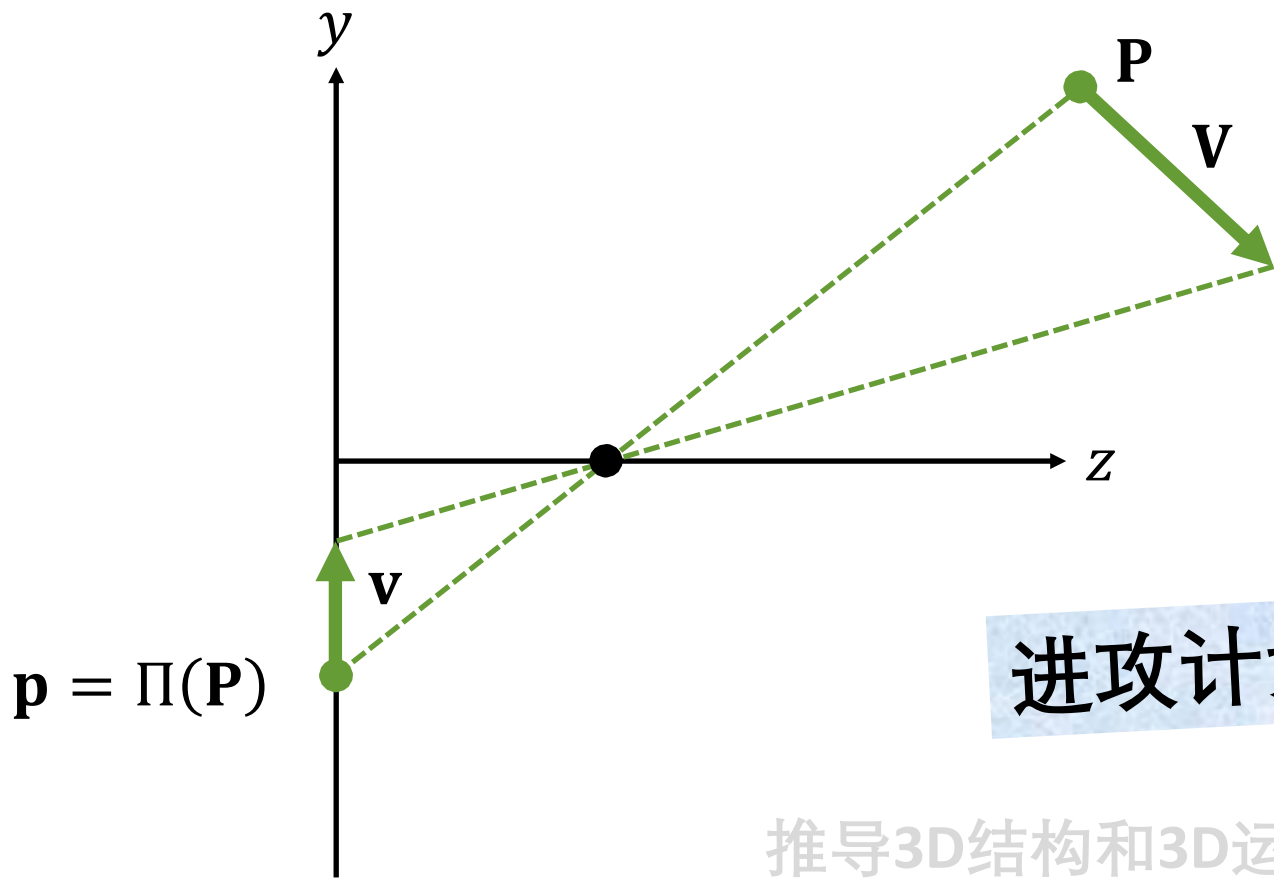
像平面



## 进攻计划

推导3D结构和3D运动的表达式

推导图像速度的表达式

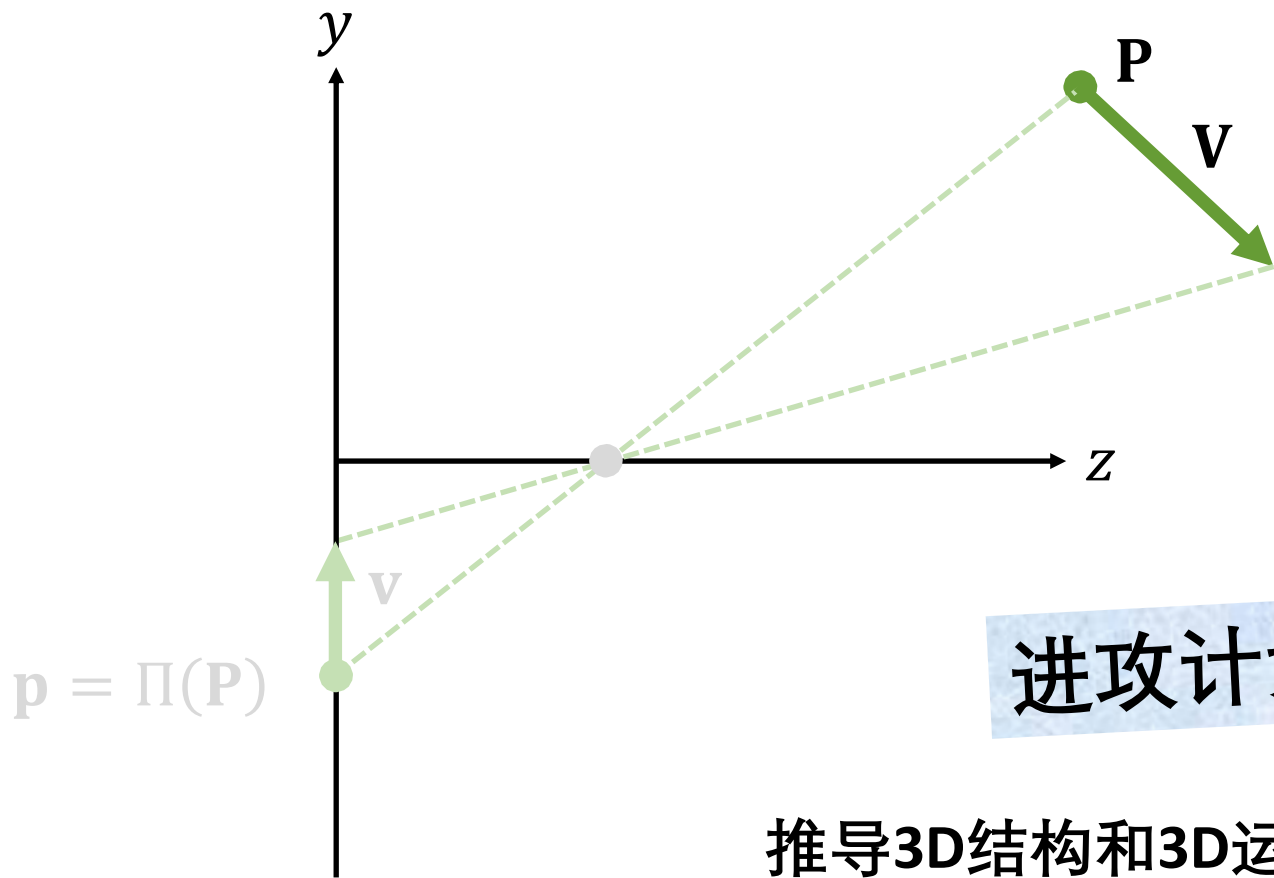


# 进攻计划

推导3D结构和3D运动的表达式

推导图像速度的表达式

关联3D和2D参数



## 进攻计划

推导3D结构和3D运动的表达式

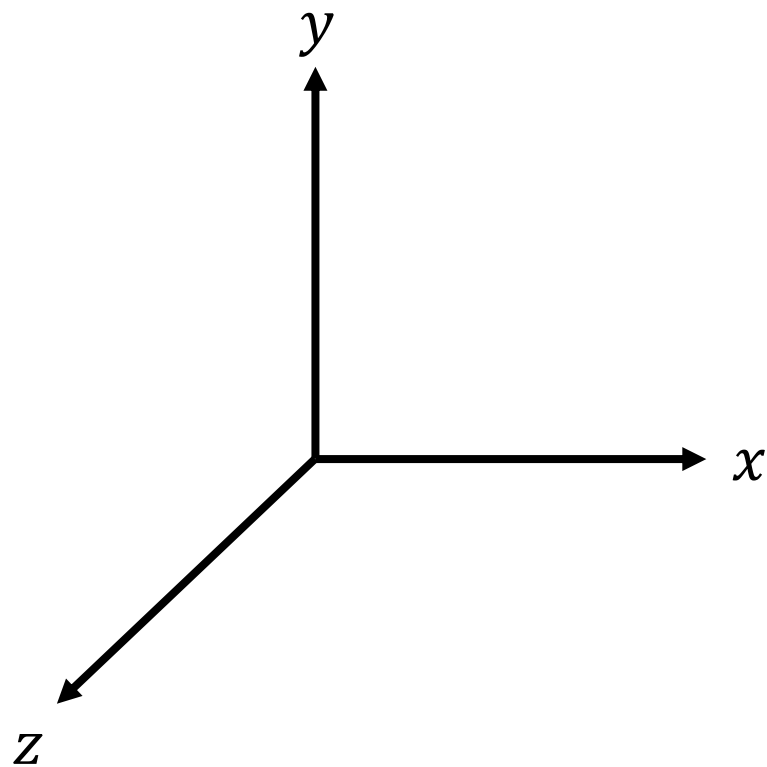
推导图像速度的表达式

关联3D和2D参数

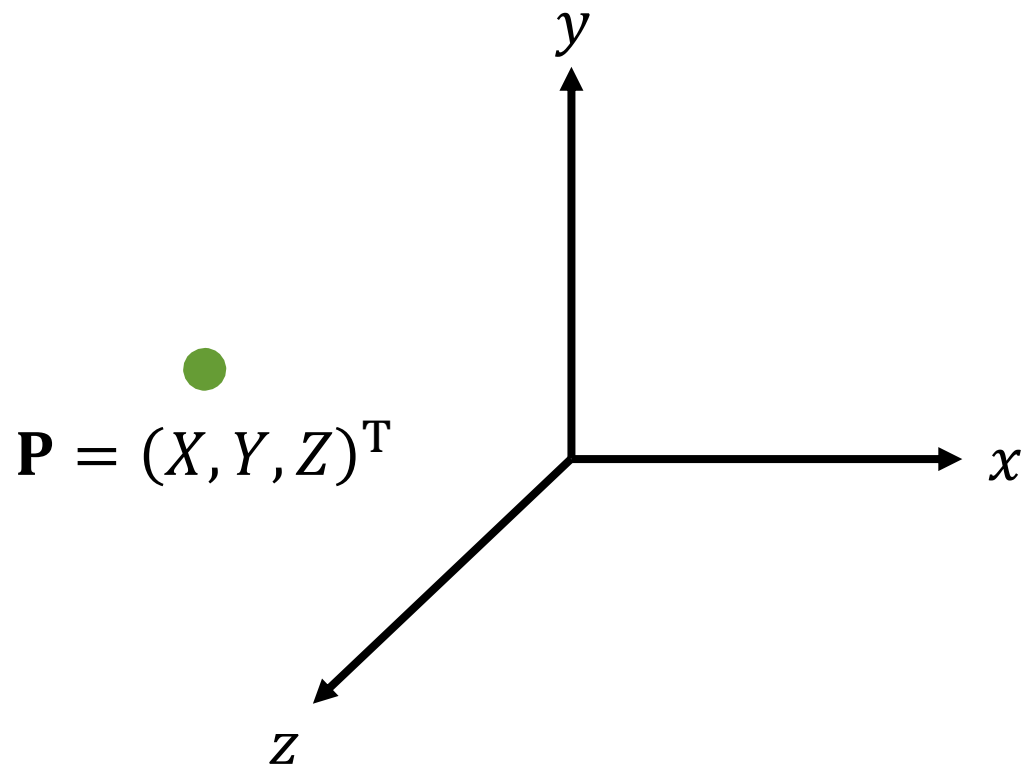
**假设场景是刚性的**



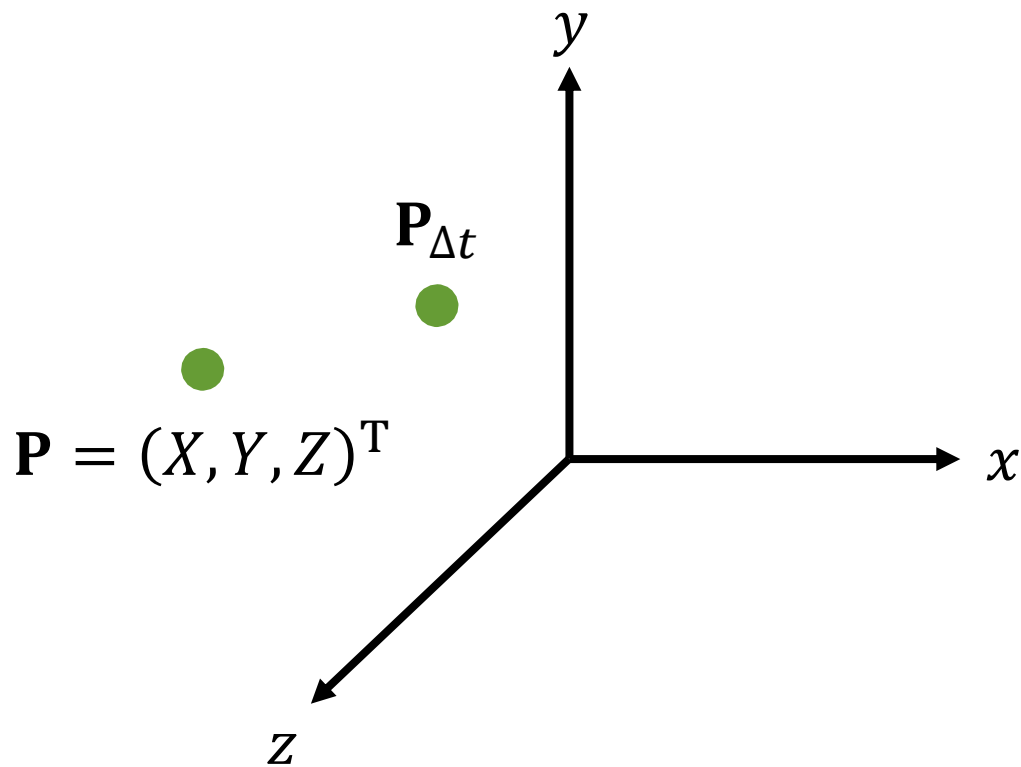
# 3D结构 与运动



# 3D结构 与运动



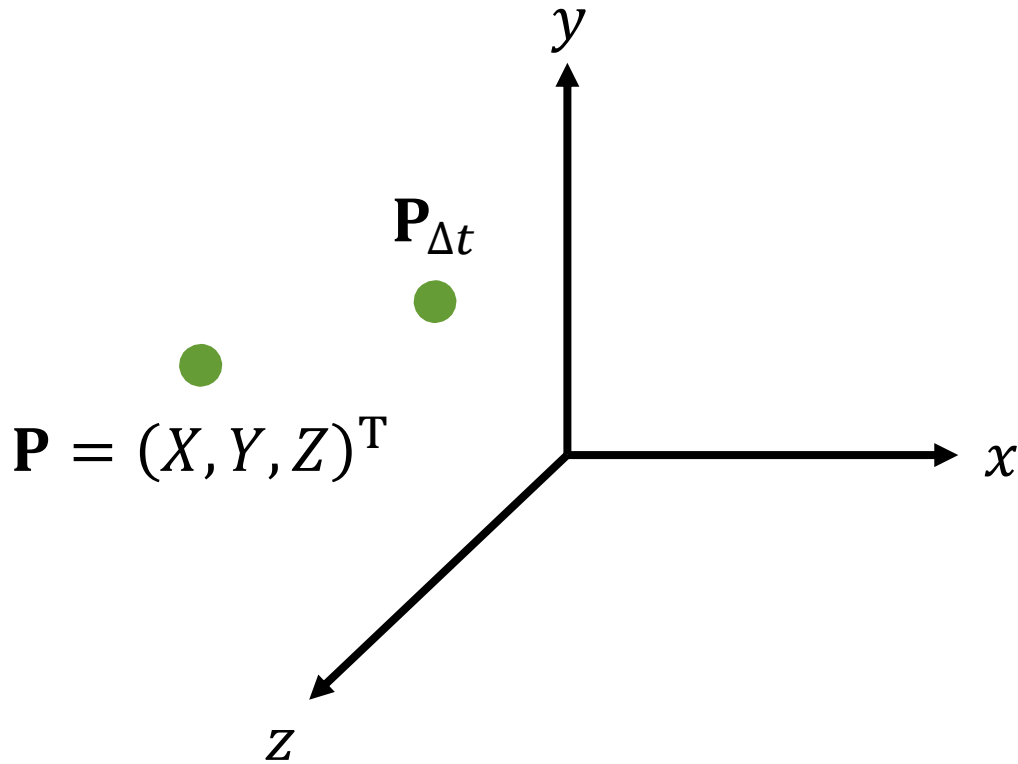
# 3D结构 与运动



点的运动可以分解为两部分

平移

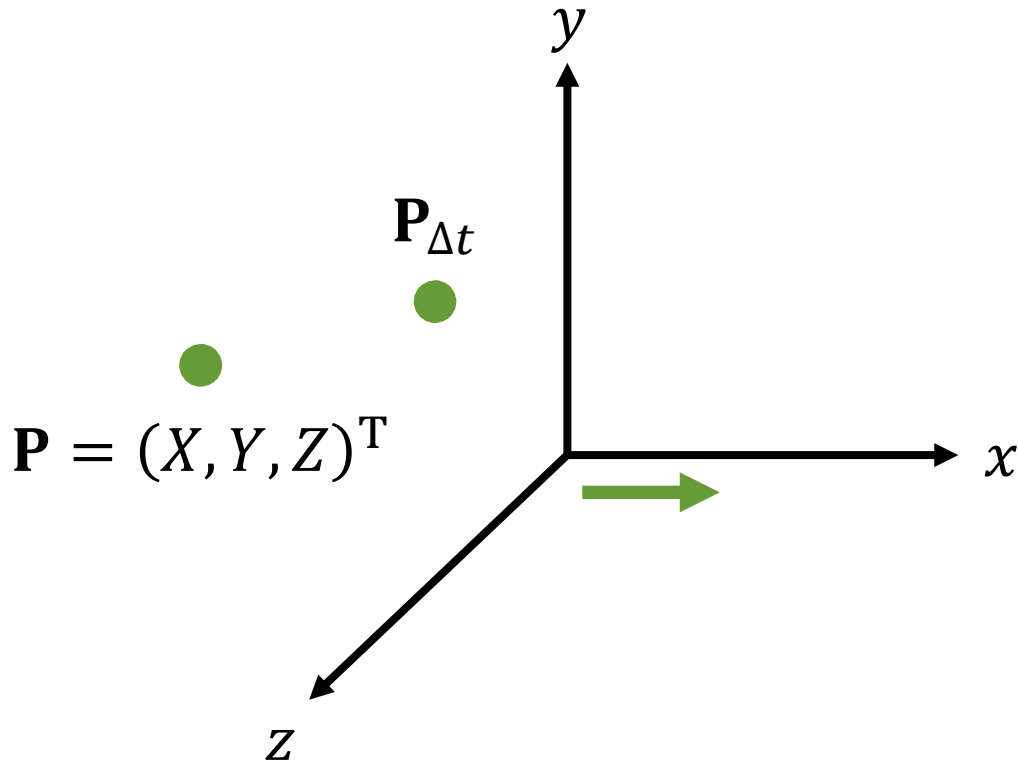
$$\mathbf{T} = (t_x, t_y, t_z)^T$$



点的运动可以分解为两部分

平移

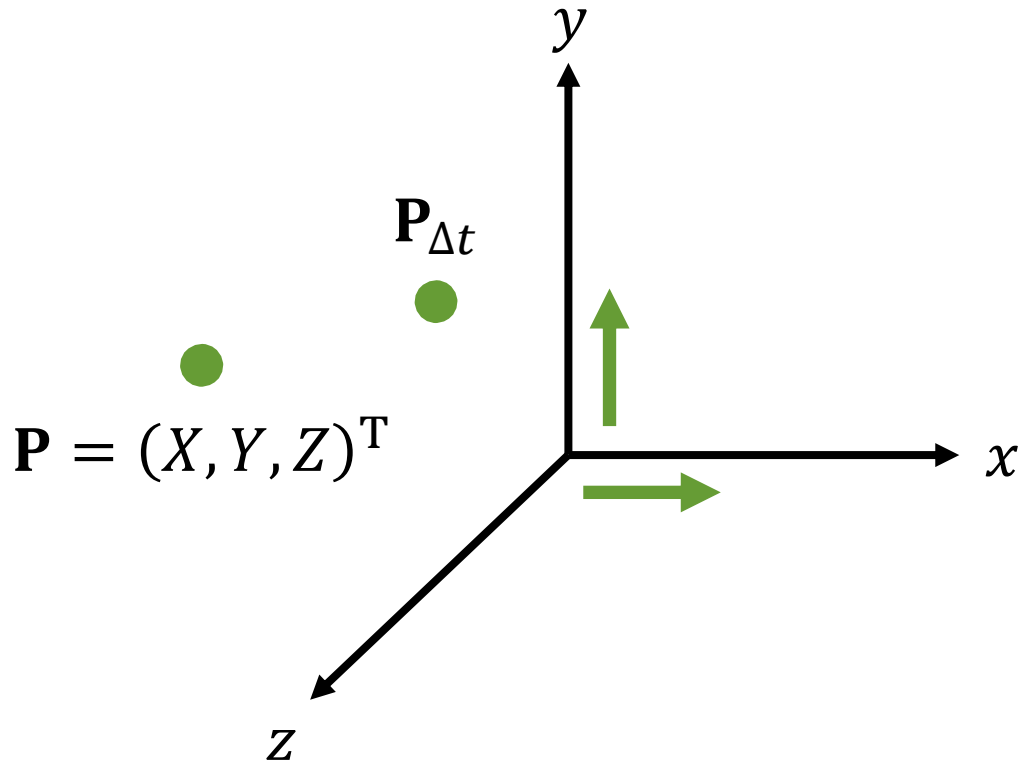
$$\mathbf{T} = (t_x, t_y, t_z)^T$$



点的运动可以分解为两部分

平移

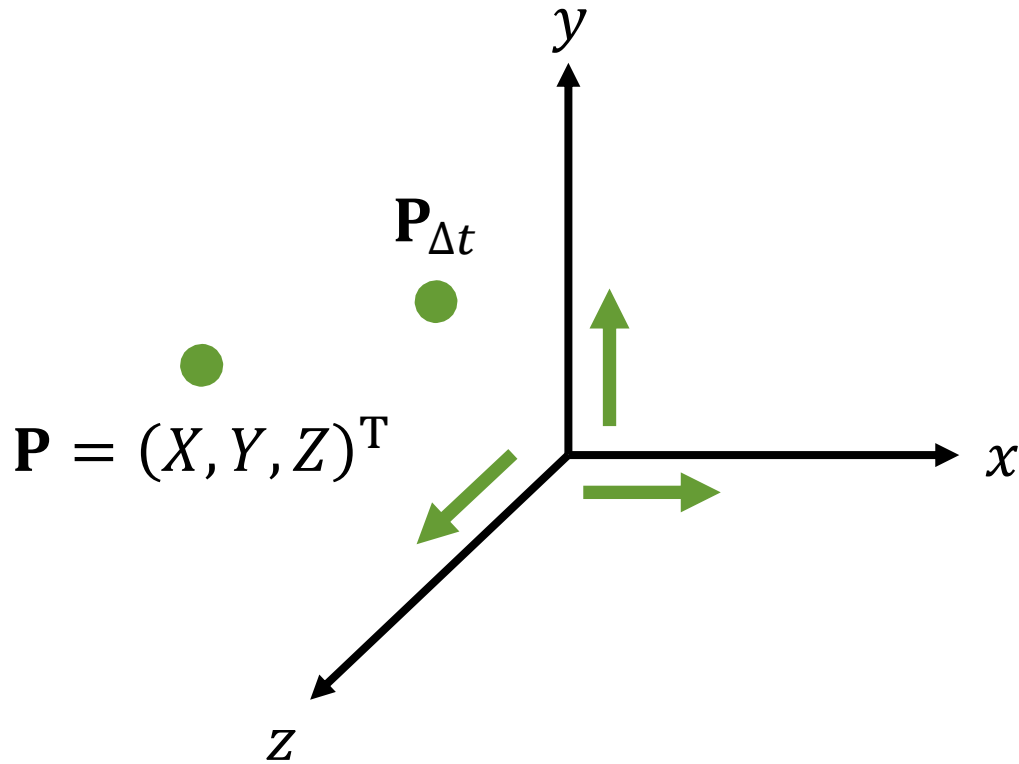
$$\mathbf{T} = (t_x, t_y, t_z)^T$$



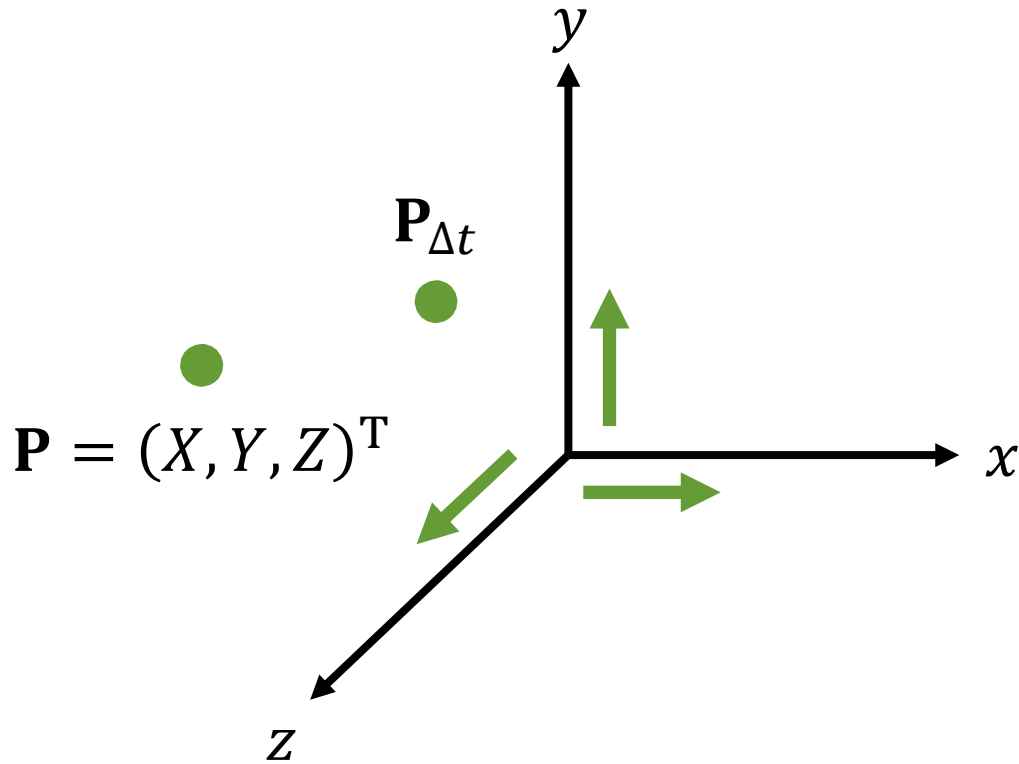
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平移

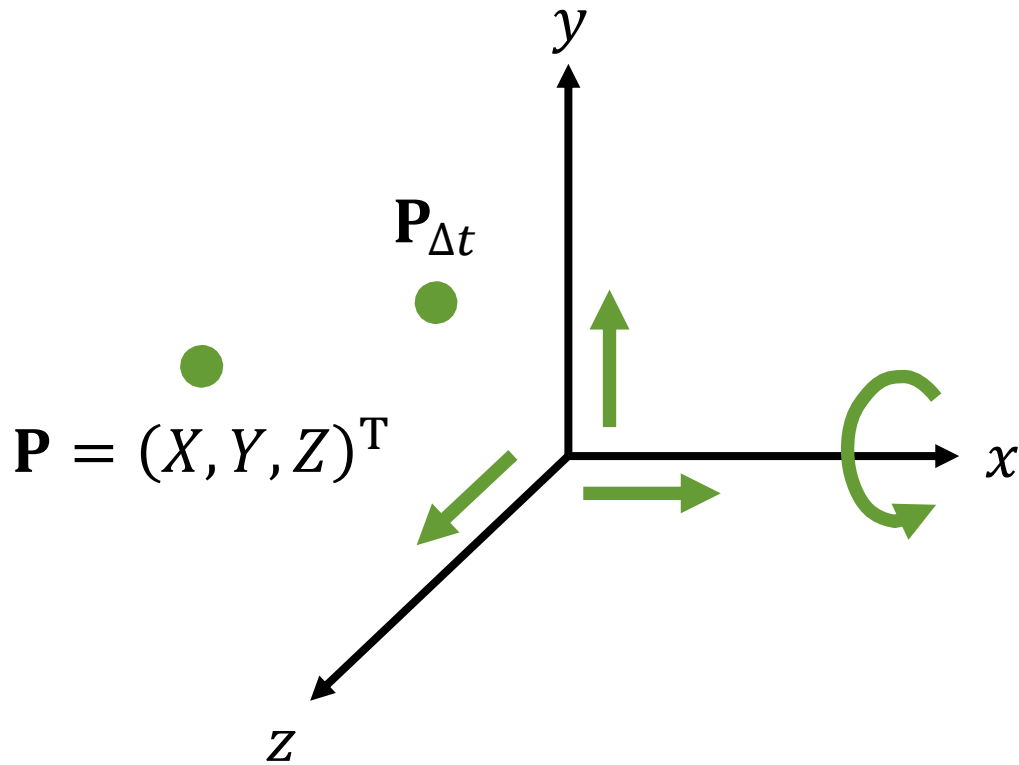
$$\mathbf{T} = (t_x, t_y, t_z)^T$$

旋转

$$\mathbf{R}(\boldsymbol{\Omega})$$
$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T$$



点的运动可以分解为两部分



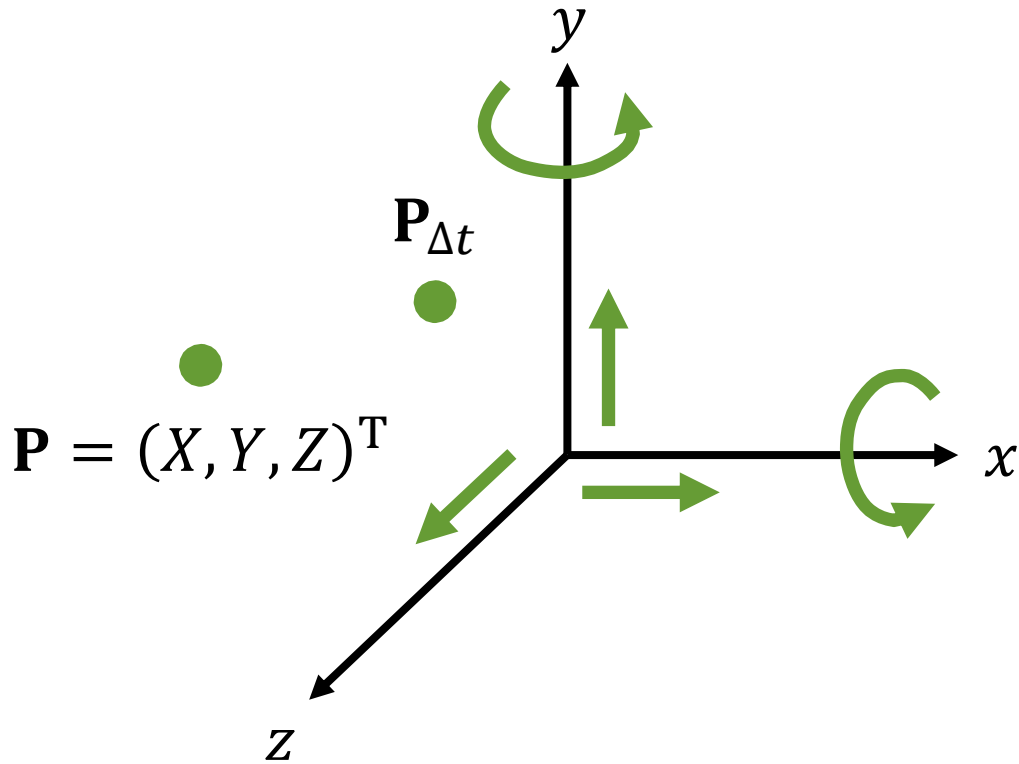
