

Computer Graphics

실습 5.

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박 화 종

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공 지 사 항

- 과제 제출 시 .pdf 혹은 .py 파일을 첨부하지 않으면 감점(-6점)
- .pdf 파일이 아니라 .hwp 혹은 .docx(워드) 로 보고서 제출 시 감점(-1점)

실습 소개

- 과목 홈페이지

- 충남대학교 사이버 캠퍼스 (<http://e-learn.cnu.ac.kr>)

- TA 연락처

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- 실습 튜터

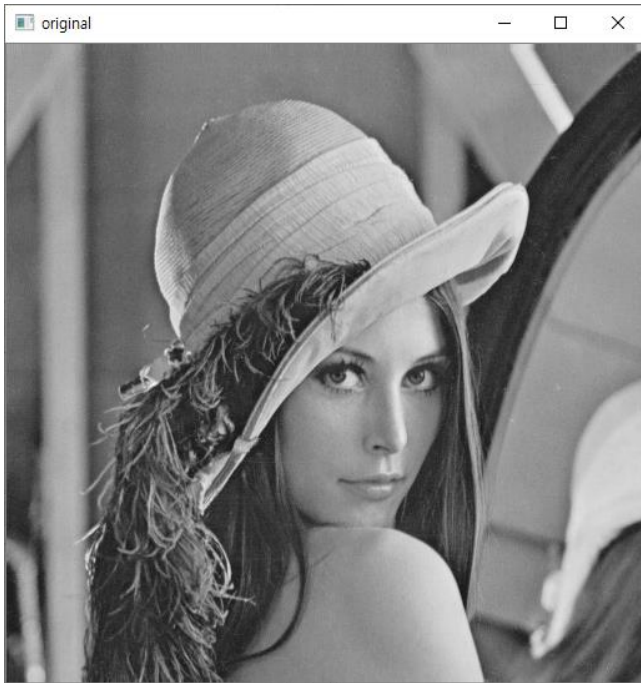
- 최수민(00반)
- eocjstnals12@naver.com
- 신준호(01반)
- wnsgh578@naver.com

목 차

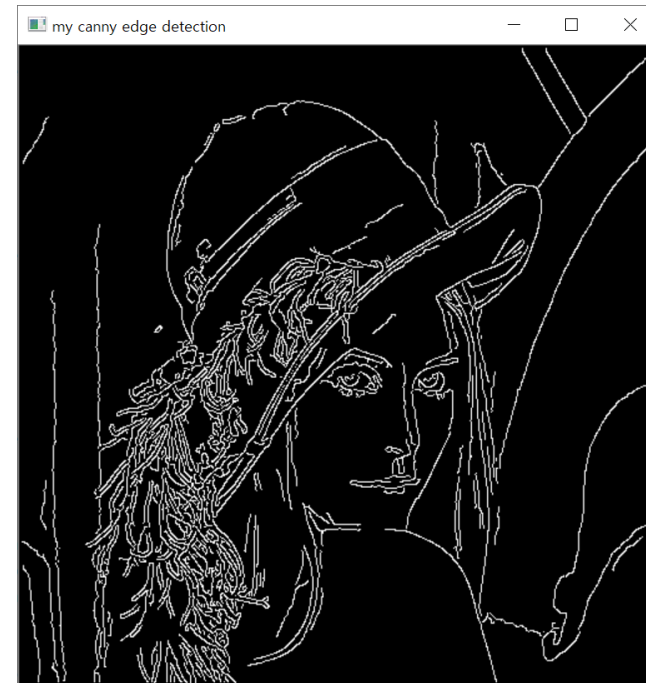
- 3주차 과제 리뷰
- 실습
 - Filter
- 과제
 - Integral image

