

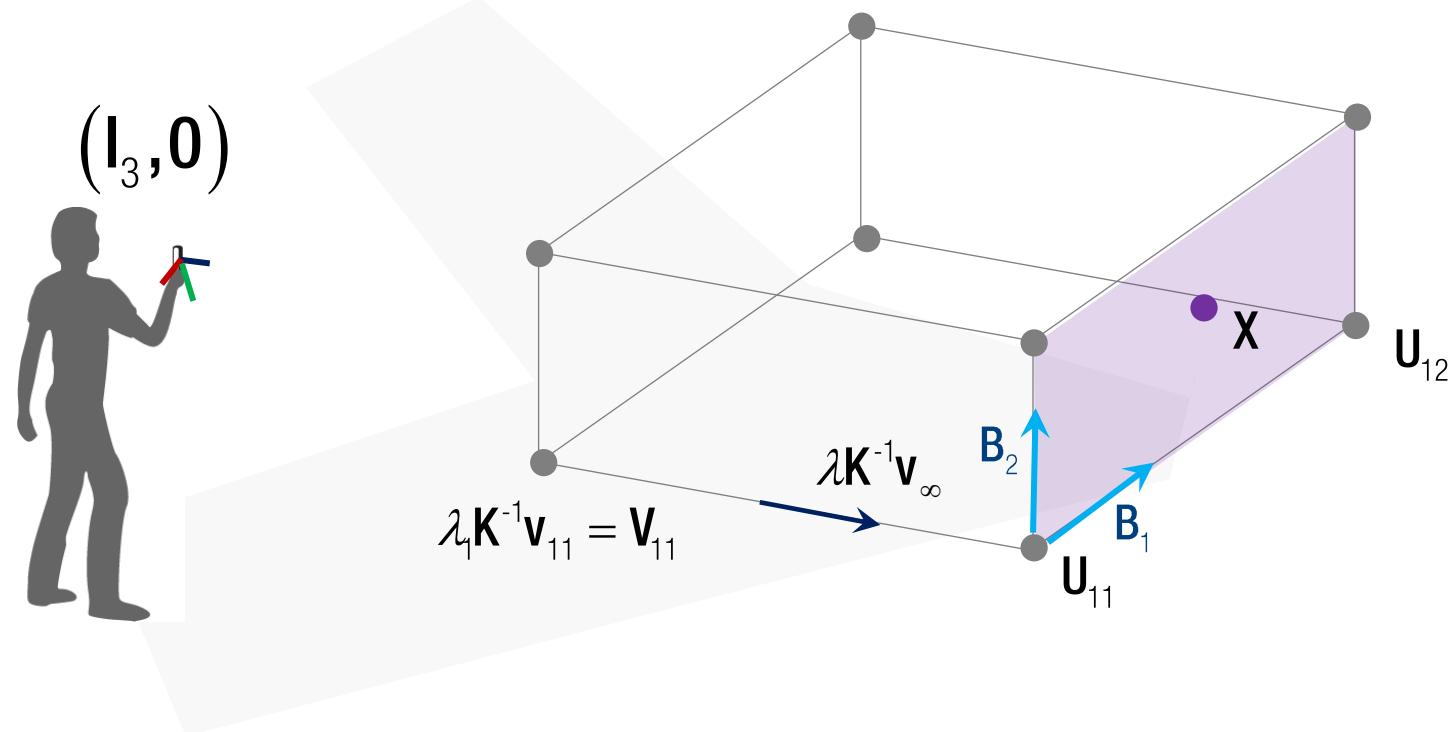
# Spatial Rotation



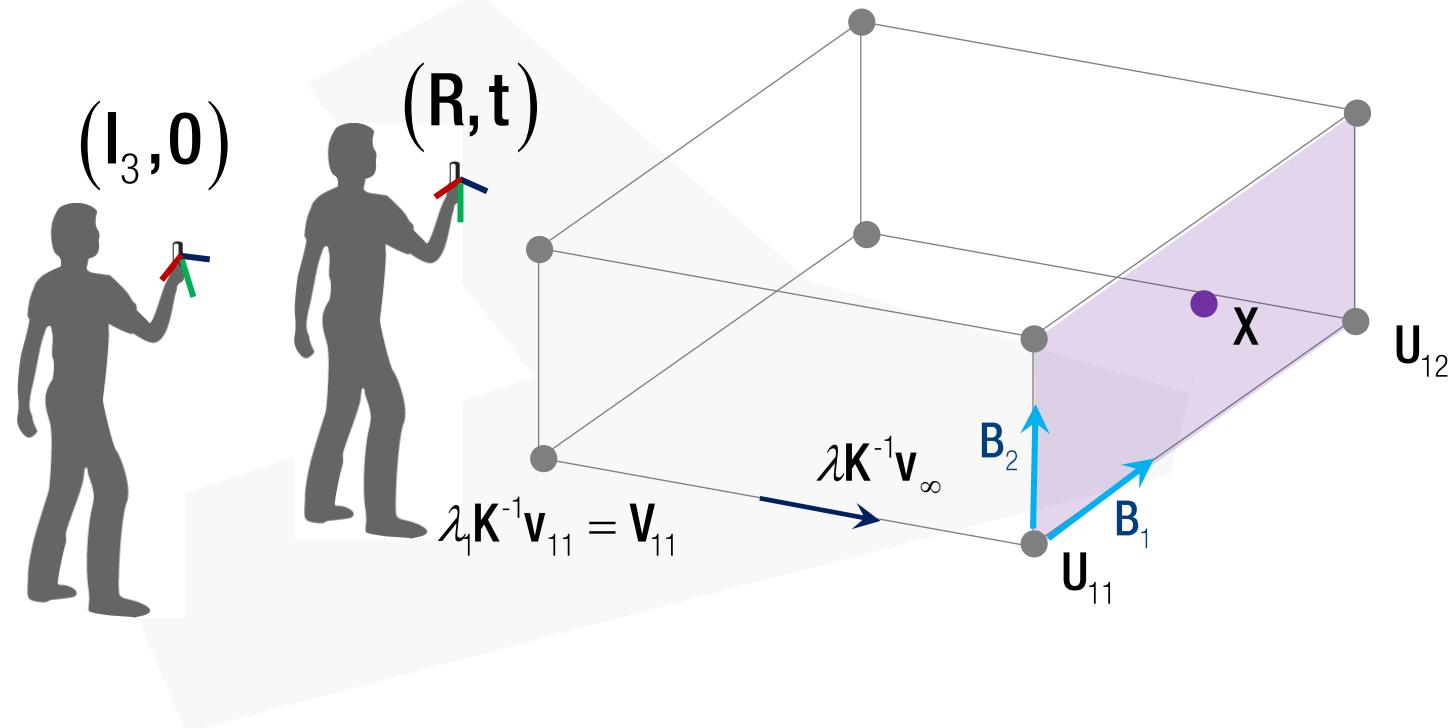
# Announcement

- HW #3 deadline is extended (March 9)
- Paper assignment will be out today.

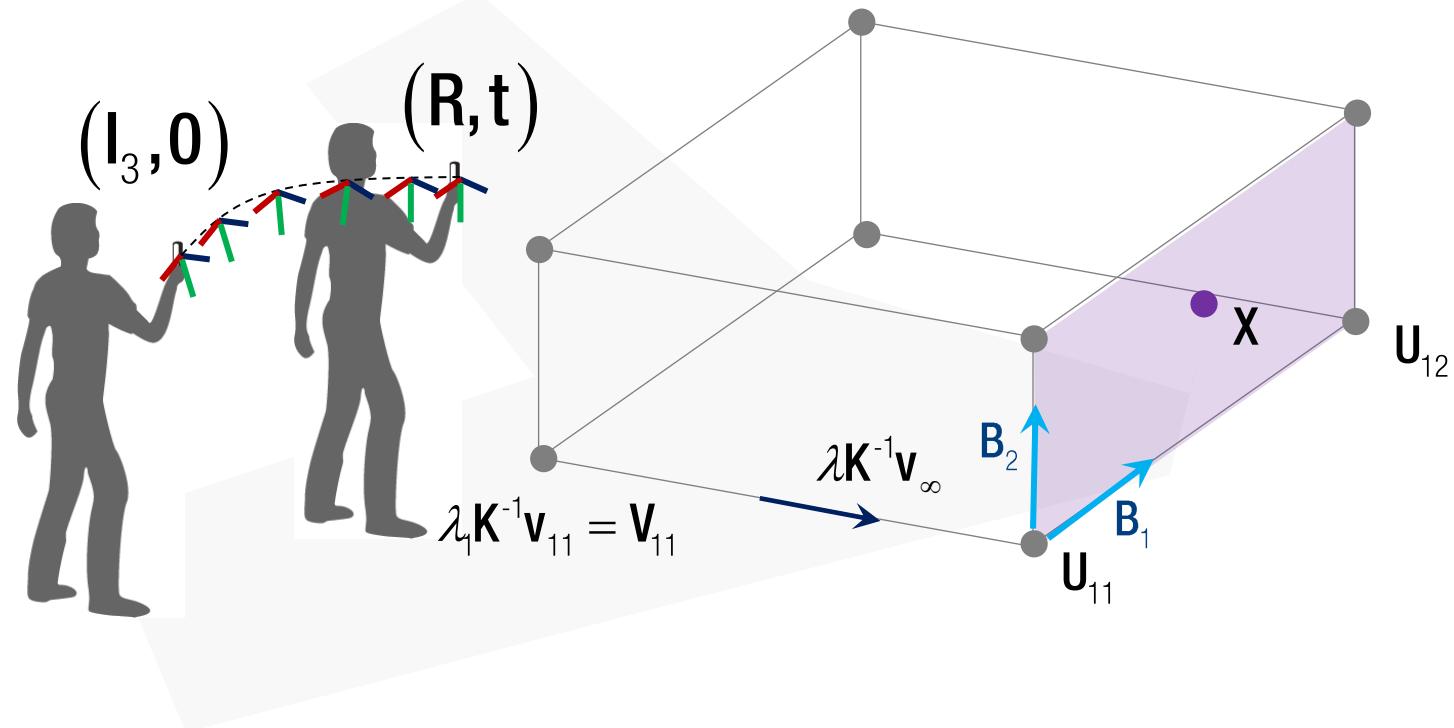
# Interpolation of Transformation



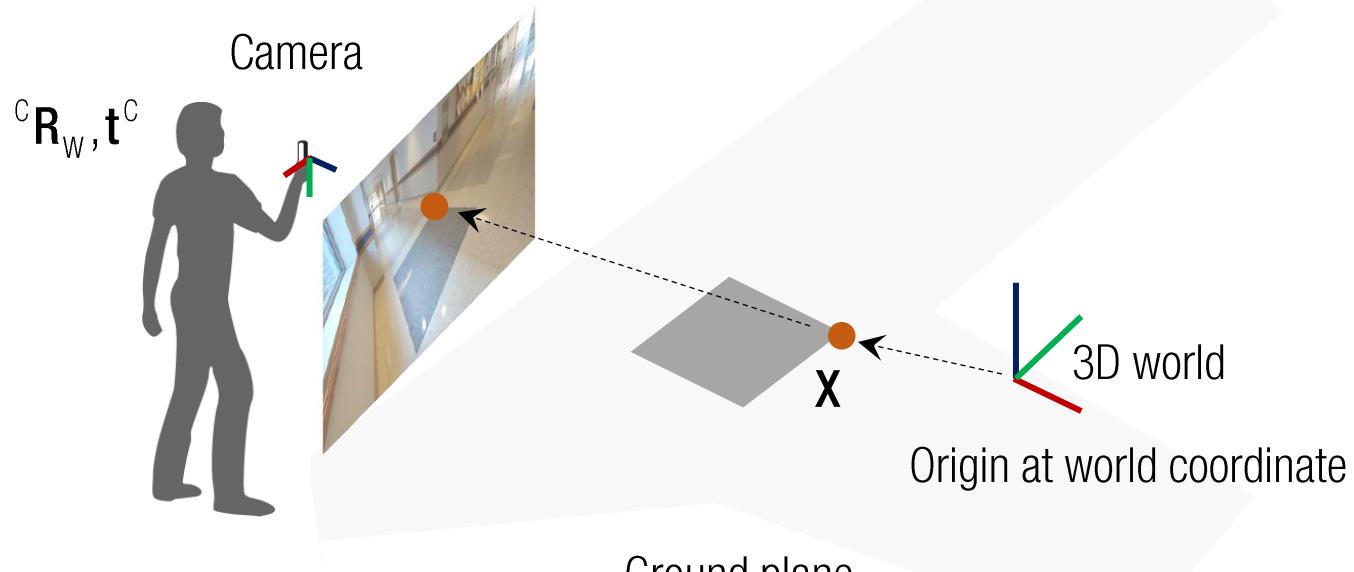
# Interpolation of Transformation



# Interpolation of Transformation



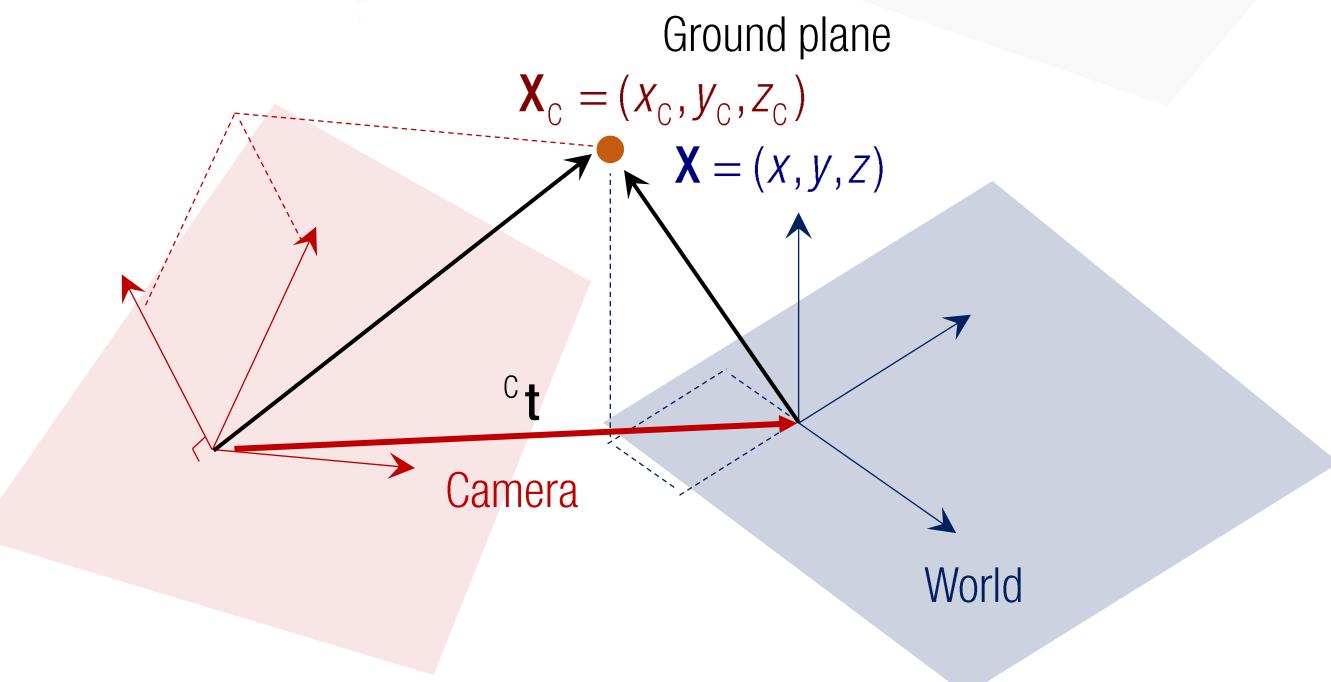
# Recall: Rotate and then, Translate



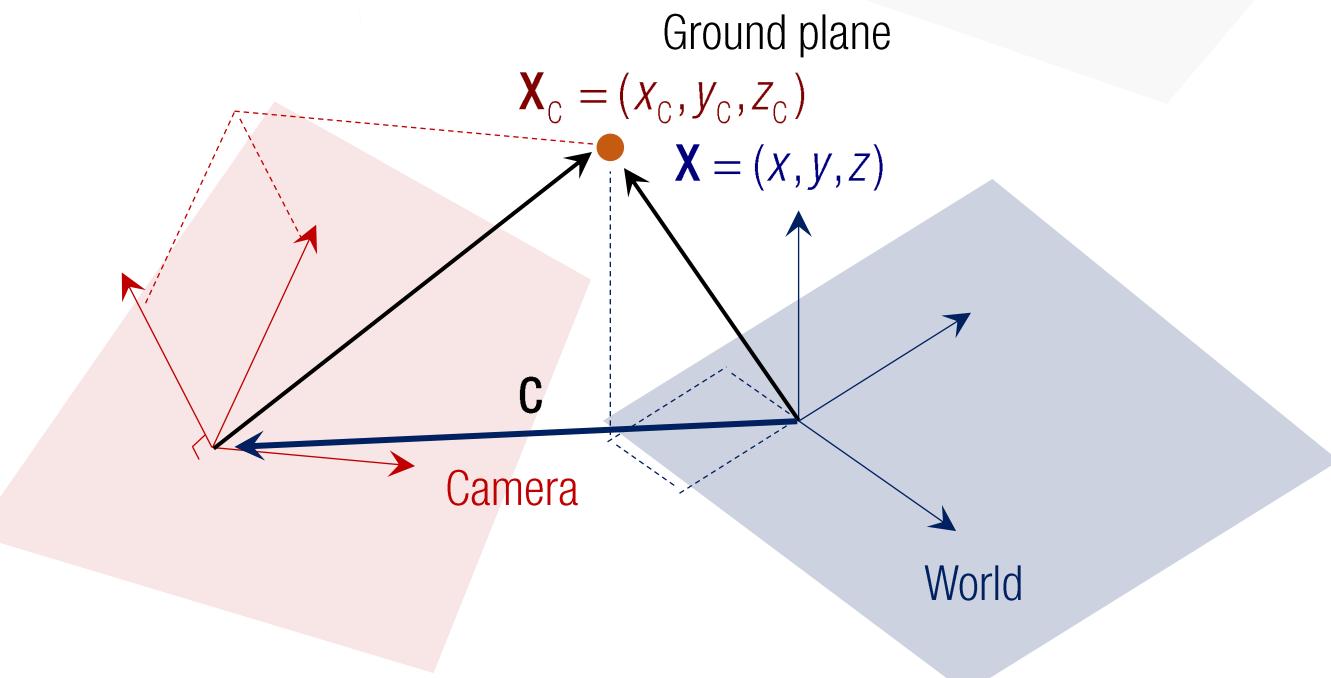
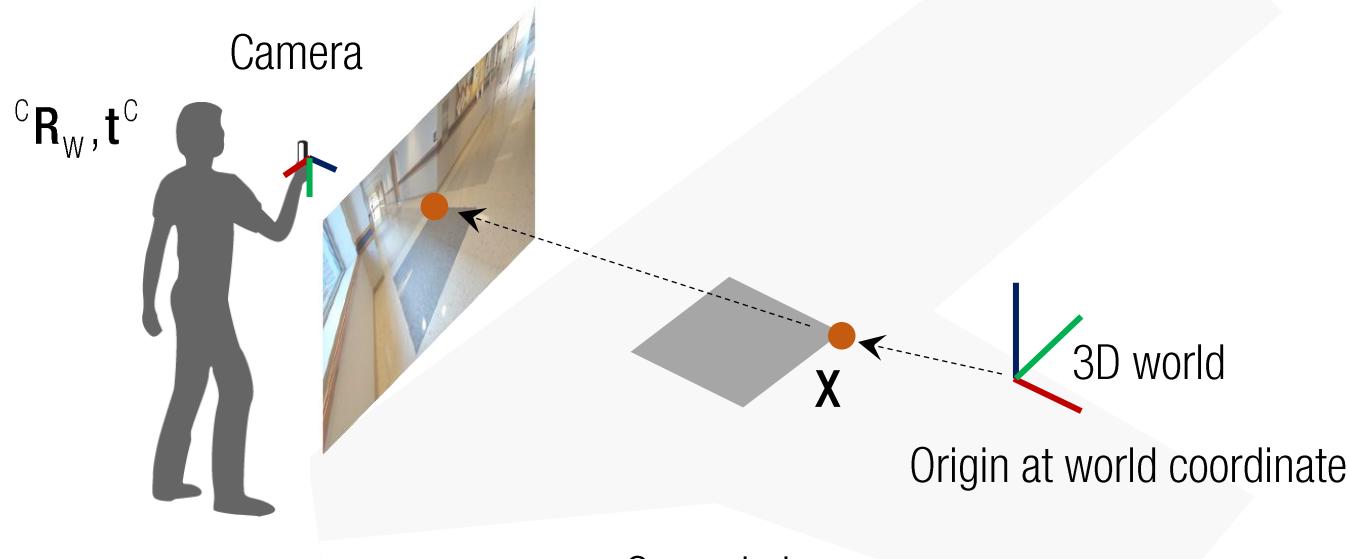
$$\mathbf{x}_c = {}^C \mathbf{R}_w \mathbf{X} + {}^C \mathbf{t} = \begin{bmatrix} r_{x1} & r_{x2} & r_{x3} & t_x \\ r_{y1} & r_{y2} & r_{y3} & t_y \\ r_{z1} & r_{z2} & r_{z3} & t_z \end{bmatrix} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix}$$

where  ${}^C \mathbf{t}$  is translation from world to camera seen from camera.

**Rotate and then, translate.**



# Recall: Translate and the, Rotate



$$\mathbf{X}_C = {}^C \mathbf{R}_w \mathbf{X} + {}^C \mathbf{t} = \begin{bmatrix} r_{x1} & r_{x2} & r_{x3} & t_x \\ r_{y1} & r_{y2} & r_{y3} & t_y \\ r_{z1} & r_{z2} & r_{z3} & t_z \end{bmatrix} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix}$$

where  ${}^C \mathbf{t}$  is translation from world to camera seen from camera.

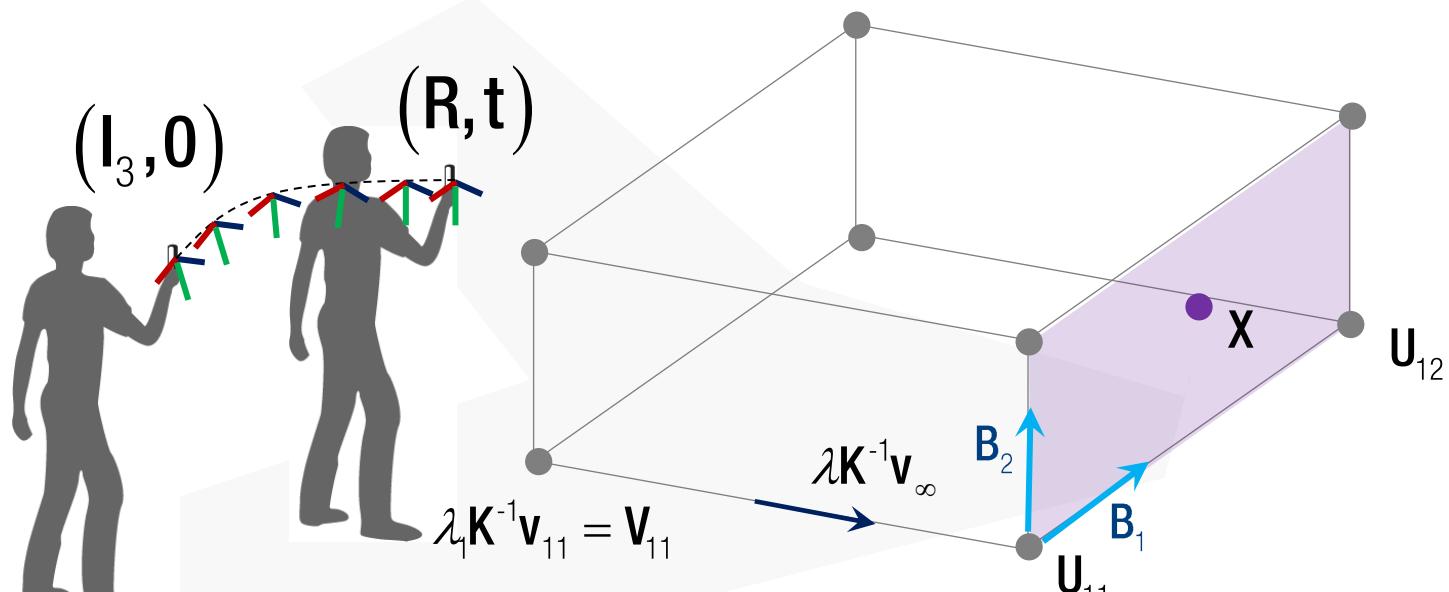
**Rotate and then, translate.**

c) Translate and then, rotate.

$$\mathbf{X}_C = {}^C \mathbf{R}_w (\mathbf{X} - \mathbf{C}) = \begin{bmatrix} r_{x1} & r_{x2} & r_{x3} \\ r_{y1} & r_{y2} & r_{y3} \\ r_{z1} & r_{z2} & r_{z3} \end{bmatrix} \begin{bmatrix} 1 & -C_x \\ 1 & -C_y \\ 1 & -C_z \end{bmatrix} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix}$$

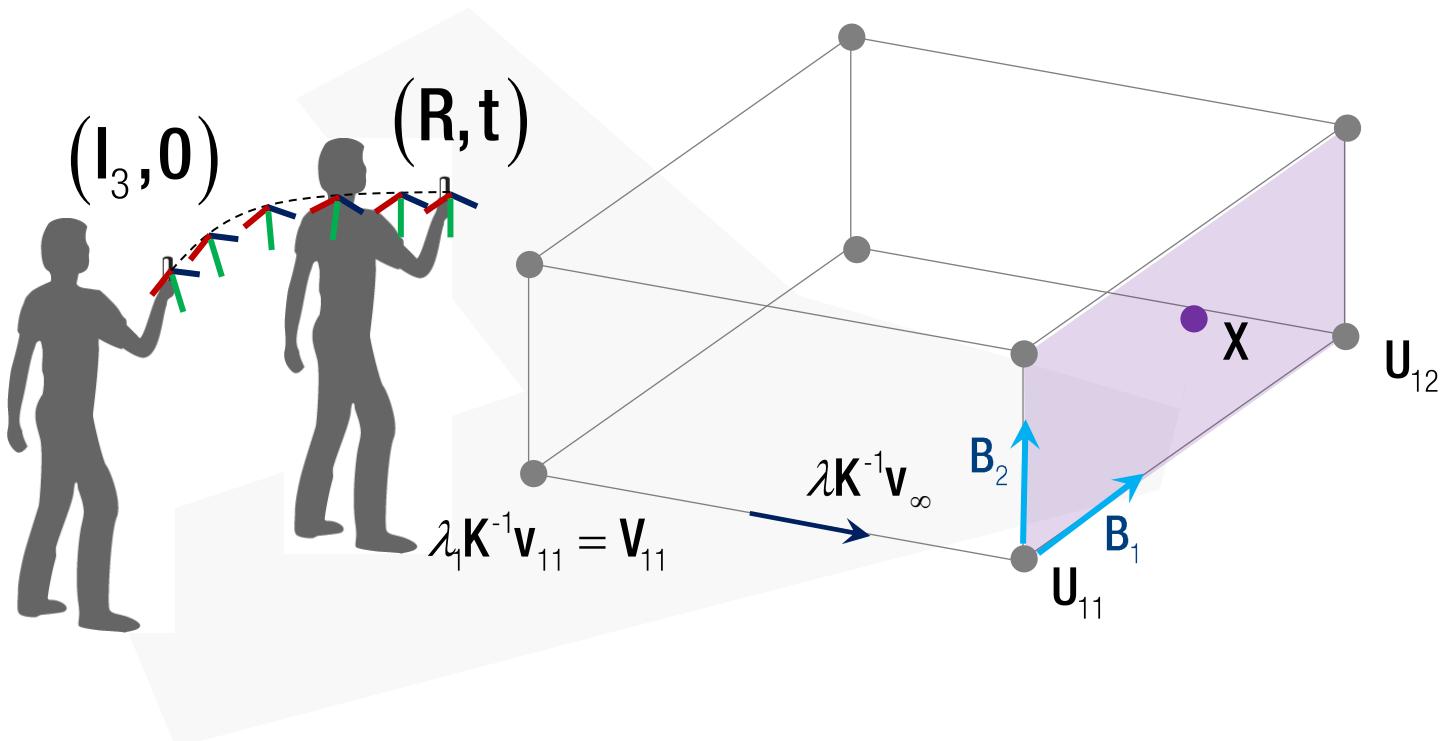
where  $\mathbf{C}$  is translation from world to camera seen from world.

# Interpolation of Translation



$$\lambda \tilde{u} = K [R \quad t] \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix} = KR [I_3 \quad -C] \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix}$$

# Interpolation of Translation



$$\lambda \tilde{\mathbf{v}} = \mathbf{K} [\mathbf{R} \quad \mathbf{t}] \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix} = \mathbf{K} \mathbf{R} \begin{bmatrix} I_3 & -\mathbf{C} \end{bmatrix} \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix}$$

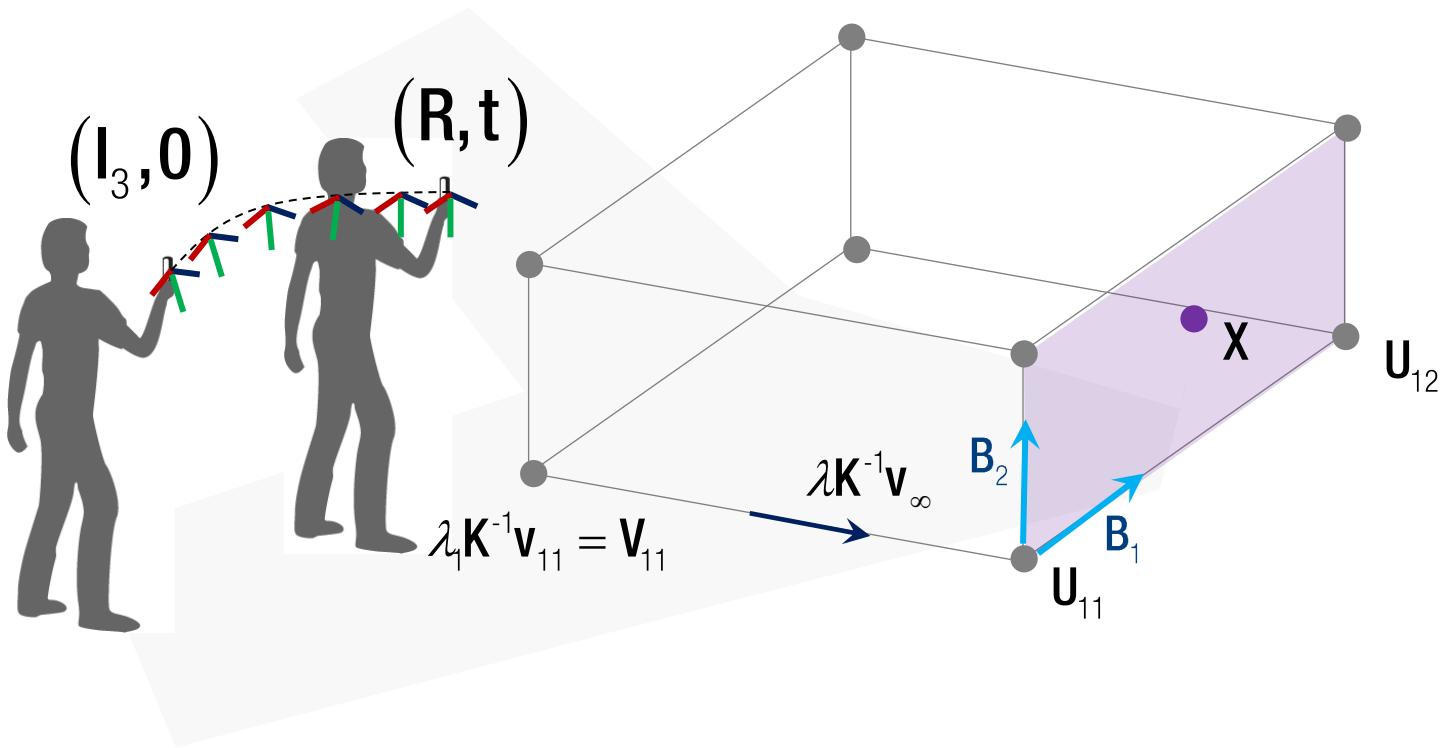
Rot.  $\rightarrow$  Trans.      Trans.  $\rightarrow$  Rot.

Translation is independent on rotation.

How to interpolate translation?

$$\mathbf{c}_1 = \begin{bmatrix} C_1^x \\ C_1^y \\ C_1^z \end{bmatrix} \rightarrow \mathbf{c}_2 = \begin{bmatrix} C_2^x \\ C_2^y \\ C_2^z \end{bmatrix}$$

# Interpolation of Translation



$$\lambda \tilde{u} = K [R \quad t] \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix} = KR [I_3 \quad -C] \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix}$$

Rot.  $\rightarrow$  Trans.      Trans.  $\rightarrow$  Rot.

Translation is independent on rotation.

How to interpolate translation?

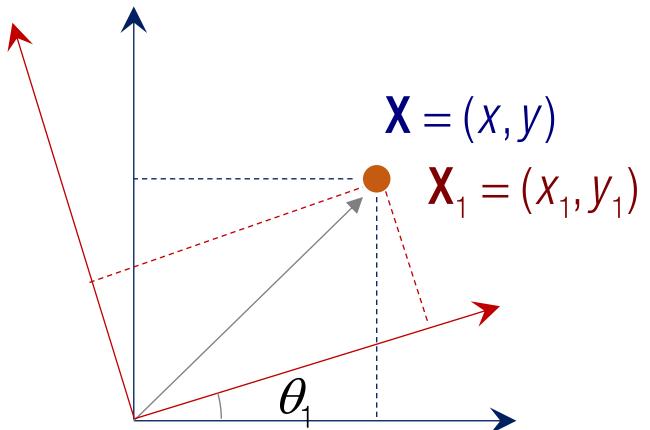
$$C_1 = \begin{bmatrix} C_1^x \\ C_1^y \\ C_1^z \end{bmatrix} \rightarrow C_2 = \begin{bmatrix} C_2^x \\ C_2^y \\ C_2^z \end{bmatrix}$$

Interpolated camera center:

$$C_i = wC_1 + (1-w)C_2 \quad w \in [0, 1]$$

# Interpolation of Rotation

2D coordinate transform:

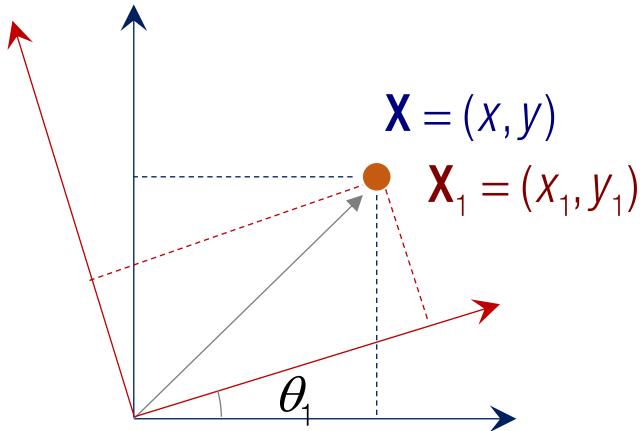


$$\begin{bmatrix} x_1 \\ y_1 \end{bmatrix} =$$

$$\begin{bmatrix} x \\ y \end{bmatrix}$$

# Interpolation of Rotation

2D coordinate transform:

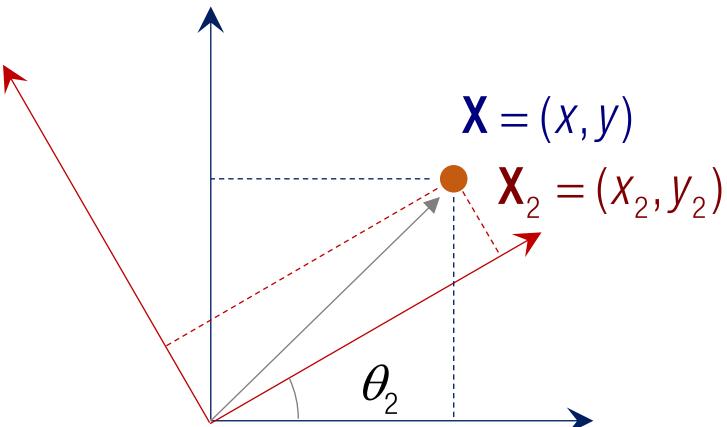


$$\begin{bmatrix} x_1 \\ y_1 \end{bmatrix} = \begin{bmatrix} \cos \theta_1 & \sin \theta_1 \\ -\sin \theta_1 & \cos \theta_1 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

$$\det \left( \begin{bmatrix} \cos \theta_1 & \sin \theta_1 \\ -\sin \theta_1 & \cos \theta_1 \end{bmatrix} \right) = \cos^2 \theta_1 + \sin^2 \theta_1 = 1$$

# Interpolation of Rotation

2D coordinate transform:

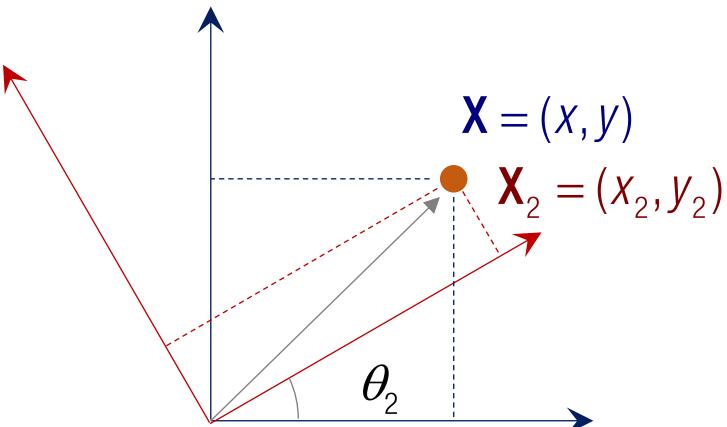


$$\begin{bmatrix} x_1 \\ y_1 \end{bmatrix} = \begin{bmatrix} \cos \theta_1 & \sin \theta_1 \\ -\sin \theta_1 & \cos \theta_1 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

$$\begin{bmatrix} x_2 \\ y_2 \end{bmatrix} = \begin{bmatrix} \cos \theta_2 & \sin \theta_2 \\ -\sin \theta_2 & \cos \theta_2 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

# Interpolation of Rotation

2D coordinate transform:

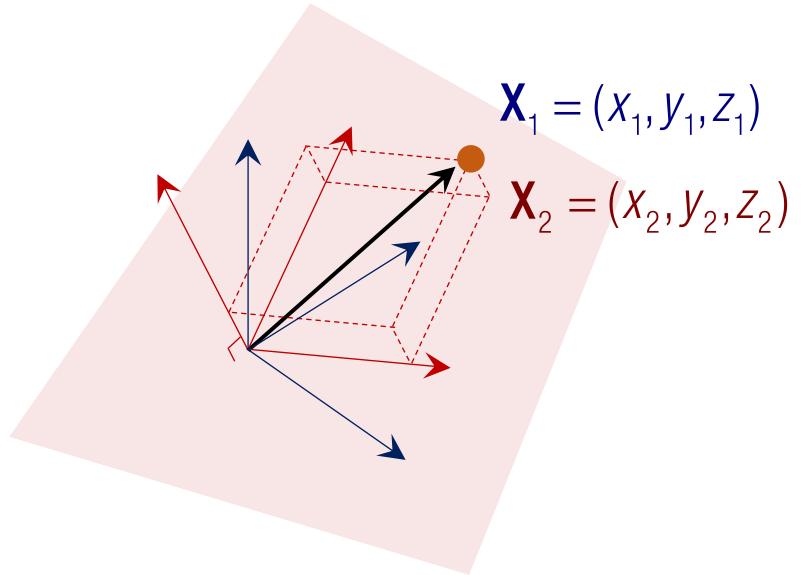


$$\begin{bmatrix} x_1 \\ y_1 \end{bmatrix} = \begin{bmatrix} \cos \theta_1 & \sin \theta_1 \\ -\sin \theta_1 & \cos \theta_1 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

$$\theta = w\theta_1 + (1-w)\theta_2$$
$$w \in [0, 1]$$

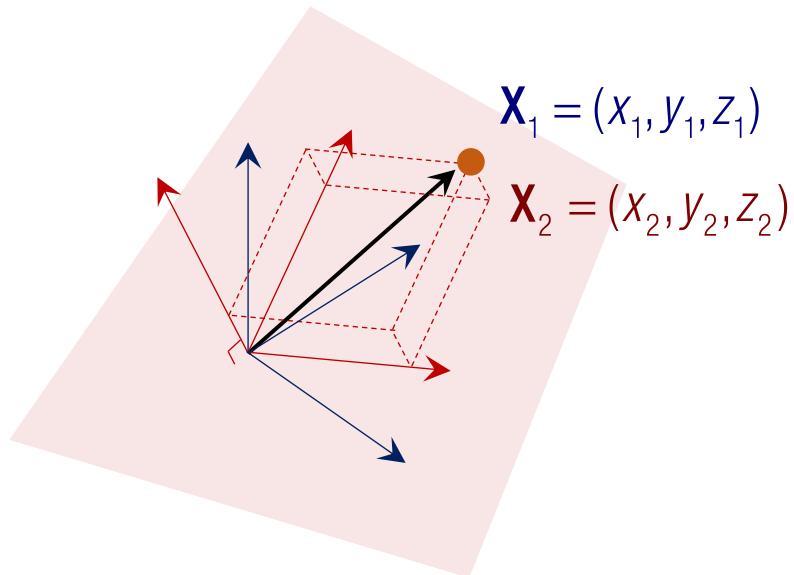
$$\begin{bmatrix} x_2 \\ y_2 \end{bmatrix} = \begin{bmatrix} \cos \theta_2 & \sin \theta_2 \\ -\sin \theta_2 & \cos \theta_2 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

# Interpolation of Rotation in 3D



$$\mathbf{X}_2 = \begin{bmatrix} r_{x1} & r_{x2} & r_{x3} \\ r_{y1} & r_{y2} & r_{y3} \\ r_{z1} & r_{z2} & r_{z3} \end{bmatrix} \mathbf{X} = \mathbf{R}_1 \mathbf{X}_1$$

# Interpolation of Rotation in 3D



$$\mathbf{X}_2 = \begin{bmatrix} r_{x1} & r_{x2} & r_{x3} \\ r_{y1} & r_{y2} & r_{y3} \\ r_{z1} & r_{z2} & r_{z3} \end{bmatrix} \mathbf{X} = \mathbf{R}_1 \mathbf{X}_1$$

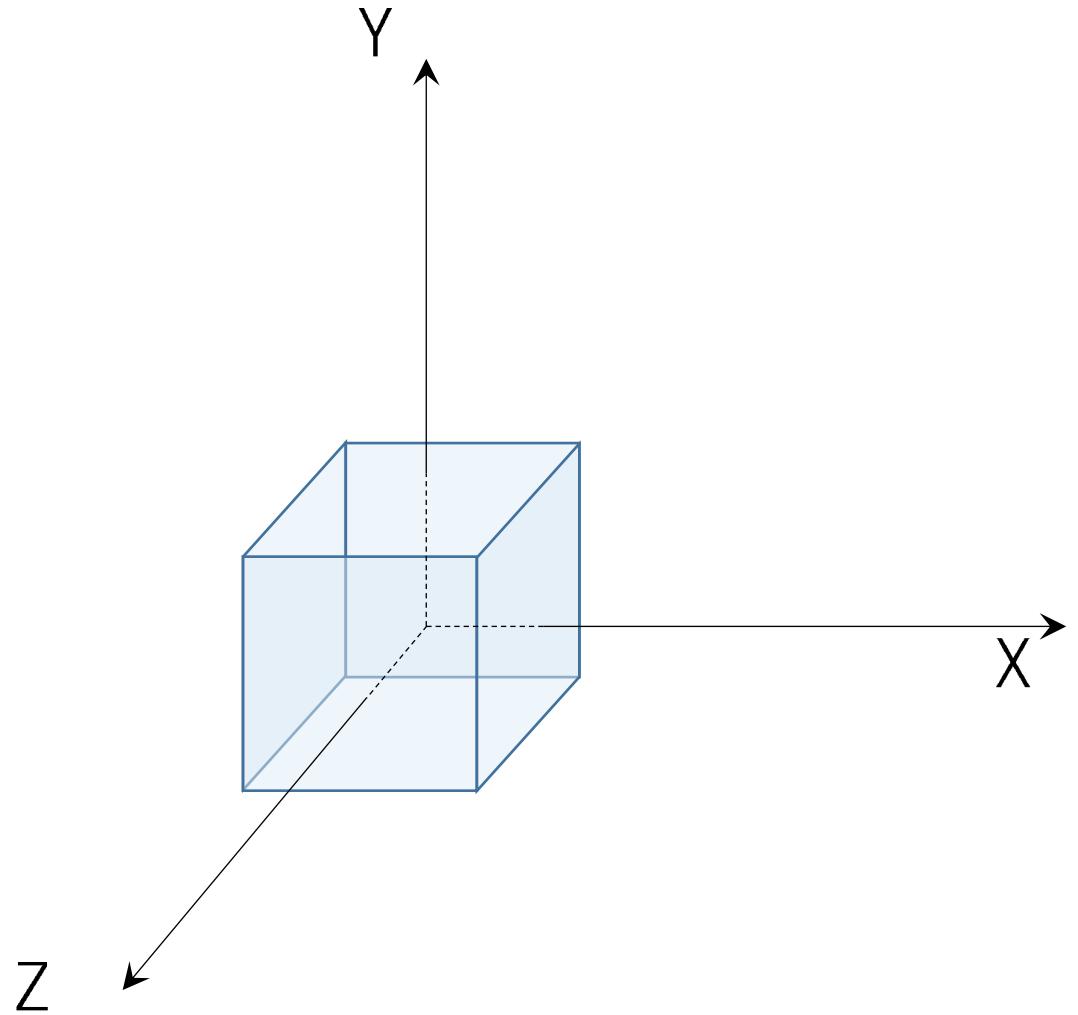
How to interpolate between two coordinates?