平移

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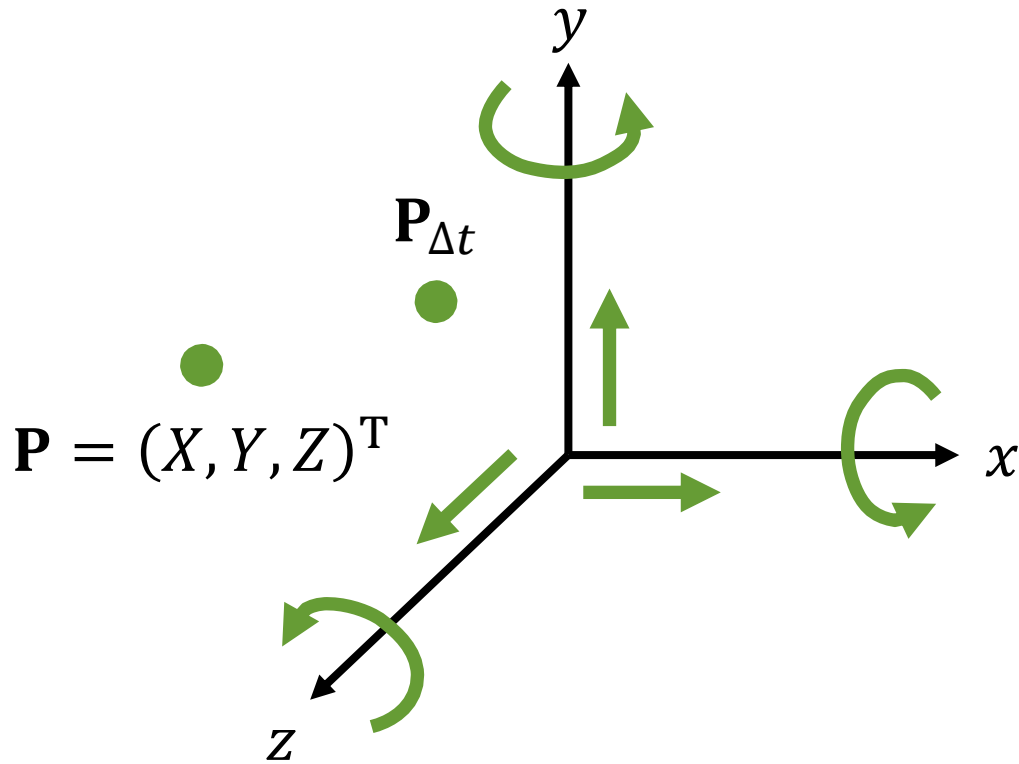
平移

$$\mathbf{T} = (t_x, t_y, t_z)^T$$

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$$\mathbf{R}(\boldsymbol{\Omega})$$
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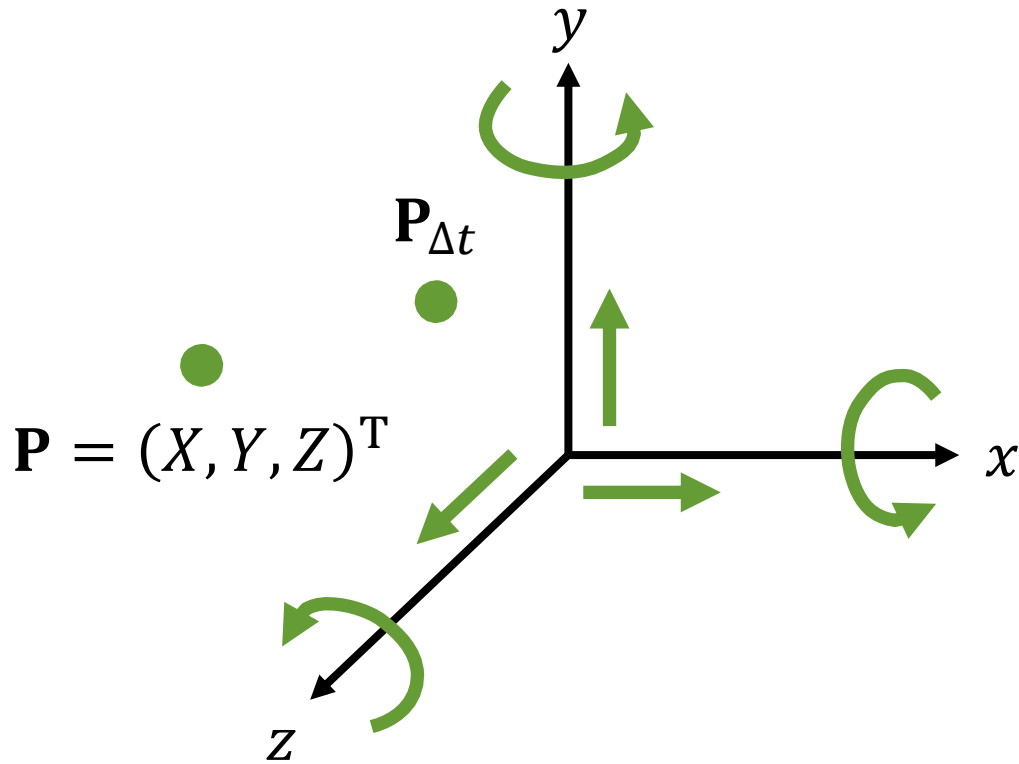
平移

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点的运动可以分解为两部分



平移

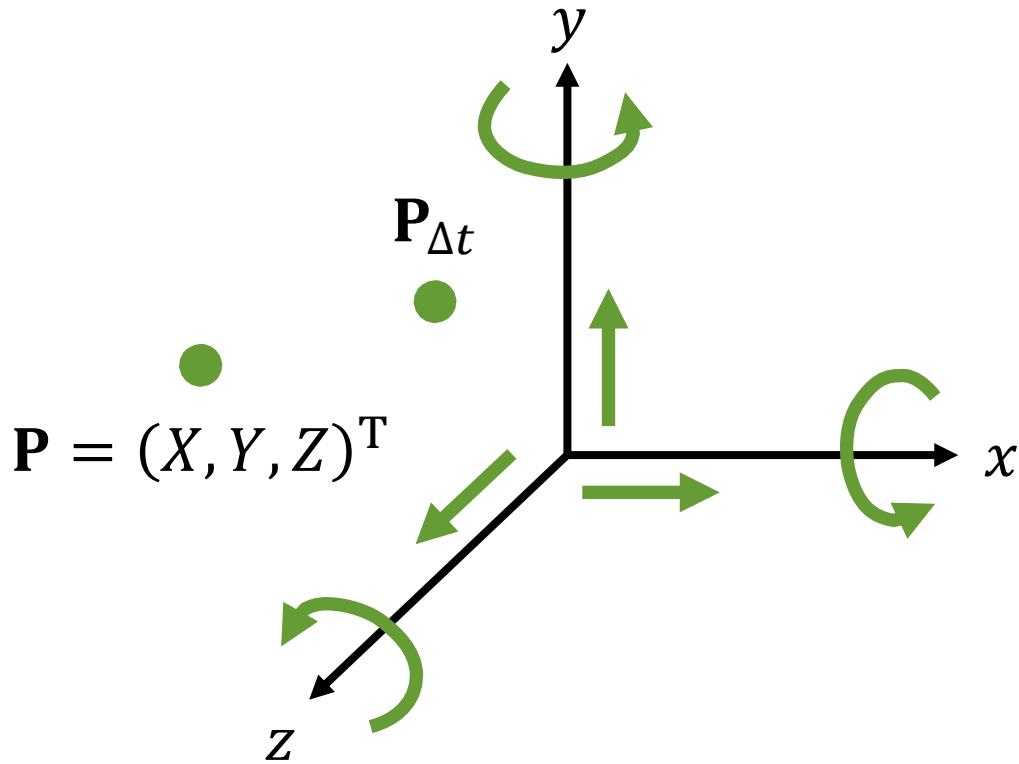
$$\mathbf{T} = (t_x, t_y, t_z)^T$$

旋转

$$\mathbf{R}(\boldsymbol{\Omega})$$
$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T$$

$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

点的运动可以分解为两部分



$$\mathbf{P} = (X, Y, Z)^T$$

平移

$$\mathbf{T} = (t_x, t_y, t_z)^T$$

旋转

$$\mathbf{R}(\boldsymbol{\Omega})$$
$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T$$

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因为我们要处理的是速度，所以可以用无穷小近似



# 插曲

$$\cos(0 + \Delta\theta)$$

$$\cos(0 + \Delta\theta) = 1 - \frac{\Delta\theta^2}{2!} + \frac{\Delta\theta^4}{4!} - \frac{\Delta\theta^6}{6!} + \dots$$

