

# Announcements

## **Final project upcoming deadlines:**

- **Nov 13**, a short video of your progress.  
Submit via Compass, 10% of the final project total.
- **Dec 16**, 7-11pm in Siebel 4240.  
Final project presentations and Open House for press!

## **Grades are out for:**

- Midterm 1
- Project abstract and picture-title

# Tracking Systems in VR: Estimating 3D Orientation

Integrate sensor readings to estimate orientation:

Recall 2D:  $\hat{\theta} = \theta_0 + \sum_{i=1}^k \Delta \hat{\theta}_i = \Delta \hat{\theta}_k + \Delta \hat{\theta}_{k-1} + \dots + \Delta \hat{\theta}_1 + \theta_0$

$\Delta \hat{\theta}_i = \hat{\omega}_i \Delta t$

Now 3D:  $\hat{Q} = \Delta \hat{Q}_k \circ \Delta \hat{Q}_{k-1} \circ \dots \circ \Delta \hat{Q}_2 \circ \Delta \hat{Q}_1 \circ Q_0$

$\rightarrow$  Each  $\Delta \hat{Q}_i = \text{Quat}(\hat{v}_i, \Delta \hat{\theta}_i)$

$\frac{\hat{\omega}_i}{\|\hat{\omega}_i\|}$        $\|\hat{\omega}_i\| \Delta t$

Problem: Drift or dead reckoning

# Estimating 3D Orientation: Drift Correction

Separate the rotational drift error into **two components**:

1) Tilt error: Pitch + roll

To correct: need a gravity  
or "up" vector

2) Yaw error

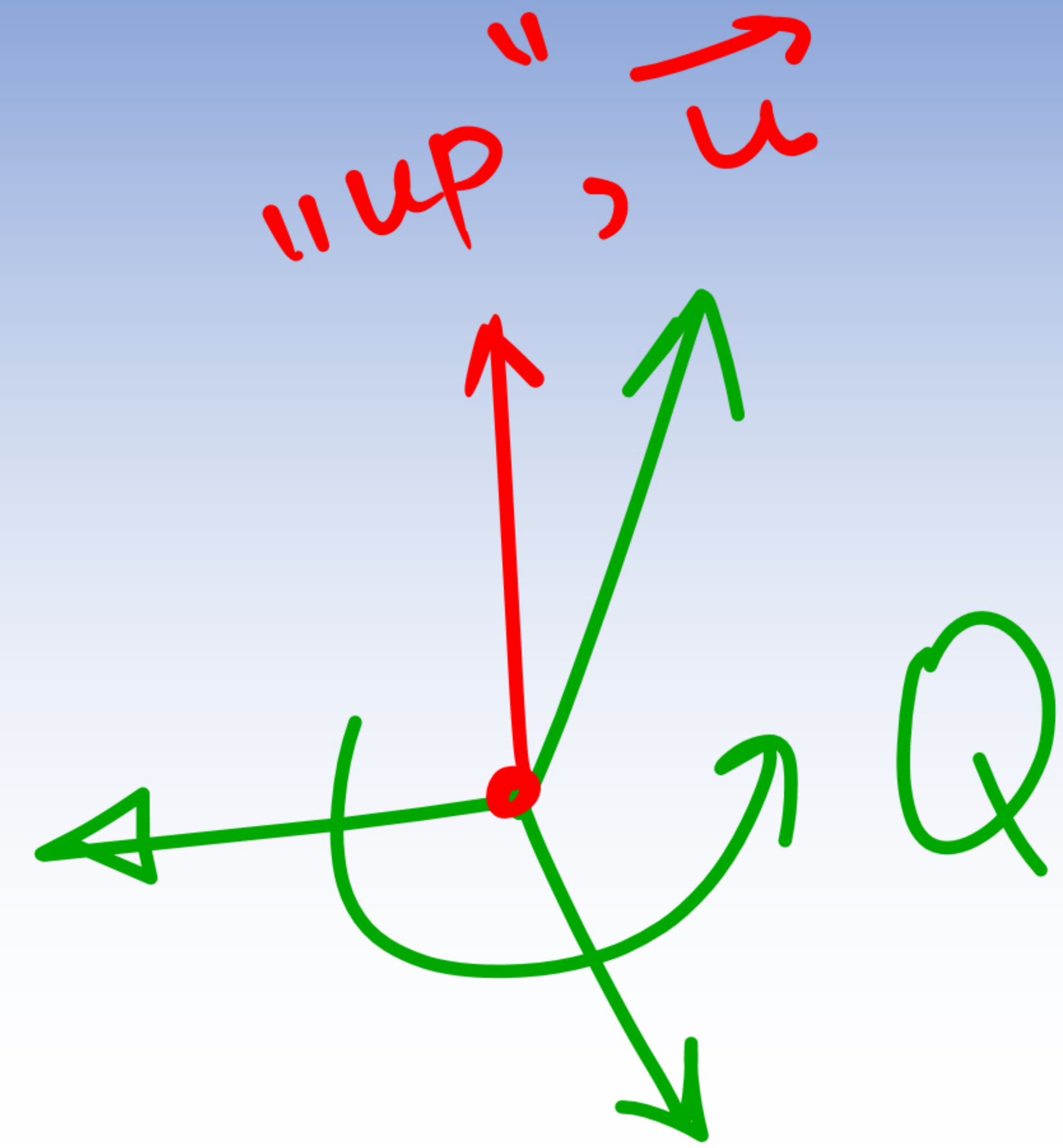
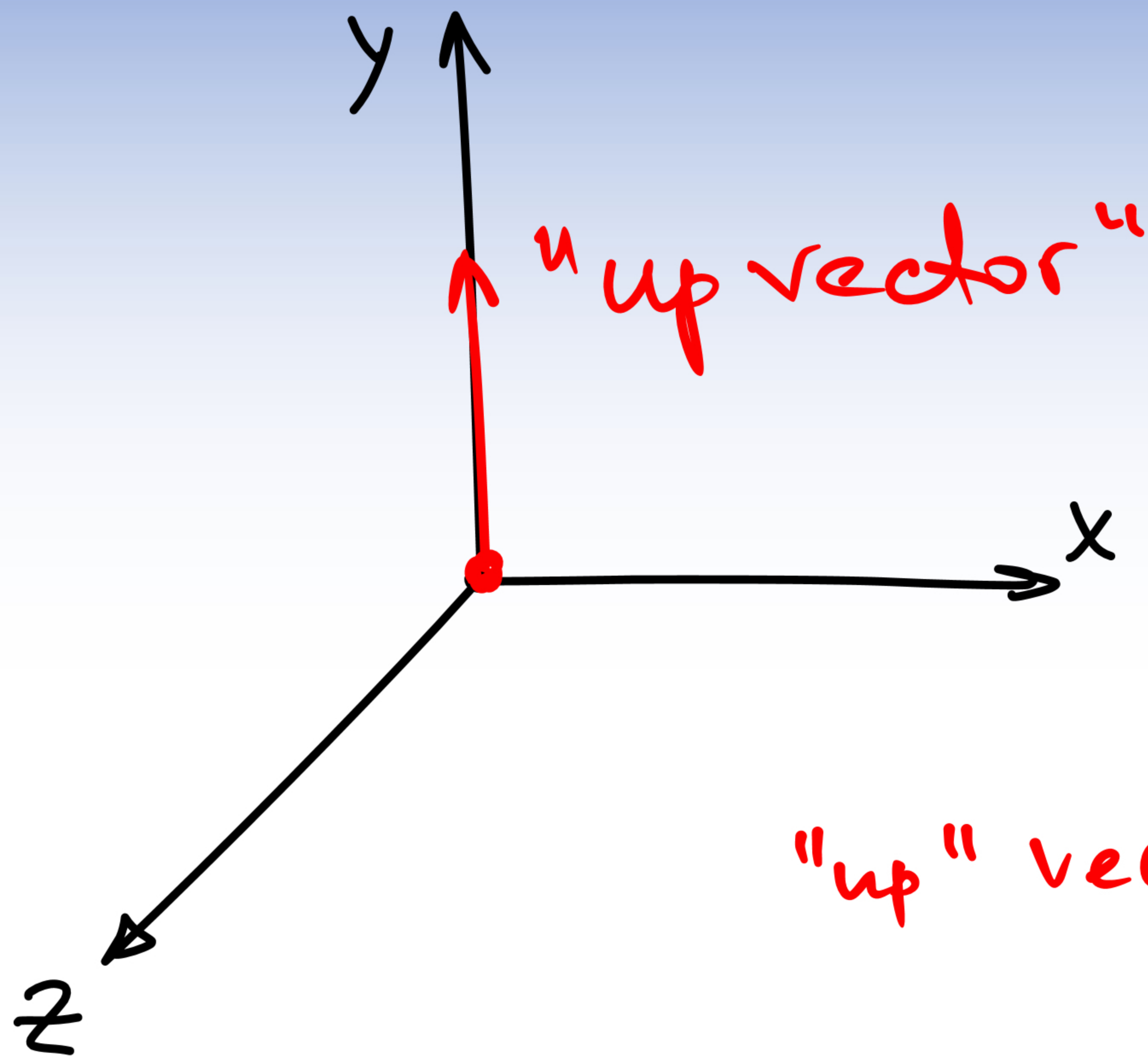
To correct: need a "compass"

