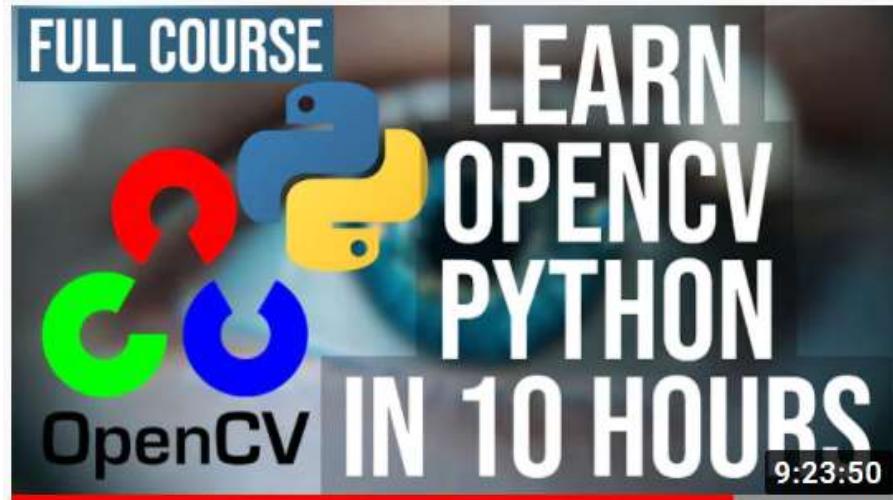


OpenCV Python Tutorial For Beginners (10 hrs)

<https://www.youtube.com/watch?v=N81PCpADwKQ&t=27645s>

<https://www.youtube.com/watch?v=kdLM6A0d2vc&list=PLS1Qu1Wo1RIa7D106skqDQ-JZ1GGHKK-K>



https://opencv-python-tutorials.readthedocs.io/en/latest/py_tutorials/py_tutorials.html

OpenCV-Python Tutorials



OpenCV-Python Tutorials

Introduction to OpenCV

Gui Features in OpenCV

Core Operations

Image Processing in OpenCV

Changing Colorscales

....

OpenCV was started at Intel in 1999 by Gary Bradsky

[OpenCV documentation index](#)

1. Introduction to OpenCV

- **OpenCV is an image processing library created by Intel and later supported by Willow Garage and now maintained by Itseez.**
- **Available on Mac, Windows, Linux.**
- **Works in C, C++, and Python.**
- **Open Source and free.**
- **Easy to use and install.**

SUBS

It has C++, Python, Java and MATLAB interfaces and supports Windows, Linux, Android and Mac OS.

What is Numpy

- Numpy is a highly optimized library for numerical operations.
- Array structure is important because digital images are 2D arrays of P-I-X-E-L-S
- All the OpenCV array structures are converted to-and-from Numpy arrays.
- You can use more convenient indexing system rather than using for loops.

NumPy 能夠支援 Python 進行大量的陣列與矩陣運算，同時也提供了大量的數學 library 提升 Python 運算速度。因此未來在進行機器學習的時候，我們將不可避免地大量使用到 NumPy 的功能。

```
import numpy as np  
arr = np.array([1, 2, 3, 4, 5])  
print(arr)      # [1 2 3 4 5]  
type(arr)      # numpy.ndarray
```

這裡你可能會問，為什麼我們不能直接操作 Python list，而要建立一個新的 NumPy array 呢？因為 NumPy array 的相對優勢在於

1. 使用更少的儲存空間
2. 有更快的速度
3. 以及有 NumPy 與 SciPy 等 library 各種優化過、更強大的功能的支援

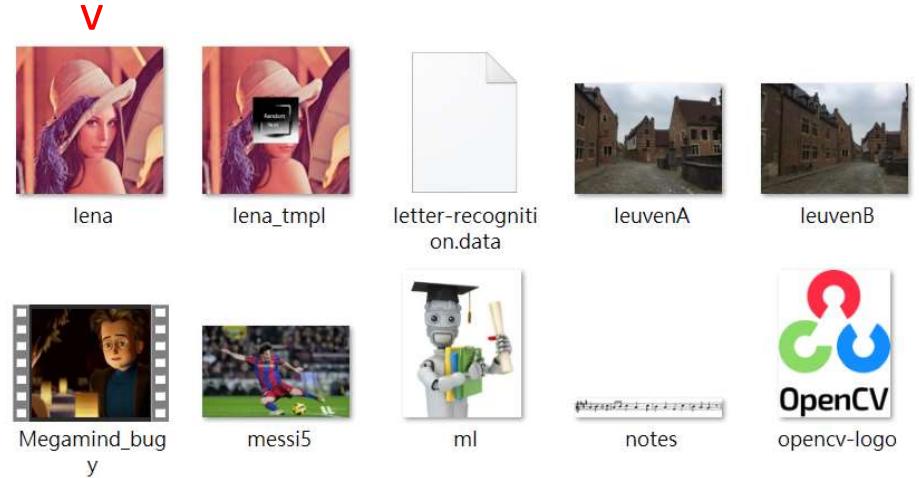
2. How to Install OpenCV for Python on Windows 10 (skip)

3. How to Read, Write, Show Images in OpenCV

<https://github.com/opencv/opencv> to download  opencv-master

-  3rdparty
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-  opengl
-  openvx
-  python



opencv-logo

<https://drive.google.com/file/d/14-6CatqE8o0TBytRZk2y3dsDzGMcynK/view?usp=sharing>
(download images, videos here)

ex1.py

```
7 import cv2
8
9 img = cv2.imread('lena.jpg',0) # grayscale
10 print(img.shape)
11 # (512,512)
12 """
13 array([[163, 162, 161, ..., 170, 154, 130],
14        [162, 162, 162, ..., 173, 155, 126],
15        [162, 162, 163, ..., 170, 155, 128],
16        ...,
17        [ 43,  42,  51, ..., 103, 101,  99],
18        [ 41,  42,  55, ..., 103, 105, 106],
19        [ 42,  44,  57, ..., 102, 106, 109]], dtype=uint8)
20 """
21
22 img = cv2.imread('lena.jpg',1) # color (default)
23 print(img.shape)
24 # (512,512,3)
25
26 img = cv2.imread('lena.jpg',-1) # as is
27 print(img.shape)
28 # (512,512,3)
29
30 cv2.imshow('lena image',img)
31 cv2.waitKey(0) # waits until a key is pressed
32 cv2.destroyAllWindows()
33
34 cv2.imwrite('lena_copy.png',img)
```

Read an image

cv2.imread() Second argument is a flag which specifies the way image should be read.

flag	integer value	description
cv2.IMREAD_COLOR	1	Loads a color image.
cv2.IMREAD_GRAYSCALE	0	Loads image in grayscale mode
cv2.IMREAD_UNCHANGED	-1	Loads image as such including alpha channel



lena.jpg

* Array:
(512,512)
(512,512,3)

Syntax: `cv2.imread(/path/to/image, flag)`
Syntax: `cv2.imshow(window_name, image)`

ex2.py

```
import cv2

def test():
    img = cv2.imread('lena.jpg')
    while True:
        cv2.imshow('lena image', img)
        if cv2.waitKey(1) & 0xFF == ord('q'):
            print('I am done')
            cv2.destroyAllWindows()
            break

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

1. indent 縮排

2. bitwise AND (&) $0\&0=0; 0\&1=0$
 $1\&0=0; 1\&1=1$

`cv2.waitKey([delay]) → retval`

Parameters:

`delay` – Delay in milliseconds. 0 is the special value that means “forever”.

It returns the code of the pressed key or -1 if no key was pressed before the specified time had elapsed.

`ord(' ')`可以將字符轉化為對應的整數
(ASCII碼)

`cv2.waitKey(1) & 0xFF` &

`cv2.waitKey(1)` 與 `0xFF` (1111 1111) 相 ‘與’，是因為`cv2.waitKey(1)` 的返回值不止8位(32)，但是只有後8位實際有效，為避免產干擾，通過 ‘與’ 操作將其餘位置設0。

`cv2.waitKey()` returns a 32 Bit integer value (might be dependent on the platform). The key input is in ASCII which is an 8 Bit integer value. So you only care about these 8 bits and want all other bits to be 0.

`if __name__ == '__main__'`的意思是：

當.py檔案被直接執行時，`if __name__ == '__main__'`之下的程式碼塊將被執行；當.py檔案以模組形式被匯入時，`if __name__ == '__main__'`之下的程式碼塊不被執行。

通俗的理解`__name__ == '__main__'`：假如你叫小明.py，在朋友眼中，你是小明(`__name__ == '小明'`)；在你自己眼中，你自己(`__name__ == '__main__'`)。

```

7 import cv2
8
9 cap = cv2.VideoCapture(0, cv2.CAP_DSHOW)
10 # cap = cv2.VideoCapture('vtest.avi')
11 width = int(cap.get(cv2.CAP_PROP_FRAME_WIDTH))
12 height = int(cap.get(cv2.CAP_PROP_FRAME_HEIGHT))
13 fps = int(cap.get(cv2.CAP_PROP_FPS)) # = 0 if cam 0 is used
14 codec = cv2.VideoWriter_fourcc(*'XVID')
15 out = cv2.VideoWriter('output.avi', codec, 20.0, (width, height))
16
17 print(cap.isOpened()) # True
18 while (cap.isOpened()):
19     ret, frame = cap.read()
20     if ret == True:
21         print(cap.get(cv2.CAP_PROP_FRAME_WIDTH))
22         print(cap.get(cv2.CAP_PROP_FRAME_HEIGHT))
23
24         out.write(frame) # save color video
25
26         frame = cv2.cvtColor(frame, cv2.COLOR_BGR2GRAY)
27         cv2.imshow('gray video', frame) # show gray video
28
29         if cv2.waitKey(1) & 0xFF == ord('q'):
30             break
31
32     else:
33         break
34
35 cap.release()
36 out.release()
37 cv2.destroyAllWindows()

```

ex3.py

4. How to Read, Write, Show Videos from Camera in OpenCV

output_format: 'XVID',
codec used in VideoWriter
when saving video to file.

參數cv2.CAP_DSHOW是微軟特有的
用於防止釋放攝像頭時的[WARN:0]
terminating async callback警告

The cv2.CAP_DSHOW is a flag passed as
part of the open call, there are
many others you can pass, and this
CAP_DSHOW is Microsoft specific.

```
import numpy as np      ex4.py  
import cv2
```

5. Draw geometric shapes on images

```
img = cv2.imread('lena.jpg',1) # color (default)  
# img = np.zeros([512, 512, 3], np.uint8) # black image
```

color (b,g,r)

```
img = cv2.line(img, (0, 0), (255, 255), (255, 153, 187), 10) # color=(b,g,r)  
img = cv2.arrowedLine(img, (0, 255), (255, 255), (255, 0, 0), 10)
```

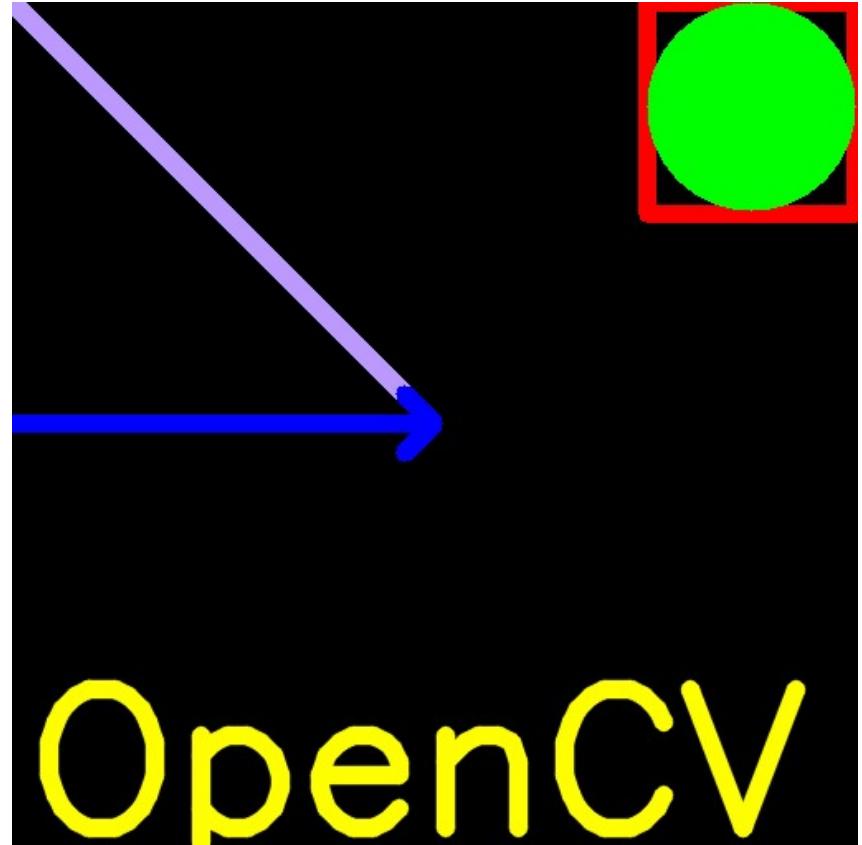
bottom-left corner of the text