3주차 과제 리뷰

- Canny edge detection 구현하기



original



Canny Edge Detection

3주차 과제 리뷰

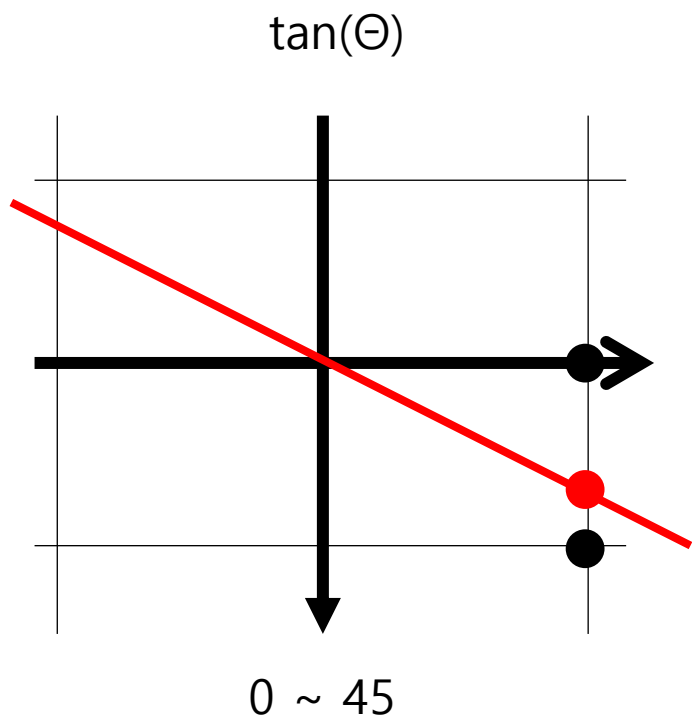
```
# Ix와 Iy의 magnitude를 구함
def calcMagnitude(Ix, Iy):
    #####
    # TODO #
    # calcMagnitude 완성 #
    # magnitude : ix와 iy의 magnitude #
    #####
    # Ix와 Iy의 magnitude를 계산
    magnitude = np.sqrt(Ix ** 2 + Iy ** 2)
    return magnitude

# Ix와 Iy의 angle을 구함
def calcAngle(Ix, Iy):
    #####
    # TODO #
    # calcAngle 완성 #
    # angle : ix와 iy의 angle #
    #####
    angle = np.rad2deg(np.arctan(Iy / (Ix+1e-6)))

    return angle
```

