

**NANYANG
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EE6222: MACHINE VISION
Project Report (Assignment 2)

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Question 1

Find the focal length f of your hand phone (in pixels). You may use a real person or printed figure, and include one figure of the settings in your report. Make sure you turn the camera's "zooming/auto-focusing" off. (40 marks)

We used two crosses with a midpoint (in pink tape) as denoted below. Pictures were taken at a varying distance from the phone camera (**O**) to the physical midpoint of the two crosses, denoted by the distance **OL**.

The diagram below depicts how the experiment was set up. We vary the distance **OL** between 1240mm and 1800mm, and measure the pixel distance ($x_a x_b$) between the two crosses in the resulting image plane. We are trying to find the focal length f_x in terms of its pixel value. The physical distance between the two crosses (**AB**) is fixed at 1200mm.

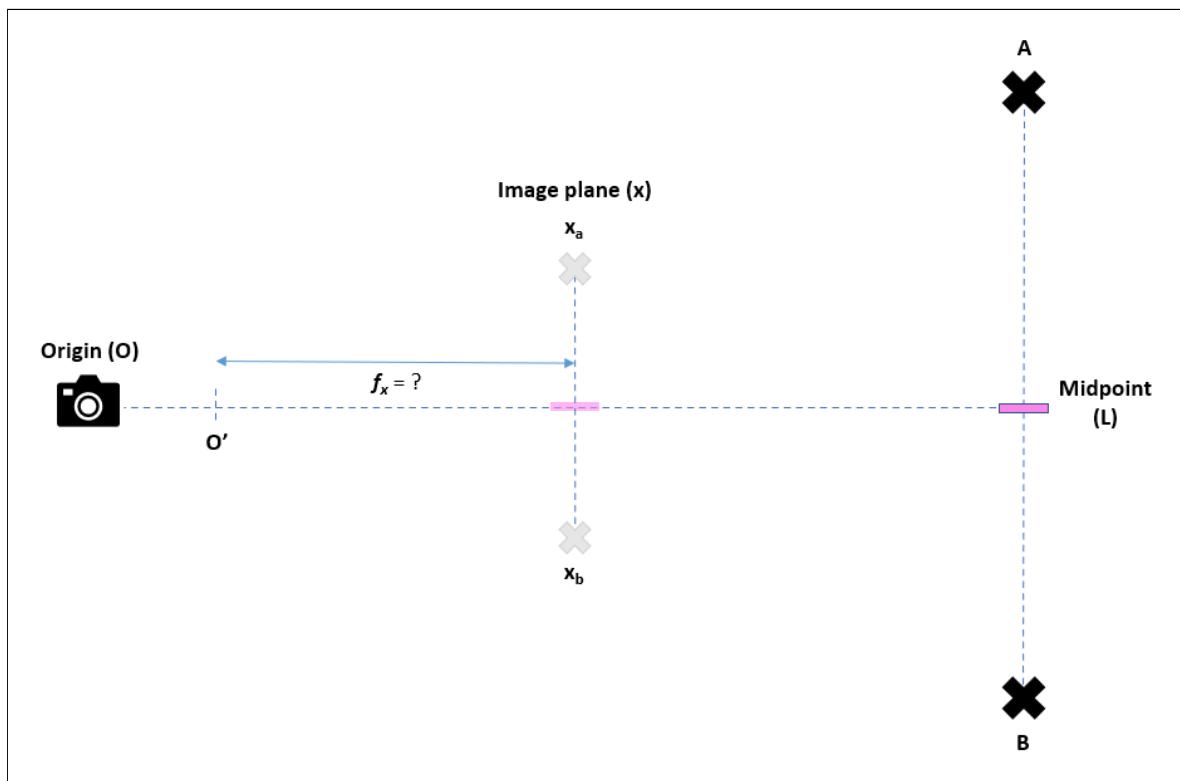


Figure 1: Experimental setup

The settings used for the phone camera as well as the resulting images are listed below:

Phone model	Samsung Galaxy S21+
Manufacturer's focal length	26mm
Zoom level	1.0x (no zoom)
Focus mode	Manual focus
HDR mode	Off
Camera type	Main (Not telephoto/selfie)



Figure 2: Two images at different distances

By projective geometry, we can see two similar triangles as shown below:

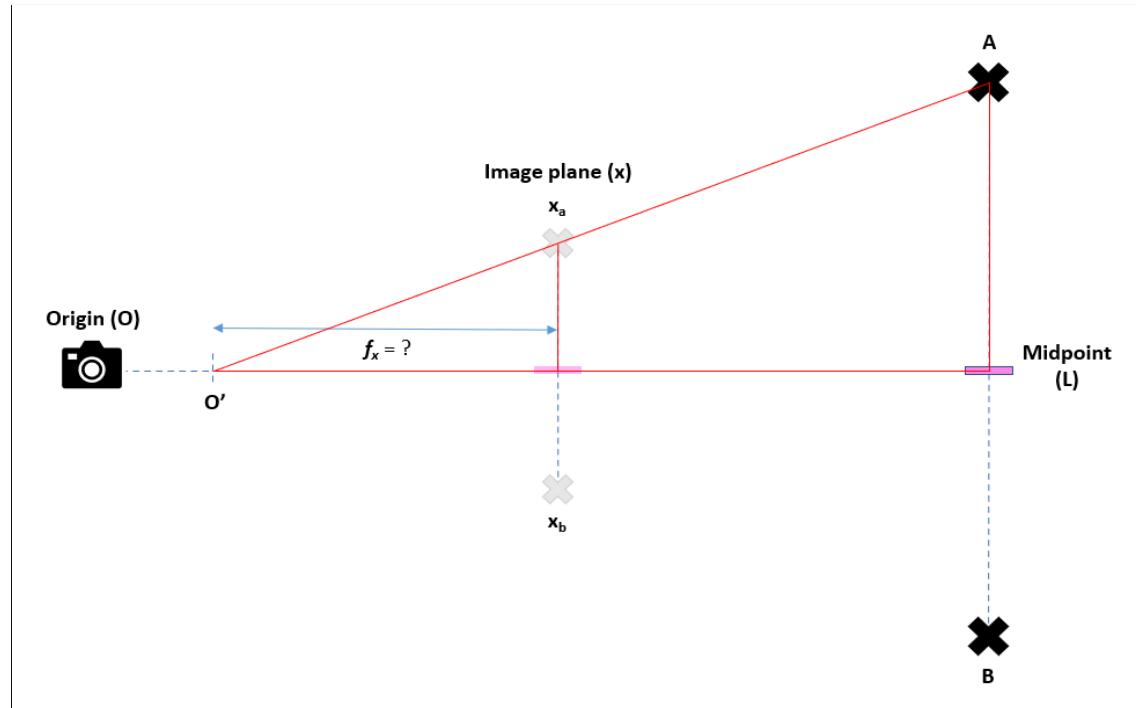


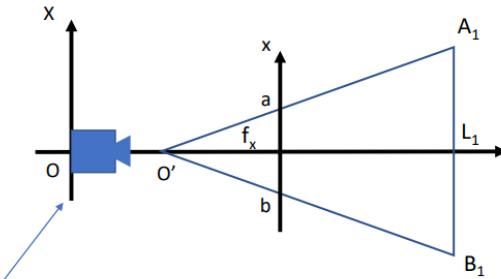
Figure 3: Projective geometry

We refer to Slide 4 of [2] 3D vision 1.pdf lecture slides for the equation to resolve both the pixel focal length f_x , and the actual focal length OO'

Projective Geometry

Camera Parameters

- f_x, f_y – focal length in x,y directions
- x_0, y_0 – image center (found by calibration)
- f_x/f_y – aspect ratio



Back side of hand phone

How to find f_x ?

- Point the camera to a wall
- Mark two points on the wall (A_1 & B_1)
- Measure A_1B_1 and OL_1 using a tape in mm
- Read image points in pixels

$$a = (x_a, y_a)$$

$$b = (x_b, y_b)$$

- Relocate the camera and obtain

$$A_2B_2, OL_2$$

$$a_2 = (x'_a, y'_a)$$

$$b_2 = (x'_b, y'_b)$$

- Solve

$$\frac{f_x}{OL_1 - OO'} = \frac{x_a - x_b}{A_1B_1}$$

$$\frac{f_x}{OL_2 - OO'} = \frac{x'_a - x'_b}{A_2B_2}$$

Hence, given an image point (row, column)

For simplicity, we assume $f_x = f_y = f$

$$x = -(row - x_0) \text{ in pixels}$$

$$y = column - y_0 \text{ in pixels}$$

$$f \quad \quad \quad \text{in pixels}$$

Figure 4: Projective Geometry equation from lecture slides

Using two images taken at different distances OL , we are able to derive two sets of equations relating f_x and OO' , therefore we can solve for both variables.

