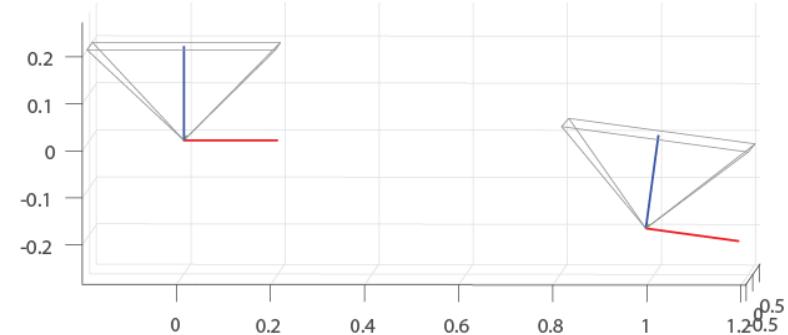
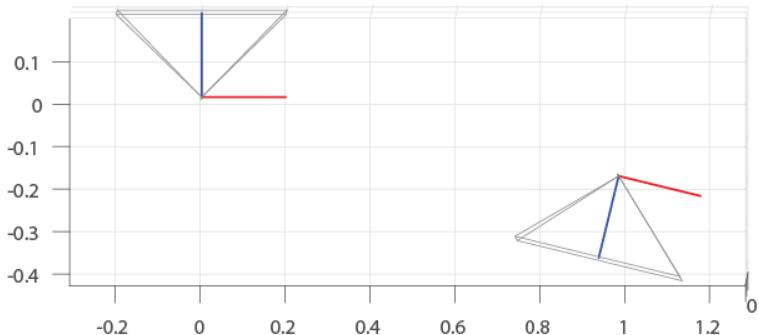
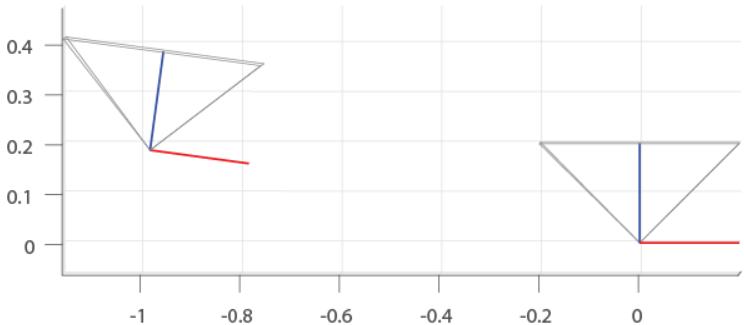
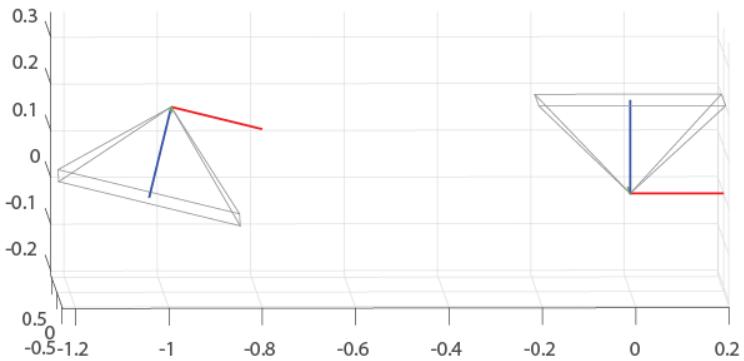