$$\mathbf{R}_1 \rightarrow \mathbf{R}_2$$

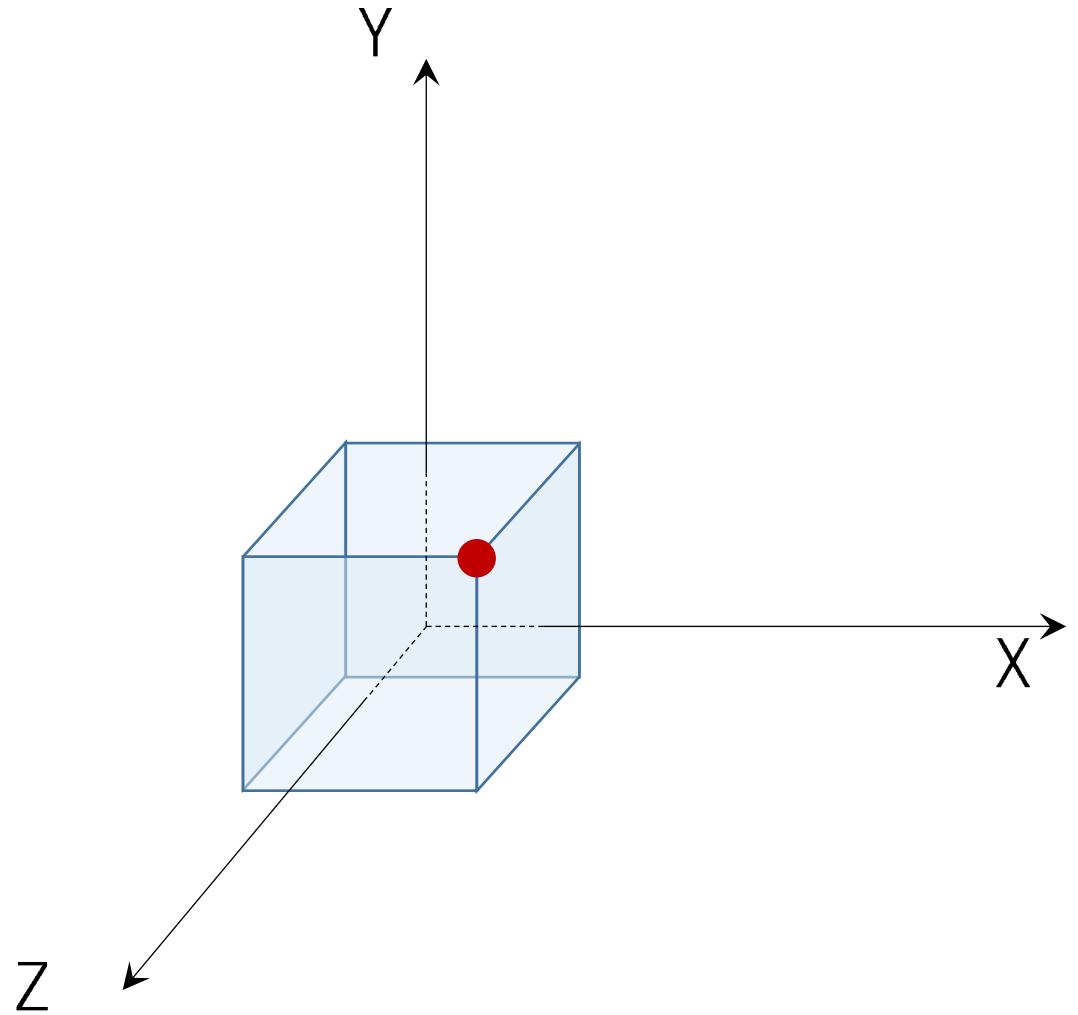
# dof: 3

# of parameters: 9

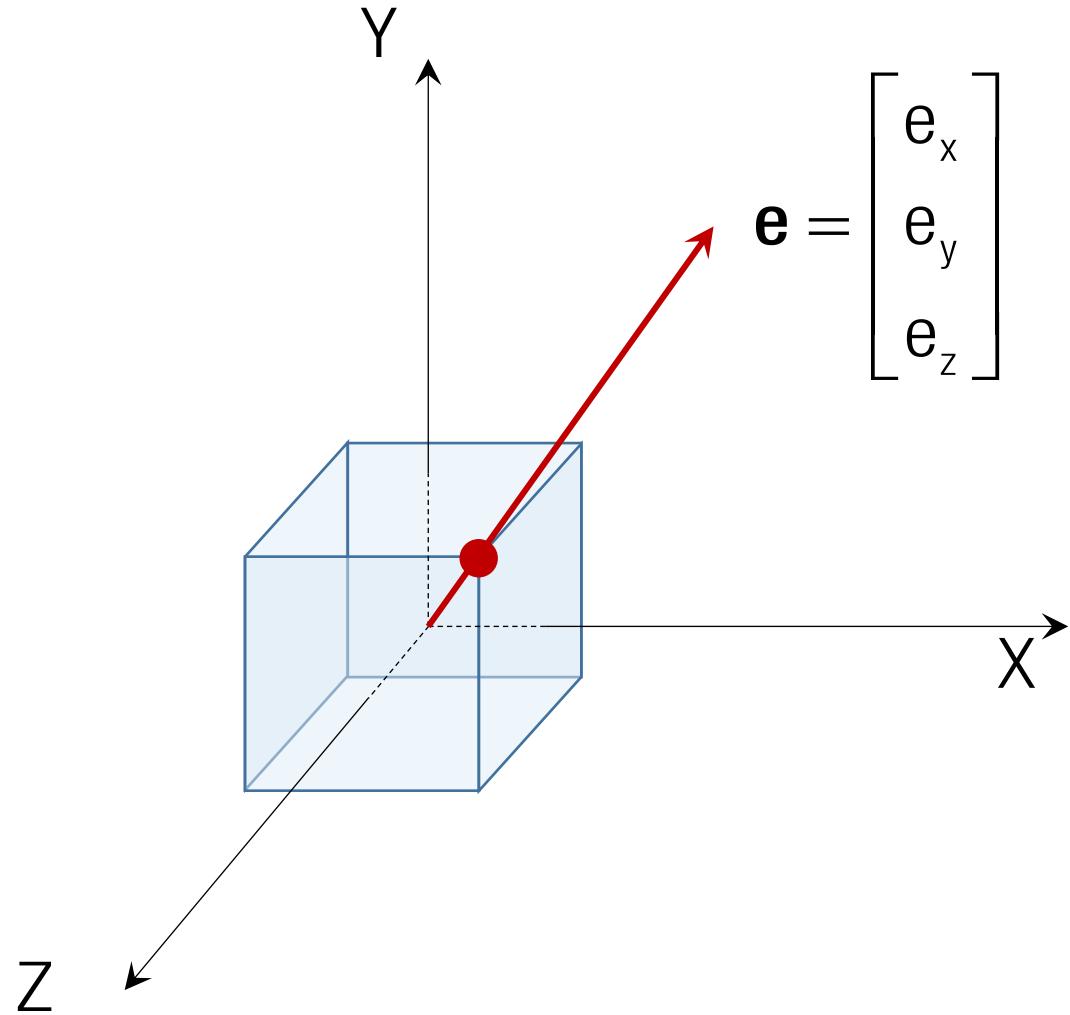
# Axis Angle Representation



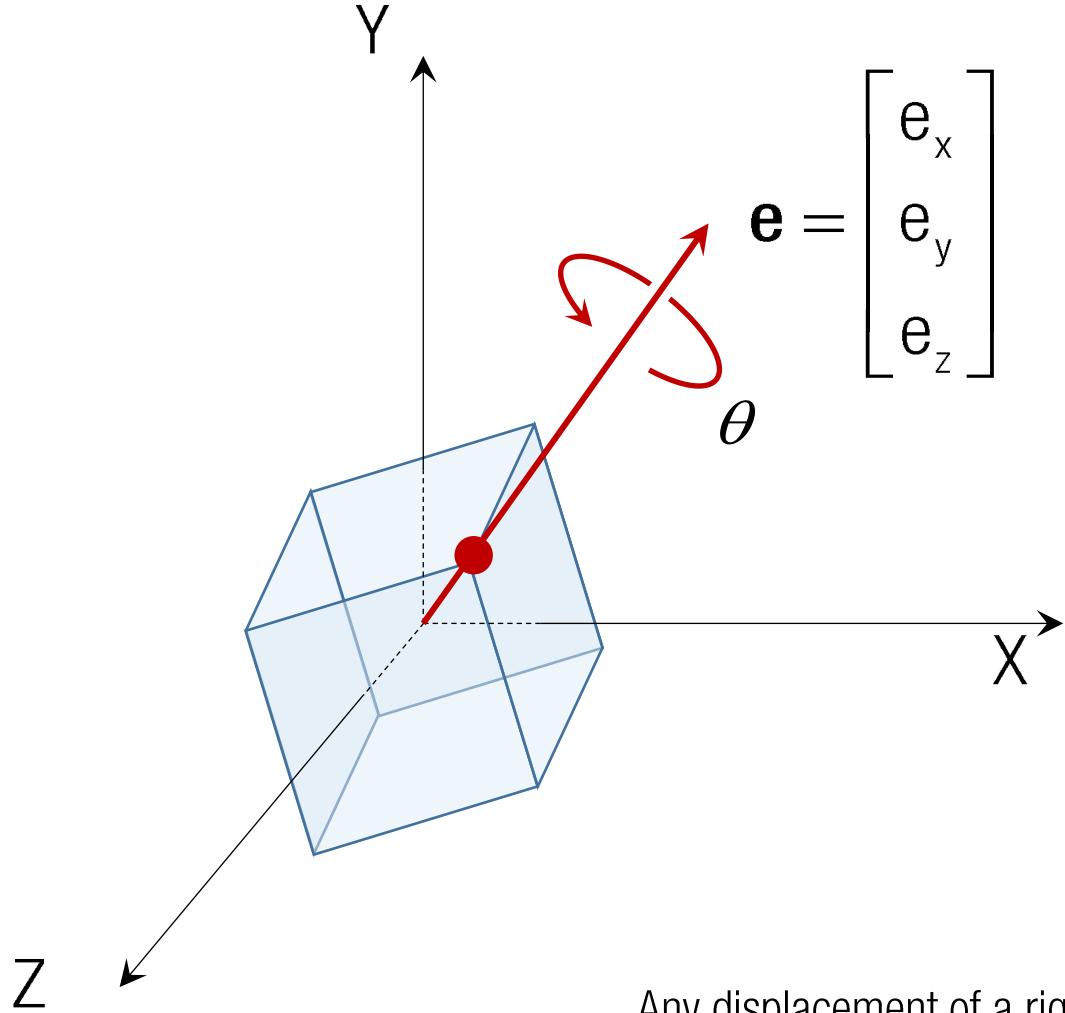
# Axis Angle Representation



# Axis Angle Representation



# Axis Angle Representation



$$\mathbf{e} = \begin{bmatrix} e_x \\ e_y \\ e_z \end{bmatrix}$$

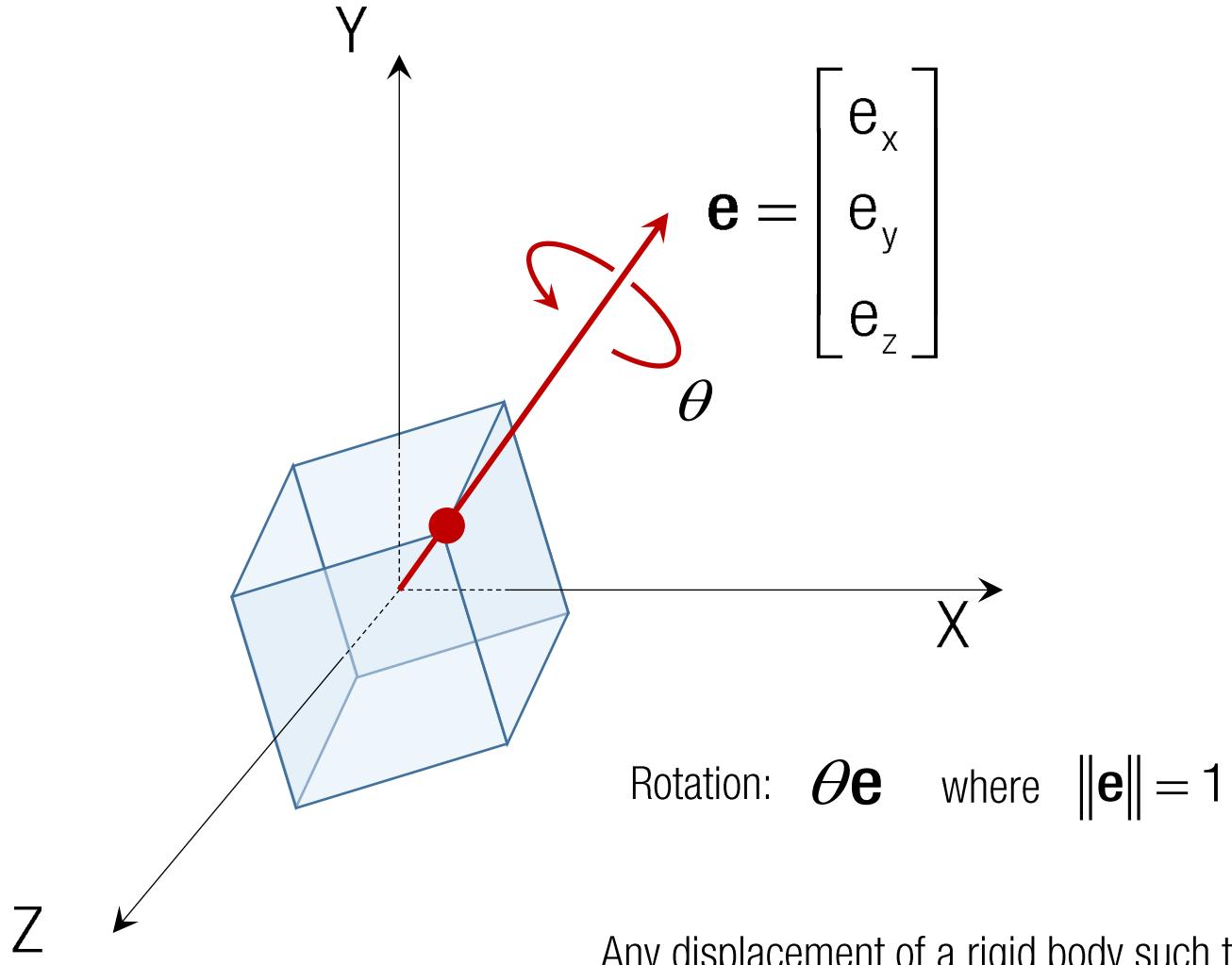


Leonhard Euler

Euler's theorem

Any displacement of a rigid body such that a point on the rigid body remains fixed, is equivalent to a single rotation about some axis that runs through the fixed point.

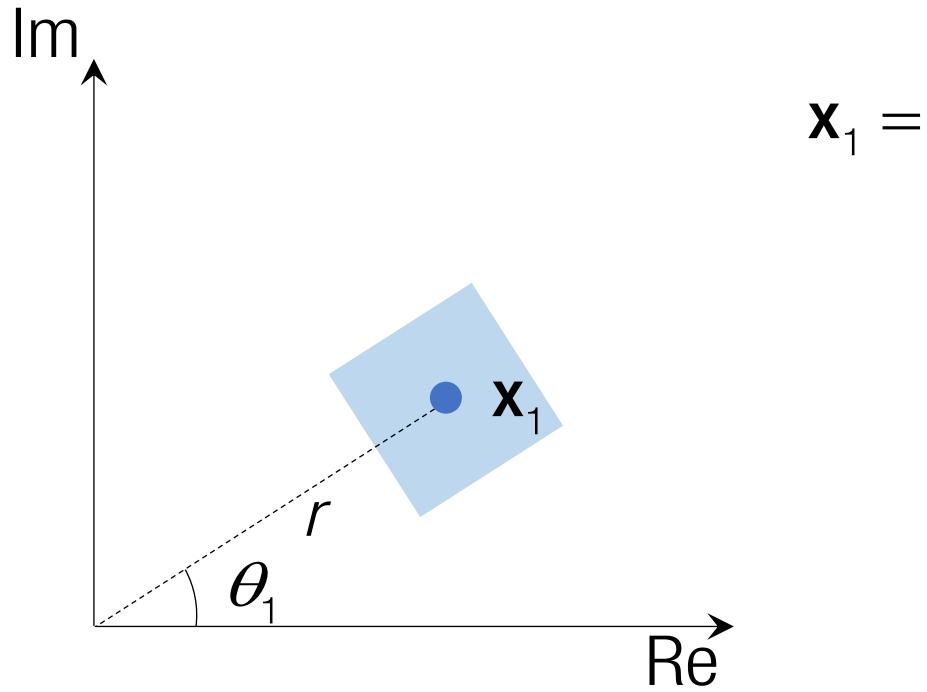
# Axis Angle Representation



Euler's theorem

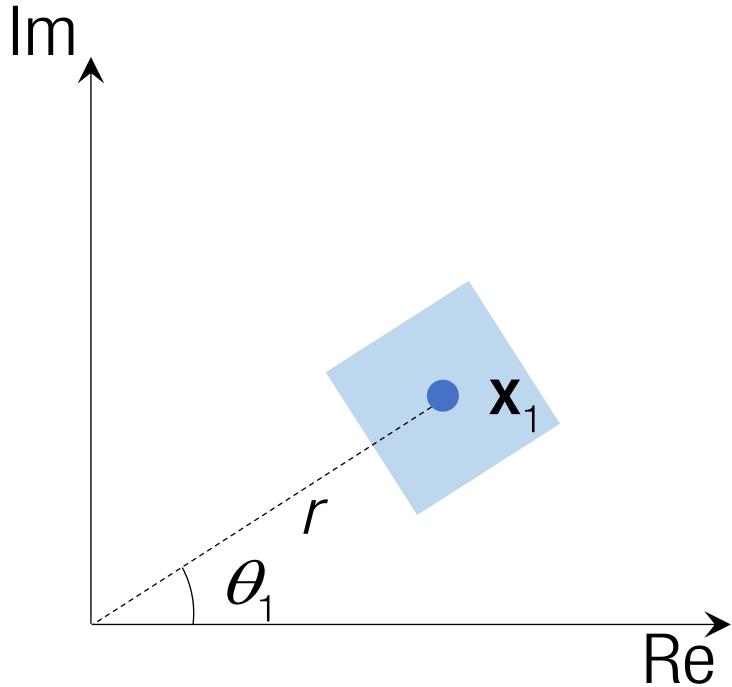
Any displacement of a rigid body such that a point on the rigid body remains fixed, is equivalent to a single rotation about some axis that runs through the fixed point.

# 2D Exponential Map (Euler's Formula)



$$x_1 =$$

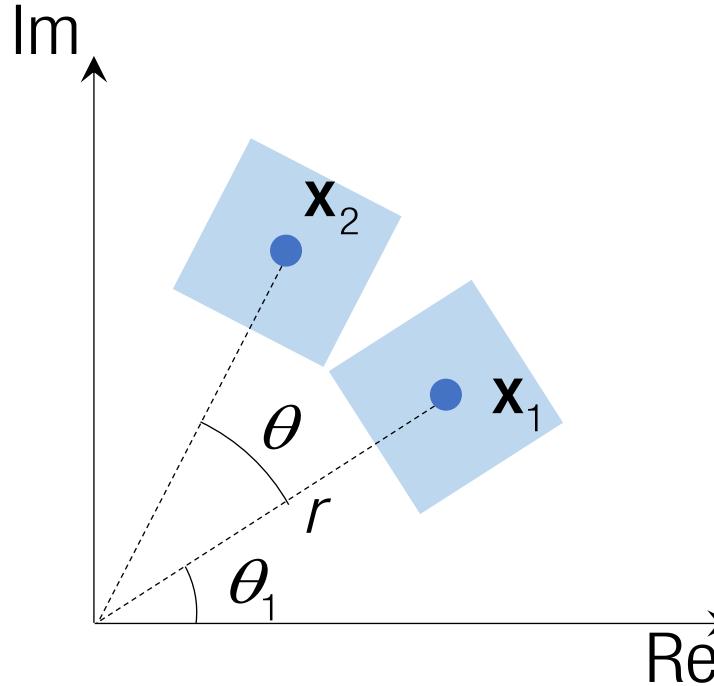
# 2D Exponential Map (Euler's Formula)



$$x_1 = r \exp(i\theta_1) = r(\cos\theta_1 + i\sin\theta_1)$$

Ref)  $\exp(x) = \sum_{k=0}^{\infty} \frac{x^k}{k!}$

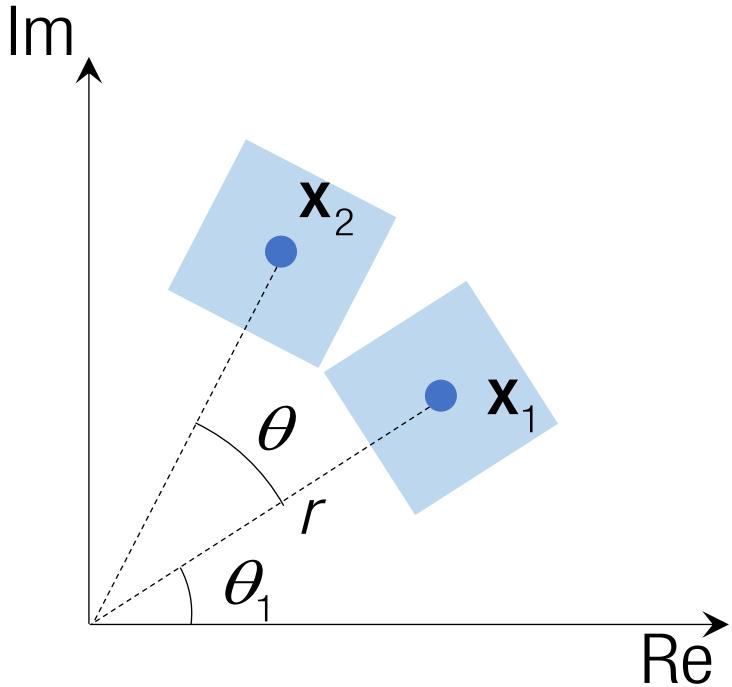
# 2D Exponential Map (Euler's Formula)



$$x_1 = r \exp(i\theta_1) = r(\cos\theta_1 + i\sin\theta_1)$$

$x_2$

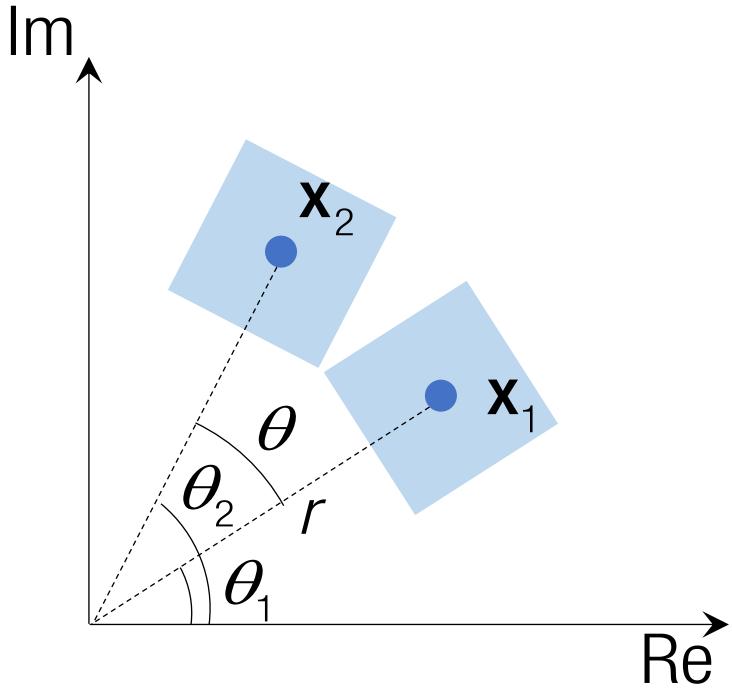
# 2D Exponential Map (Euler's Formula)



$$\mathbf{x}_1 = r \exp(i\theta_1) = r(\cos\theta_1 + i\sin\theta_1)$$

$$\begin{aligned}\mathbf{x}_2 &= \exp(i\theta)\mathbf{x}_1 = r(\cos\theta + i\sin\theta)(\cos\theta_1 + i\sin\theta_1) \\ &= r(\cos\theta\cos\theta_1 - \sin\theta\sin\theta_1 + i(\cos\theta\sin\theta_1 + \sin\theta\cos\theta_1)) \\ &= r(\cos(\theta + \theta_1) + i\sin(\theta + \theta_1))\end{aligned}$$

# 2D Exponential Map (Euler's Formula)

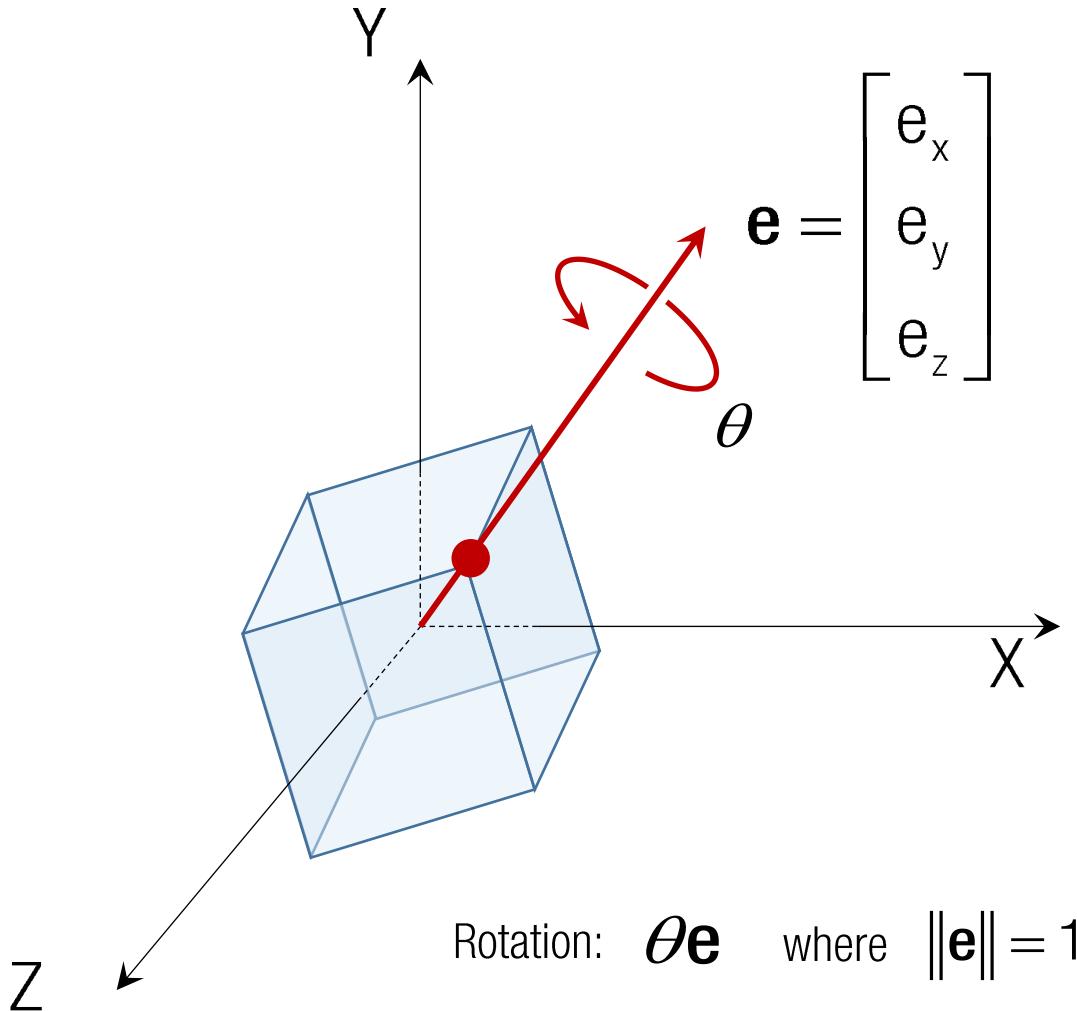


$$\mathbf{x}_1 = r \exp(i\theta_1) = r(\cos\theta_1 + i\sin\theta_1)$$

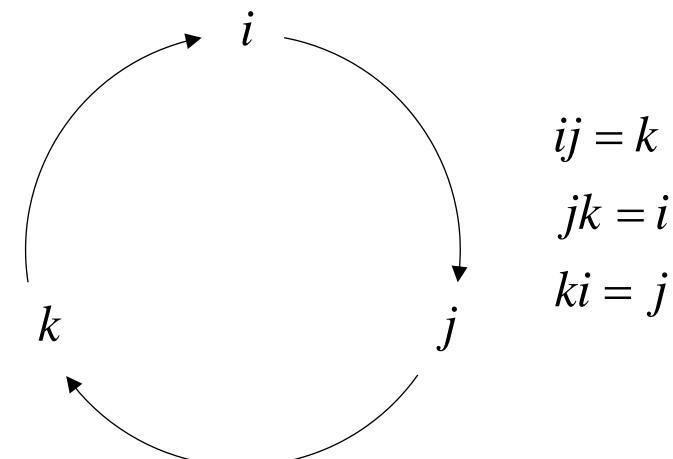
$$\begin{aligned}\mathbf{x}_2 &= \exp(i\theta)\mathbf{x}_1 = r(\cos\theta + i\sin\theta)(\cos\theta_1 + i\sin\theta_1) \\&= r(\cos\theta\cos\theta_1 - \sin\theta\sin\theta_1 + i(\cos\theta\sin\theta_1 + \sin\theta\cos\theta_1)) \\&= r(\cos(\theta + \theta_1) + i\sin(\theta + \theta_1)) \\&= r(\cos\theta_2 + i\sin\theta_2)\end{aligned}$$

$$\theta_2 = \theta_1 + \theta$$

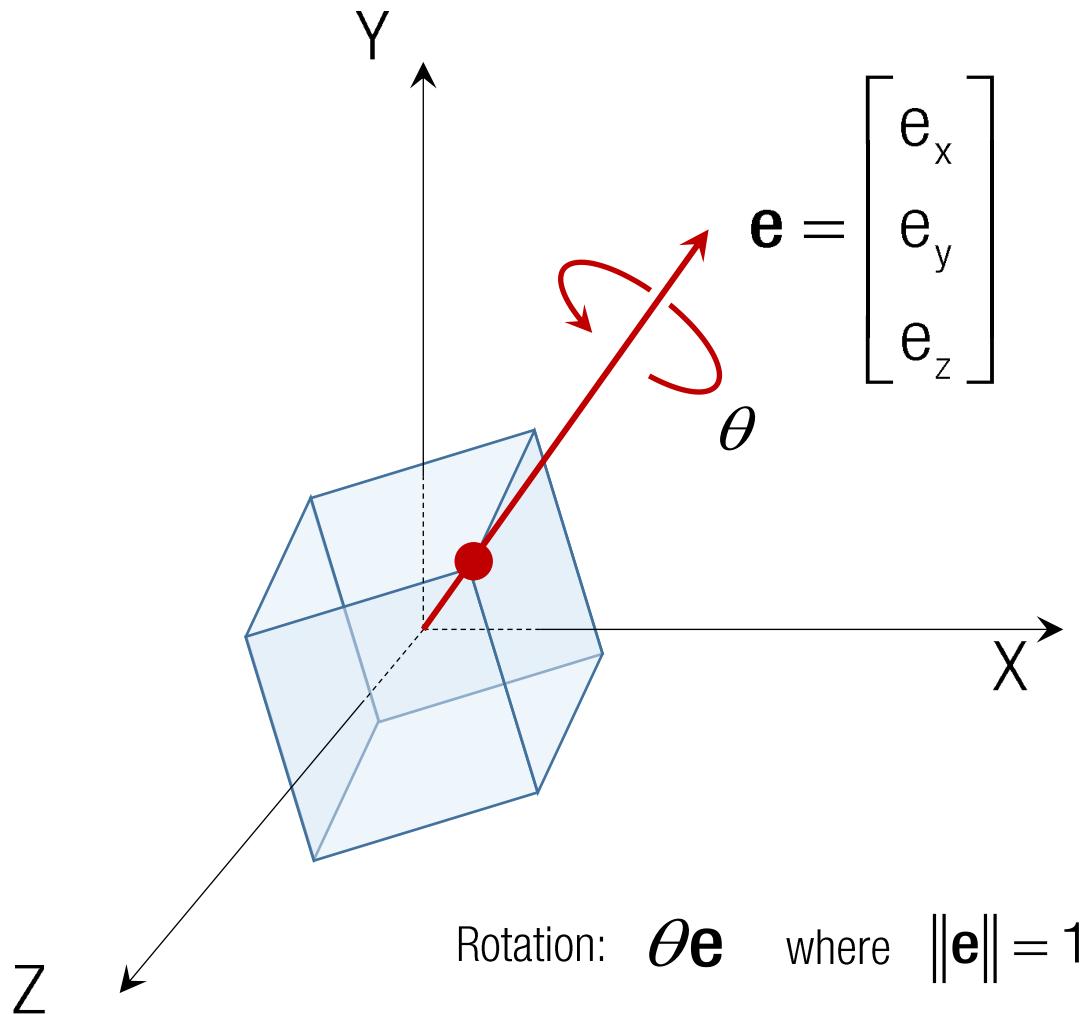
# 3D Exponential Map: Quaternion



$$\exp\left(\frac{\theta}{2}\mathbf{e}\right) = \cos\frac{\theta}{2} + \sin\frac{\theta}{2}(i e_x + j e_y + k e_z)$$
$$i^2 = j^2 = k^2 = ijk = -1$$



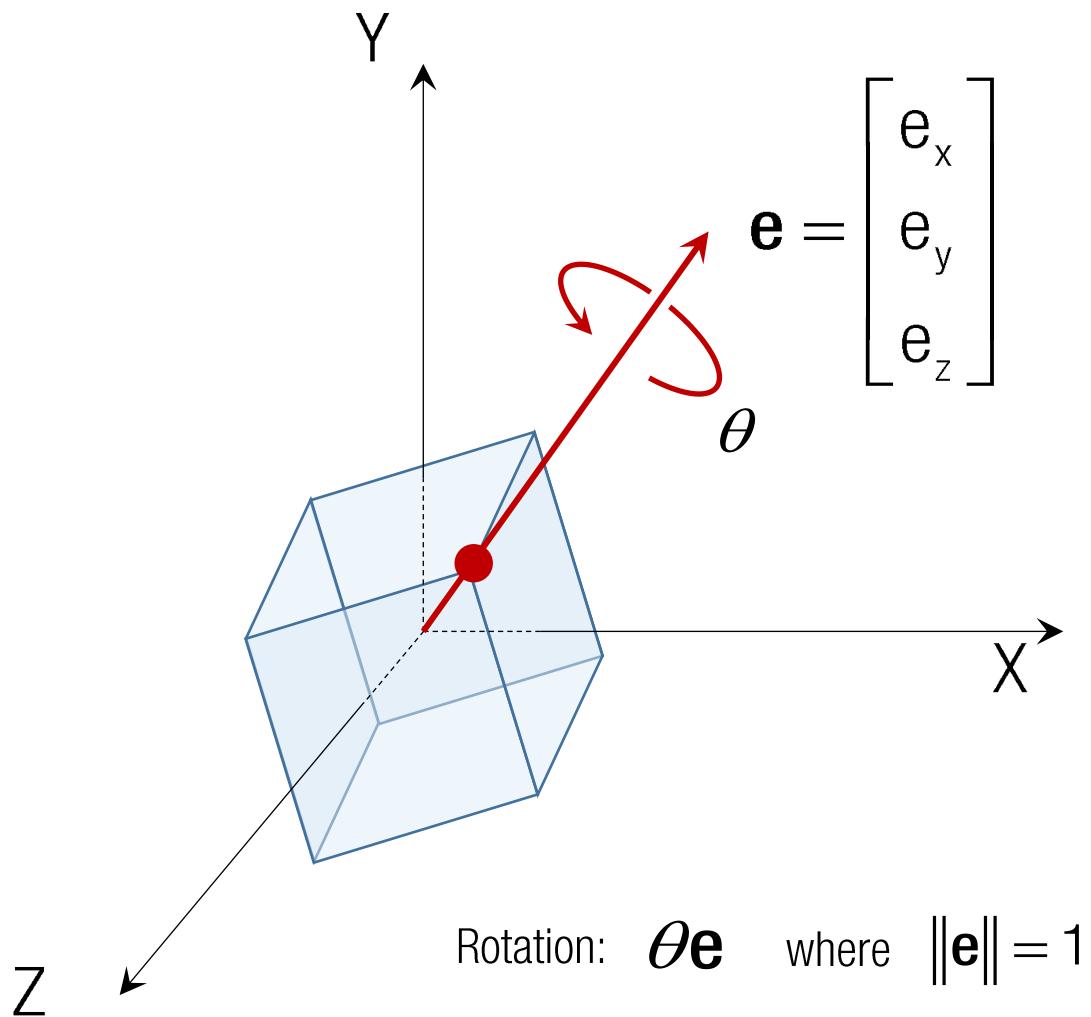
# Exercise



$$\exp\left(\frac{\theta}{2}\mathbf{e}\right) = \cos\frac{\theta}{2} + \sin\frac{\theta}{2}(i\mathbf{e}_x + j\mathbf{e}_y + k\mathbf{e}_z)$$

Find a quaternion  $\mathbf{q}$  such that it describes a rotation of 60 degrees about the axis  $\mathbf{a}=[3, 4, 0]$ .

# Exercise



$$\exp\left(\frac{\theta}{2}\mathbf{e}\right) = \cos\frac{\theta}{2} + \sin\frac{\theta}{2}(i\mathbf{e}_x + j\mathbf{e}_y + k\mathbf{e}_z)$$

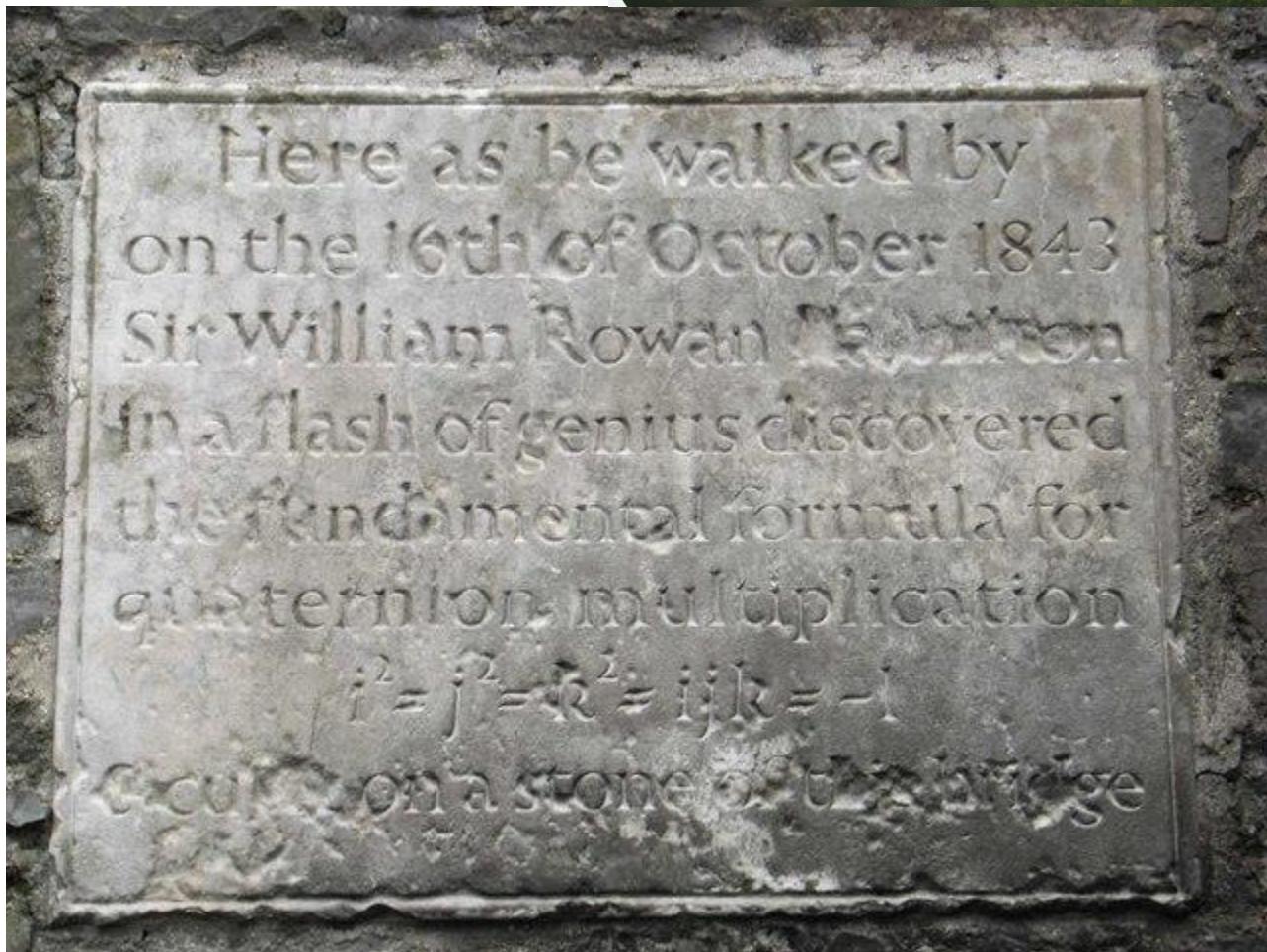
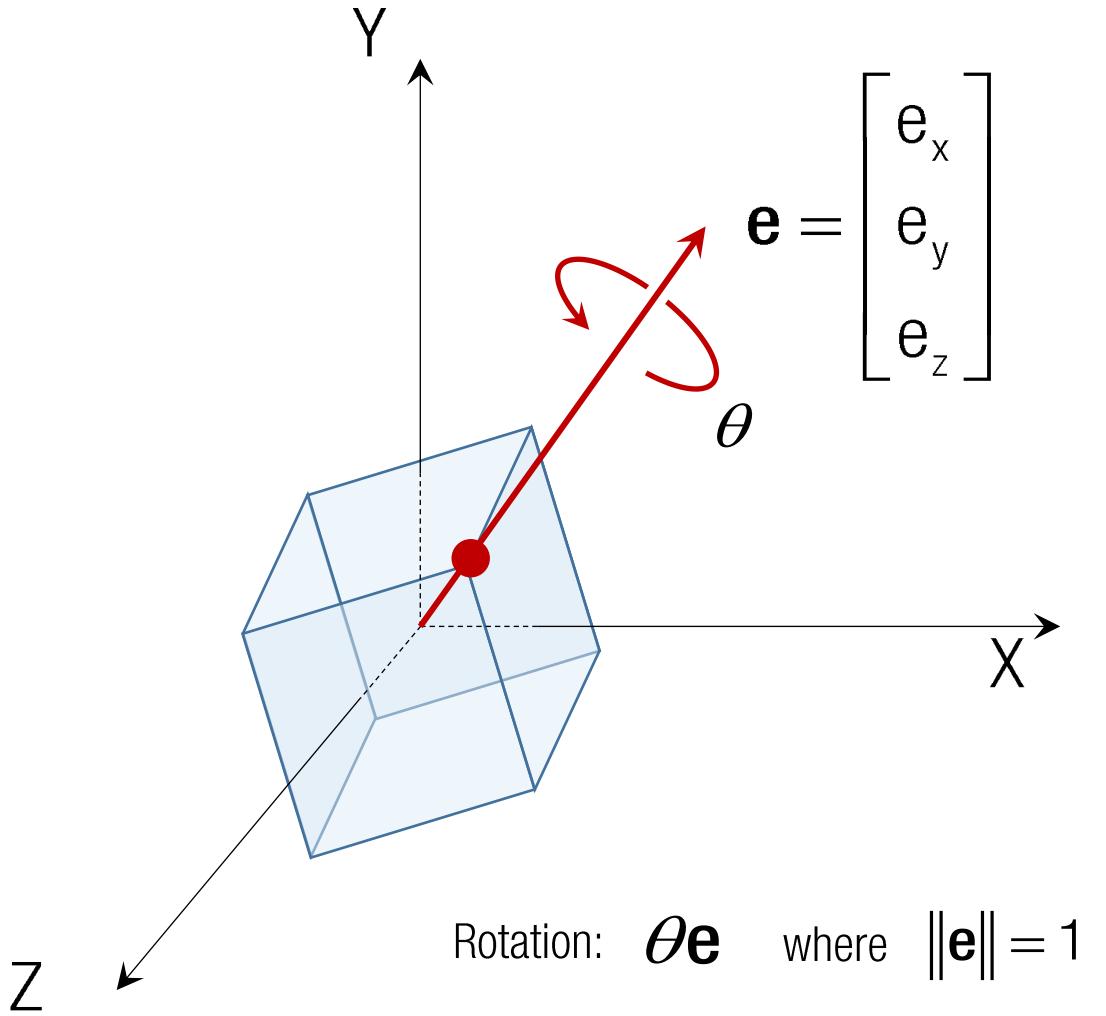
Find a quaternion  $\mathbf{q}$  such that it describes a rotation of 60 degrees about the axis  $\mathbf{a}=[3, 4, 0]$ .

$$\mathbf{e} = \mathbf{a} / \|\mathbf{a}\| = i\frac{3}{5} + j\frac{4}{5} + k\frac{0}{5}$$

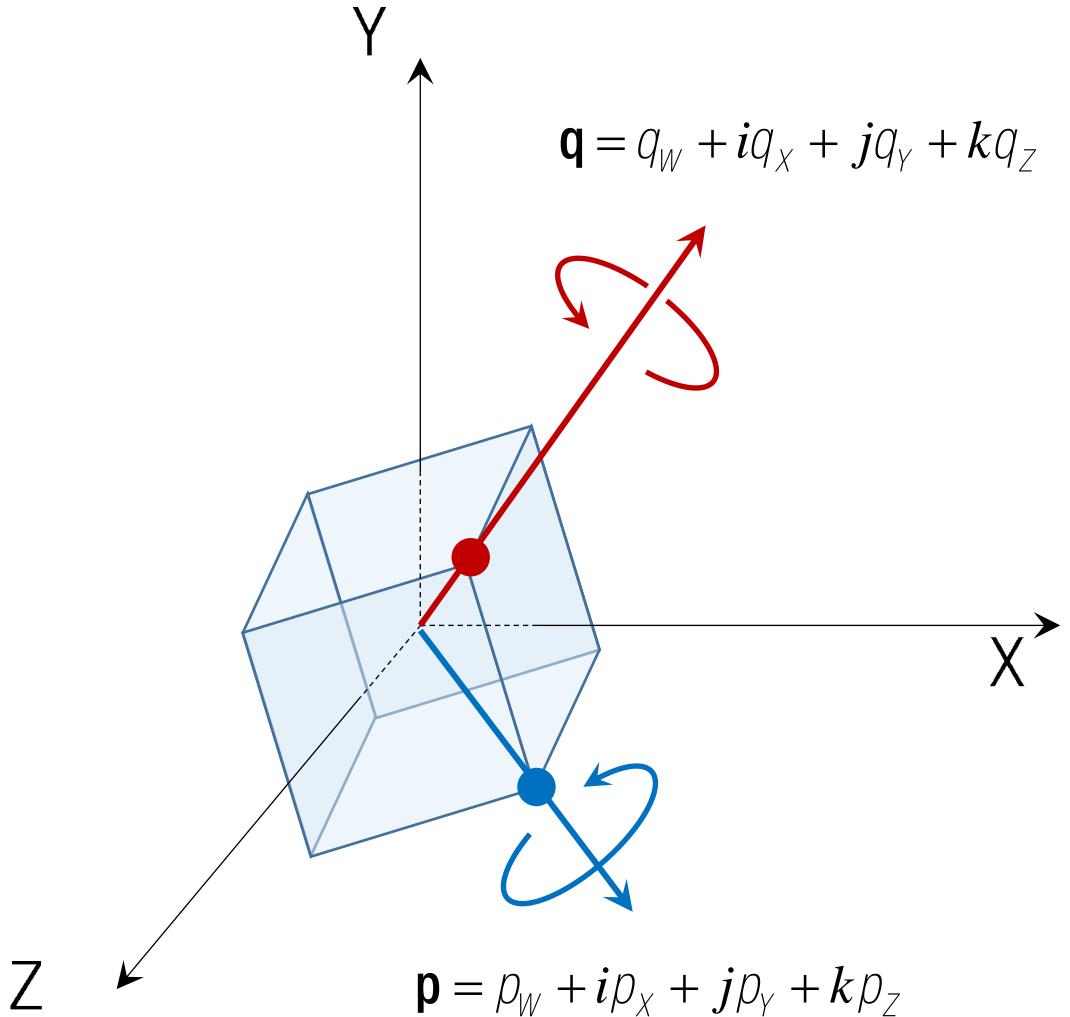
Unit vector

$$\begin{aligned}\mathbf{q} &= \cos\frac{\theta}{2} + \sin\frac{\theta}{2}\left(i\frac{3}{5} + j\frac{4}{5} + k\frac{0}{5}\right) & \theta &= \frac{\pi}{3} \\ &= \cos\frac{\pi}{3 \cdot 2} + \sin\frac{\pi}{3 \cdot 2}\left(i\frac{3}{5} + j\frac{4}{5} + k\frac{0}{5}\right) \\ &= \frac{\sqrt{3}}{2} + \frac{1}{2}\left(i\frac{3}{5} + j\frac{4}{5} + k\frac{0}{5}\right)\end{aligned}$$

# 3D Exponential Map: Quaternion



# Quaternion Product

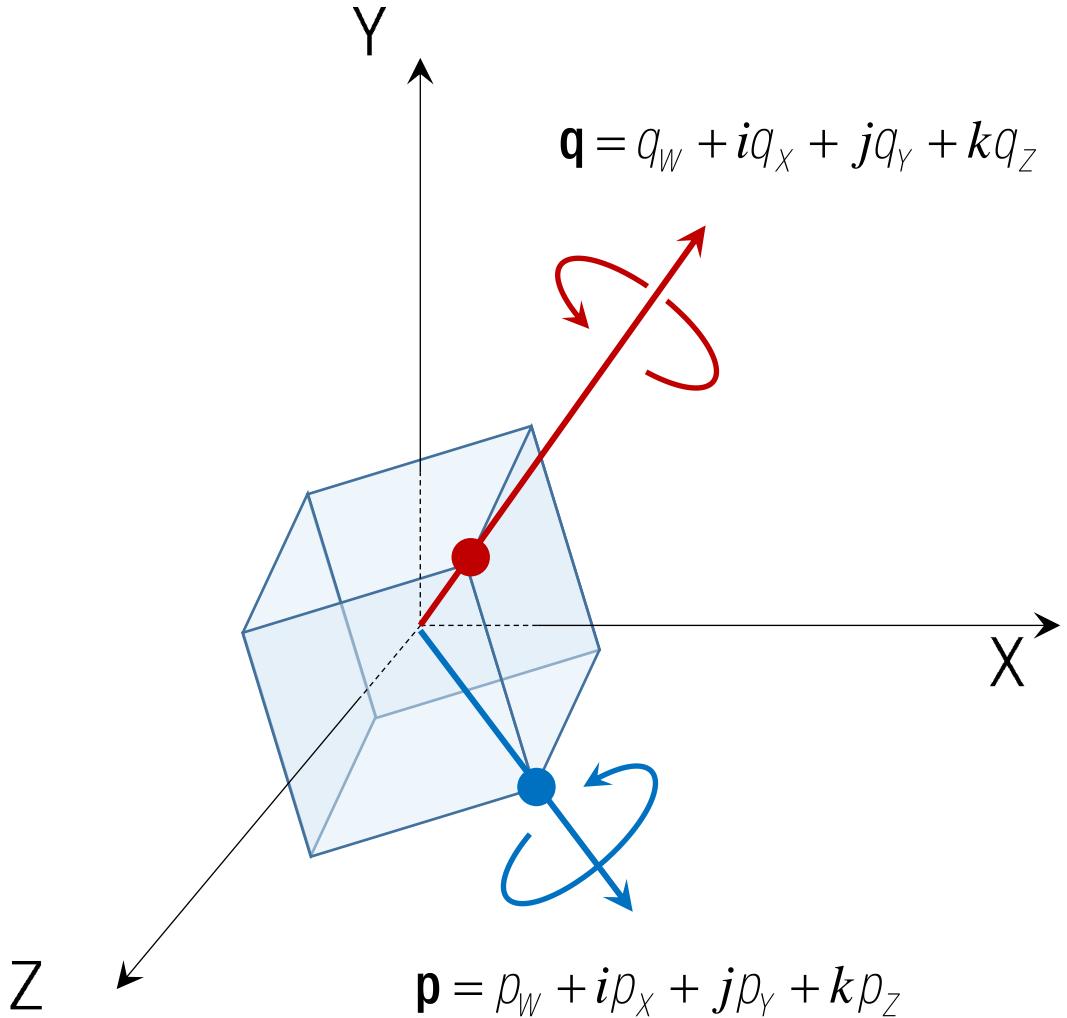


Rotate  $\mathbf{q}$  and then,  $\mathbf{p}$ :

$$\mathbf{qp} = (q_w + iq_x + jq_y + kq_z)(p_w + ip_x + jp_y + kp_z)$$

where  $\hat{\mathbf{q}} = iq_x + jq_y + kq_z$

# Quaternion Product

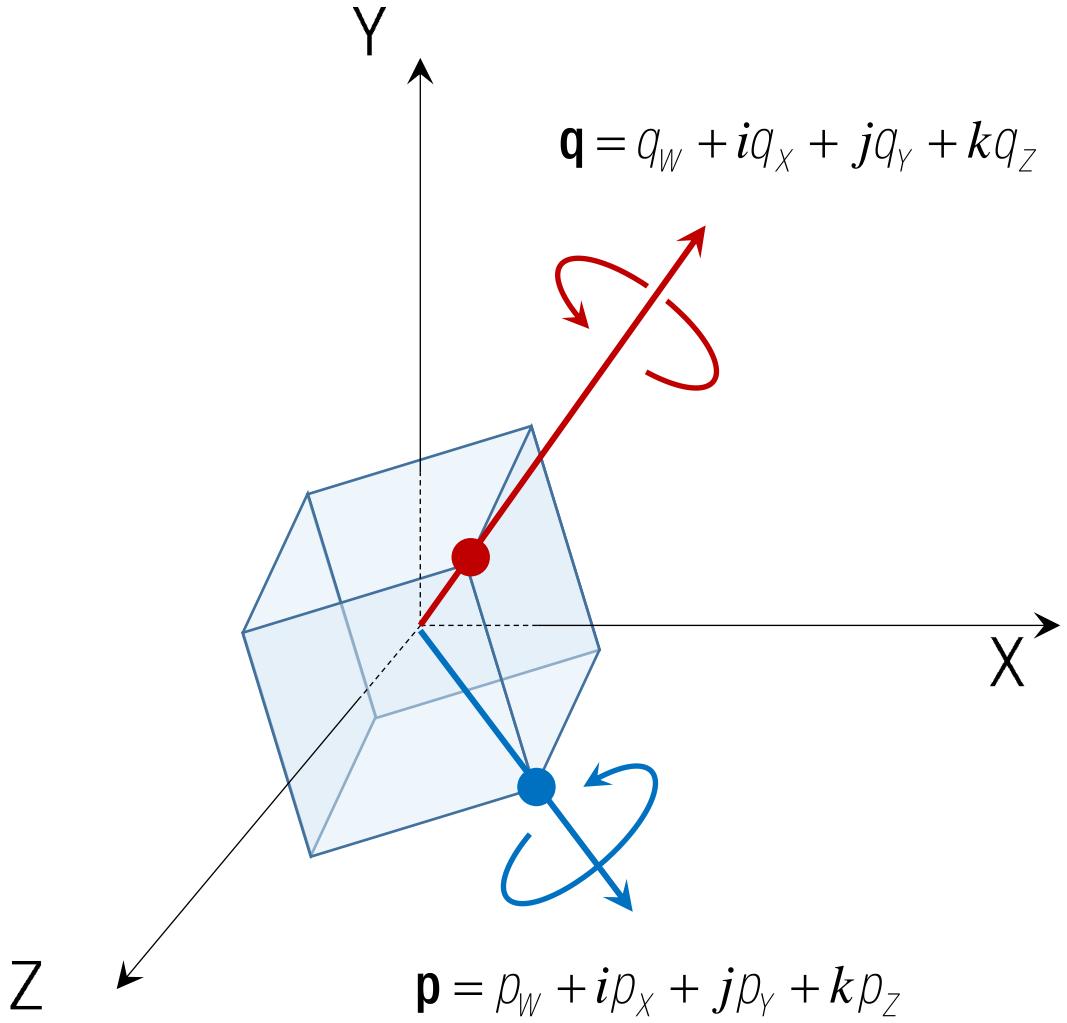


Rotate  $\mathbf{q}$  and then,  $\mathbf{p}$ :

$$\begin{aligned}\mathbf{qp} &= (q_w + iq_x + jq_y + kp_z)(p_w + ip_x + jp_y + kp_z) \\ &= (q_w p_w - q_x p_x - q_y p_y - q_z p_z) + i(q_w p_x + q_x p_w + q_y p_z - q_z p_y) \\ &\quad + j(q_w p_y - q_x p_z + q_y p_w + q_z p_x) + k(q_w p_z + q_x p_y - q_y p_x + q_z p_w)\end{aligned}$$

where  $\hat{\mathbf{q}} = iq_x + jq_y + kp_z$

# Quaternion Product

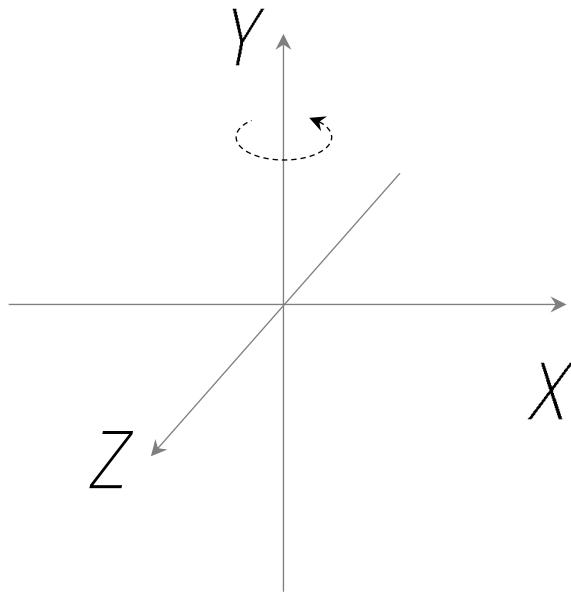


Rotate  $\mathbf{q}$  and then,  $\mathbf{p}$ :

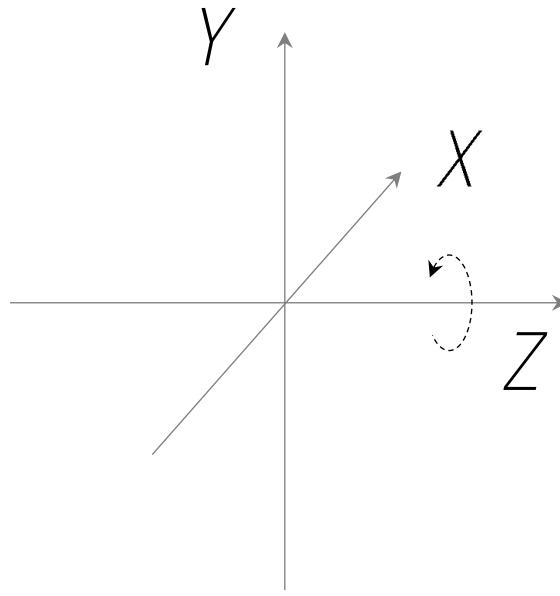
$$\begin{aligned}\mathbf{qp} &= (q_w + iq_x + jq_y + kq_z)(p_w + ip_x + jp_y + kp_z) \\ &= (q_w p_w - q_x p_x - q_y p_y - q_z p_z) + i(q_w p_x + q_x p_w + q_y p_z - q_z p_y) \\ &\quad + j(q_w p_y - q_x p_z + q_y p_w + q_z p_x) + k(q_w p_z + q_x p_y - q_y p_x + q_z p_w) \\ &= (q_w p_w - \hat{\mathbf{q}} \cdot \hat{\mathbf{p}}) + (q_w \hat{\mathbf{p}} + p_w \hat{\mathbf{q}} + \hat{\mathbf{q}} \times \hat{\mathbf{p}})\end{aligned}$$

where  $\hat{\mathbf{q}} = iq_x + jq_y + kq_z$

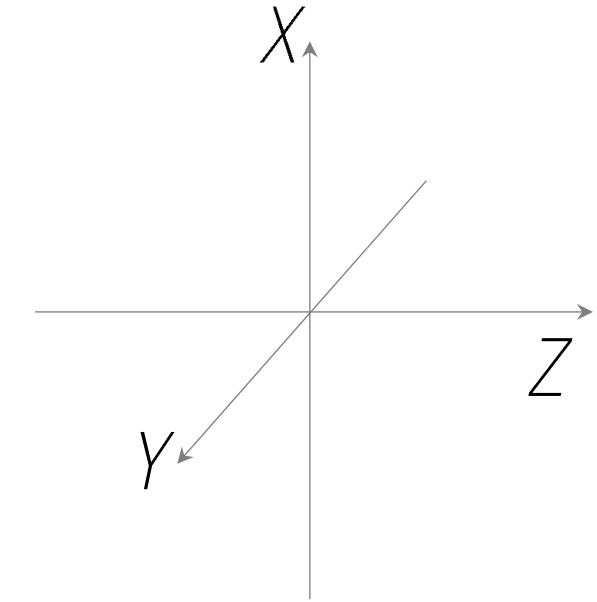
# Quaternion Product Example



Rotating 90 degrees about  $Y$  axis.