$\frac{f_x}{OL_1 - OO'} = \frac{x_{a1} - x_{b1}}{A_1B_1}$ $f_x = \frac{x_{a1} - x_{b1}}{A_1B_1} (OL_1 - OO')$ $f_x = \frac{x_{a1} - x_{b1}}{A_1B_1} OL_1 - \frac{x_{a1} - x_{b1}}{A_1B_1} OO'$	$\frac{f_x}{OL_2 - OO'} = \frac{x_{a2} - x_{b2}}{A_2B_2}$ $f_x = \frac{x_{a2} - x_{b2}}{A_2B_2} (OL_2 - OO')$ $f_x = \frac{x_{a2} - x_{b2}}{A_2B_2} OL_2 - \frac{x_{a2} - x_{b2}}{A_2B_2} OO'$
$\left(\frac{x_{a1} - x_{b1}}{A_1B_1} - \frac{x_{a2} - x_{b2}}{A_2B_2} \right) OO' = \frac{x_{a1} - x_{b1}}{A_1B_1} OL_1 - \frac{x_{a2} - x_{b2}}{A_2B_2} OL_2$	
$\text{where } A_1B_1 = A_2B_2 = AB,$ $OO' = \frac{(x_{a1} - x_{b1})OL_1 - (x_{a2} - x_{b2})OL_2}{(x_{a1} - x_{b1}) - (x_{a2} - x_{b2})}$ $f_x = \frac{x_{a1} - x_{b1}}{AB} OL_1 - \frac{x_{a1} - x_{b1}}{AB} OO' \quad \text{or} \quad f_x = \frac{x_{a2} - x_{b2}}{AB} OL_2 - \frac{x_{a2} - x_{b2}}{AB} OO'$	

Figure 5: Formula derivation for f_x and OO'

In our case, we have the following values after measurement from both images:

	Image 1	Image 2
OL	1240mm	1800mm
AB	1200mm	1200mm
x _a	1111	925
x _b	157	273

Figure 6: Experimental values

This allows us to solve the value of OO' and f_x using the derivations in Figure 5

$$Focal\ Length = OO' = \frac{(1111 - 157)1240 - (925 - 273)1800}{(1111 - 157) - (925 - 273)} = 30.99\ mm$$

$$Pixel\ Focal\ Length = f_x = \frac{1111 - 157}{1200} 1240 - \frac{1111 - 157}{1200} 30.99 = 961.16\ ppx$$

The focal length discovered is similar to the manufacturer's specification of 26mm with around a 6mm difference.

Alternatively, we may make use of a simpler equation to determine the pixel focal length from only one image. This operates on the assumption that the distance OO' is negligible, that is, the distance of the lens to the focal point is negligible.

$$\frac{x_a - x_b}{AB} = \frac{f_x}{OL} \quad \rightarrow \quad f_x = \frac{x_a - x_b}{AB} OL$$

Figure 7: Simplified formula with OO' being negligible

Using the simplified equation, we can plug in the value of each image respectively, ending up with the following results:

$$Pixel\ Focal\ Length\ (Image\ 1) = f_{x1} = \frac{1111 - 157}{1200} 1240 = 985.8\ ppx$$

$$Pixel\ Focal\ Length\ (Image\ 2) = f_{x2} = \frac{925 - 273}{1200} 1800 = 978\ ppx$$

These values are within +25px of the value found using two images. This suggests that it is possible to just approximate OO' as zero to simplify the calculations of the pixel focal length.