# *TRIANGULATION*

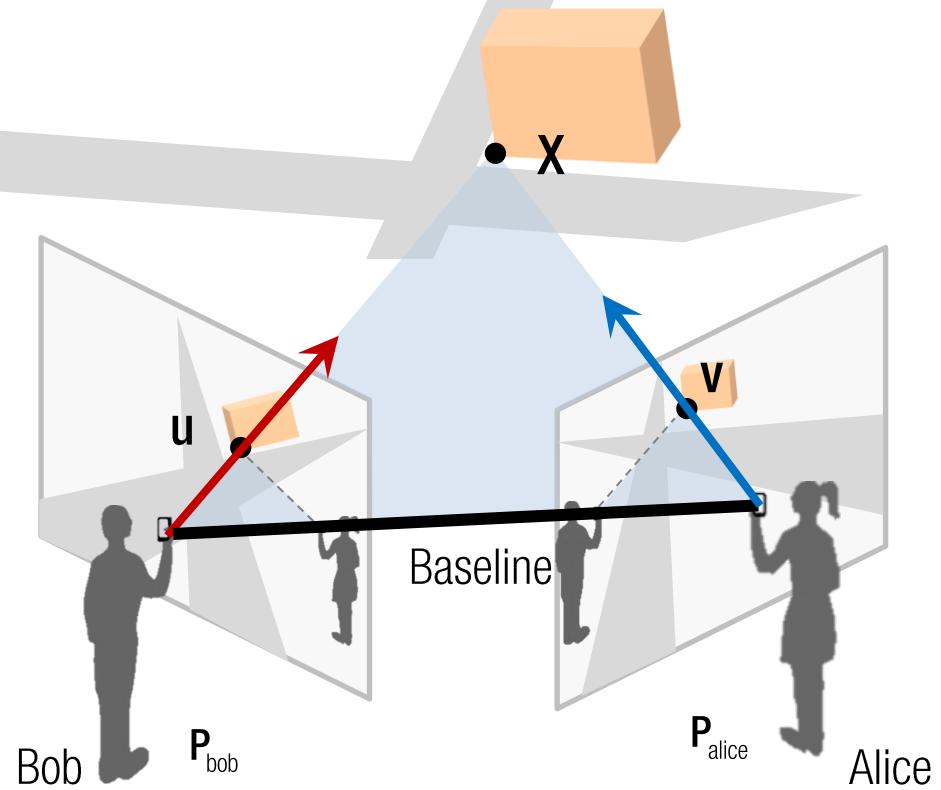
HYUN Soo PARK



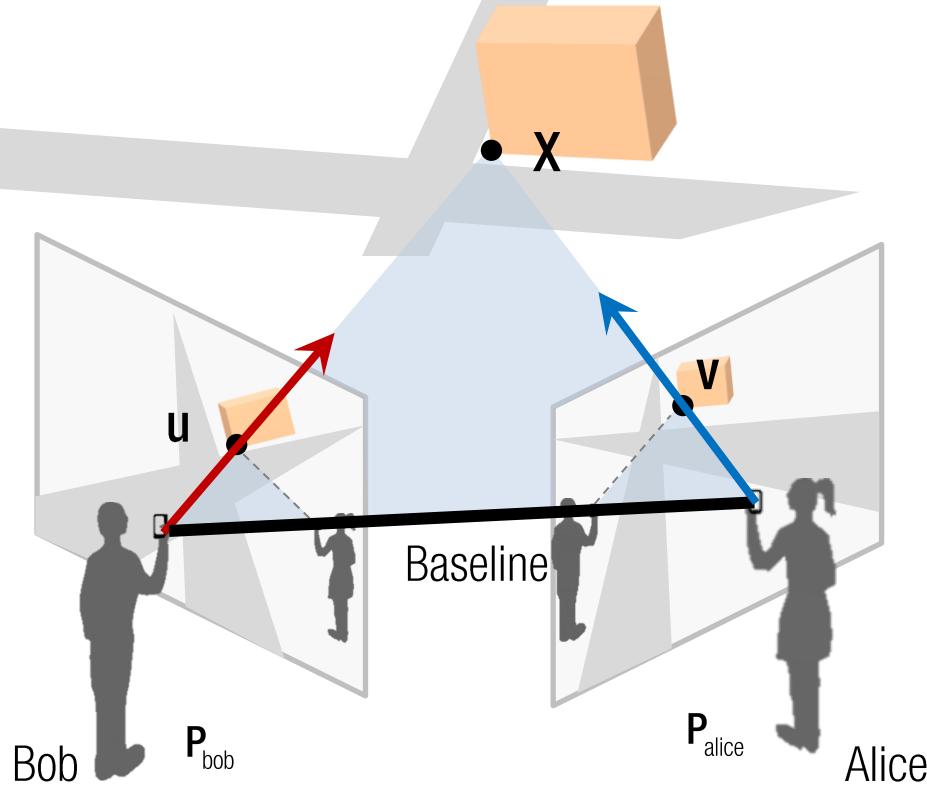
# POSE DISAMBIGUATION



# TRIANGULATION



# TRIANGULATION

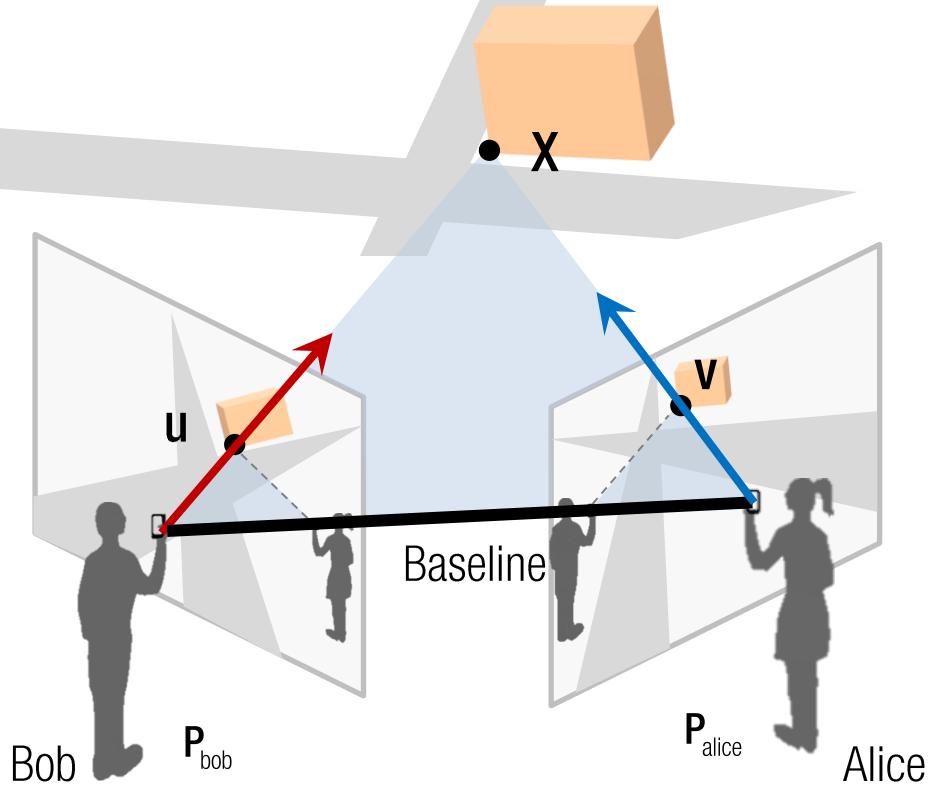


General camera pose

$$\lambda_1 \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} = \mathbf{P}_{\text{bob}} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix}$$

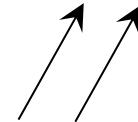
Two 3D vectors are parallel.

# TRIANGULATION



General camera pose

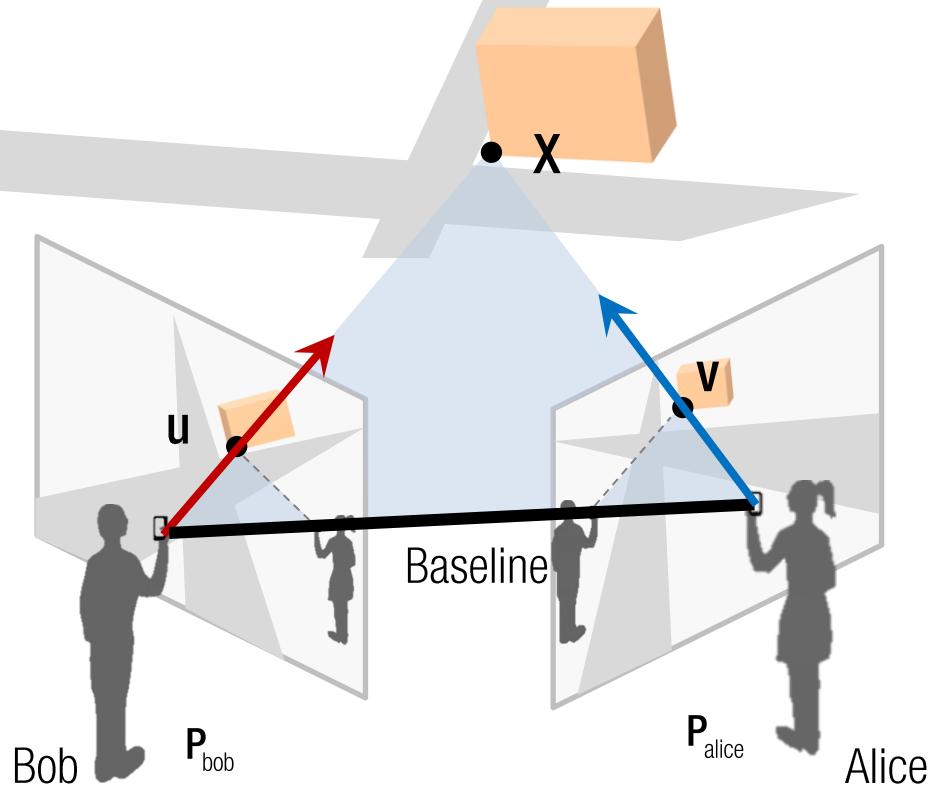
$$\lambda_1 \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} = \mathbf{P}_{\text{bob}} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix}$$



Two 3D vectors are parallel.

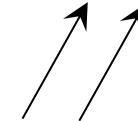
$$\rightarrow \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} \times \mathbf{P}_{\text{bob}} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix} = \mathbf{0}$$

# TRIANGULATION



General camera pose

$$\lambda_1 \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} = \mathbf{P}_{\text{bob}} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix}$$



Two 3D vectors are parallel.

$$\rightarrow \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} \times \mathbf{P}_{\text{bob}} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix} = \mathbf{0}$$

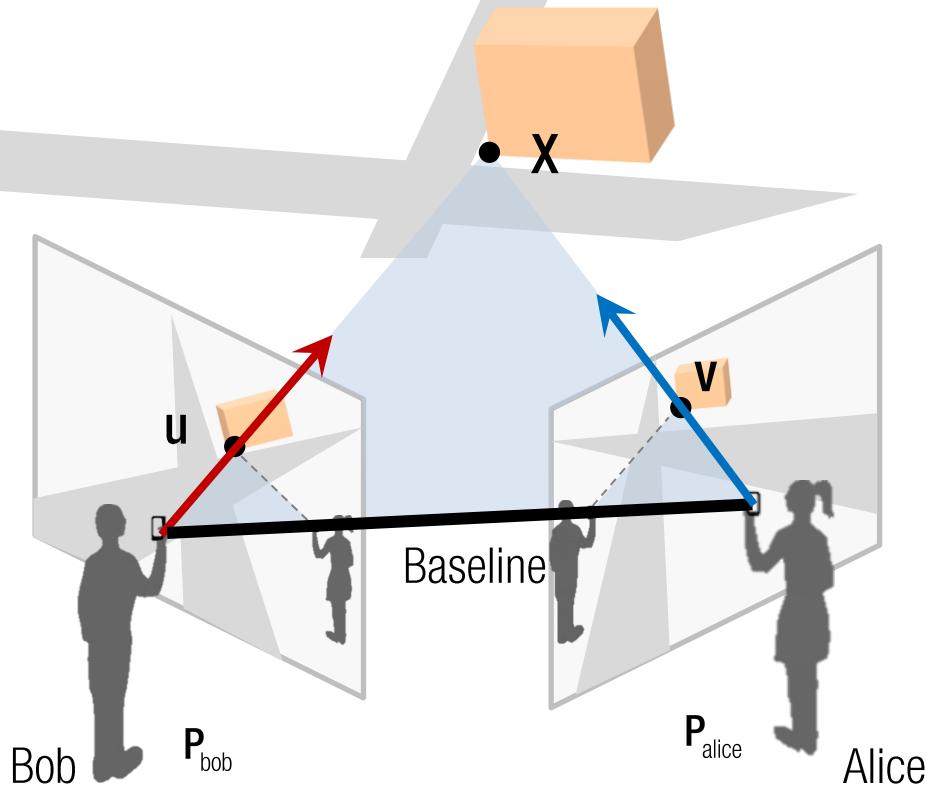
$$\rightarrow \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} \times \mathbf{P}_{\text{bob}} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix} = \mathbf{0}$$

: Knowns  
 : Unknowns

Skew-symmetric matrix

$$\begin{bmatrix} a \\ b \\ c \end{bmatrix}_x = \begin{bmatrix} 0 & -c & b \\ c & 0 & -a \\ -b & a & 0 \end{bmatrix}$$

# TRIANGULATION



General camera pose

$$\lambda_1 \begin{bmatrix} u \\ 1 \end{bmatrix} = P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix}$$

Two 3D vectors are parallel.

$$\rightarrow \begin{bmatrix} u \\ 1 \end{bmatrix} \times P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix} = 0$$