```
img = cv2.rectangle(img, (384, 0), (510, 128), (0, 0, 255), 10)  
img = cv2.circle(img, (447, 63), 63, (0, 255, 0), -1) # fill in  
font = cv2.FONT_HERSHEY_SIMPLEX  
img = cv2.putText(img, 'OpenCV', (10, 500), font, 4, (0, 255, 255), 10, cv2.LINE_AA)
```

cv2.putText(image, 'OpenCV', org, font,
fontScale, color, thickness, cv2.LINE_AA)
(line types)

```
cv2.imshow('geometric image',img)  
cv2.waitKey(0) # waits until a key is pressed  
cv2.destroyAllWindows()
```





6. Setting Camera Parameters

`cap.get(propId)` : 取得影片的一些資訊，其中 `propId` 是屬性的 ID
，可用的值是從 0 到 18，請參考 [OpenCV 的文件](#)。

https://docs.opencv.org/3.0-beta/modules/videoio/doc/reading_and_writing_video.html#videocapture-get

`cap.set(propId, value)` : Sets a property in the VideoCapture.

3 CV_CAP_PROP_FRAME_WIDTH Width of the frames in the video stream.

4 CV_CAP_PROP_FRAME_HEIGHT Height of the frames in the video stream.

`cap.set(3, 1280)`

VGA = 640 x 480

`cap.set(4, 720) # HD`

HD = 1280 x 720

FHD = 1920 x 1080

4K = 3840 x 2160

0 , 1, ~ 18

- **CV_CAP_PROP_POS_MSEC** Current position of the video file in milliseconds or video capture timestamp.
- **CV_CAP_PROP_POS_FRAMES** 0-based index of the frame to be decoded/captured next.
- **CV_CAP_PROP_POS_AVI_RATIO** Relative position of the video file: 0 – start of the film, 1 – end of the film.
- **CV_CAP_PROP_FRAME_WIDTH** Width of the frames in the video stream.
- **CV_CAP_PROP_FRAME_HEIGHT** Height of the frames in the video stream.
- **CV_CAP_PROP_FPS** Frame rate.
- **CV_CAP_PROP_FOURCC** 4-character code of codec.
- **CV_CAP_PROP_FRAME_COUNT** Number of frames in the video file.
- **CV_CAP_PROP_FORMAT** Format of the Mat objects returned by `retrieve()`.
- **CV_CAP_PROP_MODE** Backend-specific value indicating the current capture mode.
- **CV_CAP_PROP_BRIGHTNESS** Brightness of the image (only for cameras).
- **CV_CAP_PROP_CONTRAST** Contrast of the image (only for cameras).
- **CV_CAP_PROP_SATURATION** Saturation of the image (only for cameras).
- **CV_CAP_PROP_HUE** Hue of the image (only for cameras).
- **CV_CAP_PROP_GAIN** Gain of the image (only for cameras).
- **CV_CAP_PROP_EXPOSURE** Exposure (only for cameras).
- **CV_CAP_PROP_CONVERT_RGB** Boolean flags indicating whether images should be converted to RGB.
- **CV_CAP_PROP_WHITE_BALANCE** Currently not supported
- **CV_CAP_PROP_RECTIFICATION** Rectification flag for stereo cameras (note: only supported by DC1394 v 2.x backend currently)

```
import cv2
cap = cv2.VideoCapture(0, cv2.CAP_DSHOW)
print(cap.get(cv2.CAP_PROP_FRAME_WIDTH)) # 640
print(cap.get(cv2.CAP_PROP_FRAME_HEIGHT)) # 480

cap.set(3, 1280) # highest resolution
cap.set(4, 720) # highest resolution
print(cap.get(3))
print(cap.get(4))

while (cap.isOpened()):
    ret, frame = cap.read()
    if ret == True:
        frame = cv2.cvtColor(frame, cv2.COLOR_BGR2GRAY)
        cv2.imshow('gray video', frame) # show gray video

        if cv2.waitKey(1) & 0xFF == ord('q'):
            break
    else:
        break

cap.release()
cv2.destroyAllWindows()
```

ex5.py

7. Show Date and Time on Videos

```
7 import cv2
8 import datetime
9
10 cap = cv2.VideoCapture(0, cv2.CAP_DSHOW)
11 print(cap.get(cv2.CAP_PROP_FRAME_WIDTH)) # 640
12 print(cap.get(cv2.CAP_PROP_FRAME_HEIGHT)) # 480
13
14 while (cap.isOpened()):
15     ret, frame = cap.read()
16     if ret == True:
17
18         font = cv2.FONT_HERSHEY_SIMPLEX
19         text = str(datetime.datetime.now())
20         #text = 'Width:' +str(cap.get(3))+ ' Height:' + str(cap.get(4))
21         frame = cv2.putText(frame, text, (10, 50), font, 1, (0, 255, 255), 2,
22                             cv2.LINE_AA)
23         cv2.imshow('date time', frame) # show date & time
24
25     if cv2.waitKey(1) & 0xFF == ord('q'):
26         break
27
28     else:
29         break
30
31 cap.release()
32 cv2.destroyAllWindows()
```

ex6.py

```
import datetime
text = str(datetime.datetime.now())
print(text)
```

2021-03-03 10:40:35.268917

8. Handle Mouse Events in OpenCV

ex7.py

```
import cv2  
events = [i for i in dir(cv2) if 'EVENT' in i]  
print(events)  
print(len(events))
```

18 events

```
['EVENT_FLAG_ALTKEY', 'EVENT_FLAG_CTRLKEY', 'EVENT_FLAG_LBUTTON',  
'EVENT_FLAG_MBUTTON', 'EVENT_FLAG_RBUTTON', 'EVENT_FLAG_SHIFTKEY',  
'EVENT_LBUTTONDOWNDBLCLK', 'EVENT_LBUTTONDOWN', 'EVENT_LBUTTONUP',  
'EVENT_MBUTTONDOWNDBLCLK', 'EVENT_MBUTTONDOWN',  
'EVENT_MBUTTONUP', 'EVENT_MOUSEWHEEL', 'EVENT_MOUSEMOVE',  
'EVENT_MOUSEWHEEL', 'EVENT_RBUTTONDOWNDBLCLK',  
'EVENT_RBUTTONDOWN', 'EVENT_RBUTTONUP']
```

cv2.setMouseCallback(windowName, onMouse[, param]) 滑鼠響應

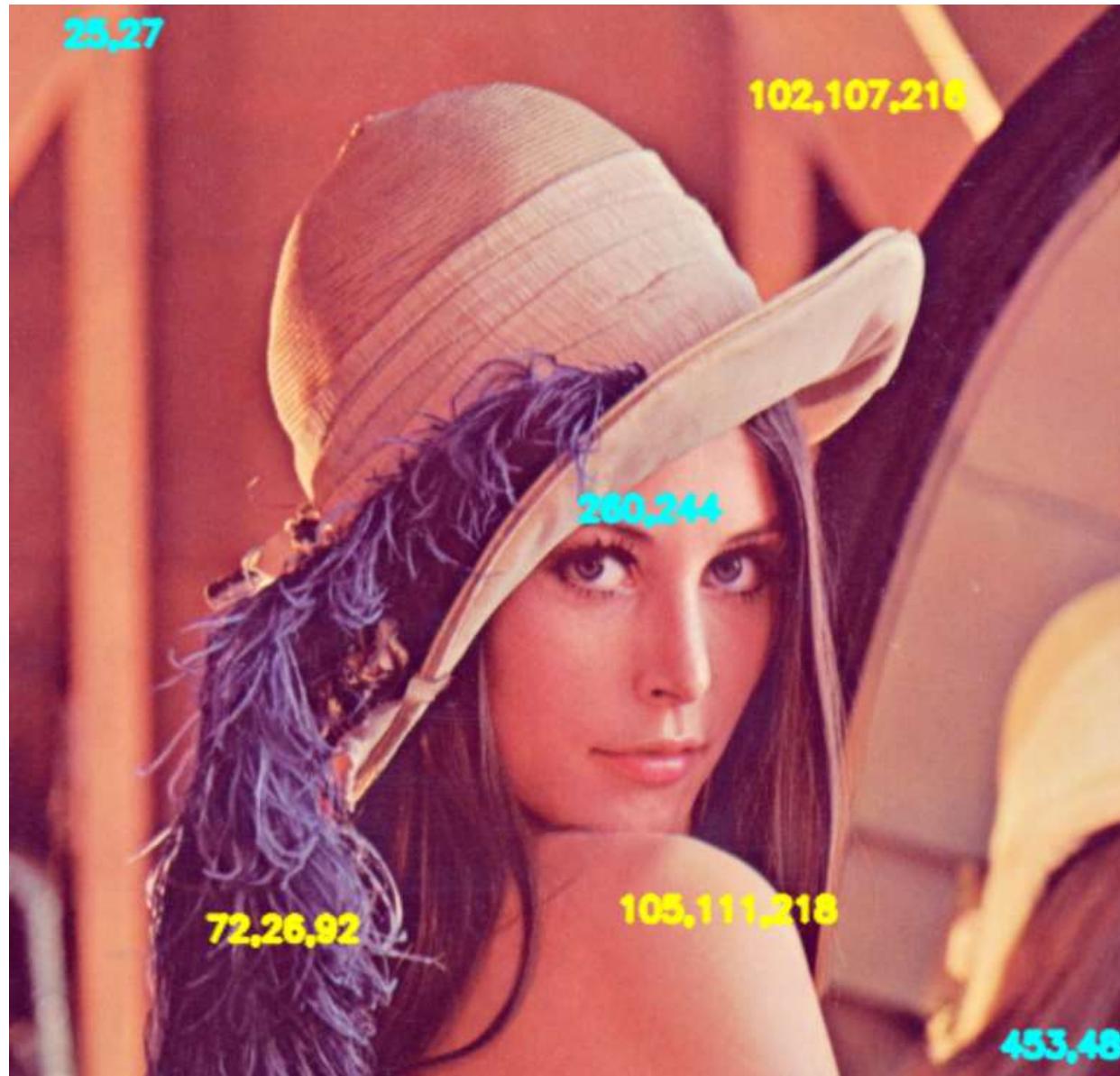
: sets mouse handler for the specified window

onMouse: callback function for mouse events.