Rotating 90 degrees about  $Z$  axis.



$$\mathbf{q}_1 = \cos \frac{\pi/2}{2} + j \sin \frac{\pi/2}{2}$$

$$\mathbf{q}_2 = \cos \frac{\pi/2}{2} + k \sin \frac{\pi/2}{2}$$

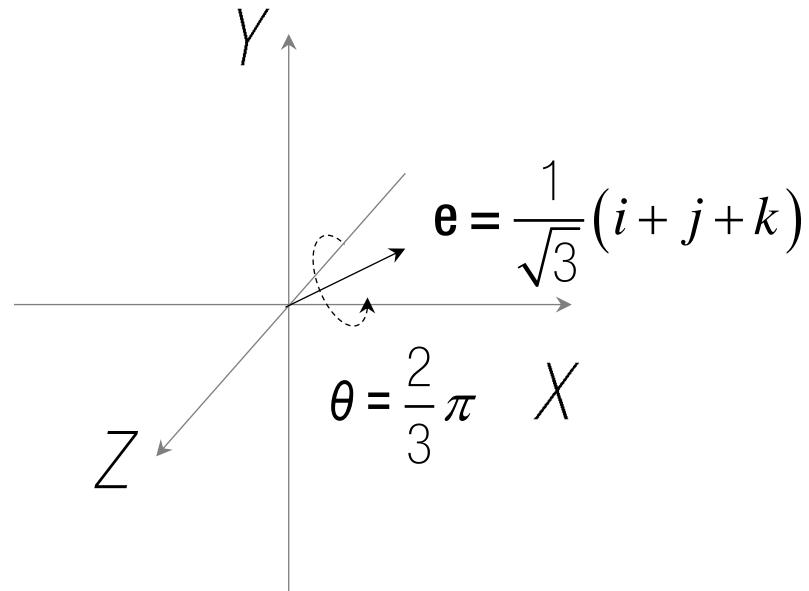
$$\mathbf{q}_{12} = \mathbf{q}_1 \mathbf{q}_2 \quad ?$$

# Quaternion Product Example

$$\mathbf{q}\mathbf{p} = \left( q_w p_w - \hat{\mathbf{q}} \cdot \hat{\mathbf{p}} \right) + \left( q_w \hat{\mathbf{p}} + p_w \hat{\mathbf{q}} + \hat{\mathbf{q}} \times \hat{\mathbf{p}} \right)$$

$$\mathbf{q}_1 = \cos \frac{\pi/2}{2} + j \sin \frac{\pi/2}{2} \quad \mathbf{q}_2 = \cos \frac{\pi/2}{2} + k \sin \frac{\pi/2}{2}$$

# Quaternion Product Example



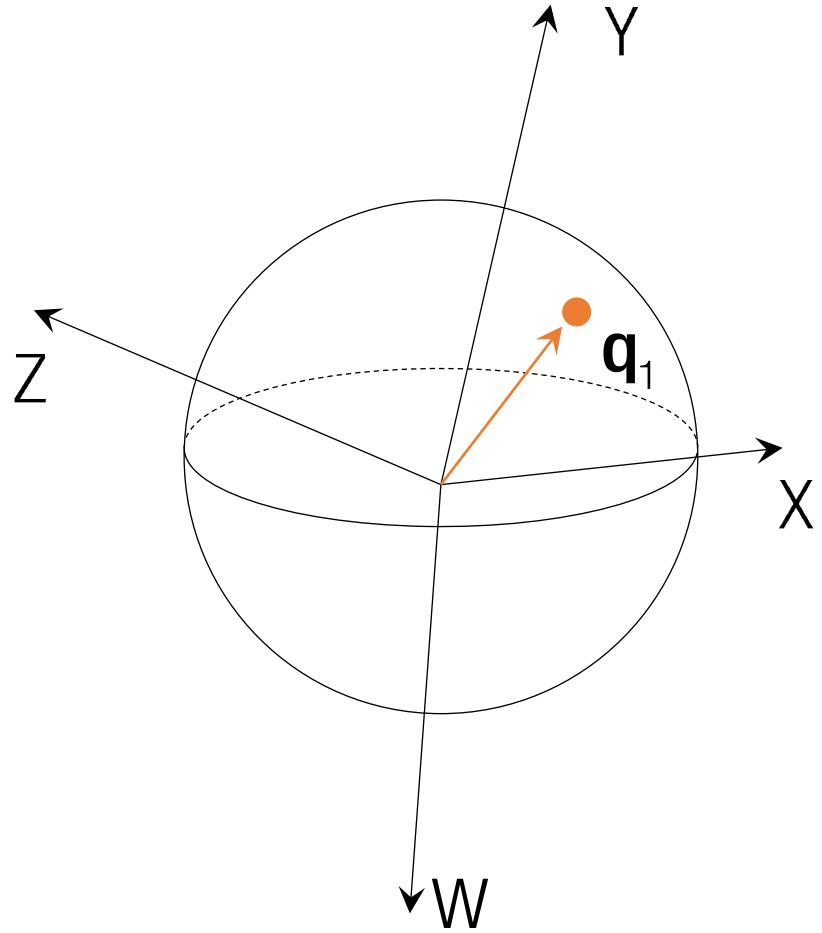
$$\mathbf{q}\mathbf{p} = (q_w p_w - \hat{\mathbf{q}} \cdot \hat{\mathbf{p}}) + (q_w \hat{\mathbf{p}} + p_w \hat{\mathbf{q}} + \hat{\mathbf{q}} \times \hat{\mathbf{p}})$$

$$\mathbf{q}_1 = \cos \frac{\pi/2}{2} + j \sin \frac{\pi/2}{2}$$

$$\mathbf{q}_2 = \cos \frac{\pi/2}{2} + k \sin \frac{\pi/2}{2}$$

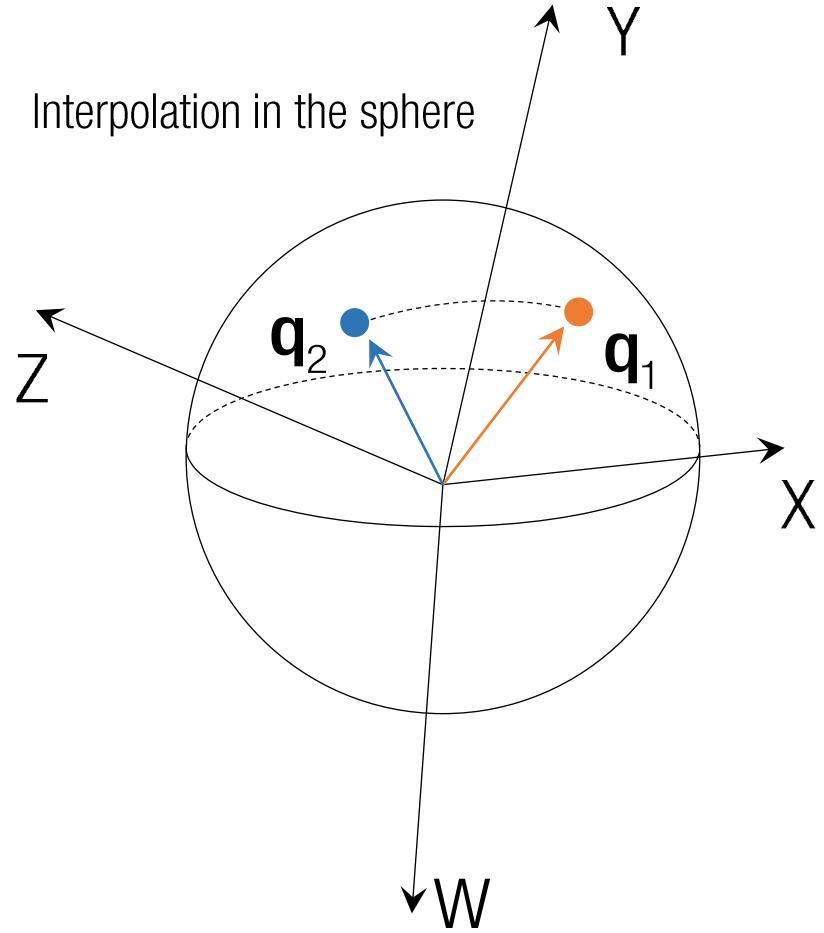
$$\begin{aligned}\mathbf{q}_{12} &= \mathbf{q}_1 \mathbf{q}_2 \\ &= \left( \frac{\sqrt{2}}{2} + i \frac{\sqrt{2}}{2} \right) \left( \frac{\sqrt{2}}{2} + j \frac{\sqrt{2}}{2} \right) \\ &= \frac{1}{2} + \frac{1}{2} \mathbf{i} + \frac{1}{2} \mathbf{j} + \frac{1}{2} \mathbf{k} \\ &= \frac{1}{2} + \frac{1}{2} \mathbf{i} + \frac{1}{2} \mathbf{j} + \frac{1}{2} \mathbf{k} \\ &= \frac{1}{2} + \frac{\sqrt{3}}{2} \left( \frac{1}{\sqrt{3}} \mathbf{i} + \frac{1}{\sqrt{3}} \mathbf{j} + \frac{1}{\sqrt{3}} \mathbf{k} \right)\end{aligned}$$

# Quaternion in 4D Sphere



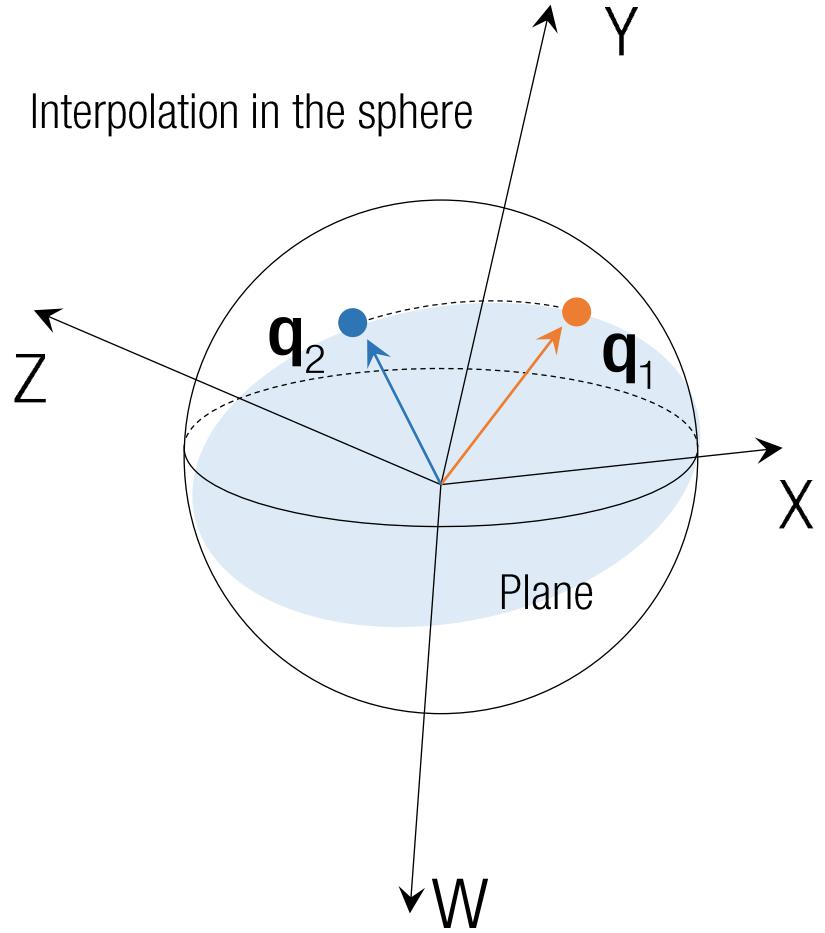
$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix} \quad q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$

# Quaternion in 4D Sphere



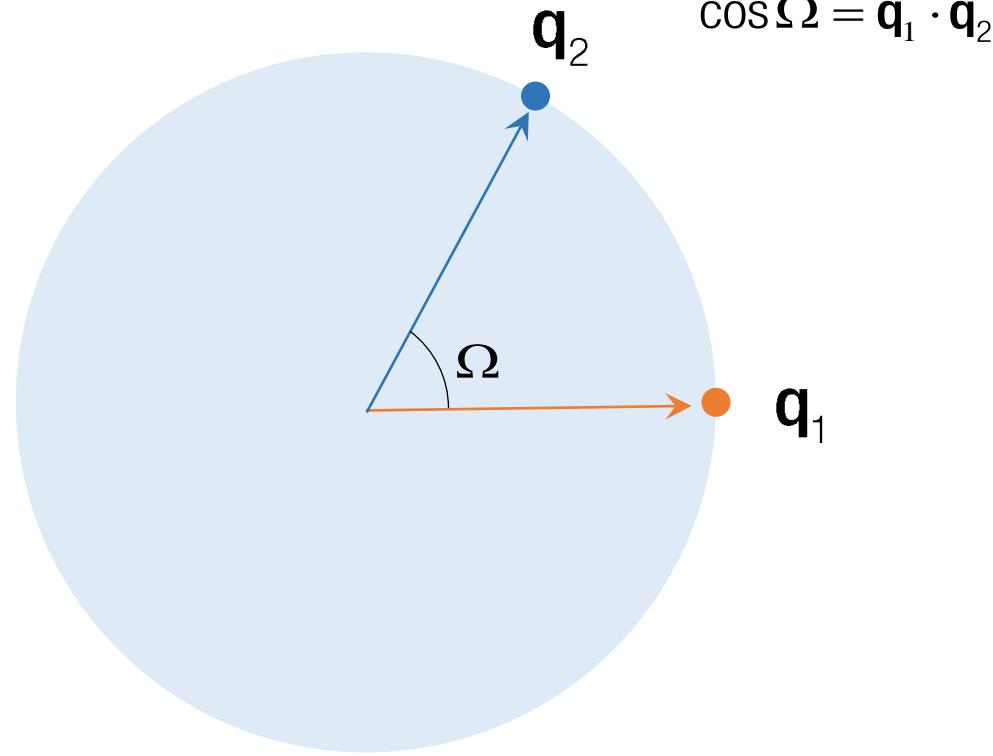
$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix}$$
$$q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$

# Quaternion in 4D Sphere



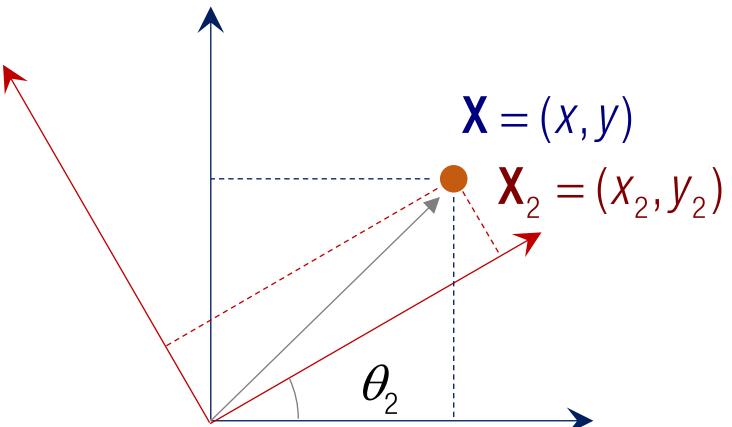
$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix}$$

$$q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$



# Recall: Interpolation of Rotation

2D coordinate transform:

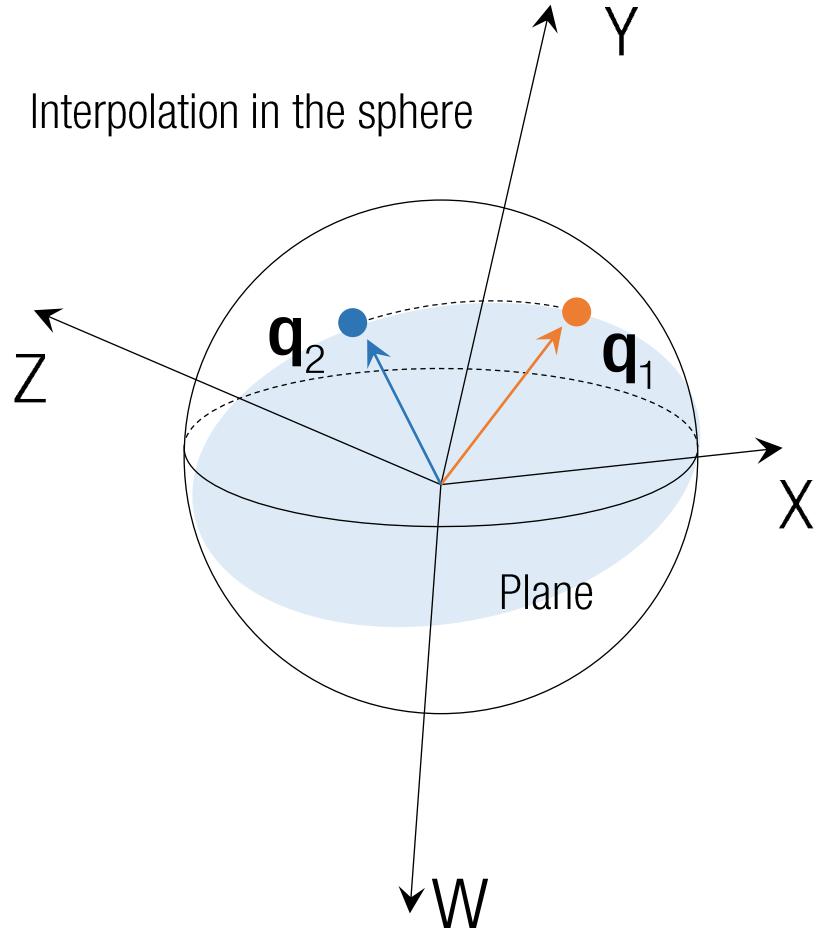


$$\begin{bmatrix} x_1 \\ y_1 \end{bmatrix} = \begin{bmatrix} \cos \theta_1 & \sin \theta_1 \\ -\sin \theta_1 & \cos \theta_1 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

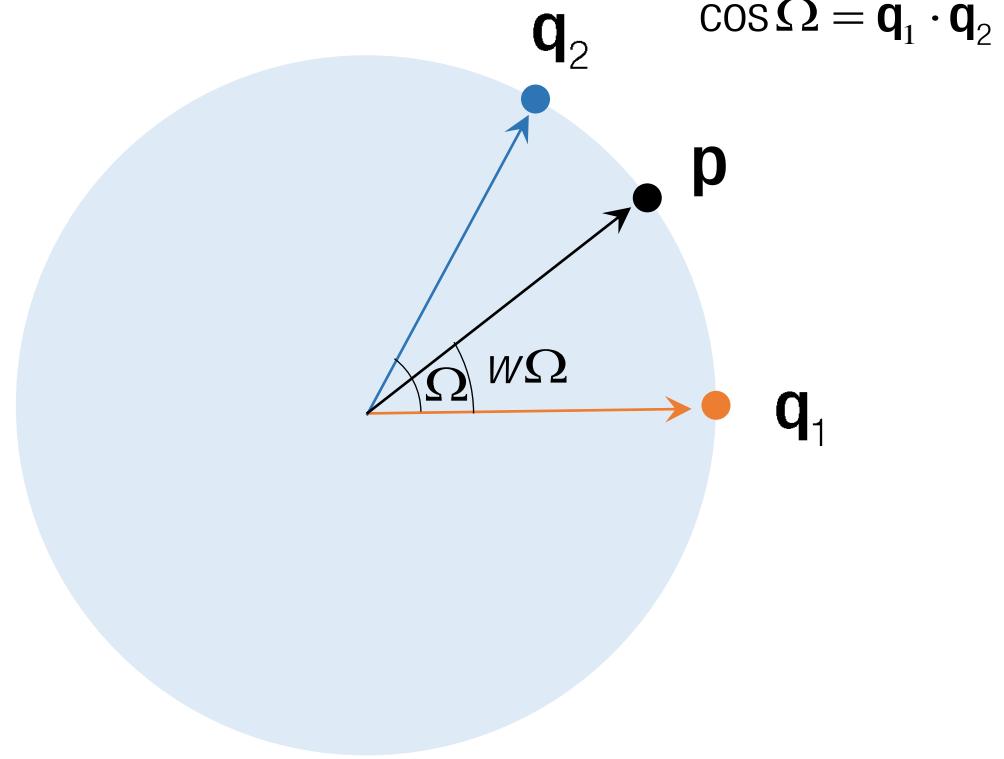
$$\theta = w\theta_1 + (1-w)\theta_2$$
$$w \in [0, 1]$$

$$\begin{bmatrix} x_2 \\ y_2 \end{bmatrix} = \begin{bmatrix} \cos \theta_2 & \sin \theta_2 \\ -\sin \theta_2 & \cos \theta_2 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

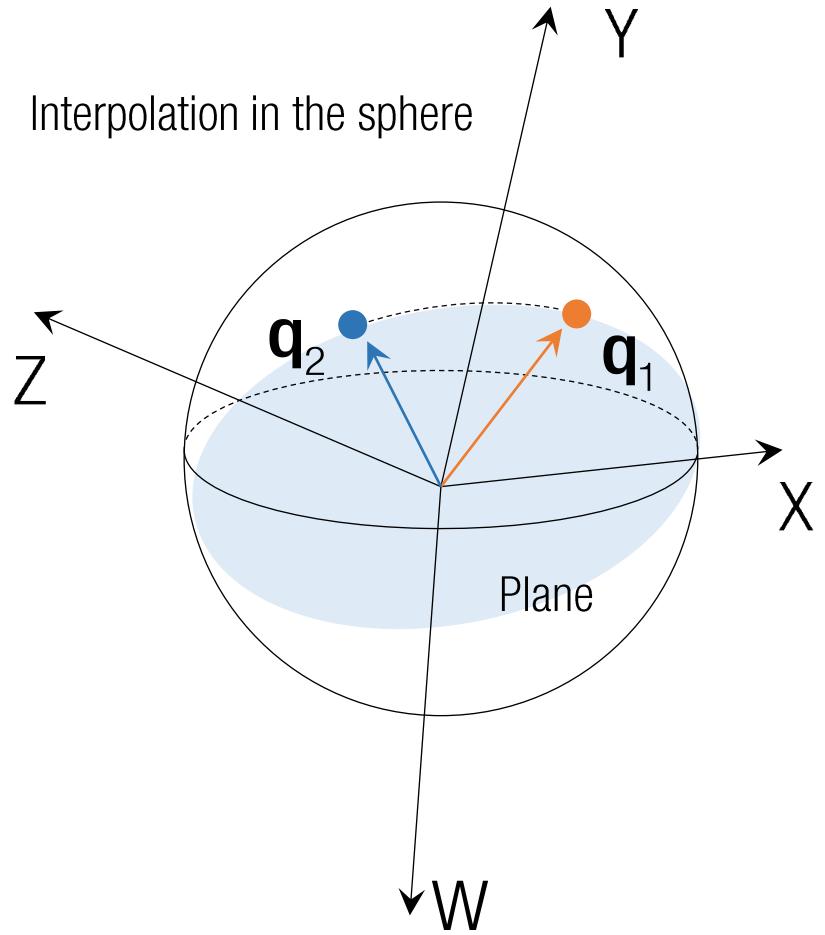
# Quaternion Interpolation



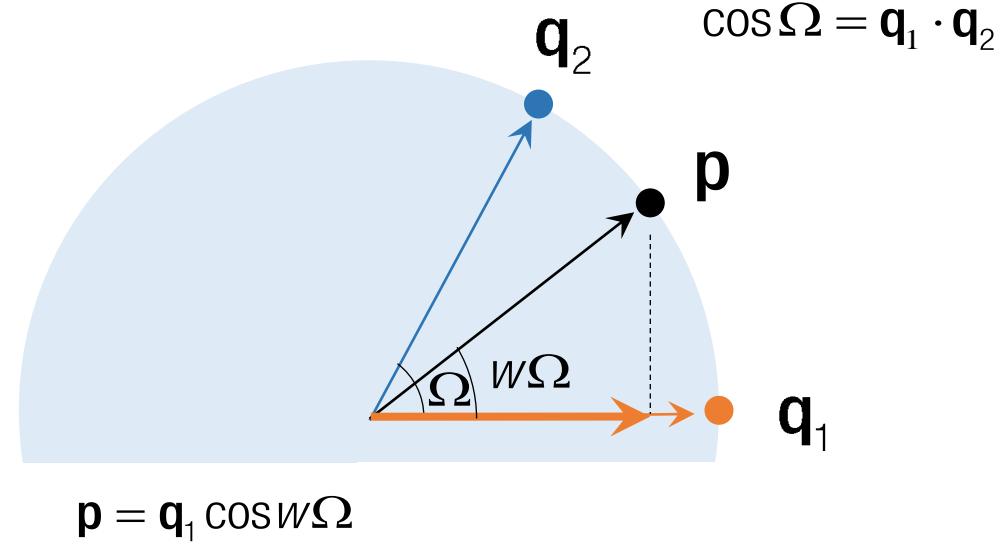
$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix}$$
$$q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$



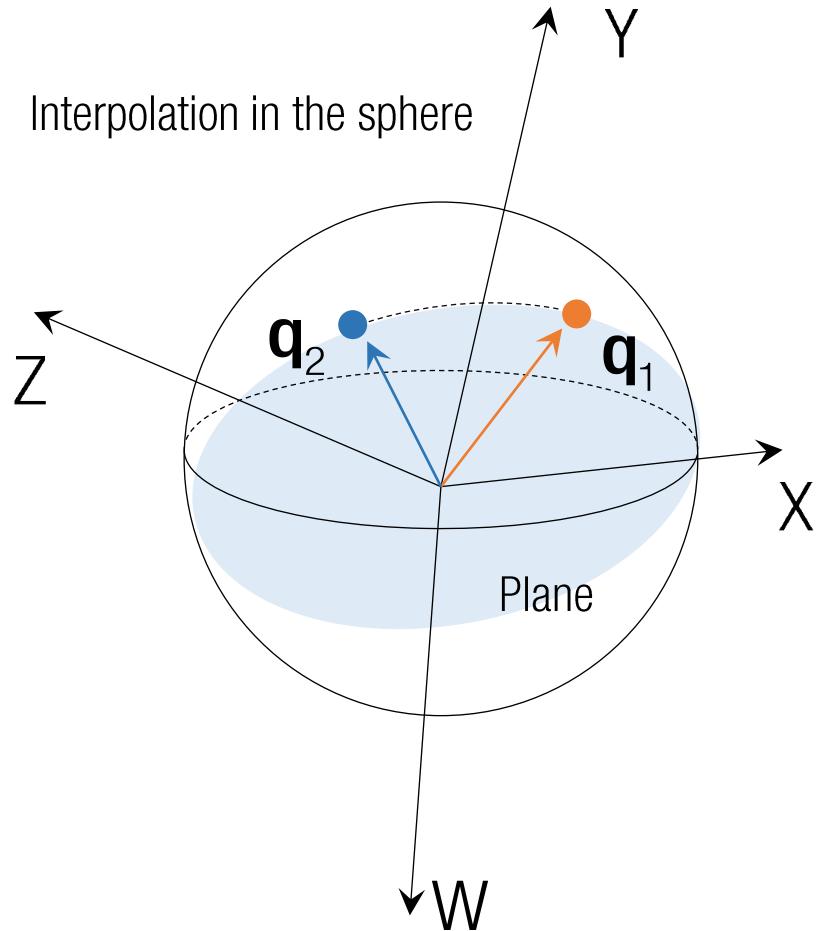
# Quaternion Interpolation



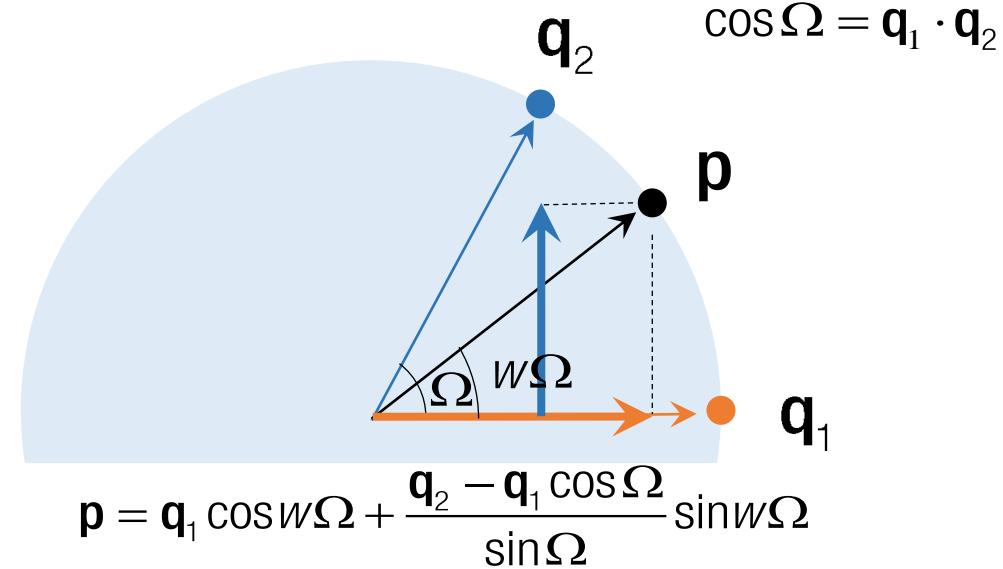
$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix}$$
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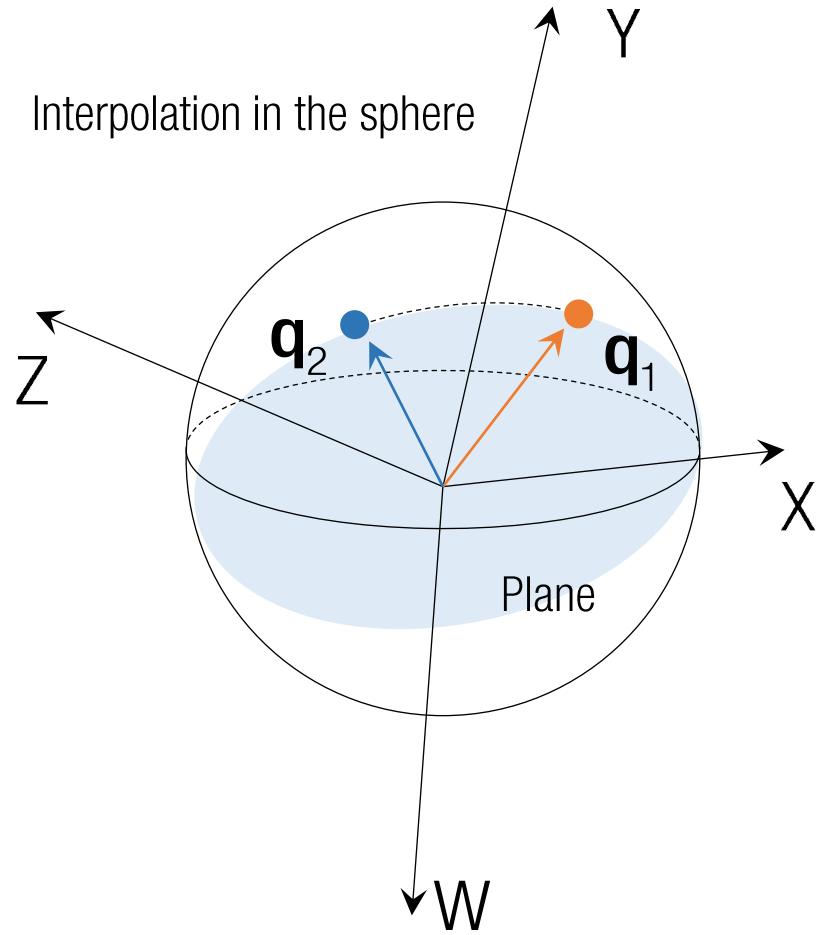
# Quaternion Interpolation



$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix} \quad q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$



# Quaternion Interpolation

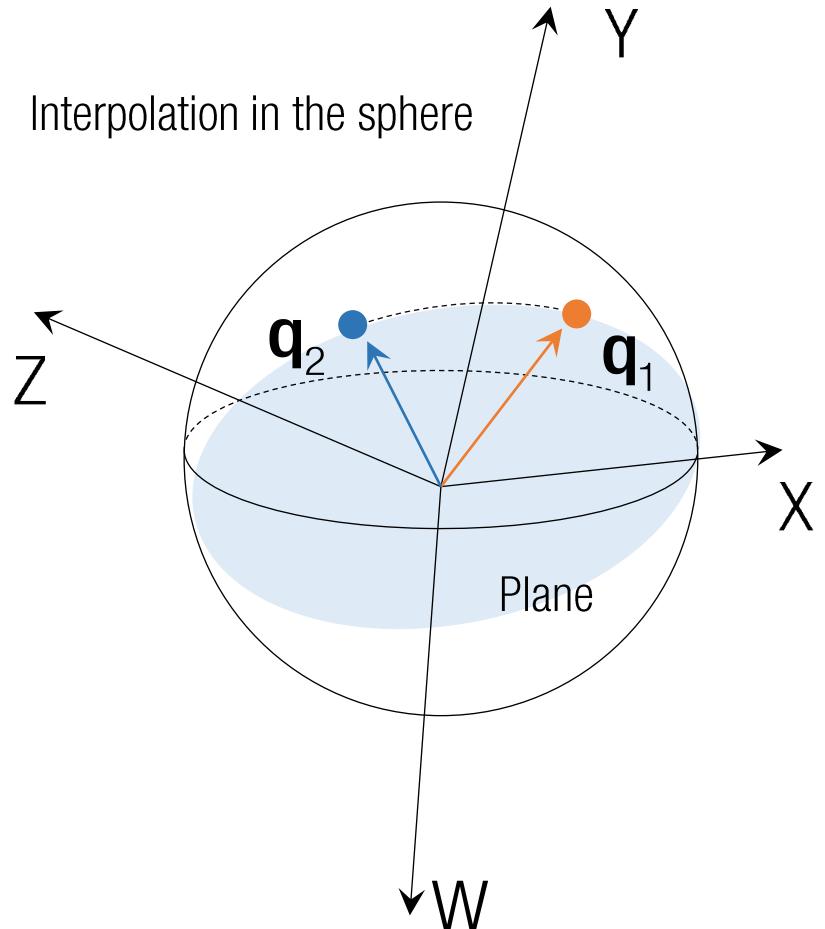


$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix} \quad q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$

The diagram shows a 2D projection of the sphere's surface onto a plane. Two points  $\mathbf{q}_1$  (orange) and  $\mathbf{q}_2$  (blue) are shown on the sphere. A point  $\mathbf{p}$  (black dot) is also on the sphere. The angle between the vectors from the origin to  $\mathbf{q}_1$  and  $\mathbf{q}_2$  is labeled  $\Omega$ . The angle between the vector from the origin to  $\mathbf{p}$  and the vector from the origin to  $\mathbf{q}_1$  is labeled  $w\Omega$ .

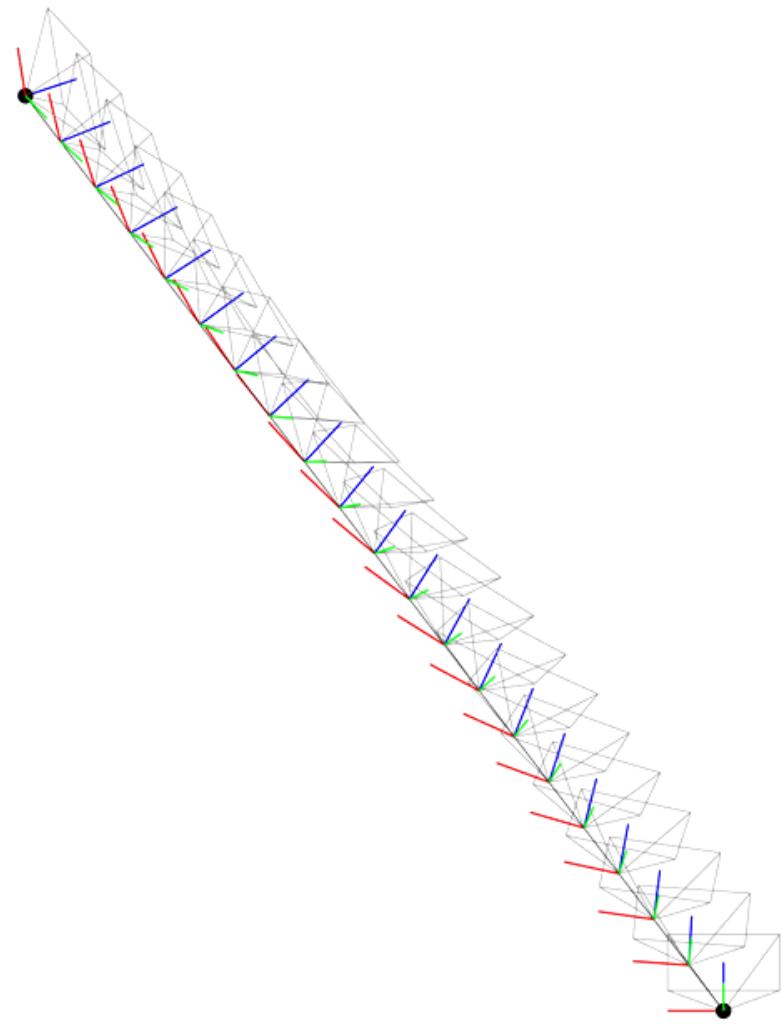
$$\mathbf{p} = \mathbf{q}_1 \cos w\Omega + \frac{\mathbf{q}_2 - \mathbf{q}_1 \cos \Omega}{\sin \Omega} \sin w\Omega$$
$$= \frac{\mathbf{q}_1 (\sin \Omega \cos w\Omega - \cos \Omega \sin w\Omega) + \mathbf{q}_2 \sin w\Omega}{\sin \Omega}$$
$$\cos \Omega = \mathbf{q}_1 \cdot \mathbf{q}_2$$

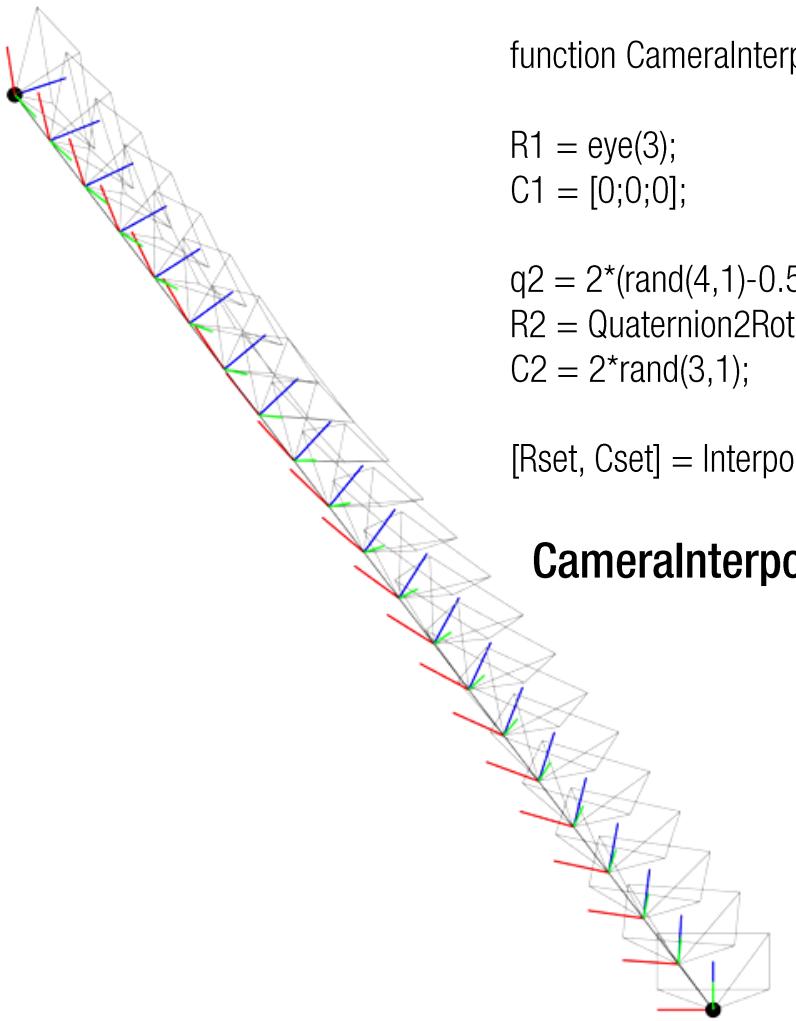
# Quaternion Interpolation



$$\mathbf{q} = q_W + iq_X + jq_Y + kq_Z = \begin{bmatrix} q_W \\ q_X \\ q_Y \\ q_Z \end{bmatrix} \quad q_W^2 + q_X^2 + q_Y^2 + q_Z^2 = 1$$

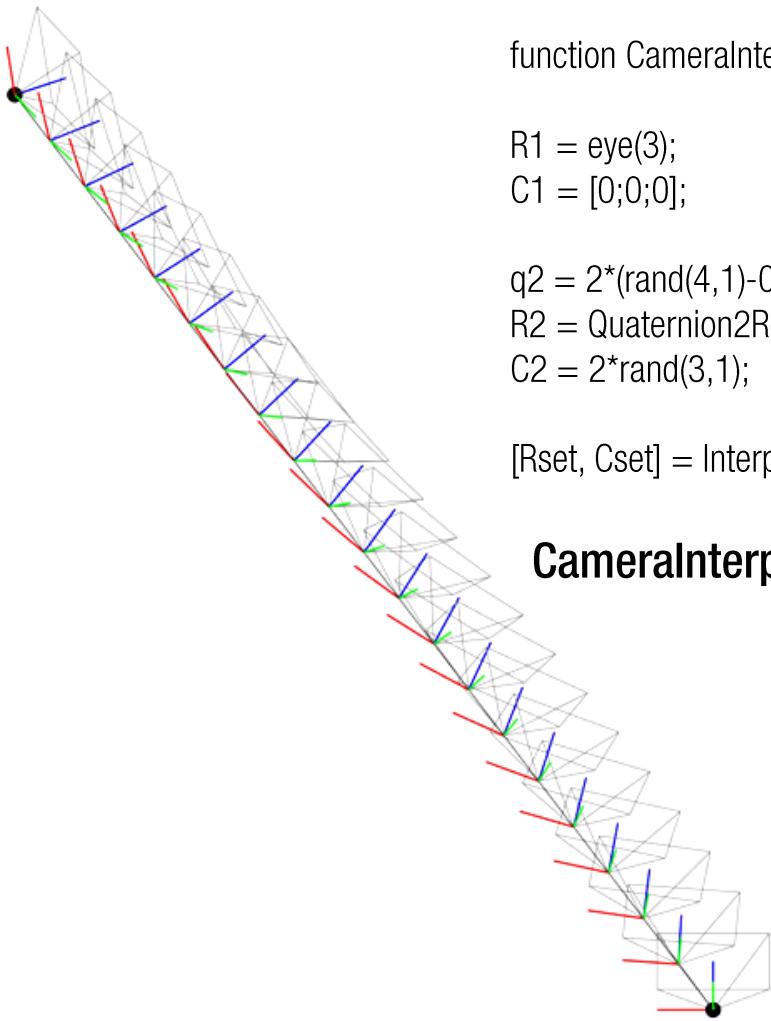
$$\begin{aligned} \cos \Omega &= \mathbf{q}_1 \cdot \mathbf{q}_2 \\ \mathbf{p} &= \mathbf{q}_1 \cos w\Omega + \frac{\mathbf{q}_2 - \mathbf{q}_1 \cos \Omega}{\sin \Omega} \sin w\Omega \\ &= \frac{\mathbf{q}_1 (\sin \Omega \cos w\Omega - \cos \Omega \sin w\Omega) + \mathbf{q}_2 \sin w\Omega}{\sin \Omega} \\ &= \frac{\mathbf{q}_1 \sin(1-w)\Omega + \mathbf{q}_2 \sin w\Omega}{\sin \Omega} \end{aligned}$$





```
function CameralInterpolation  
R1 = eye(3);  
C1 = [0;0;0];  
  
q2 = 2*(rand(4,1)-0.5);  
R2 = Quaternion2Rotation(q2);  
C2 = 2*rand(3,1);  
  
[Rset, Cset] = InterpolateCoordinate(R1, C1, R2, C2, 20);
```

## **CameralInterpolation.m**



```
function CameralInterpolation
```

```
R1 = eye(3);  
C1 = [0;0;0];
```

```
q2 = 2*(rand(4,1)-0.5);  
R2 = Quaternion2Rotation(q2);  
C2 = 2*rand(3,1);
```

```
[Rset, Cset] = InterpolateCoordinate(R1, C1, R2, C2, 20);
```

### **CameralInterpolation.m**

```
function [Rset, Cset] = InterpolateCoordinate(R1, C1, R2, C2, n)
```

```
Cx = linspace(C1(1), C2(1), n+1);  
Cy = linspace(C1(2), C2(2), n+1);  
Cz = linspace(C1(3), C2(3), n+1);
```

```
Cset = [Cx; Cy; Cz];
```

```
w = 0 : 1/n : 1;
```

```
q1 = Rotation2Quaternion(R1);  
q2 = Rotation2Quaternion(R2);
```

```
omega = acos(q1'*q2);
```

```
for i = 1 : length(w)
```

```
q = sin(omega*(1-w(i)))/sin(omega) * q1 + sin(omega*w(i))/sin(omega) * q2;
```

```
Rset{i} = Quaternion2Rotation(q);
```

```
end
```