- Complementary Filters on  $SO(3)$ , Mahoney, 2008

- Head Tracking for the Oculus Rift, ICRA 2014

S. LaValle, A. Yershova, M. Katsev, and M. Antonov

perfect "up" sensor  
Use Accelerometer to Correct "Tilt Error"



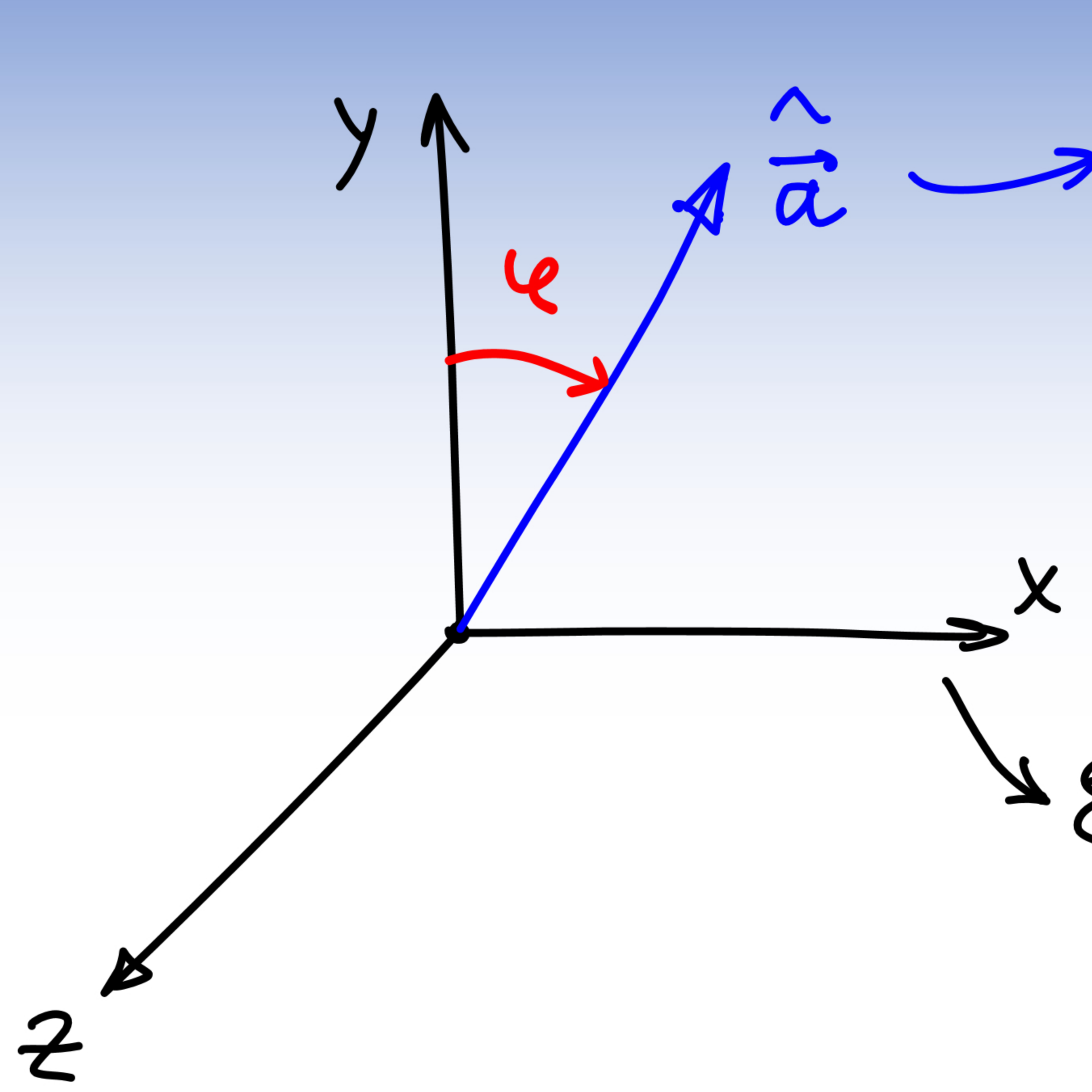
"up" vector is always

What is  $Q\vec{u}$ ? Assume  $Q$  is accurate.

What if  $Q\vec{u}$  is not aligned with y-axis?