3주차 과제 리뷰

Non maximum suppression 함수



gradient의 degree는 edge와 수직방향이다.

```
if 0 <= degree and degree < 45:
    rate = np.tan(np.deg2rad(degree))
    left_magnitude = (rate) * magnitude[row - 1, col - 1] + (1 - rate) * magnitude[row, col - 1]
    right_magnitude = (rate) * magnitude[row + 1, col + 1] + (1 - rate) * magnitude[row, col + 1]
    if magnitude[row, col] == max(left_magnitude, magnitude[row, col], right_magnitude):
        larger_magnitude[row, col] = magnitude[row, col]

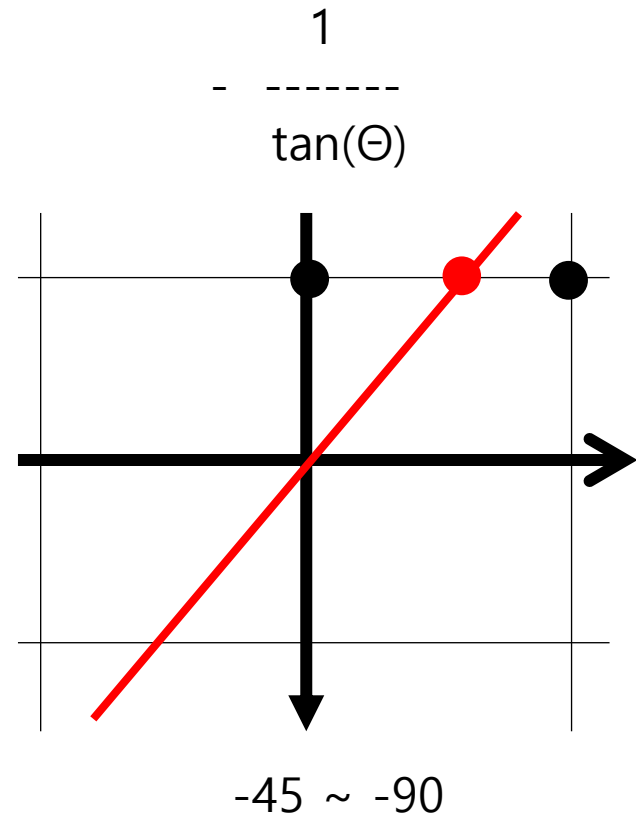
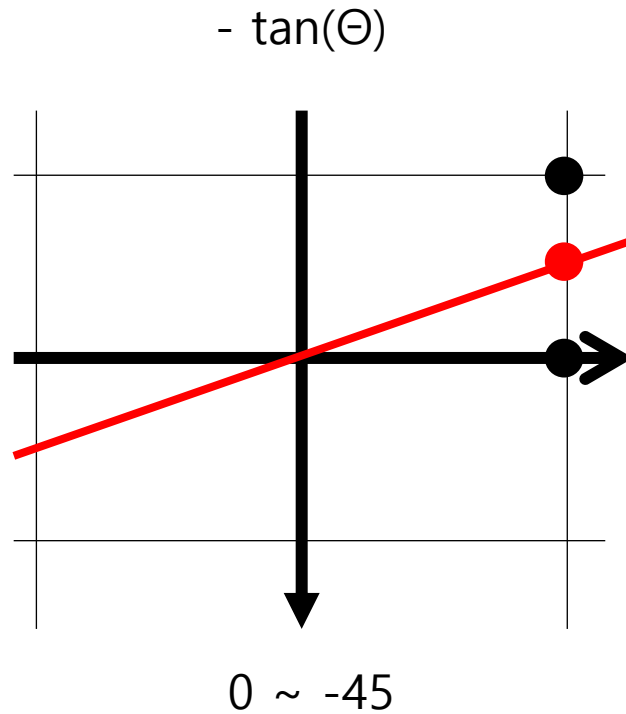
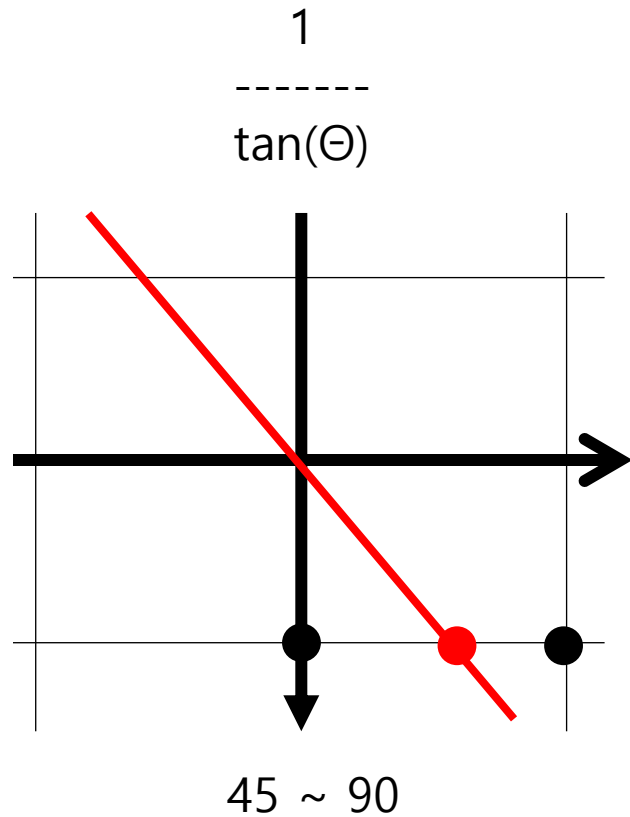
elif -45 > degree and degree >= -90:
    rate = -1 / np.tan(np.deg2rad(degree))
    up_magnitude = (1 - rate) * magnitude[row - 1, col] + rate * magnitude[row - 1, col + 1]
    down_magnitude = (1 - rate) * magnitude[row + 1, col] + rate * magnitude[row + 1, col - 1]
    if magnitude[row, col] == max(up_magnitude, magnitude[row, col], down_magnitude):
        larger_magnitude[row, col] = magnitude[row, col]

elif -45 <= degree and degree < 0:
    rate = -np.tan(np.deg2rad(degree))
    left_magnitude = (1 - rate) * magnitude[row, col - 1] + rate * magnitude[row + 1, col - 1]
    right_magnitude = (1 - rate) * magnitude[row, col + 1] + rate * magnitude[row - 1, col + 1]
    if magnitude[row, col] == max(left_magnitude, magnitude[row, col], right_magnitude):
        larger_magnitude[row, col] = magnitude[row, col]

elif 90 >= degree and degree >= 45:
    rate = 1 / np.tan(np.deg2rad(degree))
    up_magnitude = (1 - rate) * magnitude[row - 1, col] + rate * magnitude[row - 1, col - 1]
    down_magnitude = (1 - rate) * magnitude[row + 1, col] + rate * magnitude[row + 1, col + 1]
    if magnitude[row, col] == max(up_magnitude, magnitude[row, col], down_magnitude):
        larger_magnitude[row, col] = magnitude[row, col]
```

3주차 과제 리뷰

Non maximum suppression 함수



3주차 과제 리뷰

Non maximum suppression 함수

```
# double_thresholding 수행 high threshold value는 내장함수(otsu방식 이용)를 사용하여 구하고 low thr
def double_thresholding(src, test_mode=False):
    (h, w) = src.shape
    high_threshold_value, _ = cv2.threshold(src, 0, 255, cv2.THRESH_OTSU)
    print('highthreshold')
    print(high_threshold_value)
    if test_mode == True:
        print('test mode!! - double threshold function')
        high_threshold_value = 200
    low_threshold_value = high_threshold_value * 0.4

    dst = src.copy()
    for row in range(h):
        for col in range(w):
            if dst[row, col] >= high_threshold_value:
                dst[row, col] = 255
            elif dst[row, col] < low_threshold_value:
                dst[row, col] = 0
            else:
                weak_edge = []
                weak_edge.append((row, col))
                search_weak_edge(dst, weak_edge, high_threshold_value, low_threshold_value)
                if calssity_edge(dst, weak_edge, high_threshold_value):
                    for idx in range(len(weak_edge)):
                        (r, c) = weak_edge[idx]
                        dst[r, c] = 255
                else:
                    for idx in range(len(weak_edge)):
                        (r, c) = weak_edge[idx]
                        dst[r, c] = 0

    return dst
```