Question 2

Take two snaps of an outdoor scene, with a 5 to 10 degrees angle difference. You need to keep the angle as ground truth. (0 marks)



Figure 8: Two images at 9 degree angle difference

Question 3

Hand pick 8 points or more from one image, and find the matching points on the other image. These points should not be coplanar. You need to turn these points into n-vectors, and submit them into the equation for calculation. (10 marks)

The 8 points selected in each image have been marked as red crosses with their corresponding pixel coordinates below:

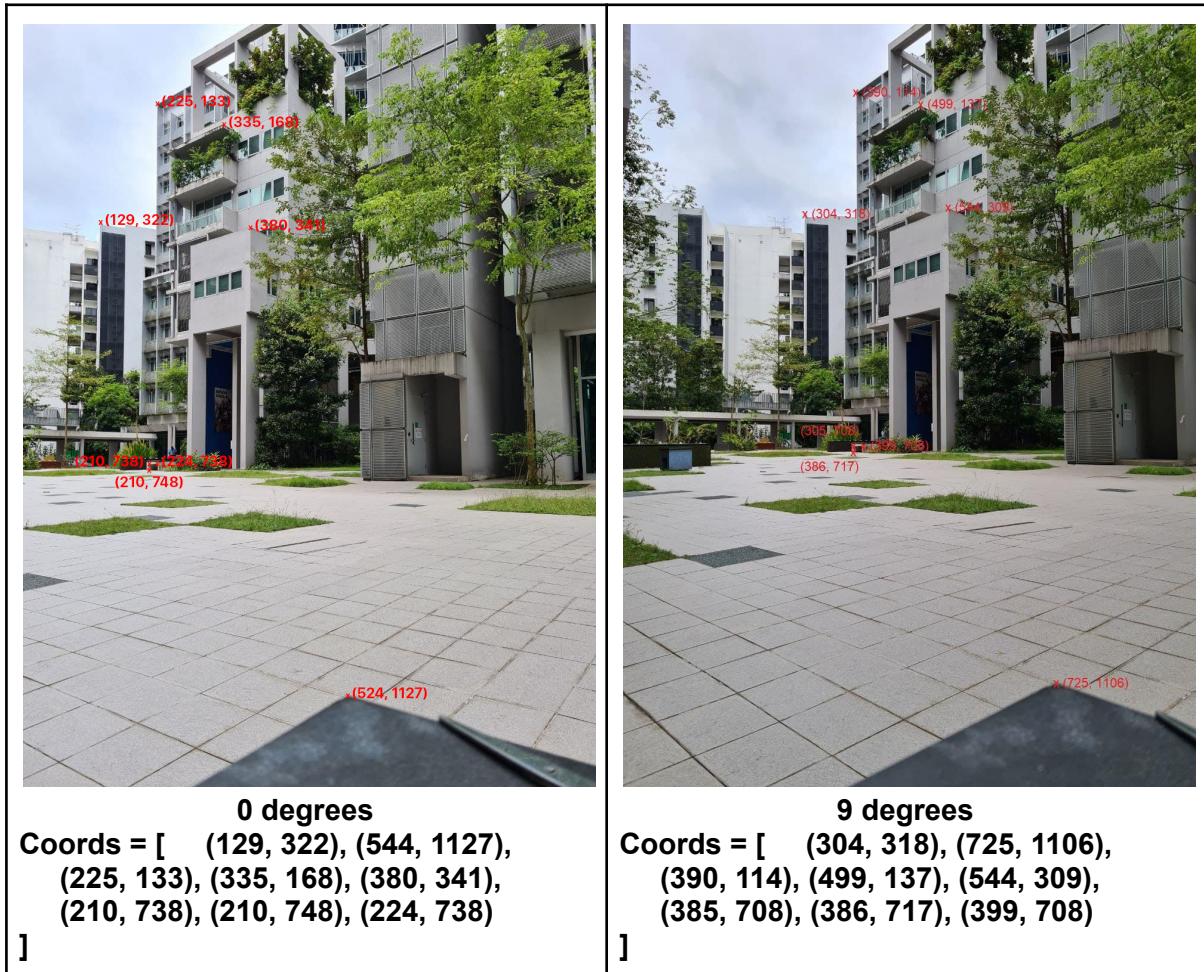


Figure 9: Choosing 8 random matching points in the two images

To turn these points into n-vectors, we will first homogenize these points. The pixel locations for each point in the image are a representation of a vector of shape (3,1) in world space (3D) which represents the x, y and z locations for each point. Since the points only exist as 2D vectors in the image, we will use the pixel focal length calculated in question 1 as the z-coordinate across all points to homogenize them.