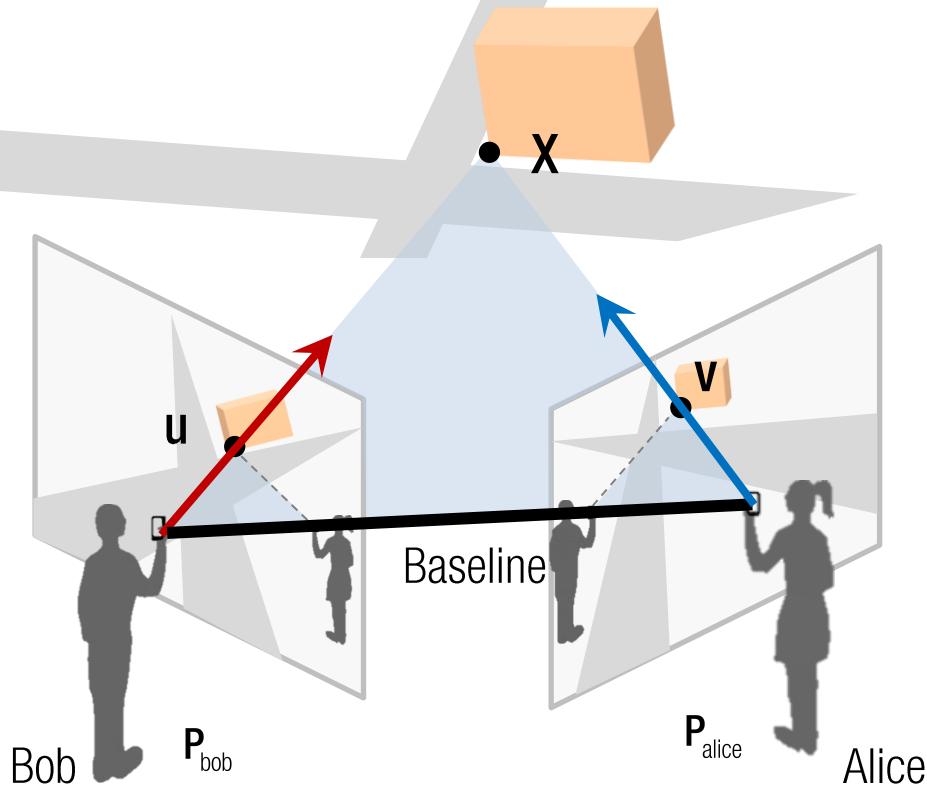
$$\rightarrow \begin{bmatrix} u \\ 1 \end{bmatrix} \times \begin{bmatrix} P_{\text{bob}} & X \\ 0 & 1 \end{bmatrix} = 0$$

: Knowns  
: Unknowns

3x4

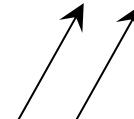
Can we solve for  $X$ ? (single view reconstruction)  
Why not?

# TRIANGULATION



General camera pose

$$\lambda_1 \begin{bmatrix} u \\ 1 \end{bmatrix} = P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix}$$



Two 3D vectors are parallel.

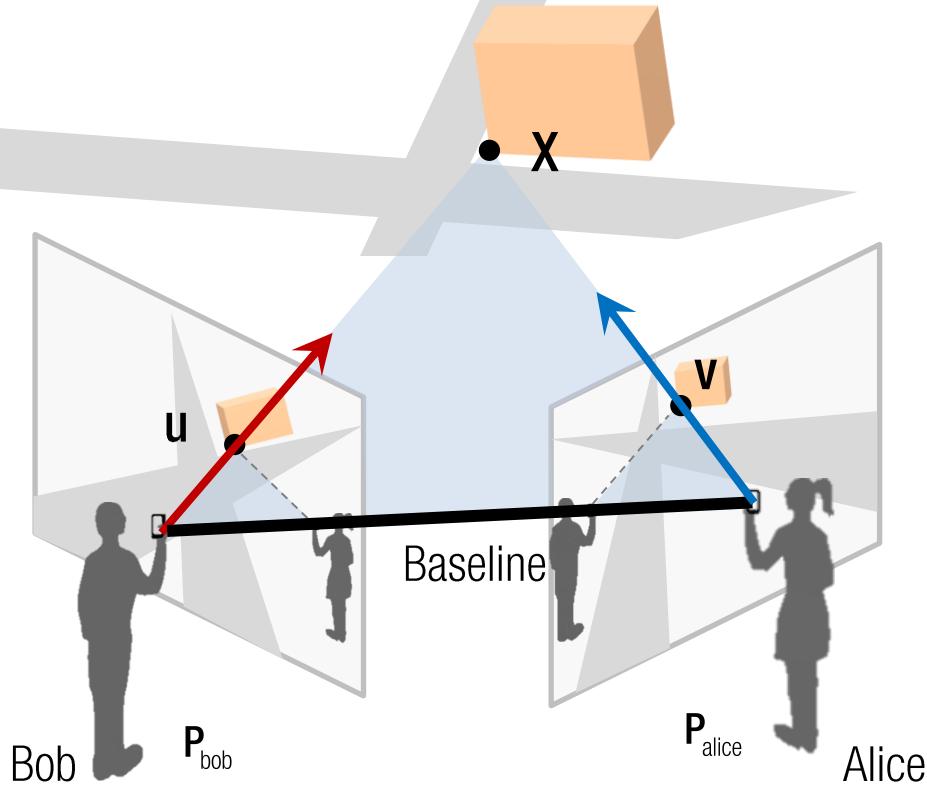
$$\rightarrow \begin{bmatrix} u \\ 1 \end{bmatrix} \times P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix} = 0$$

$$\rightarrow \begin{bmatrix} u \\ 1 \end{bmatrix} \times \begin{bmatrix} P_{\text{bob}} & X \\ 0 & 1 \end{bmatrix} = 0$$

2x4

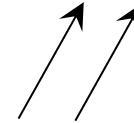
: Knowns  
: Unknowns

# TRIANGULATION



General camera pose

$$\lambda_1 \begin{bmatrix} u \\ 1 \end{bmatrix} = P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix}$$



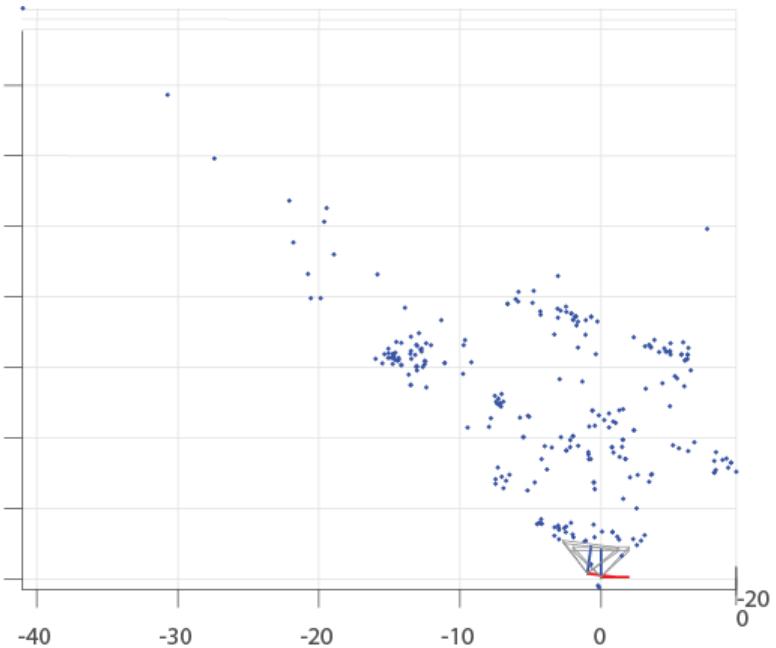
Two 3D vectors are parallel.

$$\rightarrow \begin{bmatrix} u \\ 1 \end{bmatrix} \times P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix} = 0$$

$$\rightarrow \begin{bmatrix} u \\ 1 \end{bmatrix} \times P_{\text{bob}} \begin{bmatrix} X \\ 1 \end{bmatrix} = 0$$
  
$$\begin{bmatrix} v \\ 1 \end{bmatrix} \times P_{\text{alice}} \begin{bmatrix} X \\ 1 \end{bmatrix} = 0$$

: Knowns  
: Unknowns

4x4



$$\begin{bmatrix} \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} \times \mathbf{P}_{\text{bob}} \\ \begin{bmatrix} \mathbf{v} \\ 1 \end{bmatrix} \times \mathbf{P}_{\text{alice}} \end{bmatrix} \begin{bmatrix} \mathbf{X} \\ 1 \end{bmatrix} = \mathbf{0}$$

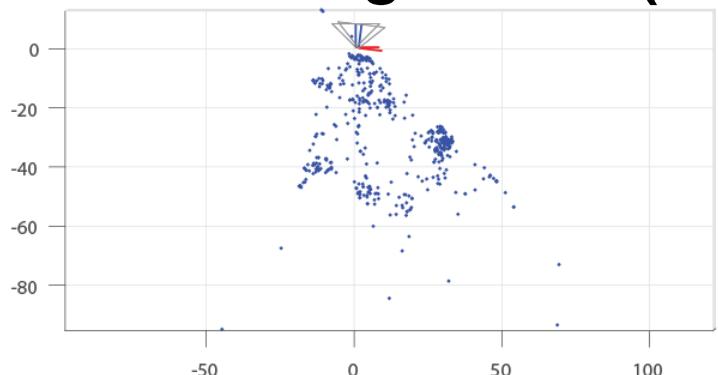
# Camera Pose Disambiguation (Cheirality)

Cheirality condition:

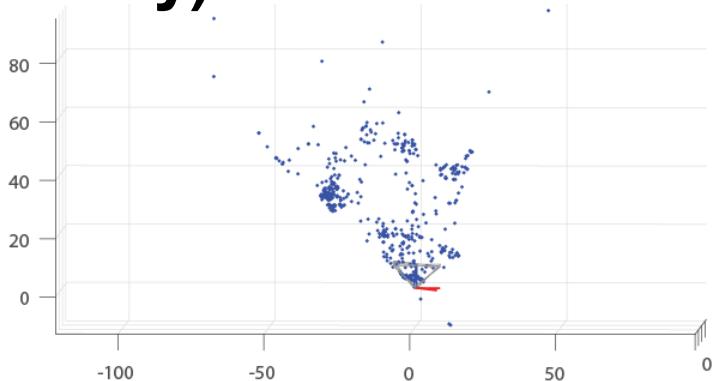
$$\mathbf{r}_3^T(\mathbf{X} - \mathbf{C}) > 0$$

where

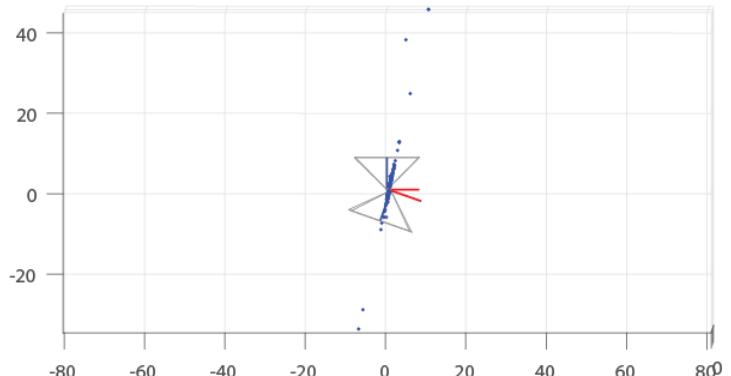
$$\mathbf{R} = \begin{bmatrix} \mathbf{r}_1^T \\ \mathbf{r}_2^T \\ \mathbf{r}_3^T \end{bmatrix}$$



