Using the fundamental matrix estimation,

$$\left[\begin{array}{cccc} x_m' & y_m' & 1\end{array}\right] \left[\begin{array}{cccc} f_1 & f_2 & f_3 \\ f_4 & f_5 & f_6 \\ f_7 & f_8 & f_9\end{array}\right] \left[\begin{array}{cccc} x_m \\ y_m \\ 1\end{array}\right] = 0$$

which translates into

$$x_m x'_m f_1 + x_m y'_m f_2 + x_m f_3 + y_m x'_m f_4 + y_m y'_m f_5 + y_m f_6 + x'_m f_7 + y'_m f_8 + f_9 = 0$$

where  $f_9$  is the  $F_{33}$  element of the fundamental matrix.

Since (0,0) coincides with the principal point, one such point satisfies the above equation:

$$x_m = 0 \ y_m = 0 \ x_m^{'} = 0 \ y_m^{'} = 0$$

Putting these values in the above equation,

$$f_9 = 0$$
 =>  $F_{33} = 0$ 

Since the second camera differs from the first by a pure translation that is parallel to x-axis,

$$R = I$$

$$t = (T,0,0)$$

$$E = t \times R = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & -T \\ 0 & T & 0 \end{bmatrix}$$

$$x^{T} E x' = 0$$

$$(u \vee 1) \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & -T \\ 0 & T & 0 \end{bmatrix} \begin{bmatrix} u' \\ v' \\ 1 \end{bmatrix} = 0$$

$$(u \vee 1) \begin{bmatrix} 0 \\ -T \\ Tv' \end{bmatrix} = 0$$

$$\Rightarrow Tv = Tv'$$

Therefore, the y coordinate is always the same. Hence, the epipolar lines are horizontal.

Let us consider two timestamps t<sub>1</sub> and t<sub>2</sub>,

$$x_1' = R_1 (x-t_1)$$
  
 $x_2' = R_2 (x-t_2)$ 

Replacing the value of x, we get,

$$\Rightarrow x_2' = R_2 R_1^T (x_1' - R_1(t_2 - t_1))$$

Hence,

$$R_{rel} = R_2 R_1^T$$
  
 $T_{rel} = R_1(t_2 - t_1)$ 

$$E = R[t_x]$$

Let 
$$T_{rel} = \begin{bmatrix} txrel \\ tyrel \\ tzrel \end{bmatrix}$$

$$E = R_{rel} [T_{relx}] = R_2 R_1^{T} \begin{bmatrix} 0 & -tzrel & tyrel \\ tzrel & 0 & -txrel \\ -tyrel & txrel & 0 \end{bmatrix}$$

$$F = K'^T E K^{-1}$$

$$\mathsf{F} = \mathsf{K'}^\mathsf{T} \, \mathsf{R}_{\mathsf{rel}} \, [\mathsf{T}_{\mathsf{relx}}] \mathsf{K}^\mathsf{-1} = \mathsf{K'}^\mathsf{T} \, \mathsf{R}_2 \, \mathsf{R}_1^\mathsf{T} \begin{bmatrix} 0 & -tzrel & tyrel \\ tzrel & 0 & -txrel \\ -tyrel & txrel & 0 \end{bmatrix} \mathsf{K}^\mathsf{-1}$$

Let  $P_1$  and  $P_2$  be the vectors from camera C to the real object P and it's reflection P' respectively.