perfect "up" sensor

# Use Accelerometer to Correct "Tilt Error"



Apply  $\hat{Q}_k$  to ~~accelerometer~~ <sup>perfect "up" sensor</sup> reading

$$\vec{a} = (\hat{a}_x, \hat{a}_y, \hat{a}_z)$$

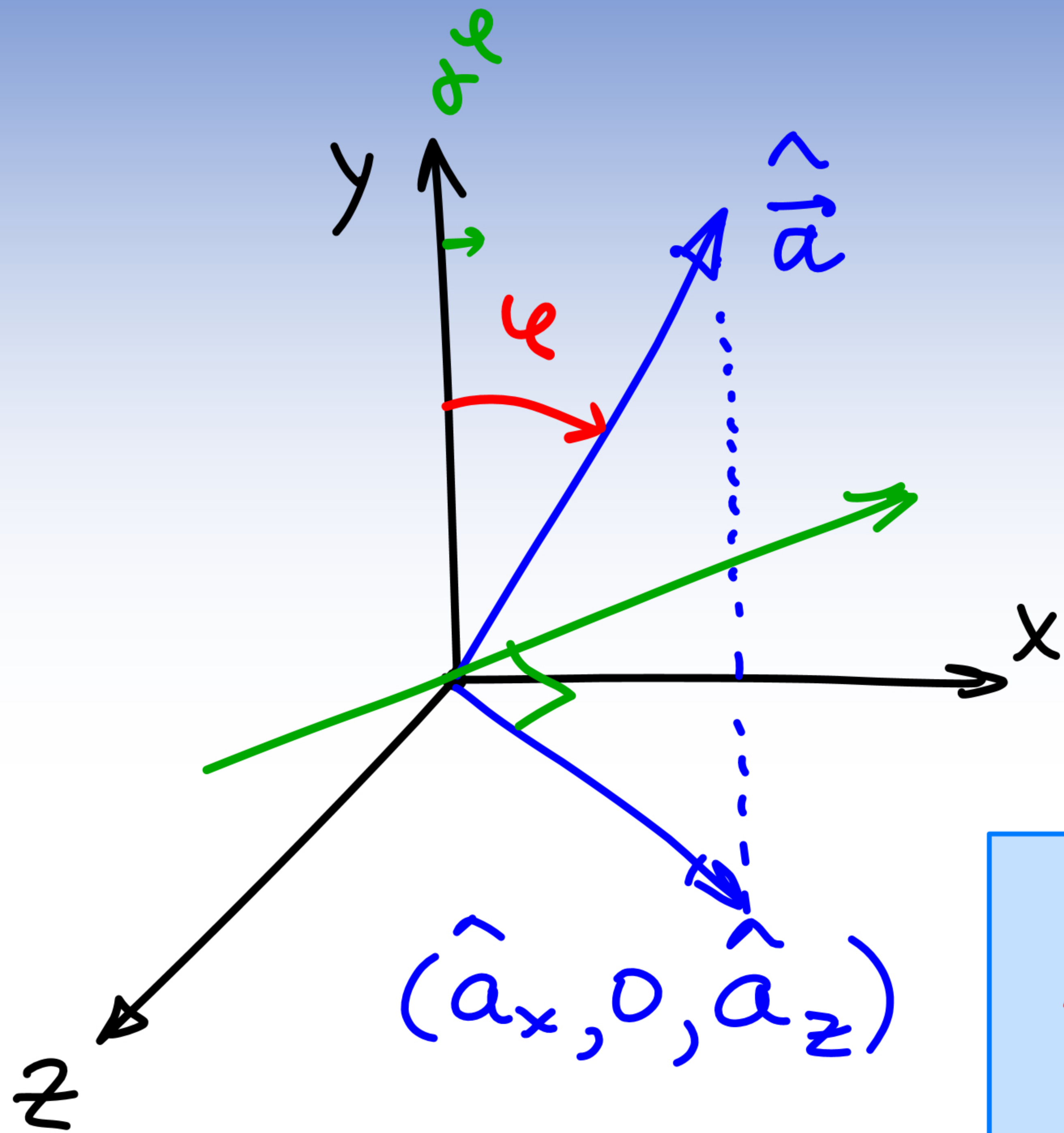
Estimated world frame

Tilt axis in XZ plane:  
 $\vec{v}_{\text{tilt}} = ( \quad )$

Now rotate by  $\phi$  about  $\vec{v}_{\text{tilt}}$  to fix  $\hat{Q}_k$

$$\hat{Q}_{\text{corrected}} = \hat{Q}_k$$

perfect "up" sensor  
Use Accelerometer to Correct "Tilt Error"



Complementary filter:

In each  $\Delta t$ ,

rotate by

about  $\vec{V}_{\text{tilt}}$  to fix  $\hat{Q}_k$

recompute every  $\Delta t$

$$\hat{Q}_{\text{corrected}} = \text{Quat}(\vec{V}_{\text{tilt}}, \psi) \circ \hat{Q}_k$$