3주차 과제 리뷰

Non maximum suppression 함수

```
def search_weak_edge(dst, edges, high_threshold_value, low_threshold_value):
    # now (row, col) = edges[-1]
    (row, col) = edges[-1]
    for i in range(-1, 2):
        for j in range(-1, 2):
            if dst[row+i, col+j] < high_threshold_value and dst[row+i, col+j] >= low_threshold_value:
                # 중복 아닌 값만 append
                if edges.count((row+i, col+j)) < 1:
                    edges.append((row+i, col+j))
                    search_weak_edge(dst, edges, high_threshold_value, low_threshold_value)

def calssity_edge(dst, weak_edge, high_threshold_value):
    for idx in range(len(weak_edge)):
        (row, col) = weak_edge[idx]
        value = np.max(dst[row-1:row+2, col-1:col+2])
        if value >= high_threshold_value:
            return True
```

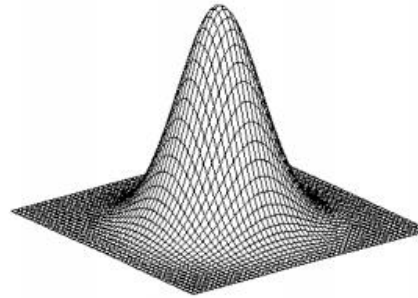
실습

• Filter 모양 확인

- Average filter
- Gaussian filter
- Derivative of Gaussian

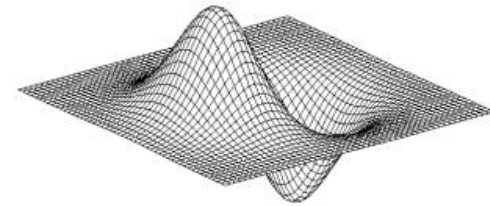
2D Derivative of Gaussian (DoG)

18/28



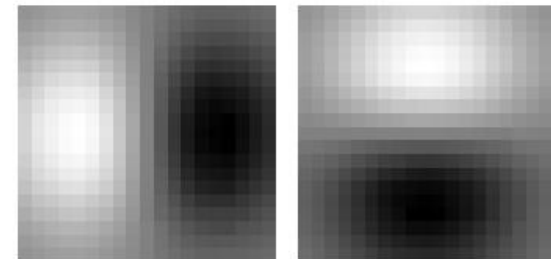
Gaussian

$$G(x, y) = \frac{1}{2\pi\sigma^2} e^{-\frac{x^2+y^2}{2\sigma^2}}$$



derivative of Gaussian (DOG)

$$\nabla G(x, y) = (G_x, G_y)$$



실습

- Average filter



```
[[0.11111111 0.11111111 0.11111111]
 [0.11111111 0.11111111 0.11111111]
 [0.11111111 0.11111111 0.11111111]]
```

```
import cv2
import numpy as np

def show_filter(type, fshape):
    show_filter_size = (32, 32)
    if type == 'average':
        filter = np.ones(fshape)
        filter = filter / (fshape[0] * fshape[1])
        print(filter)

    cv2.imshow(type + ' filter', filter)
    cv2.waitKey()
    cv2.destroyAllWindows()

def main():
    type = 'average'
    fshape = (3, 3)
    show_filter(type, fshape)

if __name__ == '__main__':
    main()
```

실습

- Average filter



```
[[0.11111111 0.11111111 0.11111111 ... 0.11111111 0.11111111 0.11111111]
 [0.11111111 0.11111111 0.11111111 ... 0.11111111 0.11111111 0.11111111]
 [0.11111111 0.11111111 0.11111111 ... 0.11111111 0.11111111 0.11111111]
 ...
 [0.11111111 0.11111111 0.11111111 ... 0.11111111 0.11111111 0.11111111]
 [0.11111111 0.11111111 0.11111111 ... 0.11111111 0.11111111 0.11111111]
 [0.11111111 0.11111111 0.11111111 ... 0.11111111 0.11111111 0.11111111]]
```

```
import cv2
import numpy as np

def show_filter(type, fshape):
    show_filter_size = (32, 32)
    if type == 'average':
        filter = np.ones(fshape)
        filter = filter / (fshape[0] * fshape[1])
        filter = cv2.resize(filter, (show_filter_size), interpolation=cv2.INTER_NEAREST)

    print(filter)

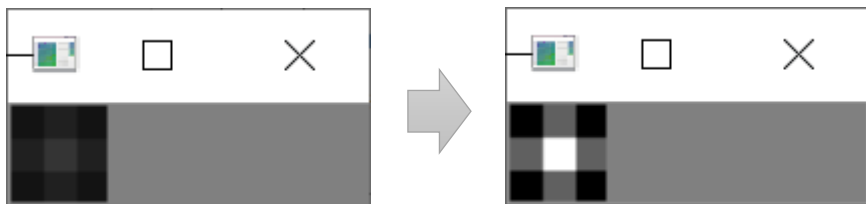
cv2.imshow(type + ' filter', filter)
cv2.waitKey()
cv2.destroyAllWindows()

def main():
    type = 'average'
    fshape = (3, 3)
    show_filter(type, fshape)

if __name__ == '__main__':
    main()
```