```
7 import cv2                                ex7.py
8
9 # events = [i for i in dir(cv2) if 'EVENT' in i]
10 # print(events)
11
12 def click_event(event, x, y, flags, param):
13     if event == cv2.EVENT_LBUTTONDOWN:
14         print(x, ',', y)
15         font = cv2.FONT_HERSHEY_SIMPLEX
16         text = str(x)+','+str(y)
17         cv2.putText(img, text, (x, y), font, 0.5, (255, 255, 0), 2,
18                     cv2.LINE_AA)
19         cv2.imshow('image',img)
20     if event == cv2.EVENT_RBUTTONDOWN:
21         blue = img[y, x, 0]
22         green = img[y, x, 1]
23         red = img[y, x, 2]
24         font = cv2.FONT_HERSHEY_SIMPLEX
25         text = str(blue)+','+str(green)+','+str(red)
26         cv2.putText(img, text, (x, y), font, 0.5, (0, 255, 255), 2,
27                     cv2.LINE_AA)
28         cv2.imshow('image',img)
30 img = cv2.imread('lena.jpg') # 512x512x3
31 cv2.imshow('image', img)
32
33 cv2.setMouseCallback('image', click_event)
34
35 cv2.waitKey(0)
36 cv2.destroyAllWindows()
```

512x512x3



9. More Mouse Event Examples

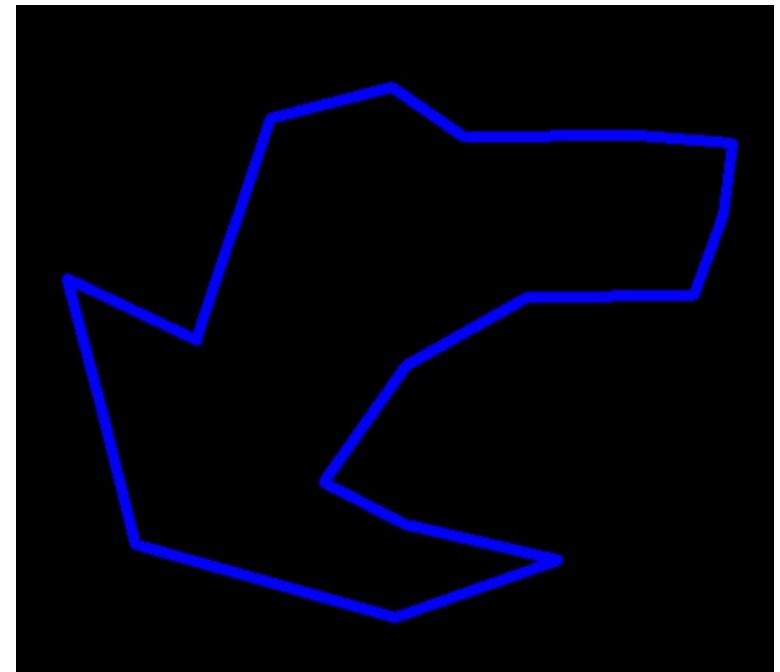
```
import cv2
import numpy as np

def click_event(event, x, y, flags, param):
    if event == cv2.EVENT_LBUTTONDOWN:
        cv2.circle(img, (x, y), 3, (0, 0, 255), -1)
        points.append((x, y))
        if len(points) >= 2:
            cv2.line(img, points[-2], points[-1], (255, 0, 0), 5)
    cv2.imshow('image', img)

img = np.zeros((512, 512, 3), np.uint8) # 512x512x3
cv2.imshow('image', img)
points = []
cv2.setMouseCallback('image', click_event)

cv2.waitKey(0)
cv2.destroyAllWindows()
```

ex8.py : connecting points with line using mouse



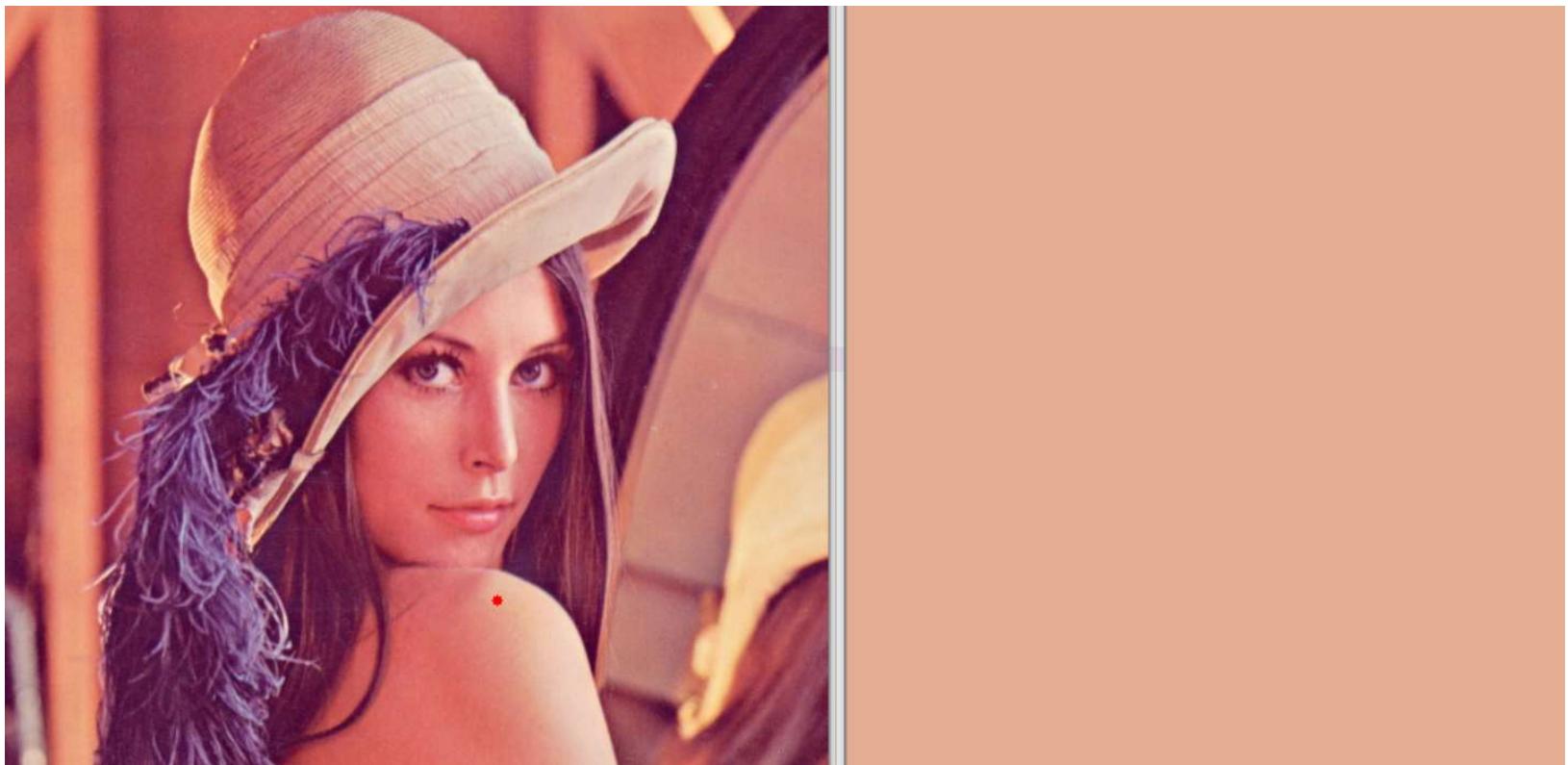
```
import cv2
import numpy as np

def click_event(event, x, y, flags, param):
    if event == cv2.EVENT_LBUTTONDOWN:
        blue = img[y, x, 0]
        green = img[y, x, 1]
        red = img[y, x, 2]
        cv2.circle(img, (x, y), 3, (0, 0, 255), -1)
        cv2.imshow('image', img)
        mycolorImage = np.zeros((512, 512, 3), np.uint8) # black image
        mycolorImage[:] = [blue, green, red]
        cv2.imshow('color',mycolorImage)

img = cv2.imread('lena.jpg')
cv2.imshow('image', img)
cv2.setMouseCallback('image', click_event)

cv2.waitKey(0)
cv2.destroyAllWindows()
```

ex9.py : extract color information and show it in another window



10. cv.split, cv.merge, cv.resize, cv.add, cv.addWeighted, ROI

```
import cv2
```

ex10.py

```
img = cv2.imread('messi5.jpg') # 548x342
print(img.shape) # (row, column, channel)
print(img.size) # total no. of pixels
print(img.dtype) # image datatype
```

(342, 548, 3)

562248

uint8

```
b,g,r = cv2.split(img)
img = cv2.merge((b,g,r)) # try (r,g,b)
```

```
cv2.imshow('image',img)
cv2.waitKey(0)
cv2.destroyAllWindows()
```



```
import cv2
```

```
ex11.py
```

ROI : region of interest

```
img = cv2.imread('messi5.jpg') # WxH: 548x342  
print(img.shape) # (row, column, channel)  
print(img.size) # total no. of pixels  
print(img.dtype) # image datatype
```

(342, 548, 3)
562248
uint8

```
b,g,r = cv2.split(img)  
img = cv2.merge((b,g,r))
```

```
ball = img[280:340, 330:390] # ROI, see also  
img[273:333, 100:160] = ball cv2.selectROI
```

```
cv2.imshow('image',img)  
cv2.waitKey(0)  
cv2.destroyAllWindows()
```



ex12.py

resize, add, addWeighted

```
import cv2
```

```
img = cv2.imread('messi5.jpg') # 548x342
```

```
img2 = cv2.imread('opencv-logo.png') # 600x794
```

```
img = cv2.resize(img, (512, 512))
```

addWeighted(src1, alpha, src2, beta, gamma, dst=None, dtype=None)

```
img2 = cv2.resize(img2, (512, 512))
```

dst(I)=saturate(src1(I)*alpha+src2(I)*beta+gamma)

```
#dst = cv2.add(img, img2);
```

```
dst = cv2.addWeighted(img, 0.2, img2, 0.8, 0) # image blending 圖像融合
```

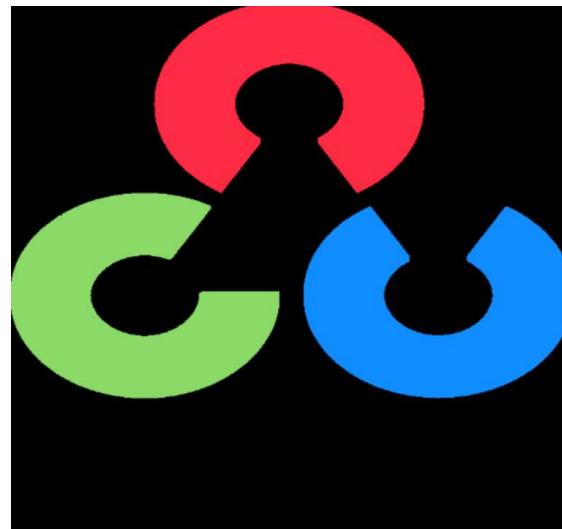
```
cv2.imshow('image', dst)
```