Therefore, we get

$$P_1 + T = P_2$$

$$P_1 = P_2 - T$$

Since P<sub>1</sub>, P<sub>2</sub> and T are coplanar,

$$(P_2 - T)^T T \times P_2 = 0$$

$$(P_2 - T)^T [t_x] P_2 = 0$$

where 
$$[t_x] = \begin{bmatrix} 0 & -Tz & Ty \\ Tz & 0 & -Tx \\ -Ty & Tx & 0 \end{bmatrix}$$

Therefore,

$$P_1^T [t_x] P_2 = 0$$

Since 
$$P_1^T E P_2 = 0$$
,  $E = [t_x]$ 

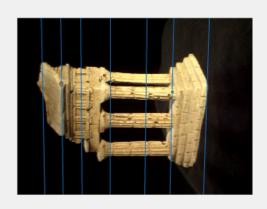
$$F = K^{-T} E K^{-1}$$

$$F^{T} = K^{-T} E^{T} K^{-1} = -K^{-T} E K^{-1} = -F$$

Since  $F^T = -F$ , the two images of the object are related by a skew-symmetric fundamental matrix.



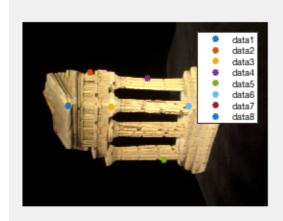
Select a point in this image (Right-click when finished)



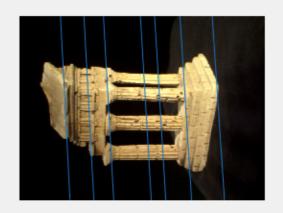
Verify that the corresponding point is on the epipolar line in this image

## F=

-0.0000 -0.0000 -0.0011 -0.0000 0.0000 0.0000 0.0011 -0.0000 -0.0042



Select a point in this image (Right-click when finished)



Verify that the corresponding point is on the epipolar line in this image

F{1}

ans =

-0.0000 0.0000 -0.0014 0.0000 -0.0000 0.0001 0.0014 -0.0001 0.0040 E =

-0.0520 0.4314 -2.1412 0.1270 -0.0282 0.1256 2.1450 -0.0511 0.0017 A is represented by the following equation:

$$\left[egin{array}{c} yoldsymbol{p}_3^ op - oldsymbol{p}_2^ op \ oldsymbol{p}_1^ op - xoldsymbol{p}_3^ op \ y'oldsymbol{p}_3'^ op - oldsymbol{p}_2'^ op \ oldsymbol{p}_1'^ op - x'oldsymbol{p}_3'^ op \end{array}
ight] oldsymbol{X} = \left[egin{array}{c} 0 \ 0 \ 0 \ 0 \ 0 \end{array}
ight]$$

$$\mathbf{A}X = \mathbf{0}$$

In Matlab,

A = [p1(i,2)\*C1(3,:)-C1(2,:);C1(1,:)-p1(i,1)\*C1(3,:);p2(i,2)\*C2(3,:)-C2(2,:);C2(1,:)-p2(i,1)\*C2(3,:)]

```
Q 3.3
```

C2 =

1.0e+03 \*

 1.5219
 0.0205
 0.2938
 0.0436

 0.0589
 1.5365
 -0.1585
 1.5710

 0.0000
 0.0003
 0.0010
 0.0002

error1 =

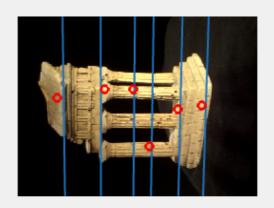
987.5777

error2 =

945.3894



Select a point in this image (Right-click when finished)