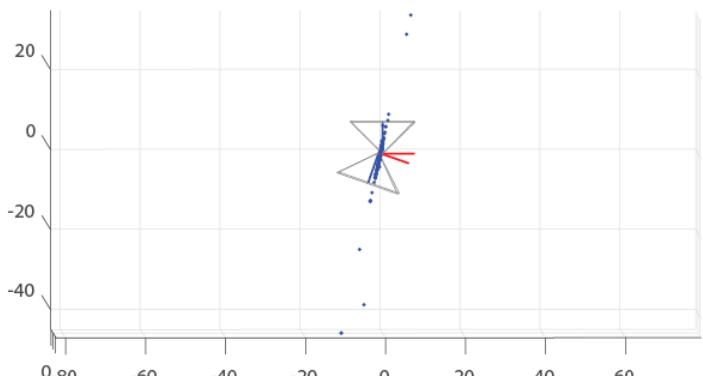
(a) nValid = 10



(b) nValid = 488

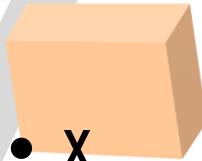


(c) nValid = 0

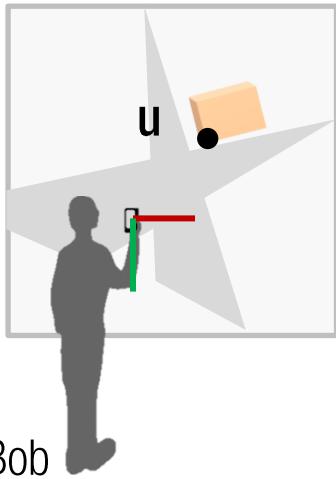


(d) nValid = 0

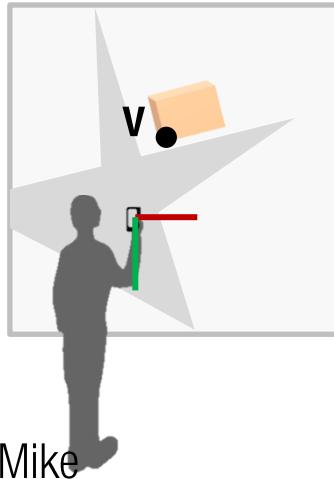
# *Special Case: Stereo*



- Same orientation

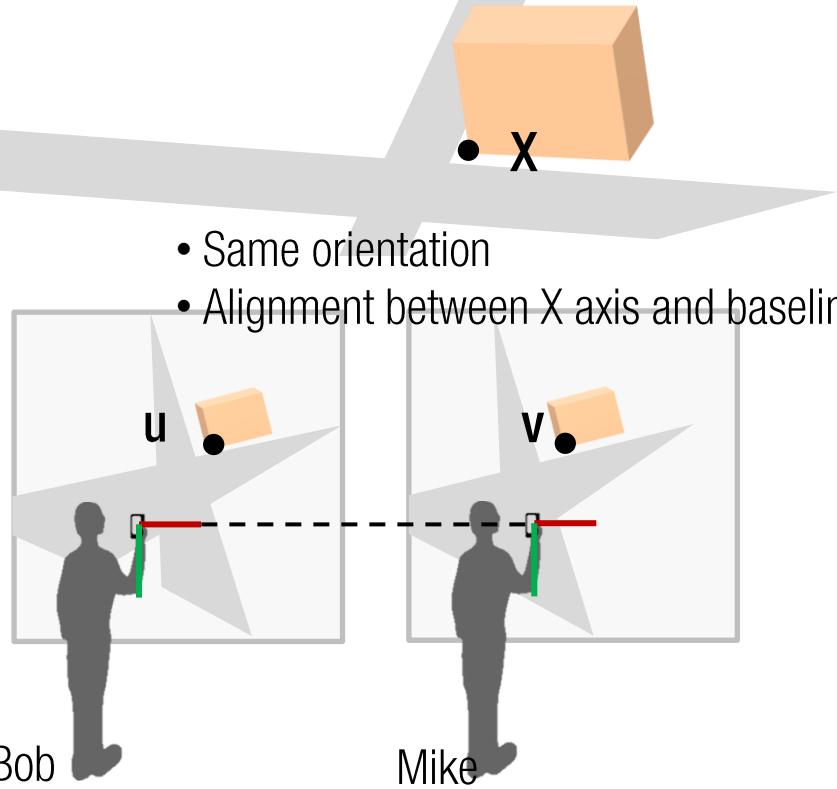


Bob

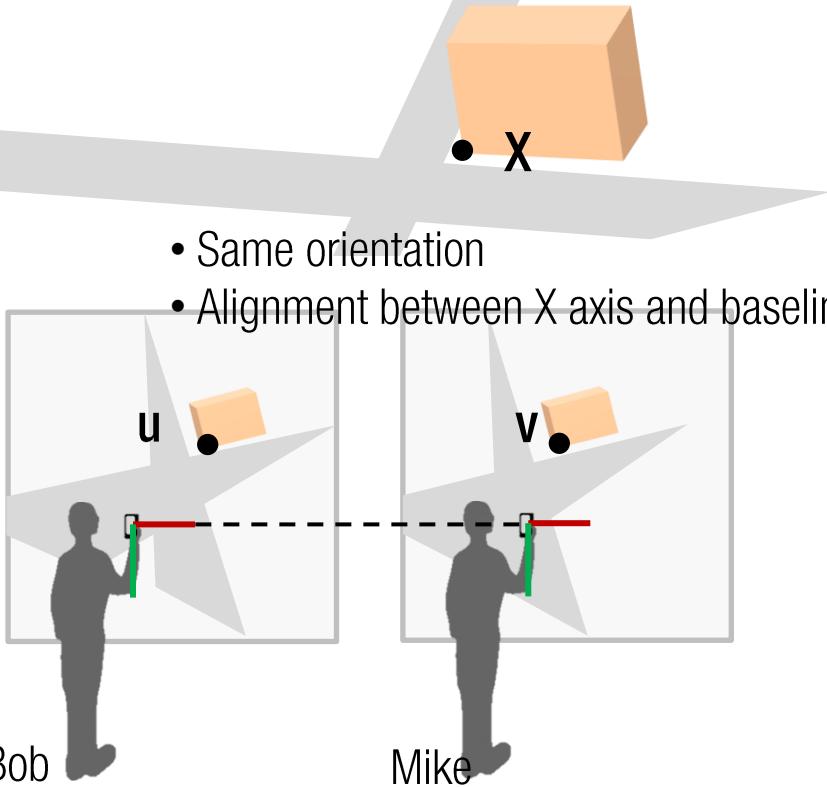


Mike

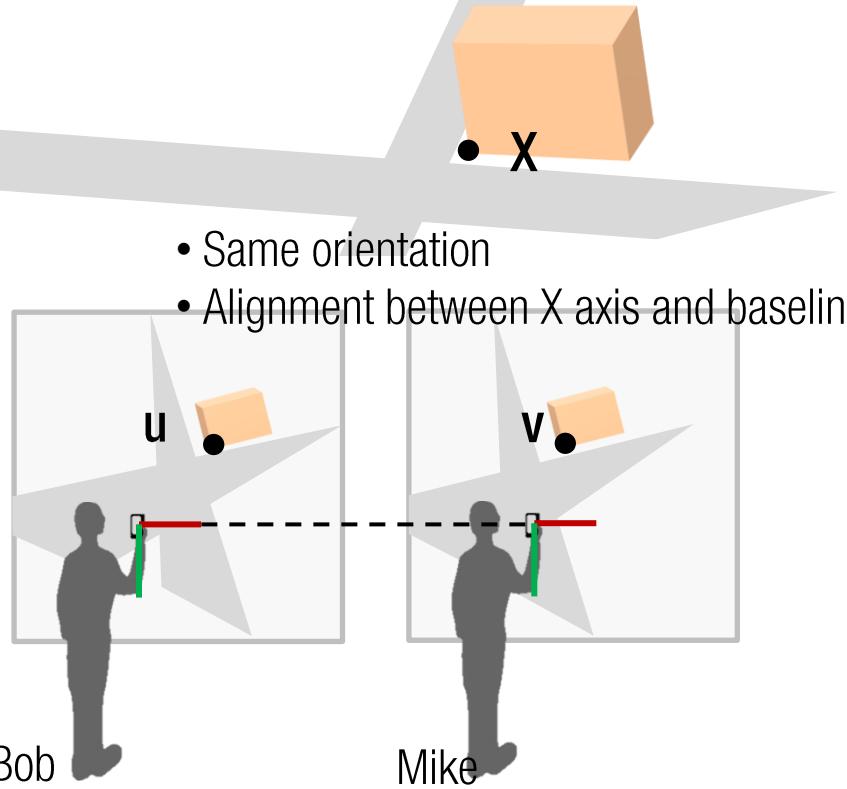
# *Special Case: Stereo*



# *Special Case: Stereo*

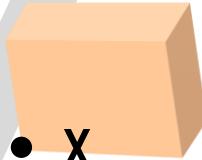


# *Special Case: Stereo*

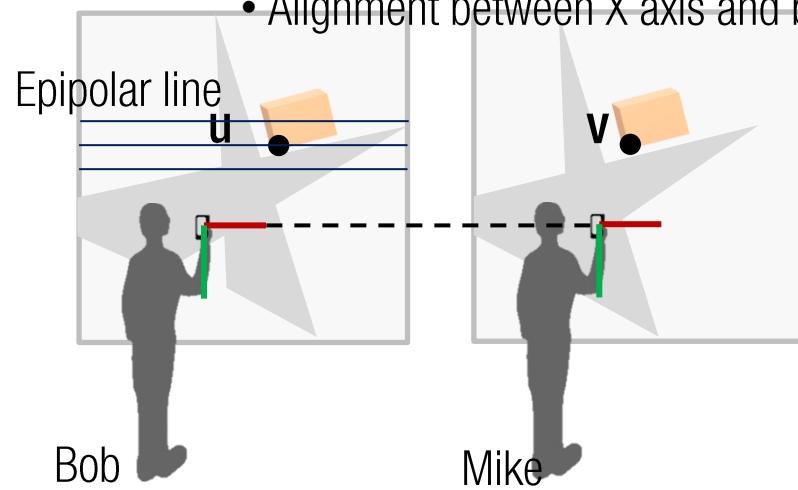


Top view

# *Special Case: Stereo*



- Same orientation