Gain coefficient

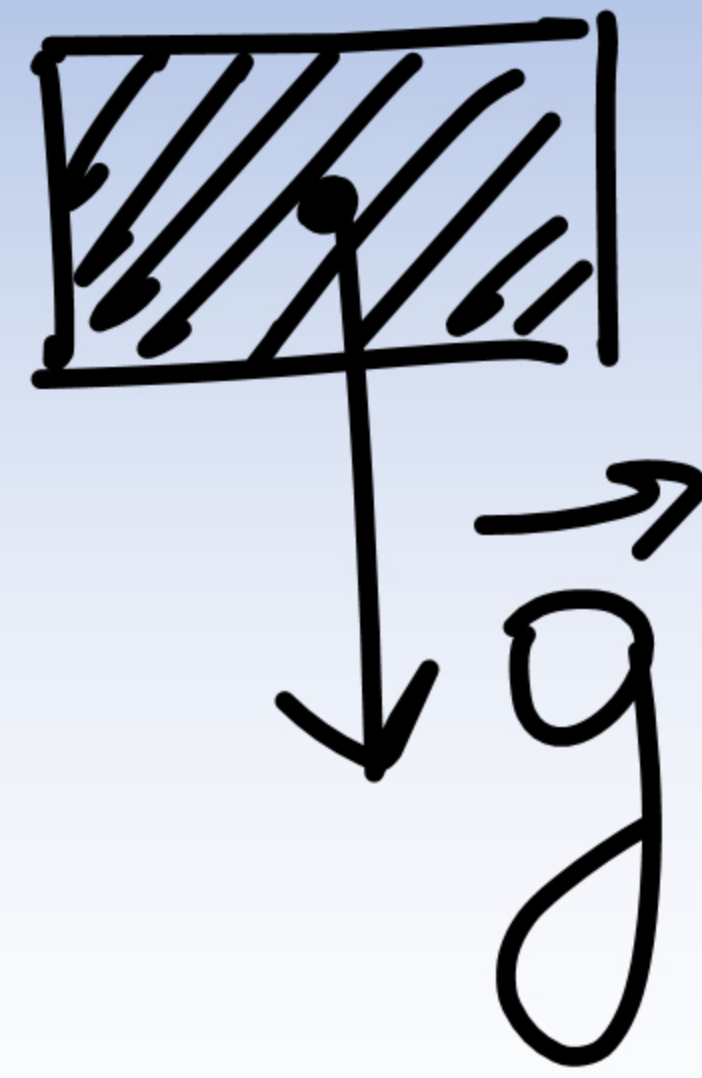
$$\alpha > 0$$

$$\alpha \approx 0 \text{ (ex. } \alpha = 0.0001)$$

$\alpha$  needs to be large enough to  
but small enough to

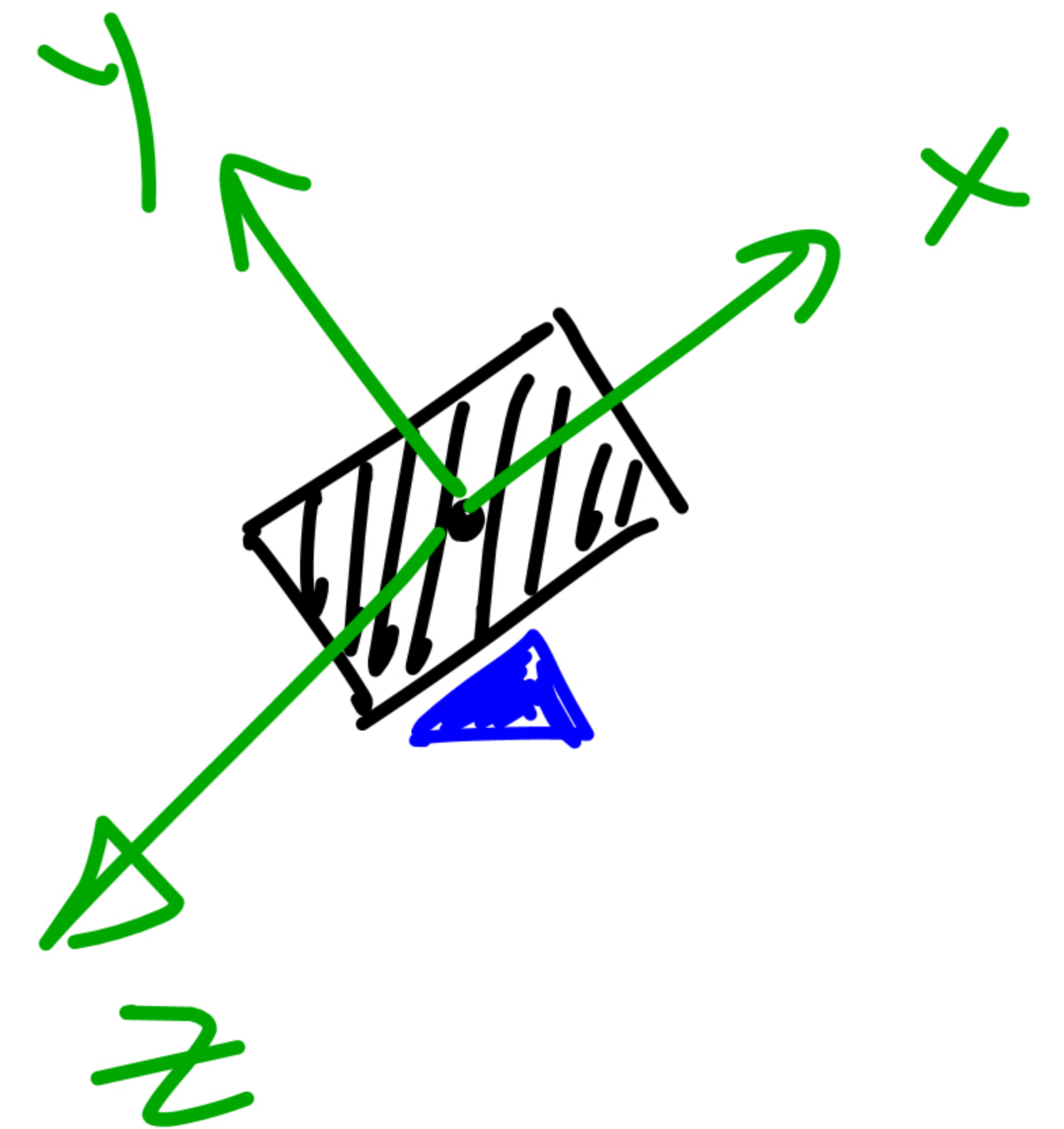
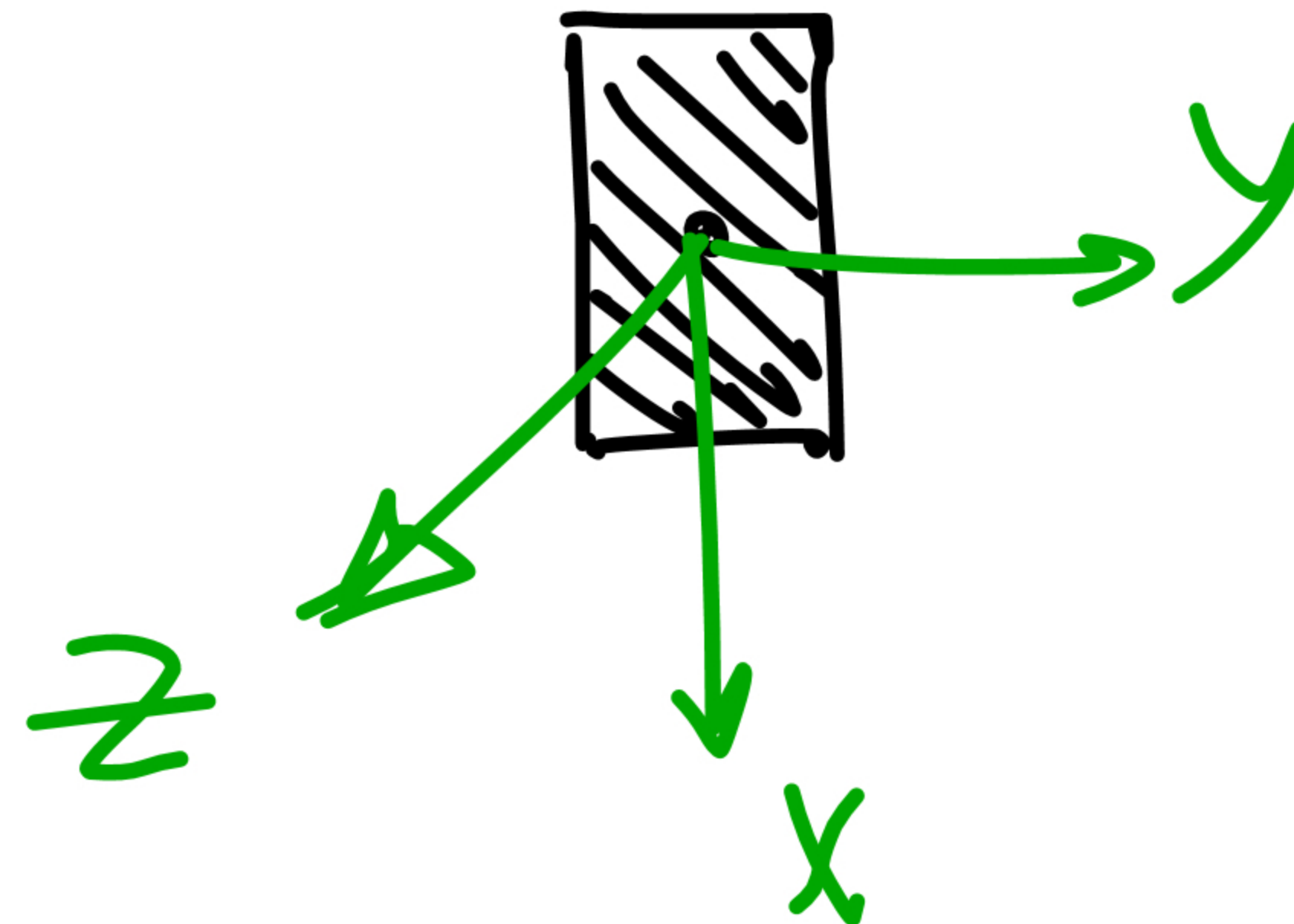
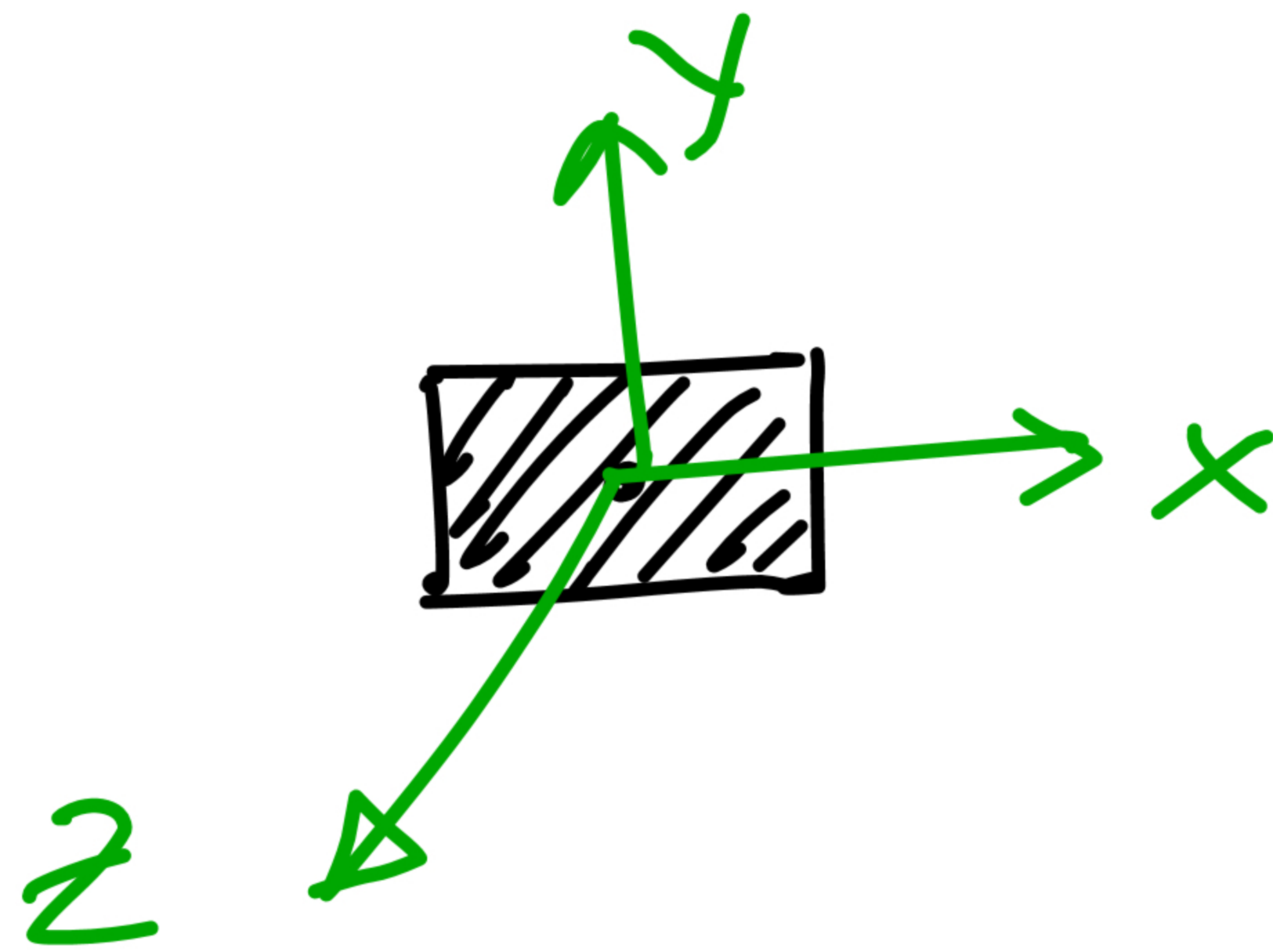
# What Does Accelerometer Measure?