### **InterpolateCoordinate.m**

# View Interpolation



Looking left



Looking right

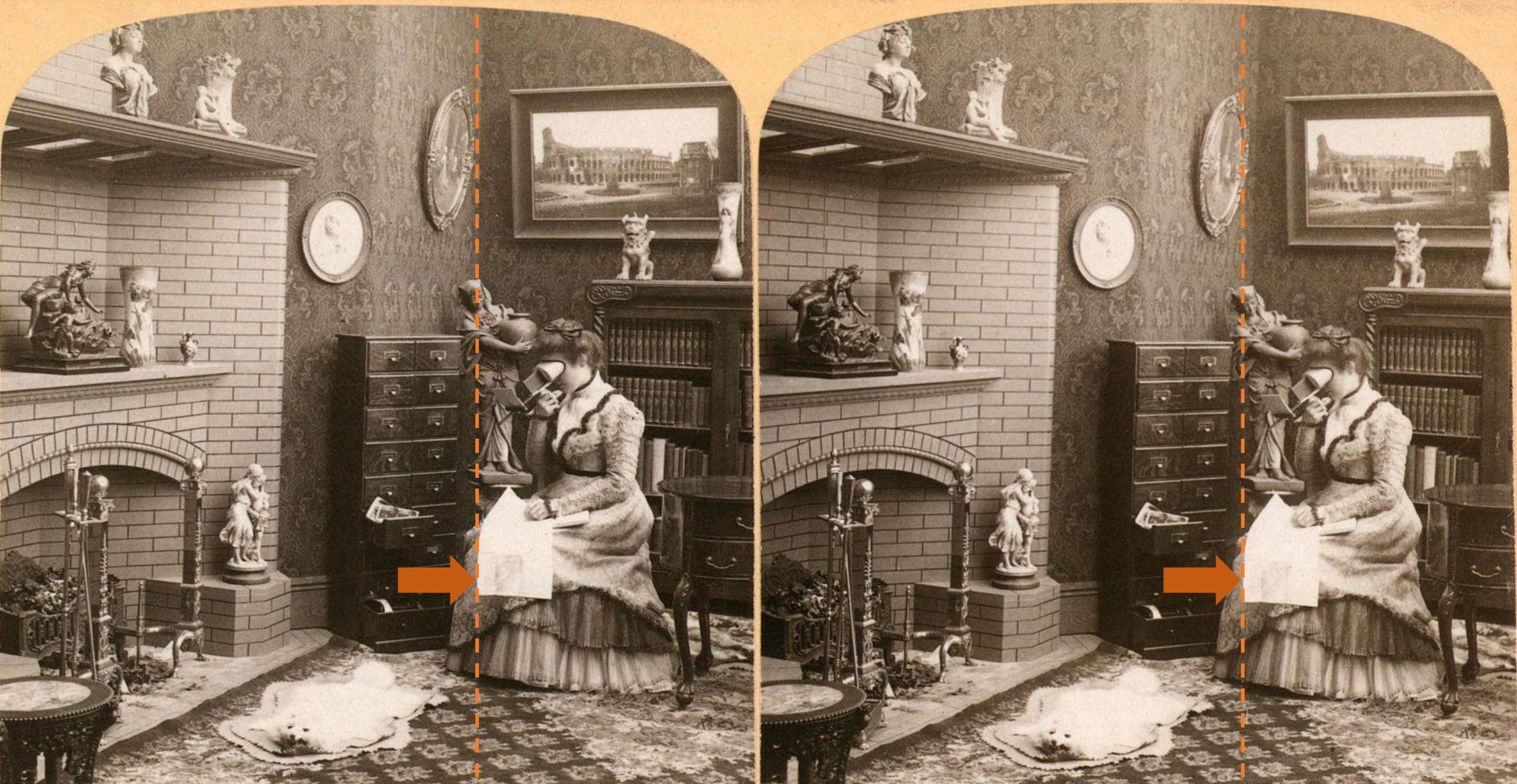




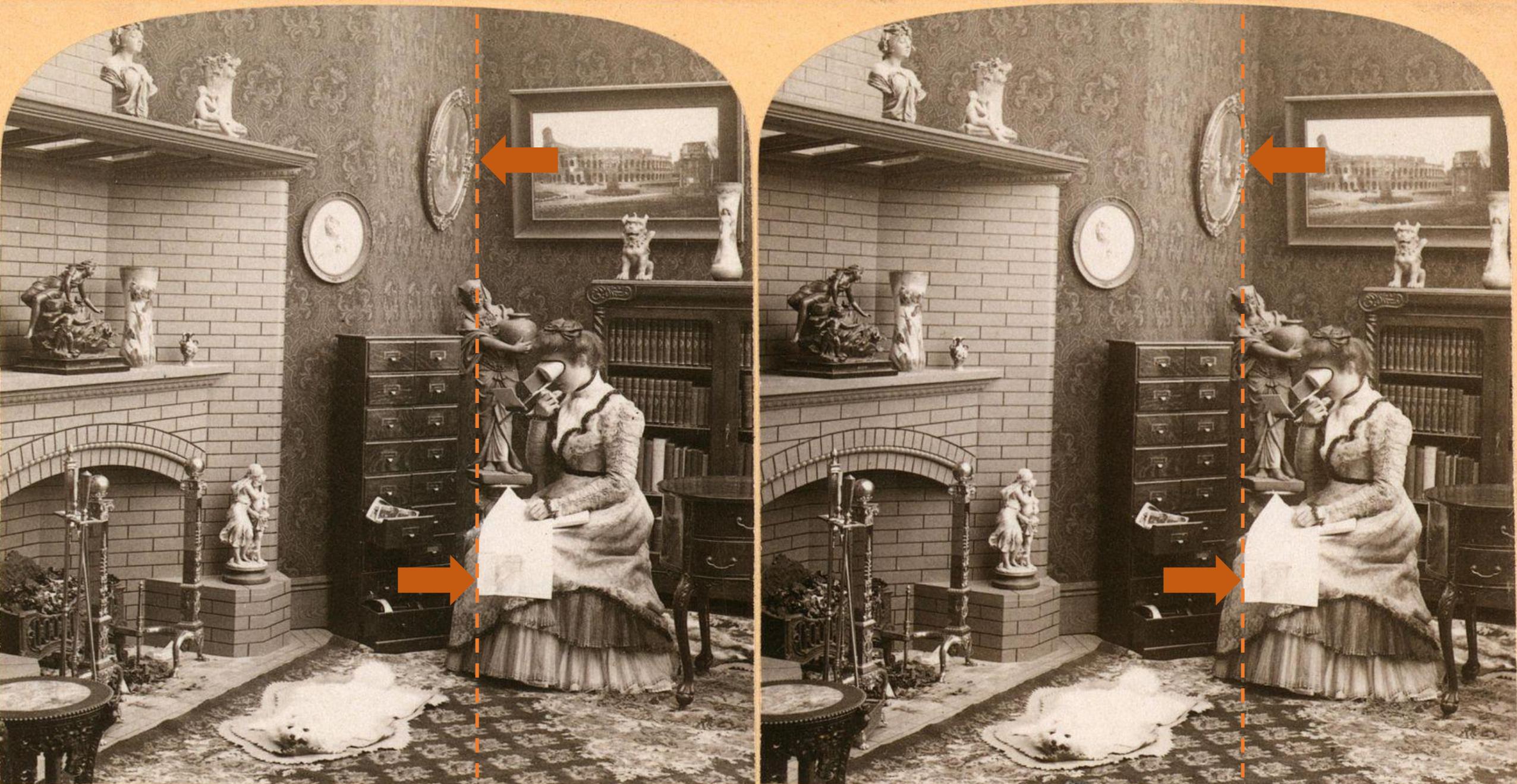
Two View (Epipolar) Geometry



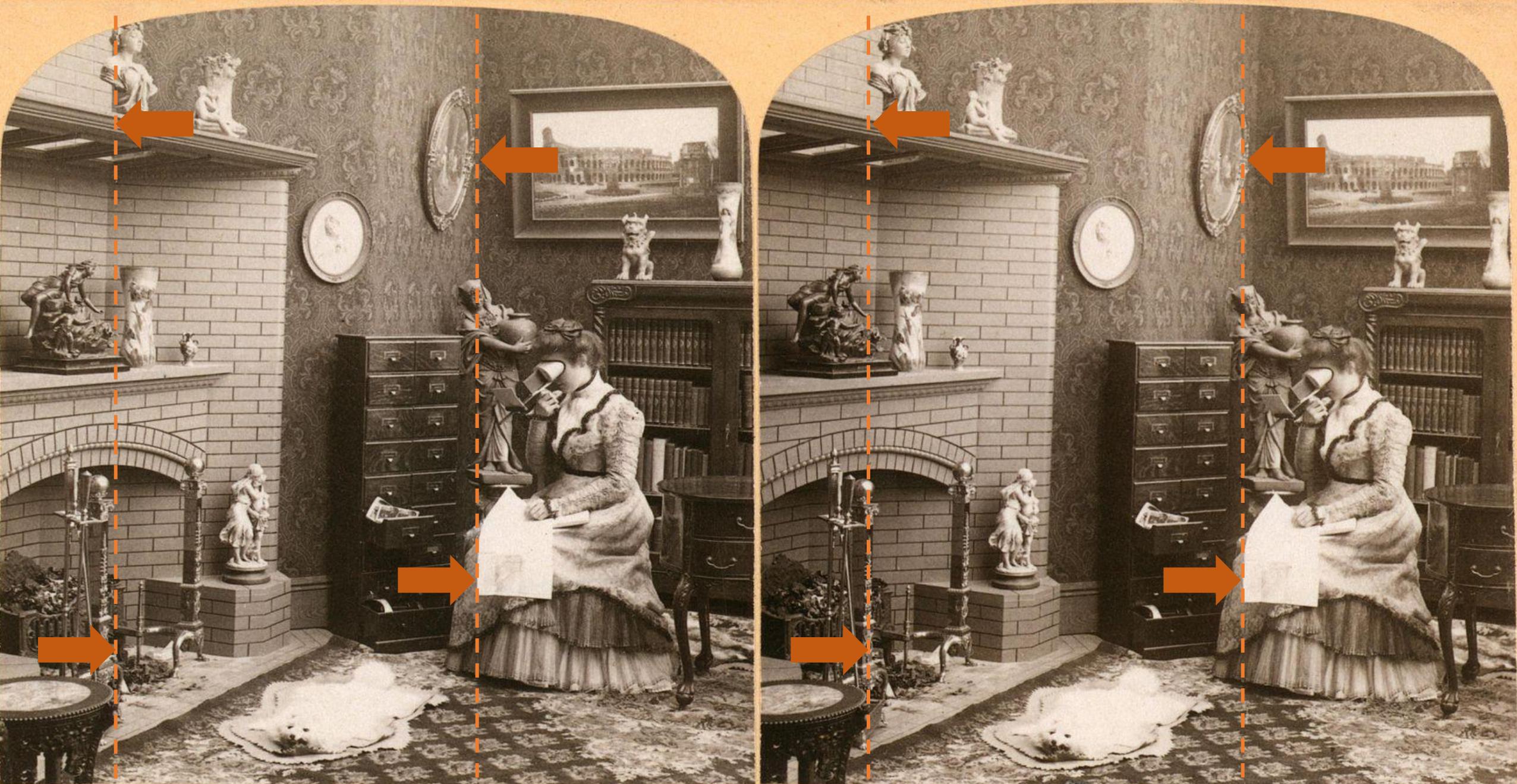
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Circa 1900

# Stereo: Holmes Stereoscope









Left image (Bob)



Right image (Alice)

# 2D Correspondence

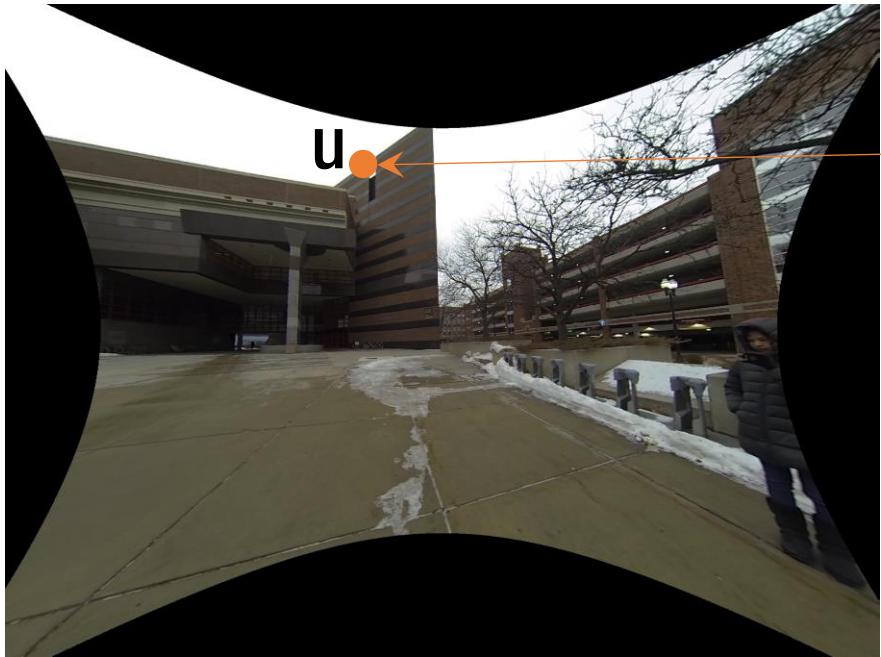


Left image (Bob)



Right image (Alice)

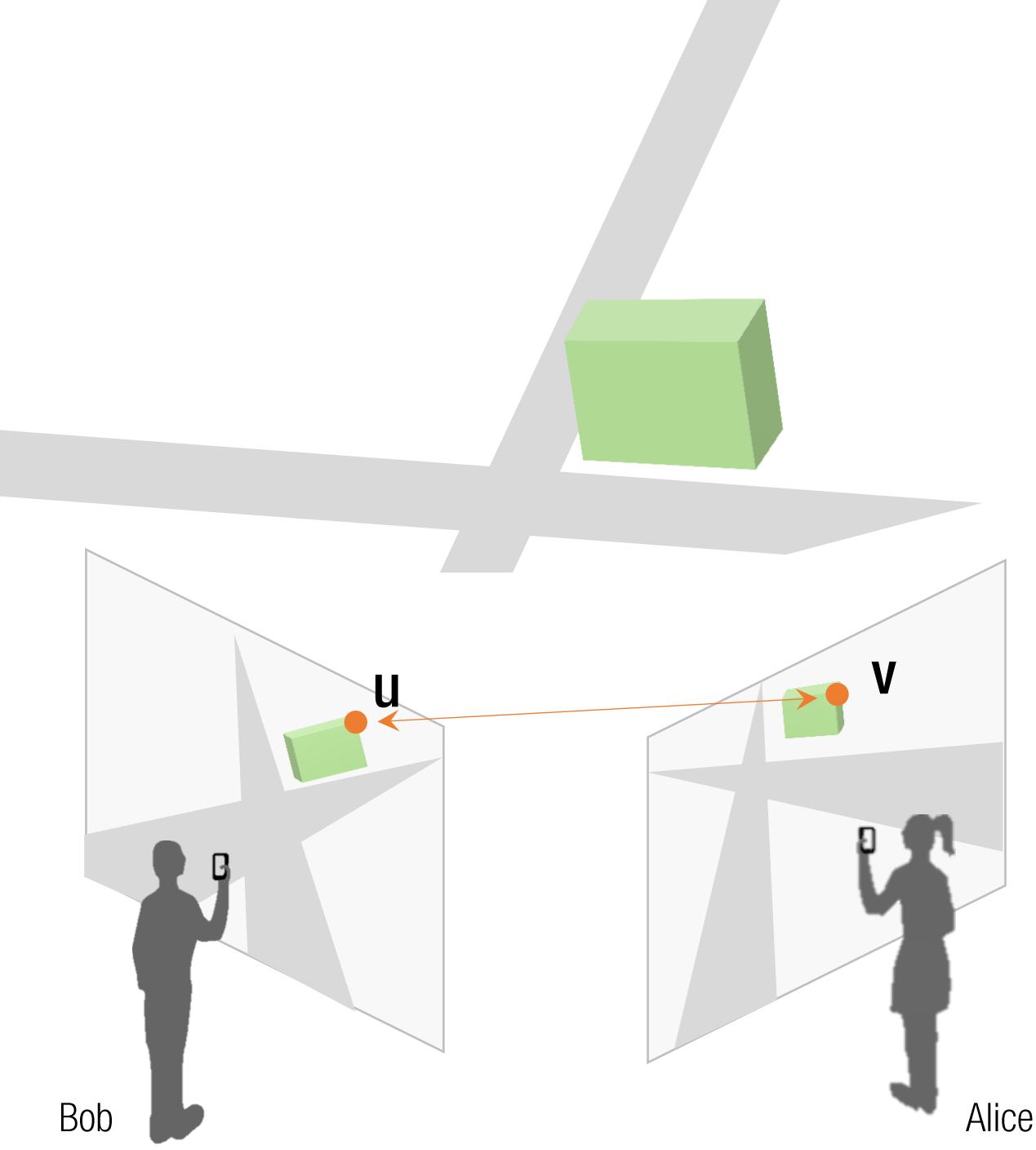
# 2D Correspondence

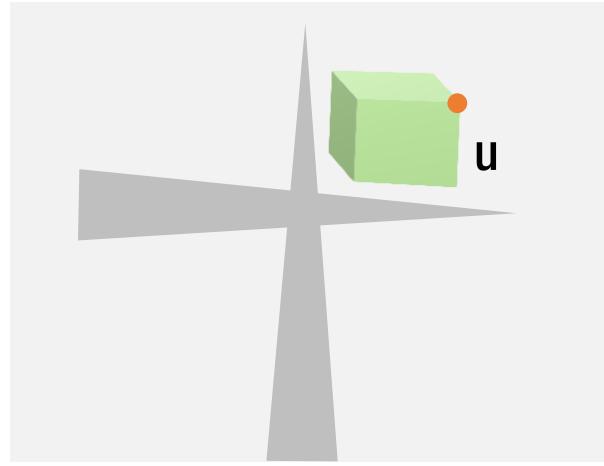
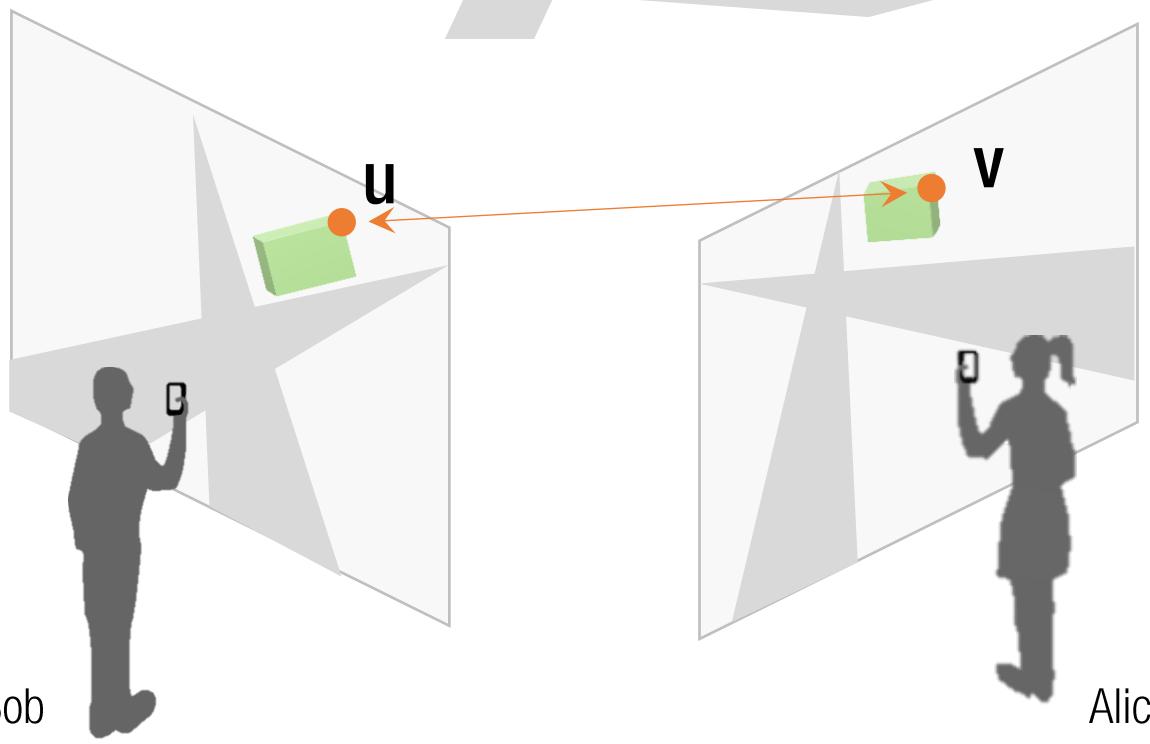
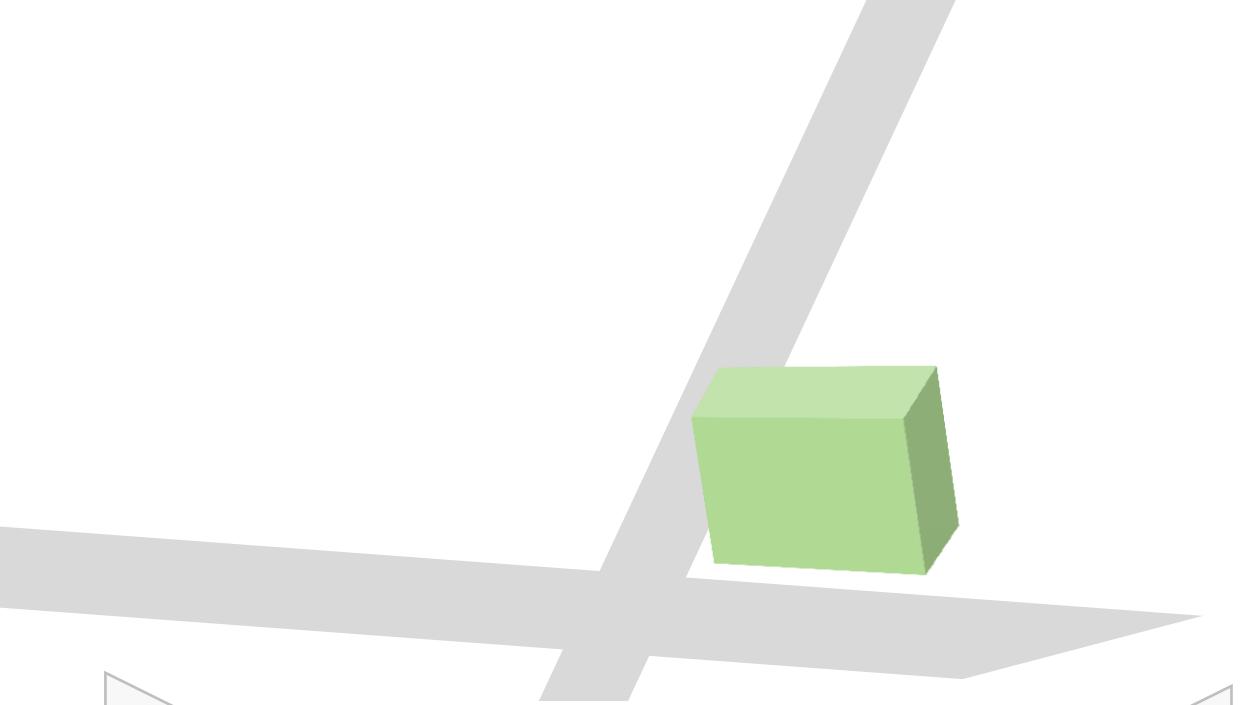


Left image (Bob)

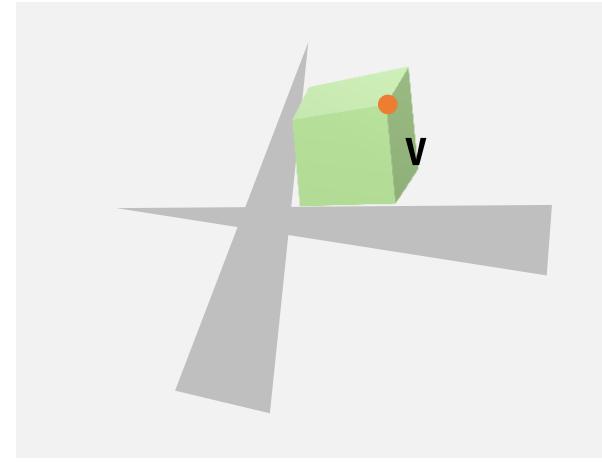


Right image (Alice)

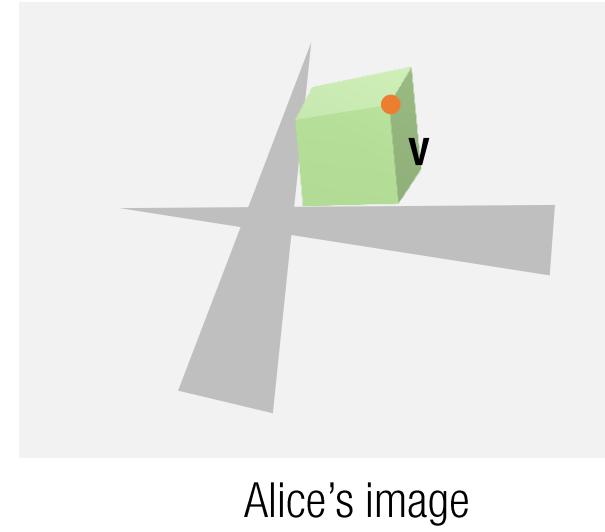
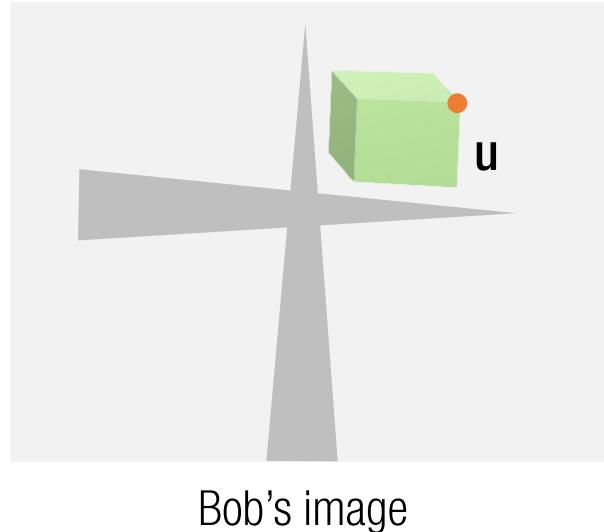
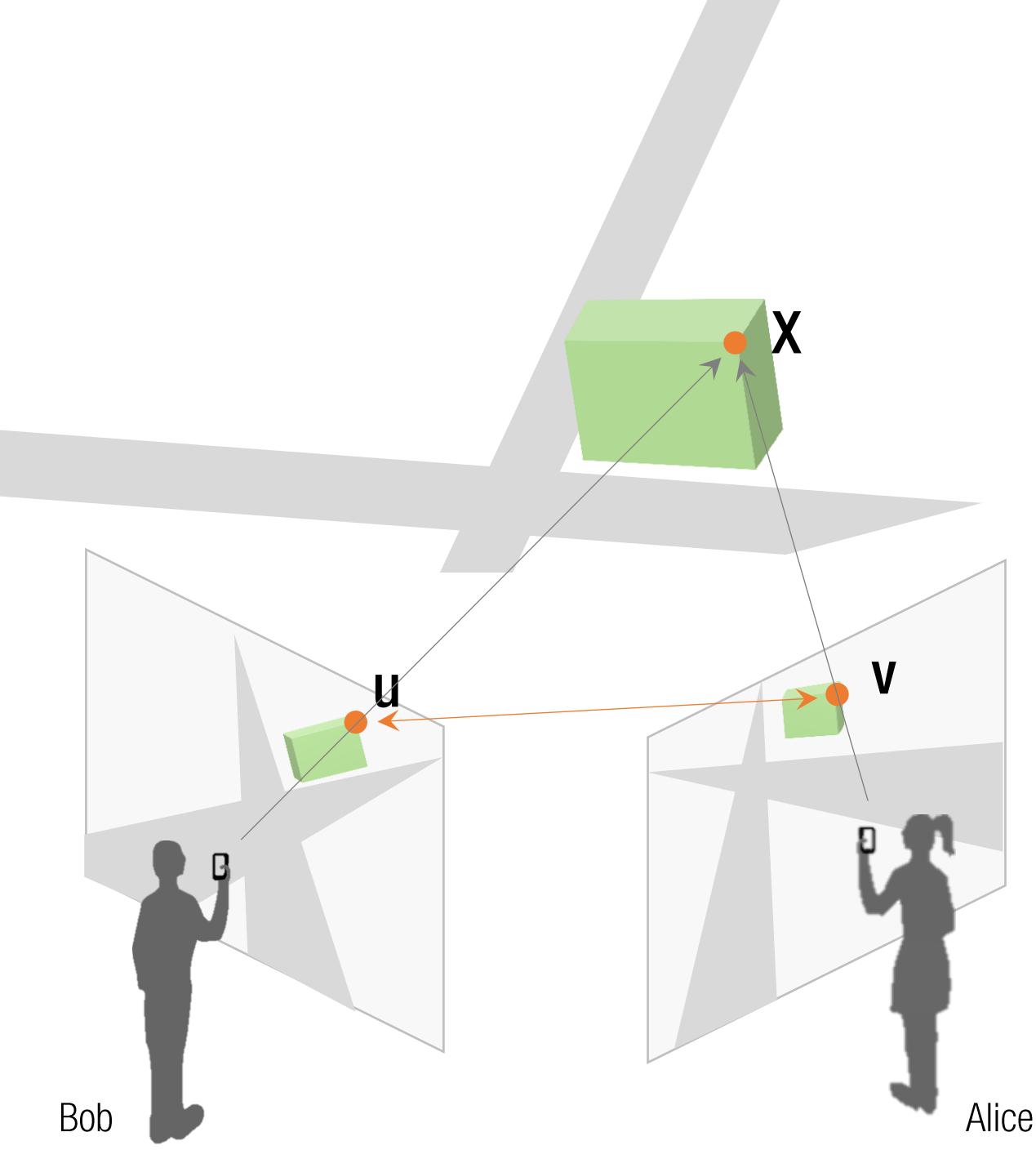


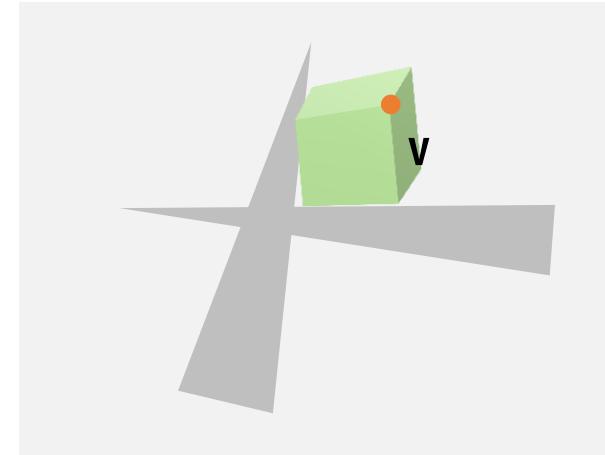
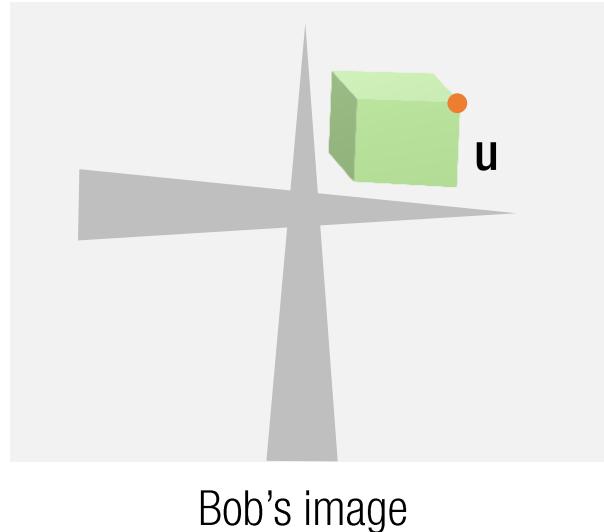
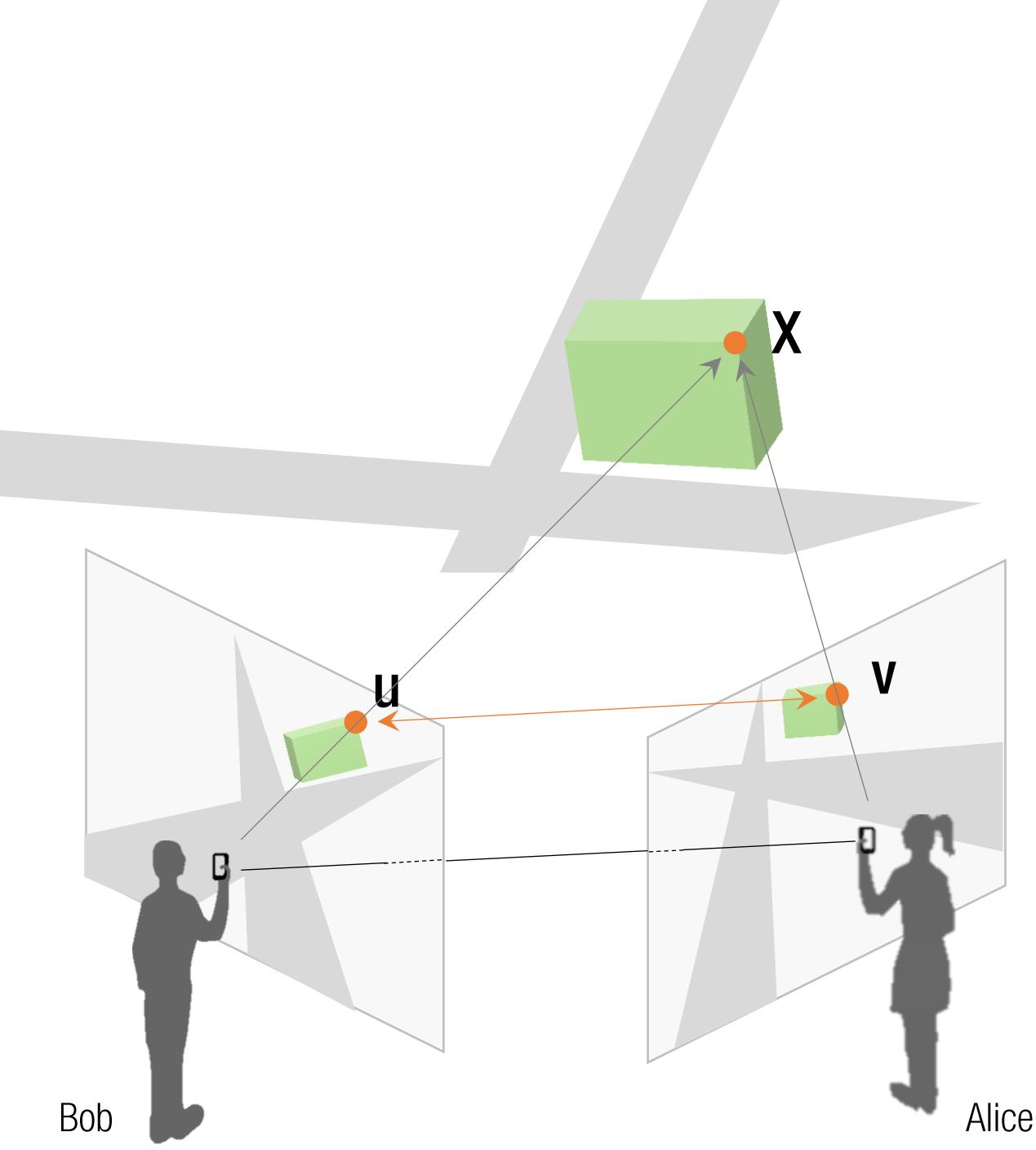


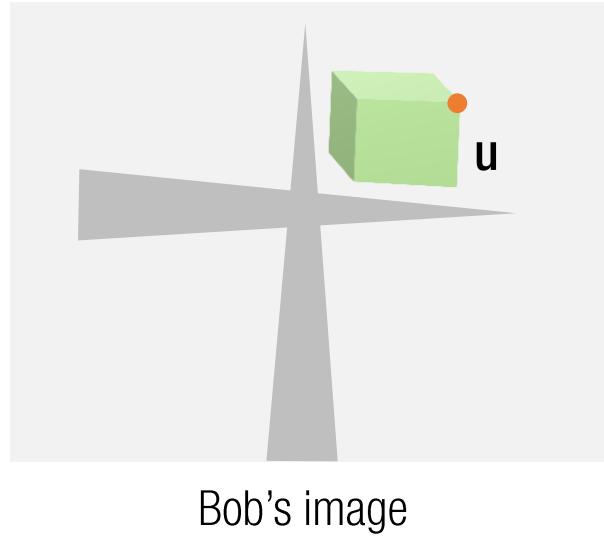
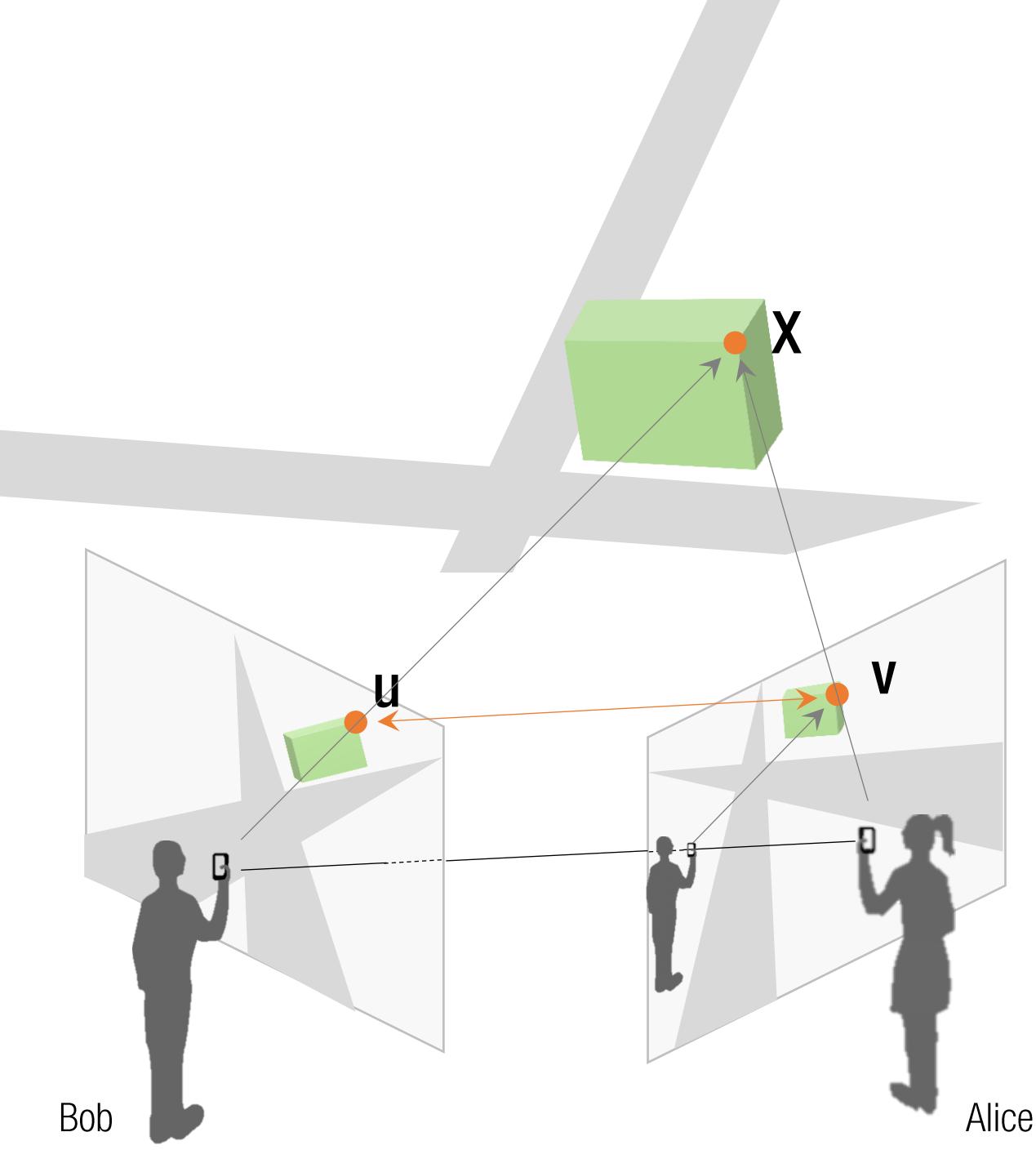
Bob's image



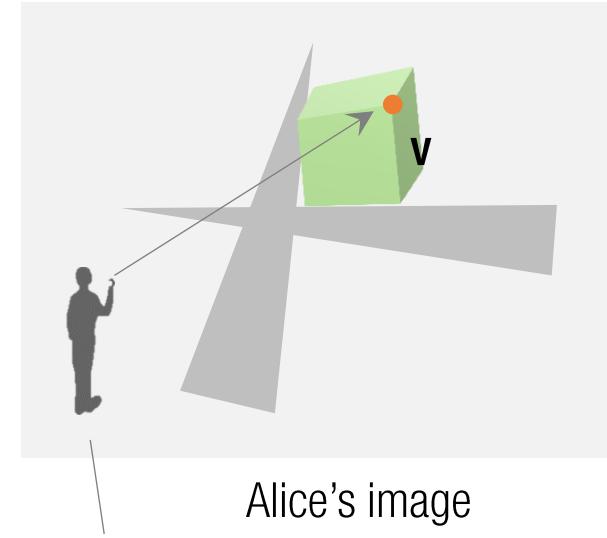
Alice's image





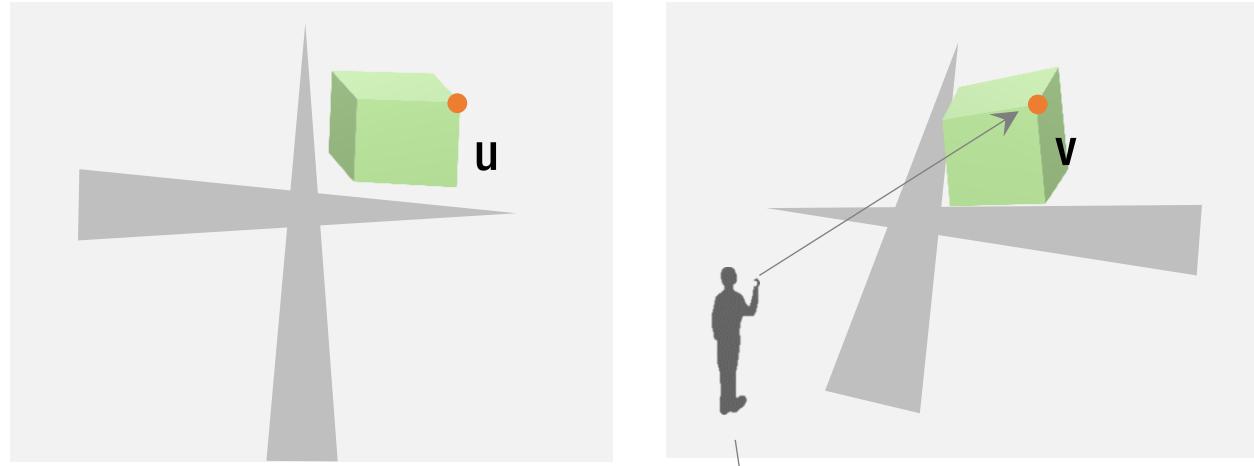
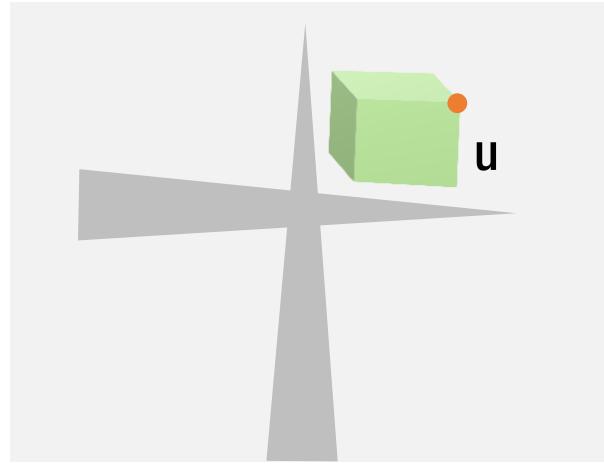
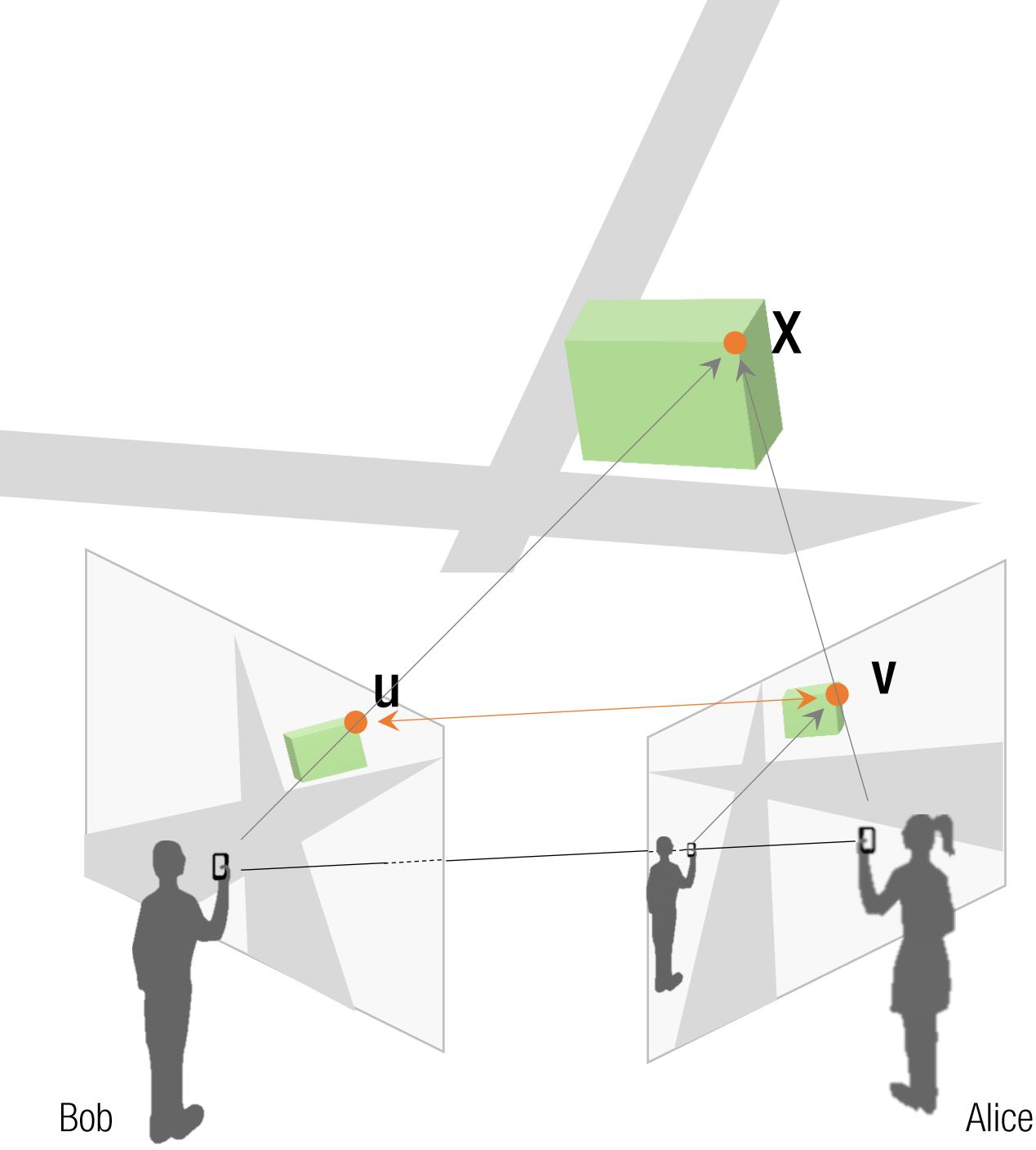


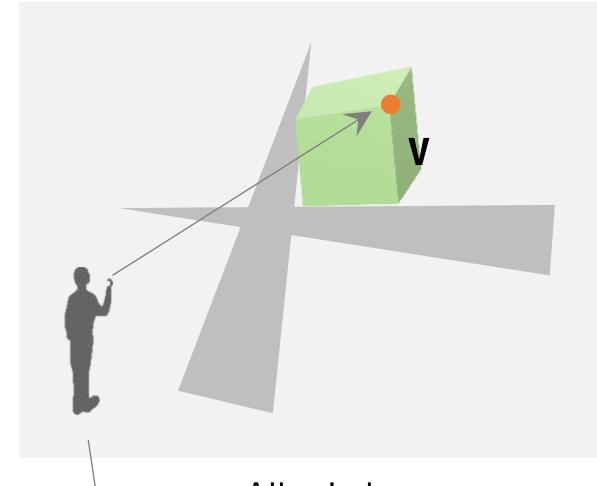
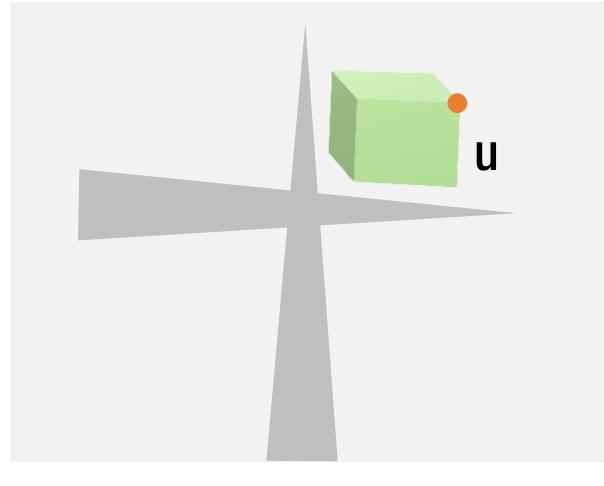
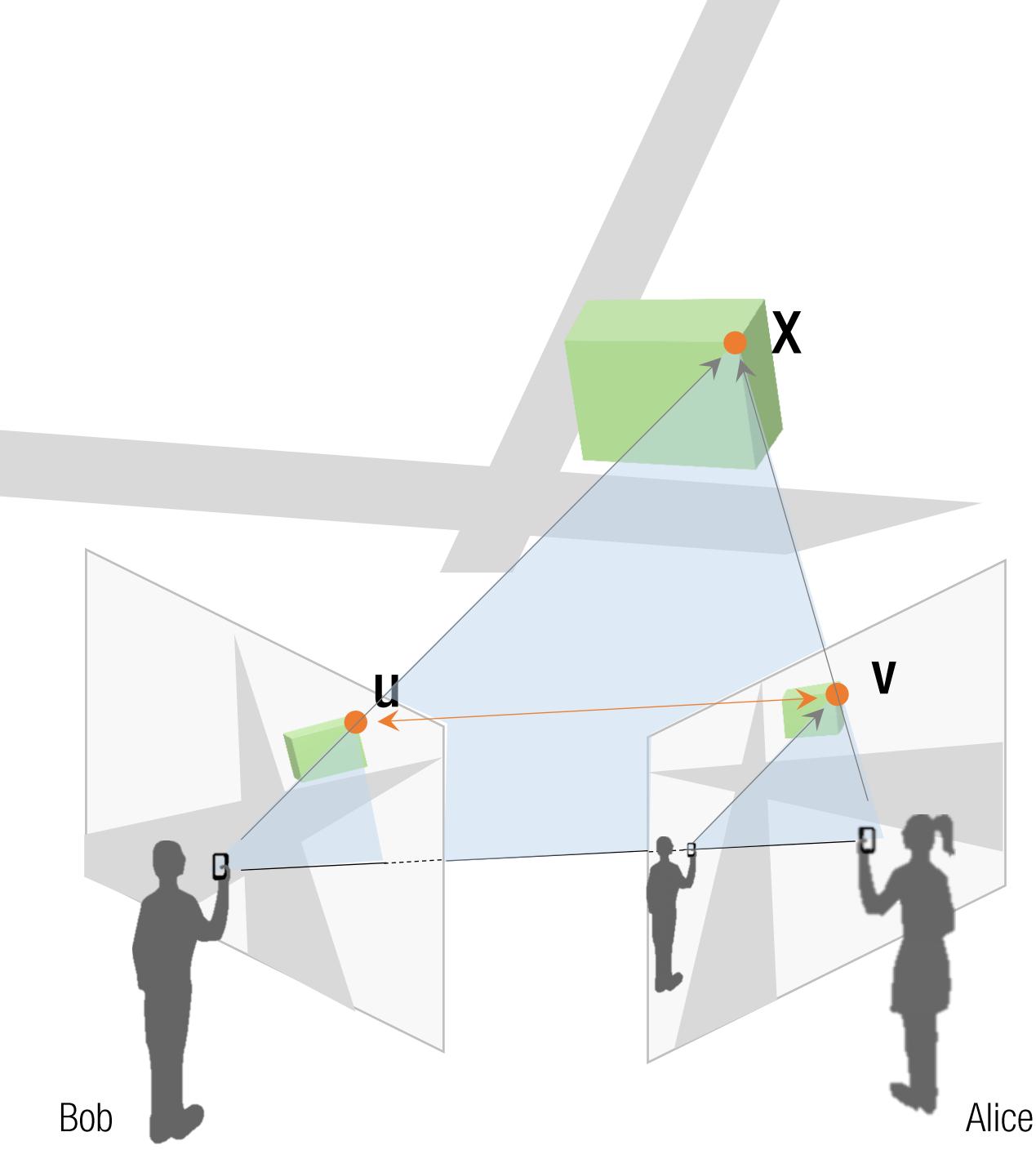
Bob's image

