

## Homework 3: Camera Geometry

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Handout: 2024-10-11

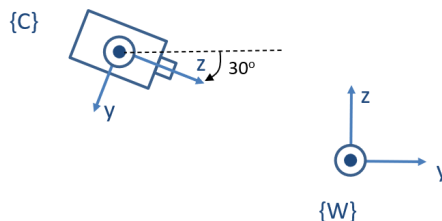
Due: 2024-10-28, at 3:00 PM on Canvas

### Instructions:

- Homework is on a “rolling” basis and more **questions will be added until 1 week** before the due date. There will be an announcement (on Discord or in class) when new questions are added.
- For all problems in this homework, you can convert your images to **grayscale** for simplicity. So, no need to work with RGB images (unless you want to).
- You can get help from your teammates (or others) for all problems and/or code. However, you will need to code the problems and submit your report **individually** on Canvas. Reports/code that are **identical** will receive a grade of **zero**.
- The **quiz** will strongly resemble homework questions, and if you understood/coded the homework yourself, you will be able to answer the quiz questions immediately. Because the quiz will be closed-notes & no internet access, understanding the homework is crucial!
- **Deliverables:** You will submit a **single PDF** file to Canvas. The PDF must contain your **answers**, your **code** (copy-paste in the document), and any requested **outputs** (like images). For convenience, you may use Jupyter notebook and convert it to a PDF.
- Only use **images provided** in the homework material, as requested by each problem. Using any other image, will result in a **grade of zero**.
- **Grading:** This homework will be scaled to **10pts** of your final grade. Grading **rubric** will be posted on **Canvas** after the assignment due date.

### Problem 1: Coordinate transformation:

- 2D transformation: Compute the coordinate of a 2D point  $p = (10, 20)^T$  using a transformation of 45 degrees about the x-axis, and a translation of  $t = (40, -30)^T$ . Answer/explain the following:
  - What is the point representation in homogeneous coordinates?
  - What is the rotation matrix  $R$ ?
  - What is the translation vector  $t$ ?
  - What is the full transformation matrix (consisting of  $R, t$ ) that can be used to transform the homogeneous point coordinate?
  - How do we apply this transformation to the point (in homogeneous coordinate form)?
  - What is the coordinate of the transformed point, in homogeneous coordinates, and in the cartesian coordinates?
- 3D transformation: A camera is located at point  $(0, -5, 3)$  in the world frame. The camera is tilted down by 30 degrees from the horizontal. We want to find the 4x4 homogeneous transformation  ${}^C H_W$  from the world frame  $\{W\}$  to camera frame  $\{C\}$ . Note that in “the world” Z is up (X-Y ground plane) but in “the camera”, Z is out (X-Y image plane).



Answer/explain the following:

- What is  ${}^C H_W$ ? Explain how you computed it.

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- Using transformation  ${}^C H_W$ , transform the point  ${}^W p = (0,0,1)$  in the world frame to the camera frame. Hint: use the homogeneous coordinates of the point for this transformation.

Notes:

- If you are not familiar with coordinate transformations, please take a look at the notes "Coordinate\_Transforms.pdf" in the HW3 folder of course materials.

### Problem 2: Camera calibration:

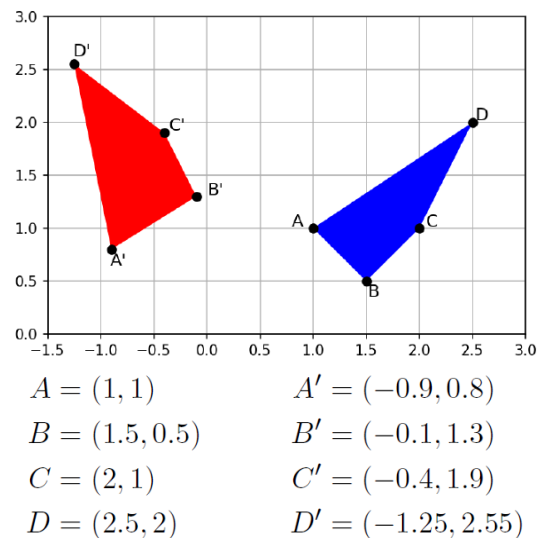
- Find the calibration/ intrinsic matrix of a camera (e.g., your cellphone camera). Use the camera calibration board (print PDF file) provided in the HW3 folder.
  - Provide a copy of your code in the report
  - Display the images you took from the calibration board (at different angles/locations)
  - After calibration, print out the camera intrinsic matrix
  - Print out five distortion parameters, and explain what they are for.
  - Print out camera extrinsic matrices for all of your images

Notes:

- For this problem, you can follow the camera calibration instructions at
  - [https://docs.opencv.org/4.x/dc/dbb/tutorial\\_py\\_calibration.html](https://docs.opencv.org/4.x/dc/dbb/tutorial_py_calibration.html)
  - <https://www.geeksforgeeks.org/camera-calibration-with-python-opencv/>

### Problem 3: Least-squares estimation:

Suppose we have a quadrilateral ABCD and a transformed version A'B'C'D' as seen in the image below.