Rift is free falling:



$$\vec{a} = \quad )$$

Rift lying on a side:

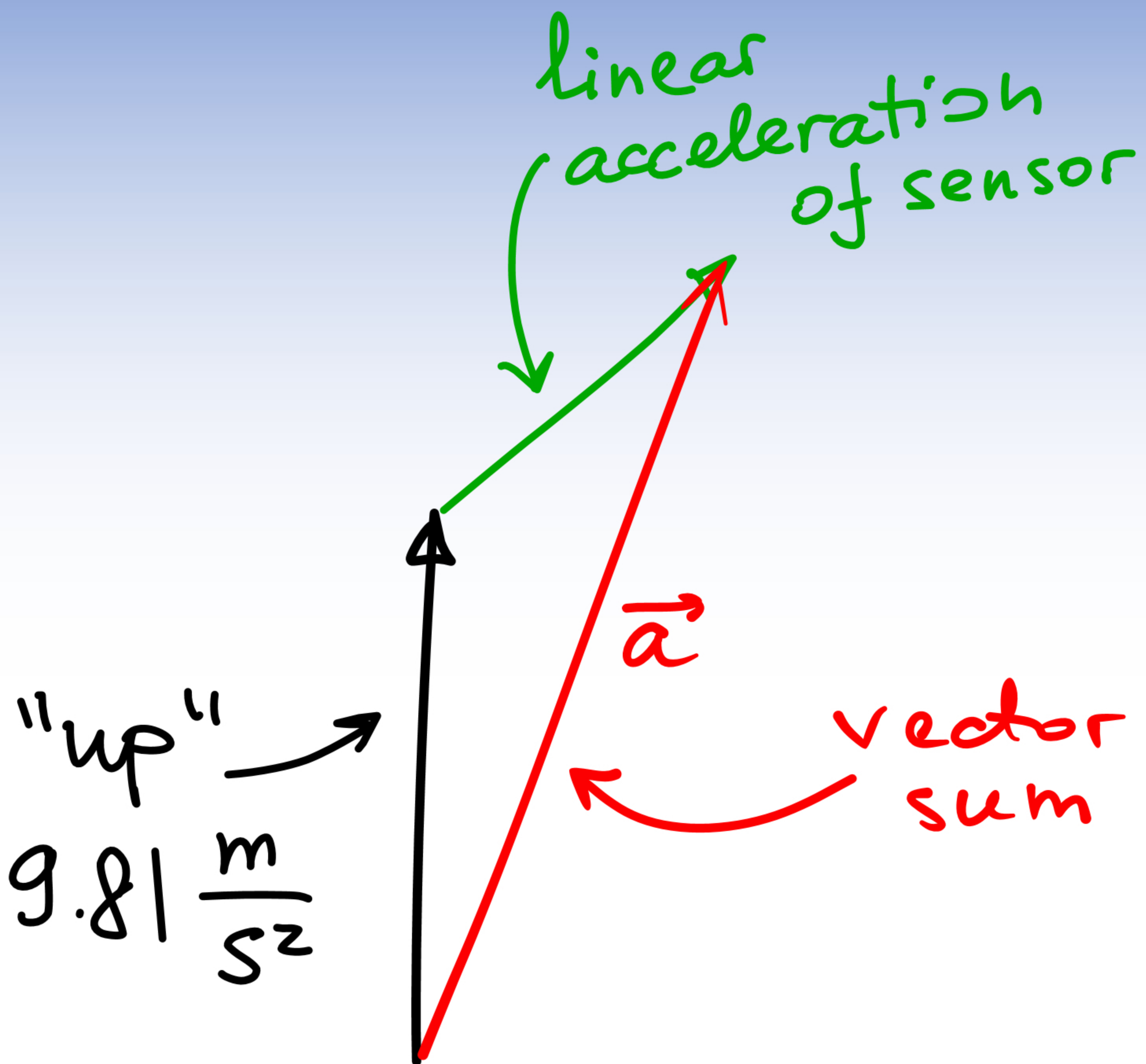


$$\vec{a} = ( \quad )$$

$$\vec{a} = ( \quad )$$

$$\vec{a} = ( \quad )$$

# Use Accelerometer to Correct "Tilt Error"



Problem:

Accelerometer measures vector sum of gravity and linear acceleration of sensor.

Solution:

Use heuristic to detect when "not moving" and apply correction only then.

Example:  $\|\vec{a}\| \approx 9.81$



# Use Magnetometer to Correct Yaw Error

## Similar to tilt correction:

- Calculate reference error
- Gradually apply using complementary filter

} during  
each  $\Delta t$

## Problems:

- Vector sum of
- Calibration is
- Field might vary over

→ accuracy  $\approx 5$  degrees

# Estimating Position and Orientation

## Problem setup:

- Allow and track parallax motions
- IMU (gyro + accelerometer + magnetometer) not enough
  - Drift too fast from double integration
  - No way to detect drift errors
- Need sub-millimeter accuracy, stable estimates