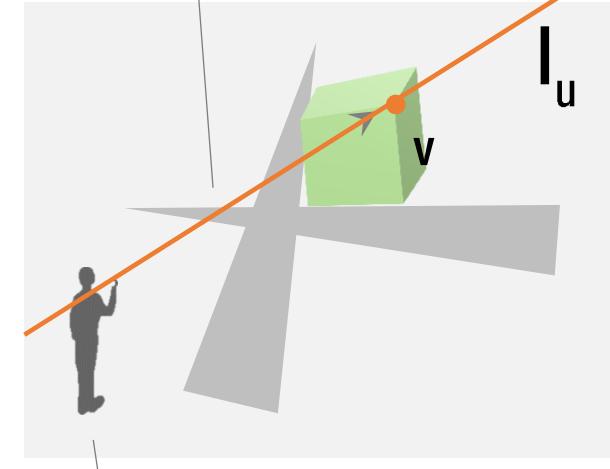
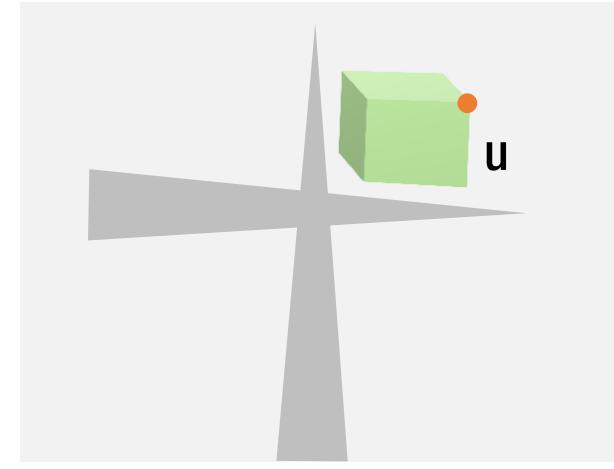
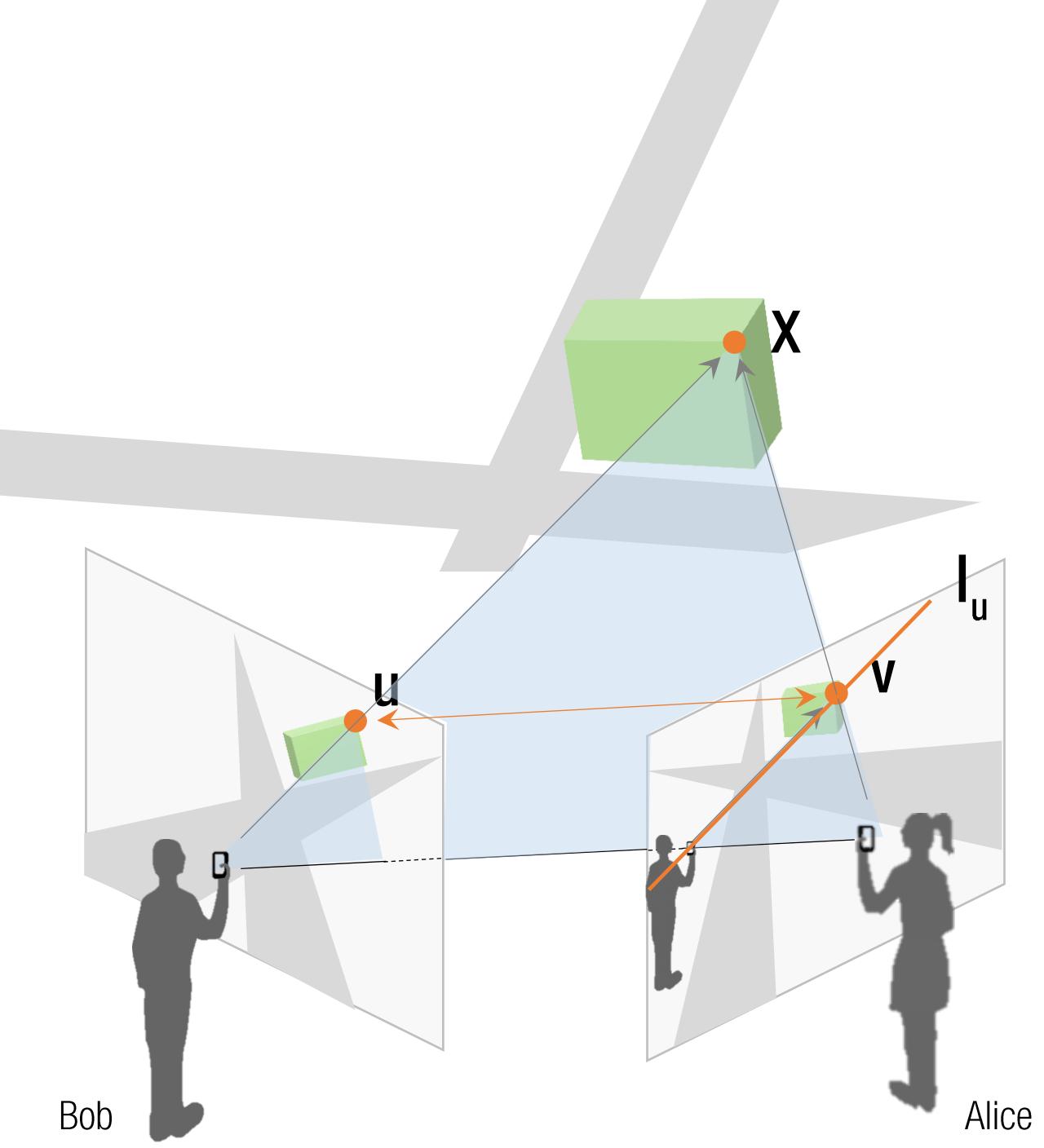


Alice's image

Bob from Alice's view



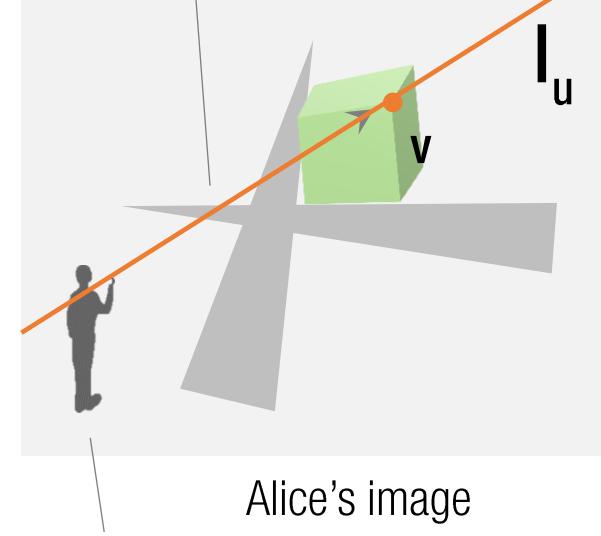
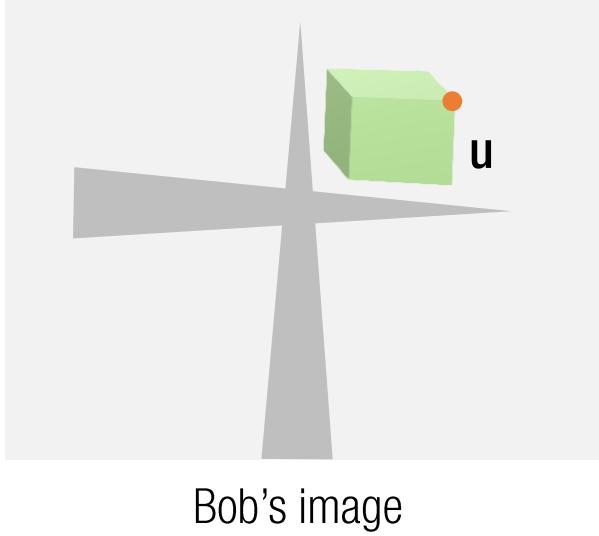
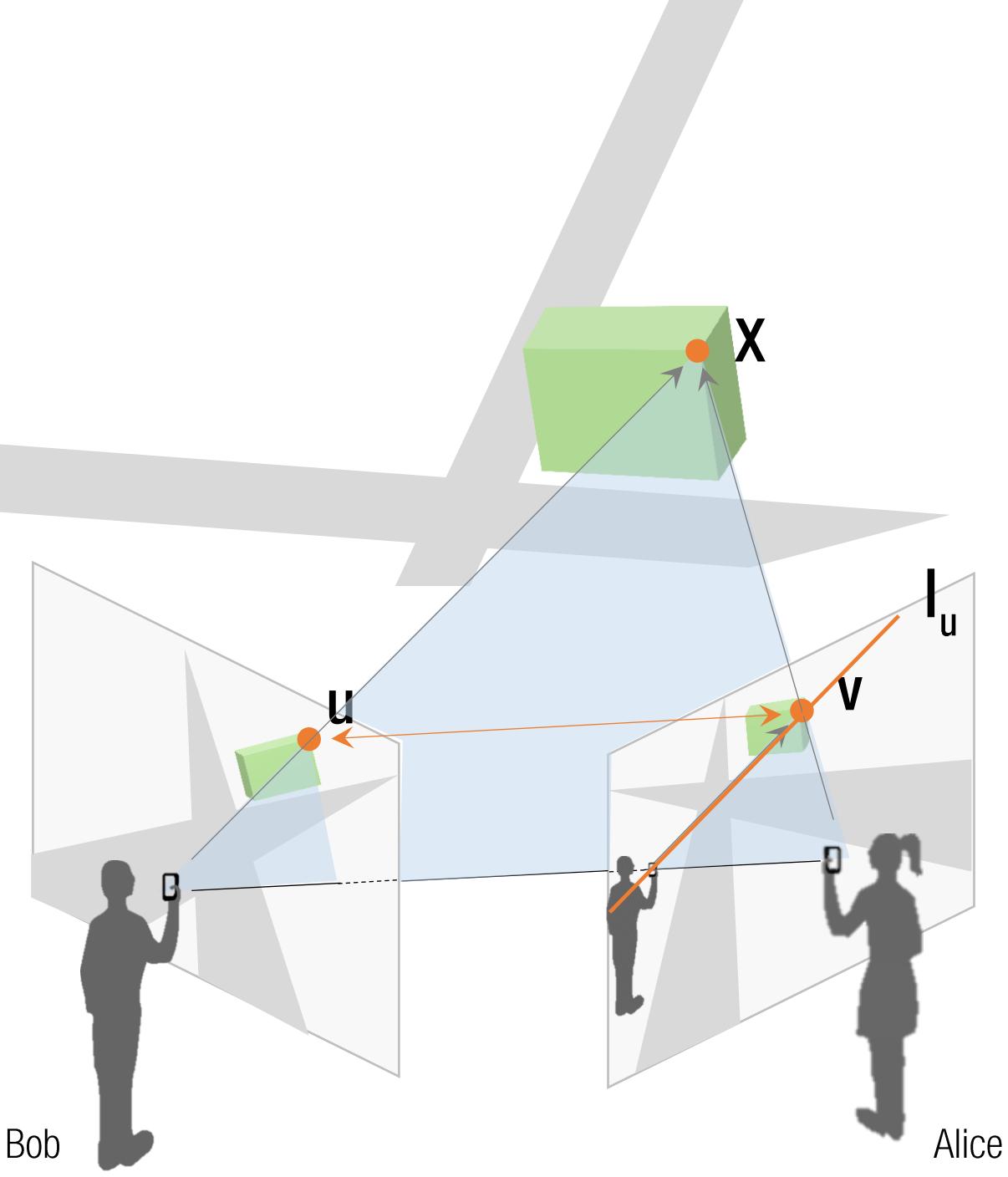




Bob from Alice's view



Epipolar line

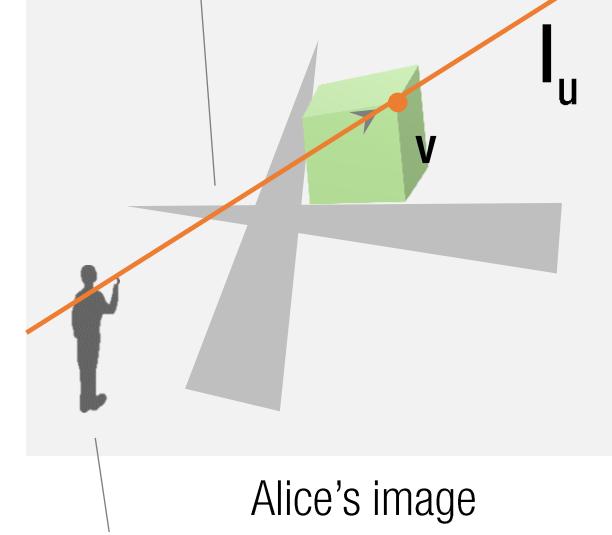
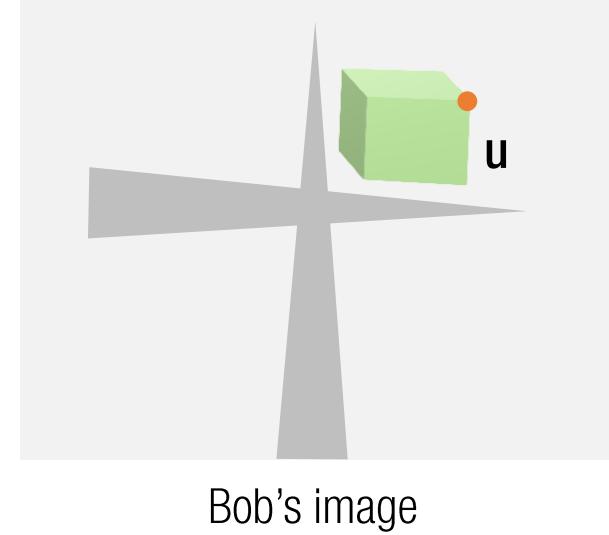
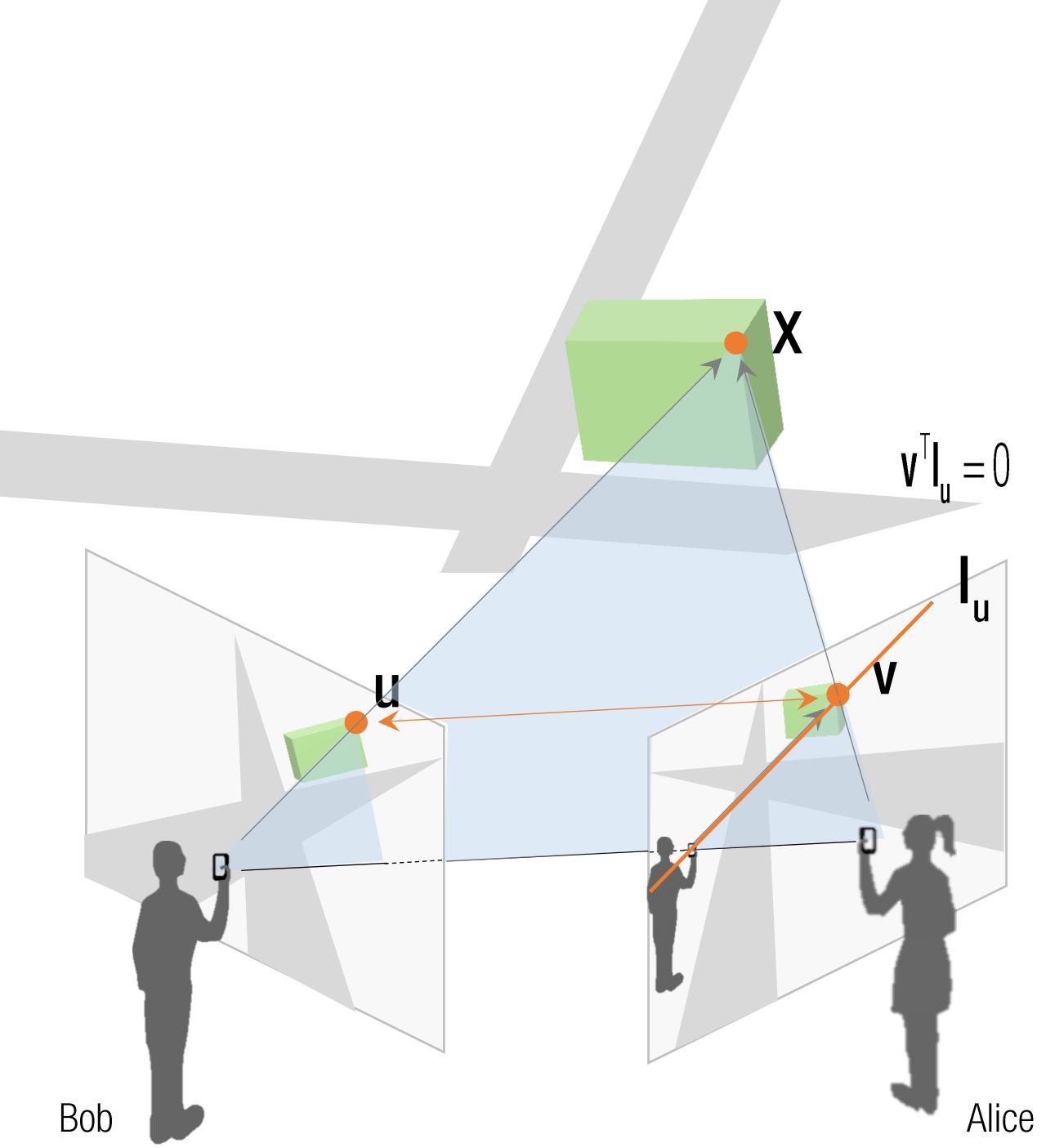


Bob from Alice's view

Epipolar line

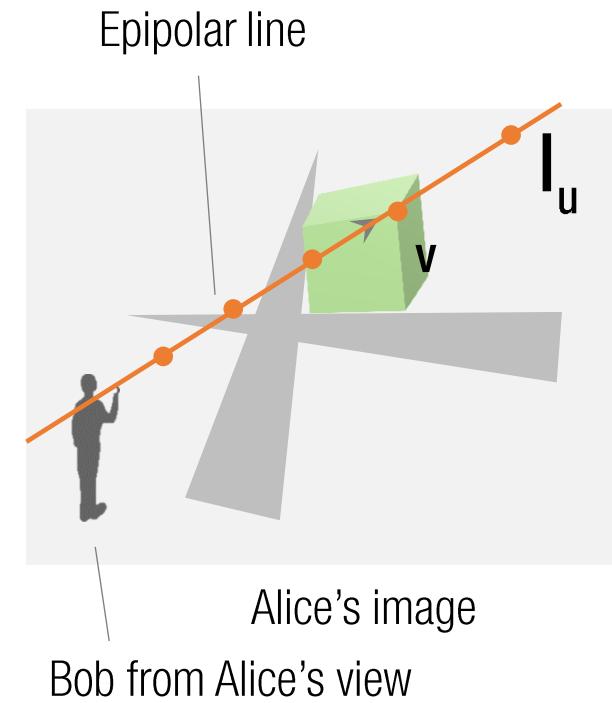
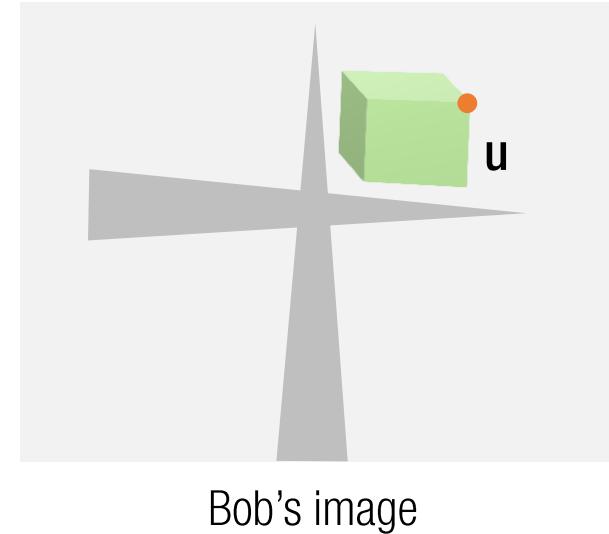
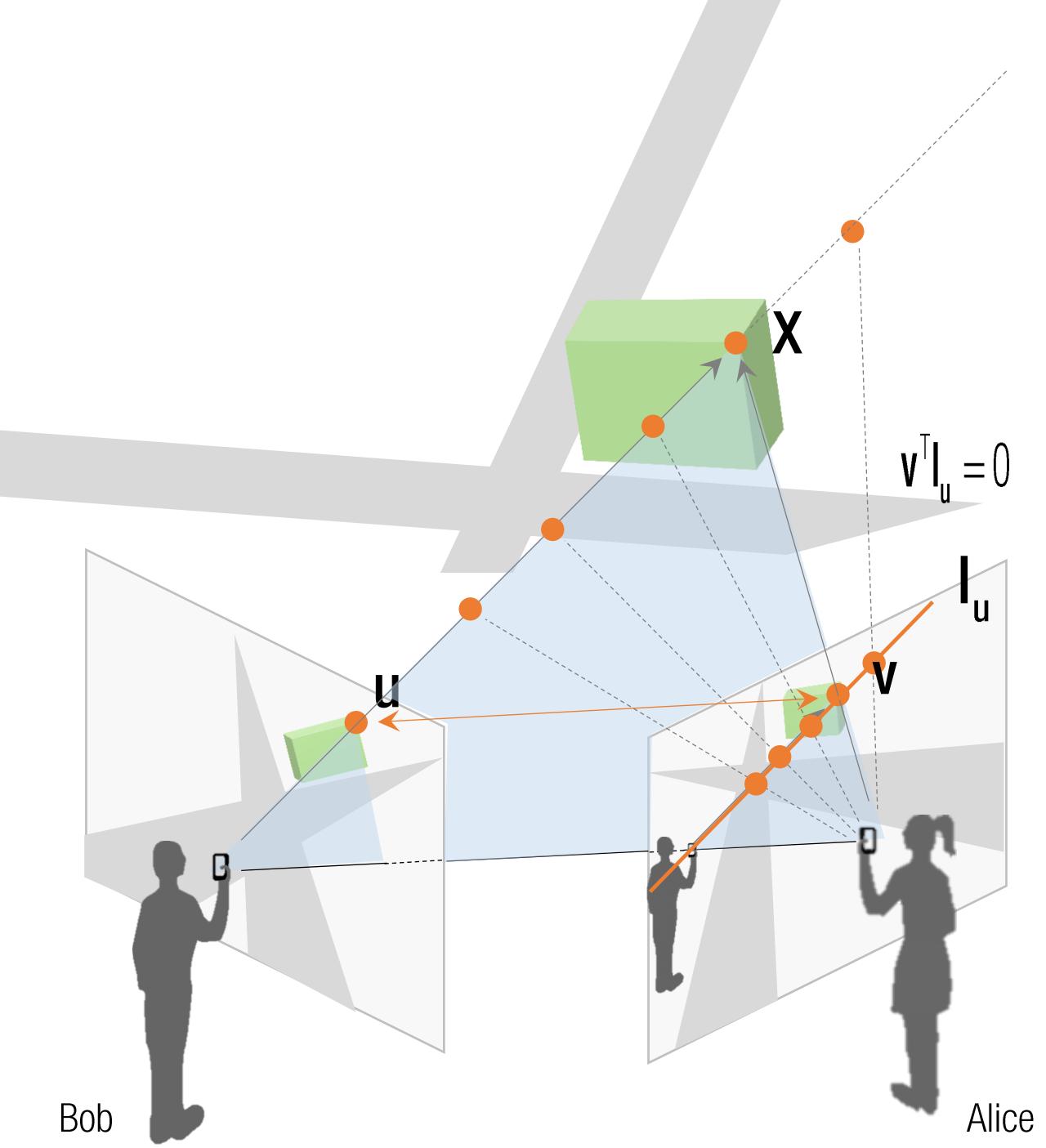
**Epipolar constraint** between two images:

1. A point,  $u$ , in Bob's image corresponds to an epipolar line  $I_u$  in Alice's image.



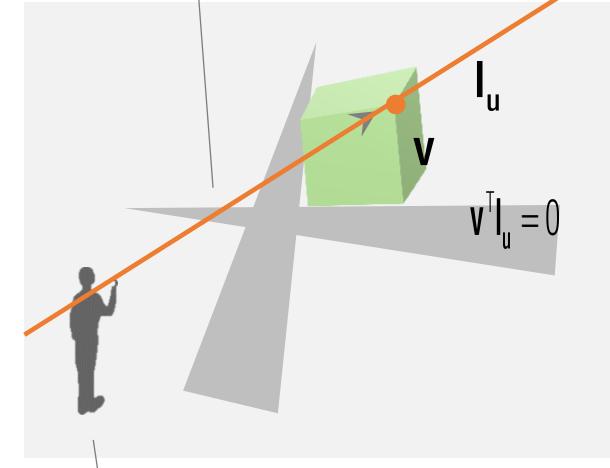
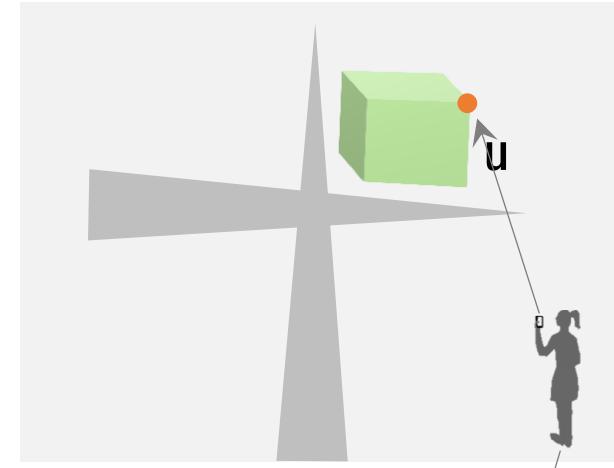
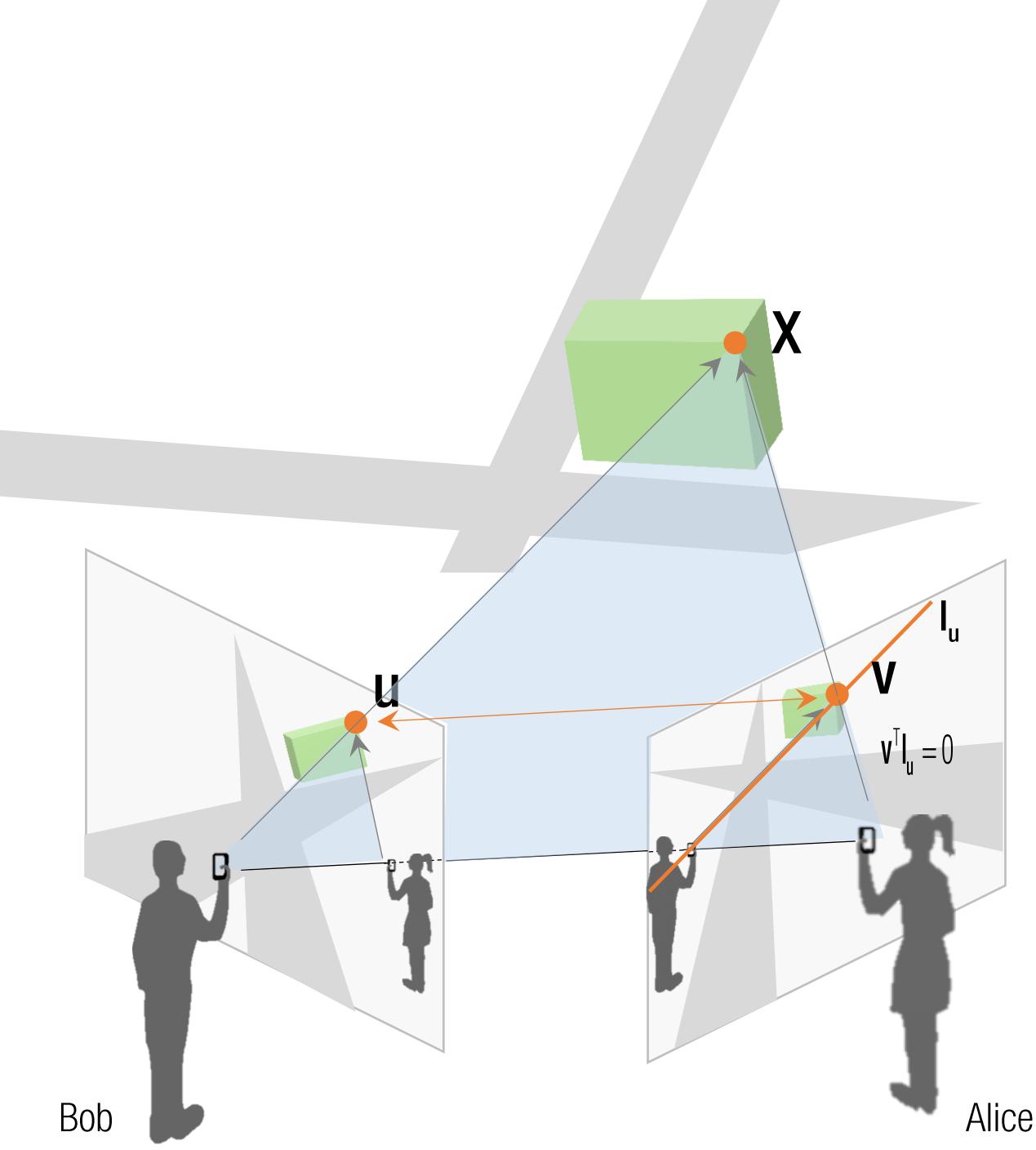
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2. The epipolar line passes the corresponding point in Alice's image,  $\mathbf{v}$ :  $\mathbf{v}^T \mathbf{I}_\mathbf{u} = 0$



**Epipolar constraint** between two images:

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2. The epipolar line passes the corresponding point in Alice's image,  $\mathbf{v}$ :  $\mathbf{v}^T I_u = 0$
3. Any point along the epipolar line can be a candidate of correspondences.





Alice



Bob

Epipolar line

Ep

1.

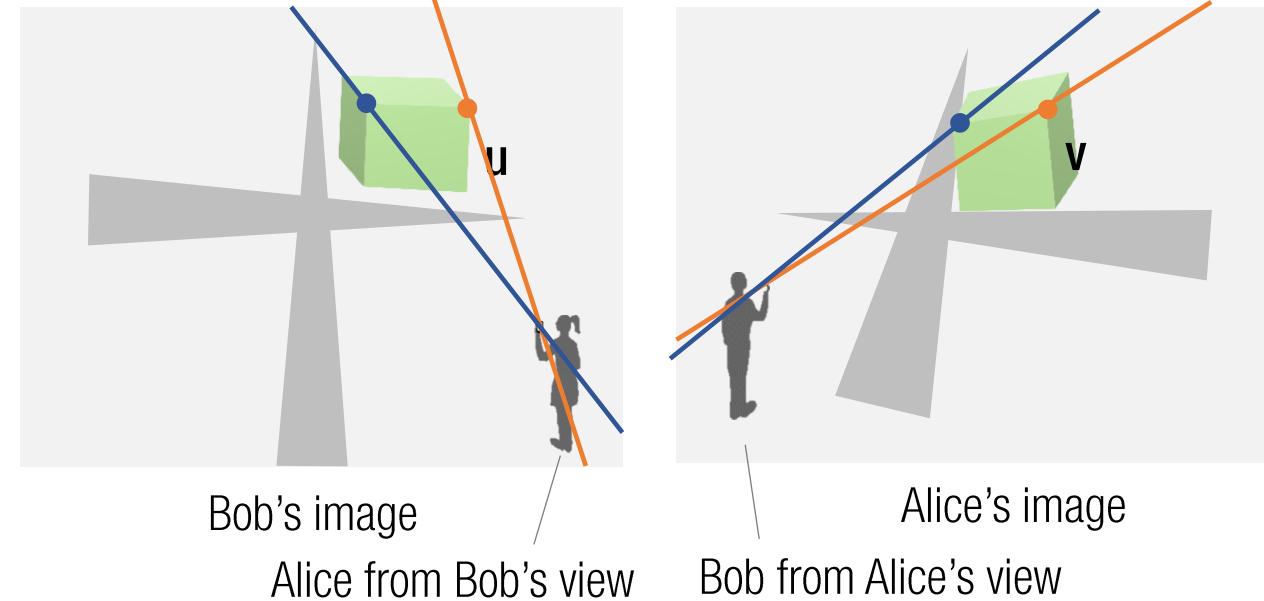
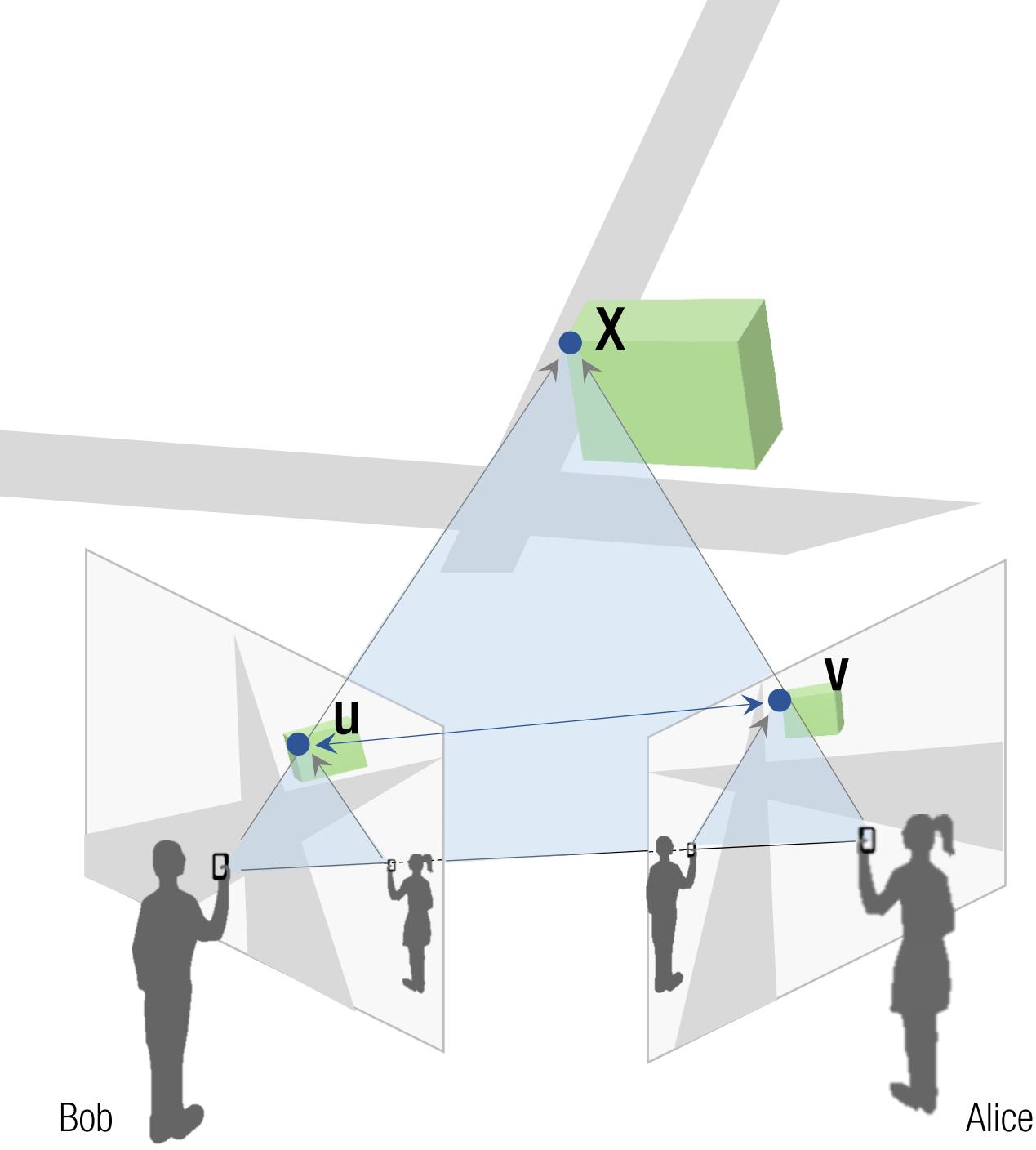
2.

$$\text{image, } \mathbf{v}: \quad \mathbf{v}^T \mathbf{l}_u = 0 \quad \mathbf{u}^T \mathbf{l}_v = 0$$

3. Any point along the epipolar line can be a candidate of correspondences.

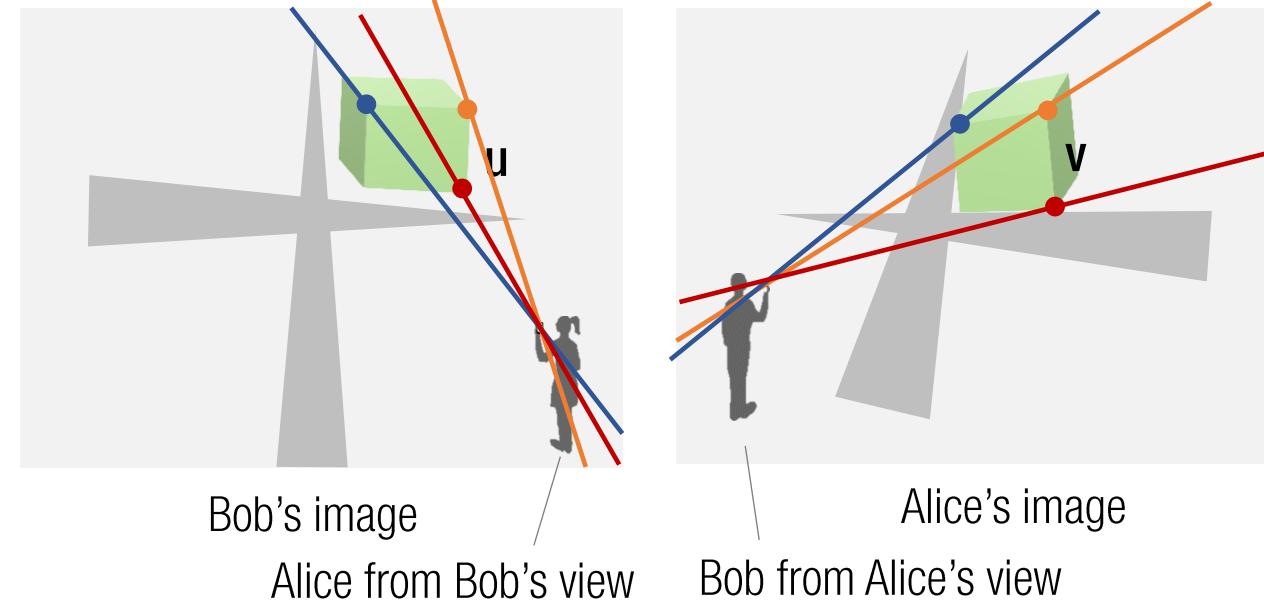
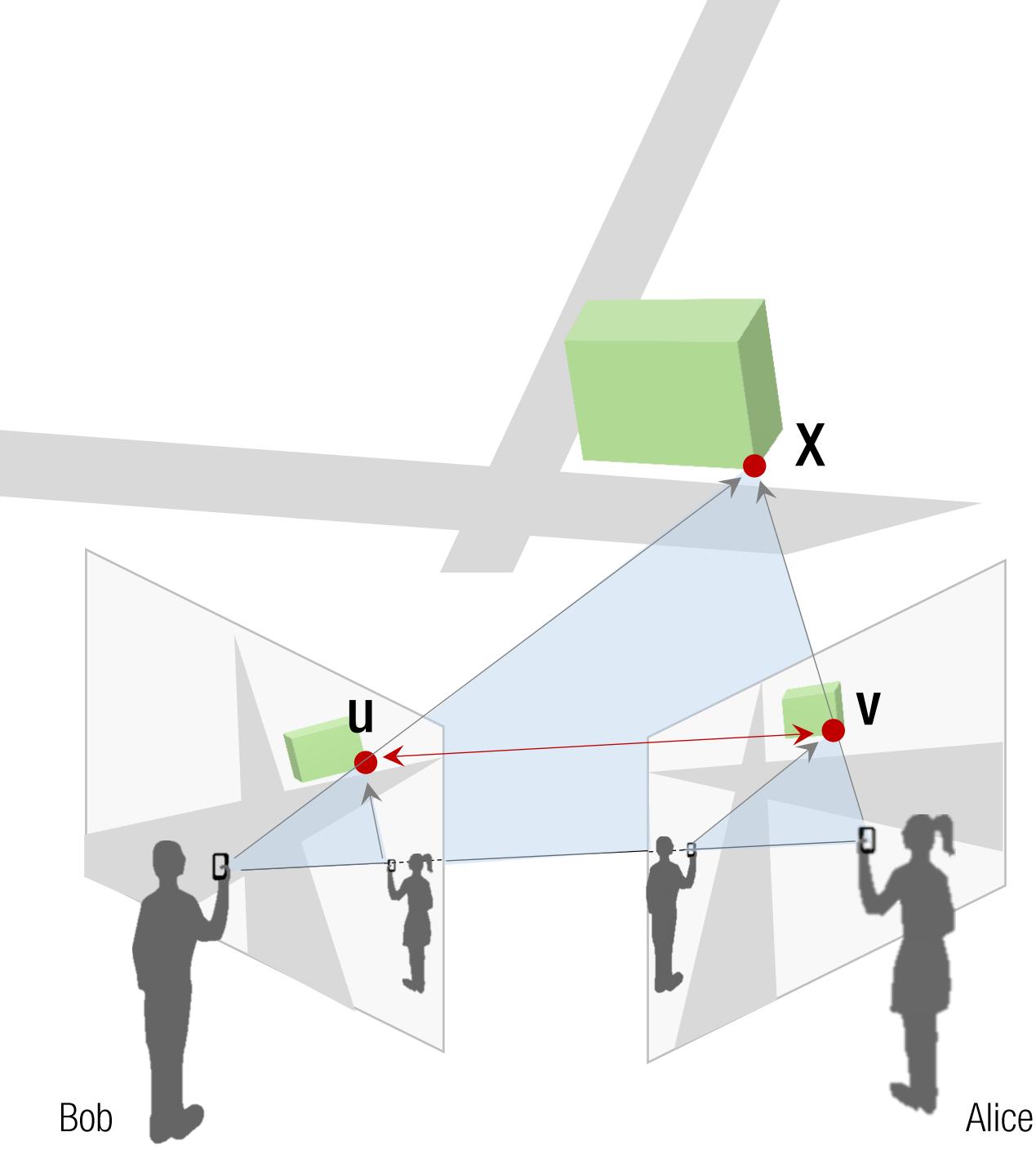
is image  
view

epipolar line in  
in Alice's



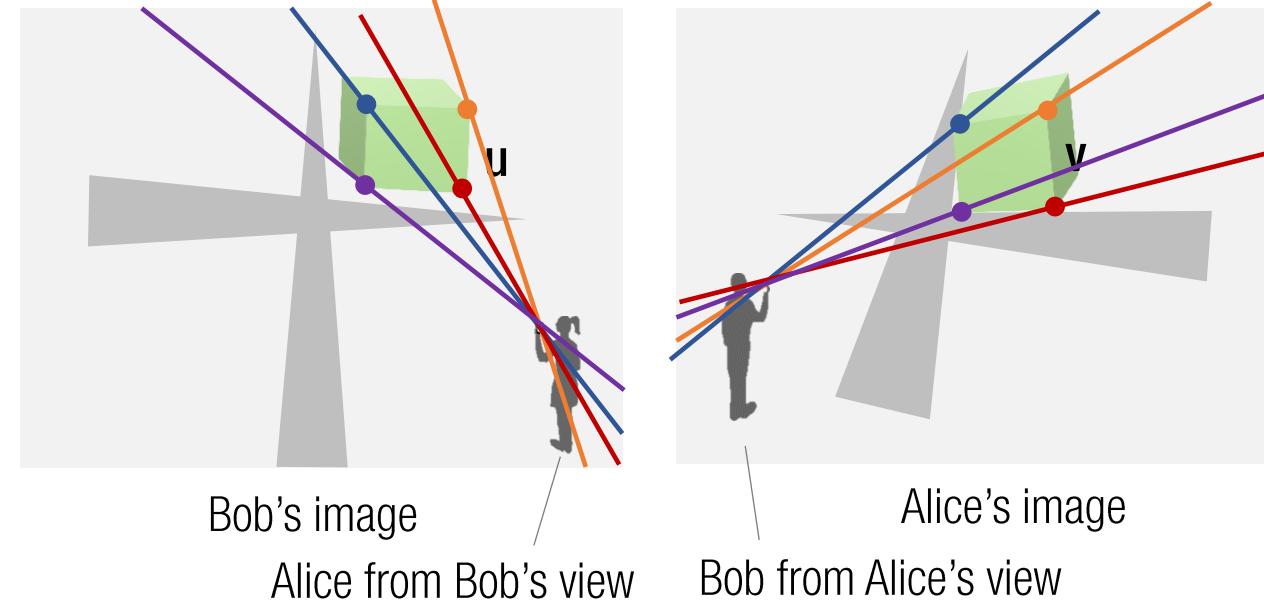
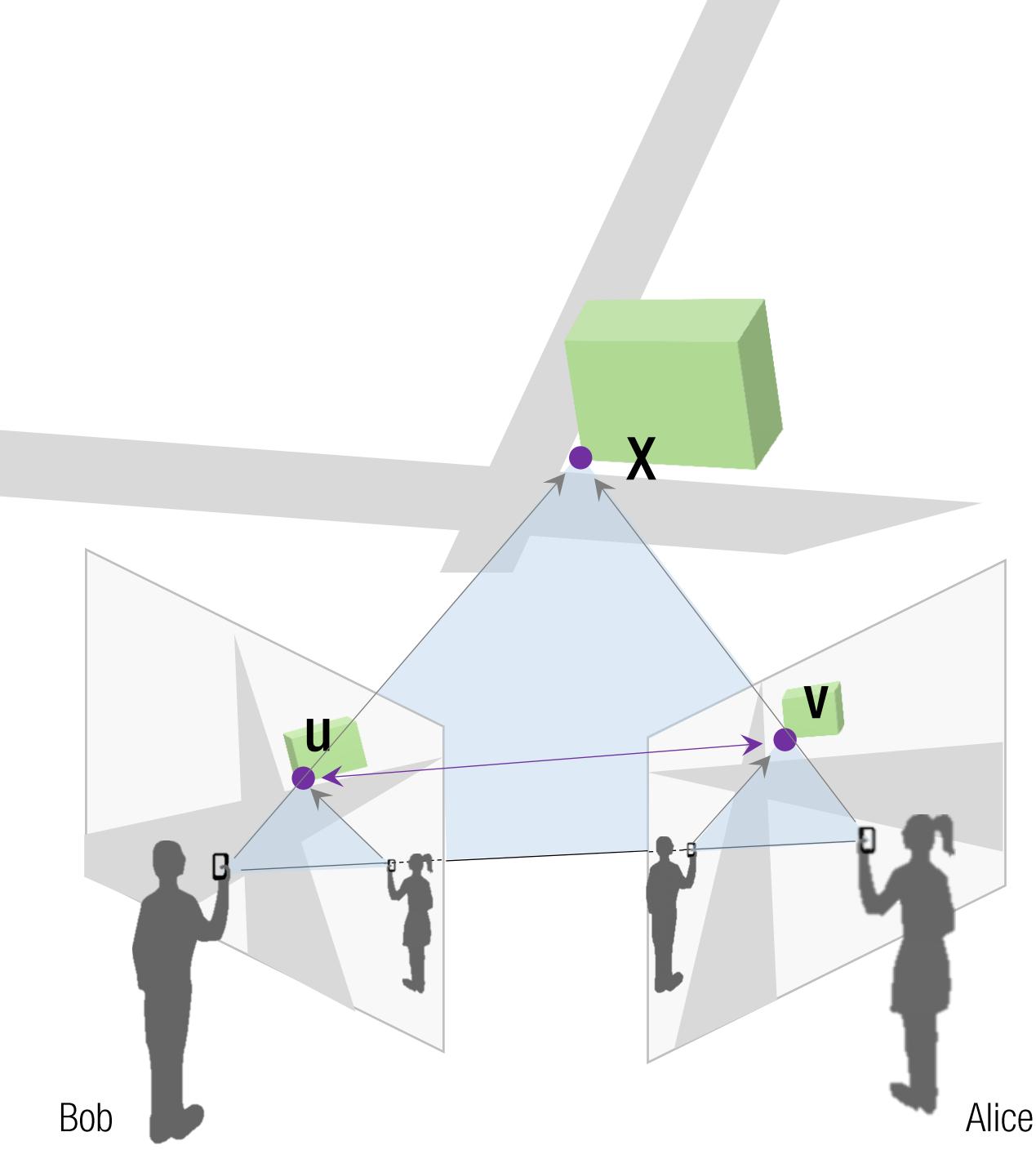
**Epipolar constraint** between two images:

1. A point,  $\mathbf{u}$ , in Bob's image corresponds to an epipolar line in Alice's image.
2. The epipolar line passes the corresponding point in Alice's image,  $\mathbf{v}$ :  $\mathbf{v}^T \mathbf{l}_u = 0$     $\mathbf{u}^T \mathbf{l}_v = 0$
3. Any point along the epipolar line can be a candidate of correspondences.