실습

• Gaussian



normalize(보기편하게)

```
<gaussian 3x3>
[[0.07511361 0.1238414 0.07511361]
 [0.1238414 0.20417996 0.1238414 ]
 [0.07511361 0.1238414 0.07511361]]
<gaussian 32x32 Nearest>
[[0.07511361 0.07511361 0.07511361 ... 0.07511361 0.07511361 0.07511361]
 [0.07511361 0.07511361 0.07511361 ... 0.07511361 0.07511361 0.07511361]
 [0.07511361 0.07511361 0.07511361 ... 0.07511361 0.07511361 0.07511361]
 ...
 [0.07511361 0.07511361 0.07511361 ... 0.07511361 0.07511361 0.07511361]
 [0.07511361 0.07511361 0.07511361 ... 0.07511361 0.07511361 0.07511361]
 [0.07511361 0.07511361 0.07511361 ... 0.07511361 0.07511361 0.07511361]]
<gaussian 32x32 Normalize 0 ~ 1>
[[0. 0. 0. ... 0. 0. 0.]
 [0. 0. 0. ... 0. 0. 0.]
 [0. 0. 0. ... 0. 0. 0.]
 ...
 [0. 0. 0. ... 0. 0. 0.]
 [0. 0. 0. ... 0. 0. 0.]
 [0. 0. 0. ... 0. 0. 0.]]
```

```
import cv2
import numpy as np

def my_get_Gaussian_filter(fshape, sigma=1):
    (f_h, f_w) = fshape
    y, x = np.mgrid[-(f_h // 2):(f_h // 2) + 1, -(f_w // 2):(f_w // 2) + 1]
    #2차 gaussian mask 생성
    filter_gaus = 1 / (2 * np.pi * sigma**2) * np.exp(-((x**2 + y**2)/(2 * sigma**2)))
    #mask의 총 합 = 1
    filter_gaus /= np.sum(filter_gaus)
    return filter_gaus

def show_filter(type, fshape):
    show_filter_size = (32, 32)
    if type == 'average':...

    elif type == 'gaussian':
        sigma = 1
        filter = my_get_Gaussian_filter(fshape, sigma)
        print('<gaussian 3x3>')
        print(filter)
        filter = cv2.resize(filter, (show_filter_size), interpolation=cv2.INTER_NEAREST)
        print('<gaussian 32x32 Nearest>')
        print(filter)
        filter = (filter - np.min(filter)) / (np.max(filter) - np.min(filter))
        print('<gaussian 32x32 Normalize 0 ~ 1>')
        print(filter)

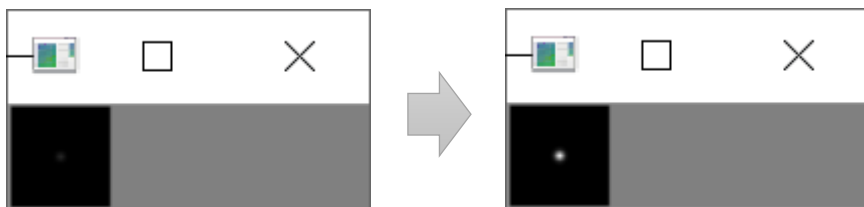
    cv2.imshow(type + ' filter', filter)
    cv2.waitKey()
    cv2.destroyAllWindows()

def main():
    type = 'gaussian'
    fshape = (3, 3)
    show_filter(type, fshape)

if __name__ == '__main__':
    main()
```