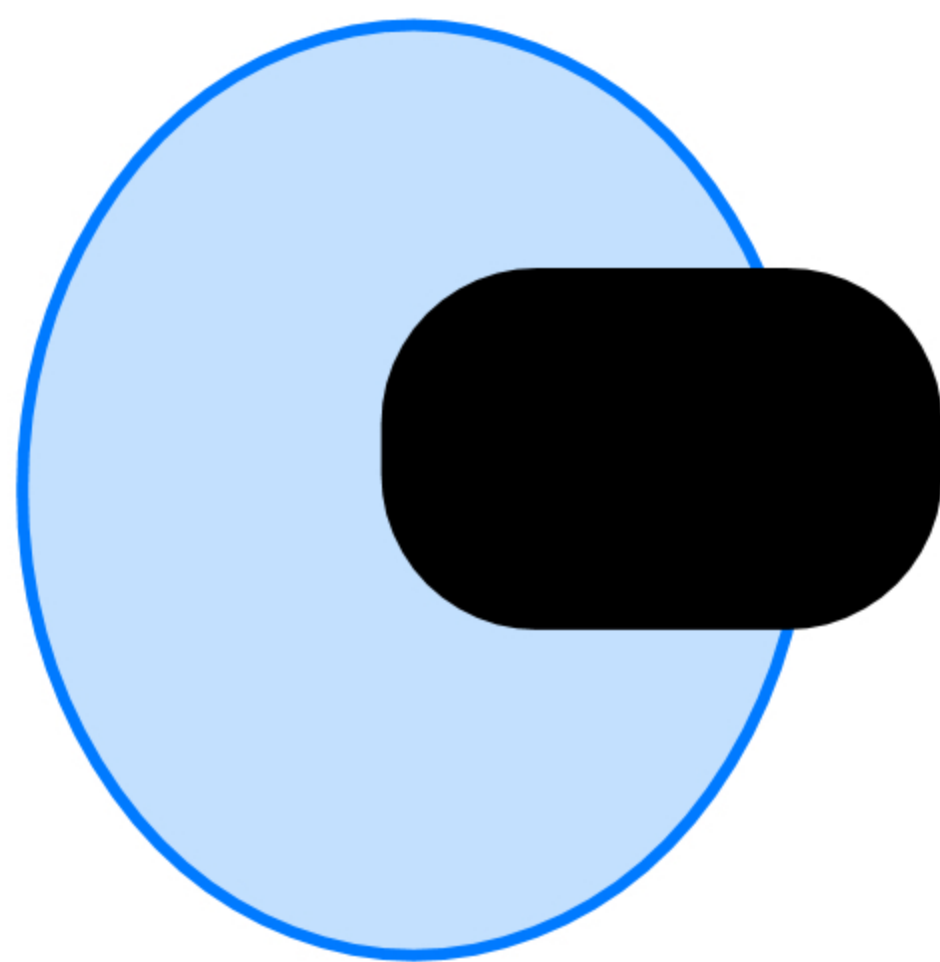
## Solutions:

1. Generate non-constant magnetic or EM field
  - RazerHydra, STEM Sixense
  - UWBradio
2. Visibility or line of sight methods

# Position Tracking: Visibility Methods

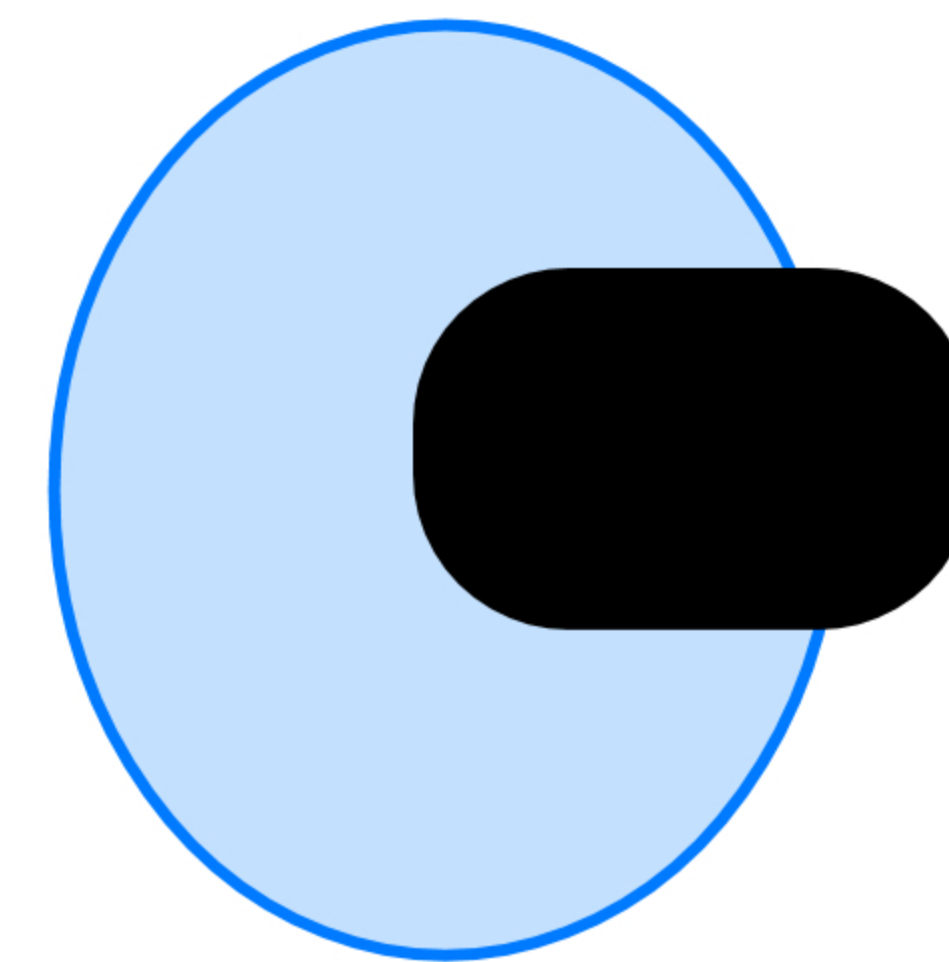
Camera arrangements:

On headset



inside-out

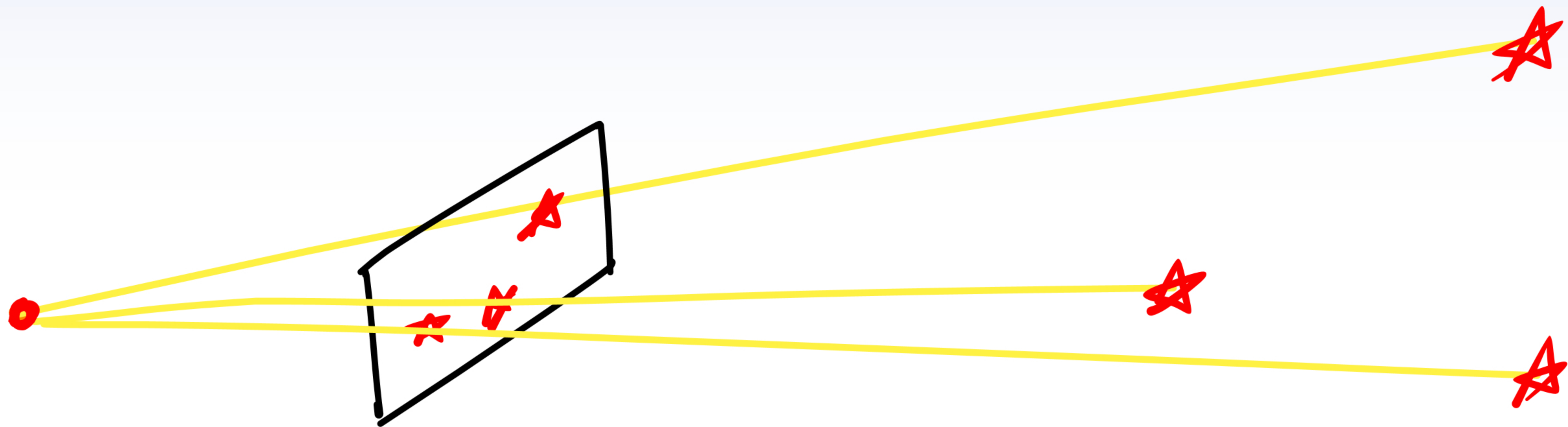
In world



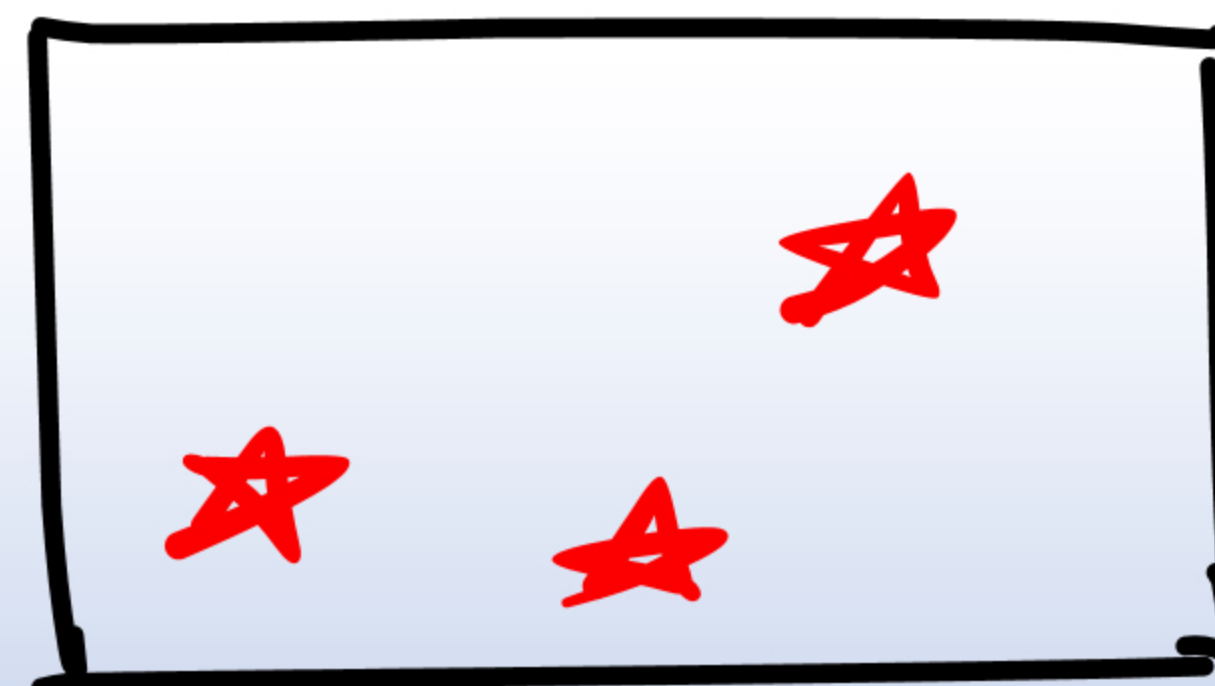
outside-in

# Position Tracking: Visibility Methods

Pinhole camera:



Features in an image:



# Position Tracking: Visibility Methods

## FEATURES:

### 1) Natural

- Hard computer vision
- Extract and maintain from natural scenes
- Remove moving objects
- Reliability low

### 2) Artificial

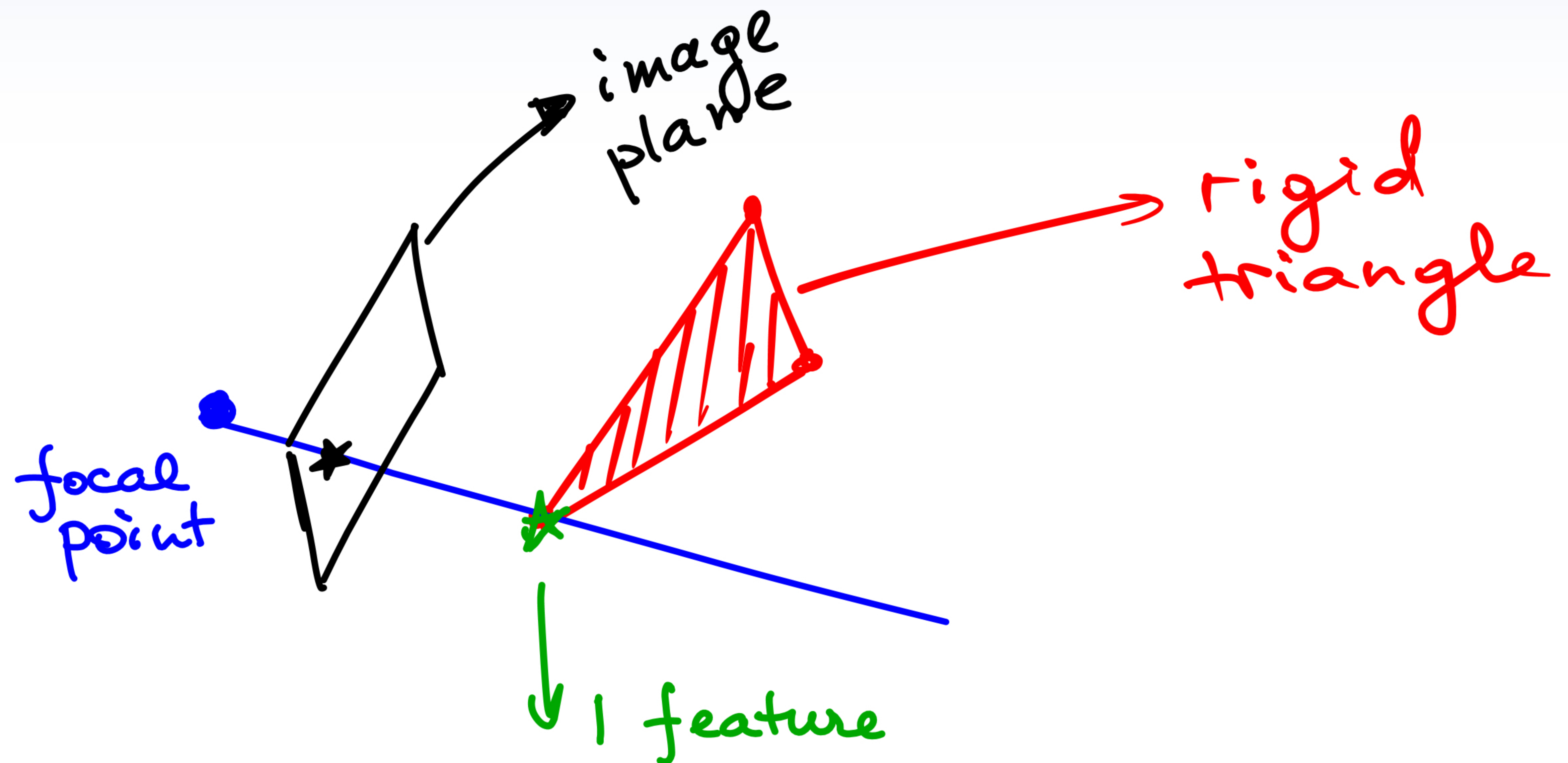
- Trivial computer vision (blob detection)
- QR tags, retro reflective markers, LEDs, laser projections
- Can stay in IR spectrum (invisible to humans)

# Position Tracking: Blob Detection

PnP Problem:

Determine rigid body transformation from identified, observed features on a rigid body.