```
cv2.waitKey(0)
```

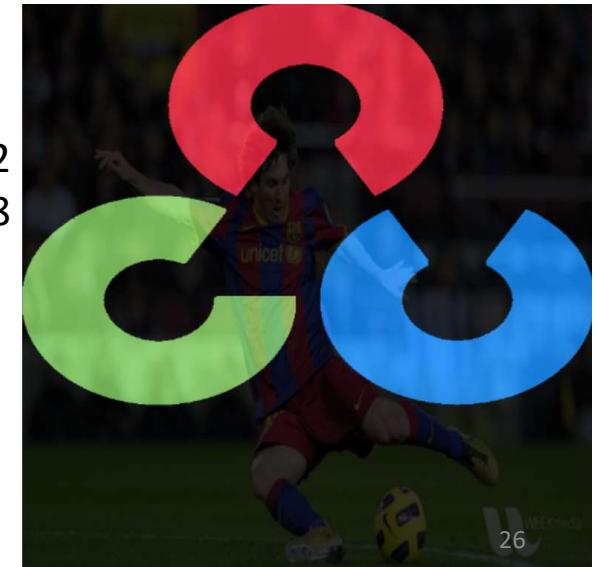
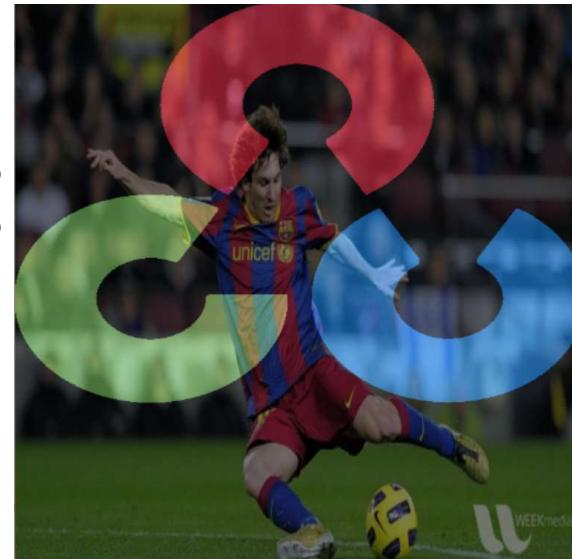
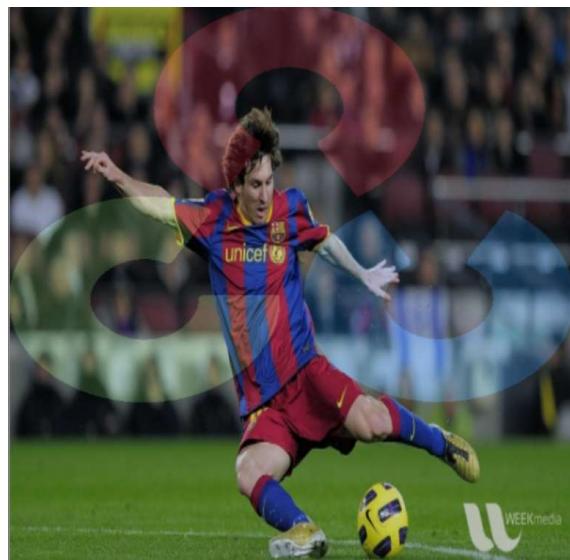
```
cv2.destroyAllWindows()
```



+



=?



Python OpenCV cv2 Resize Image

<https://pythonexamples.org/python-opencv-cv2-resize-image/>

`cv2.resize(src, dsize[, dst[, fx[, fy[, interpolation]]]])`



50% in y



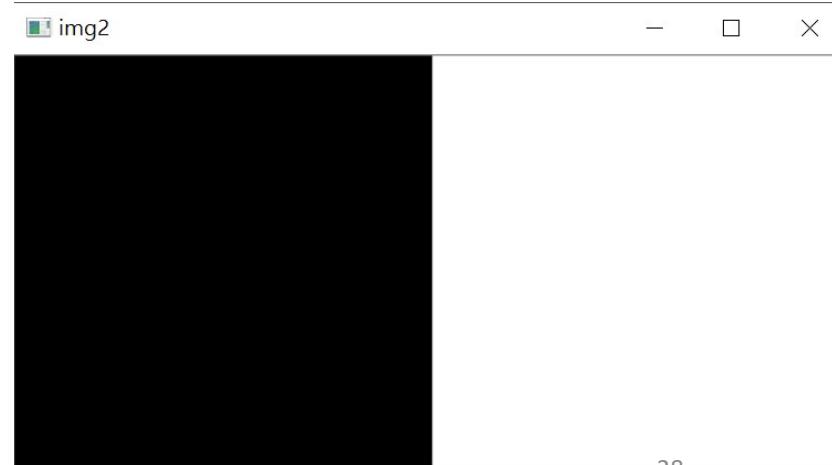
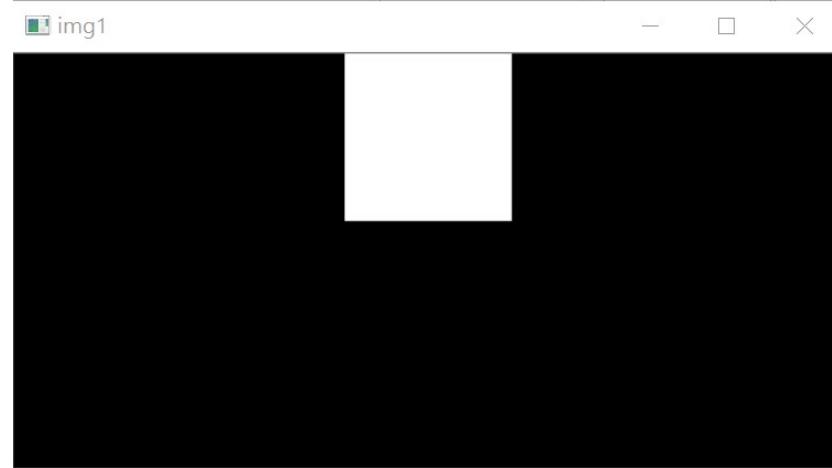
11. Bitwise Operations (bitwise AND, OR, NOT and XOR)

XOR: 互斥或閘 Exclusive-OR gate

Truth Table for the logic XOR

B	A	Q
0	0	0
0	1	1
1	0	1
1	1	0

Read as A **OR** B but not **BOTH** gives Q (odd)

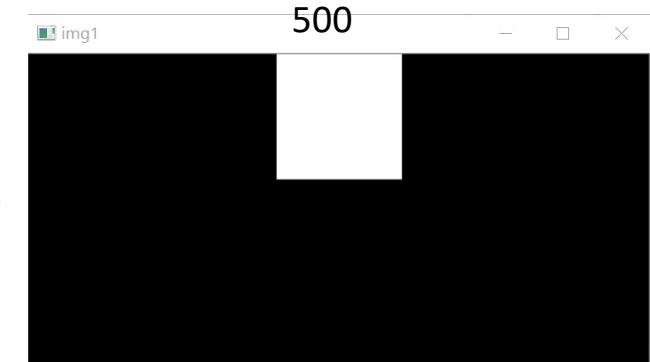


ex13.py

```
import cv2
import numpy as np

img1 = np.zeros((250, 500, 3), np.uint8)
img1 = cv2.rectangle(img1, (200, 0), (300, 100),(255, 255, 255), -1)
img2 = np.full((250, 500, 3), 255, np.uint8)
img2 = cv2.rectangle(img2, (0, 0), (250, 250), (0, 0, 0), -1)

bitAnd = cv2.bitwise_and(img2, img1)
bitOr = cv2.bitwise_or(img2, img1)
bitXor = cv2.bitwise_xor(img2, img1)
bitNot1 = cv2.bitwise_not(img1)
bitNot2 = cv2.bitwise_not(img2)
```

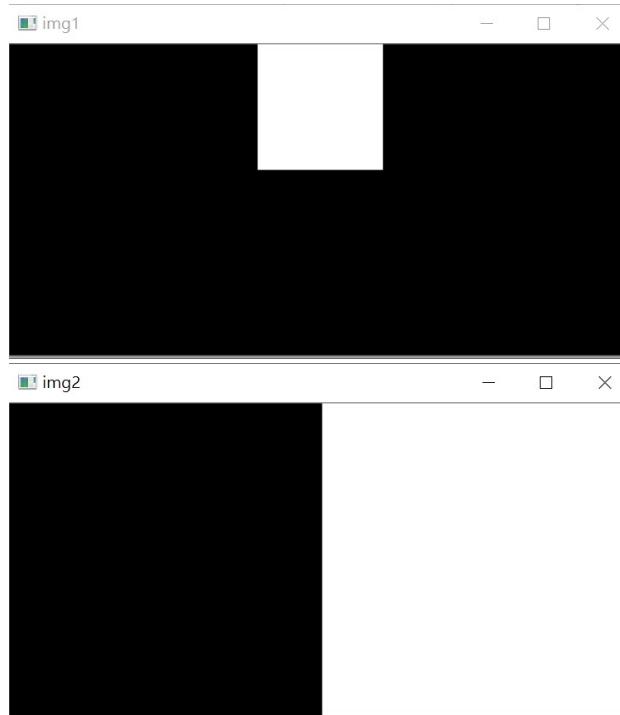


np.zeros, np.ones

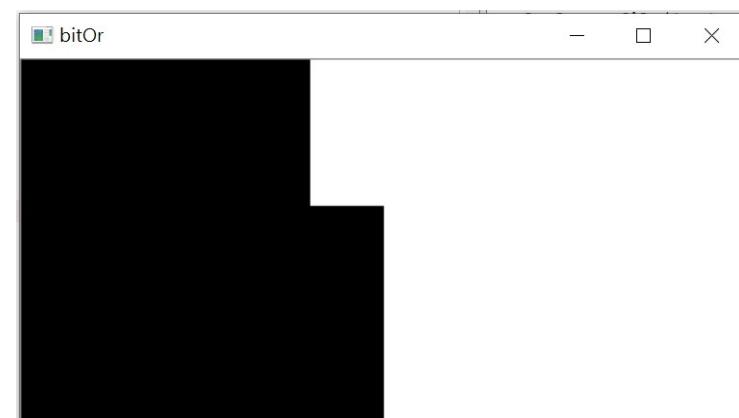
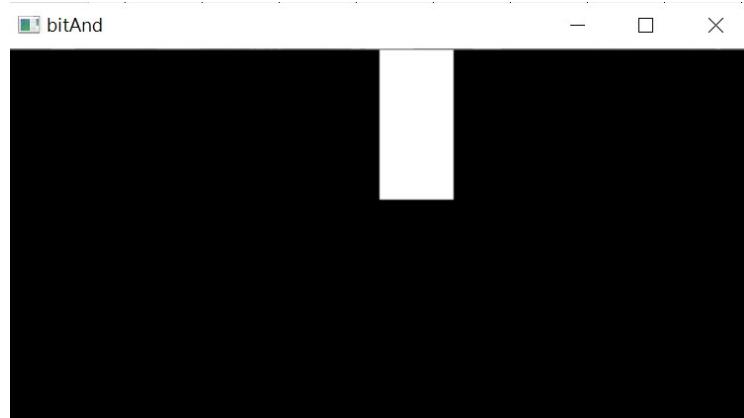
除了建立元素皆為 0 和 1 的陣列外，我們也可以用 `np.full()` 來指定特定值

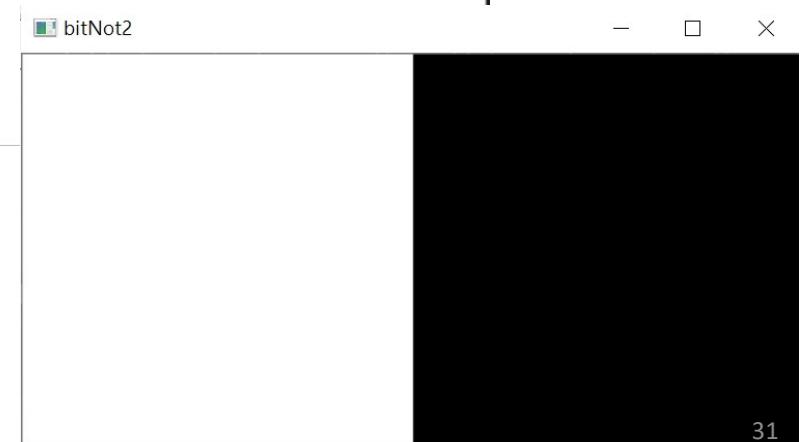
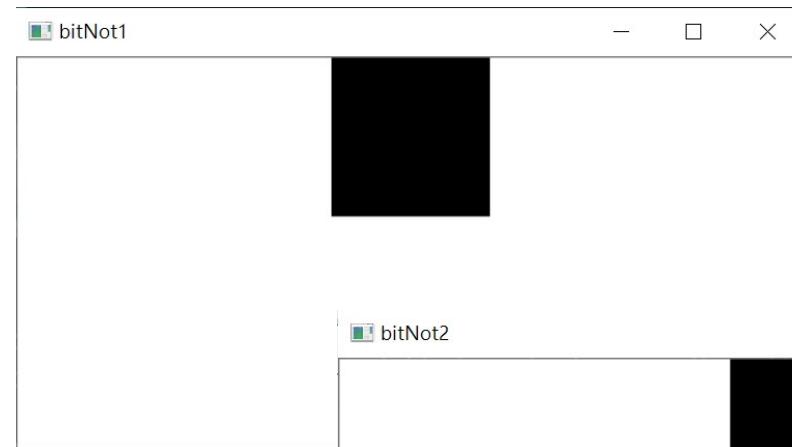
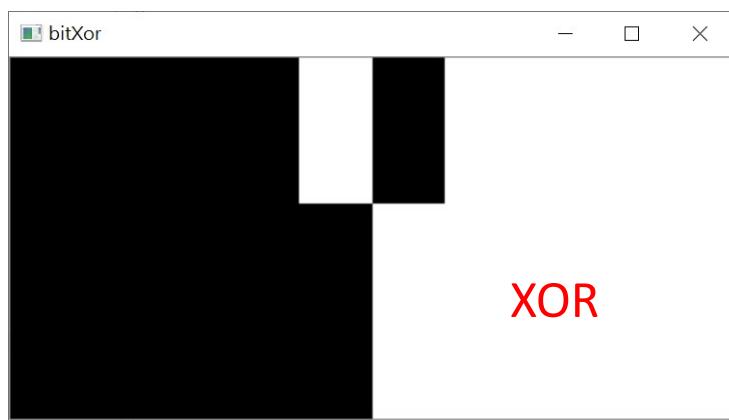
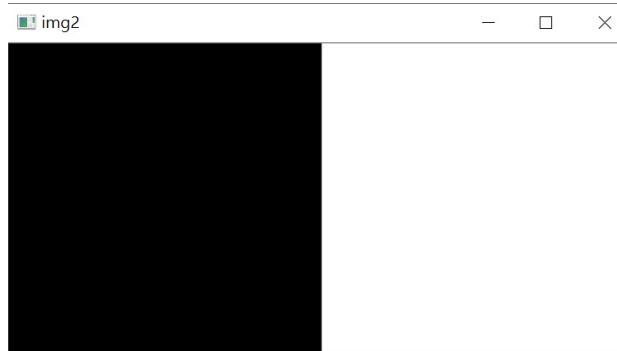
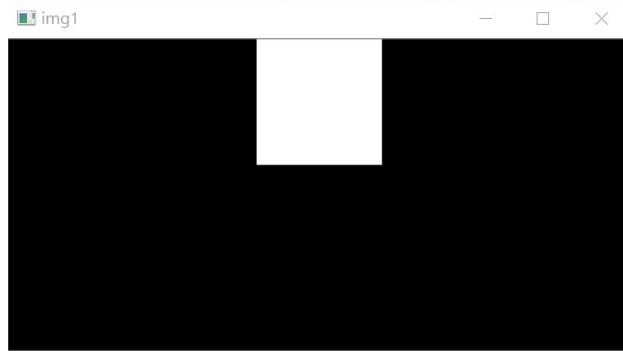
```
cv2.imshow('img1',img1)
cv2.imshow('img2',img2)
cv2.imshow('bitAnd',bitAnd)
cv2.imshow('bitOr',bitOr)
cv2.imshow('bitXor',bitXor)
cv2.imshow('bitNot1',bitNot1)
cv2.imshow('bitNot2',bitNot2)
```