- Alignment between X axis and baseline



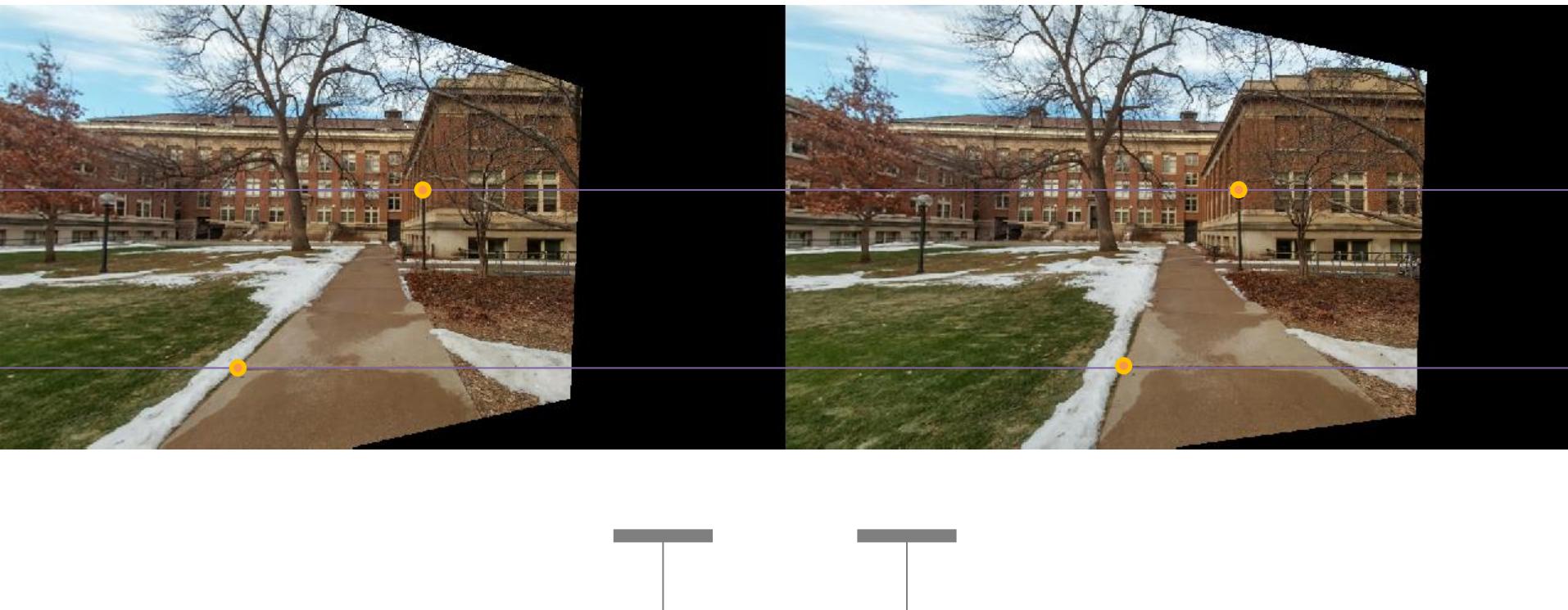
Epipole?  
Point at infinity



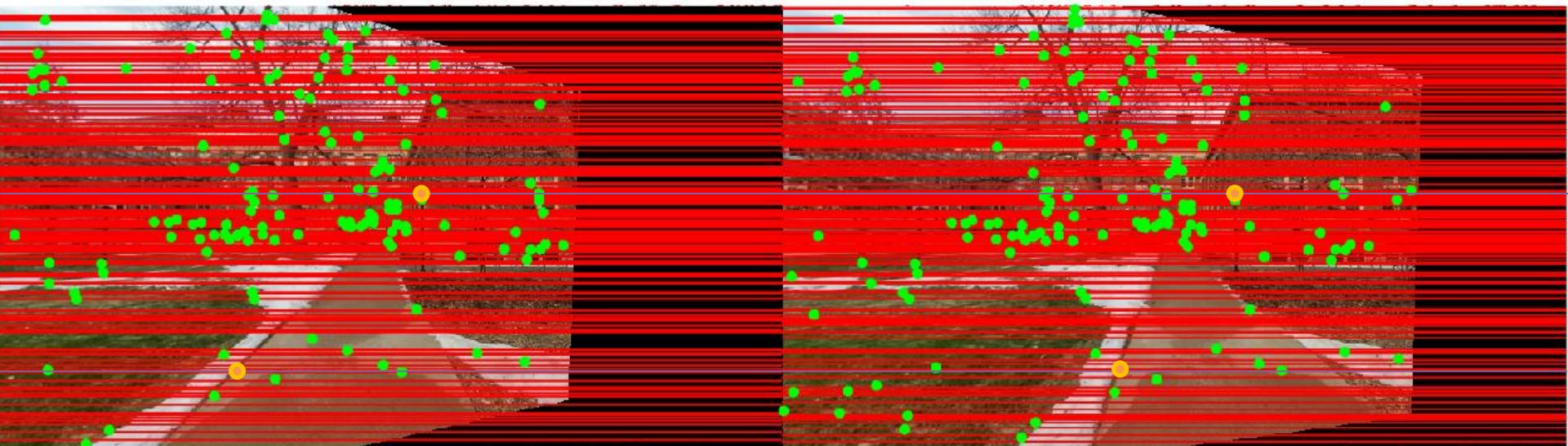
# *Special Case: Stereo*



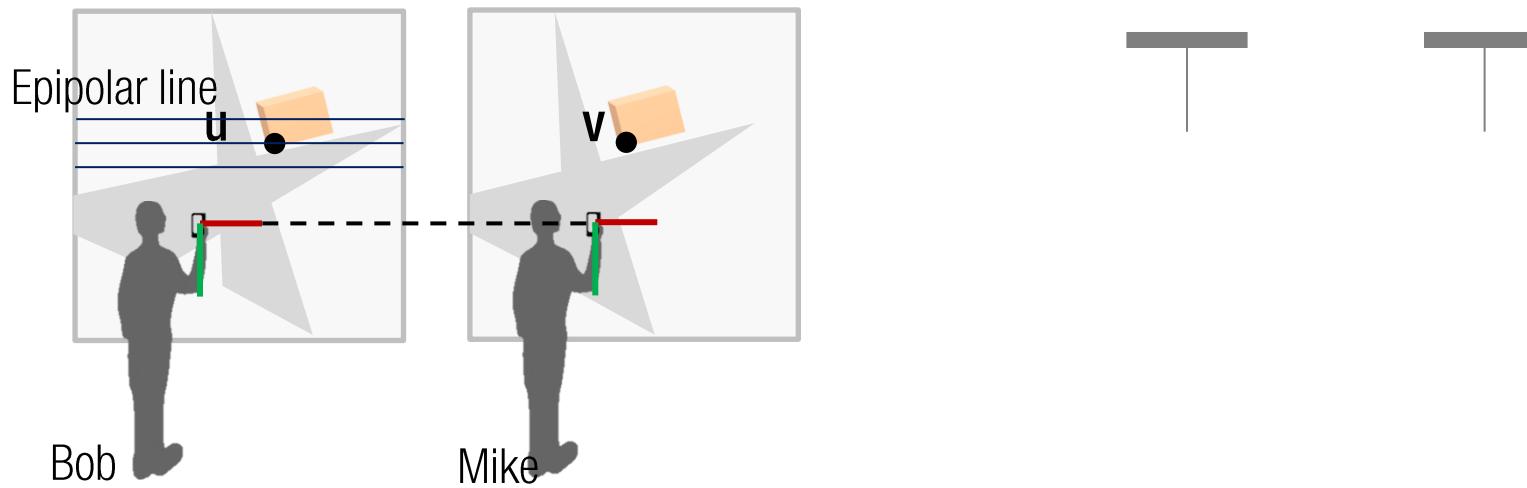
# *Special Case: Stereo*



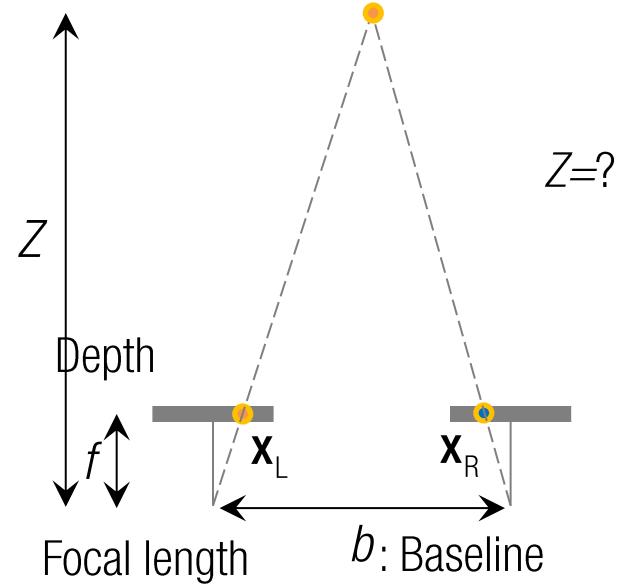
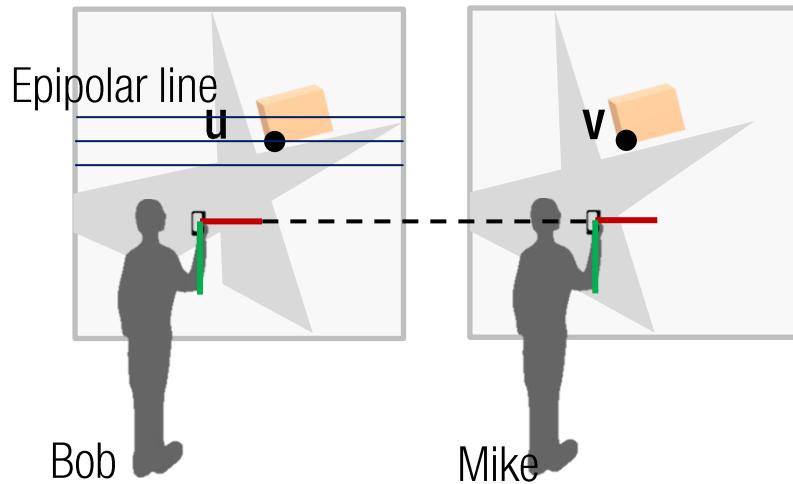
# *Special Case: Stereo*



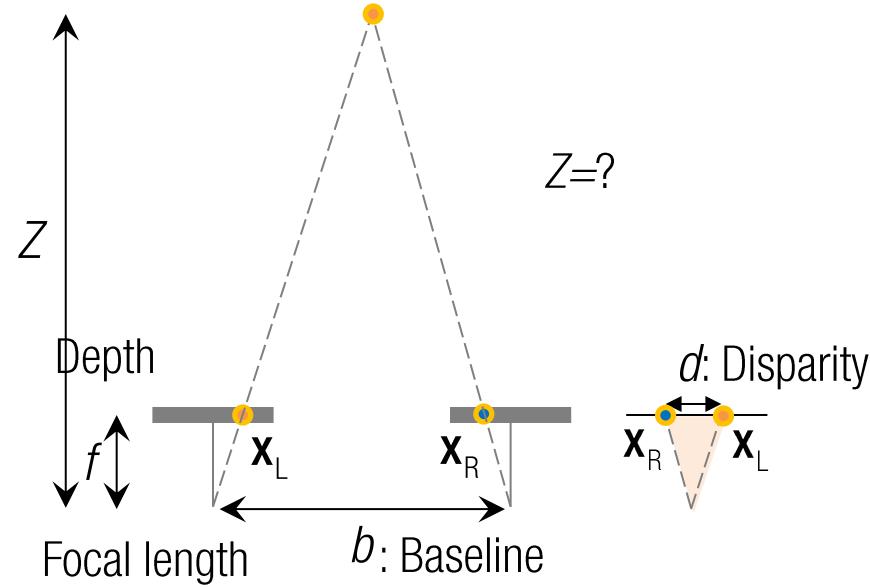
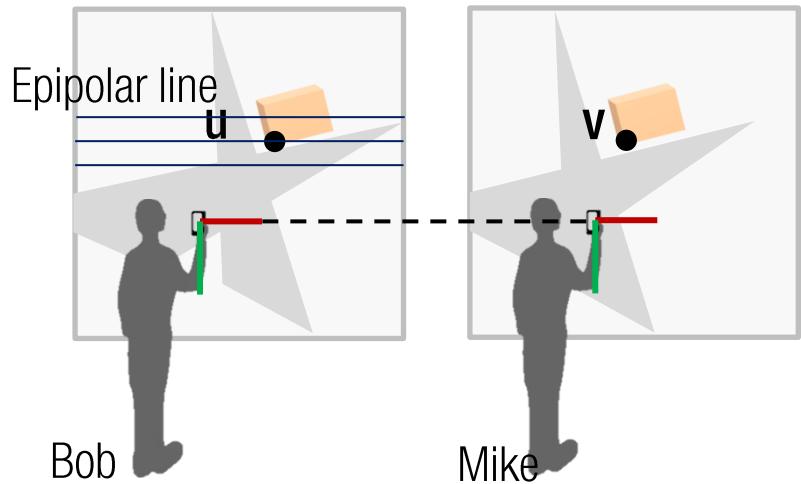
# *Special Case: Stereo*



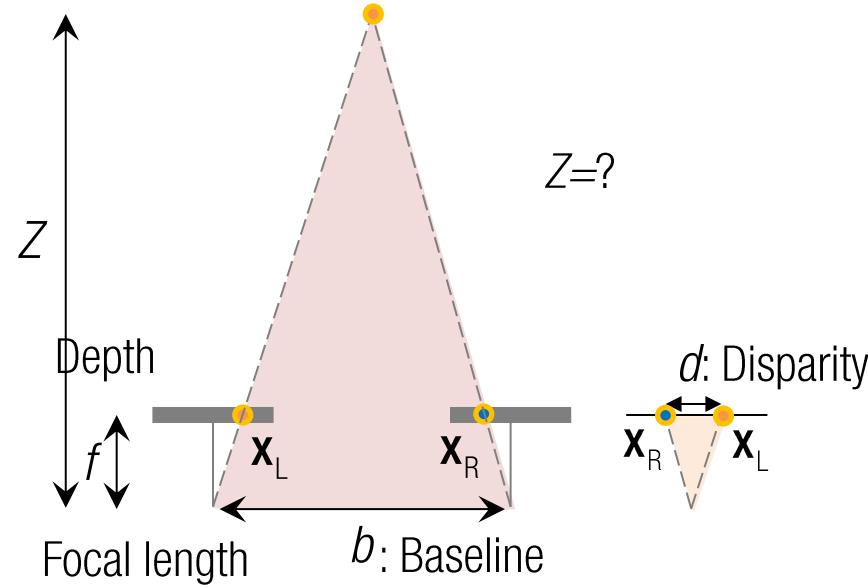
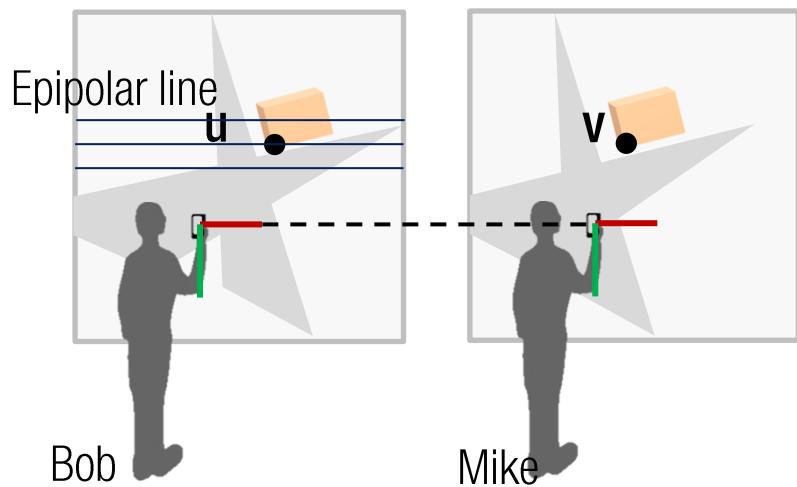
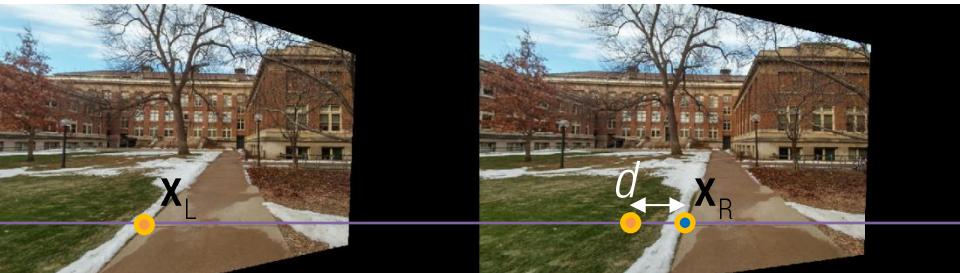
# *Special Case: Stereo*