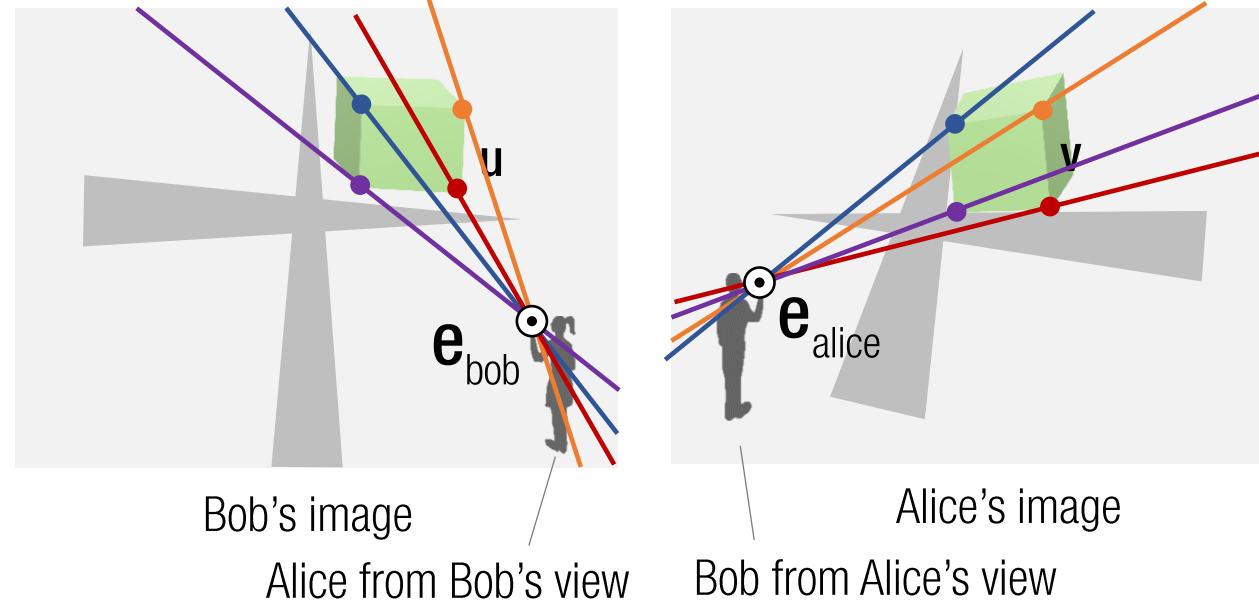
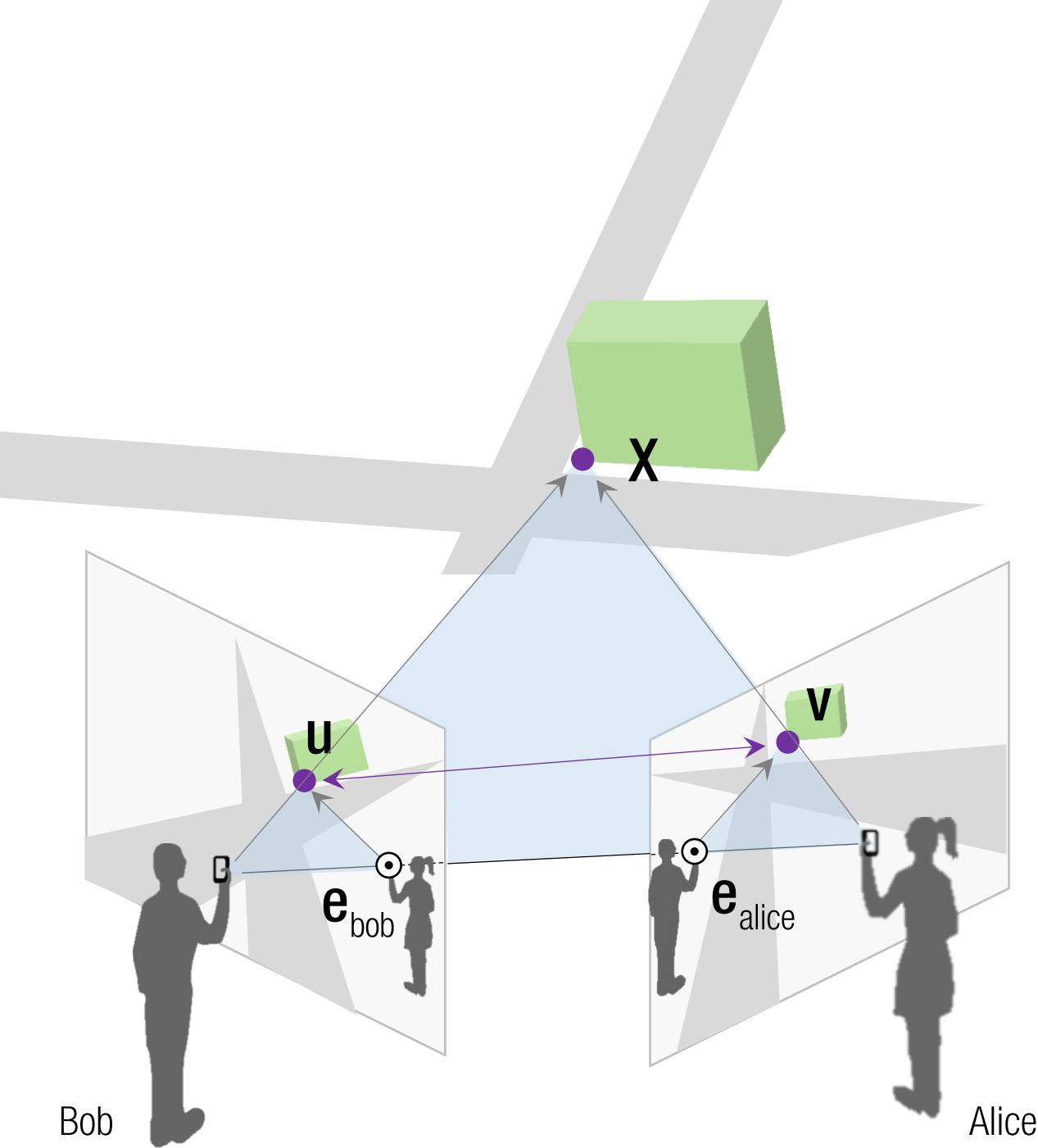
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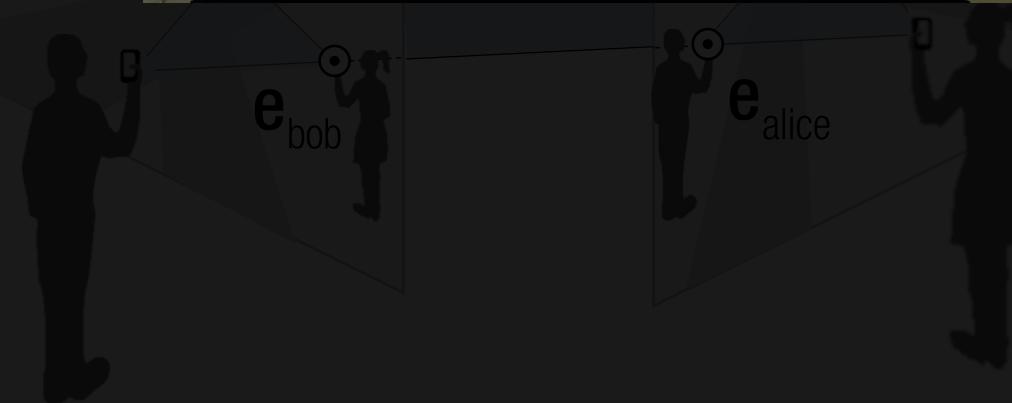
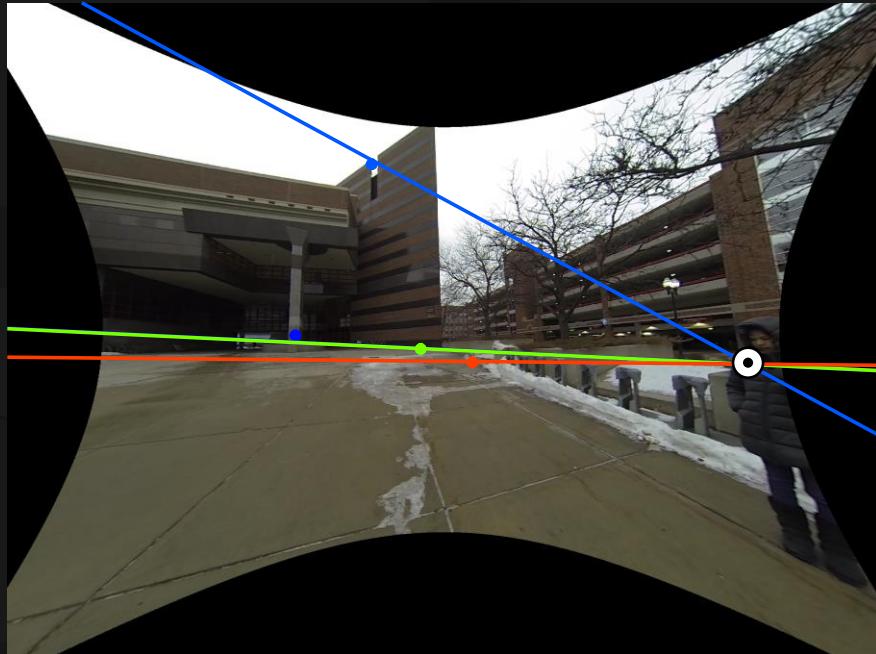
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1. A point,  $\mathbf{u}$ , in Bob's image corresponds to an epipolar line in Alice's image.
2. The epipolar line passes the corresponding point in Alice's image,  $\mathbf{v}$ :  $\mathbf{v}^T \mathbf{l}_u = 0 \quad \mathbf{u}^T \mathbf{l}_v = 0$
3. Any point along the epipolar line can be a candidate of correspondences.
4. Epipolar lines meet at the epipole.

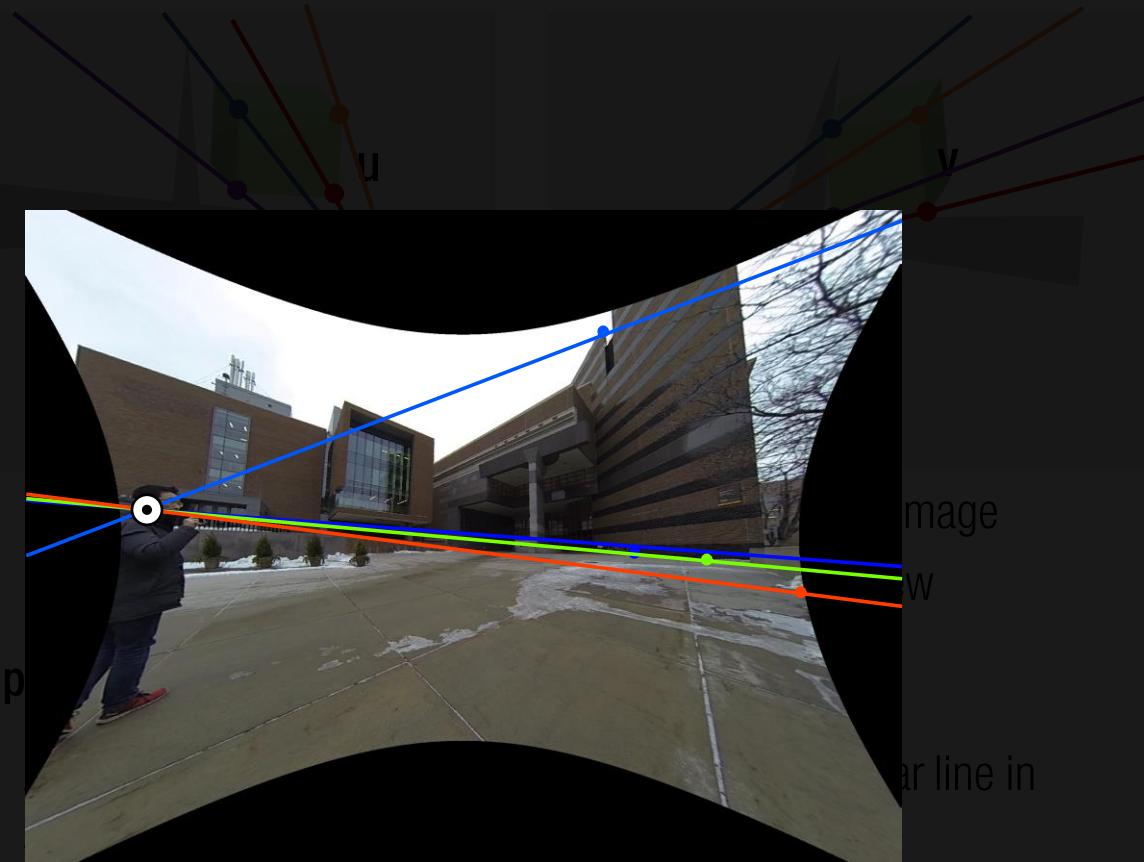


**Epipolar constraint** between two images:

1. A point,  $\mathbf{u}$ , in Bob's image corresponds to an epipolar line in Alice's image.
  2. The epipolar line passes the corresponding point in Alice's image,  $\mathbf{v}$ :  $\mathbf{v}^T \mathbf{l}_u = 0$     $\mathbf{u}^T \mathbf{l}_v = 0$
  3. Any point along the epipolar line can be a candidate of correspondences.
  4. Epipolar lines meet at the epipole:  $\mathbf{e}_{\text{bob}}^T \mathbf{l}_u = 0$     $\mathbf{e}_{\text{alice}}^T \mathbf{l}_v = 0$

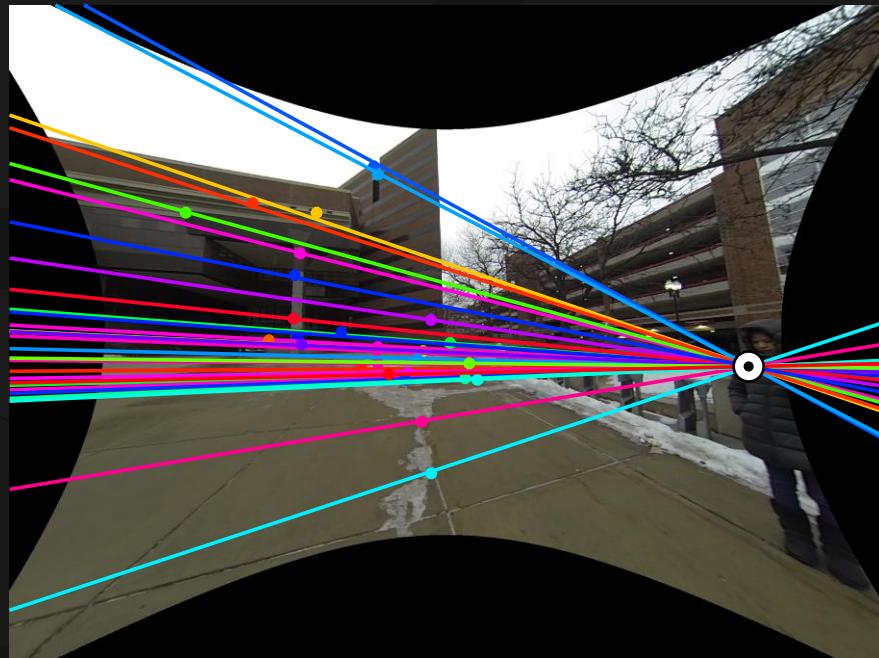


Alice

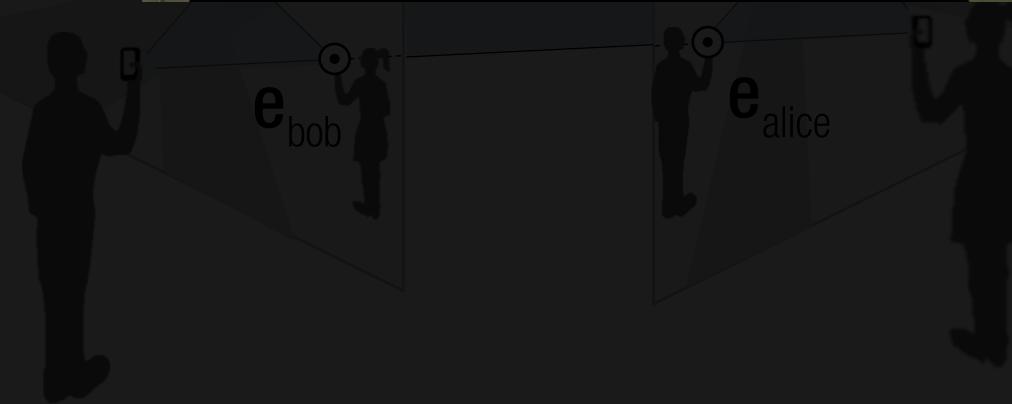


## Epipoles

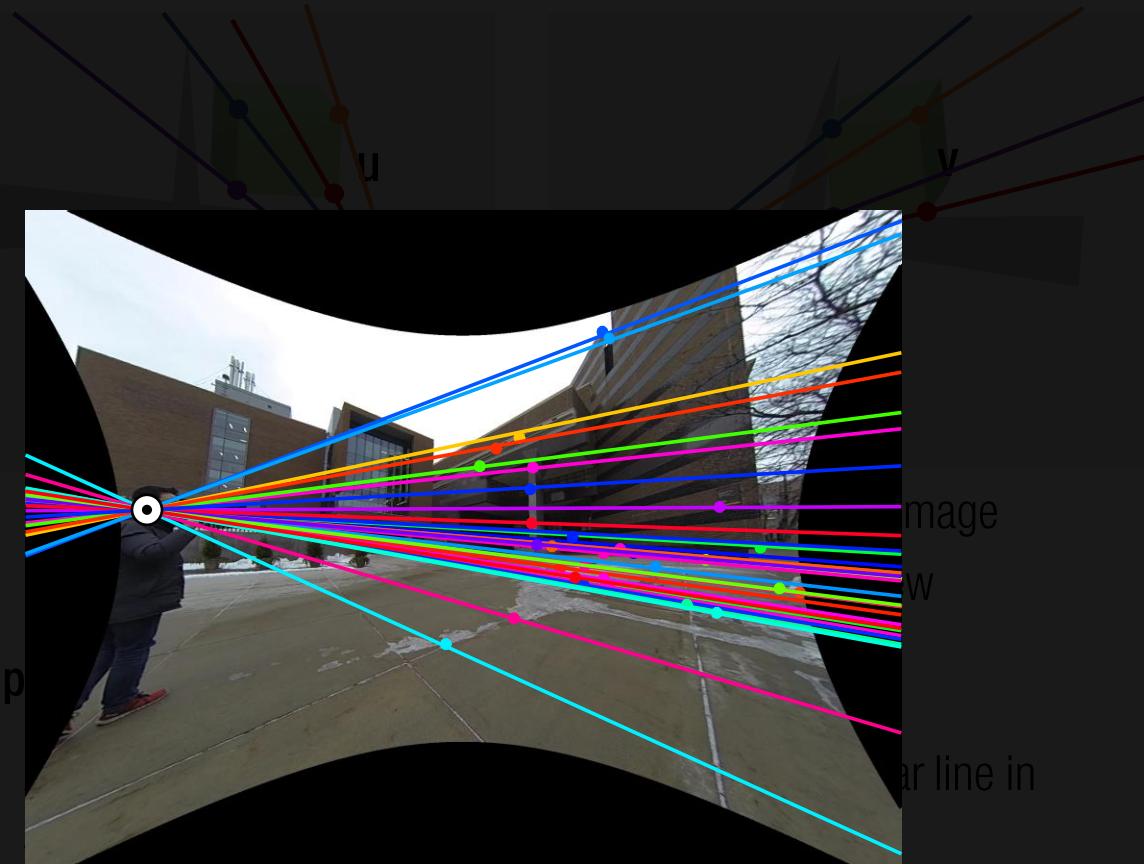
1. Epipoles are the intersection points of the epipolar lines with the image plane.
2. The epipolar line passes the corresponding point in Alice's image,  $v$ :  $v^T l_u = 0 \quad u^T l_v = 0$
3. Any point along the epipolar line can be a candidate of correspondences.
4. Epipolar lines meet at the epipole:  $e_{bob}^T l_u = 0 \quad e_{alice}^T l_v = 0$



Alice

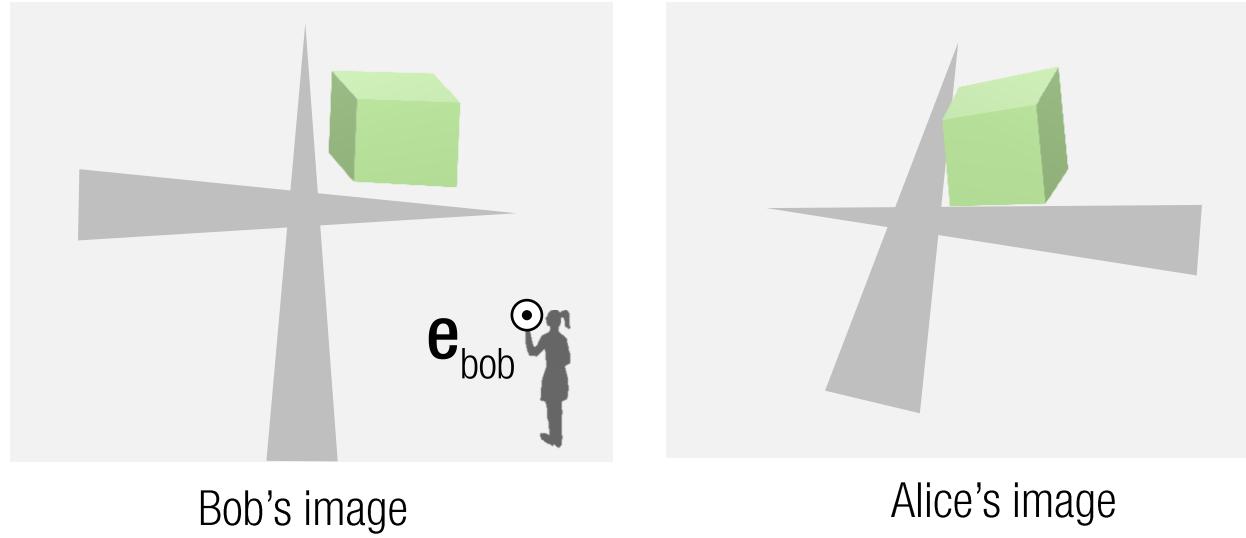
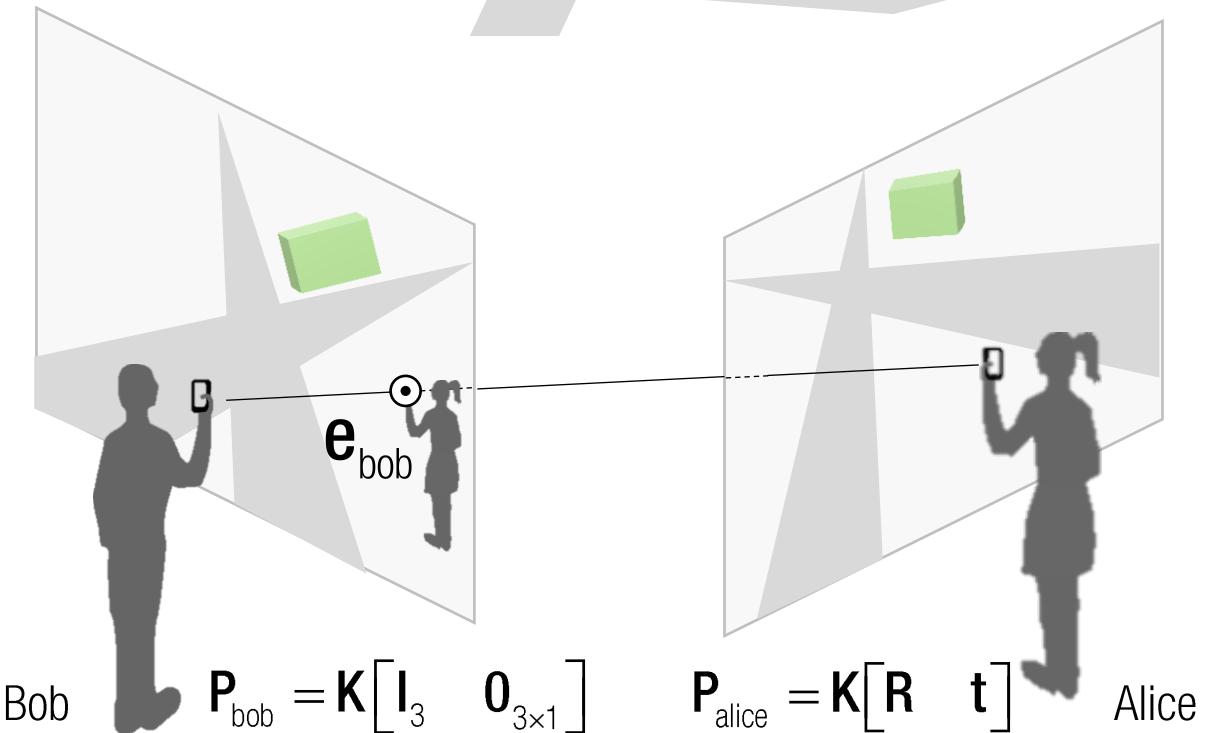


Bob



- Epipolar line in
- 1.
  2. The epipolar line passes the corresponding point in Alice's image,  $v$ :  $v^T l_u = 0 \quad u^T l_v = 0$
  3. Any point along the epipolar line can be a candidate of correspondences.
  4. Epipolar lines meet at the epipole:  $e_{\text{bob}}^T l_u = 0 \quad e_{\text{alice}}^T l_v = 0$

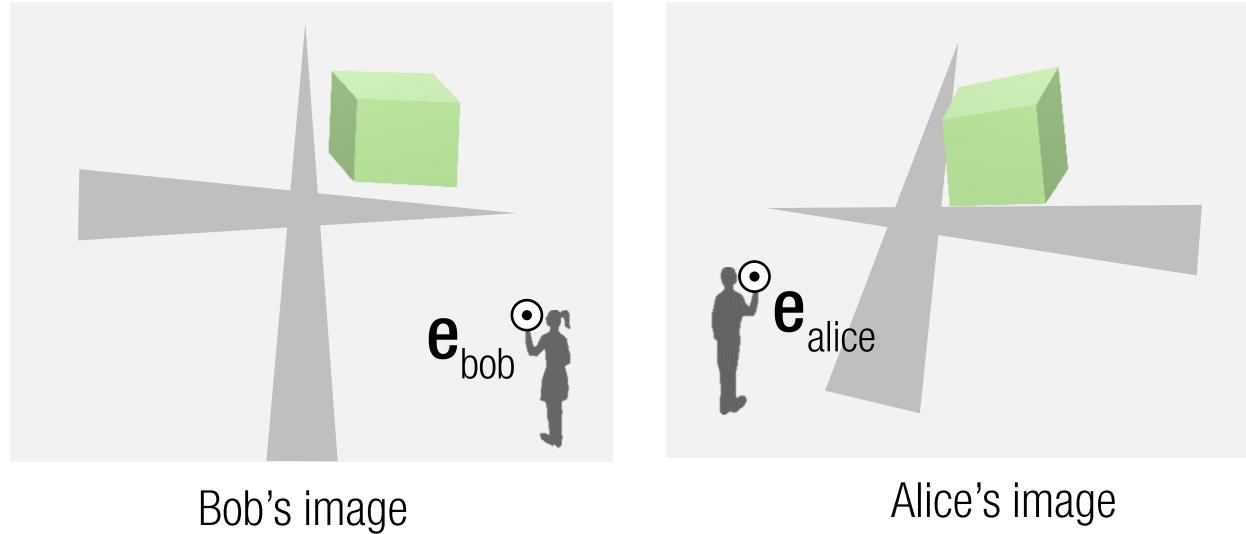
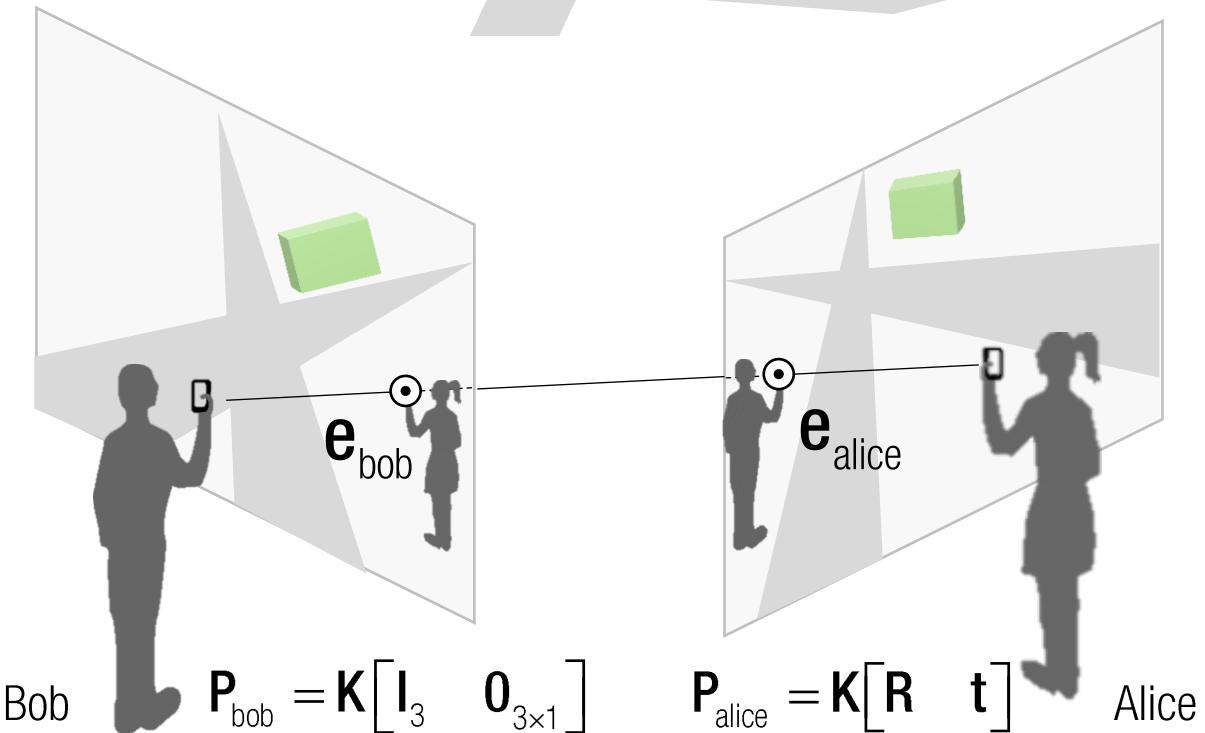
# Epipole Computation



$$\lambda e_{\text{bob}} = K \begin{bmatrix} I_3 & 0 \end{bmatrix} \begin{bmatrix} -R^T t \\ 1 \end{bmatrix} = -KR^T t$$

Bob's camera projection matrix

# Epipole Computation



$$\lambda e_{\text{bob}} = K \begin{bmatrix} I_3 & 0 \end{bmatrix} \begin{bmatrix} -R^T t \\ 1 \end{bmatrix} = -KR^T t$$

Bob's camera projection matrix

$$\lambda e_{\text{alice}} = K \begin{bmatrix} R & t \end{bmatrix} \begin{bmatrix} 0 \\ 1 \end{bmatrix} = Kt$$

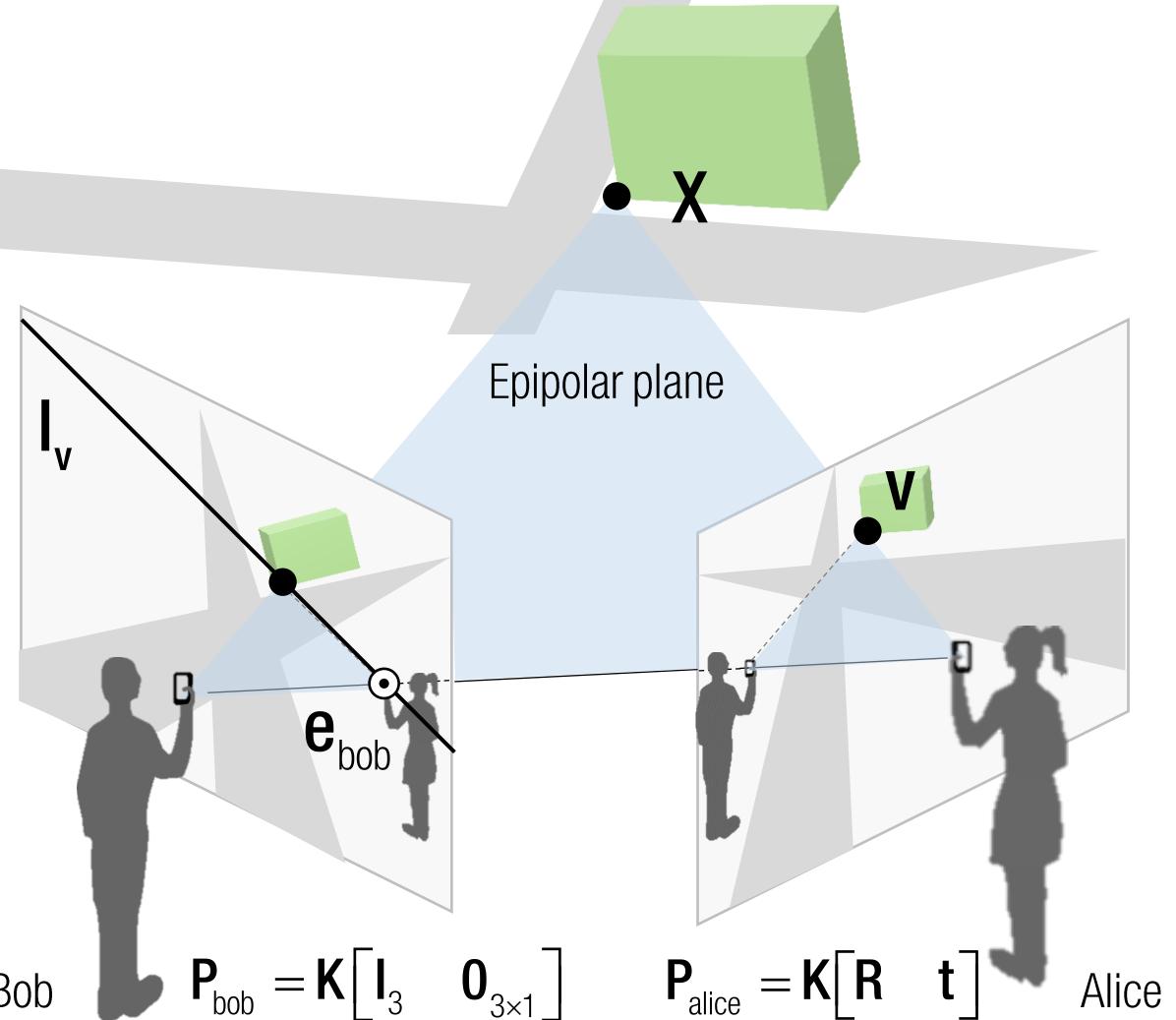
Alice's camera projection matrix

# Epipolar Line

$$\lambda \mathbf{e}_{\text{bob}} = \mathbf{K} \mathbf{R}^T \mathbf{t}$$

$$\lambda \mathbf{e}_{\text{alice}} = \mathbf{K} \mathbf{t}$$

$$\mathbf{l}_v =$$



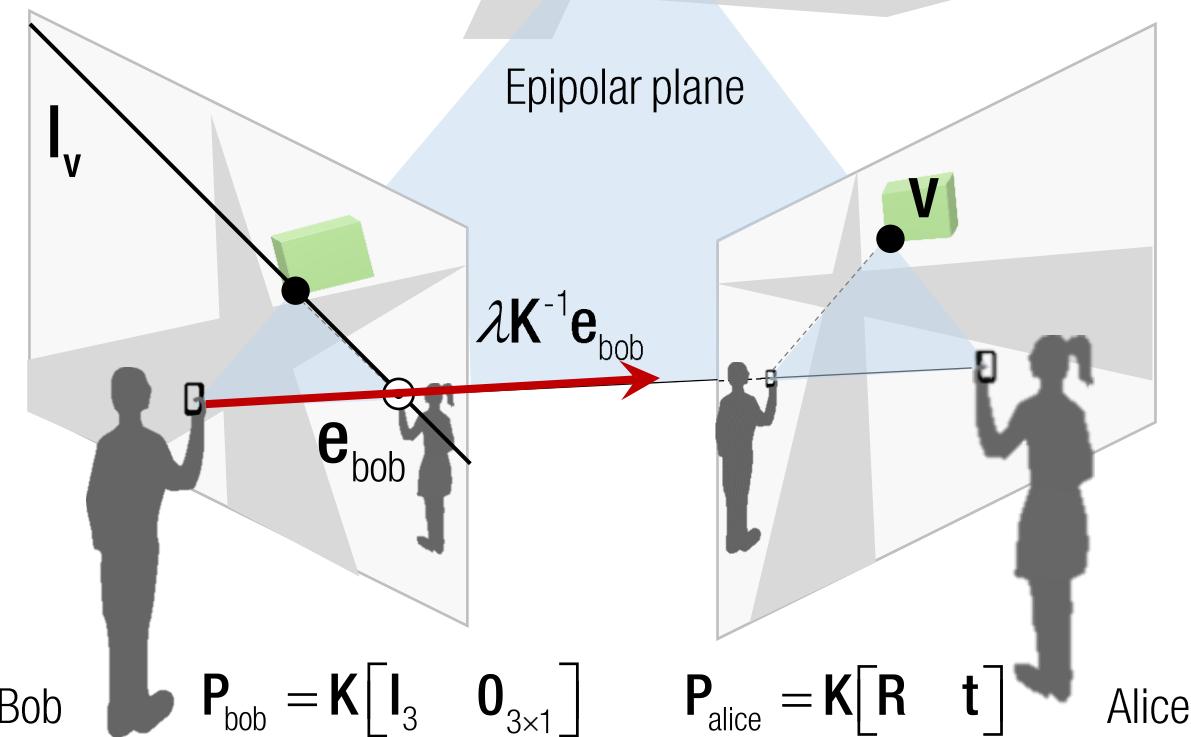
# Epipolar Line

$$\lambda \mathbf{e}_{\text{bob}} = \mathbf{K} \mathbf{R}^T \mathbf{t}$$

$$\lambda \mathbf{e}_{\text{alice}} = \mathbf{K} \mathbf{t}$$

$$\mathbf{l}_v =$$

$$\rightarrow \lambda \mathbf{K}^{-1} \mathbf{e}_{\text{bob}} = \mathbf{R}^T \mathbf{t}$$



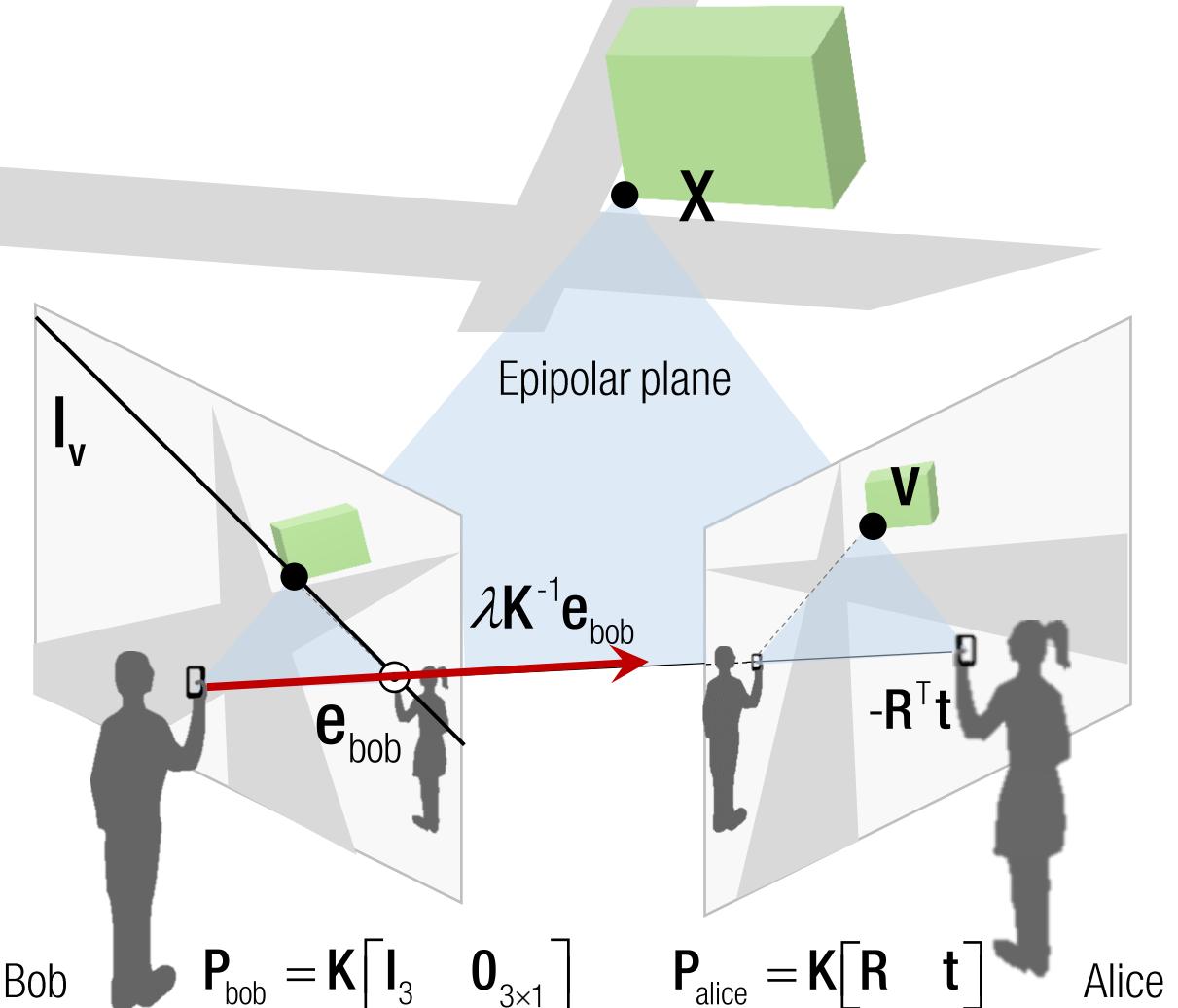
# Epipolar Line

$$\lambda \mathbf{e}_{\text{bob}} = \mathbf{K} \mathbf{R}^T \mathbf{t}$$

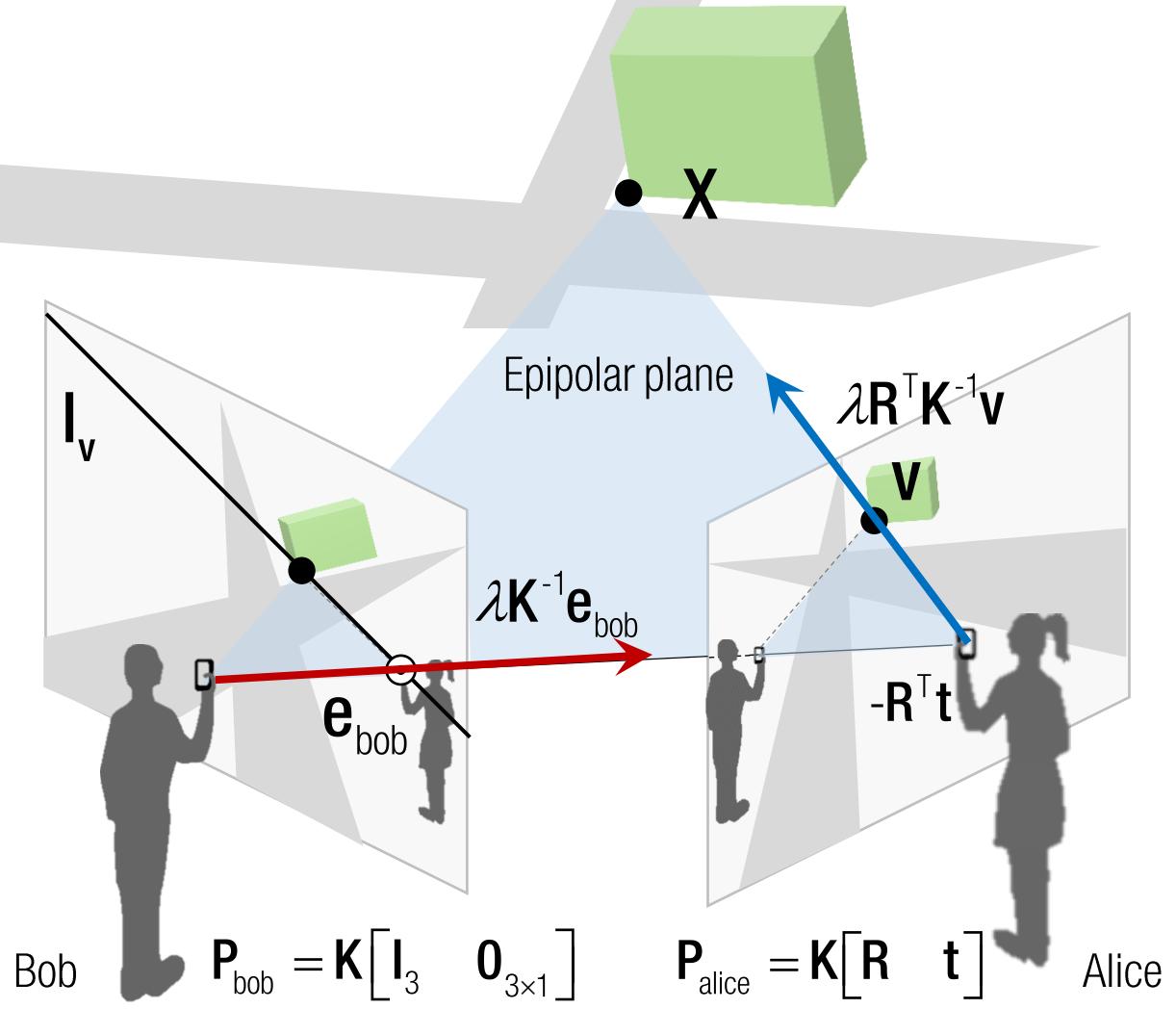
$$\lambda \mathbf{e}_{\text{alice}} = \mathbf{K} \mathbf{t}$$

$$\mathbf{l}_v =$$

$$\rightarrow \lambda \mathbf{K}^{-1} \mathbf{e}_{\text{bob}} = \mathbf{R}^T \mathbf{t}$$



# Epipolar Line



$$\lambda e_{\text{bob}} = KR^T t$$

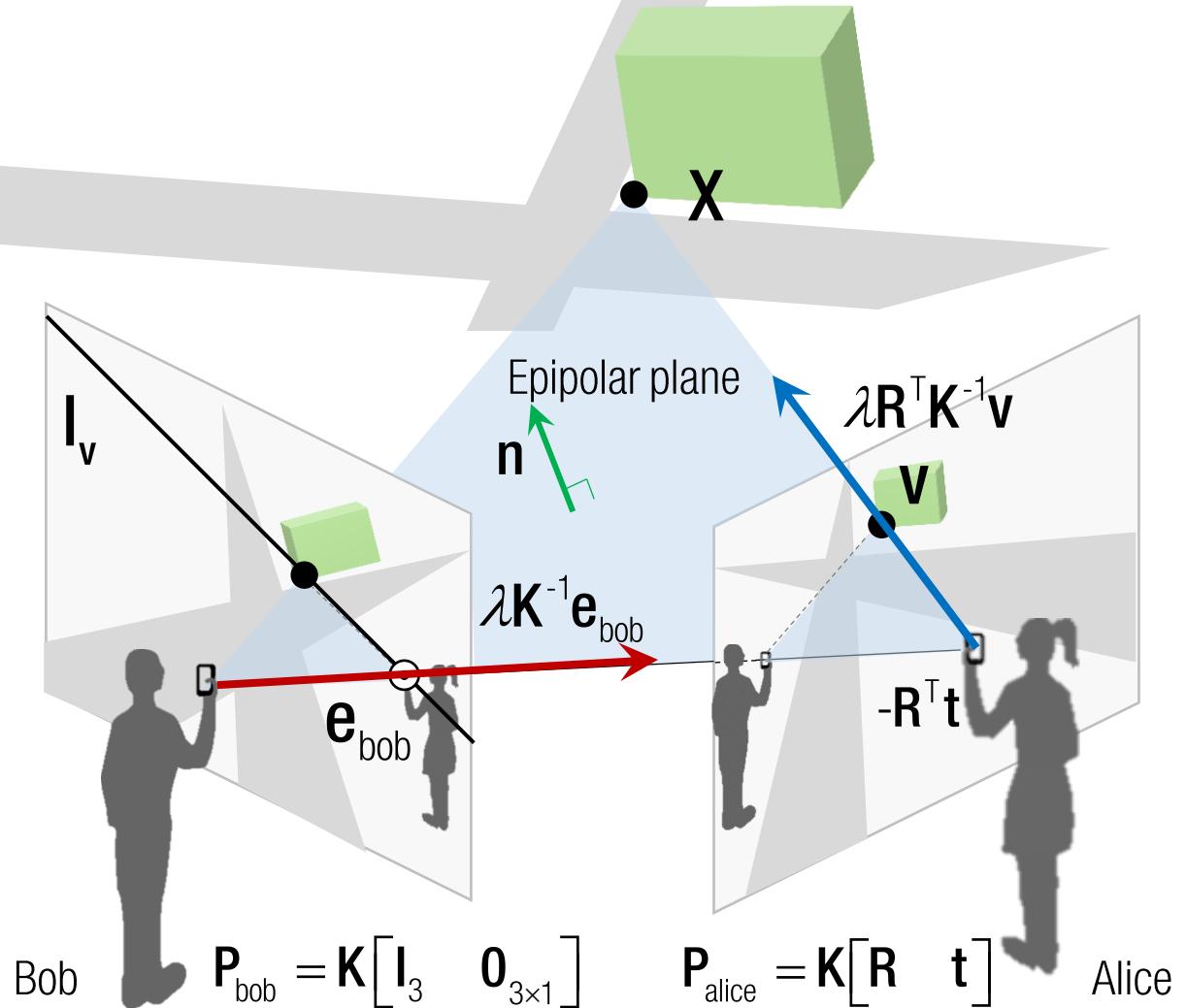
$$\lambda e_{\text{alice}} = Kt$$

$$I_v =$$

$$\rightarrow \lambda K^{-1} e_{\text{bob}} = R^T t$$

$$\rightarrow \frac{\lambda R^T K^{-1} v - R^T t}{\text{Direction} \quad \text{Alice's camer location}}$$

# Epipolar Line



$$\lambda e_{\text{bob}} = KR^T t$$

$$\lambda e_{\text{alice}} = Kt$$

$$I_v =$$

$$\rightarrow \lambda K^{-1} e_{\text{bob}} = R^T t$$

$$\rightarrow \frac{\lambda R^T K^{-1} v - R^T t}{\text{Direction}} \quad \text{Alice's camer location}$$