Verify that the corresponding point is on the epipolar line in this image

### coordsIM1 =

123.6746 217.6429

222.7222 215.1032

436.0556 230.3413

504.6270 243.0397

311.6111 210.0238

364.9444 352.2460

#### coordsIM2 =

107 217

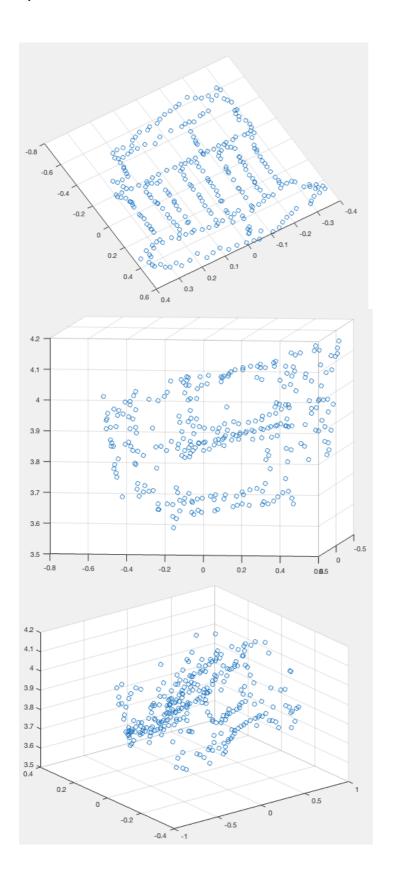
233 195

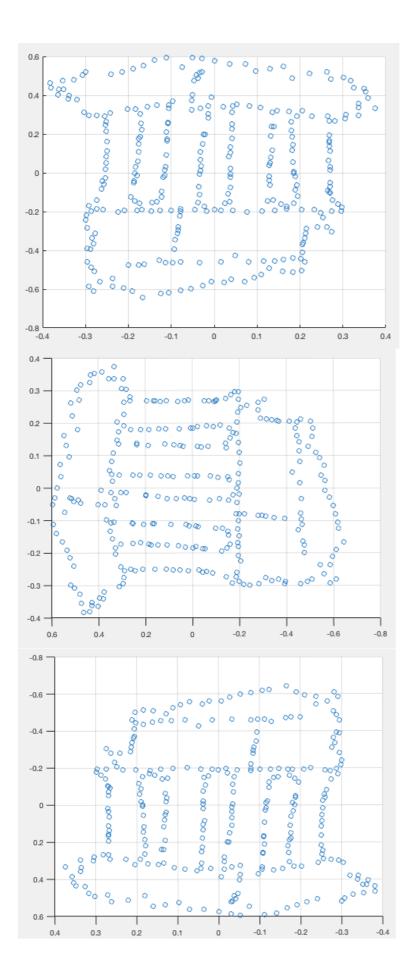
428 248

491 238

309 196

353 347

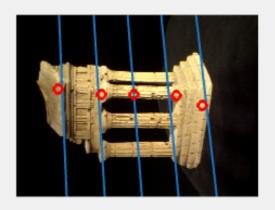




### Output from RANSAC with noisy correspondence



Select a point in this image (Right-click when finished)

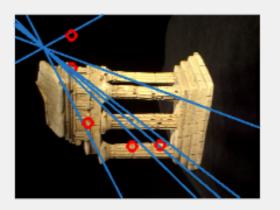


Verify that the corresponding point is on the epipolar line in this image

# **Output from Eightpoint**



Select a point in this image (Right-click when finished)



Verify that the corresponding point is on the epipolar line in this image

As it can be observed, output from RANSAC is much better than eightpoint. For RANSAC, the metric for computing error used is the distance between the point and the mapped epipolar line found using sevenpoint for each F. The threshold used for inliers is 0.03 and the loop is run for 75% inliers. Since RANSAC has mostly correct matches, it gives a better result.

### Q5.2

See code

Case tested:

```
r = [2 1 2]

R =

-0.1056  0.5363  0.8374

0.3481  -0.7689  0.5363

0.9315  0.3481  -0.1056
```

Verified with the in-built functions rotationMatrixToVector() and rotationVectorToMatrix()



These images were taken using 3-D Point Cloud Processing in the Computer Vision System Toolbox in Matlab. (<a href="http://www.mathworks.com/help/vision/examples/structure-from-motion-from-two-views.html">http://www.mathworks.com/help/vision/examples/structure-from-motion-from-two-views.html</a>)

The key idea is to generate more points for the 3D reconstruction of the image and record each pixel value. The output P of triangulation along with the pixels are sent to the pointCloud function which generates the given plots.