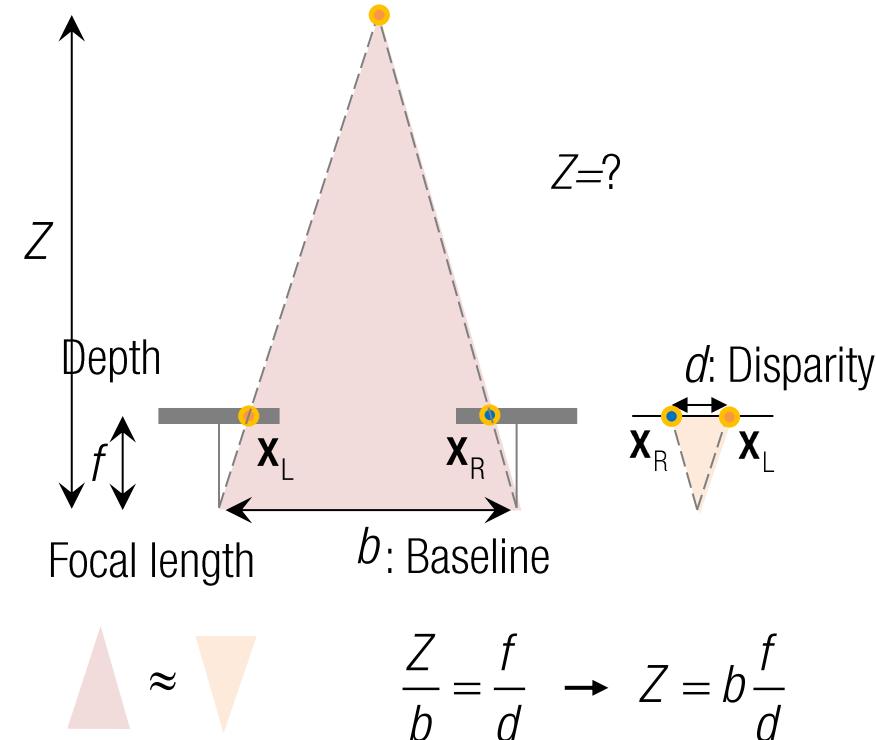
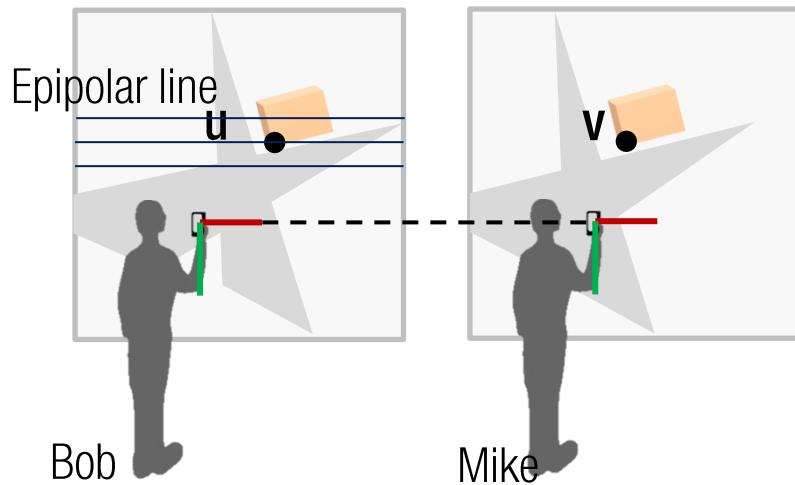
# *Special Case: Stereo*



# Special Case: Stereo



# Special Case: Stereo



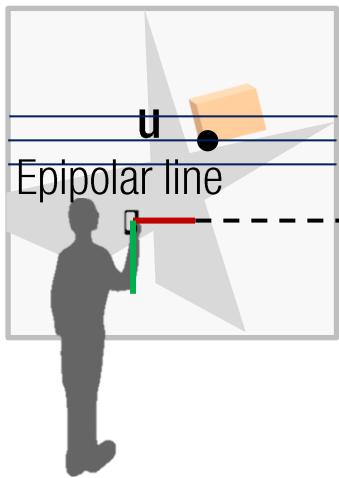
Two triangles are similar.

$$\frac{Z}{b} = \frac{f}{d} \rightarrow Z = b \frac{f}{d}$$

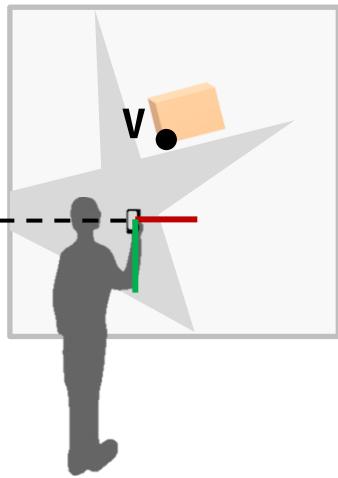
# *Special Case: Stereo*



# Special Case: Stereo



$$P_{\text{bob}} = K \begin{bmatrix} I & 0 \end{bmatrix}$$



$$P_{\text{mike}} = K R \begin{bmatrix} I & -C \end{bmatrix}$$

- Same orientation

$$R_{\text{rect}} = \begin{bmatrix} r_x^T \\ r_y^T \\ r_z^T \end{bmatrix}$$

- Alignment between X axis and baseline

$$r_x = \frac{c}{\|c\|}$$

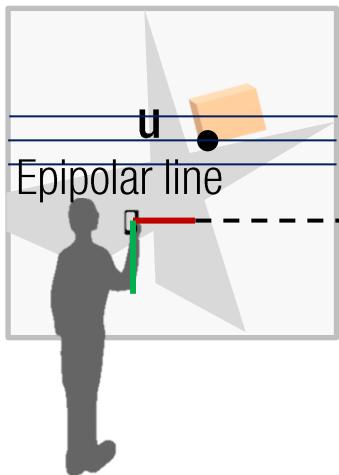
$$r_z = \frac{\tilde{r}_z - (\tilde{r}_z \cdot r_x) r_x}{\|\tilde{r}_z - (\tilde{r}_z \cdot r_x) r_x\|}$$

: Orthogonal projection

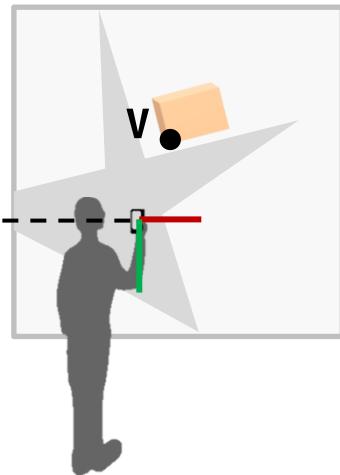
$$r_y = r_z \times r_x$$

$$\text{where } \tilde{r}_z = \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix}$$