실습

• Gaussian



normalize(보기편하게)

```
<gaussian 32x32>
[[1.05301064e-112 5.67540985e-106 1.12529714e-099 ... 1.12529714e-099
 5.67540985e-106 1.05301064e-112]
 [5.67540985e-106 3.05887478e-099 6.06501231e-093 ... 6.06501231e-093
 3.05887478e-099 5.67540985e-106]
 [1.12529714e-099 6.06501231e-093 1.20254593e-086 ... 1.20254593e-086
 6.06501231e-093 1.12529714e-099]
 ...
 [1.12529714e-099 6.06501231e-093 1.20254593e-086 ... 1.20254593e-086
 6.06501231e-093 1.12529714e-099]
 [5.67540985e-106 3.05887478e-099 6.06501231e-093 ... 6.06501231e-093
 3.05887478e-099 5.67540985e-106]
 [1.05301064e-112 5.67540985e-106 1.12529714e-099 ... 1.12529714e-099
 5.67540985e-106 1.05301064e-112]]
```

```
def show_filter(type, fshape):
    show_filter_size = (32, 32)
    if type == 'average':...

    elif type == 'gaussian':
        sigma = 1
        """filter = my_get_Gaussian_filter(fshape, sigma)
        print('<gaussian 3x3>')
        print(filter)
        filter = cv2.resize(filter, (show_filter_size), interpolation=cv2.INTER
        print('<gaussian 32x32 Nearest>')
        print(filter)"""

        filter = my_get_Gaussian_filter(fshape, sigma)
        print('<gaussian 32x32>')
        print(filter)

        filter = (filter - np.min(filter)) / (np.max(filter) - np.min(filter))
        print('<gaussian 32x32 Normalize 0 ~ 1>')
        print(filter)

cv2.imshow(type + ' filter', filter)
cv2.waitKey()
cv2.destroyAllWindows()

def main():
    type = 'gaussian'
    fshape = (32, 32)
    show_filter(type, fshape)

if __name__ == '__main__':
    main()
```

실습

- Gaussian



normalize(보기편하게)



sigma : 3



sigma : 1

```
def show_filter(type, fshape):  
    show_filter_size = (32, 32)  
    if type == 'average':...  
  
    elif type == 'gaussian':  
        sigma = 3  
        """filter = my_get_Gaussian_filter(fshape, sigma)  
        print('<gaussian 3x3>')  
        print(filter)  
        filter = cv2.resize(filter, (show_filter_size), interpolation=cv2.INTER_NEAREST)  
        print('<gaussian 32x32 Nearest>')  
        print(filter)"""  
  
        filter = my_get_Gaussian_filter(fshape, sigma)  
        print('<gaussian 32x32>')  
        print(filter)  
  
        filter = (filter - np.min(filter)) / (np.max(filter) - np.min(filter))  
        print('<gaussian 32x32 Normalize 0 ~ 1>')  
        print(filter)  
  
    cv2.imshow(type + ' filter', filter)  
    cv2.waitKey()  
    cv2.destroyAllWindows()
```


실습

- Gaussian



sigma = 3



sigma = 7



sigma = 10

실습

- Gaussian filter의 Sigma값이 크면 Average필터와 비슷하다?

```
[[0.11111111 0.11111111 0.11111111]  
 [0.11111111 0.11111111 0.11111111]  
 [0.11111111 0.11111111 0.11111111]]
```

Average filter 3x3

```
[[0.07511361 0.1238414  0.07511361]  
 [0.1238414  0.20417996 0.1238414 ]  
 [0.07511361 0.1238414  0.07511361]]
```

Gaussian filter 3x3
sigma : 1

```
[[0.11110741 0.11111296 0.11110741]  
 [0.11111296 0.11111852 0.11111296]  
 [0.11110741 0.11111296 0.11110741]]
```

Gaussian filter 3x3
sigma : 100

실습

• Derivative of Gaussian



normalize(보기편하게)



sigma : 1 -> 5



```
def get_my_DoG(fshape, sigma=1):
    (f_h, f_w) = fshape
    y, x = np.mgrid[-(f_h // 2):(f_h // 2) + 1, -(f_w // 2):(f_w // 2) + 1]
    DoG_x = (-x / sigma**2) * np.exp(-(x **2 + y **2)/(2 * sigma**2))
    DoG_y = (-y / sigma**2) * np.exp(-(x **2 + y **2)/(2 * sigma**2))
    return DoG_x, DoG_y
```

```
def show_filter(type, fshape):
    show_filter_size = (32, 32)
    if type == 'average':...
    elif type == 'gaussian':...
    elif type == 'dog':
        sigma = 1
        DoG_x, DoG_y = get_my_DoG(fshape, sigma)
        filter = DoG_x
        print('<DoG 32x32>')
        print(filter)
```

normalize (

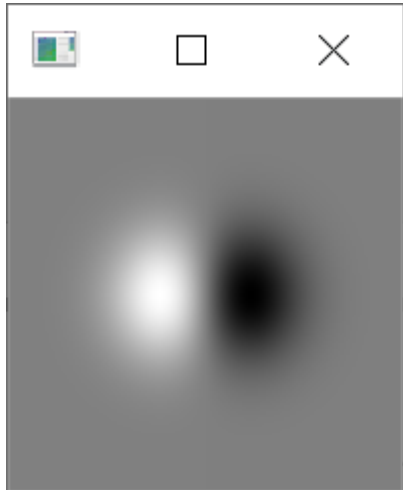
```
#filter = (filter - np.min(filter)) / (np.max(filter) - np.min(filter))
#print('<DoG 32x32 Normalize 0 ~ 1>')
#print(filter)
```

```
cv2.imshow(type + ' filter', filter)
cv2.waitKey()
cv2.destroyAllWindows()
```

