## Line and point detection

## 1 Feature point detection and matching

Exercise 1. Write a function corners (image: np.ndarray, w: int, kappa: float) that implements the Harris corner detector. Your function should:

- a. Apply a  $w \times w$  Gaussian filter to the image I to remove noise.
- b. Compute the gradients  $I_x$ ,  $I_y$  of the image in x and y directions.
- c. Compute the Harris operator at each pixel (x, y)

$$K(x,y) = \frac{\det(H(x,y))}{\operatorname{trace}(H(x,y))} \text{ where } H(x,y) = \sum_{(u,v) \in W(x,y)} w(u,v) \begin{bmatrix} I_x^2 & I_x I_y \\ I_x I_y & I_y^2 \end{bmatrix}_{(x+u,y+v)}$$

where w(u, v) is the Gaussian window function and W(x, y) is a  $w \times w$  neighborhood of (x, y).

- d. Find the set of pixels  $H = \{(x,y) : K(x,y) > \kappa\}$  such that the response of the Harris operator is above a threshold  $\kappa$ .
- e. Apply non-maximum-suppression in a  $w \times w$  pixel neighborhood of each  $(x, y) \in H$ . Store the pixel coordinates of the resulting keypoints.

Write a script that tests your code on images "ames1.JPG" for different values of the window size w and the Harris corner threshold  $\kappa$ . For the best choice, plot the results of each step, as well as the Harris corners before and after non-maximum-suppression.

Exercise 2. Write a function features (image: np.ndarray, keypoints: np.ndarray) that extracts a descriptor centered around each keypoint in keypoints  $\in \mathbb{R}^{2 \times P}$ . Use a simple vectorized image patch of  $9 \times 9$  pixels as your descriptor so that descriptors  $\in \mathbb{R}^{81 \times P}$ .

Exercise 3. Write a function matching (descriptors1: np.ndarray, descriptors2: np.ndarray, tau: float) that matches two sets of feature descriptors using the sum of squared differences (SSD) as a matching score. Your function should return for each descriptor in image 1 the index of the best match in image 2 provided that the SSD score is above a threshold  $\tau$ . If a descriptor in image 1 has no match, then the corresponding entry of matches should be set to -1. Write a script that tests your code on image pair: "ames1.JPG" and "ames2.JPG" and plots the resulting matches. Plot also the ROC curve and use it to select the threshold.

## 2 Line detector

**Exercise 4.** Write a script that does the following.

- a. Apply the Canny edge detector to images: "ames1.JPG".
- b. Apply **Hough transform** to the detected edges. Plot the lines estimated by Hough transform superimposed on the image.
- c. Show the original image, edge map (after step 1), and final image (after step 2).