```
cv2.waitKey(0)
cv2.destroyAllWindows()
```



ex13.py





ex13.py

12. How to Bind Trackbar To OpenCV Windows

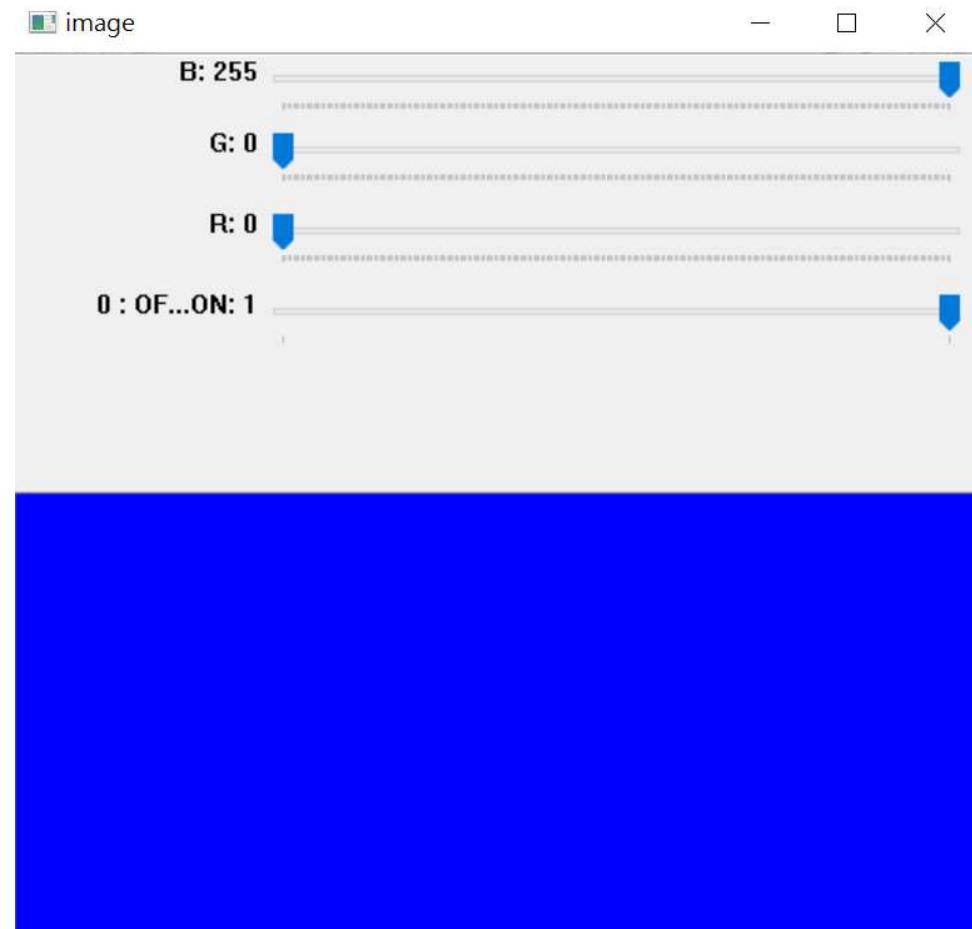
`createTrackbar()` takes five parameters:

- 1 Name of the trackbar, which will also be used to retrieve data
- 2 Named window on which it will reside
- 3 Initial (default) value of the trackbar
- 4 The highest value of the trackbar
- 5 A **callback function** that will do nothing.

which is executed everytime trackbar value changes.
The callback function always has a default argument which is the trackbar position. In our case, function does nothing, so we simply pass.

`getTrackbarPos()` takes two values:

- 1 Name of the trackbar and,
 - 2 Name of the Window where it resides
- This returns the trackbar position between low to high value i.e 0 to 255.



```
import numpy as np  
import cv2 as cv
```

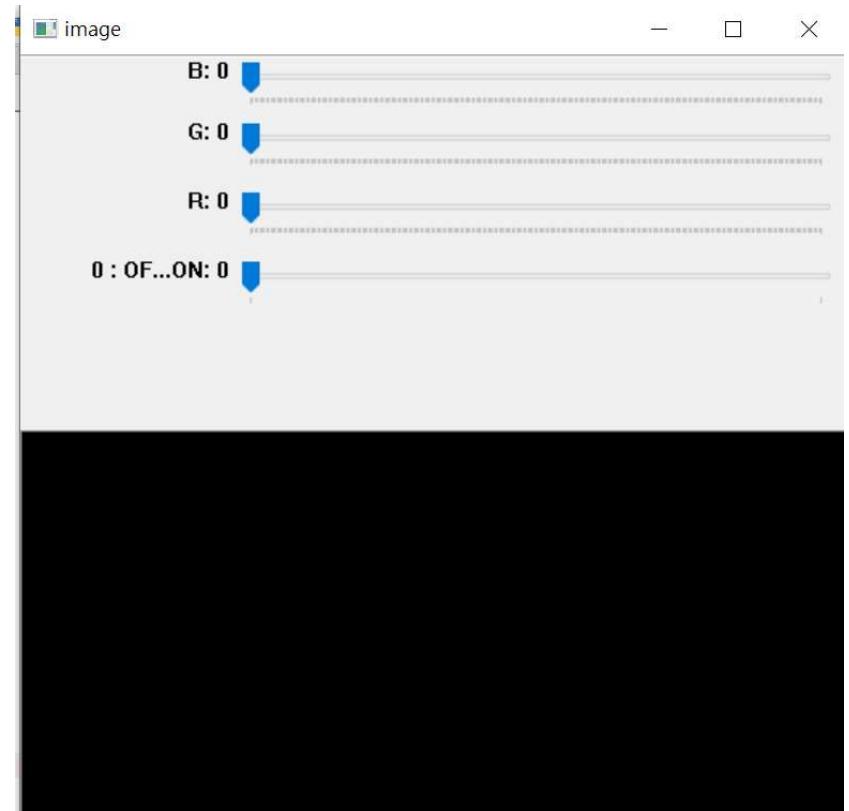
```
def nothing(x):  
    print(x)  
    #pass
```

```
# Create a black image, a window  
img = np.zeros((300,512,3), np.uint8)  
cv.namedWindow('image')
```

```
cv.createTrackbar('B', 'image', 0, 255, nothing)  
cv.createTrackbar('G', 'image', 0, 255, nothing)  
cv.createTrackbar('R', 'image', 0, 255, nothing)
```

```
switch = '0 : OFF\n1 : ON'  
cv.createTrackbar(switch, 'image', 0, 1, nothing)
```

ex14.py



Another important application of trackbar is to use it as a button or switch.

```
while(1):
```

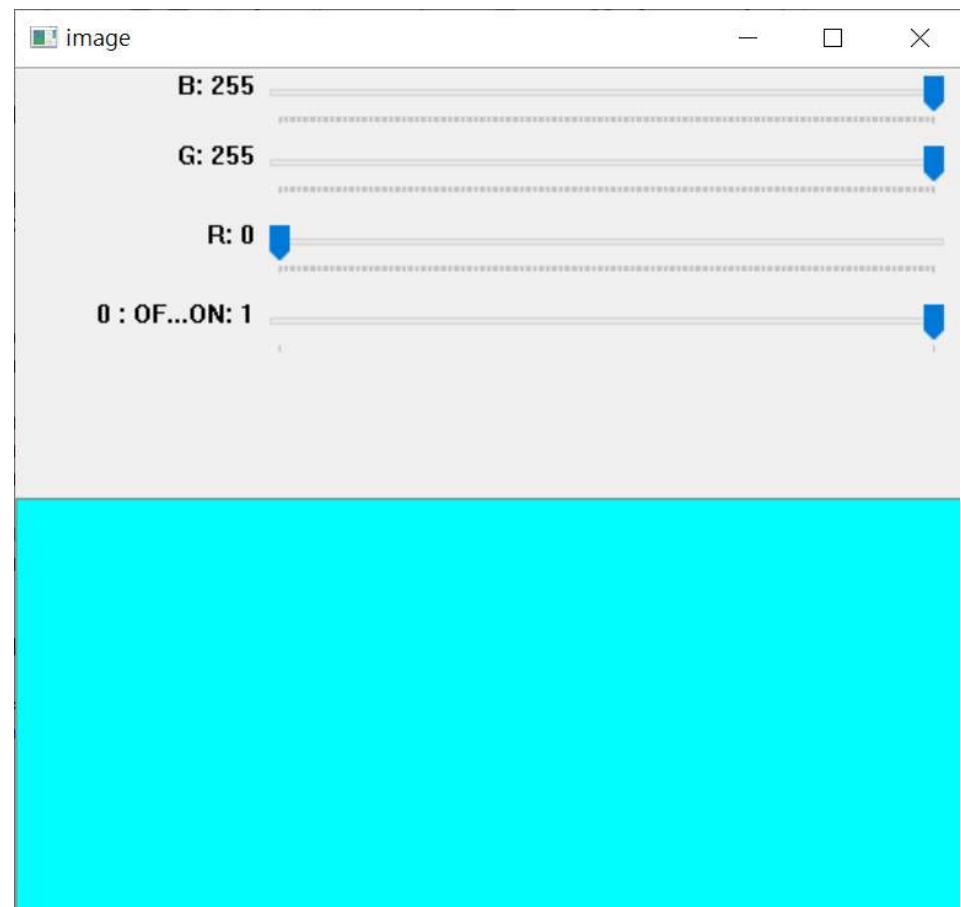
```
    cv.imshow('image',img)
    k = cv.waitKey(1) & 0xFF
    if k == 27: # esc key
        break
```

```
    b = cv.getTrackbarPos('B', 'image')
    g = cv.getTrackbarPos('G', 'image')
    r = cv.getTrackbarPos('R', 'image')
    s = cv.getTrackbarPos(switch, 'image')
```

```
    if s == 0:
        img[:] = 0
    else:
        img[:] = [b, g, r]
```

```
cv.destroyAllWindows()
```

ex14.py

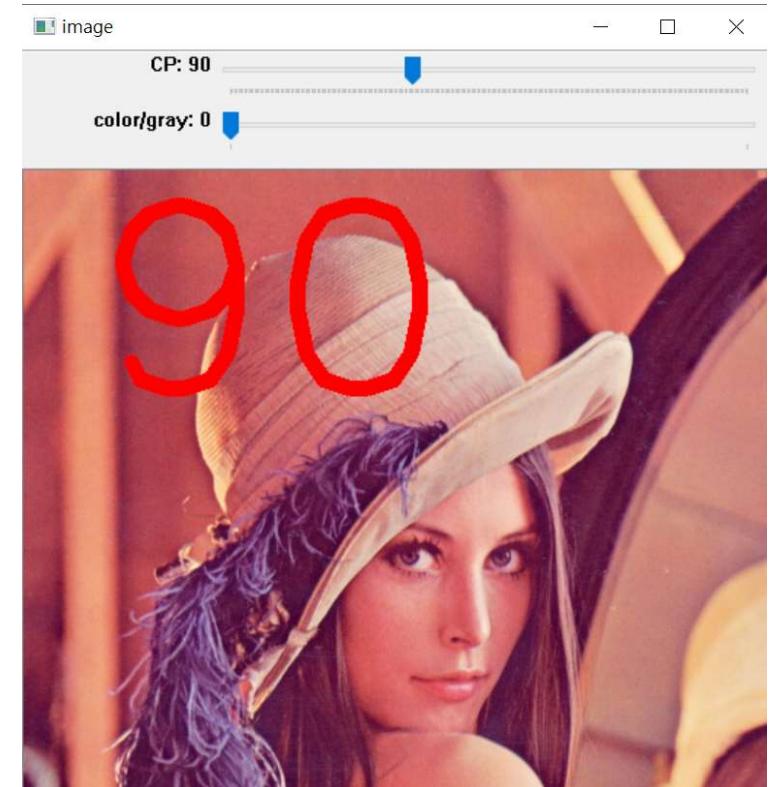