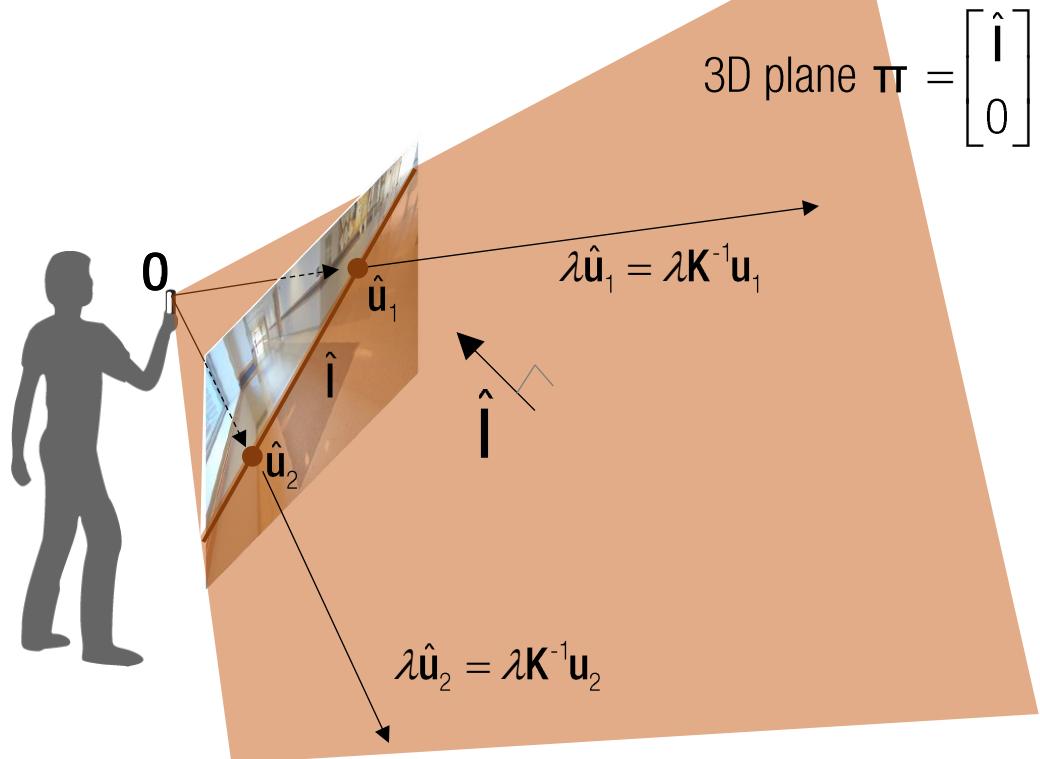
$$\rightarrow n = R^T t \times (\lambda R^T K^{-1} v - R^T t)$$

$$= R^T t \times R^T K^{-1} v$$

$$= R^T (t \times K^{-1} v) \quad : \text{only works for rotation}$$

$$= R^T [t]_x K^{-1} v$$

# Recall: Projective Line vs. Plane



Normalized coordinate:

$$\hat{\mathbf{u}}_1 = \mathbf{K}^{-1}\mathbf{u}_1 \quad \hat{\mathbf{u}}_2 = \mathbf{K}^{-1}\mathbf{u}_2$$

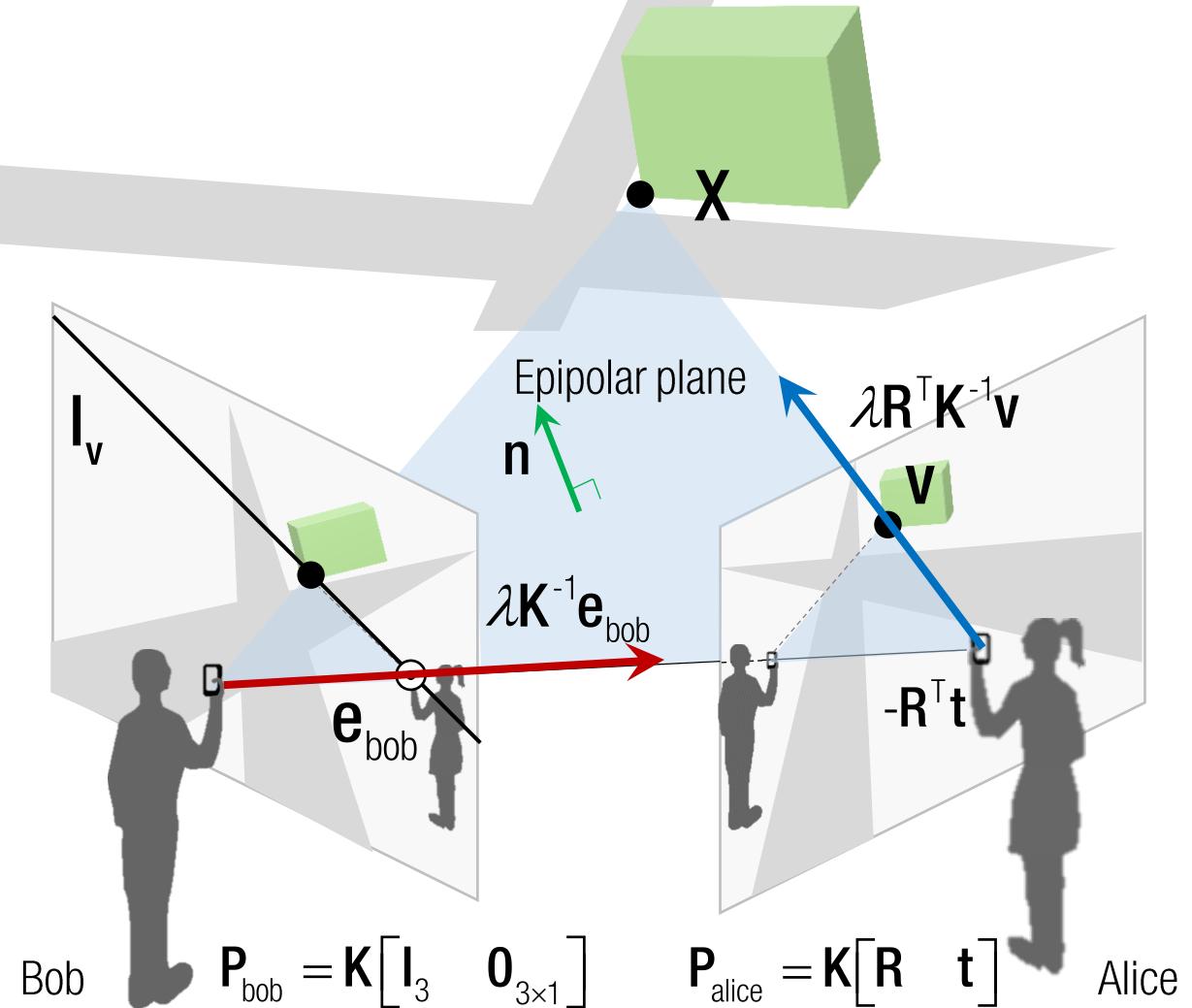
$$\longrightarrow \hat{\mathbf{l}} = \hat{\mathbf{u}}_1 \times \hat{\mathbf{u}}_2$$

$$\text{where } \hat{\mathbf{l}} = (\mathbf{K}^{-1})^T \mathbf{l} = \mathbf{K}^T \mathbf{l} \text{ due to duality}$$

Plane normal:  $(\lambda_1 \hat{\mathbf{u}}_1) \times (\lambda_2 \hat{\mathbf{u}}_2) = \lambda \hat{\mathbf{l}}$

$$\therefore \pi = \begin{bmatrix} \hat{\mathbf{l}} \\ 0 \end{bmatrix}$$

# Epipolar Line



$$\lambda e_{\text{bob}} = KR^T t$$

$$\lambda e_{\text{alice}} = Kt$$

$$I_v =$$

$$\rightarrow \lambda K^{-1} e_{\text{bob}} = R^T t$$

$$\rightarrow \frac{\lambda R^T K^{-1} v - R^T t}{\text{Direction} \quad \text{Alice's camer location}}$$

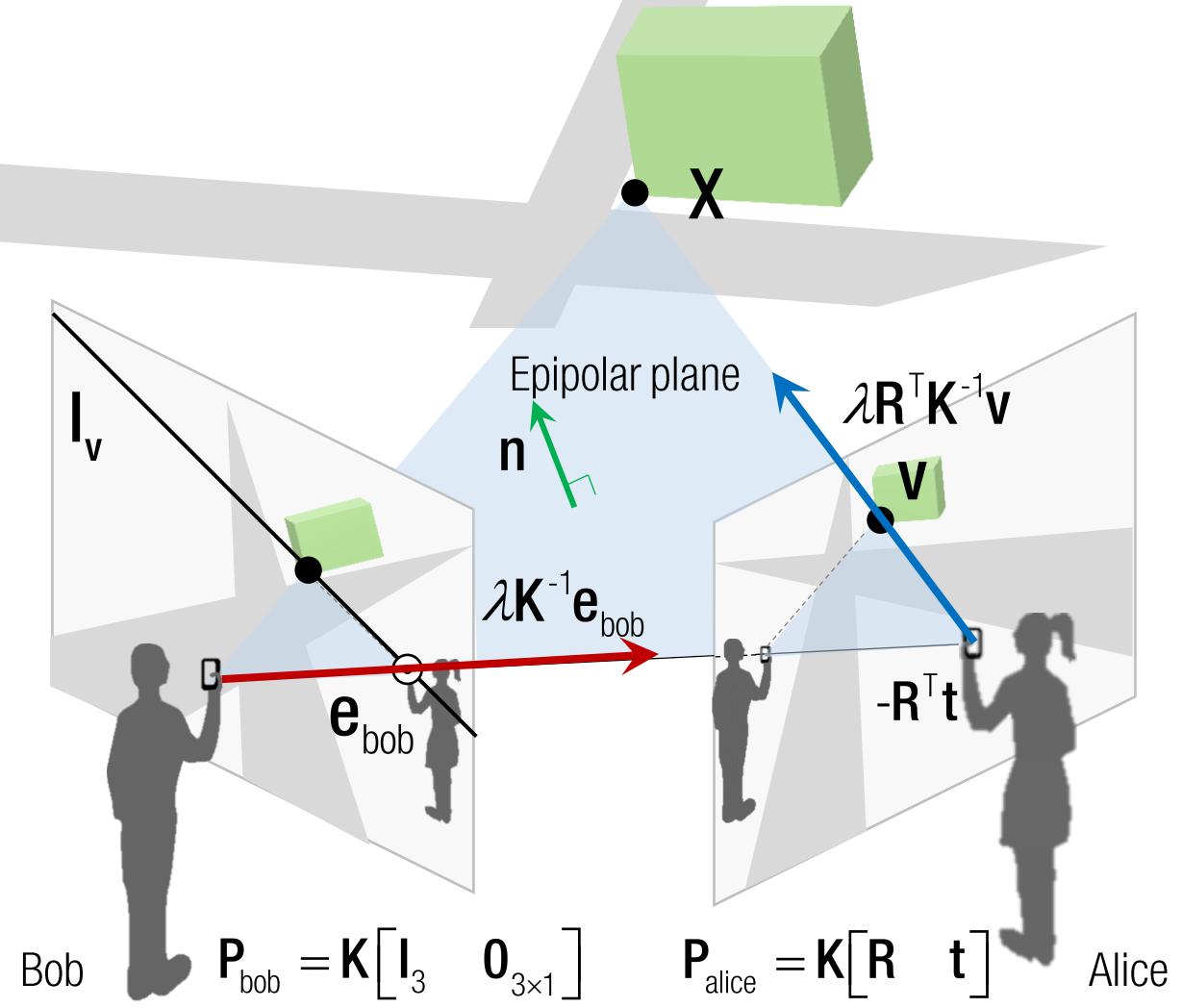
$$\rightarrow n = R^T t \times (\lambda R^T K^{-1} v - R^T t)$$

$$= R^T t \times R^T K^{-1} v$$

$$= R^T (t \times K^{-1} v) \quad : \text{only works for rotation}$$

$$= R^T [t]_x K^{-1} v$$

# Epipolar Line



$$\lambda e_{\text{bob}} = KR^T t$$

$$\lambda e_{\text{alice}} = Kt$$

$$I_v = K^{-T} n = K^{-T} R^T [t] K^{-1} v \quad : \text{Epipolar line}$$

$$\rightarrow \lambda K^{-1} e_{\text{bob}} = R^T t$$

$$\rightarrow \frac{\lambda}{\lambda} \frac{R^T K^{-1} v - R^T t}{R^T t}$$

Direction Alice's camer location

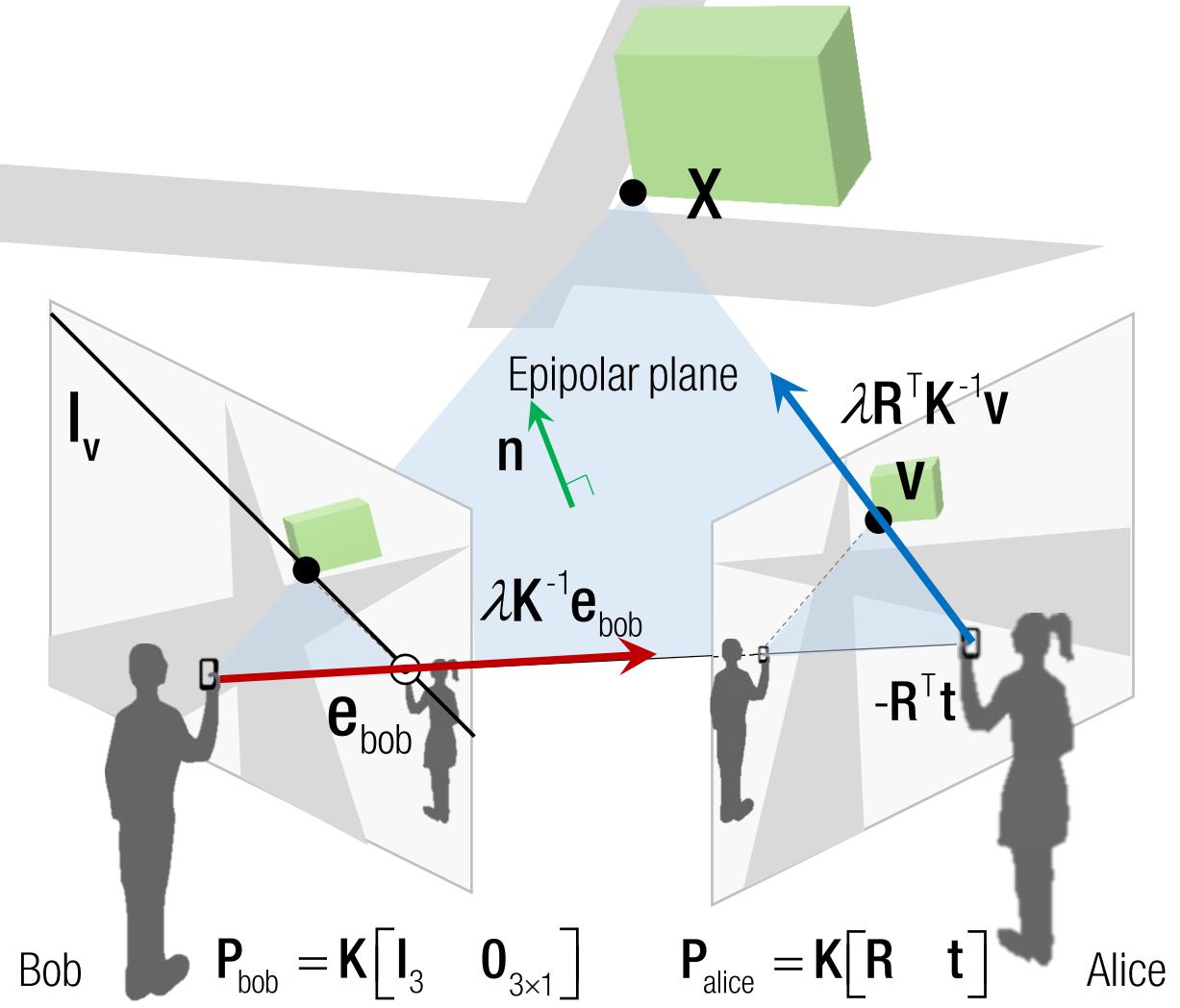
$$\rightarrow n = R^T t \times (\lambda R^T K^{-1} v - R^T t)$$

$$= R^T t \times R^T K^{-1} v$$

$$= R^T (t \times K^{-1} v) \quad : \text{only works for rotation}$$

$$= R^T [t] K^{-1} v$$

# Epipolar Line



$$\lambda \mathbf{e}_{\text{bob}} = \mathbf{K} \mathbf{R}^T \mathbf{t}$$

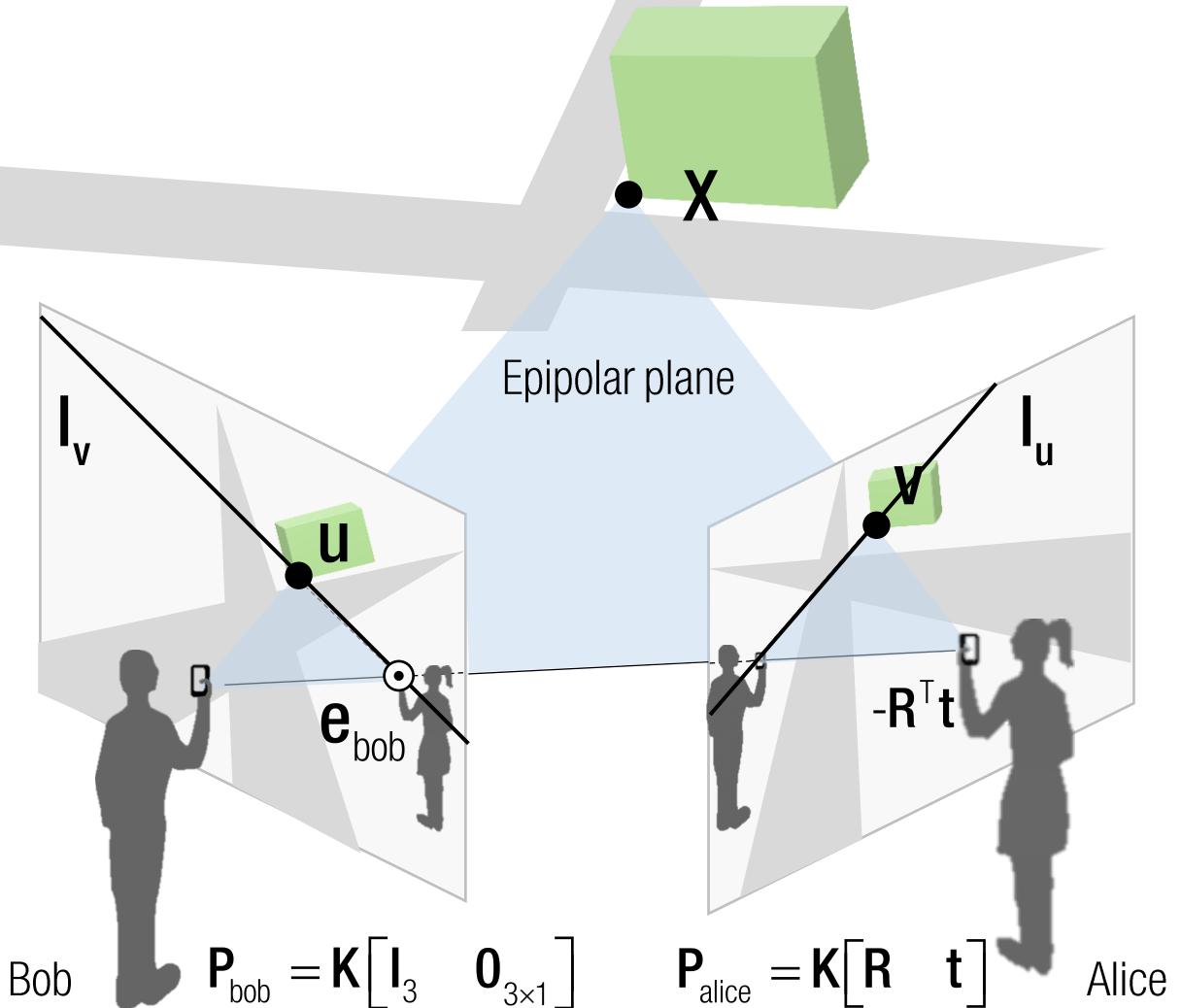
$$\lambda \mathbf{e}_{\text{alice}} = \mathbf{K} \mathbf{t}$$

$$\mathbf{l}_v = \mathbf{K}^{-T} \mathbf{n} = \mathbf{K}^{-T} \mathbf{R}^T [\mathbf{t}] \mathbf{K}^{-1} \mathbf{v} : \text{Epipolar line}$$

Epipolar constraint:

$$\mathbf{u}^T \mathbf{l}_v = \mathbf{u}^T \mathbf{K}^{-T} \mathbf{R}^T [\mathbf{t}] \mathbf{K}^{-1} \mathbf{v} = 0$$

# Epipolar Line



$$\lambda e_{\text{bob}} = KR^T t$$

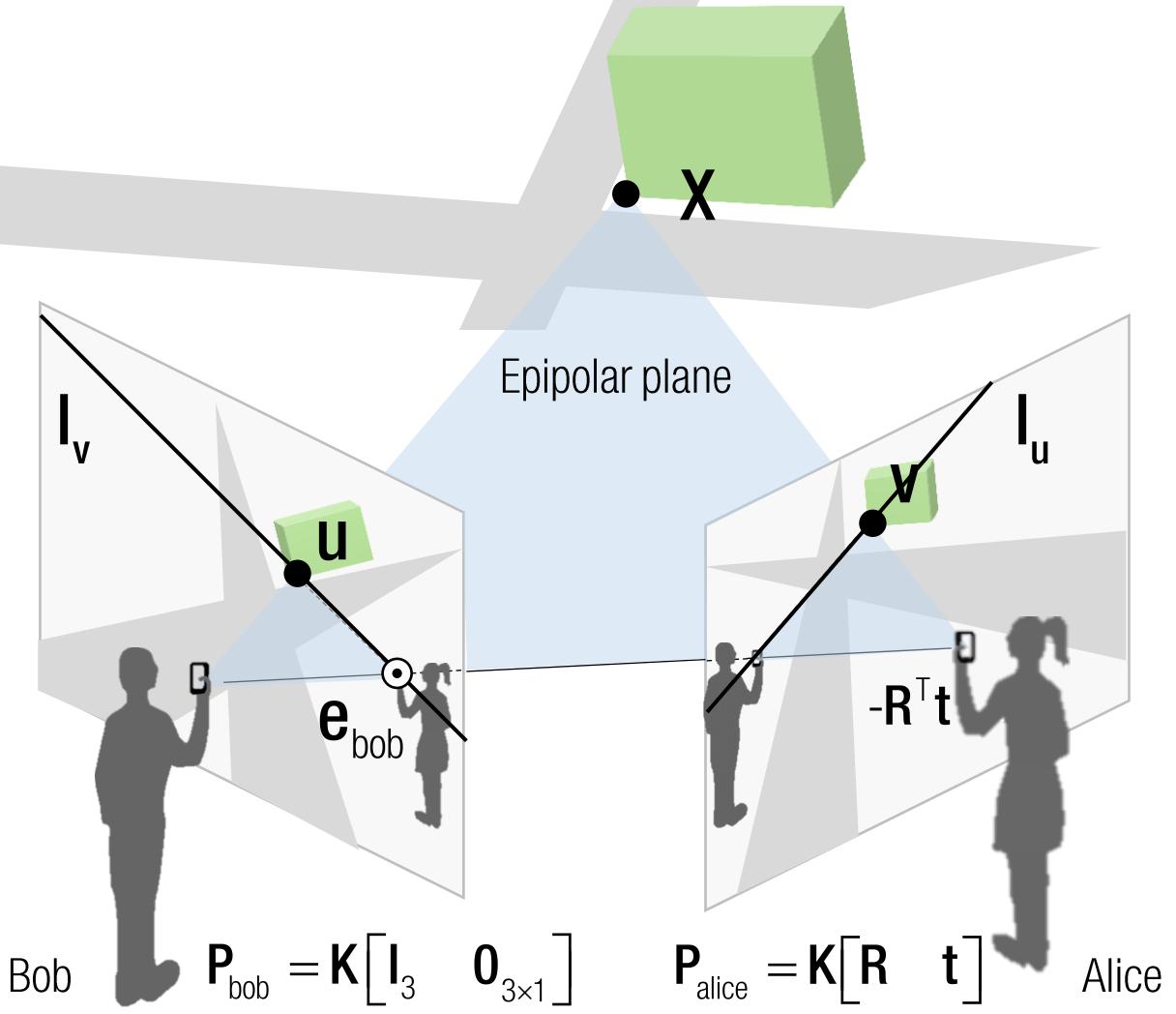
$$\lambda e_{\text{alice}} = Kt$$

$$I_v = K^{-T} n = K^{-T} R^T [t] K^{-1} v \quad : \text{Epipolar line}$$

Epipolar constraint:

$$u^T I_v = u^T K^{-T} R^T [t] K^{-1} v = 0$$

# Epipolar Line



$$\lambda e_{\text{bob}} = KR^T t \quad \lambda e_{\text{alice}} = Kt$$

$$I_v = K^{-T} n = K^{-T} R^T [t] \times K^{-1} v \quad : \text{Epipolar line}$$

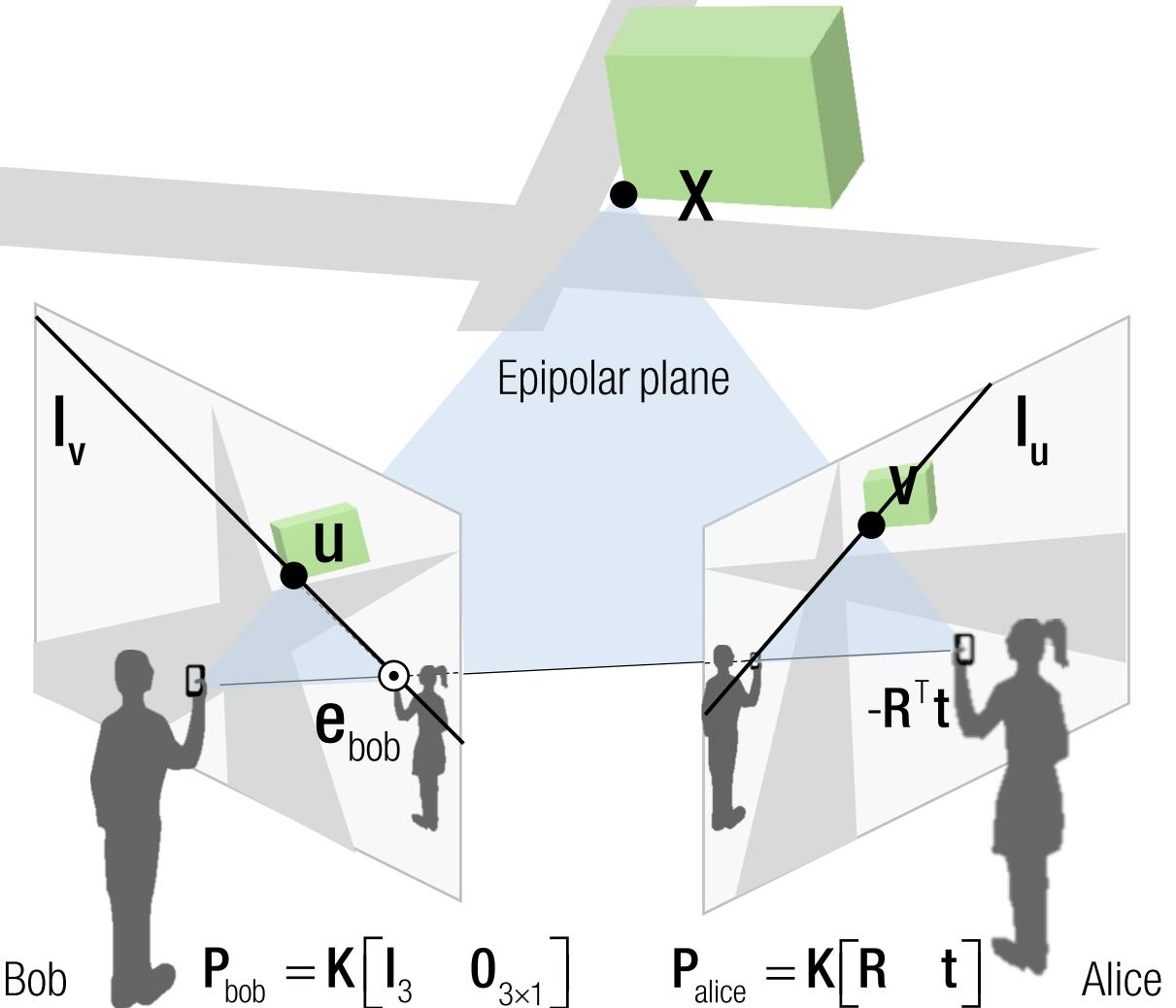
Epipolar constraint:

$$\frac{u^T I_v = u^T K^{-T} R^T [t] \times K^{-1} v = 0}{I_u^T}$$

$$I_u = -K^{-T} [t] \times R K^{-1} u \quad \because [t]^T = -[t] \times$$

Skew symmetric matrix

# Fundamental Matrix



$$\lambda e_{\text{bob}} = KR^T t \quad \lambda e_{\text{alice}} = Kt$$

$$l_v = K^{-T} n = K^{-T} R^T [t] \times K^{-1} v \quad : \text{Epipolar line}$$

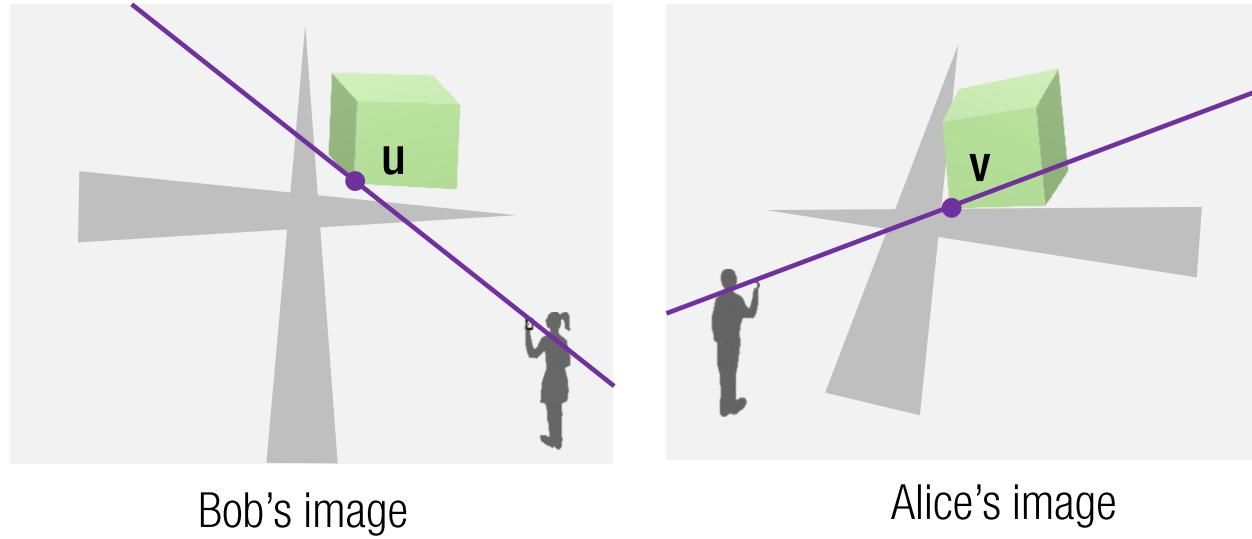
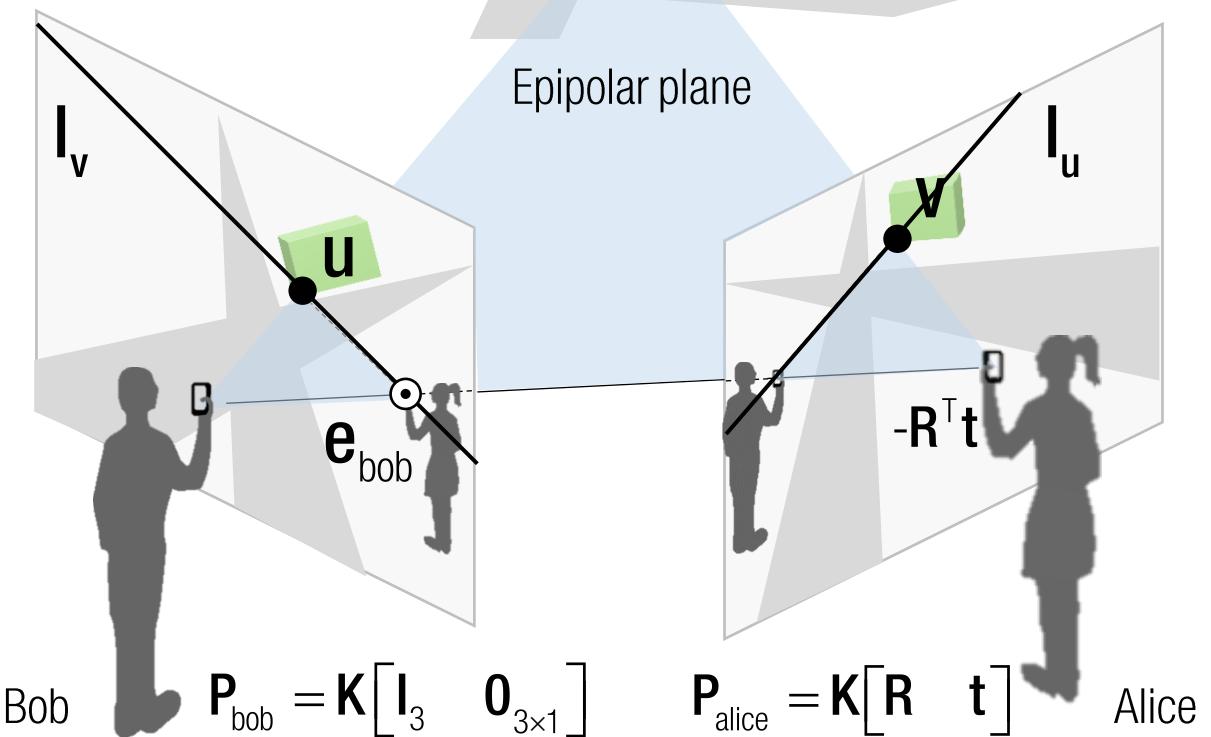
Epipolar constraint:

$$\frac{u^T l_v = u^T K^{-T} R^T [t] \times K^{-1} v = 0}{l_u^T}$$

$$\frac{l_u = -K^{-T} [t] \times R K^{-1} u}{\text{Common for all points}}$$

$$\therefore [t]^T = -[t] \quad \text{Skew symmetric matrix}$$

# Fundamental Matrix

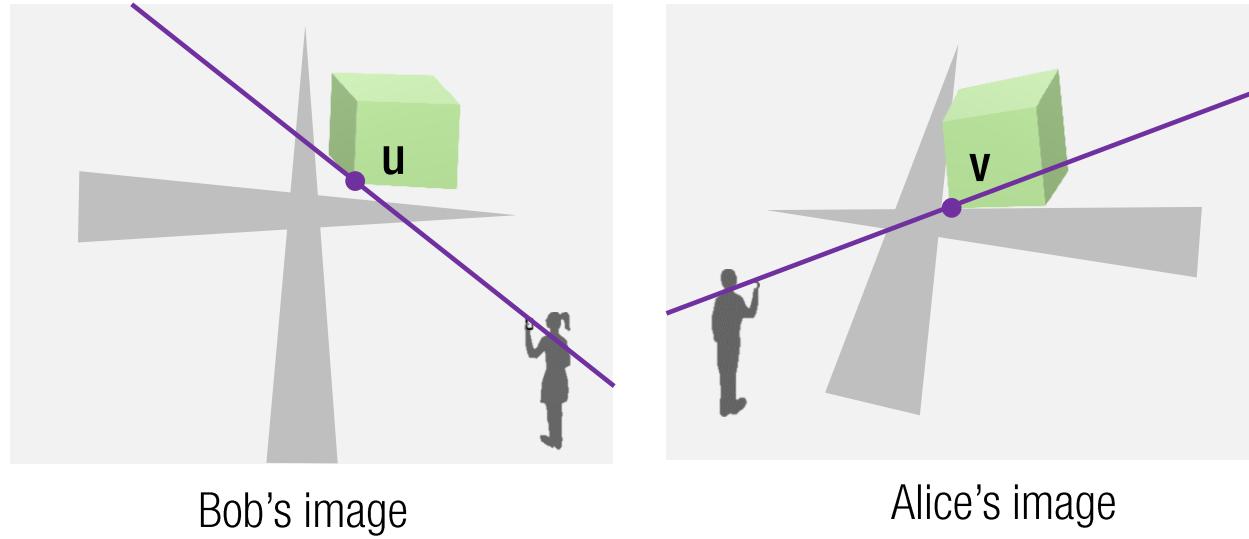
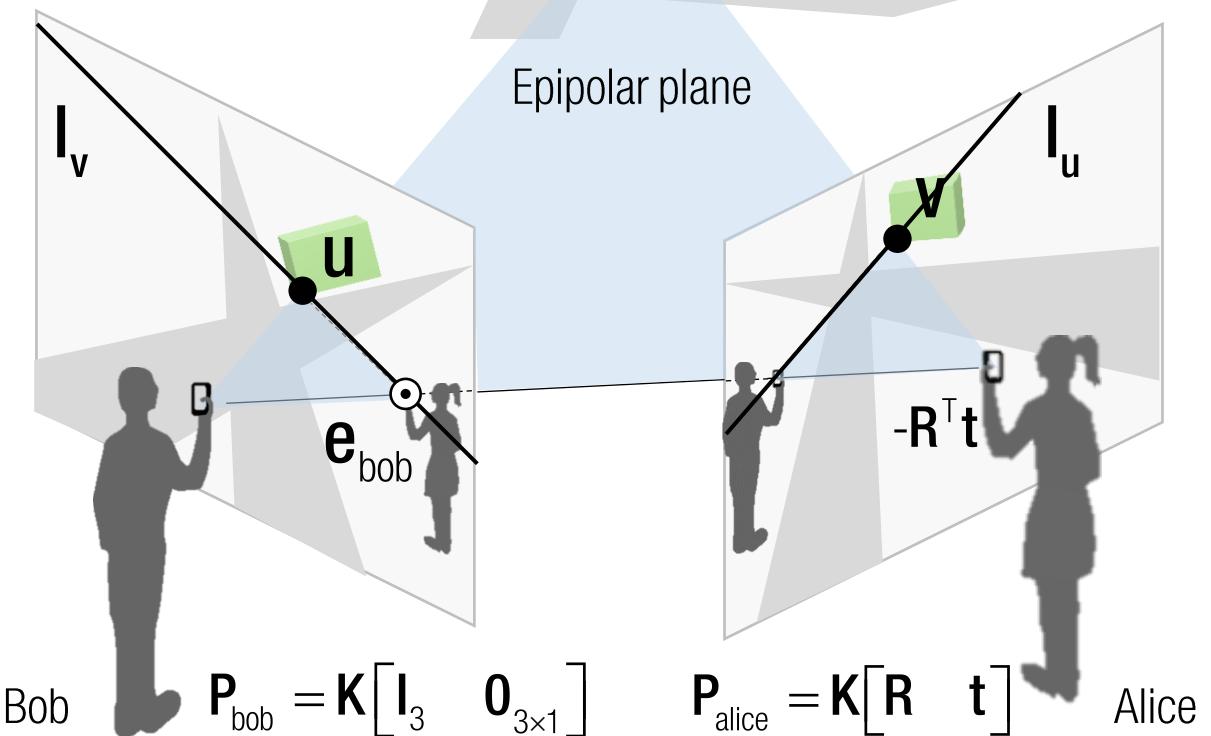


$$\mathbf{v}^T \mathbf{l}_u = \mathbf{v}^T \mathbf{K}^{-T} \begin{bmatrix} \mathbf{t} \end{bmatrix}_x \mathbf{R} \mathbf{K}^{-1} \mathbf{u} = 0$$


---

Common for all points

# Fundamental Matrix



$$v^T l_u = v^T K^{-T} \begin{bmatrix} t \end{bmatrix}_x R K^{-1} u = 0$$

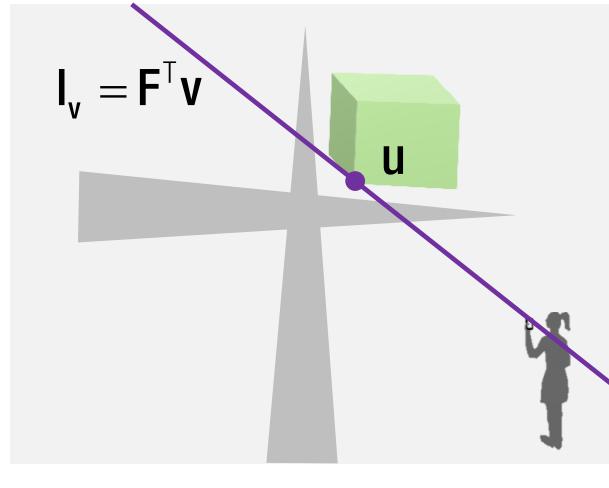
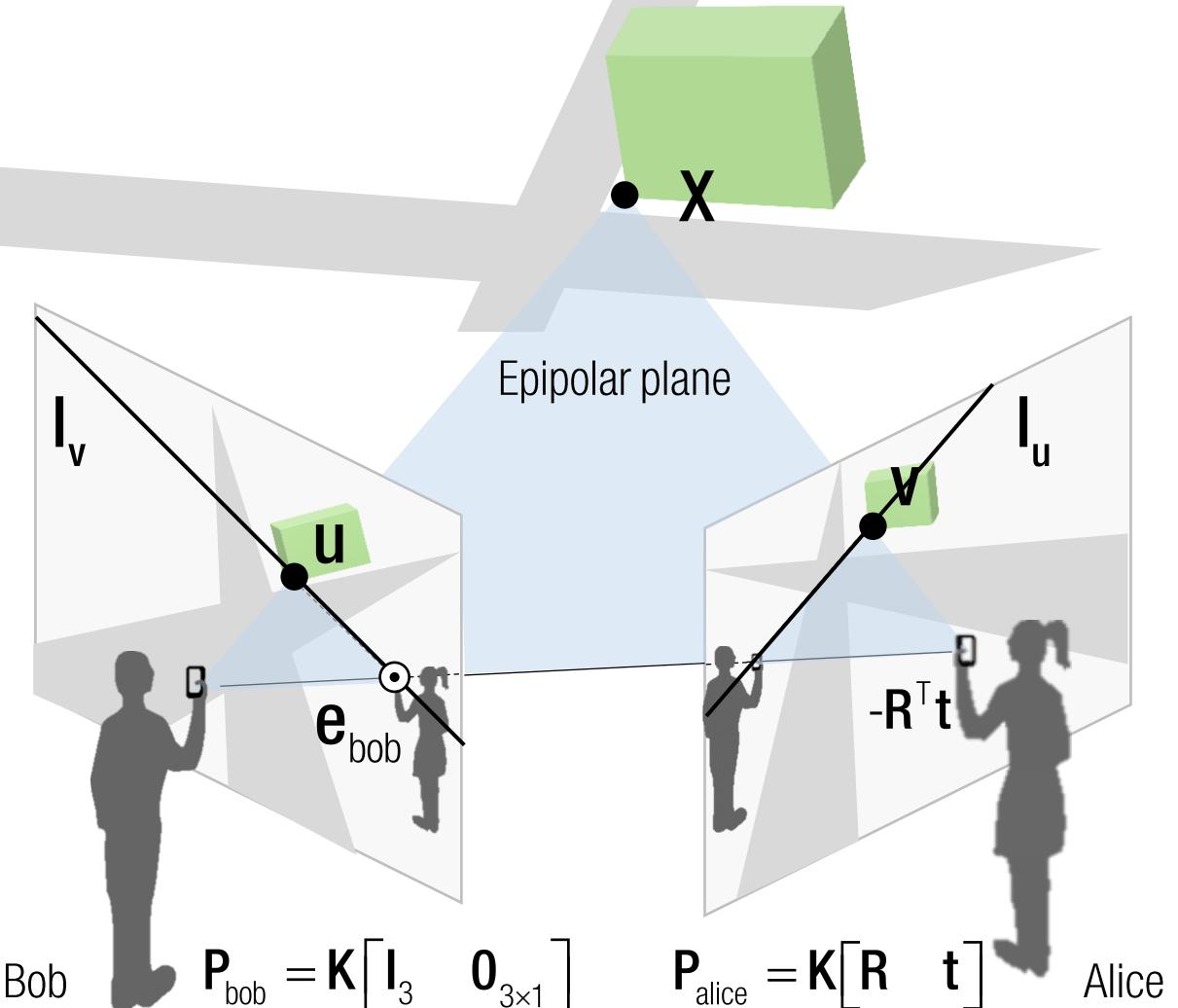
Common for all points

$$= v^T F u = 0$$

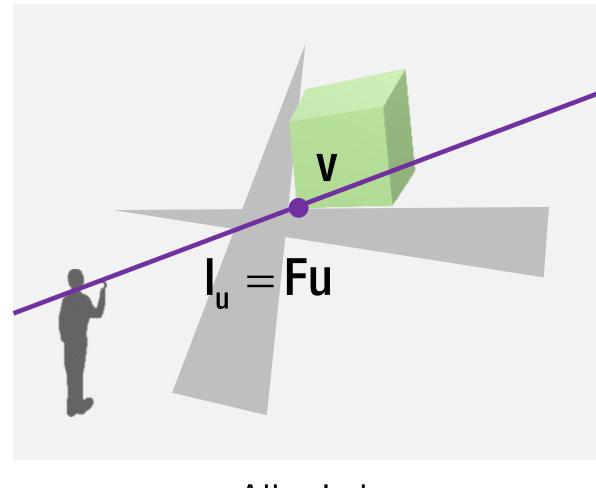
where  $F = K^{-T} \begin{bmatrix} t \end{bmatrix}_x R K^{-1}$

Fundamental matrix

# Fundamental Matrix



Bob's image



Alice's image

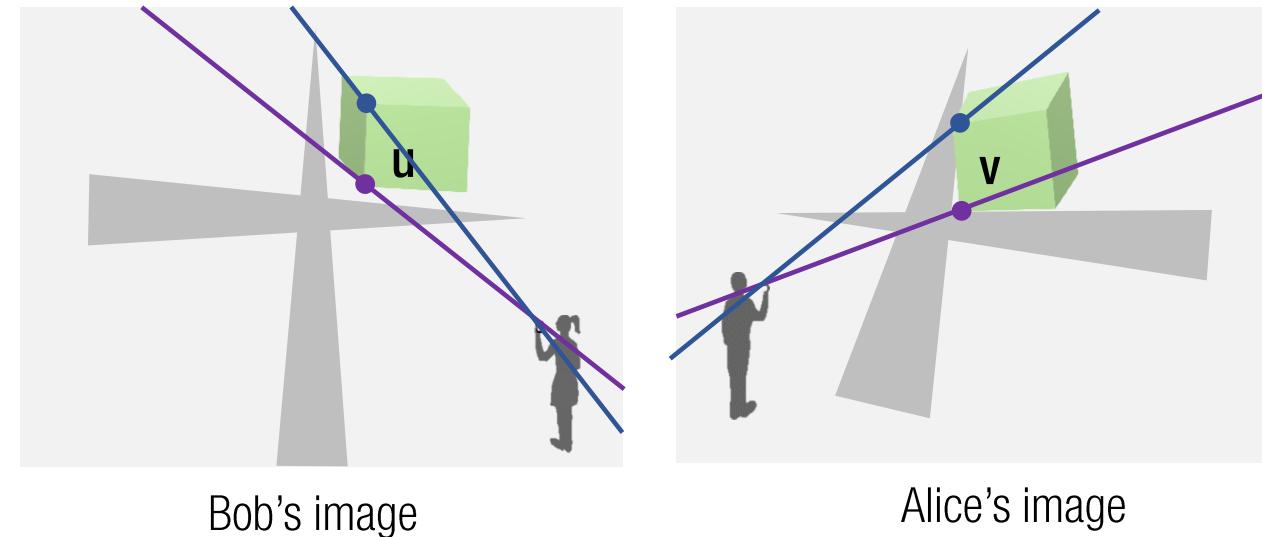
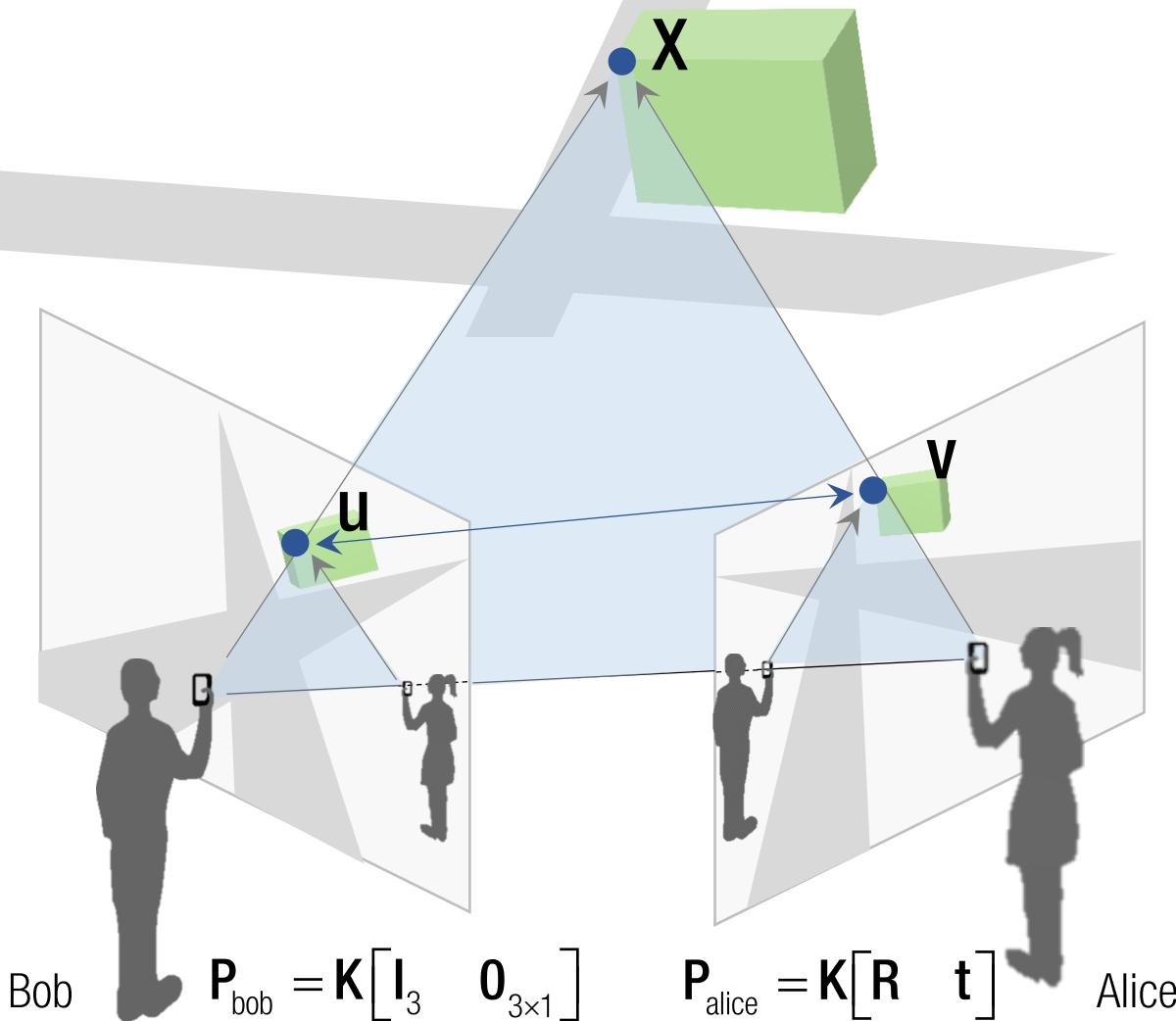
$$v^T l_u = v^T K^{-T} \begin{bmatrix} t \end{bmatrix}_x R K^{-1} u = 0$$