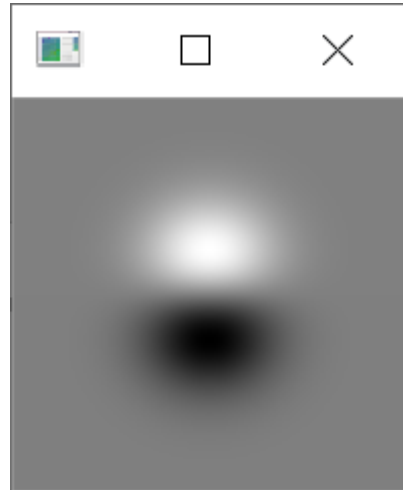
```
def main():
    type = 'dog'
    fshape = (32, 32)
    show_filter(type, fshape)
```

실습

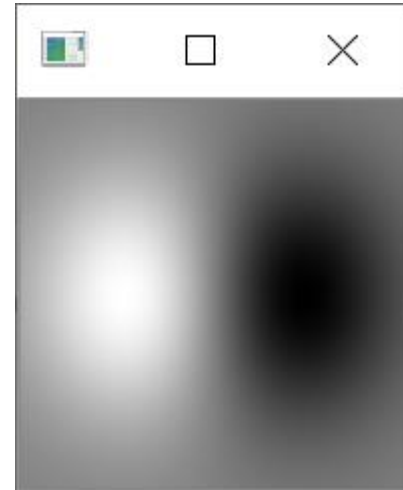
- Derivative of Gaussian



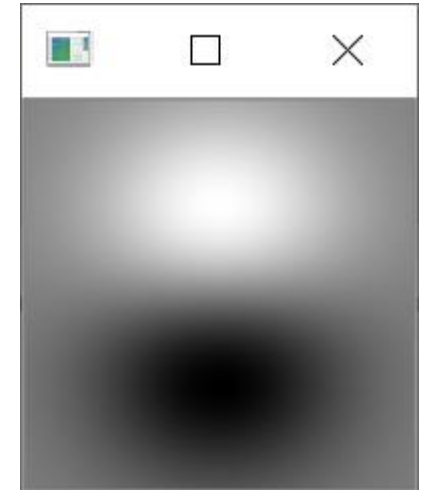
DoG_x
fshape : (128, 128)
sigma : 15



DoG_y
fshape : (128, 128)
sigma : 15



DoG_x
fshape : (128, 128)
sigma : 30



DoG_y
fshape : (128, 128)
sigma : 30

과제

- Integral image 사용시 속도 차이 확인

자신의 학번을 추가하기

```
start!  
src.shape : (552, 435, 3)  
fsize : 5  
M_harris time : 6.1276217  
make integral image time : 0.82419299999999993  
M_harris integral time : 1.15110379999999996
```



original



harris corner



harris corner
integral image

과제

• Integral image 사용시 속도 차이 확인

Integral Image

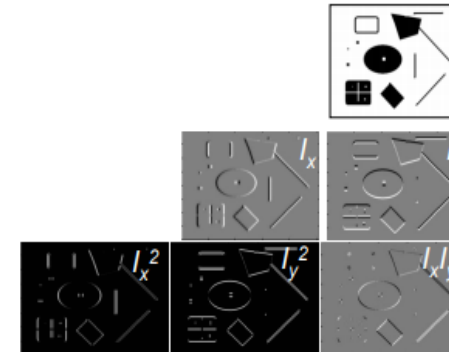
40/54

시간이 오래 걸림

fsize : 5기준
 $552 \times 435 \times 24 \times 3$
 $= 17,288,640$

552 : h
 435 : w
 24 : fsize*fsize-1
 3 : lxlx, lxly, lyly

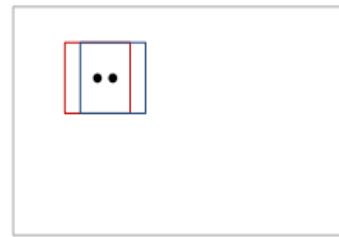
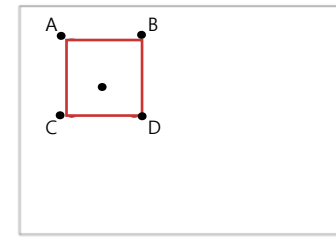
$$M = \sum \begin{bmatrix} I_x I_x & I_x I_y \\ I_x I_y & I_y I_y \end{bmatrix}$$