```

9 import cv2 as cv
10
11 def nothing(x):
12     print(x)
13
14 # Create a window
15 cv.namedWindow('image')
16
17 cv.createTrackbar('CP', 'image', 0, 255, nothing) # Current Position
18
19 switch = 'color/gray'
20 cv.createTrackbar(switch, 'image', 0, 1, nothing)
21
22 while(1):
23     img = cv.imread('lena.jpg')
24     pos = cv.getTrackbarPos('CP', 'image')
25     font = cv.FONT_HERSHEY_SIMPLEX
26     cv.putText(img, str(pos), (50, 150), font, 6, (0, 0, 255), 10)
27
28     k = cv.waitKey(1) & 0xFF
29     if k == 27:
30         break
31
32     s = cv.getTrackbarPos(switch, 'image')
33
34     if s == 0:
35         pass
36     else:
37         img = cv.cvtColor(img, cv.COLOR_BGR2GRAY)
38
39     img = cv.imshow('image',img)
40
41 cv.destroyAllWindows()

```

ex15.py

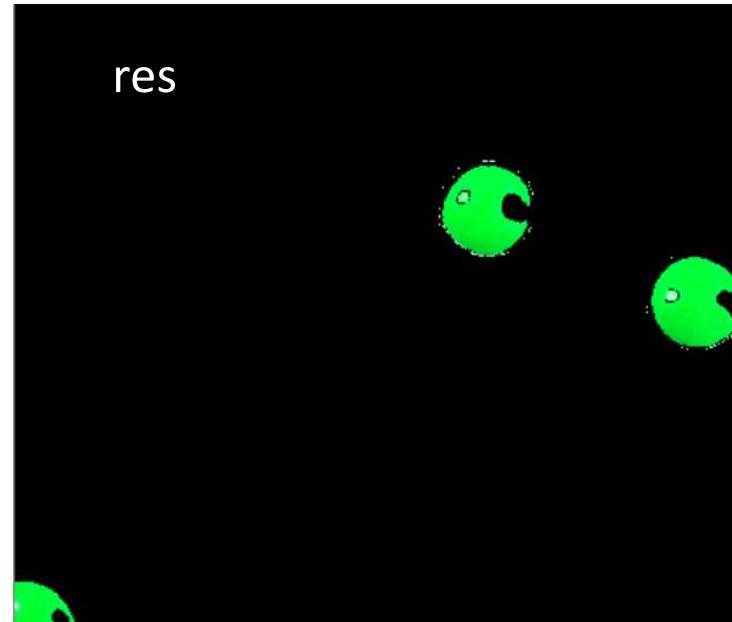
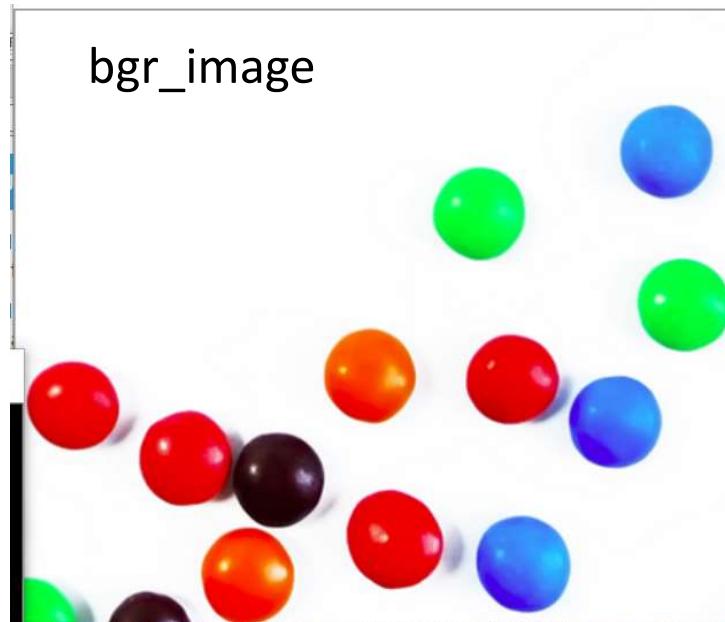


13. Object Detection and Object Tracking Using HSV Color Space

[ex16.py](#) [ex17.py](#)

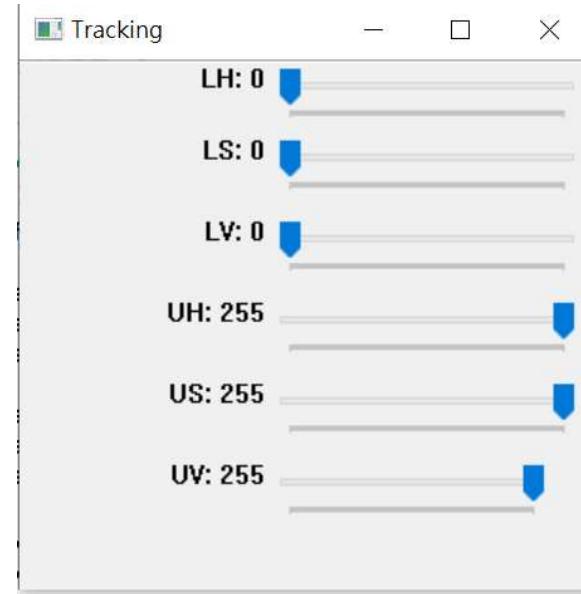
```
hsv = cv2.cvtColor(bgr_image, cv2.COLOR_BGR2HSV)
mask = cv2.inRange(hsv, lower_b, upper_b)      → binary image
res = cv2.bitwise_and(bgr_image, bgr_image, mask=mask)
```

color
thresholding



ex16.py

```
8 import cv2
9 import numpy as np
10
11 def nothing(x):
12     pass
13
14 cv2.namedWindow("Tracking")
15 cv2.createTrackbar("LH", "Tracking", 0, 255, nothing)
16 cv2.createTrackbar("LS", "Tracking", 0, 255, nothing)
17 cv2.createTrackbar("LV", "Tracking", 0, 255, nothing)
18 cv2.createTrackbar("UH", "Tracking", 255, 255, nothing)
19 cv2.createTrackbar("US", "Tracking", 255, 255, nothing)
20 cv2.createTrackbar("UV", "Tracking", 255, 255, nothing)
```

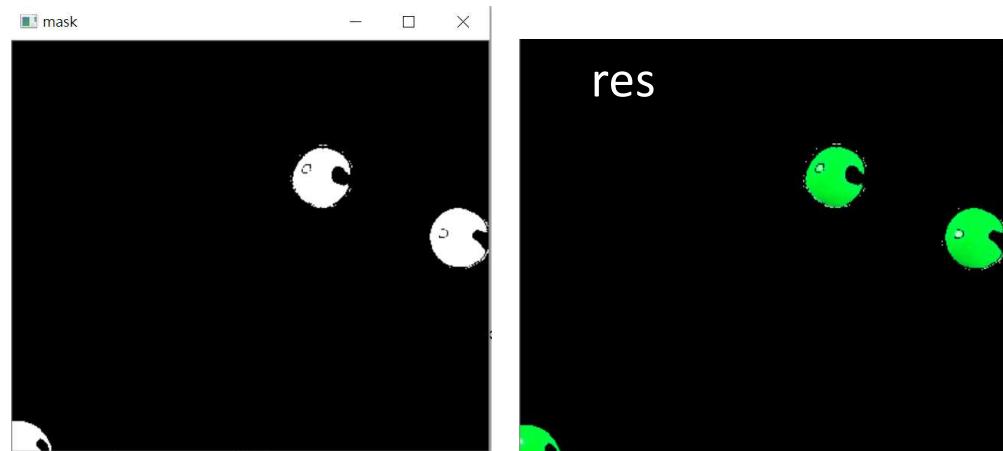


```

22 while True:
23     frame = cv2.imread('smarties.png')
24
25     hsv = cv2.cvtColor(frame, cv2.COLOR_BGR2HSV)
26
27     l_h = cv2.getTrackbarPos("LH", "Tracking")
28     l_s = cv2.getTrackbarPos("LS", "Tracking")
29     l_v = cv2.getTrackbarPos("LV", "Tracking")
30
31     u_h = cv2.getTrackbarPos("UH", "Tracking")
32     u_s = cv2.getTrackbarPos("US", "Tracking")
33     u_v = cv2.getTrackbarPos("UV", "Tracking")
34
35     l_b = np.array([l_h, l_s, l_v])
36     u_b = np.array([u_h, u_s, u_v])
37
38     mask = cv2.inRange(hsv, l_b, u_b)
39
40     res = cv2.bitwise_and(frame, frame, mask=mask)
41
42     cv2.imshow("frame", frame)
43     cv2.imshow("mask", mask)
44     cv2.imshow("res", res)
45
46     key = cv2.waitKey(1)
47     if key == 27:
48         break
49
50 cv2.destroyAllWindows()

```

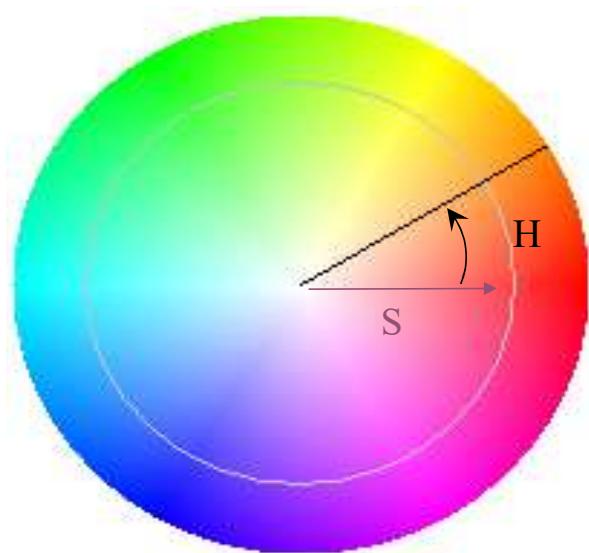
ex16.py



8-bit single
channel array

!Note:

For HSV, Hue range is [0,179], Saturation range is [0,255] and Value range is [0,255]. Different softwares use different scales. So if you are comparing OpenCV values with them, you need to normalize these ranges.



!Note:

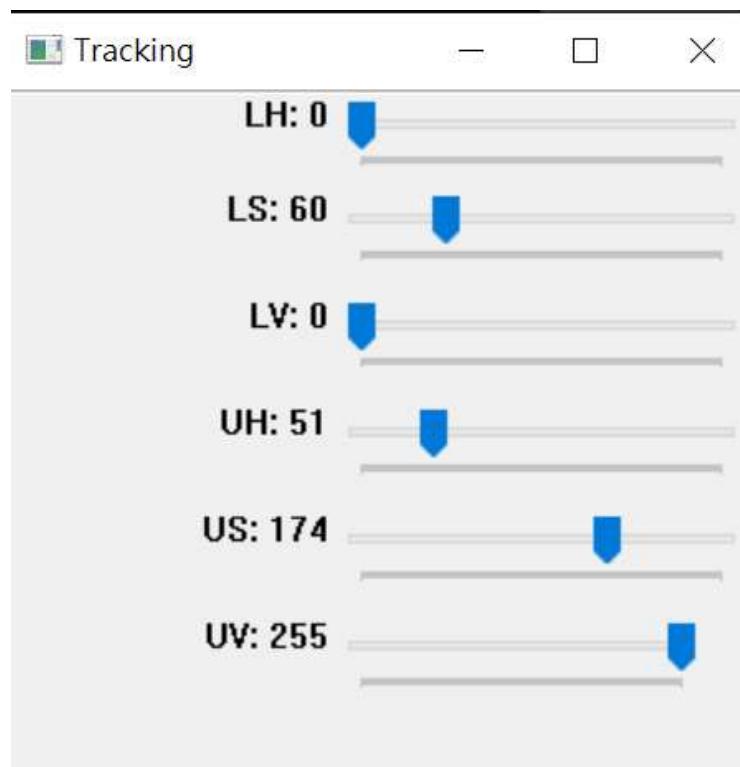
Thresholding Operations using inRange
`dst=cv.inRange(src, lowerb, upperb[, dst])`
dst (I) is set to 255 (all 1 -bits) if src (I) is within the specified 1D, 2D, 3D, ... box and 0 otherwise.

ex17.py for object tracking