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这是如何得来的？

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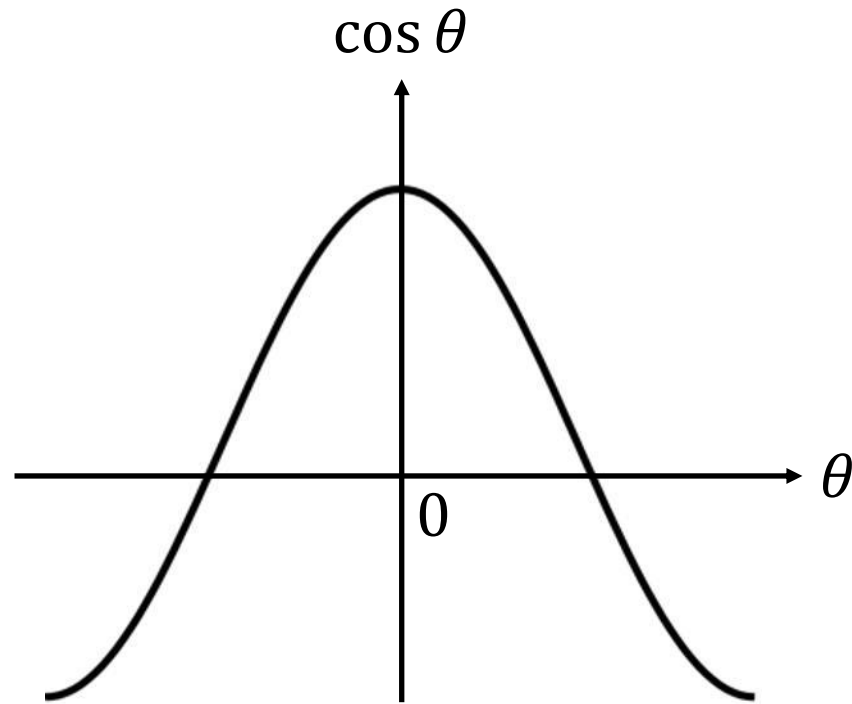
这是如何得来的？

泰勒级数

$$\cos(0 + \Delta\theta) = 1 - \frac{\Delta\theta^2}{2!} + \frac{\Delta\theta^4}{4!} - \frac{\Delta\theta^6}{6!} + \dots$$

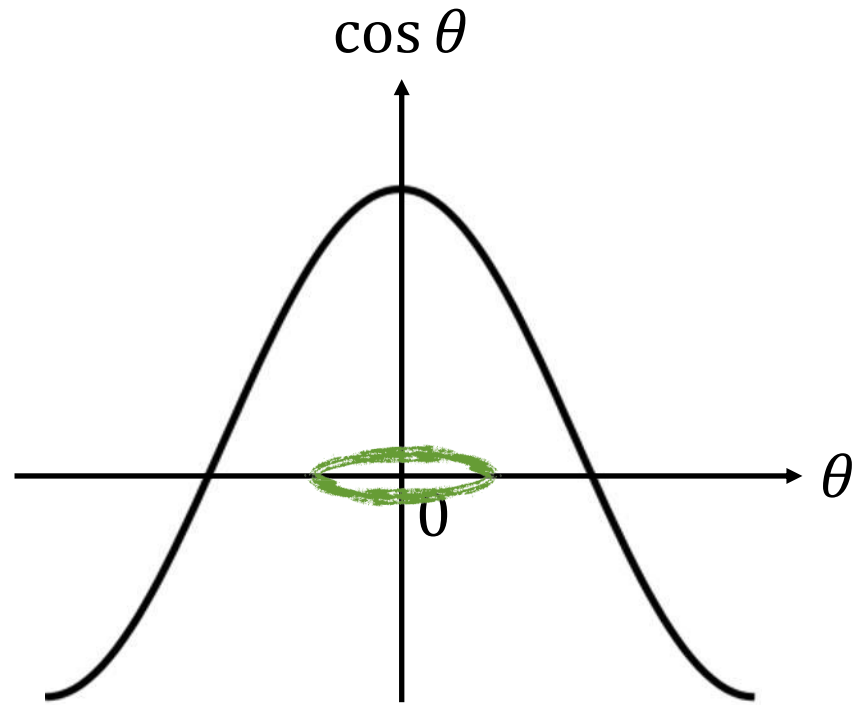
假设一个小(角度)位移

$$\begin{aligned}\cos(0 + \Delta\theta) &= 1 - \frac{\Delta\theta^2}{2!} + \frac{\Delta\theta^4}{4!} - \frac{\Delta\theta^6}{6!} + \dots \\ &\approx 1\end{aligned}$$

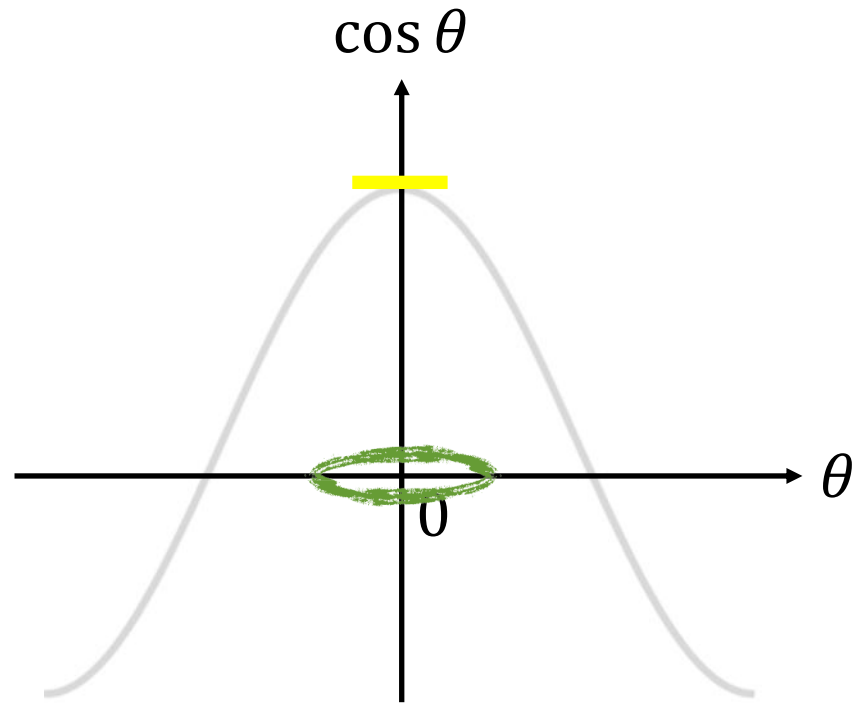


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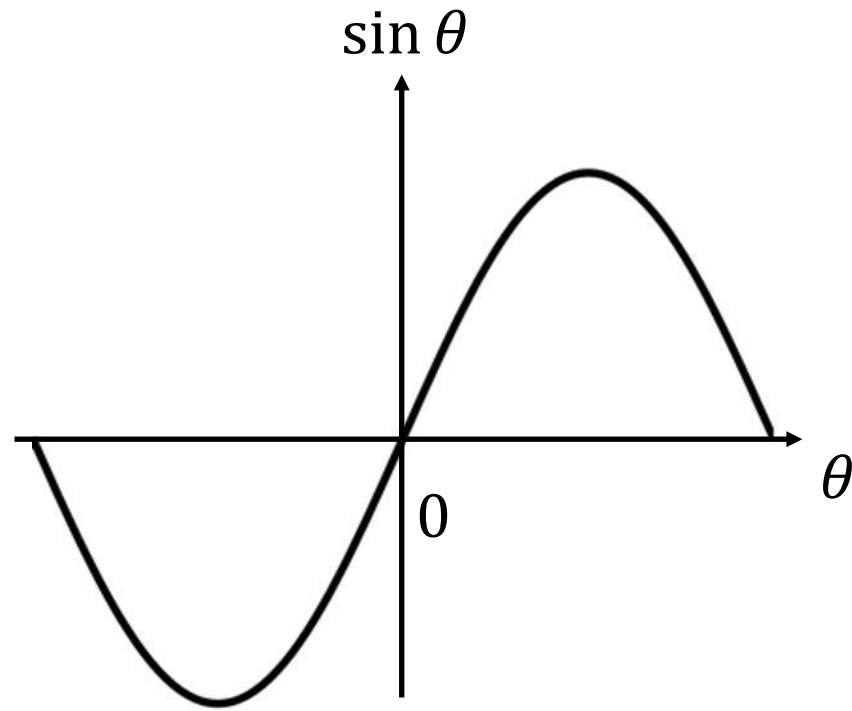
$$\sin(0 + \Delta\theta)$$

$$\sin(0 + \Delta\theta) = \Delta\theta - \frac{\Delta\theta^3}{3!} + \frac{\Delta\theta^5}{5!} - \frac{\Delta\theta^7}{7!} + \dots$$

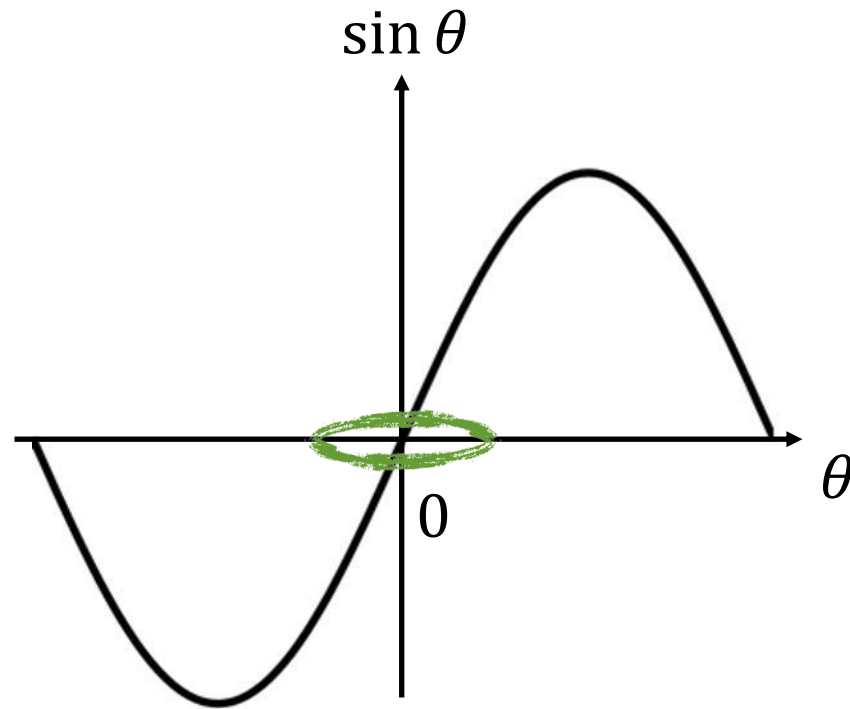
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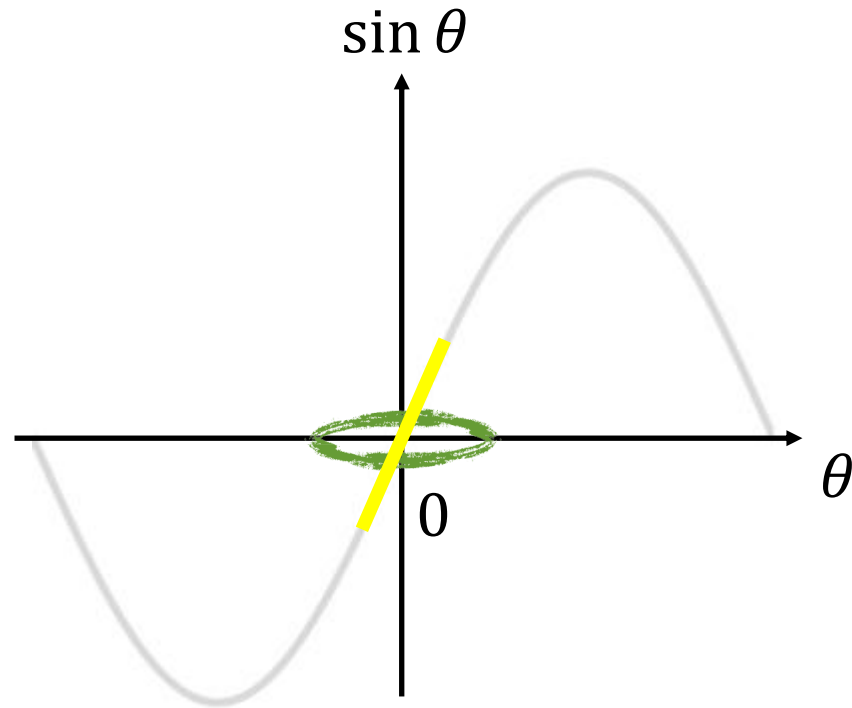


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已结束

插曲

$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

任意旋转可以表示为

$$\begin{pmatrix} 1 & 0 & 0 \\ 0 & \cos \omega_x & -\sin \omega_x \\ 0 & \sin \omega_x & \cos \omega_x \end{pmatrix} \begin{pmatrix} \cos \omega_y & 0 & \sin \omega_y \\ 0 & 1 & 0 \\ -\sin \omega_y & 0 & \cos \omega_y \end{pmatrix} \begin{pmatrix} \cos \omega_z & -\sin \omega_z & 0 \\ \sin \omega_z & \cos \omega_z & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

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$$\cos \theta \approx 1$$

$$\sin \theta \approx \theta$$

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$$\cos \theta \approx 1$$

$$\sin \theta \approx \theta$$

$$\mathbf{R}(\boldsymbol{\Omega}) \approx \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & -\omega_x \\ 0 & \omega_x & 1 \end{pmatrix} \begin{pmatrix} 1 & 0 & \omega_y \\ 0 & 1 & 0 \\ -\omega_y & 0 & 1 \end{pmatrix} \begin{pmatrix} 1 & -\omega_z & 0 \\ \omega_z & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

近似

任意旋转可以表示为

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$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

近似

任意旋转可以表示为

$$\begin{aligned}\mathbf{R}(\boldsymbol{\Omega}) &\approx \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & -\omega_x \\ 0 & \omega_x & 1 \end{pmatrix} \begin{pmatrix} 1 & 0 & \omega_y \\ 0 & 1 & 0 \\ -\omega_y & 0 & 1 \end{pmatrix} \begin{pmatrix} 1 & -\omega_z & 0 \\ \omega_z & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \\ &= \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_x\omega_y + \omega_z & 1 - \omega_x\omega_y\omega_z & -\omega_x \\ \omega_x\omega_z - \omega_y & \omega_y\omega_z + \omega_x & 1 \end{pmatrix}\end{aligned}$$

$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

近似

任意旋转可以表示为

$$\begin{aligned}\mathbf{R}(\boldsymbol{\Omega}) &\approx \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & -\omega_x \\ 0 & \omega_x & 1 \end{pmatrix} \begin{pmatrix} 1 & 0 & \omega_y \\ 0 & 1 & 0 \\ -\omega_y & 0 & 1 \end{pmatrix} \begin{pmatrix} 1 & -\omega_z & 0 \\ \omega_z & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \\ &= \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_x\omega_y + \omega_z & 1 - \omega_x\omega_y\omega_z & -\omega_x \\ \omega_x\omega_z - \omega_y & \omega_y\omega_z + \omega_x & 1 \end{pmatrix} \\ &\approx \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix}\end{aligned}$$



$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

近似

任意旋转可以表示为

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近似



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$$\mathbf{R}(\boldsymbol{\Omega}) \approx \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix}$$

新的3D位置可以表示为

$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

近似



任意旋转可以表示为

$$\mathbf{R}(\boldsymbol{\Omega}) \approx \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix}$$

新的3D位置可以表示为

$$\mathbf{P}_{\Delta t} = \mathbf{R}\mathbf{P} + \mathbf{T}$$

$$\mathbf{P}_{\Delta t} = \mathbf{R}(\boldsymbol{\Omega})\mathbf{P} + \mathbf{T}$$

近似



任意旋转可以表示为

$$\mathbf{R}(\boldsymbol{\Omega}) \approx \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix}$$

新的3D位置可以表示为

$$\mathbf{P}_{\Delta t} = \mathbf{R}\mathbf{P} + \mathbf{T} = \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix} \begin{pmatrix} X \\ Y \\ Z \end{pmatrix} + \begin{pmatrix} t_x \\ t_y \\ t_z \end{pmatrix}$$

新的3D位置可以表示为

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位移由下式给出

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位移由下式给出

$$\mathbf{P}_{\Delta t} - \mathbf{P}$$

新的3D位置可以表示为

$$\mathbf{P}_{\Delta t} = \mathbf{R}\mathbf{P} + \mathbf{T} = \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix} \begin{pmatrix} X \\ Y \\ Z \end{pmatrix} + \begin{pmatrix} t_x \\ t_y \\ t_z \end{pmatrix}$$

位移由下式给出

$$\mathbf{P}_{\Delta t} - \mathbf{P} = \begin{pmatrix} X - \omega_z Y + \omega_y Z + t_x \\ \omega_z X + Y - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + Z + t_z \end{pmatrix} - \begin{pmatrix} X \\ Y \\ Z \end{pmatrix}$$



新的3D位置可以表示为

$$\mathbf{P}_{\Delta t} = \mathbf{R}\mathbf{P} + \mathbf{T} = \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix} \begin{pmatrix} X \\ Y \\ Z \end{pmatrix} + \begin{pmatrix} t_x \\ t_y \\ t_z \end{pmatrix}$$

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化简

新的3D位置可以表示为

$$\mathbf{P}_{\Delta t} = \mathbf{R}\mathbf{P} + \mathbf{T} = \begin{pmatrix} 1 & -\omega_z & \omega_y \\ \omega_z & 1 & -\omega_x \\ -\omega_y & \omega_x & 1 \end{pmatrix} \begin{pmatrix} X \\ Y \\ Z \end{pmatrix} + \begin{pmatrix} t_x \\ t_y \\ t_z \end{pmatrix}$$

位移由下式给出

$$\mathbf{P}_{\Delta t} - \mathbf{P} = \begin{pmatrix} \cancel{X} - \omega_z Y + \omega_y Z + t_x \\ \omega_z X + \cancel{Y} - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + \cancel{Z} + t_z \end{pmatrix} - \begin{pmatrix} \cancel{X} \\ Y \\ Z \end{pmatrix}$$

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新的3D位置可以表示为

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位移由下式给出

$$\mathbf{P}_{\Delta t} - \mathbf{P} = \begin{pmatrix} \cancel{X} - \omega_z Y + \omega_y Z + t_x \\ \omega_z X + \cancel{Y} - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + \cancel{Z} + t_z \end{pmatrix} - \begin{pmatrix} \cancel{X} \\ \cancel{Y} \\ \cancel{Z} \end{pmatrix}$$

化简

$$= \begin{pmatrix} -\omega_z Y + \omega_y Z + t_x \\ \omega_z X - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + t_z \end{pmatrix}$$

位移由下式给出

$$\mathbf{P}_{\Delta t} - \mathbf{P} = \begin{pmatrix} -\omega_z Y + \omega_y Z + t_x \\ \omega_z X - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + t_z \end{pmatrix}$$

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当  $\Delta t \rightarrow 0$ ，位移除以时间得到速度

位移由下式给出

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当  $\Delta t \rightarrow 0$ ，位移除以时间得到速度

$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix}$$



位移由下式给出

$$\mathbf{P}_{\Delta t} - \mathbf{P} = \begin{pmatrix} -\omega_z Y + \omega_y Z + t_x \\ \omega_z X - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + t_z \end{pmatrix}$$

当  $\Delta t \rightarrow 0$ ，位移除以时间得到速度

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位移由下式给出

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**3D速度**

$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} -\omega_z Y + \omega_y Z + t_x \\ \omega_z X - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + t_z \end{pmatrix}$$