Let's assume that each point in ABCD was approximately mapped to its corresponding point in A'B'C'D' by a 2x2 transformation matrix  $M$ . That is, if  $X = \begin{bmatrix} x \\ y \end{bmatrix}$ , and  $X' = \begin{bmatrix} x' \\ y' \end{bmatrix}$ , and  $M = \begin{bmatrix} m_{11} & m_{12} \\ m_{21} & m_{22} \end{bmatrix}$ , then

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$$\begin{bmatrix} m_{11} & m_{12} \\ m_{21} & m_{22} \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} \approx \begin{bmatrix} x' \\ y' \end{bmatrix}$$

We would like to approximate  $M$  using least squares for linear regression.

- Rewrite the equation  $M X \approx X'$  into a pair of linear equations by expanding the matrix multiplication. Do this by replacing each of the “ $\_$ ” below with  $x, y, x', y'$ , or 0, and **print out** the answer.

$$\begin{cases} \_ m_{11} + \_ m_{12} + \_ m_{21} + \_ m_{22} = \_ \\ \_ m_{11} + \_ m_{12} + \_ m_{21} + \_ m_{22} = \_ \end{cases}$$

- With the quadrilaterals in question, there are 4 points that transform. So we should expect to see 8 such equations (2 for each point) that use the transformation equation  $M$ . From stacking these pairs of equations for all point correspondences, we can construct a  $8 \times 4$  matrix  $Q$  and a  $8 \times 1$  column vector  $b$  that satisfy

$$Q \begin{bmatrix} m_{11} \\ m_{12} \\ m_{21} \\ m_{22} \end{bmatrix} = b$$

Find and **print out**  $Q$  and  $b$  (which are based on the coordinate values of ABCD and A'B'C'D').

- Our problem is now over-constrained, so we want to find  $m_{ij}$  that minimize the least squared error between, i.e., we want to minimize  $\|Qm - b\|^2$ , where  $m$  is the  $4 \times 1$  vector, shown above, containing  $m_{ij}$  elements. Use `numpy.linalg.lstsq()` to take in the  $Q$  matrix and  $b$  vector you found above, and return the solution vector  $m$ . Reshape the output  $m$  from `linalg.lstsq` to get the  $2 \times 2$  matrix  $M$ . **Print out** the matrix  $M = \begin{bmatrix} m_{11} & m_{12} \\ m_{21} & m_{22} \end{bmatrix}$ .

### Problem 4: Panorama:

Panoramic photography is a technique that combines multiple images captured by a rotating camera into a single, wide photo. This is done by combining images based on their matching features through a process called image stitching. Given images named “**filed1.jpg**” through “**filed8.jpg**”, write an algorithm that stitches the images together to create a panorama. You can use the template provided in “**panorama\_template.py**” and add your code as needed to complete the assignment. **Print out the entire code** in your report, which must contain the following steps:

- Load **all 8 images** and downsample them by a factor of 5 or more (to speed up the process and help with displaying the final result)
- For each consecutive image pair, detect and match **SIFT features** using **Low’s threshold of 0.7**
- Compute **homography** between the image pair using matched features and **RANSAC** algorithm
- Use computed homographies to warp all images onto one base image perspective using `cv2.warpPerspective()`. Combine the base and warped images and **display the resulting panorama image**.



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Note: you are **NOT allowed** to use any existing panorama and image stitching libraries, e.g., OpenCV's `stitcher.stitch(images)`.

### Problem 5: 3D reconstruction:

Given images named “left.jpg” and “right.jpg”, write an algorithm that 3d reconstructs the matched SIFT features points. You can use the code template provided in “**twoview\_template.py**” and add your code as needed to complete the assignment. **Print out the entire code** in your report, which must contain the following steps. The camera **intrinsic matrix** is given to you as

```
f, cx, cy = 1000, 1024, 768
K = np.array([[f, 0, cx], [0, f, cy], [0, 0, 1]])
```

- Load the images and extract and match **SIFT** features using **Lowe's threshold of 0.7**
- Find the **fundamental/essential matrix** using **RANSAC**, and **print the matrix**
- **Show** matched **inlier** feature points (based on the RANSAC results) connected by lines across the images



- Recover the relative **rotation** and **translation** between the camera views from the fundamental/essential matrix and **print the results**
- Reconstruct 3D points via triangulation, and **display** the resulting 3D points