```
8 import cv2
9 import numpy as np
10
11 def nothing(x):
12     pass
13
14 cap = cv2.VideoCapture(0);
15
16 cv2.namedWindow("Tracking")
17 cv2.createTrackbar("LH", "Tracking", 0, 255, nothing)
18 cv2.createTrackbar("LS", "Tracking", 0, 255, nothing)
19 cv2.createTrackbar("LV", "Tracking", 0, 255, nothing)
20 cv2.createTrackbar("UH", "Tracking", 255, 255, nothing)
21 cv2.createTrackbar("US", "Tracking", 255, 255, nothing)
22 cv2.createTrackbar("UV", "Tracking", 255, 255, nothing)
```

```
24 while True:
25     #frame = cv2.imread('smarties.png')
26     _, frame = cap.read()
27     hsv = cv2.cvtColor(frame, cv2.COLOR_BGR2HSV)
28
29     l_h = cv2.getTrackbarPos("LH", "Tracking")
30     l_s = cv2.getTrackbarPos("LS", "Tracking")
31     l_v = cv2.getTrackbarPos("LV", "Tracking")
32
33     u_h = cv2.getTrackbarPos("UH", "Tracking")
34     u_s = cv2.getTrackbarPos("US", "Tracking")
35     u_v = cv2.getTrackbarPos("UV", "Tracking")
36
37     l_b = np.array([l_h, l_s, l_v])
38     u_b = np.array([u_h, u_s, u_v])
39
40     mask = cv2.inRange(hsv, l_b, u_b)
41     res = cv2.bitwise_and(frame, frame, mask=mask)
42
43     cv2.imshow("frame", frame)
44     cv2.imshow("mask", mask)
45     cv2.imshow("res", res)
46
47     key = cv2.waitKey(1)
48     if key == 27:
49         break
50
51 cap.release()
52 cv2.destroyAllWindows()
```

The skin in channel **H** is characterized by values between **0 and 50**, in the channel **S** from 0.23 (**59**) to 0.68 (**174**) for Asian and Caucasian ethnics.



14. Simple Image Thresholding

```
ret, out = cv2.threshold(src image, thresh, maxVal, method)
```

First argument is the **source image**, which should be a **grayscale** image.

Second argument is the threshold value which is used to classify the pixel values.

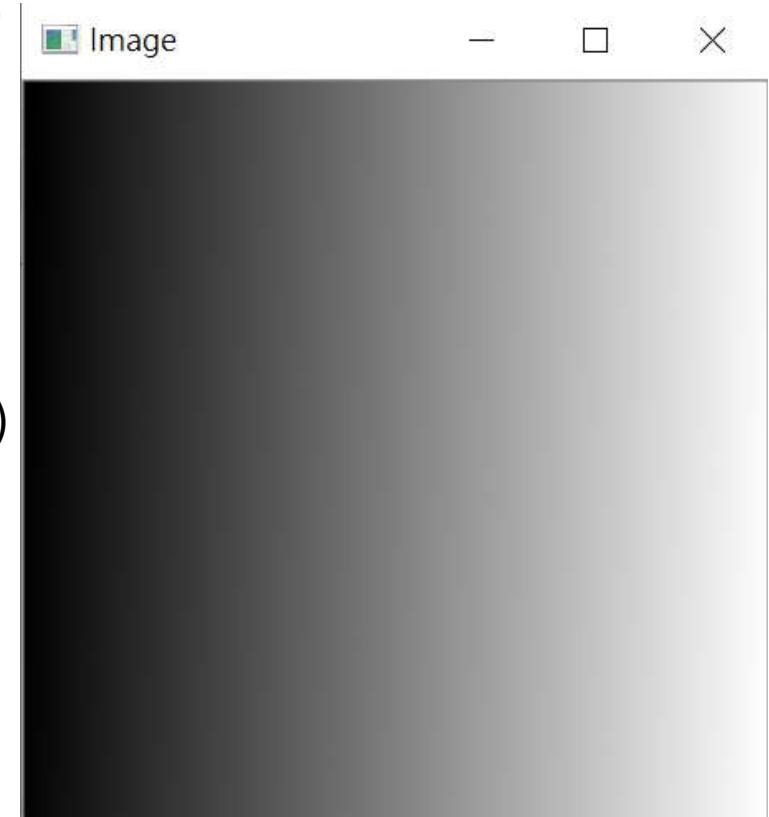
Third argument is the maxVal which represents the value to be given if pixel value is more than (sometimes less than) the threshold value.

Fourth parameter provides 5 different styles of thresholding:

- cv2.THRESH_BINARY
- cv2.THRESH_BINARY_INV
- cv2.THRESH_TRUNC
- cv2.THRESH_TOZERO
- cv2.THRESH_TOZERO_INV

gradient.png

300x300x3



- THRESH_BINARY

$$dst(x,y) = \begin{cases} maxval & \text{if } src(x,y) > thresh \\ 0 & \text{otherwise} \end{cases}$$

- THRESH_BINARY_INV

$$dst(x,y) = \begin{cases} 0 & \text{if } src(x,y) > thresh \\ maxval & \text{otherwise} \end{cases}$$

- THRESH_TRUNC

$$dst(x,y) = \begin{cases} threshold & \text{if } src(x,y) > thresh \\ src(x,y) & \text{otherwise} \end{cases}$$

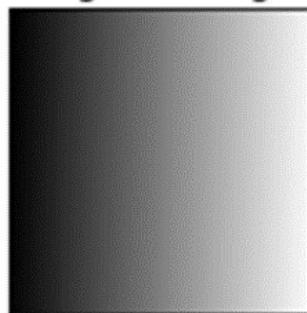
- THRESH_TOZERO

$$dst(x,y) = \begin{cases} src(x,y) & \text{if } src(x,y) > thresh \\ 0 & \text{otherwise} \end{cases}$$

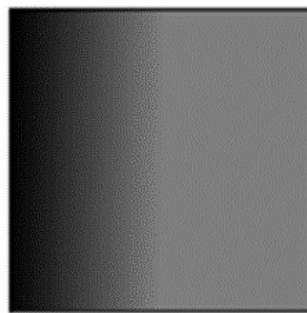
- THRESH_TOZERO_INV

$$dst(x,y) = \begin{cases} 0 & \text{if } src(x,y) > thresh \\ src(x,y) & \text{otherwise} \end{cases}$$

Original Image



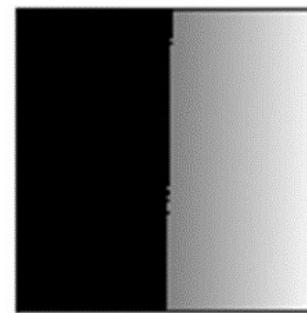
TRUNC



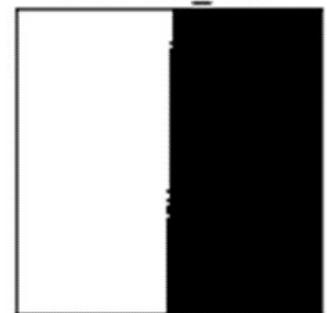
BINARY



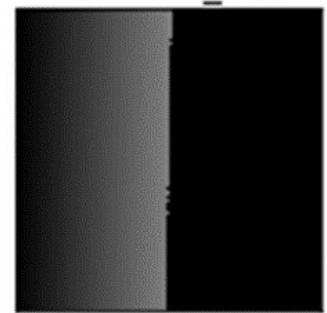
TOZERO



BINARY_INV



TOZERO_INV

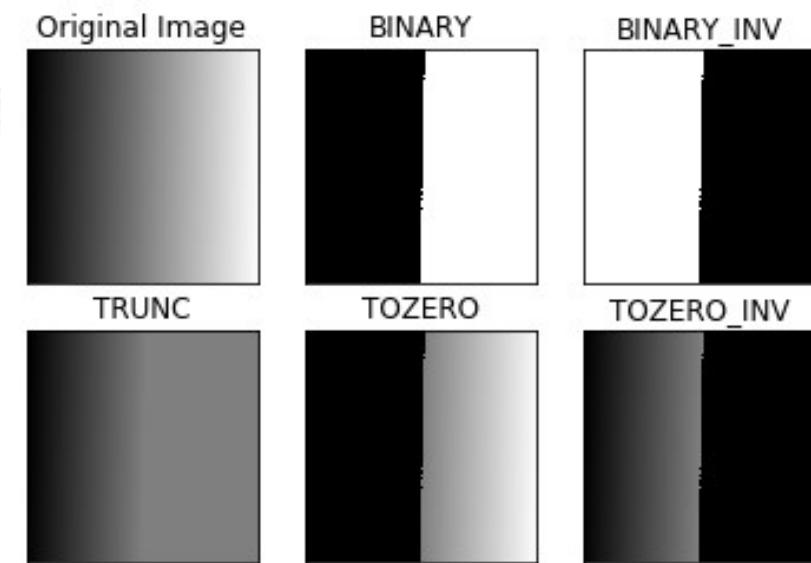


```

8 import cv2 as cv
9 import matplotlib.pyplot as plt
10 img = cv.imread('gradient.png',0)
11 ret,thresh1 = cv.threshold(img,127,255,cv.THRESH_BINARY)
12 ret,thresh2 = cv.threshold(img,127,255,cv.THRESH_BINARY_INV)
13 ret,thresh3 = cv.threshold(img,127,255,cv.THRESH_TRUNC)
14 ret,thresh4 = cv.threshold(img,127,255,cv.THRESH_TOZERO)
15 ret,thresh5 = cv.threshold(img,127,255,cv.THRESH_TOZERO_INV)
16 titles = ['Original Image','BINARY','BINARY_INV','TRUNC','TOZERO','TOZERO_INV']
17 images = [img, thresh1, thresh2, thresh3, thresh4, thresh5]
18 for i in range(6):
19     plt.subplot(2,3,i+1)
20     plt.imshow(images[i], 'gray', vmin=0, vmax=255)
21     plt.title(titles[i])
22     plt.xticks([]),plt.yticks([])
23 plt.show()

```

ex18.py



15. Adaptive Thresholding

In 14. simple image thresholding, we used a global value as threshold value. But it may not be good in all the conditions where image has different lighting conditions in different areas. In that case, we go for adaptive thresholding. In this, the algorithm calculate the threshold for a small regions of the image. So we get different thresholds for different regions of the same image and it gives us better results for images with varying illumination.



sudoku.png
558x563x3

Adaptive Method - It decides how thresholding value is calculated.

`cv2.ADAPTIVE_THRESH_MEAN_C` : threshold value is the mean of neighbourhood area.

`cv2.ADAPTIVE_THRESH_GAUSSIAN_C` : threshold value is the weighted sum of neighbourhood values where weights are a gaussian window.

Block Size - It decides the size of neighbourhood area.

C - It is just a constant which is subtracted from the mean or weighted mean calculated.