**3D速度**

如果相机在移动，而世界是静止的

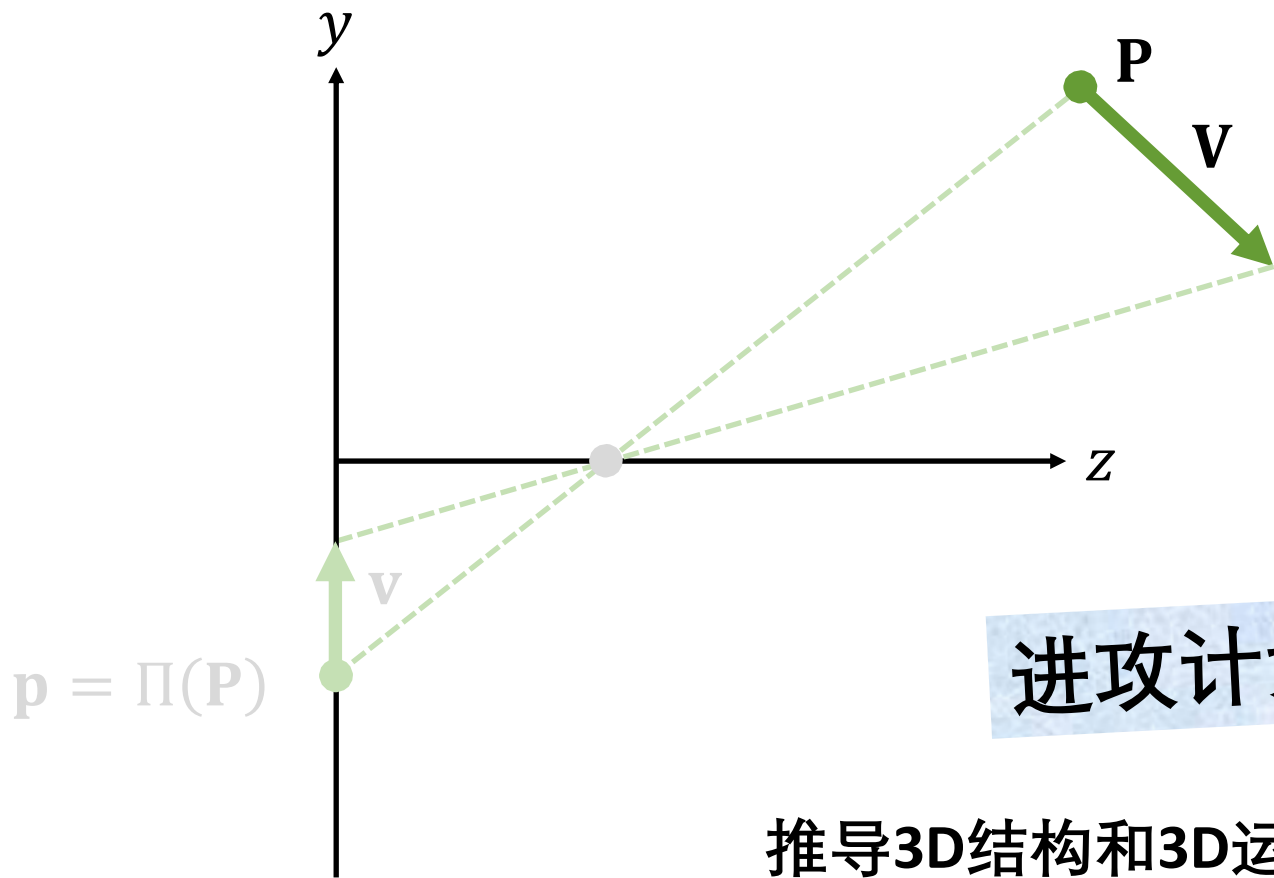
$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} -\omega_z Y + \omega_y Z + t_x \\ \omega_z X - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + t_z \end{pmatrix}$$

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$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} -\omega_z Y + \omega_y Z + t_x \\ \omega_z X - \omega_x Z + t_y \\ -\omega_y X + \omega_x Y + t_z \end{pmatrix}$$

**3D相对速度**



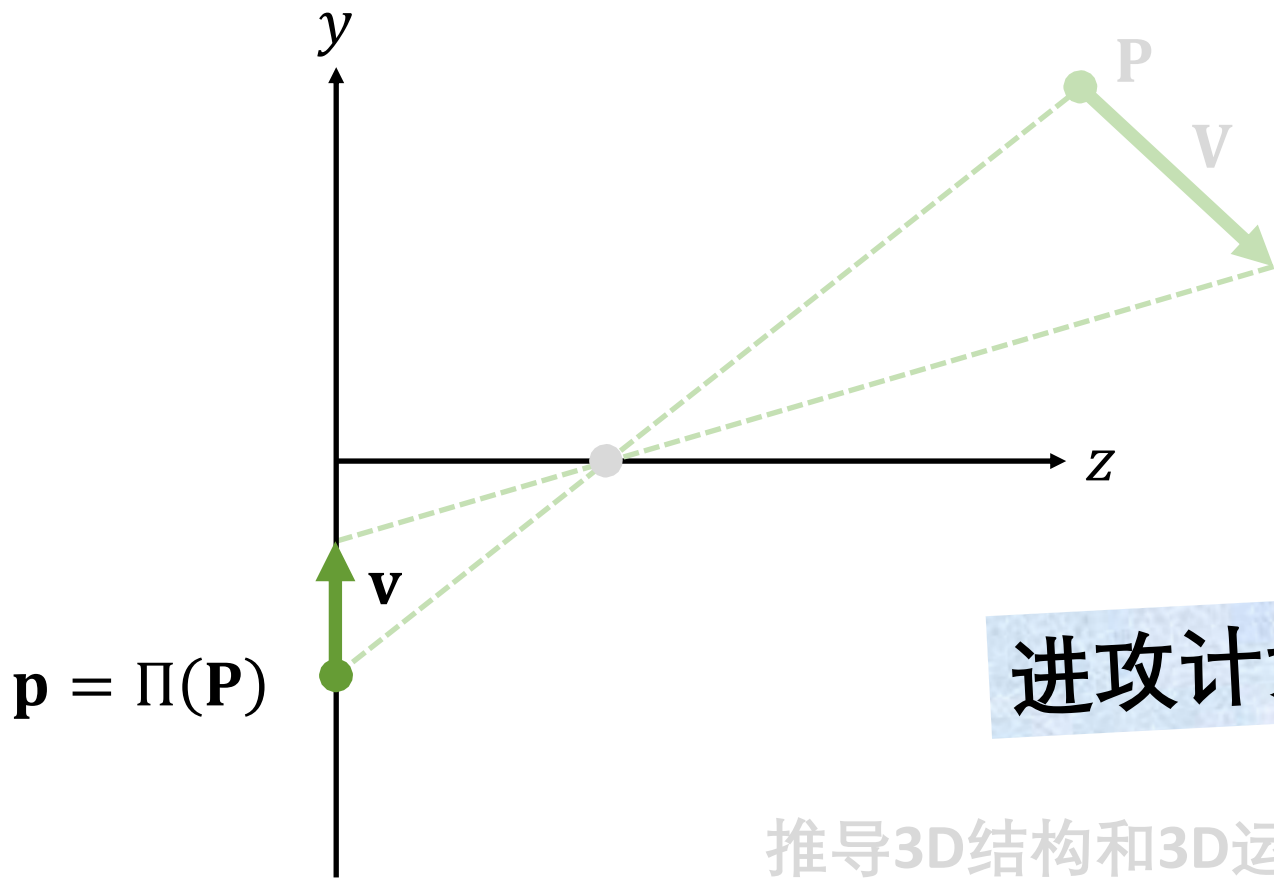
## 进攻计划

推导3D结构和3D运动的表达式

推导图像速度的表达式

关联3D和2D参数

像平面



## 进攻计划

推导3D结构和3D运动的表达式

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像平面

我们寻求图像速度的表达式

$$\frac{d\mathbf{p}}{dt} = \begin{pmatrix} dx/dt \\ dy/dt \end{pmatrix} = \begin{pmatrix} u \\ v \end{pmatrix}$$

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已知（为了不失一般性，假设  $f = 1$ ）



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$$x = \frac{X}{Z} \qquad y = \frac{Y}{Z}$$

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取导数

我们寻求图像速度的表达式

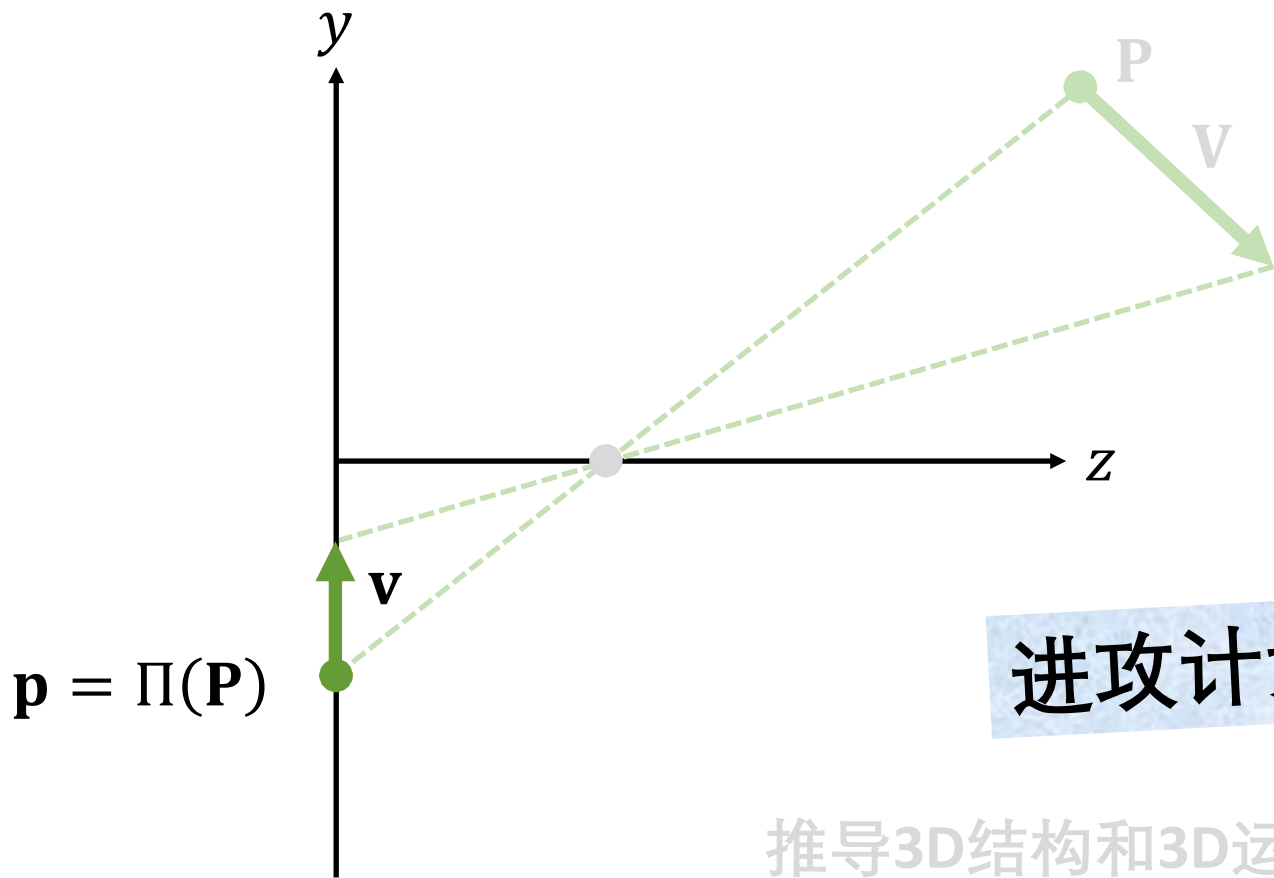
$$\frac{d\mathbf{p}}{dt} = \begin{pmatrix} dx/dt \\ dy/dt \end{pmatrix} = \begin{pmatrix} u \\ v \end{pmatrix}$$

已知（为了不失一般性，假设  $f = 1$ ）

$$x = \frac{X}{Z} \qquad y = \frac{Y}{Z}$$

取导数

$$\dot{x} = u = \frac{\dot{X}}{Z} - \frac{X\dot{Z}}{Z^2} \qquad \dot{y} = v = \frac{\dot{Y}}{Z} - \frac{Y\dot{Z}}{Z^2}$$



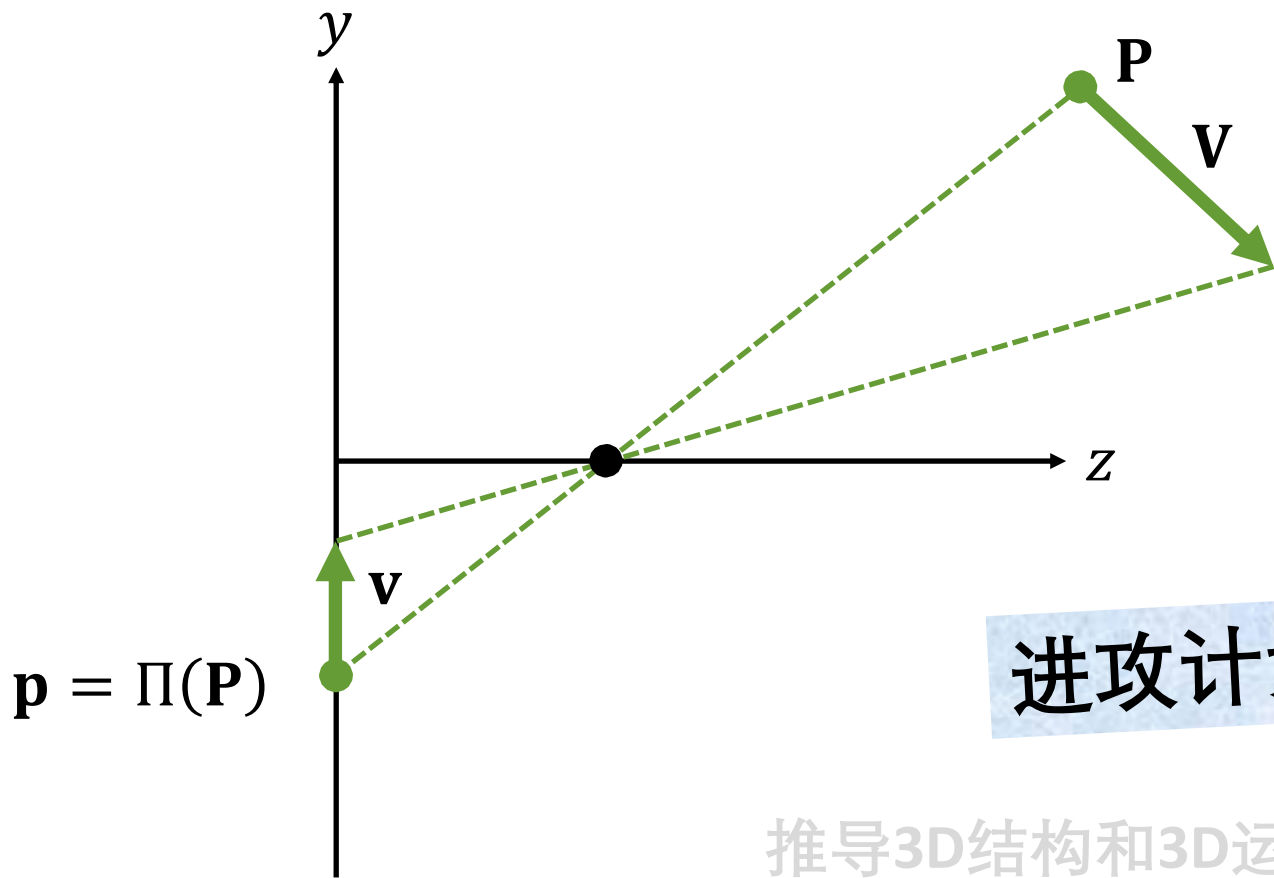
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# 进攻计划

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推导图像速度的表达式

关联3D和2D参数

像平面

我们有

$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} \omega_z Y - \omega_y Z - t_x \\ -\omega_z X + \omega_x Z - t_y \\ \omega_y X - \omega_x Y - t_z \end{pmatrix}$$

我们有

$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} \omega_z Y - \omega_y Z - t_x \\ -\omega_z X + \omega_x Z - t_y \\ \omega_y X - \omega_x Y - t_z \end{pmatrix}$$

和

$$\dot{x} = u = \frac{\dot{X}}{Z} - \frac{X\dot{Z}}{Z^2} \qquad \dot{y} = v = \frac{\dot{Y}}{Z} - \frac{Y\dot{Z}}{Z^2}$$

我们有

$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} \omega_z Y - \omega_y Z - t_x \\ -\omega_z X + \omega_x Z - t_y \\ \omega_y X - \omega_x Y - t_z \end{pmatrix}$$

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代入 (以  $u$  为例,  $v$  同理)



我们有

$$\mathbf{V} = \begin{pmatrix} \dot{X} \\ \dot{Y} \\ \dot{Z} \end{pmatrix} = \begin{pmatrix} \omega_z Y - \omega_y Z - t_x \\ -\omega_z X + \omega_x Z - t_y \\ \omega_y X - \omega_x Y - t_z \end{pmatrix}$$

和

$$\dot{x} = u = \frac{\dot{X}}{Z} - \frac{X\dot{Z}}{Z^2} \qquad \dot{y} = v = \frac{\dot{Y}}{Z} - \frac{Y\dot{Z}}{Z^2}$$

代入 (以  $u$  为例,  $v$  同理)

$$u = \frac{\dot{X}}{Z} - \frac{X\dot{Z}}{Z^2} = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

改写

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

改写

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

改写

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

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改写

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看起来眼熟吗？

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

改写

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

看起来眼熟吗？

$$x = \frac{X}{Z}$$

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

看起来眼熟吗？

$$x = \frac{X}{Z}$$

改写

代入



$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

改写

代入

$$u = \frac{1}{Z}(\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2}(\omega_y X - \omega_x Y - t_z)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

看起来眼熟吗？

改写

代入

$$u = \frac{1}{Z}(\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2}(\omega_y X - \omega_x Y - t_z)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

$$= \left( \omega_z \frac{Y}{Z} - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

改写

代入

看起来眼熟吗？

$$y = \frac{Y}{Z}$$

$$u = \frac{1}{Z} (\omega_z Y - \omega_y Z - t_x) - \frac{X}{Z^2} (\omega_y X - \omega_x Y - t_z)$$

改写

$$= \left( \omega_z \frac{Y}{Z} - \omega_y \frac{Z}{Z} - \frac{t_x}{Z} \right) - \frac{X}{Z} \left( \omega_y \frac{X}{Z} - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

代入

$$= \left( \omega_z \frac{Y}{Z} - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

代入

看起来眼熟吗?

$$y = \frac{Y}{Z}$$

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改写

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代入

$$= \left( \omega_z \frac{Y}{Z} - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x \frac{Y}{Z} - \frac{t_z}{Z} \right)$$

代入

$$= \left( \omega_z y - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x y - \frac{t_z}{Z} \right)$$

$$u = \left( \omega_z y - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x y - \frac{t_z}{Z} \right)$$

$$u = \left( \omega_z y - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x y - \frac{t_z}{Z} \right)$$

整理

$$u = \left( \omega_z y - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x y - \frac{t_z}{Z} \right)$$

整理

$$= \frac{1}{Z} (x t_z - t_x) + \omega_x (x y) - \omega_y (x^2 + 1) + \omega_z (y)$$



$$u = \left( \omega_z y - \omega_y - \frac{t_x}{Z} \right) - x \left( \omega_y x - \omega_x y - \frac{t_z}{Z} \right)$$

整理

$$= \frac{1}{Z} (x t_z - t_x) + \omega_x (x y) - \omega_y (x^2 + 1) + \omega_z (y)$$

运动场  
方程

$$u = \frac{1}{Z} (x t_z - t_x) + \omega_x (x y) - \omega_y (x^2 + 1) + \omega_z (y)$$

$$v = \frac{1}{Z} (y t_z - t_y) + \omega_x (y^2 + 1) - \omega_y (x y) - \omega_z (x)$$

## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

观察

## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

## 观察

旋转和平移分量不直接相互作用

## 运动场 方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

旋转

## 观察

旋转和平移分量不直接相互作用

运动场  
方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

平移

观察

旋转和平移分量不直接相互作用

## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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平移

## 观察

旋转和平移分量不直接相互作用

结构分量只与平移分量相互作用

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平移

## 观察

旋转和平移分量不直接相互作用

结构分量只与平移分量相互作用

平移和结构只能恢复到相差一个未知的尺度因子

## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

平移

## 观察

旋转和平移分量不直接相互作用

结构分量只与平移分量相互作用

旋转引起的图像速度与结构无关



## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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平移

## 观察

旋转和平移分量不直接相互作用

结构分量只与平移分量相互作用

旋转引起的图像速度与结构无关

旋转分量不携带深度信息

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旋转

## 观察

旋转和平移分量不直接相互作用

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$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

平移



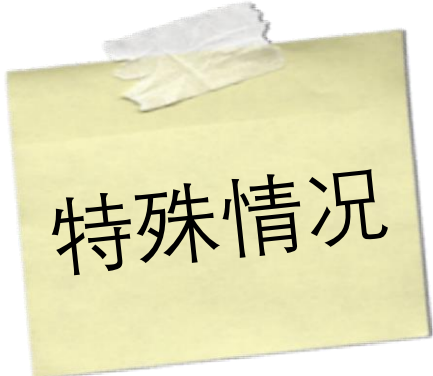


运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

表面平行于相机移动



特殊情况

运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$
$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z = 0$$

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方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$
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表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z = 0$$