Integral image를 사용하여
시간 단축

fsize : 5기준
 $552 \times 435 \times 3 \times 3 = 2,161,080$

552 : h
 435 : w
 3 : D - B - C + A
 3 : lxlx, lxly, lyly


 I_x^2


Integral image for I_x^2



과제

• Harris Corner Detection 구현하기

- 저번주차 과제를 참고하여 $I_x I_x$, $I_x I_y$, $I_y I_y$ 구하는 부분 가지고 오기
- $G_{I_x I_x}$, $G_{I_x I_y}$, $G_{I_y I_y}$ 는 사용하지 않음
- integral image를 사용하지 않고 M 구하기(4중for문 사용해야함)
- integral image를 사용하고 M 구하기

- 각각 구한 M을 가지고 harris corner 완성시키기(저번주차 과제 참고)
- R을 구할 때는 교수님 이론ppt 65~66page 참고(4주차 이론ppt)

Harris & Stephens (1988)

$$R = \det(M) - \kappa \text{trace}^2(M)$$

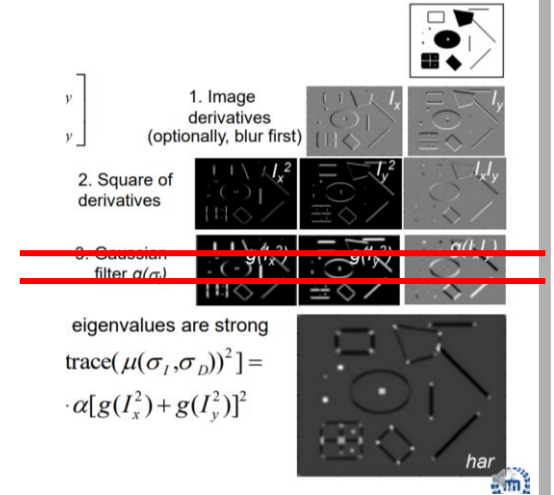
Nobel (1998)

$$R = \frac{\det(M)}{\text{trace}(M) + \epsilon}$$

k : 0.04
E : 1E-8

$$\det \begin{pmatrix} a & b \\ c & d \end{pmatrix} = ad - bc$$

$$\text{trace} \begin{pmatrix} a & b \\ c & d \end{pmatrix} = a + d$$



과제 - 구현

- 제공된 코드가 제대로 동작하도록 구현하기
 - integral image를 사용하지 않고 M 구한 후 harris corner 완성
 - integral image를 사용하고 M 구한 후 harris corner 완성
- 사용한 hyperparameter
 - sobel filter size = 3x3
 - M 구할 때의 filter size = 5x5
 - $k = 0.04$
 - $E = 1E-8$
 - threshold rate = 0.01
 - local maxima filter size = 21
- R = Harris & Stephens (1988) (Nobel (1998)로 구현해도 상관없음)

과제 - 보고서

- 보고서

- 내용:

- 이름, 학번, 학과
 - 구현 코드: 구현한 코드
 - 코드 설명: 구현한 코드에 대한 설명(설명은 1page를 넘기지 말 것, 1줄이어도 상관없음)
 - 이미지: 과제 첫 페이지를 참고하여 이미지 4개 첨부(시간측정결과 포함)
 - 느낀 점 : 결과를 보고 느낀 점, 혹은 과제를 하면서 어려웠던 점 등
 - 과제 난이도: 개인적으로 생각하는 난이도 (과제가 너무 쉬운 것 같다 등)

- .pdf 파일로 제출 (이 외의 파일 형식일 경우 감점)

- 파일 이름:

- [CG]20xxxxxxx_이름_n주차_과제.pdf

과제

- **제출 기한**

- 10월 27일 23시 59분까지 (최대 점수 10점)

- **추가 제출 기한**

- 11월 03일 23시 59분까지 (최대 점수 4점, 과제 총점 계산 후 -6점)
- 11월 04일 00시 00분 이후 (점수 0점)

- **채점**

- 구현을 못하거나(잘못 구현하거나) 보고서 내용이 빠진 경우 감점
- 아무것도 구현하지 못해도 과제 제출하면 기본점수 있음
- 다른 사람의 코드를 copy해서 제출시 보여준 사람, copy한 사람 둘 다 0점
- 내장함수 사용시 감점(내장함수를 사용해도 된다고 말 한 것 제외) – cv2.cornerHarris 사용 불가
- 저번주차 자신이 구현한 코드 가지고 오는 건 상관없음

- **제출 파일**

- 아래의 파일을 압축해서 [CG]20xxxxxxx_이름_n주차_과제.zip로 제출
 - .py 파일 전부
 - .pdf 보고서 파일

QnA