P1P Problem:



**DOF analysis:**

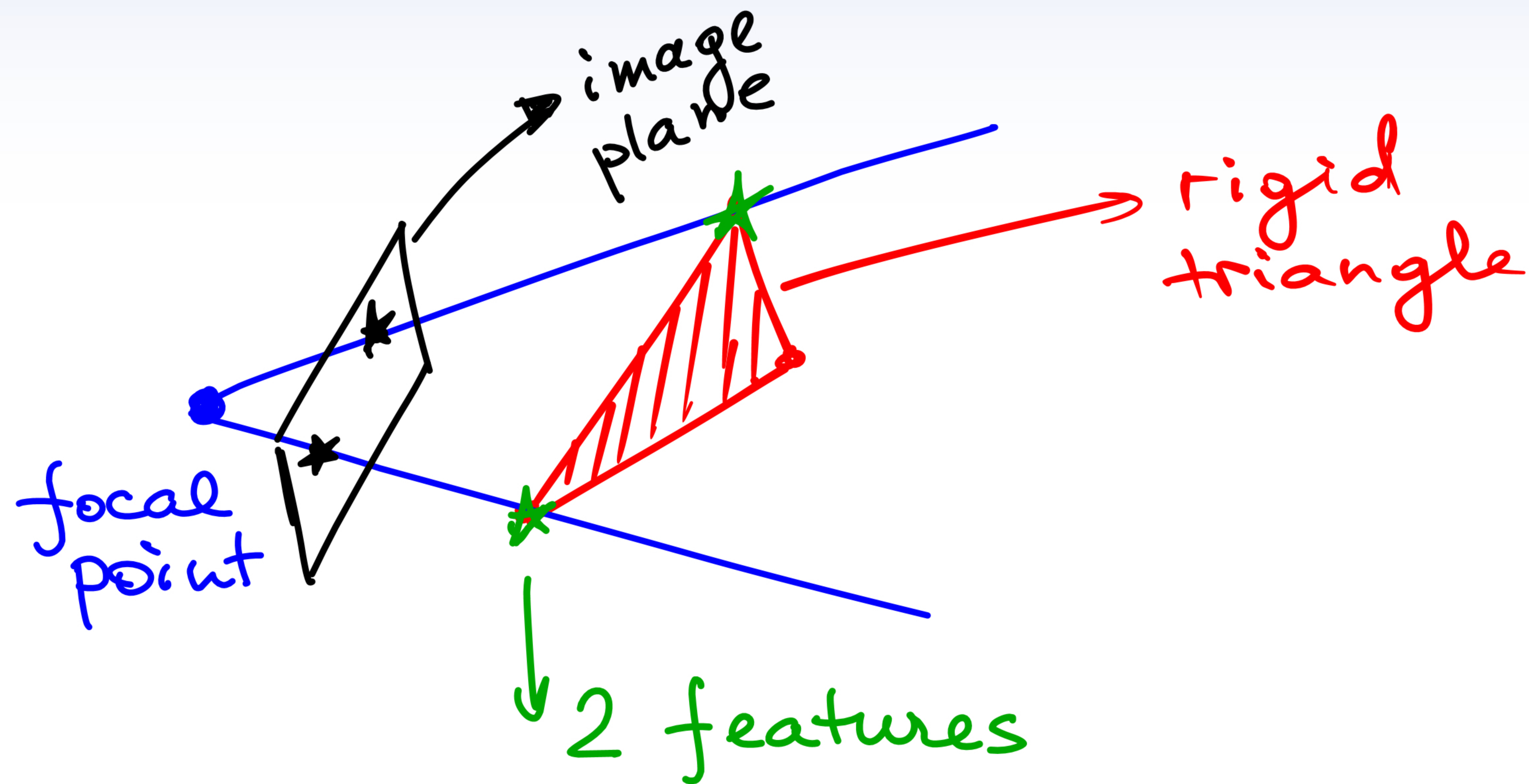
- Start with 6 DOFs (rigid body)
- Each feature subtracts 2 DOFs

DOFs left:

# Position Tracking: Blob Detection

P2P Problem:

Determine position and orientation of triangle from features in image.



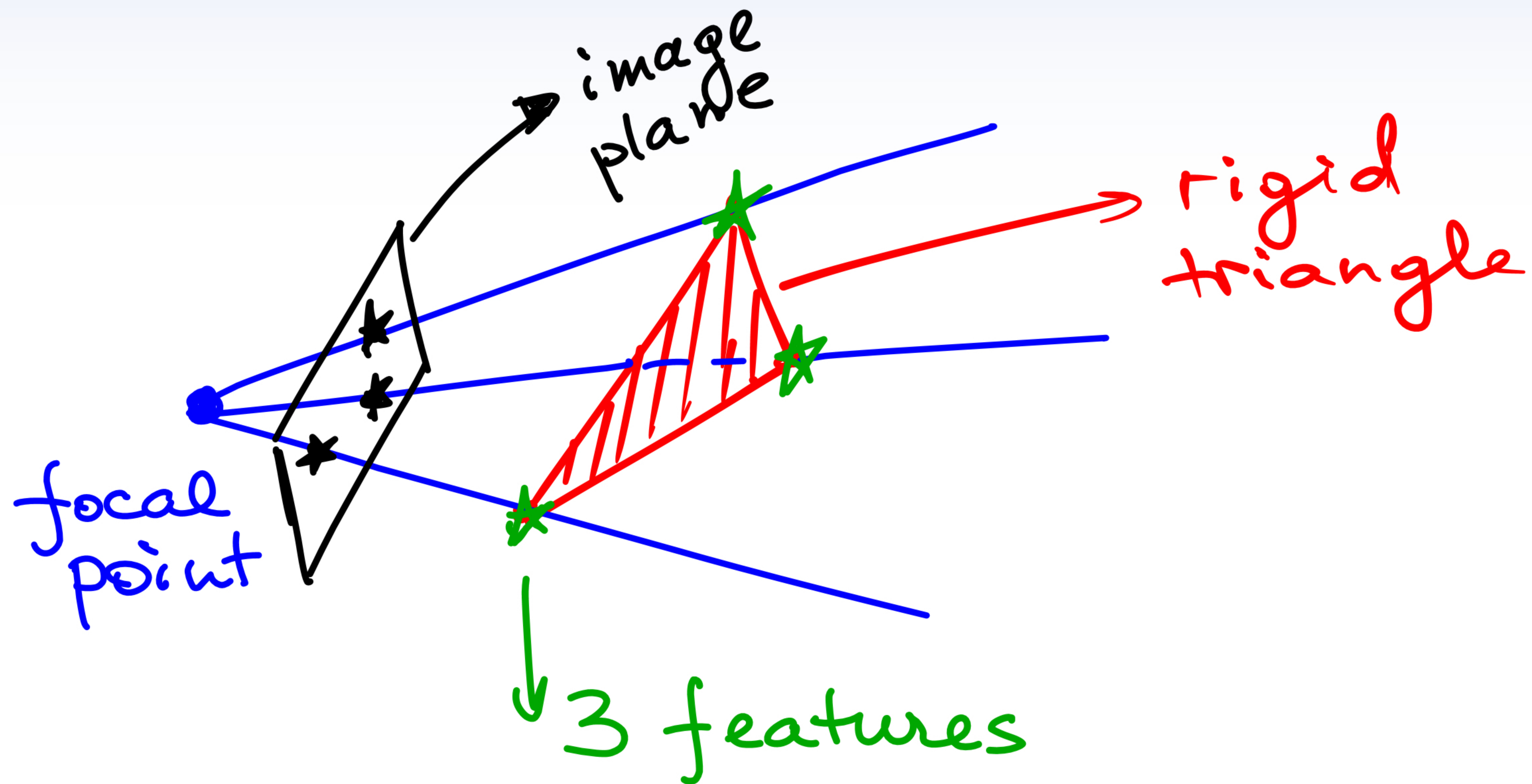
DOFs left:

# Position Tracking: Blob Detection

P3P Problem:

Determine position and orientation of triangle from features in image.

DOFs left:



**Solution:** A system of polynomial equations leads to 8 solutions (but only 4 in front of the camera). The beginnings of computational real algebraic geometry.



# Position Tracking: Incremental Blob Detection

Incremental PnP Problem:

Determine position and orientation of triangle from features in image, given current estimate.