代入

## 运动场 方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

## 表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z = 0$$

代入

$$u = -\frac{t_x}{Z} \qquad v = -\frac{t_y}{Z}$$



## 表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z = 0$$

$$u = -\frac{t_x}{Z} \qquad v = -\frac{t_y}{Z}$$

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$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z = 0$$

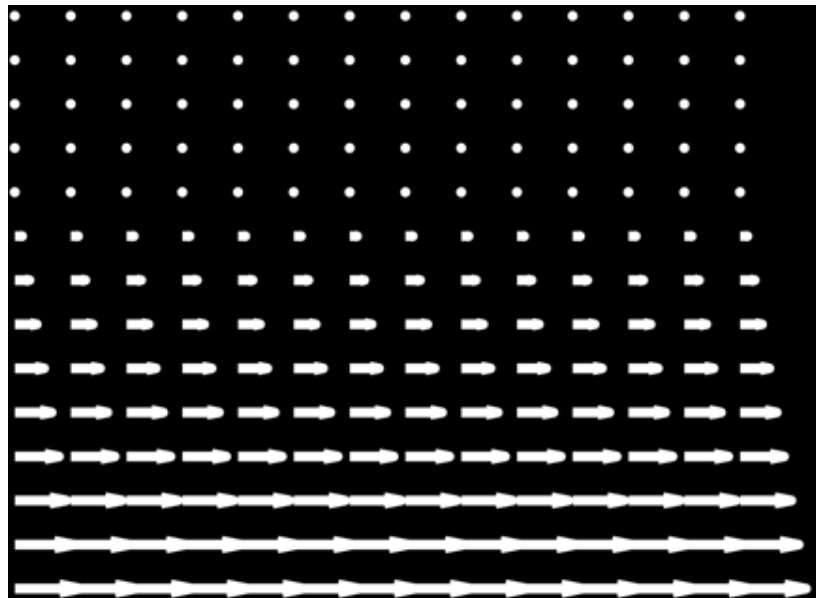
$$u = -\frac{t_x}{Z} \qquad v = -\frac{t_y}{Z}$$

运动场是什么样的？

## 表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z = 0$$

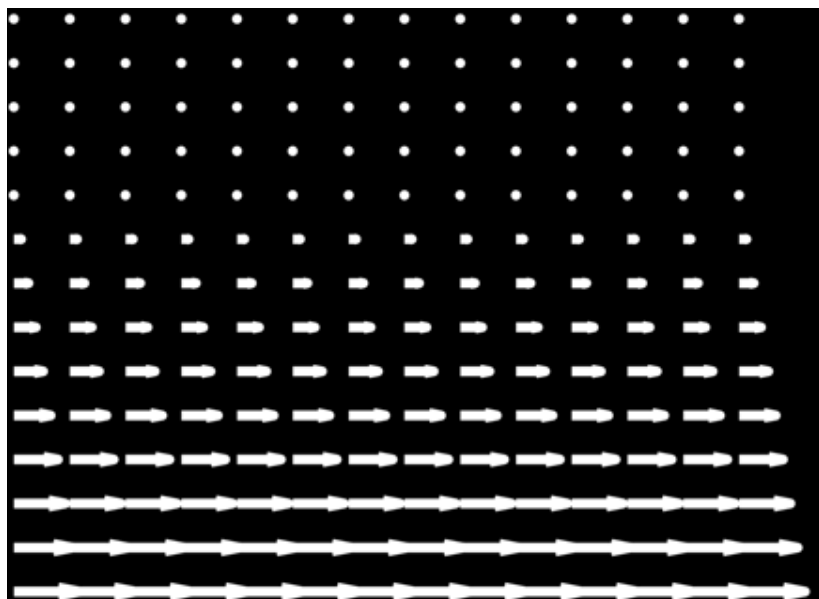
$$u = -\frac{t_x}{Z} \quad v = -\frac{t_y}{Z}$$



## 表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z = 0$$

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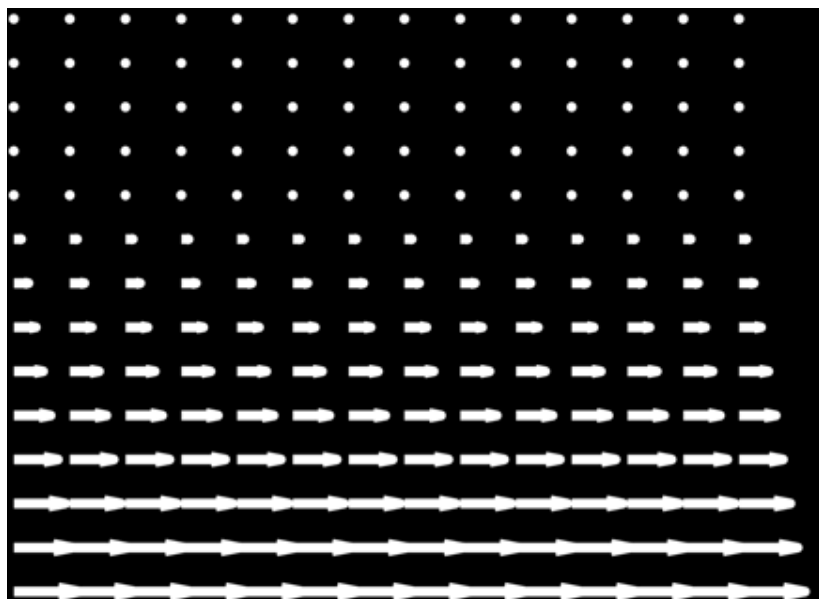


彼此相互平行

## 表面平行于相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z = 0$$

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彼此相互平行

长度与深度成反比

# 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$





# 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

平移

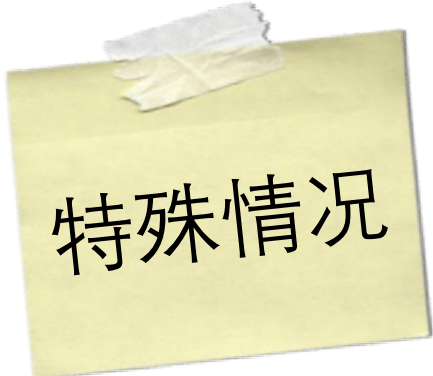


## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

表面朝相机移动



特殊情况



运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$
$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z > 0$$

## 运动场 方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z > 0$$

代入

## 运动场 方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z > 0$$

代入

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right)$$

$$v = \frac{t_z}{Z} \left( y - \frac{t_y}{t_z} \right)$$

## 表面朝相机移动

$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z > 0$$

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right) \qquad v = \frac{t_z}{Z} \left( y - \frac{t_y}{t_z} \right)$$

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z > 0$$

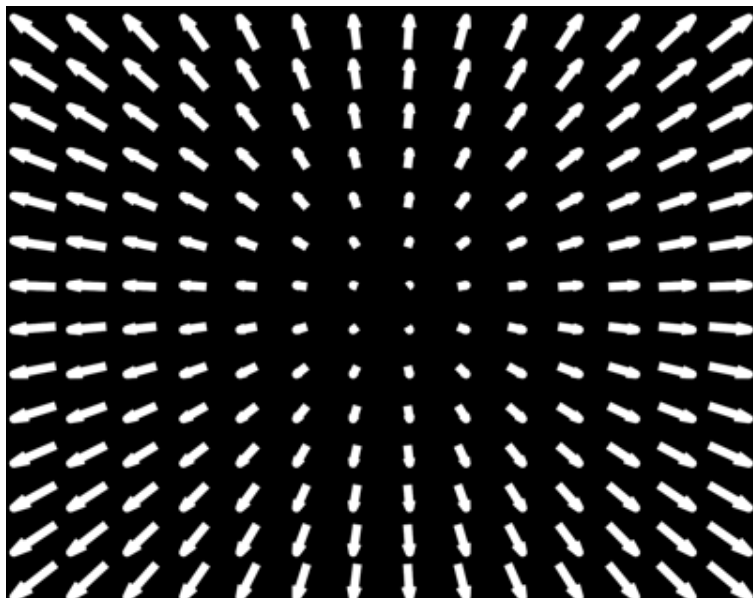
$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right) \qquad v = \frac{t_z}{Z} \left( y - \frac{t_y}{t_z} \right)$$

运动场是什么样的？

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z > 0$$

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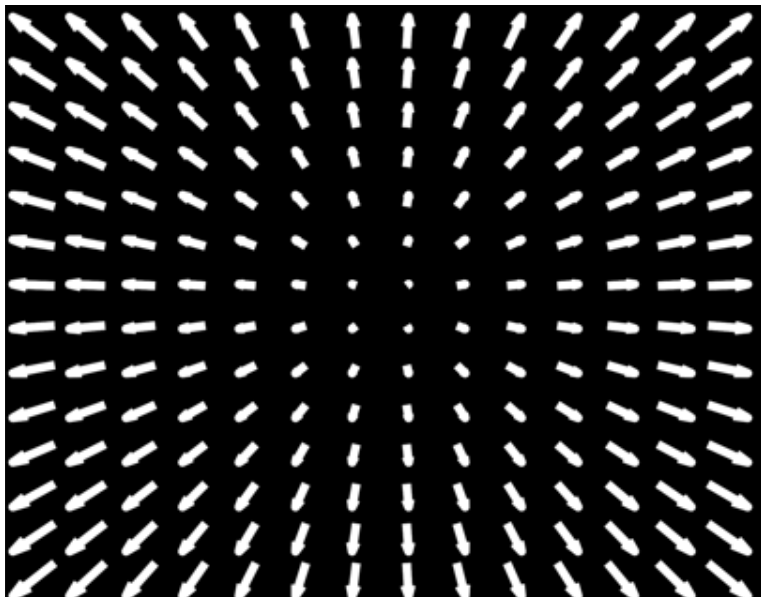


## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z > 0$$

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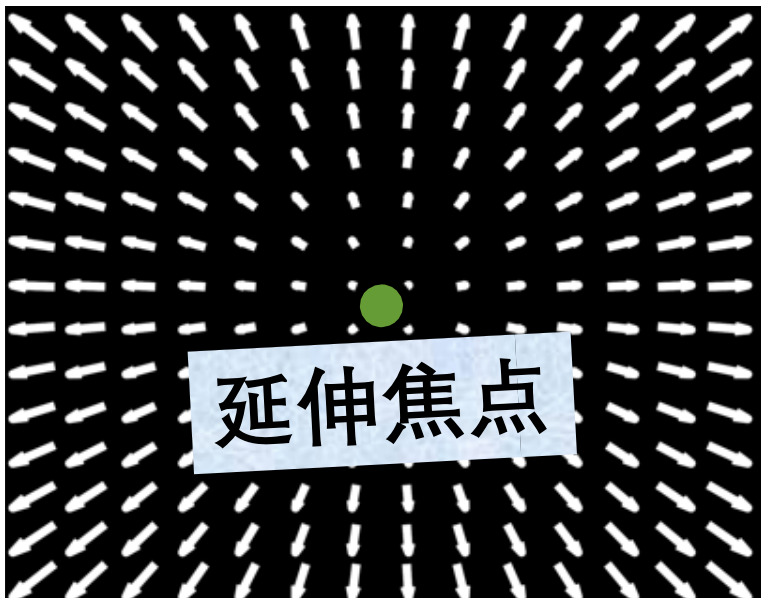
向外辐射状

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z > 0$$

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向外辐射状

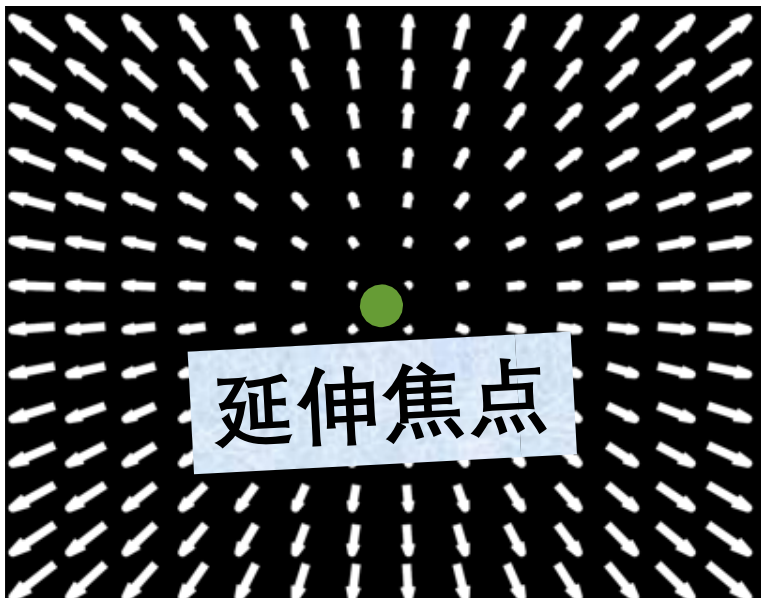


## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z > 0$$

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向外辐射状

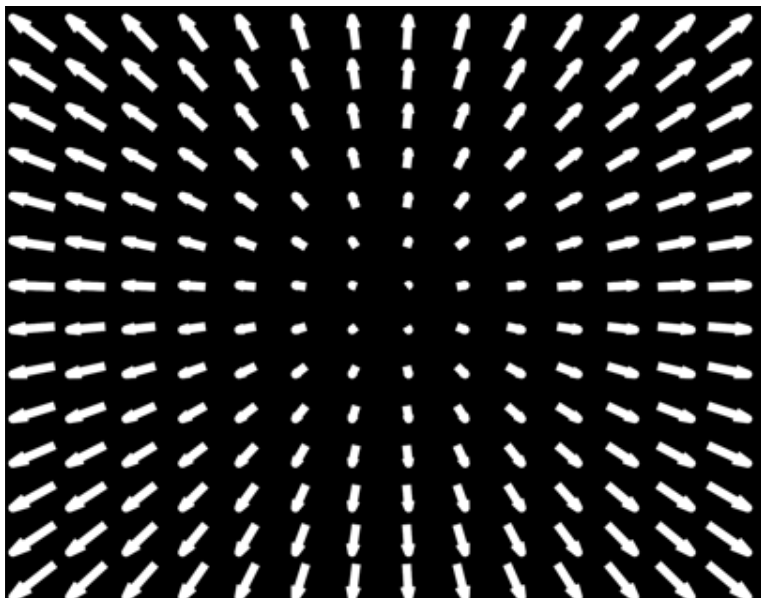
延伸焦点 (Focus of Expansion,  
FOE):  $\left( \frac{t_x}{t_z} f, \frac{t_y}{t_z} f \right)$

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z > 0$$

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right)$$

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向外辐射状

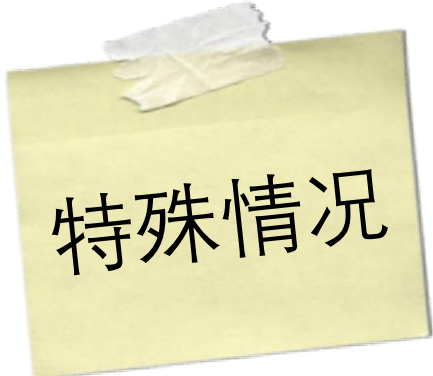
长度与深度成反比

运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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表面远离相机移动



特殊情况

**运动场  
方程**

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$
$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

## 表面远离相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z < 0$$

运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$
$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

## 表面远离相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z < 0$$

代入

## 运动场 方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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## 表面远离相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z < 0$$

代入

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right)$$

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## 表面朝相机移动

$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z < 0$$

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$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z < 0$$

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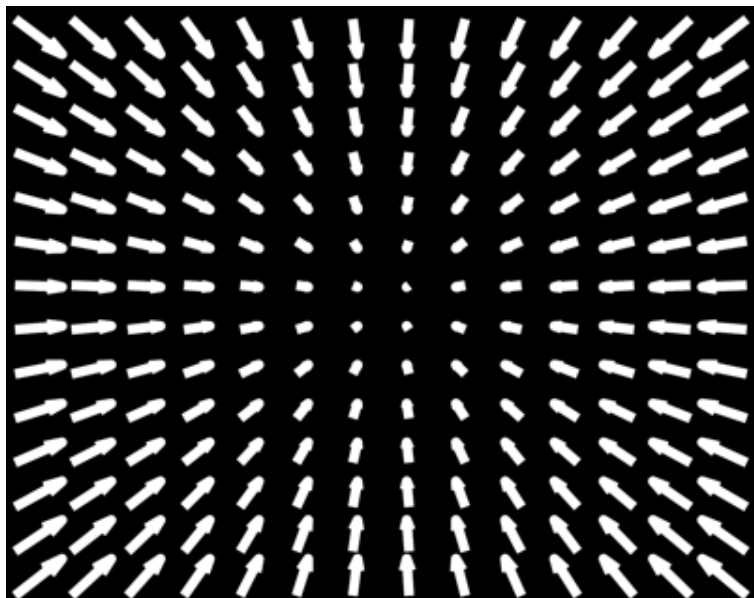
运动场是什么样的？



## 表面朝相机移动

$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \quad \text{且} \quad t_z < 0$$

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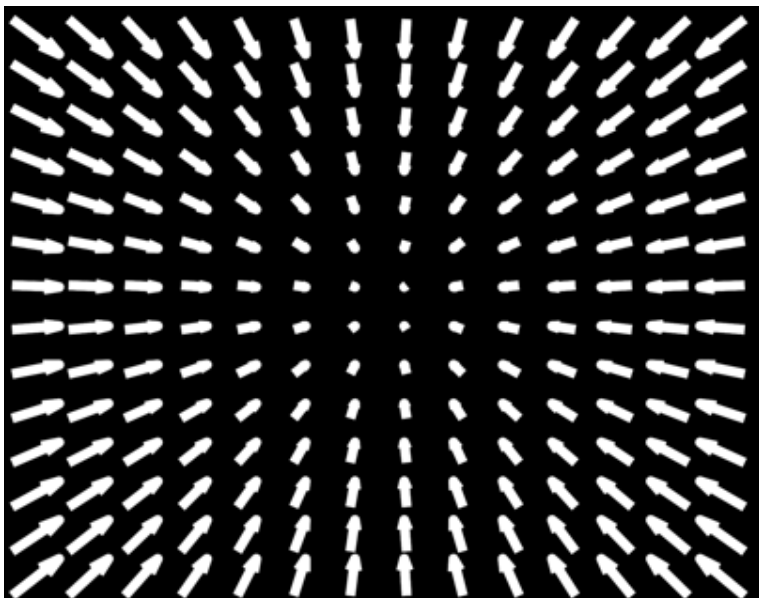


## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z < 0$$

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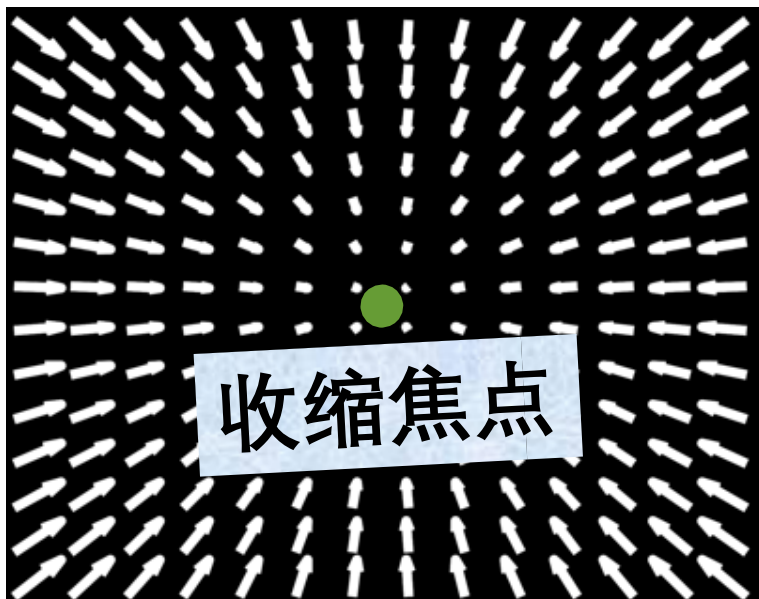
向内辐射状

