

# FEATURE DETECTION

Harris

## I. HARRIS

### ➤ BACKGROUND

When you are solving a puzzle and you look for the place of each piece, you are looking for specific pattern or specific feature to determine the exact location of this feature [1]. However, can you describe these features?

Let's explore the following example:



For A and B, you can hardly determine their exact location in the image as they are flat surface, for C and D, you know they are on the top of the building but still not the exact location. For E and F, you can for sure determine where they exist. This is a small example to understand the importance of corners as features.

## ➤ HARRIS ALGORITHM

### 1- Compute derivatives at each pixel

- Calculate image derivative
- Calculate square of derivative

### 2- Compute second moment matrix M in a Gaussian window around each pixel

$$M = \sum_{x,y} w(x,y) \begin{bmatrix} I_x^2 & I_x I_y \\ I_x I_y & I_y^2 \end{bmatrix} = \begin{bmatrix} \lambda_1 & 0 \\ 0 & \lambda_2 \end{bmatrix}$$

- If either  $\lambda$  is close to 0, then this is **not** a corner, so look for locations where both are large.

### 1- Compute corner response function R and apply a threshold.

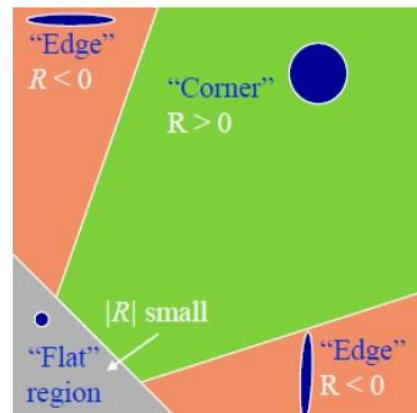
$$R = \det(M) - \alpha \text{trace}(M)^2 = \lambda_1 \lambda_2 - \alpha (\lambda_1 + \lambda_2)^2$$

$\alpha$  : constant (0.04 to 0.06)

$$\det \left( \begin{bmatrix} a & b \\ c & d \end{bmatrix} \right) = ad - bc$$

$$\text{trace} \left( \begin{bmatrix} a & b \\ c & d \end{bmatrix} \right) = a + d$$

- $R$  is large for a **corner**
- $R$  is negative with large magnitude for an **edge**
- $|R|$  is small for a **flat** region



### 2- Find local maxima of response function (non-maximum suppression)

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## ➤ HARRIS IN OPENCV

Use a grayscale image with the method `cv2.cornerHarris` to locate the corners using opencv. Usually, chessboard dominates as a basic example for corner detections.

- **src** – Input single-channel 8-bit or floating-point image.
- **blockSize** – Neighborhood size, calculates the covariation matrix of derivatives over the neighborhood where the derivatives are computed using the Sobel() operator.

**Parameters:**

- **ksize** – Aperture parameter for the Sobel() operator.
- **k** – Harris detector free parameter. See the formula below.
- **borderType** – Pixel extrapolation method.
- **Output** – Image to store the Harris detector responses. It has the type CV\_32FC1 and the same size as src .

for each pixel (x,y) it calculates a (2x2) gradient covariance matrix  $M^{(x,y)}$  over a (blocksize x blocksize) neighborhood. Then, it computes the following characteristic:

$$ds(x, y) = \det(M^{x,y}) - k \cdot (\text{trac}(M^{x,y}))^2$$

```
filename = 'chessboard.jpg'
img = cv2.imread(filename)
gray = cv2.cvtColor(img, cv2.COLOR_BGR2GRAY)
gray = np.float32(gray)
```

```
dst = cv2.cornerHarris(gray, 2, 3, 0.04)

#result is dilated for marking the corners, not important
dst = cv2.dilate(dst, None)

# Threshold for an optimal value, it may vary depending on the
image.
img[dst>0.01*dst.max()]=[0, 0, 255]
```

## II. Assignment : Non-Maximum Suppression

Implement the missing codes in the attached script.