# *Special Case: Stereo*



$$P_{\text{bob}} = K \begin{bmatrix} I & 0 \end{bmatrix}$$



$$P_{\text{mike}} = KR \begin{bmatrix} I & -C \end{bmatrix}$$

Homography by pure rotation:  $R_{\text{rect}}$

$$H_{\text{bob}} = KR_{\text{rect}} K^{-1}$$

$$H_{\text{mike}} = KR_{\text{rect}} R^T K^{-1}$$



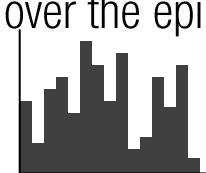
# *Dense Feature Matching using SIFT Flow*



descriptor1



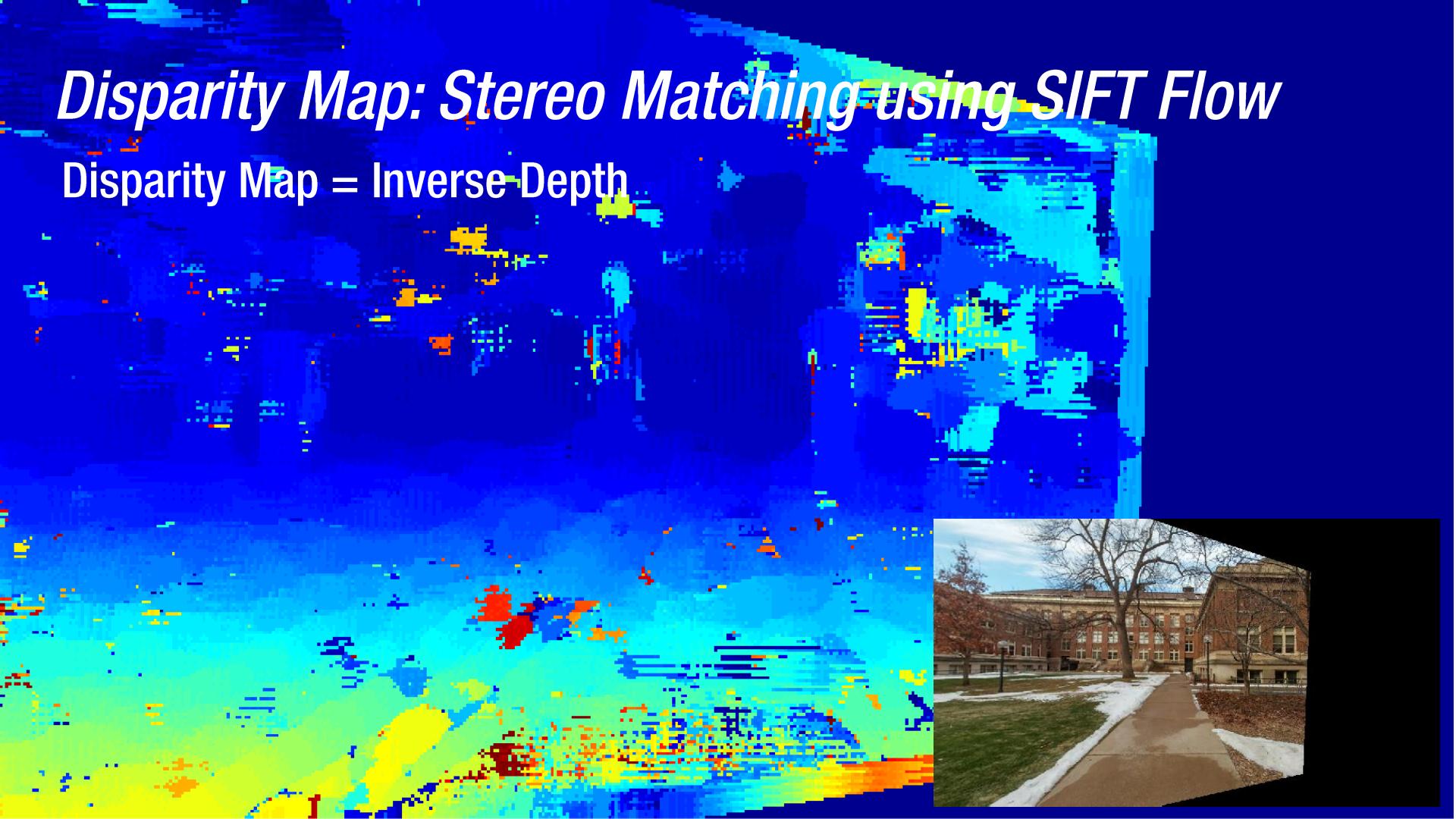
Find a minimum distance over the epipolar line



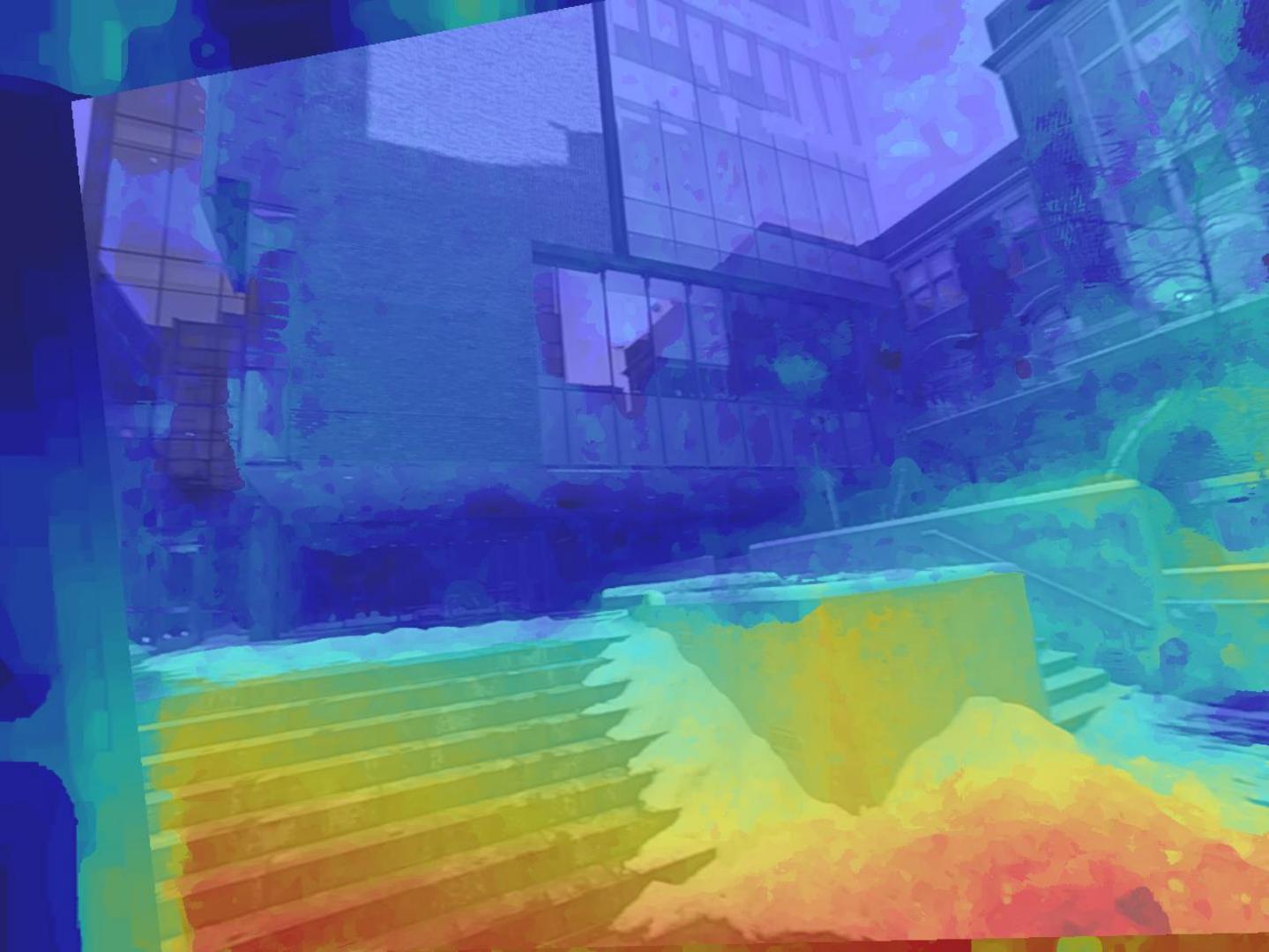
descriptor2

# *Disparity Map: Stereo Matching using SIFT Flow*

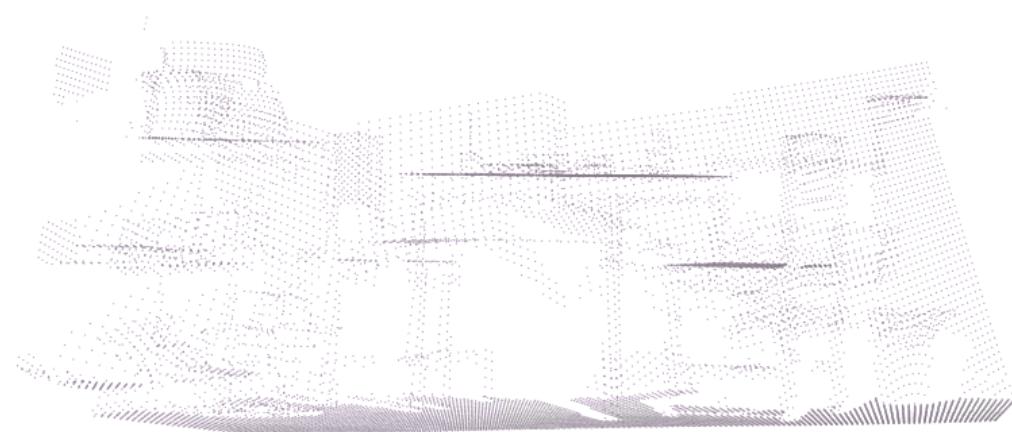
Disparity Map = Inverse Depth











☒ ☒

# EgoMotion Dataset (outdoor)



# Dense Reconstruction using a Monocular Camera



# *Structure from Motion (SfM)*

 COLMAP

3.6

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## COLMAP



*Sparse model of central Rome using 21K photos produced by COLMAP's SfM pipeline.*



*Dense models of several landmarks produced by COLMAP's MVS pipeline.*

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<https://www.insidescience.org/video/motion-capture-inside-out>

<https://www.youtube.com/watch?v=SOpwHaQnRSY>