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z < 0$$

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right)$$

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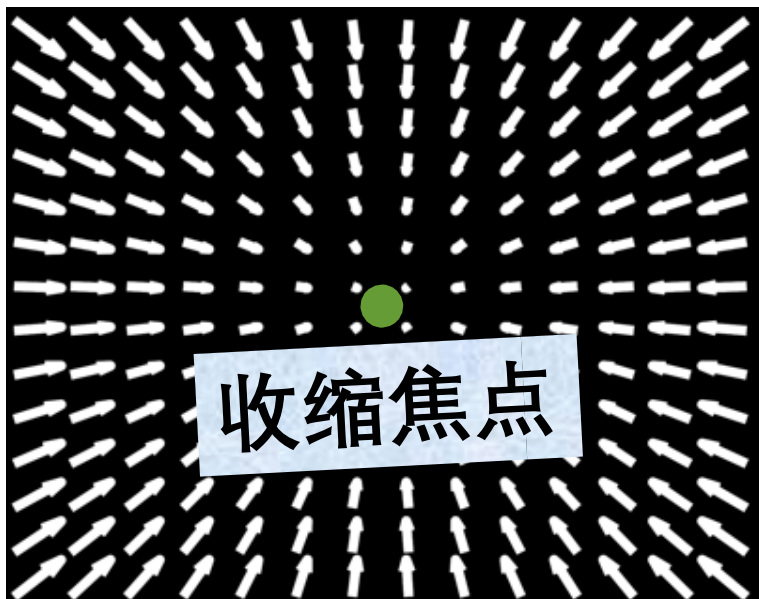
向內輻射狀

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z < 0$$

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right)$$

$$v = \frac{t_z}{Z} \left( y - \frac{t_y}{t_z} \right)$$



向內輻射狀

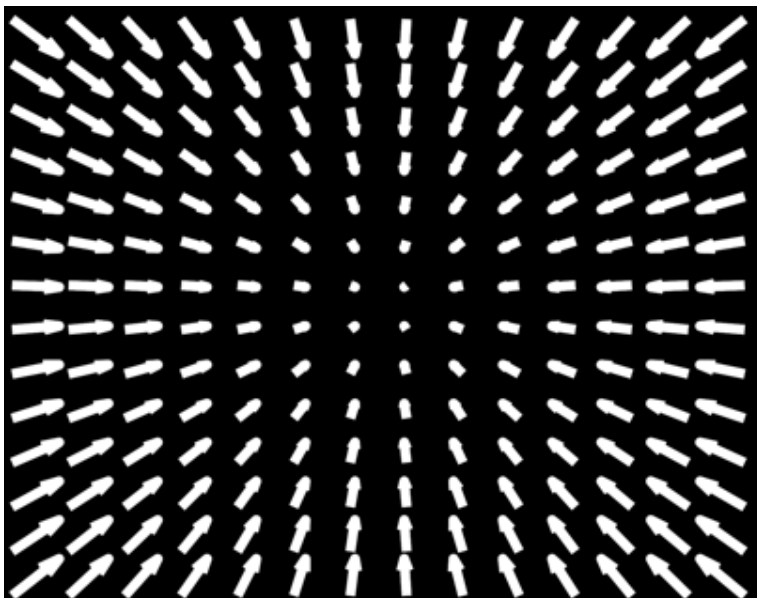
收缩焦点 (Focus of Contraction,  
FOC):  $\left( \frac{t_x}{t_z} f, \frac{t_y}{t_z} f \right)$

## 表面朝相机移动

$$\Omega = (\omega_x, \omega_y, \omega_z)^T = (0, 0, 0)^T \text{ 且 } t_z < 0$$

$$u = \frac{t_z}{Z} \left( x - \frac{t_x}{t_z} \right)$$

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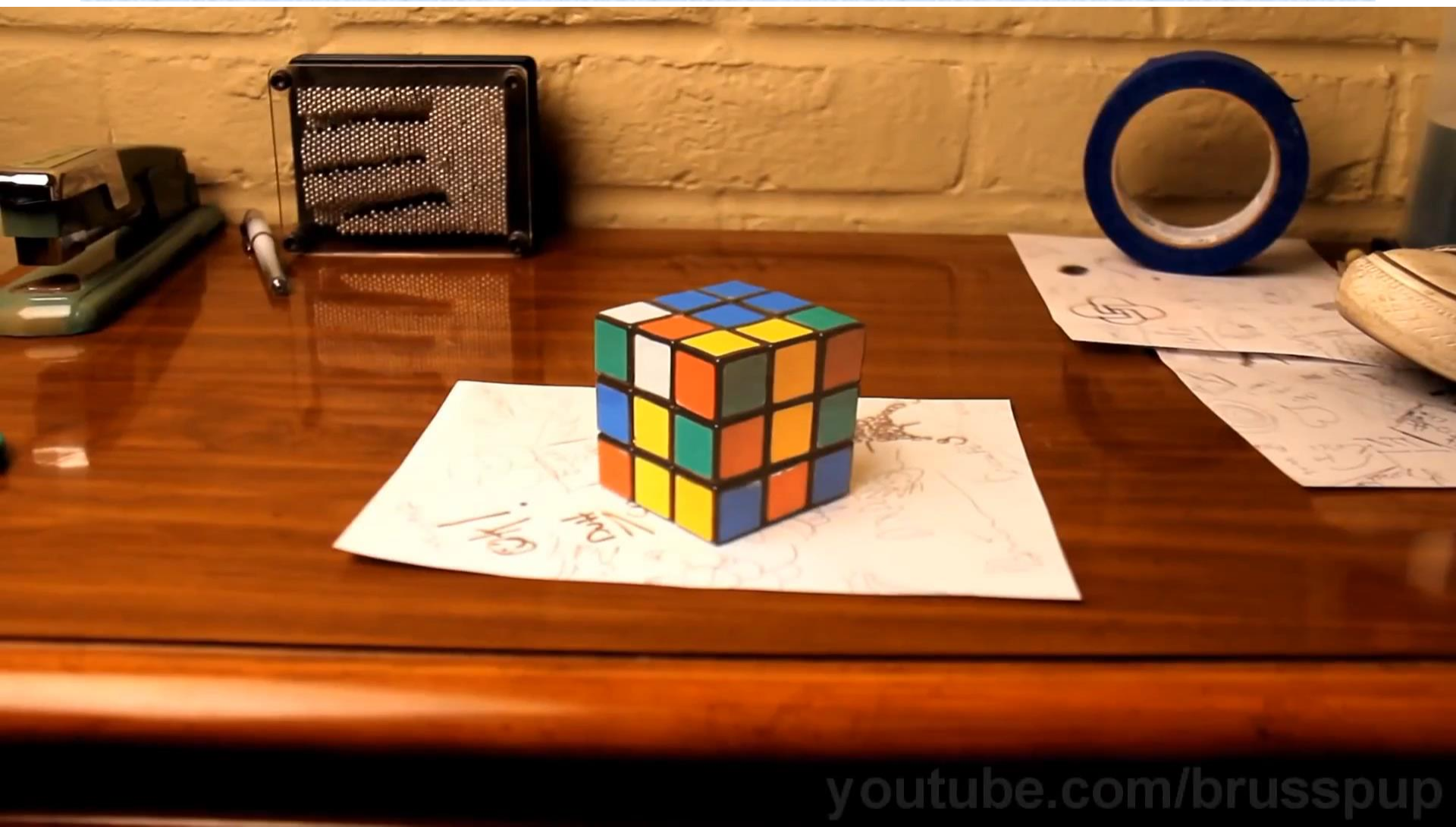
向内辐射状

长度与深度成反比

# 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$





# 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

旋转

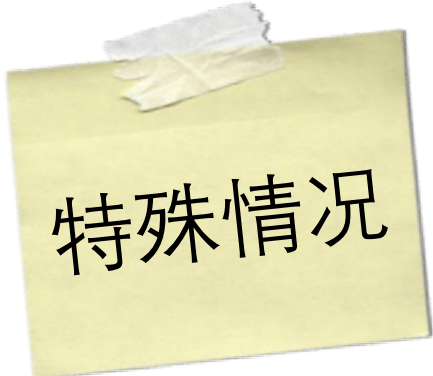


## 运动场 方程

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

“纯”旋转



特殊情况



运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$
$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

“纯”旋转

$$\boldsymbol{\Omega} = (\omega_x, \omega_y, \omega_z)^T \text{ 且 } \mathbf{T} = \mathbf{0}$$

## 运动场 方程

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## “纯”旋转

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代入

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图像坐标的二次函数

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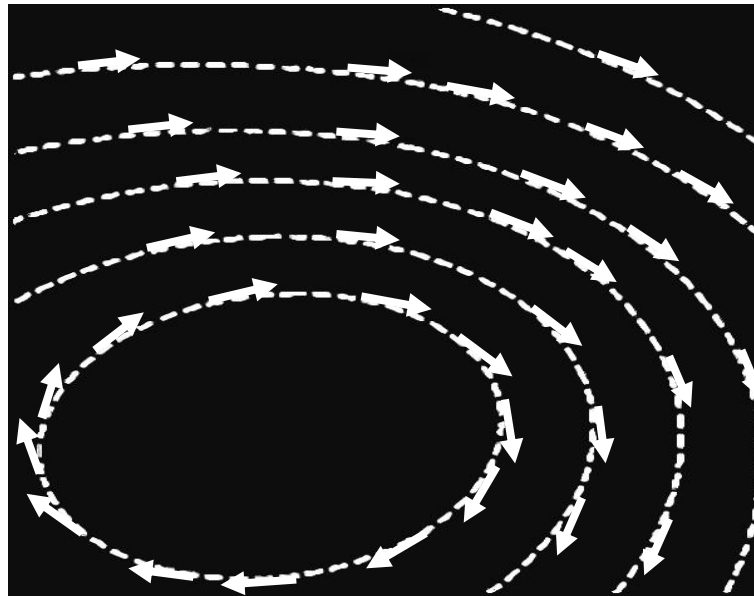
运动场是什么样的？

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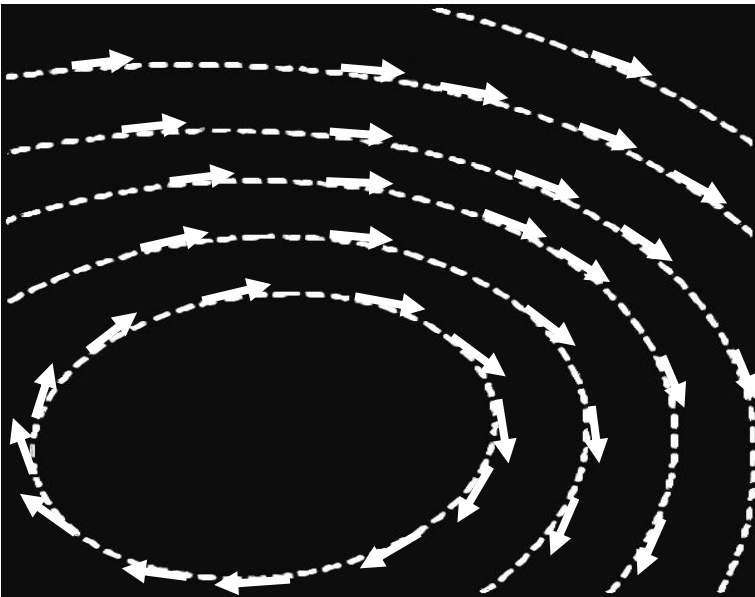


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旋转状

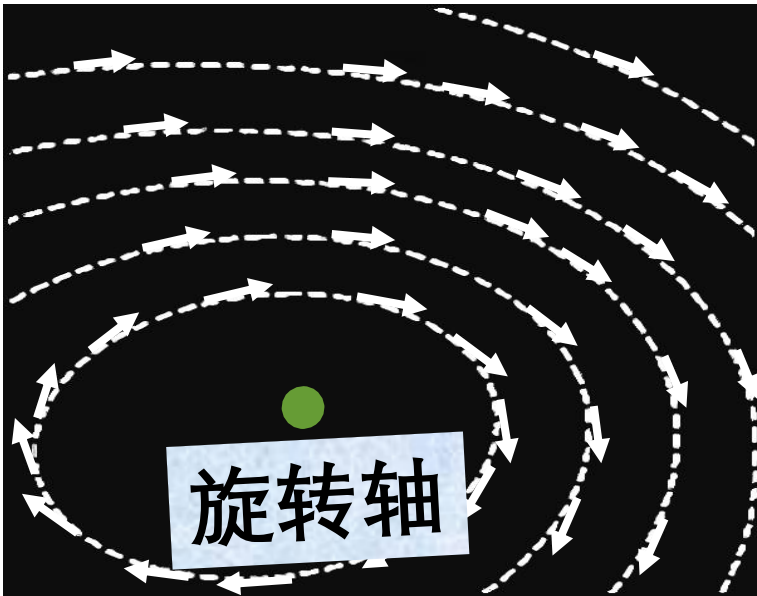


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旋转状

旋转轴 (Axis of Rotation, AOR)

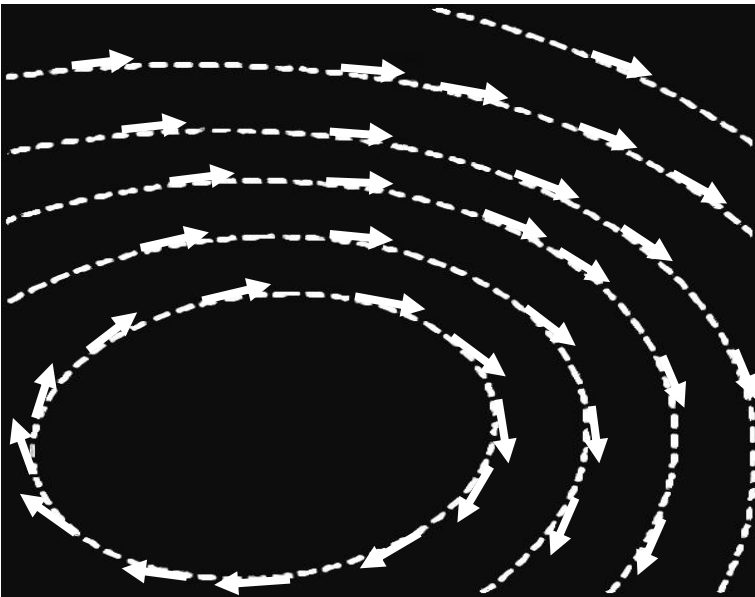
穿过图像平面： $\left( \frac{\omega_x}{\omega_z} f, \frac{\omega_y}{\omega_z} f \right)$

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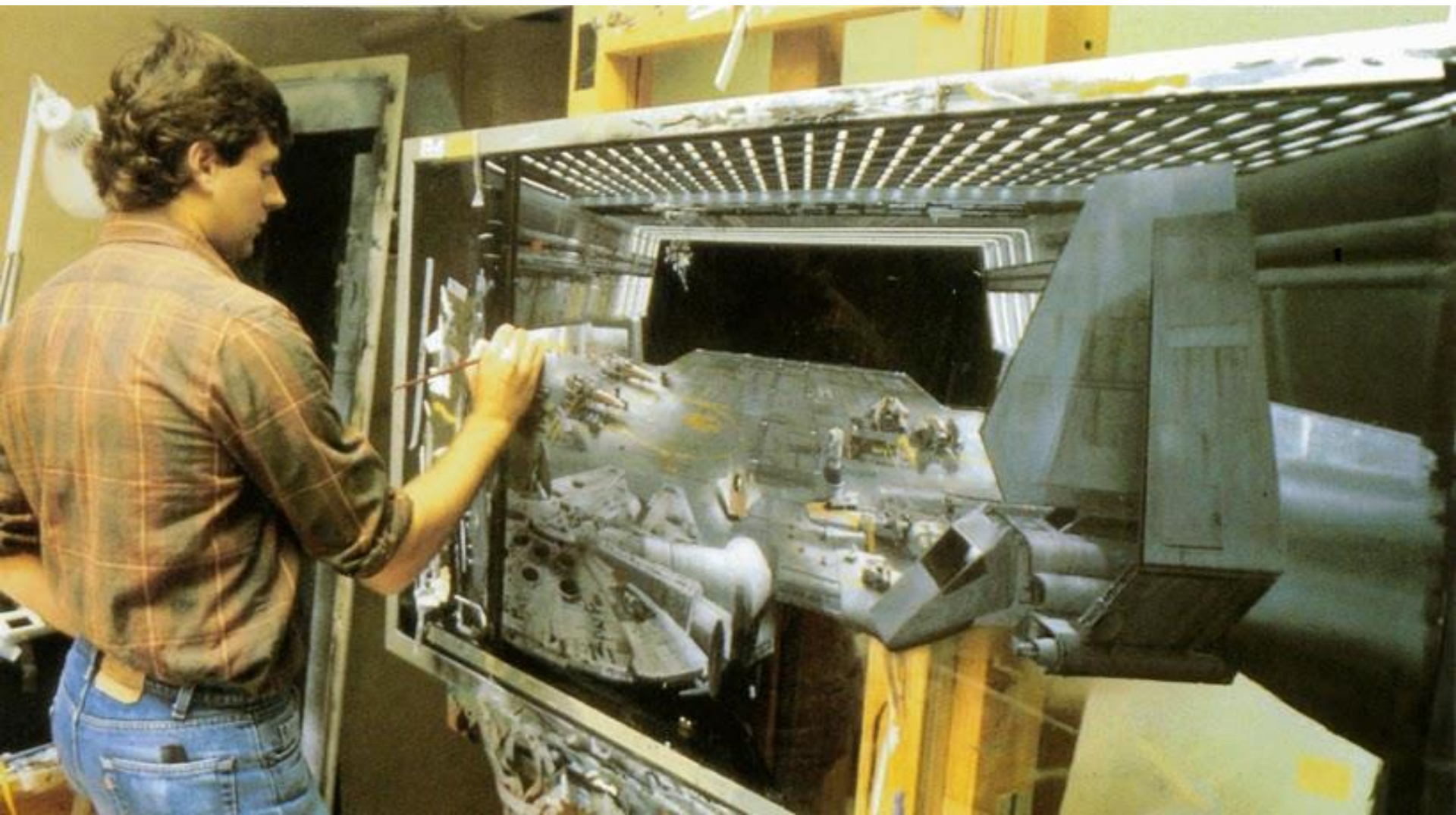