Common for all points

$$= v^T Fu = 0$$

$$= v^T (Fu) = u^T (F^T v) = 0$$

# Fundamental Matrix



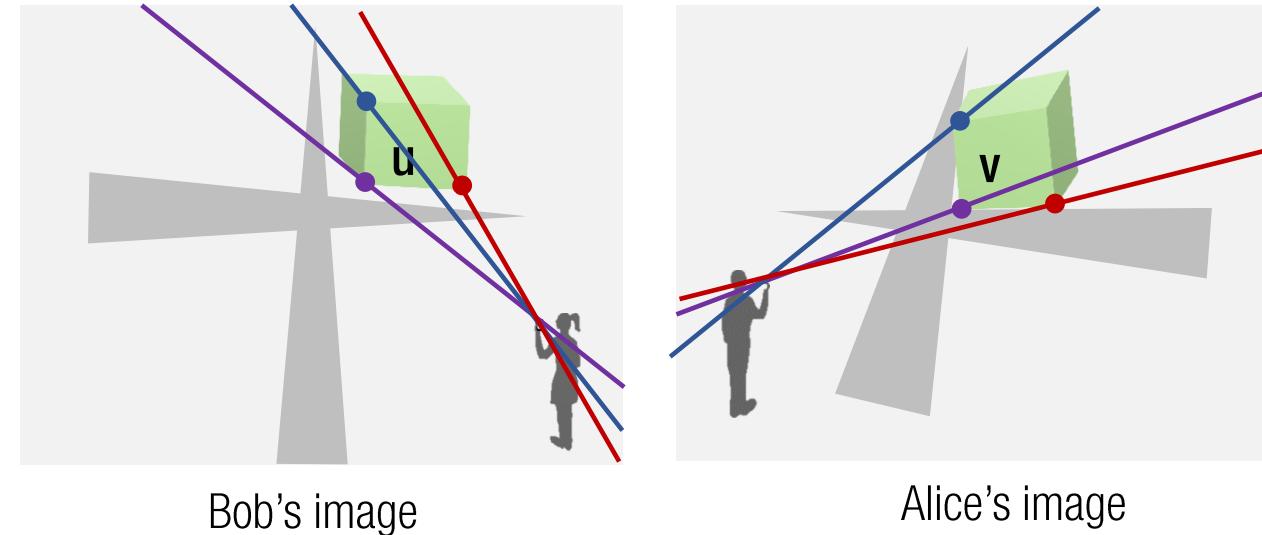
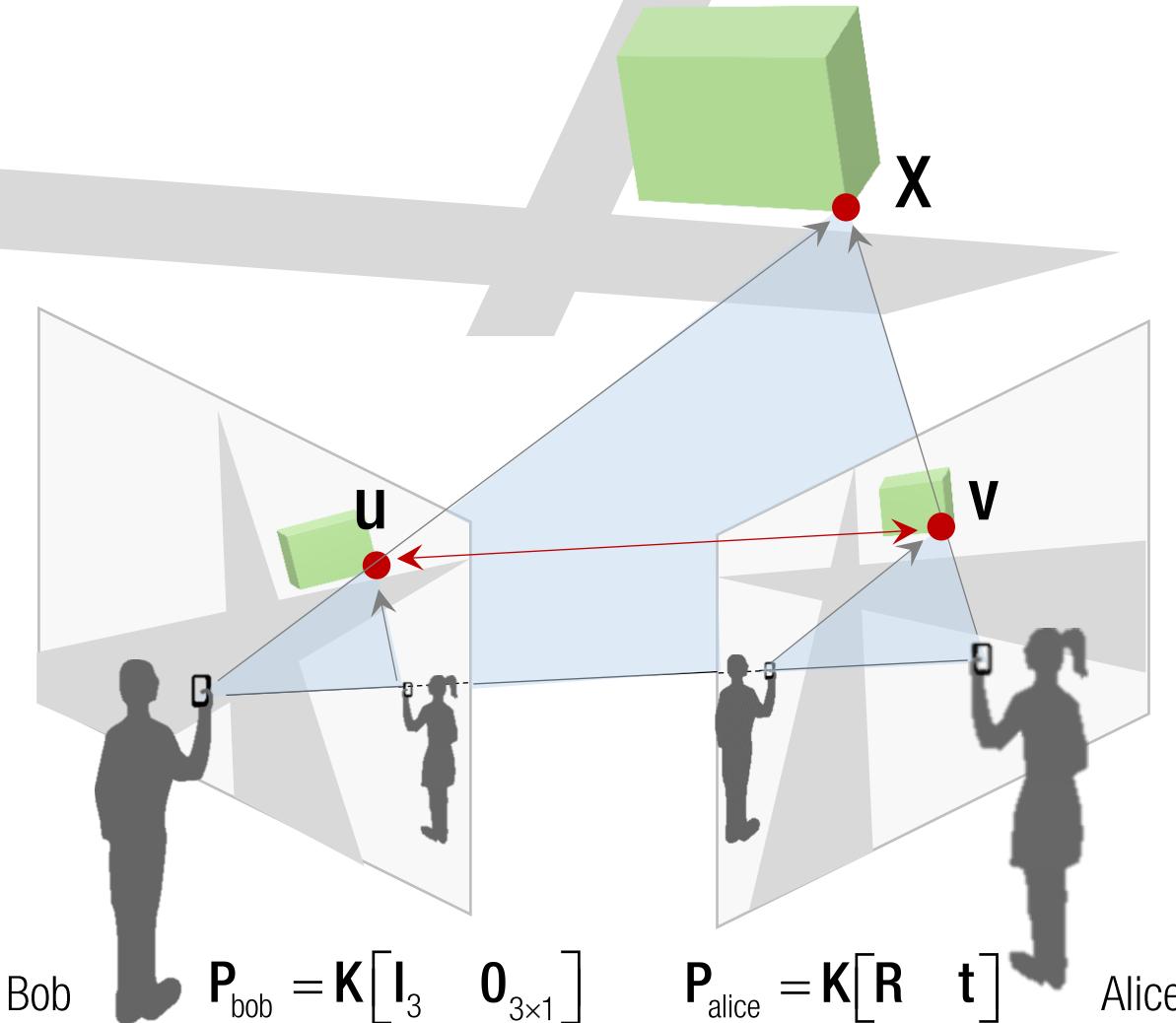
$$v^T I_u = v^T K^{-T} [t]_x R K^{-1} u = 0$$

Common for all points

$$= v^T F u = 0$$

$$= v^T (F u) = u^T (F^T v) = 0$$

# Fundamental Matrix



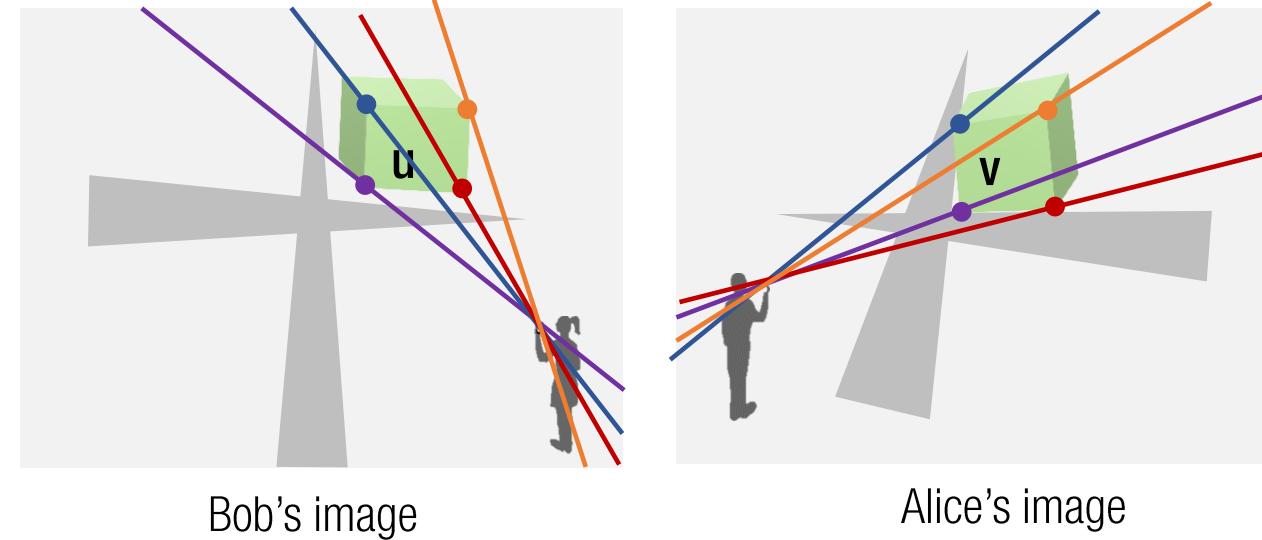
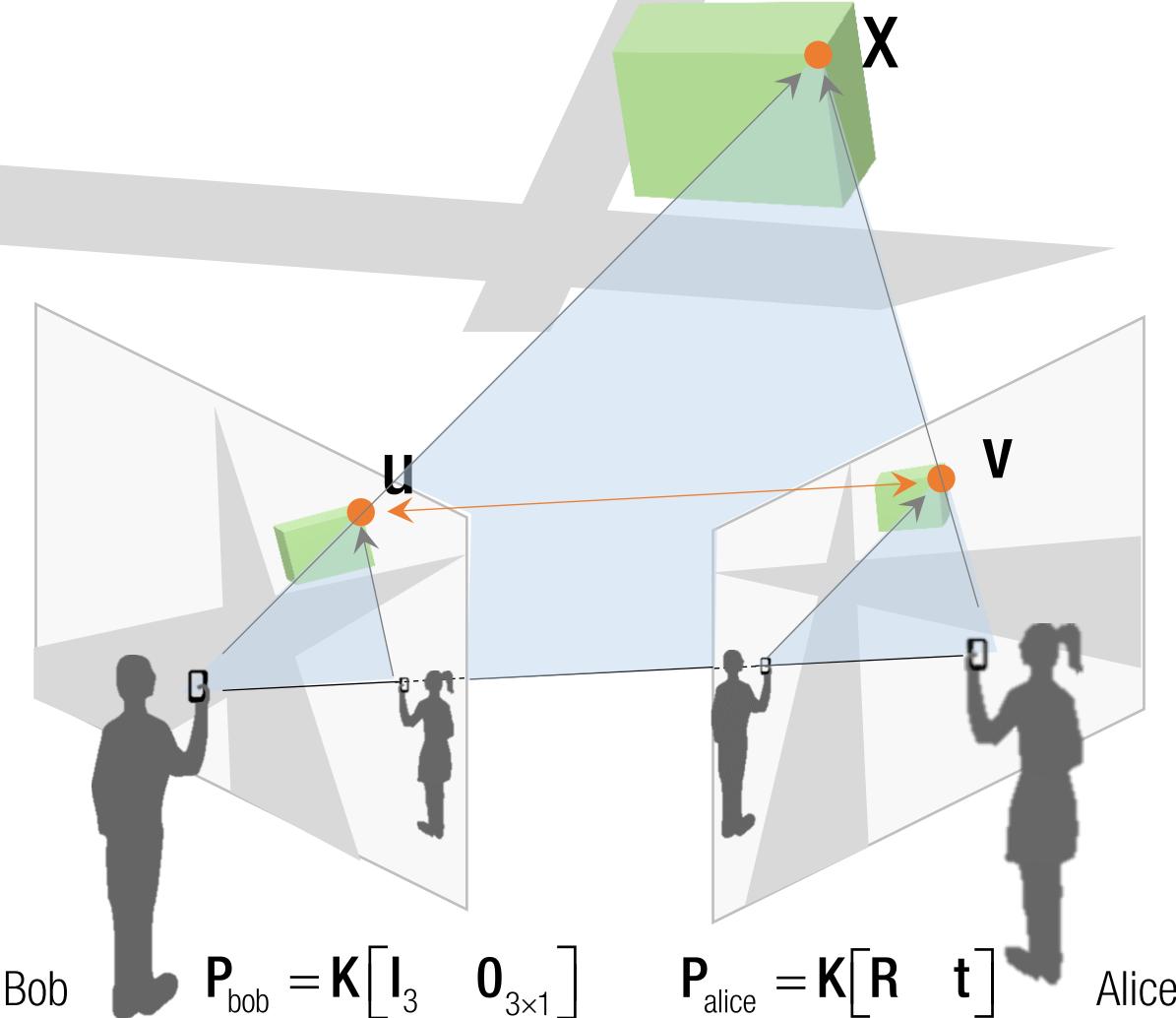
$$v^T I_u = v^T K^{-T} [t]_x R K^{-1} u = 0$$

Common for all points

$$= v^T F u = 0$$

$$= v^T (F u) = u^T (F^T v) = 0$$

# Fundamental Matrix



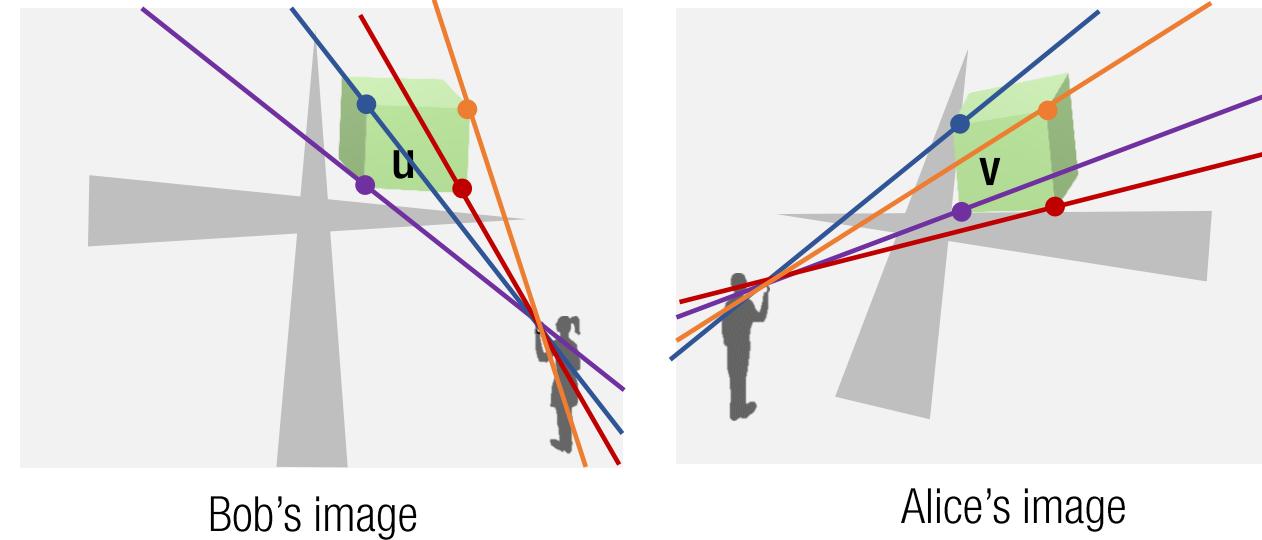
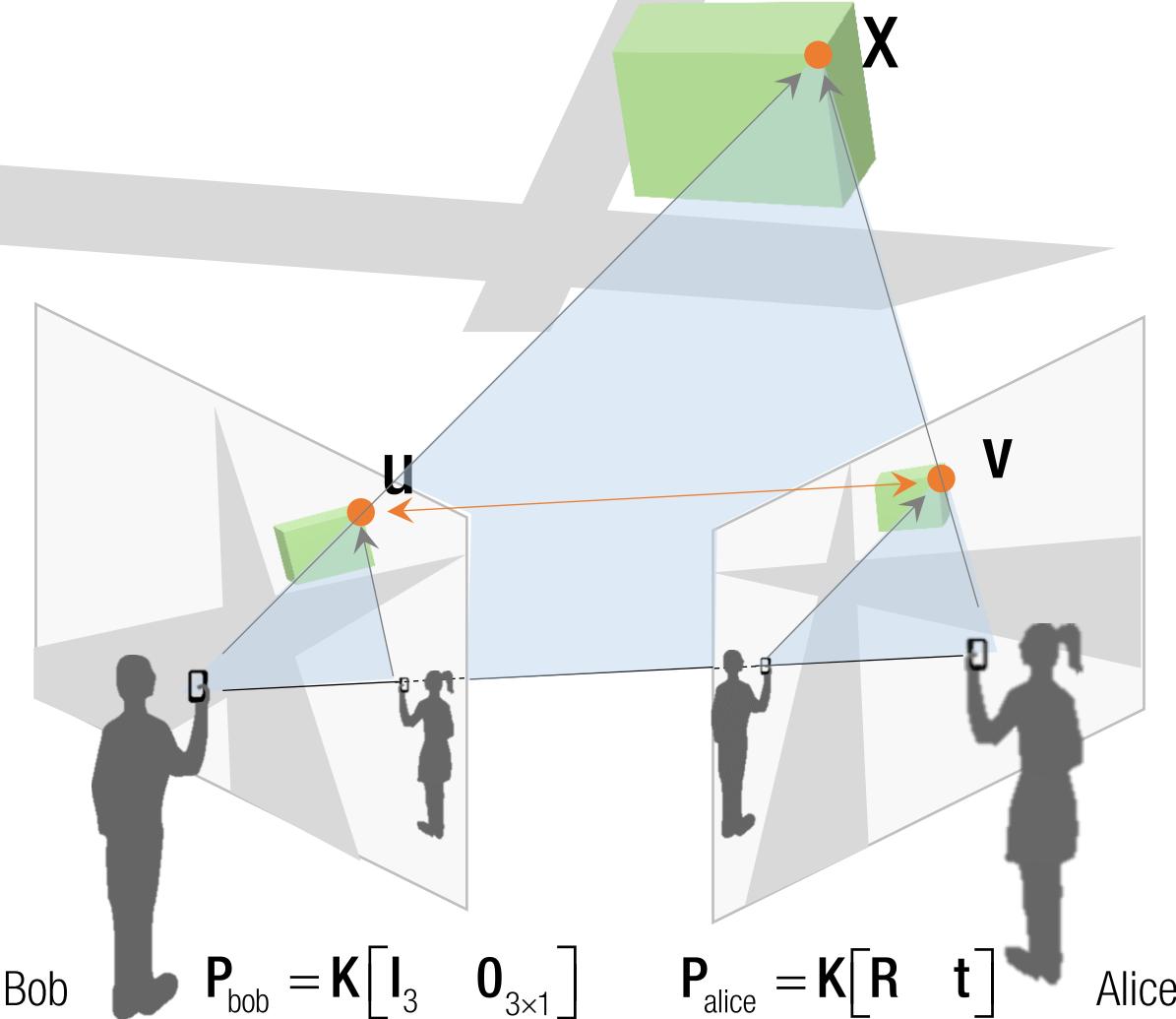
$$v^T I_u = v^T K^{-T} [t]_x R K^{-1} u = 0$$

Common for all points

$$= v^T F u = 0$$

$$= v^T (F u) = u^T (F^T v) = 0$$

# Fundamental Matrix



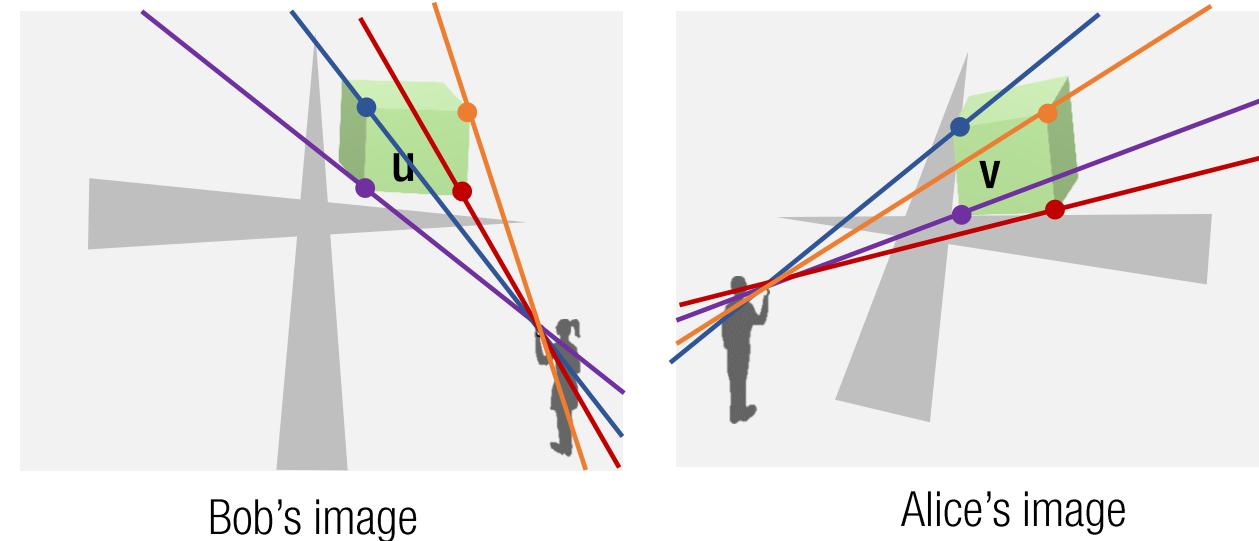
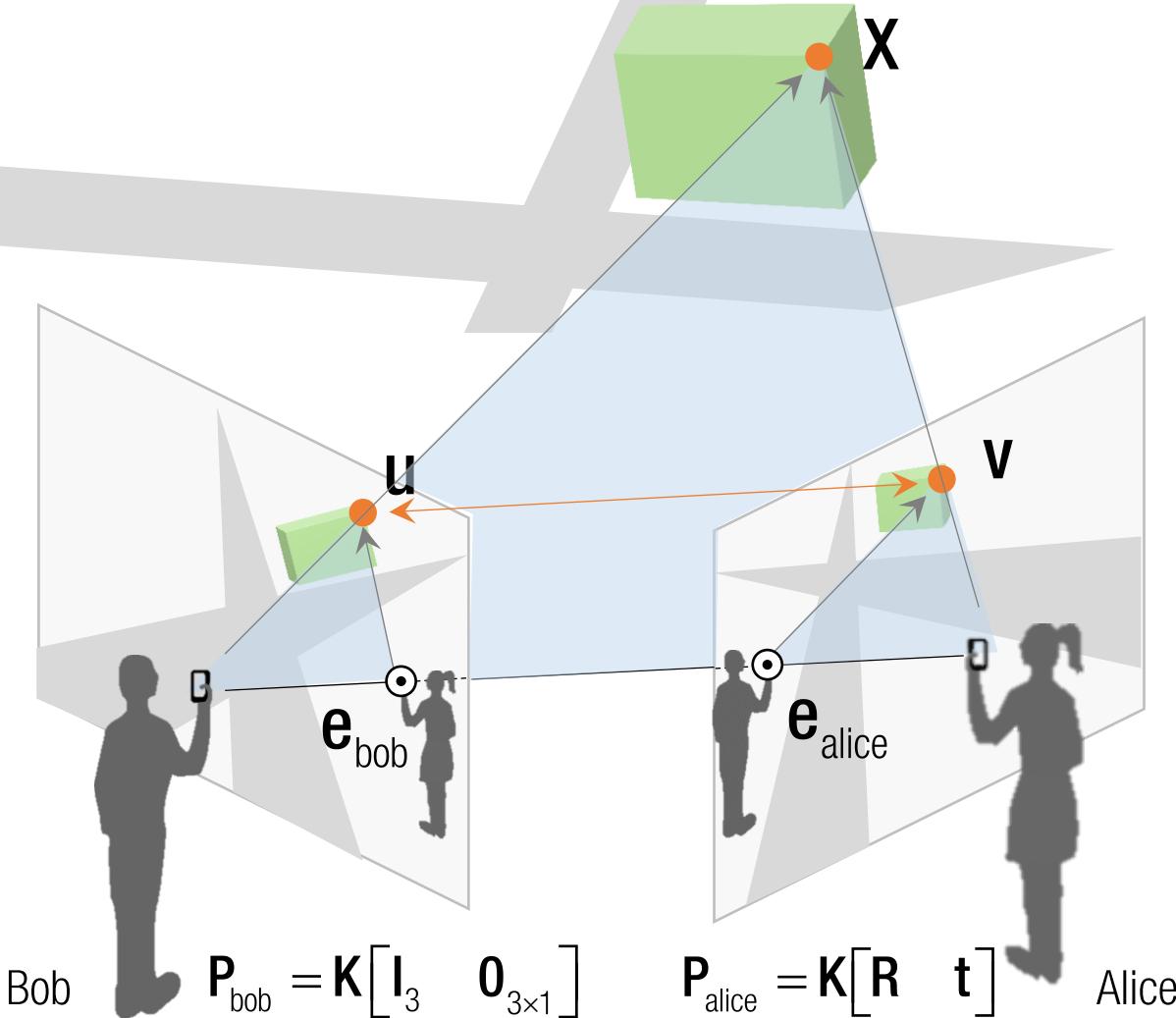
$$\mathbf{v}^T \mathbf{I}_u = \mathbf{v}^T \mathbf{K}^{-T} \begin{bmatrix} \mathbf{t} \end{bmatrix}_x \mathbf{R} \mathbf{K}^{-1} \mathbf{u} = 0$$

Common for all points

$$= \mathbf{v}^T \mathbf{F} \mathbf{u} = 0$$

$$= \mathbf{v}^T (\mathbf{F} \mathbf{u}) = \mathbf{u}^T (\mathbf{F}^T \mathbf{v}) = 0$$

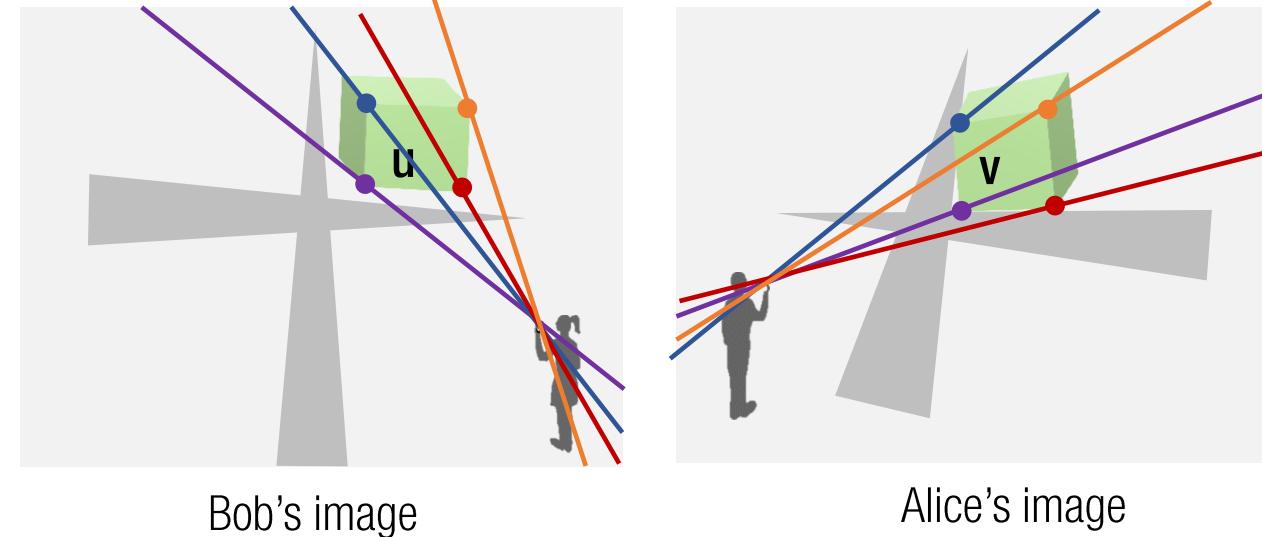
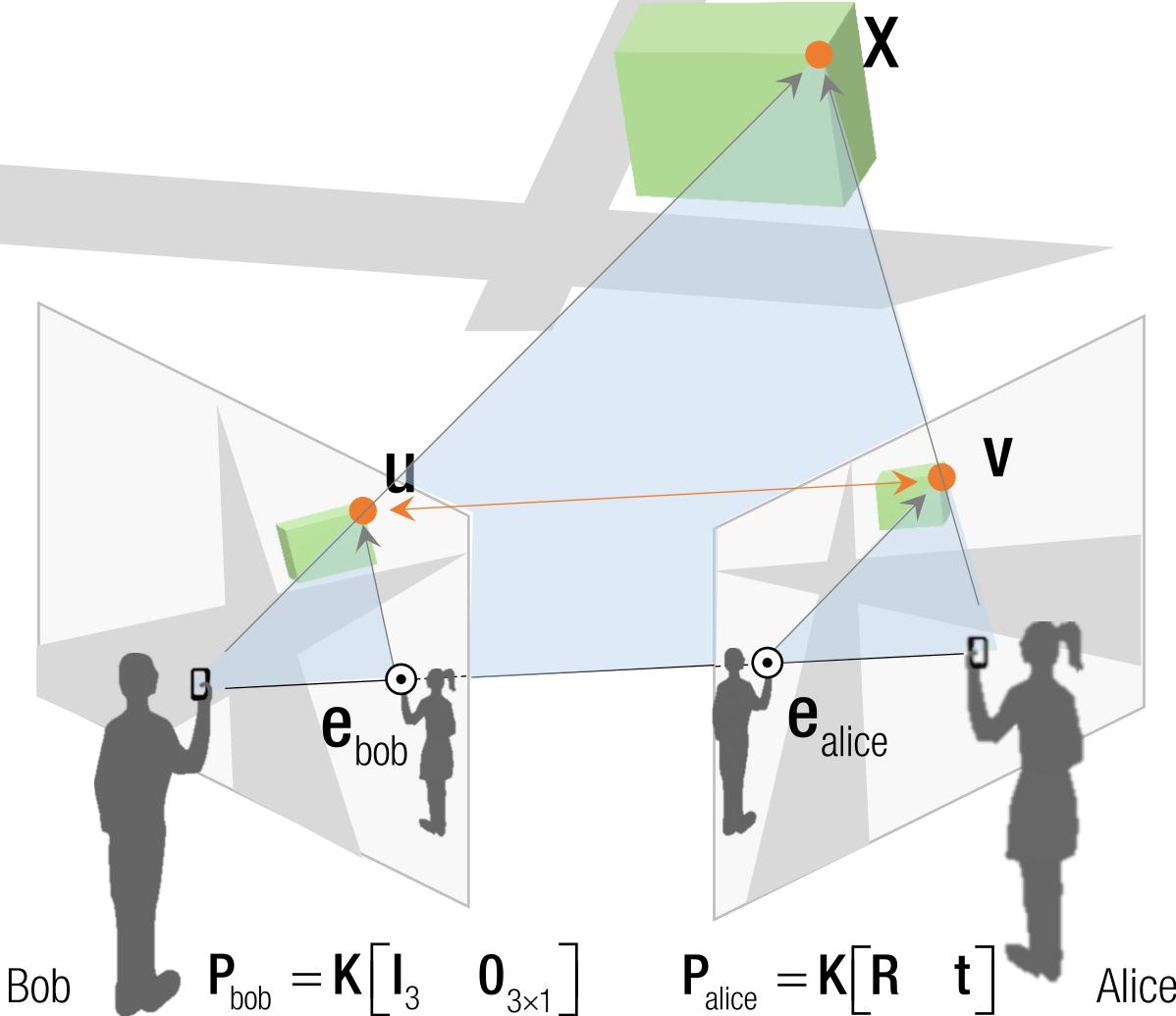
# Fundamental Matrix



## Properties of Fundamental Matrix

- Transpose: if  $\mathbf{F}$  is for  $P_{\text{bob}}, P_{\text{alice}}$ , then  $\mathbf{F}^T$  is for  $P_{\text{alice}}, P_{\text{bob}}$ .

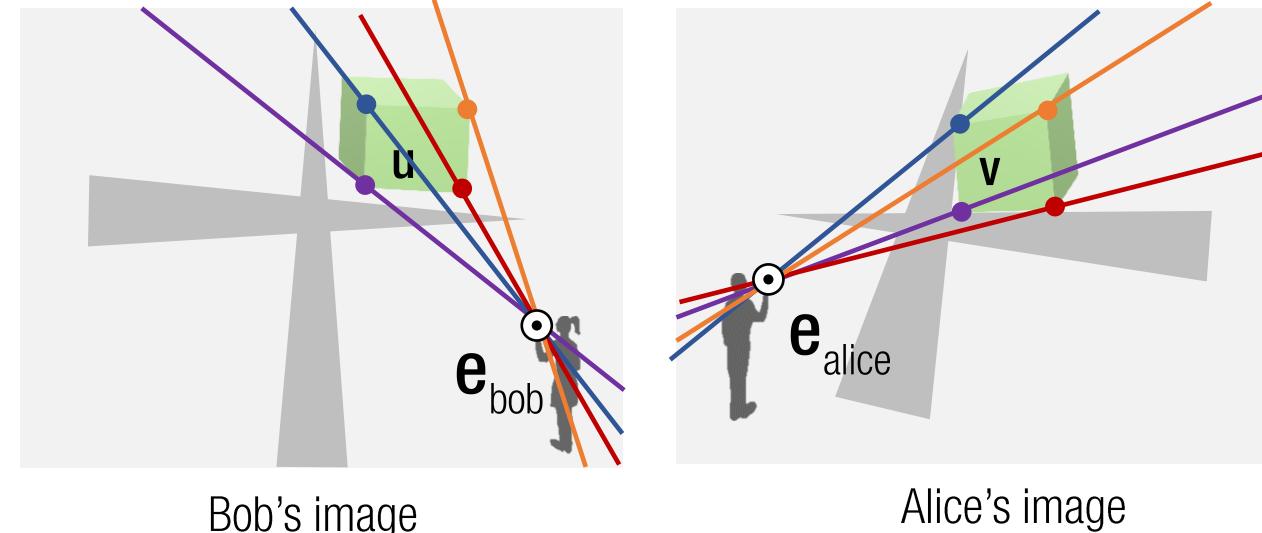
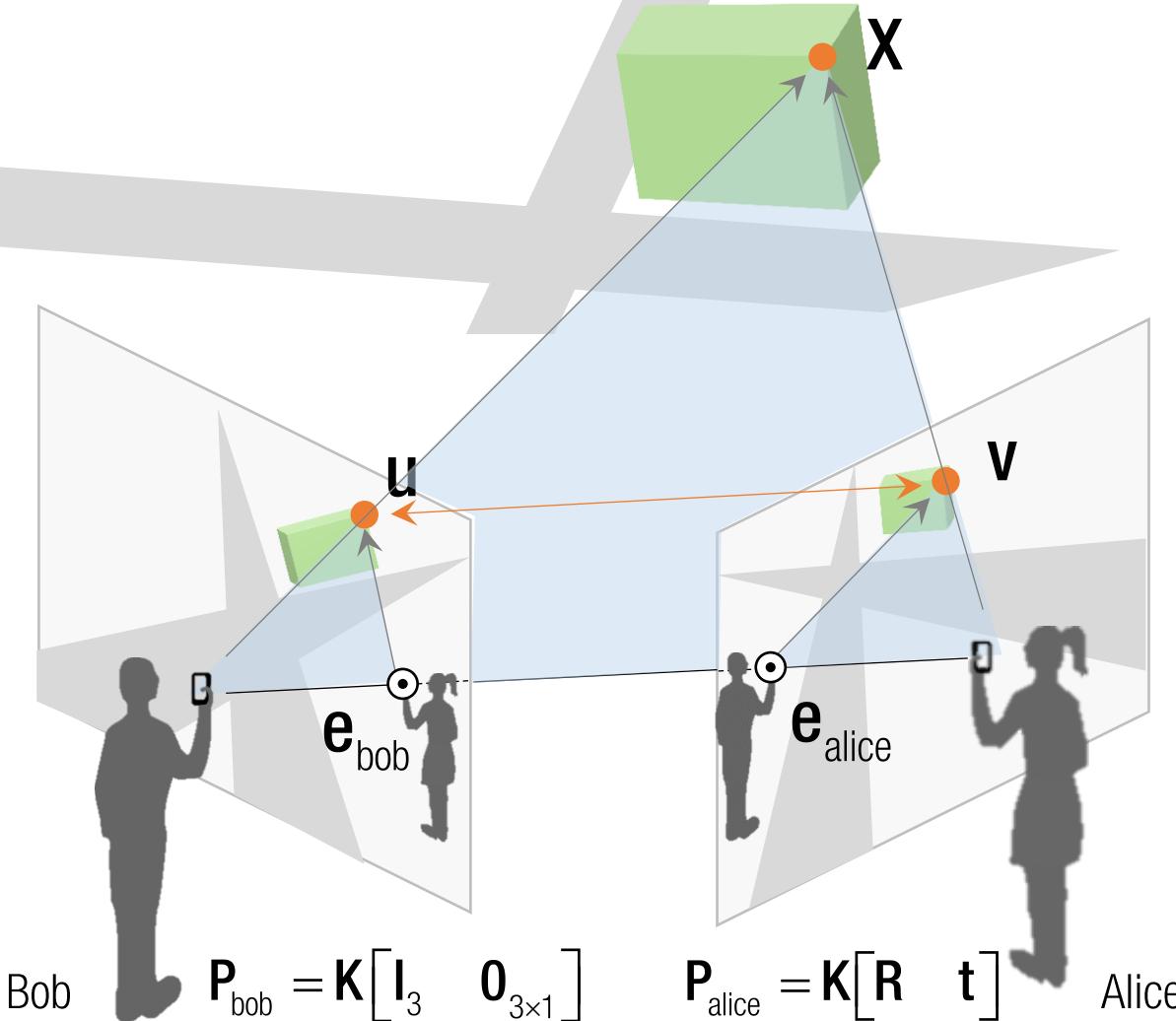
# Fundamental Matrix



## Properties of Fundamental Matrix

- Transpose: if  $\mathbf{F}$  is for  $\mathbf{P}_{\text{bob}}, \mathbf{P}_{\text{alice}}$ , then  $\mathbf{F}^T$  is for  $\mathbf{P}_{\text{alice}}, \mathbf{P}_{\text{bob}}$ .
- Epipolar line:  $\mathbf{l}_u = \mathbf{Fu}$      $\mathbf{l}_v = \mathbf{F}^T \mathbf{v}$

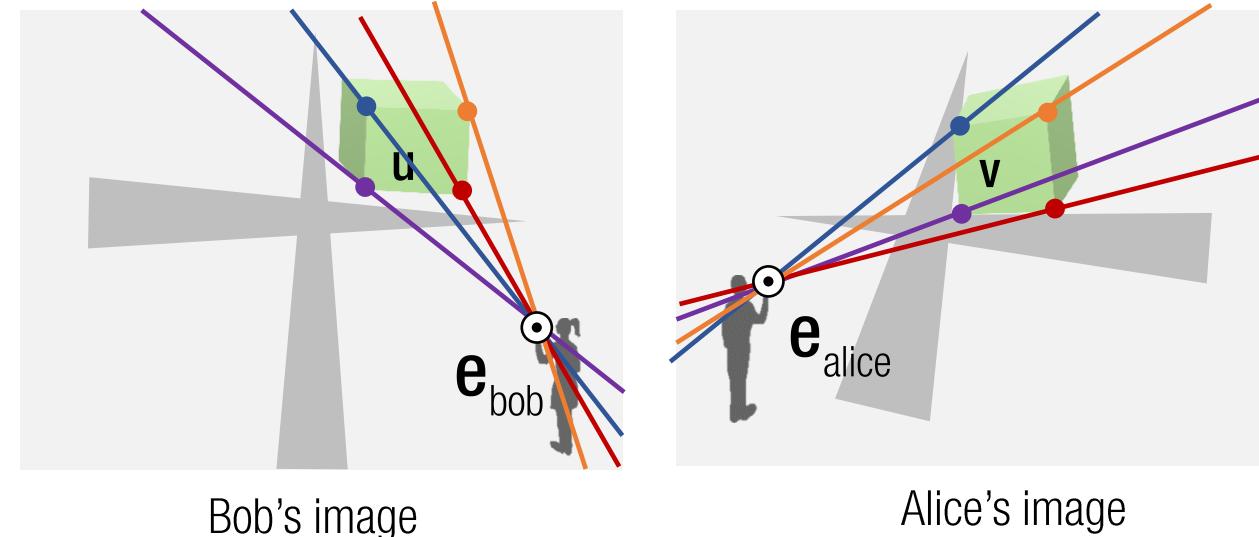
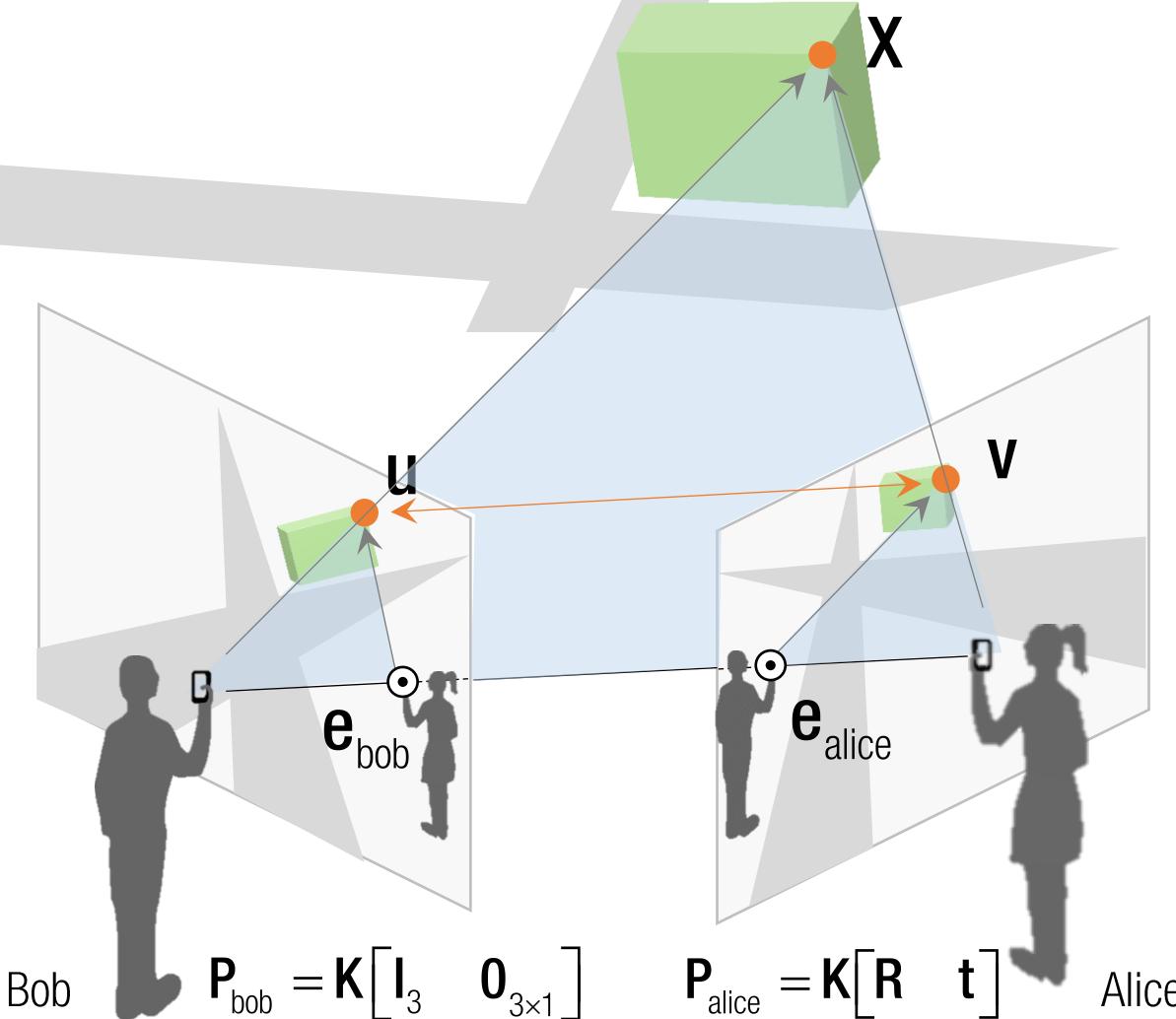
# Fundamental Matrix



## Properties of Fundamental Matrix

- Transpose: if  $\mathbf{F}$  is for  $P_{\text{bob}}, P_{\text{alice}}$ , then  $\mathbf{F}^T$  is for  $P_{\text{alice}}, P_{\text{bob}}$ .
- Epipolar line:  $\mathbf{l}_u = \mathbf{F}u \quad \mathbf{l}_v = \mathbf{F}^T v$
- Epipole:  $\mathbf{F}e_{\text{bob}} = 0 \quad \mathbf{F}^T e_{\text{alice}} = 0$   
 $\therefore v_i^T \mathbf{F} e_{\text{bob}} = 0, \quad u_i^T \mathbf{F}^T e_{\text{alice}} = 0, \quad \forall i$   
 $\rightarrow e_{\text{bob}} = \text{null}(\mathbf{F}), \quad e_{\text{alice}} = \text{null}(\mathbf{F}^T)$

# Fundamental Matrix



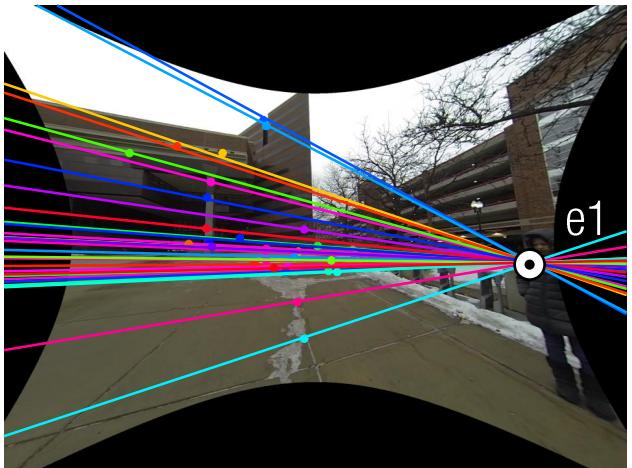
## Properties of Fundamental Matrix

- Transpose: if  $\mathbf{F}$  is for  $P_{\text{bob}}, P_{\text{alice}}$ , then  $\mathbf{F}^T$  is for  $P_{\text{alice}}, P_{\text{bob}}$ .
- Epipolar line:  $I_u = \mathbf{F}u \quad I_v = \mathbf{F}^T v$
- Epipole:  $\mathbf{F}e_{\text{bob}} = 0 \quad \mathbf{F}^T e_{\text{alice}} = 0$
- rank( $\mathbf{F}$ )=2: degree of freedom 9 (3x3 matrix)-1 (scale)-1 (rank)=7

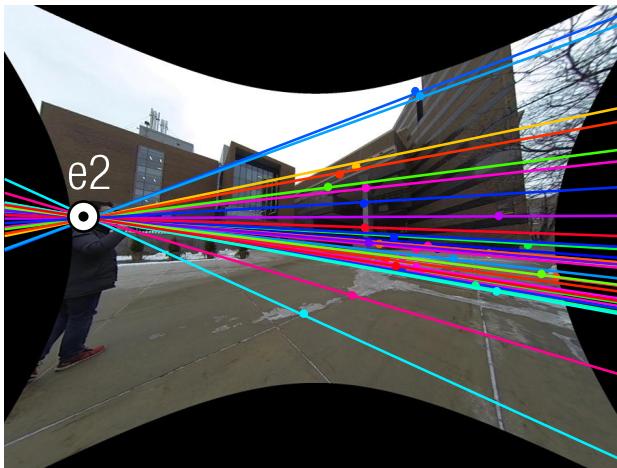
$$\mathbf{F} = \mathbf{K}_{\text{alice}}^{-T} \begin{bmatrix} \mathbf{t} \\ \mathbf{R} \end{bmatrix} \mathbf{R} \mathbf{K}_{\text{bob}}^{-1}$$

rank 2 matrix

# Fundamental Matrix



```
K =  
568.9961    0  643.2106  
0 568.9884 477.9828  
0    0  1.0000
```



```
R1 =  
0.4344  0.0271  0.9003  
-0.0139  0.9996 -0.0234  
-0.9006 -0.0024  0.4346
```

```
t1 =  
-1.8360  
-0.1582  
1.1219
```

```
F = inv(K)'*Vec2Skew(t1)*R1*inv(K);
```

```
F =  
0.0000 -0.0000  0.0013  
-0.0000  0.0000  0.0055  
0.0016 -0.0010 -1.8055
```

```
Rank =  
2
```

```
e1 = null(F);  
e1 = e1(1:2)/e1(3)  
e1 =
```

```
2167.6  
1061.1
```

```
e2 = null(F');  
e2 = e2(1:2)/e2(3);  
e2 =  
352.0323  
877.7648
```

# Camera Motion



# Camera Motion



Image 2



Image 1

—  
Image 2

—  
Image 1

Forward motion

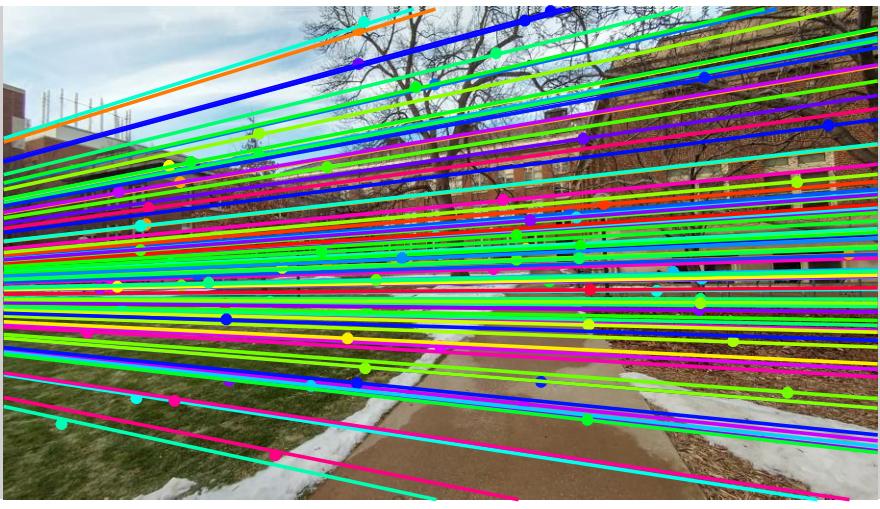


Image 2



Image 1

—  
Image 2      —  
Image 1

Lateral motion