We then adjust each point's coordinates for the image center (i.e. make the image center the origin) to have a unified origin for our normalization process. One can make the center point of the image the origin by calculating the relative vectors from the center point as such:

$$x = x_{location} - x_0$$

$$y = y_{location} - y_0$$

Here, (x_0, y_0) denotes the x and y coordinates of the center of the image. Now that we have an origin, we can normalize the vectors using their Euclidean norms.

```
% Focal length in pixels
F=961;

% Eight corresponding points of two images
pts1 = [[129 322]; [544 1127]; [225 133]; [335 168]; [380 341]; [210 738];
[210 748]; [224 738]];
pts2 = [[304 318]; [725 1106]; [390 114]; [499 137]; [544 309]; [385 708];
[386 717]; [399 708]];

% Center coordinates of image
x_center = 960/2;
y_center = 1280/2;

% Obtaining N-vectors
image1_points = [pts1 ones(8,1)*F];
image1_points(:,1) = image1_points (:,1) - x0 ;
image1_points (:,2) = image1_points (:,2) - y0 ;
image1_norm = vecnorm (image1_points , 2 , 2) ;
image1_points = image1_points ./ image1_norm ;

image2_points = [pts2 ones(8,1)*F];
image2_points (:,1) = image2_points (:,1) - x0 ;
image2_points (:,2) = image2_points (:,2) - y0 ;
image2_norm = vecnorm (image2_points , 2 , 2) ;
image2_points = image2_points ./ image2_norm ;
```

Figure 10: Obtaining N-vectors of the points

The final n-vectors for each image are as follows:

image1_points =
-0.3276 -0.2968 0.8970
0.0593 0.4512 0.8904
-0.2285 -0.4543 0.8611
-0.1342 -0.4369 0.8895
-0.0989 -0.2956 0.9502
-0.2692 0.0977 0.9581
-0.2689 0.1076 0.9571
-0.2562 0.0981 0.9616

image2_points =
-0.1711 -0.3130 0.9342
0.2236 0.4253 0.8770
-0.0819 -0.4785 0.8743
0.0175 -0.4637 0.8858
0.0628 -0.3250 0.9436
-0.0981 0.0702 0.9927
-0.0970 0.0795 0.9921
-0.0838 0.0703 0.9940

Question 4

Calculate the rotation angle from the matched points using the quaternion approach (pp 14 in [4]), or the SVD(in [3]). (40 marks)

We are opting for the SVD approach in [3].

A 3×3 matrix W is obtained where $W = \sum_{i=1}^N x_i^T p_i \in R^{3 \times 3}$. x and p are the N-vectors

relative to the center of the images respectively, corresponding to *image1_points* and *image2_points* respectively.

```
% Creating W matrix
weight_matrix = zeros ( 3 ,3) ;
for i = 1:8
temp = transpose ( image1_points ( i ,:) ) * image2_points ( i ,:) ;
weight_matrix = weight_matrix + temp ;
end
```

Figure 11: Computing the W matrix

W can be further factorized into 3 matrices $U\Sigma V^T$ via singular value decomposition. Any invertible linear transformation can be broken down into a rotation/reflection, scaling and another rotation/reflection. As such, the rotational matrix R of the linear transformation can be computed via the following formula:

$$R = UV^T$$

```
% SVD approach
[U , S , V ] = svd( W ) ;
rotational_matrix = U * transpose ( V ) ;
```

Figure 12: Performing SVD of the W matrix to compute the Rotational matrix

Using the rotational matrix R , we can calculate the rotation angle Ω as follows:

$$\Omega = \cos^{-1}\left(\frac{\text{trace}(R)-1}{2}\right)$$

This gives us a rotation angle of 10.2375° , which is close to the ground truth of 9° .

```
angleInRadians = acos((trace(rotational_matrix)-1)/2);
angleInDeg = rad2deg(angleInRadians);
% angleInDeg = 10.2375 degrees;
```

Figure 13: Obtaining rotational angle in degrees

We can further double check the validity of our rotational matrix by calculating the N-vector of the rotational axis \mathbf{l} . We obtain a N-vector that is approximately [0, -1, 0], indicating that we only have rotation about the y axis. This is accurate as we only rotated the phone 9° around a single axis.

```
l = transpose ([ rotational_matrix(3 ,2)-rotational_matrix(2 ,3)
rotational_matrix(1 ,3)-rotational_matrix(3 ,1) rotational_matrix(2
,1)-rotational_matrix(1 ,2)]) ;
l = l ./ vecnorm(l);
% N vector of rotational axis, [-0.1640 -0.9831 0.0814 ]
```

Figure 14: Obtaining the rotational axis