旋转状

长度与深度成反比



星球大战VI：绝地归来





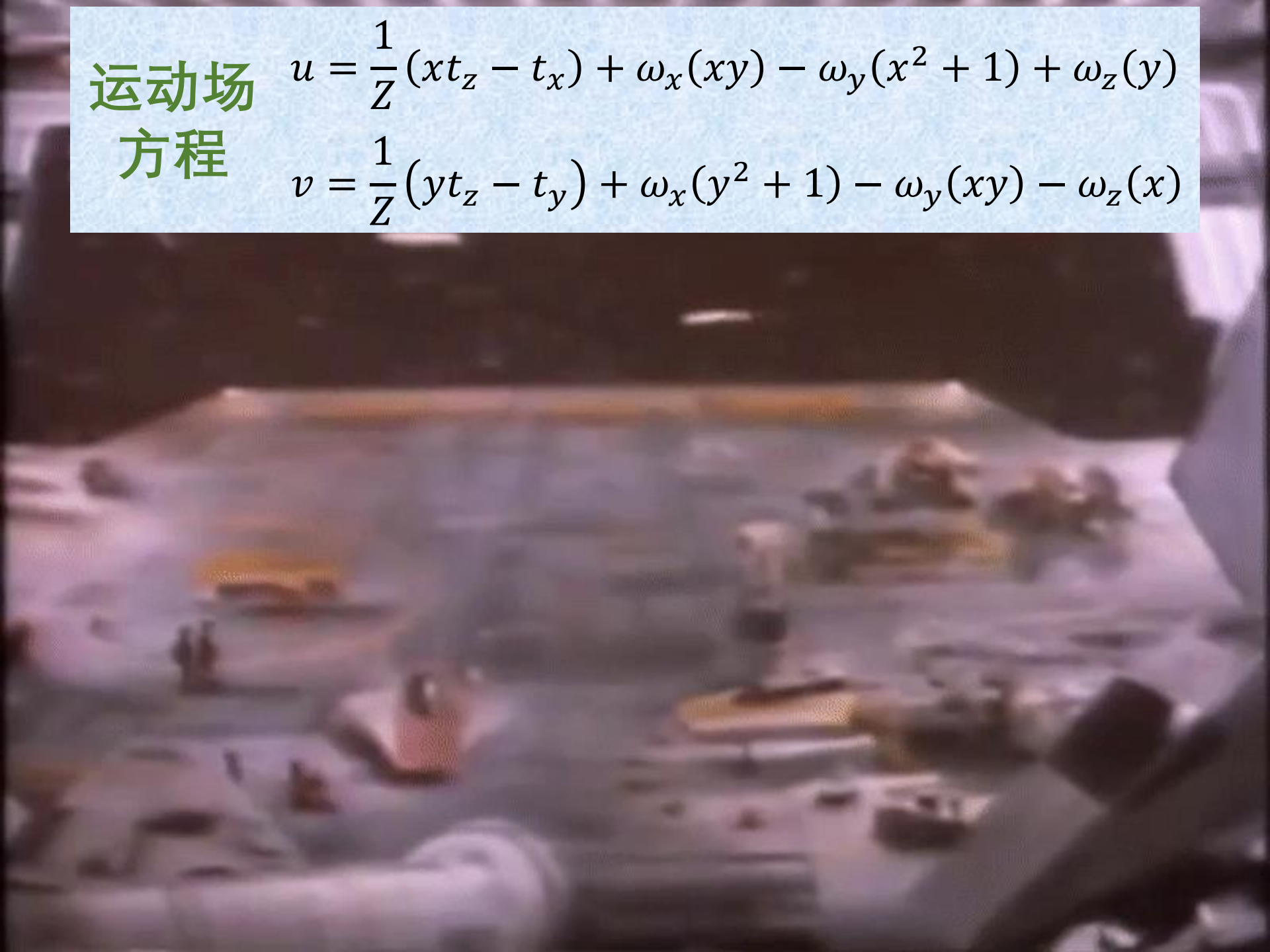




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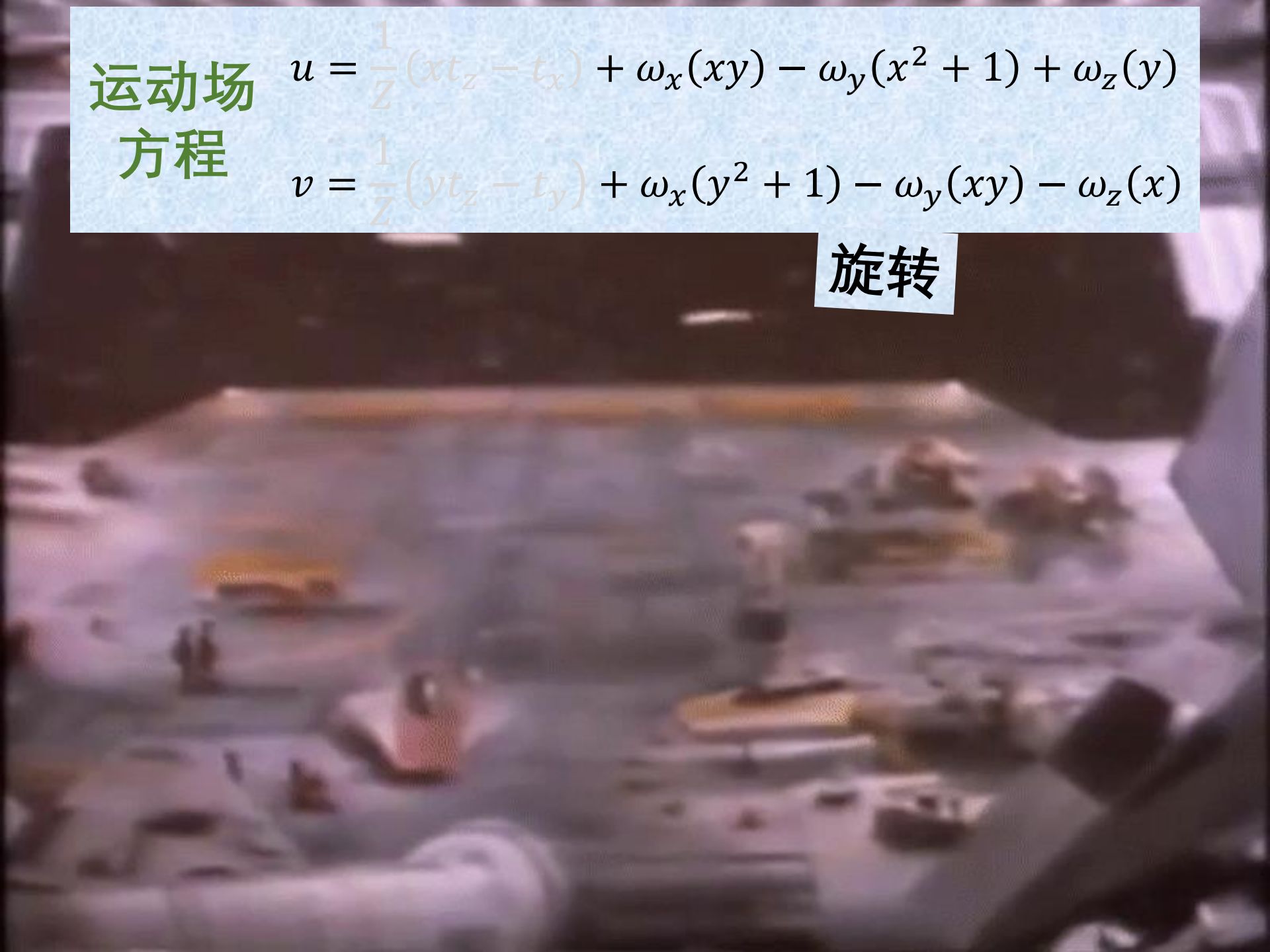


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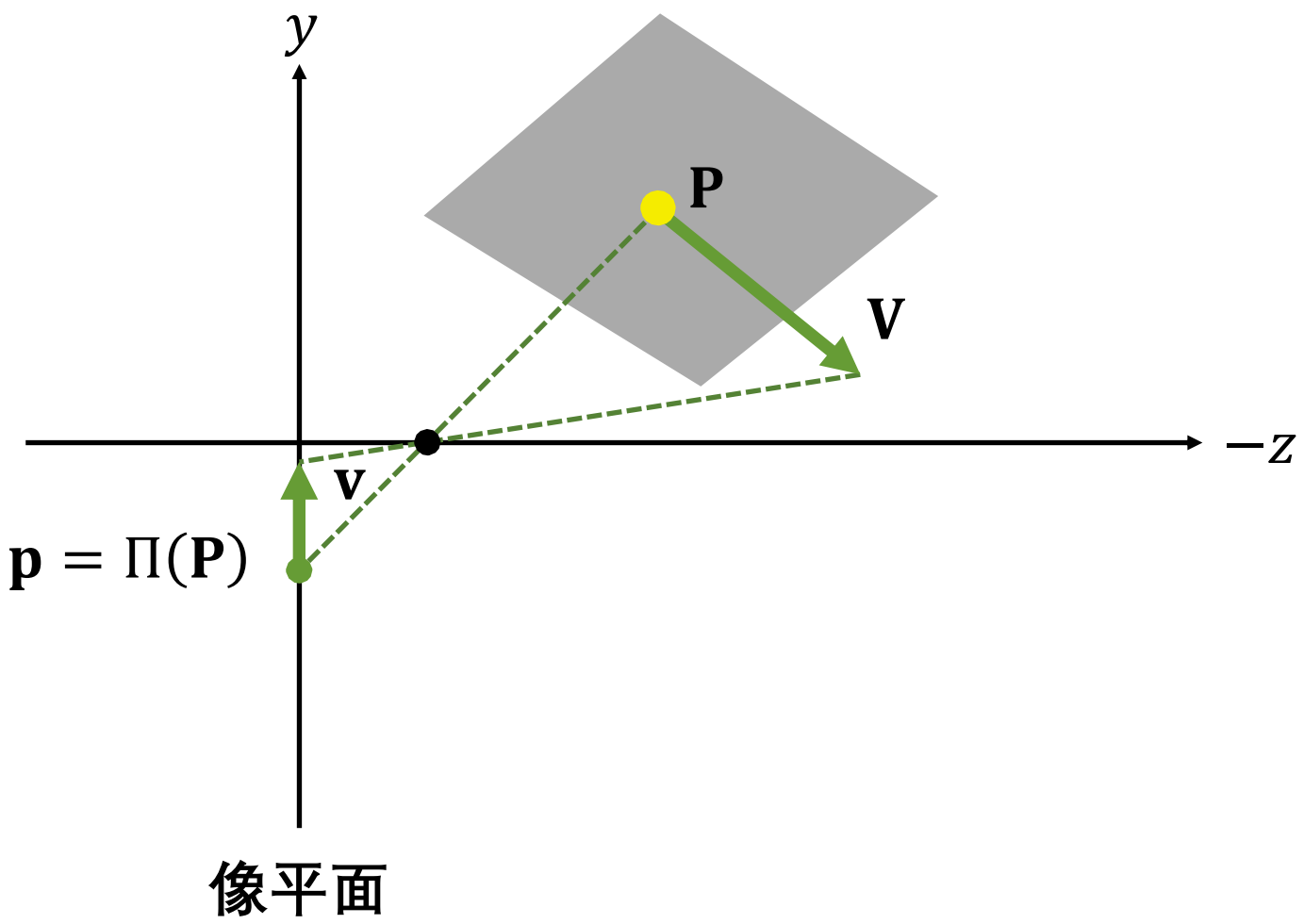
旋转







表面是一个平面

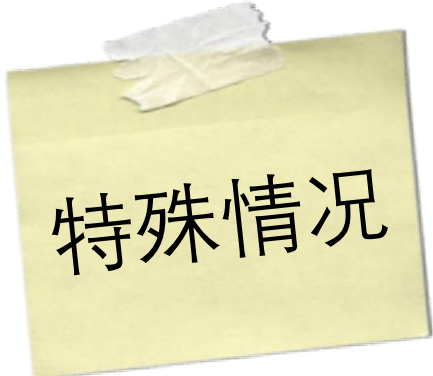


运动场  
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表面是一个平面： $\alpha X + \beta Y + \gamma Z = \delta$



特殊情况

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$$x = \frac{X}{Z} \quad y = \frac{Y}{Z}$$

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$a_i$ 是未知平面和相机运动参数的函数

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平面表面的运动场由二次多项式  
精确地、全局地给出

# 参数化流

$$I(x, y, t) = I(x + \Delta x(\mathbf{x}; \mathbf{p}), y + \Delta y(\mathbf{x}; \mathbf{p}), t + \Delta t)$$



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参数模型描述的运动

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光滑表面的流可以用一个低阶多项式来近似

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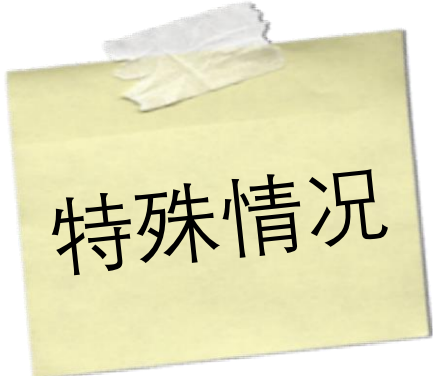
光滑表面的流可以用一个低阶多项式来近似  
仿射模型

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给定3D运动参数和光流，估计结构



特殊情况

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分离Z

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“非旋转”光流

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一个未知数的两个方程

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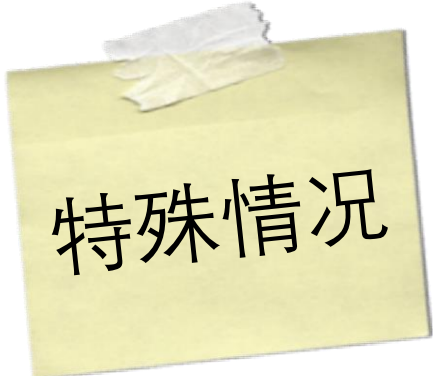
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假设没有平移并给定光流，恢复3D旋转



特殊情况

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给定3个测量值可以恢复旋转速度

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如何求解旋转速度？

假设没有平移并给定光流，恢复3D旋转

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使用最小二乘法求解

假设没有平移并给定光流，恢复3D旋转

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使用最小二乘法求解

$$\arg \min_{\omega_x, \omega_y, \omega_z} \sum_x \sum_y \left[ (u - [\omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)])^2 + (v - [\omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)])^2 \right]$$

假设没有平移并给定光流，恢复3D旋转

使用最小二乘法求解

$$\arg \min_{\omega_x, \omega_y, \omega_z} \sum_x \sum_y \left[ \left( u - [\omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)] \right)^2 \right. \\ \left. + \left( v - [\omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)] \right)^2 \right]$$

如何求解该目标函数？

假设没有平移并给定光流，恢复3D旋转

使用最小二乘法求解

$$\arg \min_{\omega_x, \omega_y, \omega_z} \sum_x \sum_y \left[ (u - [\omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)])^2 + (v - [\omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)])^2 \right]$$

如何求解该目标函数？

求导，令其等于零并求解

假设没有平移并给定光流，恢复3D旋转

使用最小二乘法求解

$$\arg \min_{\omega_x, \omega_y, \omega_z} \sum_x \sum_y \left[ \left( u - [\omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)] \right)^2 \right. \\ \left. + \left( v - [\omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)] \right)^2 \right]$$

如何求解该目标函数？

使用伪逆求解

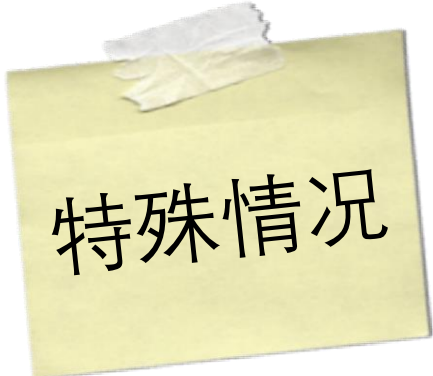


## 运动场 方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

$$v = \frac{1}{Z}(yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

假设给定线速度方向且旋转角 $\omega_z = 0$ ，给定光流，恢复3D旋转



特殊情况

运动场  
方程

$$u = \frac{1}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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假设给定线速度方向且旋转角 $\omega_z = 0$ ，给定光流，恢复3D旋转

代入

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代入

$$u = \frac{\alpha}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1)$$

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假设给定线速度方向且旋转角 $\omega_z = 0$ ，给定光流，恢复3D旋转

未知尺度因子

代入

$$u = \frac{\alpha}{Z}(xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1)$$

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计算流方程与下式的点积

$$\begin{pmatrix} t_y - yt_z \\ -t_x + xt_z \end{pmatrix}$$

假设给定线速度方向且旋转角 $\omega_z = 0$ ，给定光流，恢复3D旋转

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计算流方程与下式的点积

$$\begin{pmatrix} t_y - yt_z \\ -t_x + xt_z \end{pmatrix}$$

$$u(t_y - yt_z) + v(-t_x + xt_z) =$$

$$[\omega_x(xy) - \omega_y(x^2 + 1)](t_y - yt_z) +$$

$$[\omega_x(y^2 + 1) - \omega_y(xy)](-t_x + xt_z)$$



假设给定线速度方向且旋转角 $\omega_z = 0$ ，给定光流，恢复3D旋转

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得到一个两个未知数的线性非齐次方程

假设给定线速度方向且旋转角 $\omega_z = 0$ ，给定光流，恢复3D旋转

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得到一个两个未知数的线性非齐次方程

可以使用最小二乘法求解

2012/05/04 14:28:29

REC: OUT

(Video) In: 12.50(fps)  
Out: 33.03(fps)

tx: 3.43(m)  
ty: 60.53(m)  
vx: 0.16(Km/h)  
vy: 3.40(Km/h)

Train egomotion estimation

vicomtech

IK4 Research Alliance

# 碰撞时间

(time-to-contact)



**如何计算碰撞时间？**

**如何计算碰撞时间？**

**相机原点到达被观察表面前的持续时间**

碰撞时间



碰撞时间

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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计算光流场的散度

碰撞时间

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计算光流场的散度

$$\text{div}(u, v) = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y}$$

# 微积分和几何学

碰撞时间

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计算光流场的散度

$$\text{div}(u, v) = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y}$$

$$\begin{aligned} \text{div}(u, v) &= \frac{\partial \rho}{\partial x} (-t_x + xt_z) + 2\rho t_z + \frac{\partial \rho}{\partial y} (-t_y + yt_z) \\ &\quad + y\omega_x - 2x\omega_y + 2y\omega_x - x\omega_y \end{aligned}$$

碰撞时间

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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计算光流场的散度

深度倒数

$$\text{div}(u, v) = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y}$$

$$\begin{aligned} \text{div}(u, v) = & \frac{\partial \rho}{\partial x} (-t_x + xt_z) + 2\rho t_z + \frac{\partial \rho}{\partial y} (-t_y + yt_z) \\ & + y\omega_x - 2x\omega_y + 2y\omega_x - x\omega_y \end{aligned}$$

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$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

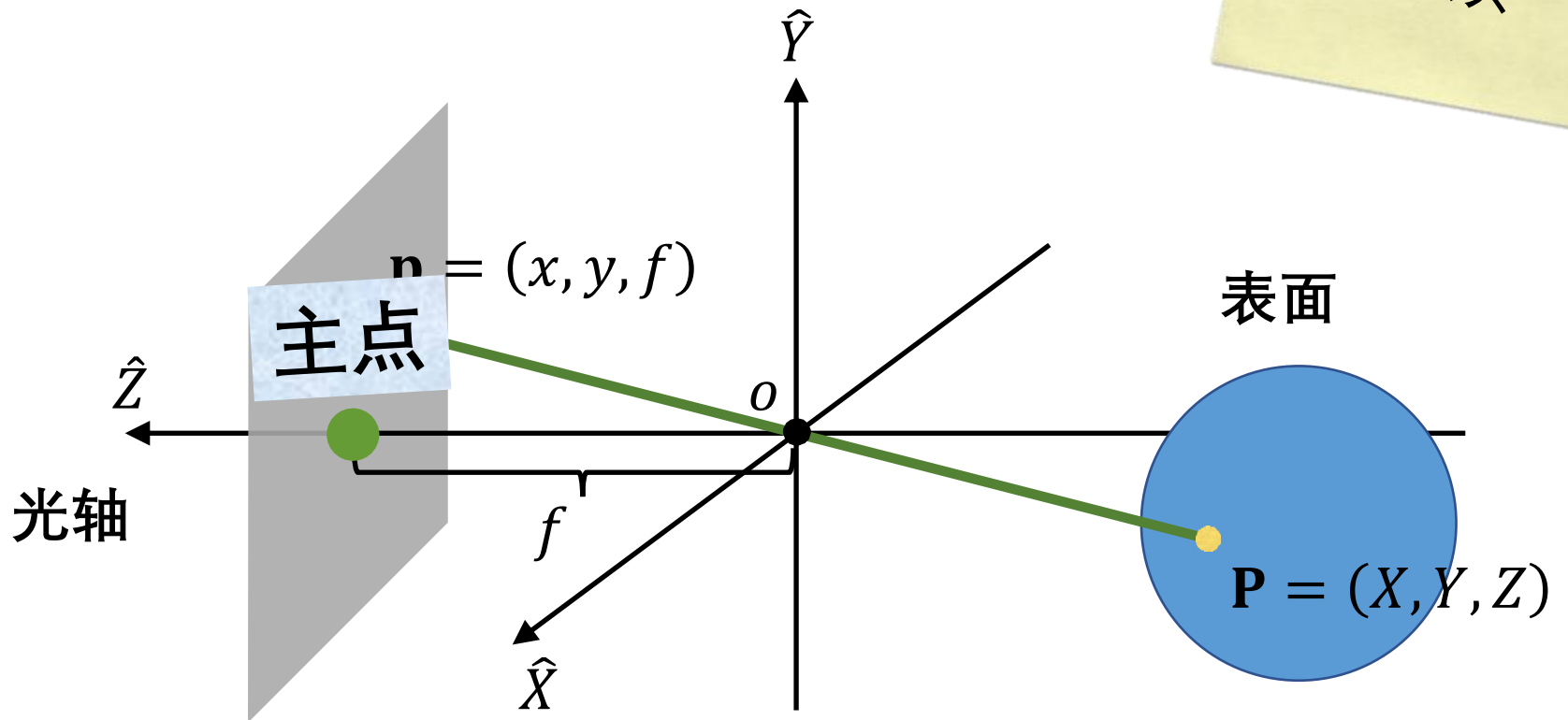
$$v = \frac{1}{Z} (yt_z - t_y) + \omega_x(y^2 + 1) - \omega_y(xy) - \omega_z(x)$$

计算光流场的散度

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计算主点的散度

回顾



$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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计算光流场的散度

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### 计算光流场的散度

$$\begin{aligned} \operatorname{div}(u, v) = & \frac{\partial \rho}{\partial x} (-t_x + \cancel{xt_z}) + 2\rho t_z + \frac{\partial \rho}{\partial y} (-t_y + \cancel{yt_z}) \\ & + \cancel{y\omega_x} - \cancel{2x\omega_y} + \cancel{2y\omega_x} - \cancel{x\omega_y} \end{aligned}$$

### 计算主点的散度

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计算光流场的散度

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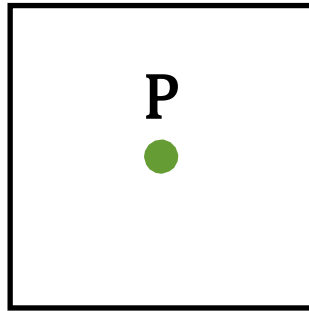
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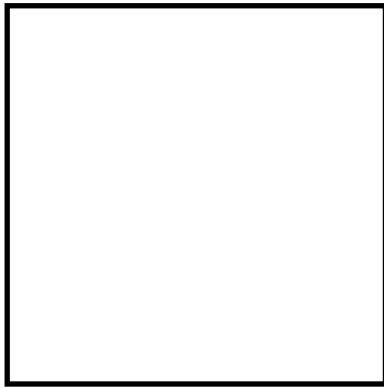
计算光流场的散度

$$\text{div}(u, v) = \frac{\partial \rho}{\partial x} (-t_x) + 2\rho t_z + \frac{\partial \rho}{\partial y} (-t_y)$$

假设成像的表面是一个正面平行平面



表面



像平面

*O*



$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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计算光流场的散度

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碰撞时间可直接从散度估计

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计算光流场的散度

$$\text{div}(u, v) = 2\rho t_z$$

碰撞时间可直接从散度估计

$$T_{\text{time-to-contact}} = \frac{Z}{t_z}$$

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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计算光流场的散度

$$\text{div}(u, v) = 2\rho t_z$$

碰撞时间可直接从散度估计

$$T_{\text{time-to-contact}} = \frac{Z}{t_z} = \frac{2}{\text{div}(u, v)}$$



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$$T_{\text{time-to-contact}} = \frac{Z}{t_z} = \frac{2}{\text{div}(u, v)}$$

图像测量

$$u = \frac{1}{Z} (xt_z - t_x) + \omega_x(xy) - \omega_y(x^2 + 1) + \omega_z(y)$$

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$$T_{\text{time-to-contact}} = \frac{Z}{t_z} = \frac{2}{\text{div}(u, v)}$$

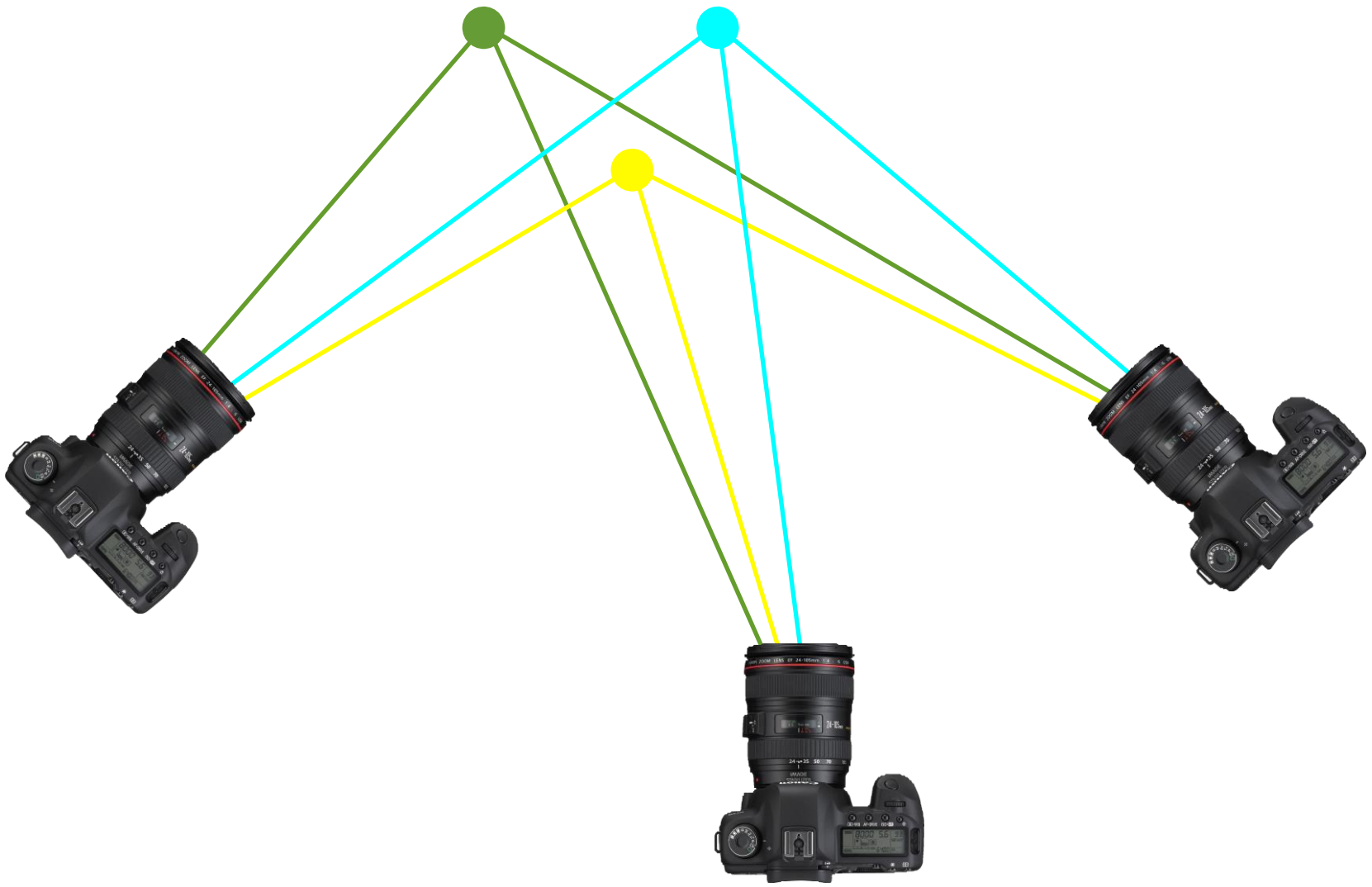
# 由运动恢复结构 (Structure from Motion)

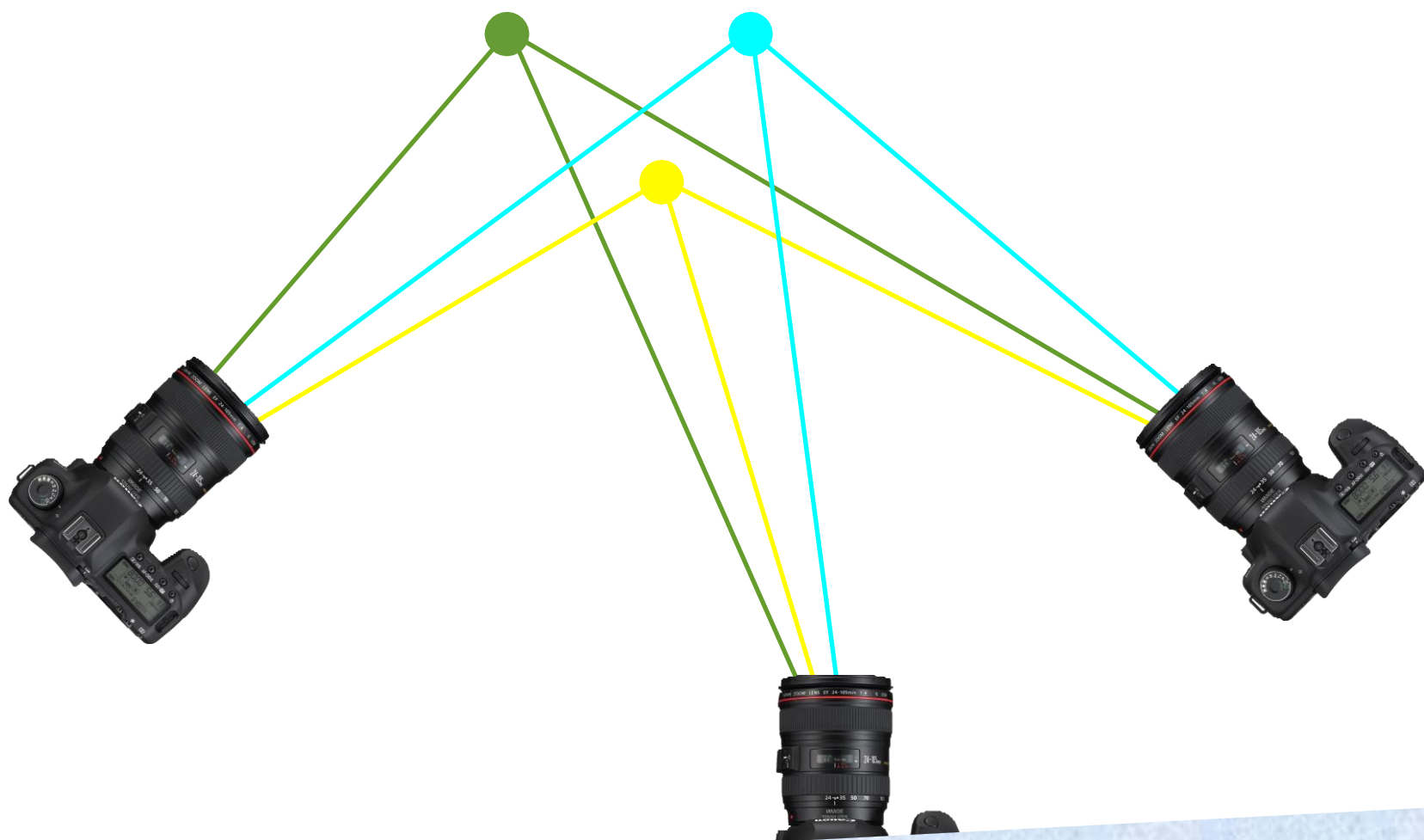
有限位移法





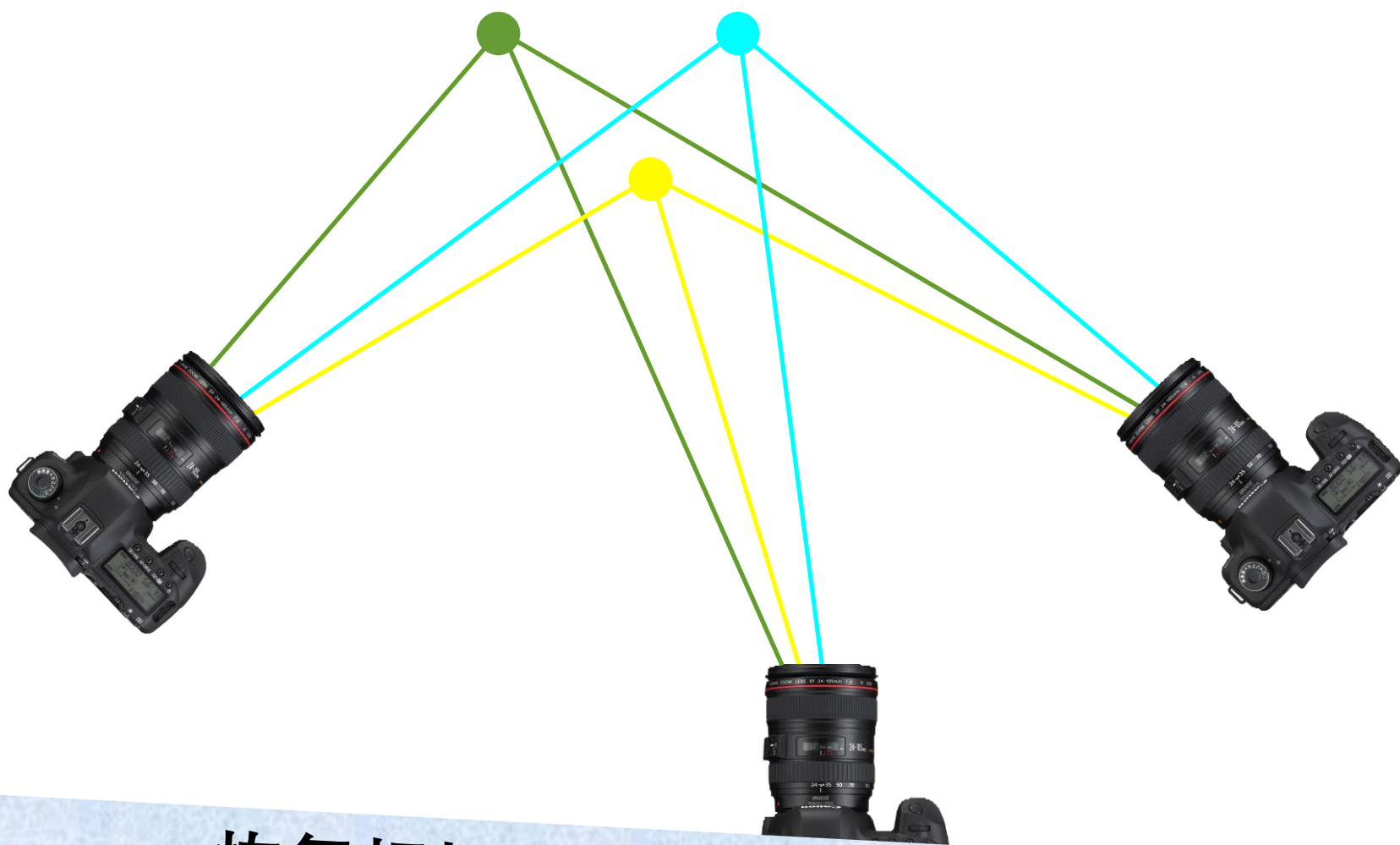






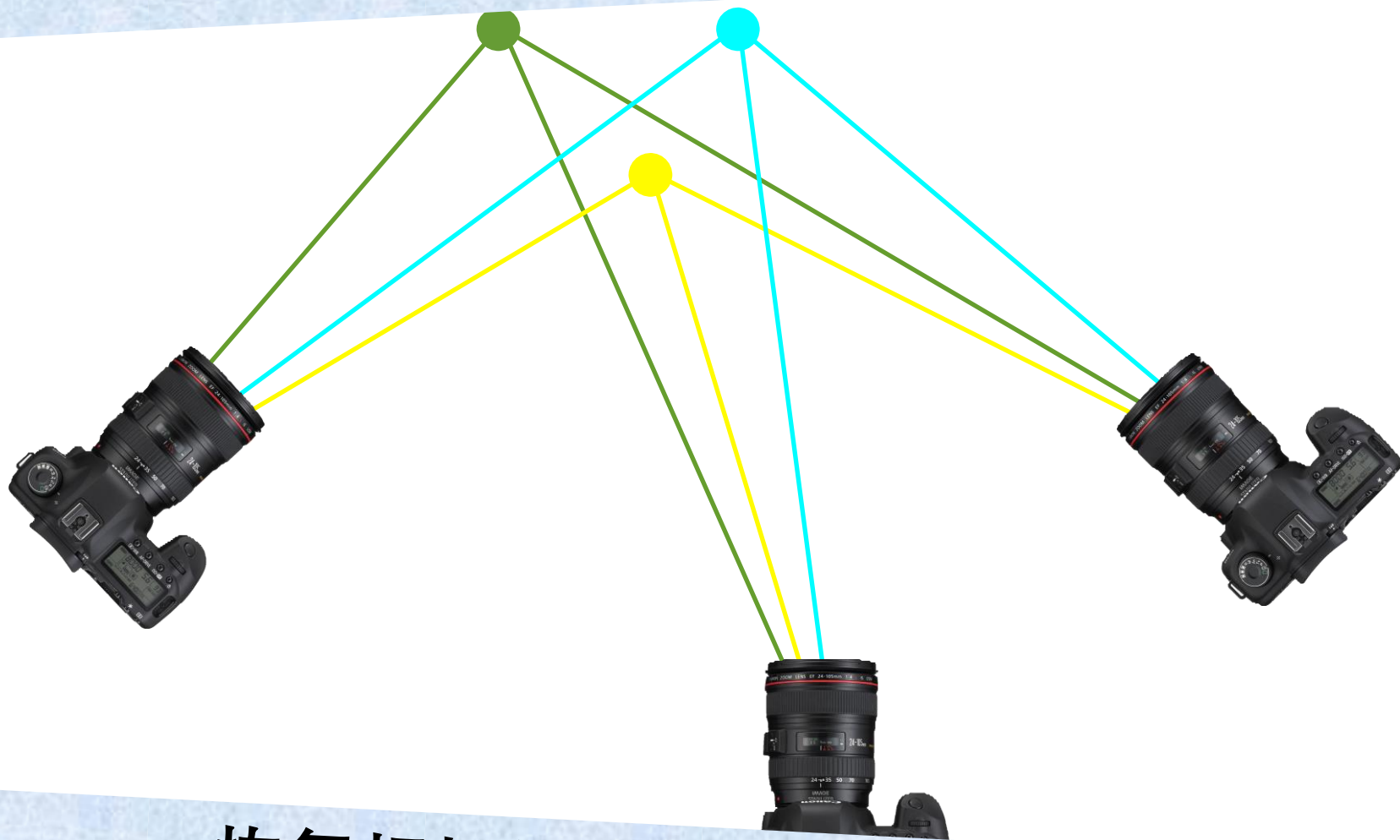
给定跨多个视图的点对应关系





恢复相机的相对3D旋转和平移

# 恢复3D场景结构



恢复相机的相对3D旋转和平移

# Shape and Motion from Image Streams under Orthography: a Factorization Method

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Received

## Abstract

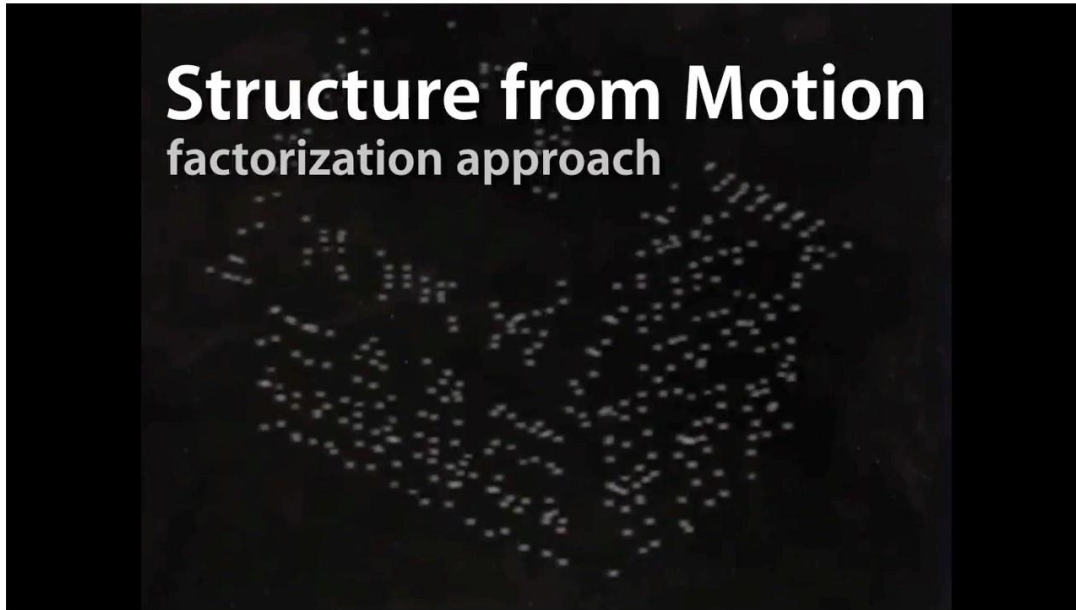
Inferring scene geometry and camera motion from a stream of images is possible in principle, but is an ill-conditioned problem when the objects are distant with respect to their size. We have developed a *factorization method* that can overcome this difficulty by recovering shape and motion under orthography without computing depth as an intermediate step.

**International Journal of Computer Vision, 1992**



**Tomasi and Kanade, 1992**





## Structure from Motion factorization approach

Tomasi and Kanade Factorization

150 views

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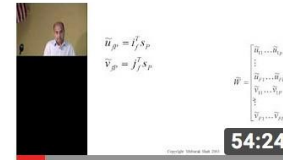
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Lecture 15: Structure from Motion

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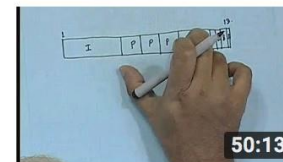
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Singular Value Decomposition (the SVD)

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Lecture - 24 Motion Estimate Techniques

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Lucas-Kanade for Optical Flow

Consider an image  $I(x, y)$ . For smaller motion, the new image can be represented as:

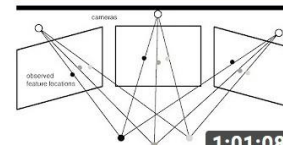
$$I(x, y) = I(x+u, y+v)$$

Where  $(u, v)$  represents the displacement of the pixel.

Solving this equation using Taylor's Expansion we obtain the Lucas-Kanade equation:

$$\begin{bmatrix} I_x & I_y \\ I_x & I_y \end{bmatrix} \begin{bmatrix} u \\ v \end{bmatrix} = - \begin{bmatrix} I_x I_x & I_x I_y \\ I_x I_y & I_y I_y \end{bmatrix}^{-1} \begin{bmatrix} I_x I_t \\ I_y I_t \end{bmatrix}$$

18:15



CVFX Lecture 18: Stereo rig calibration and projective

Rich Radke  
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1:01:08