```
cv.adaptiveThreshold(img, 255, cv.ADAPTIVE_THRESH_MEAN_C, cv.THRESH_BINARY, 11, 2);
cv.adaptiveThreshold(img, 255, cv.ADAPTIVE_THRESH_GAUSSIAN_C, cv.THRESH_BINARY, 11, 2)
```

src, maxVal

ex19.py

```
8 import cv2 as cv
9
10 img = cv.imread('sudoku.png',0) # grayscale
11 _, th1 = cv.threshold(img, 127, 255, cv.THRESH_BINARY)
12 th2 = cv.adaptiveThreshold(img, 255, cv.ADAPTIVE_THRESH_MEAN_C, cv.THRESH_BINARY, 11, 2)
13 th3 = cv.adaptiveThreshold(img, 255, cv.ADAPTIVE_THRESH_GAUSSIAN_C, cv.THRESH_BINARY, 11, 2)
14
15 cv.imshow("Image", img)
16 cv.imshow("THRESH_BINARY", th1)
17 cv.imshow("ADAPTIVE_THRESH_MEAN_C", th2)
18 cv.imshow("ADAPTIVE_THRESH_GAUSSIAN_C", th3)
19
20 cv.waitKey(0)
21 cv.destroyAllWindows()
```



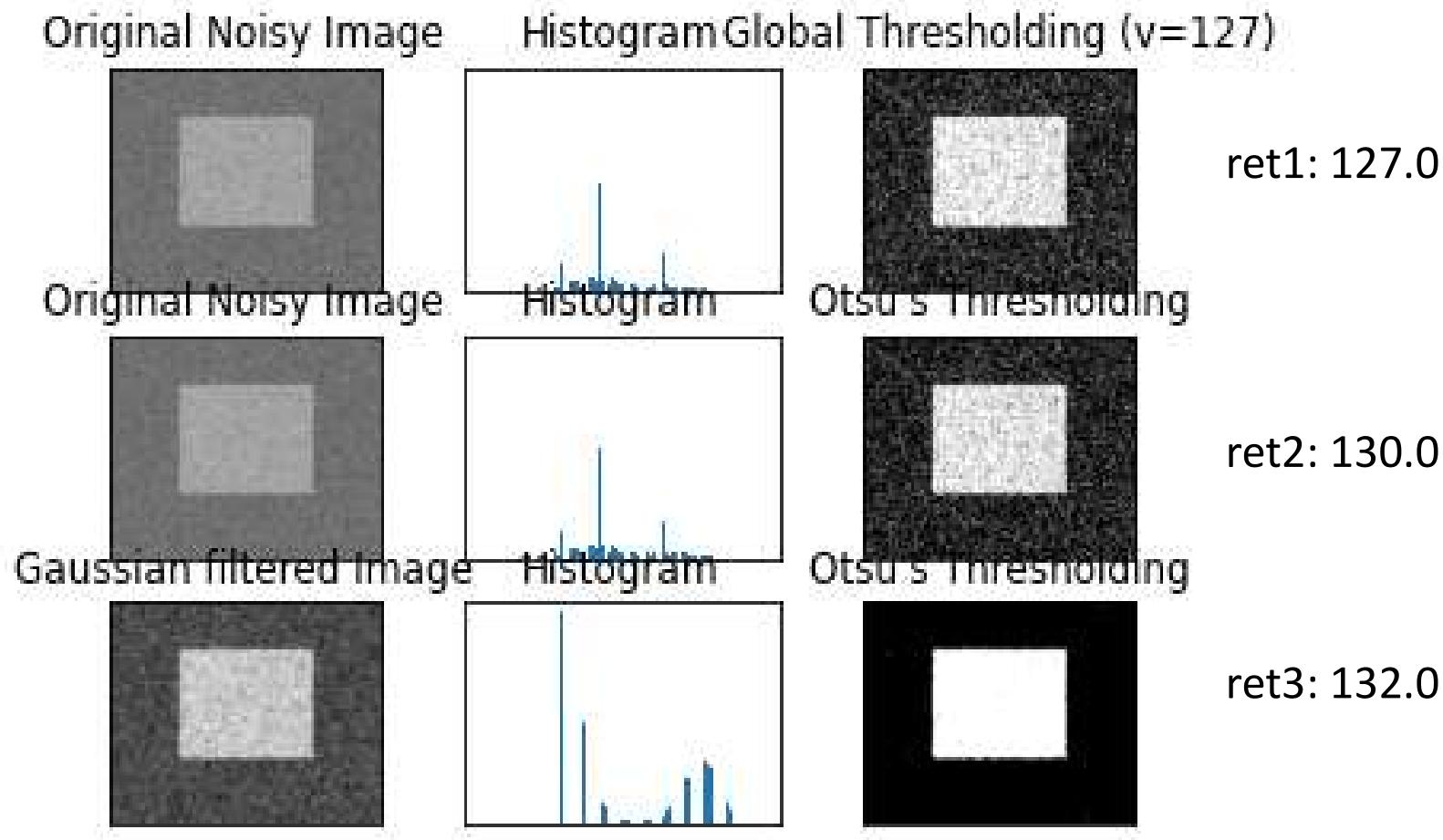
Otsu's Binarization

In global thresholding, we used an arbitrary chosen value as a threshold. In contrast, Otsu's method avoids having to choose a value and determines it automatically.

Consider an image with only two distinct image values (**bimodal image**), where the **histogram would only consist of two peaks**. A good threshold would be in the middle of those two values. Similarly, Otsu's method determines an optimal global threshold value from the image histogram.

In order to do so, the `cv.threshold()` function is used, where `cv.THRESH_OTSU` is passed as an extra flag. The **threshold value** can be chosen arbitrary (typically **0**). The algorithm then finds the optimal threshold value which is returned as the first output.

Check out the example below. The input image is a noisy image. In the first case, global thresholding with a value of 127 is applied. In the second case, Otsu's thresholding is applied directly. In the third case, the image is first filtered with a 5x5 gaussian kernel to remove the noise, then Otsu thresholding is applied. See how noise filtering improves the result.



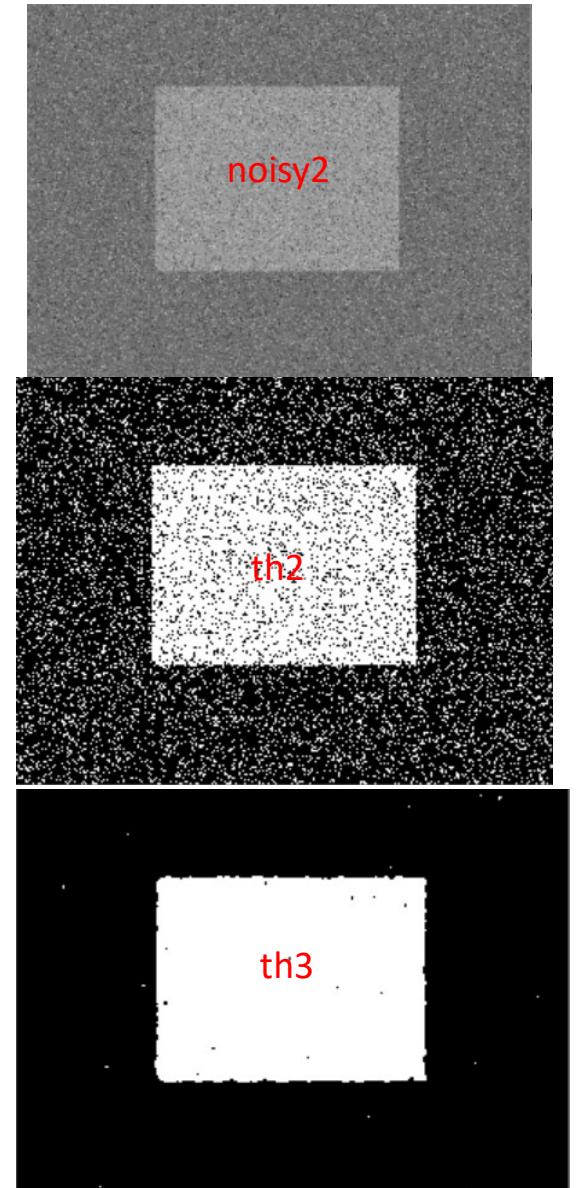
```

import cv2 as cv
from matplotlib import pyplot as plt

img = cv.imread('noisy2.png',0) # grayscale
# global thresholding
ret1,th1 = cv.threshold(img,127,255,cv.THRESH_BINARY)
# Otsu's thresholding
ret2,th2 = cv.threshold(img,0,255,cv.THRESH_BINARY+cv.THRESH_OTSU)
# Otsu's thresholding after Gaussian filtering
blur = cv.GaussianBlur(img,(5,5),0) # see 18 blurring image
ret3,th3 = cv.threshold(blur,0,255,cv.THRESH_BINARY+cv.THRESH_OTSU)
# plot all the images and their histograms
images = [img, 0, th1, img, 0, th2, blur, 0, th3]
titles = ['Original Noisy Image','Histogram','Global Thresholding (v=127)',
          'Original Noisy Image','Histogram',"Otsu's Thresholding",
          'Gaussian filtered Image','Histogram',"Otsu's Thresholding"]
for i in range(3):
    plt.subplot(3,3,i*3+1),plt.imshow(images[i*3],'gray')
    plt.title(titles[i*3]), plt.xticks([]), plt.yticks([])
    plt.subplot(3,3,i*3+2),plt.hist(images[i*3].ravel(),256)
    plt.title(titles[i*3+1]), plt.xticks([]), plt.yticks([])
    plt.subplot(3,3,i*3+3),plt.imshow(images[i*3+2],'gray')
    plt.title(titles[i*3+2]), plt.xticks([]), plt.yticks([])
plt.show()

```

otsu.py



16. matplotlib with OpenCV

ex20.py

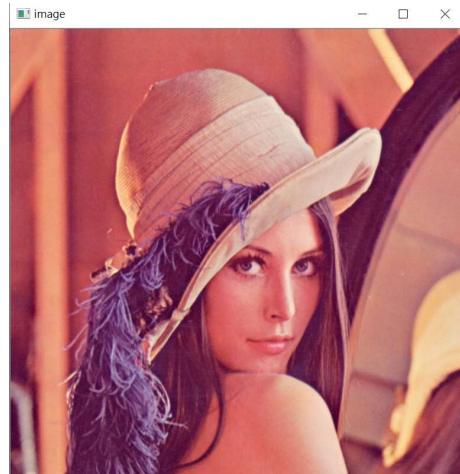
```
import cv2
Import matplotlib.pyplot as plt

img1 = cv2.imread('lena.jpg', -1)
cv2.imshow('image', img1)
img2 = cv2.cvtColor(img1, cv2.COLOR_BGR2RGB)

plt.imshow(img2)
plt.xticks([]), plt.yticks([])
plt.show()

cv2.waitKey(0)
cv2.destroyAllWindows()
```

cv2: BGR
matplotlib: RGB



See ex18.py

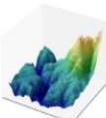
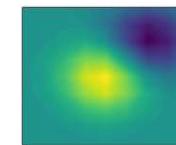
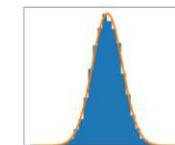
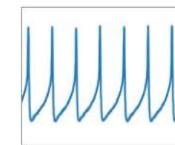


Installation Documentation Examples Tutorials Contributing

[home](#) | [contents](#) » Matplotlib: Python plotting

Matplotlib: Visualization with Python

Matplotlib is a comprehensive library for creating static, animated, and interactive visualizations in Python.



plt.imshow(img1)

17. Morphological Transformations

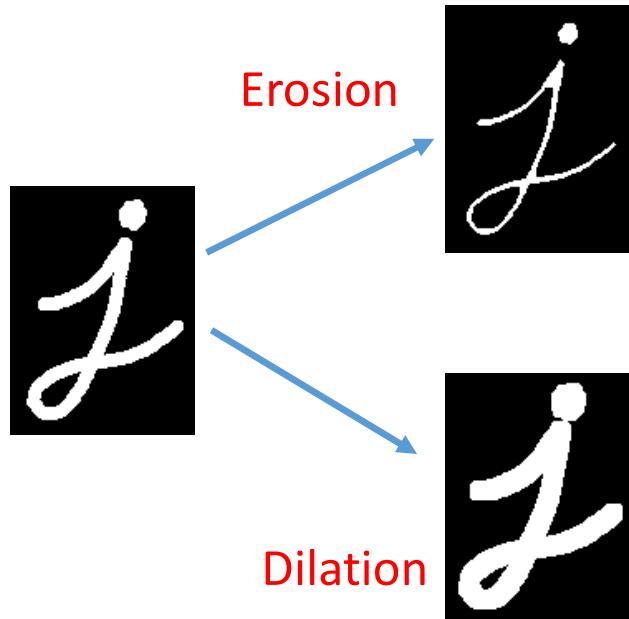
morphological operations like Erosion, Dilation, Opening, Closing etc. We will see different functions like : cv.erode(), cv.dilate(), cv.morphologyEx()

Morphological transformations are some simple operations based on the image shape. It is normally performed on binary images. It needs two inputs, one is our original image, second one is called structuring element or kernel which decides the nature of operation. Two basic morphological operators are Erosion and Dilation.

kernel	1	1	1
1	1	1	1
1	1	1	1

Erosion: A pixel in the original image (either 1 or 0) will be considered 1 only if all the pixels under the kernel is 1, otherwise it is eroded (made to zero).

Dilation: a pixel element is ‘1’ if at least one pixel under the kernel is ‘1’.



useful for removing small white noises, detach two connected objects etc.

Normally, in cases like noise removal, erosion is followed by dilation. Because, erosion removes white noises, but it also shrinks our object. So we dilate it. Since noise is gone, they won't come back, but our object area increases. It is also useful in joining broken parts of an object.

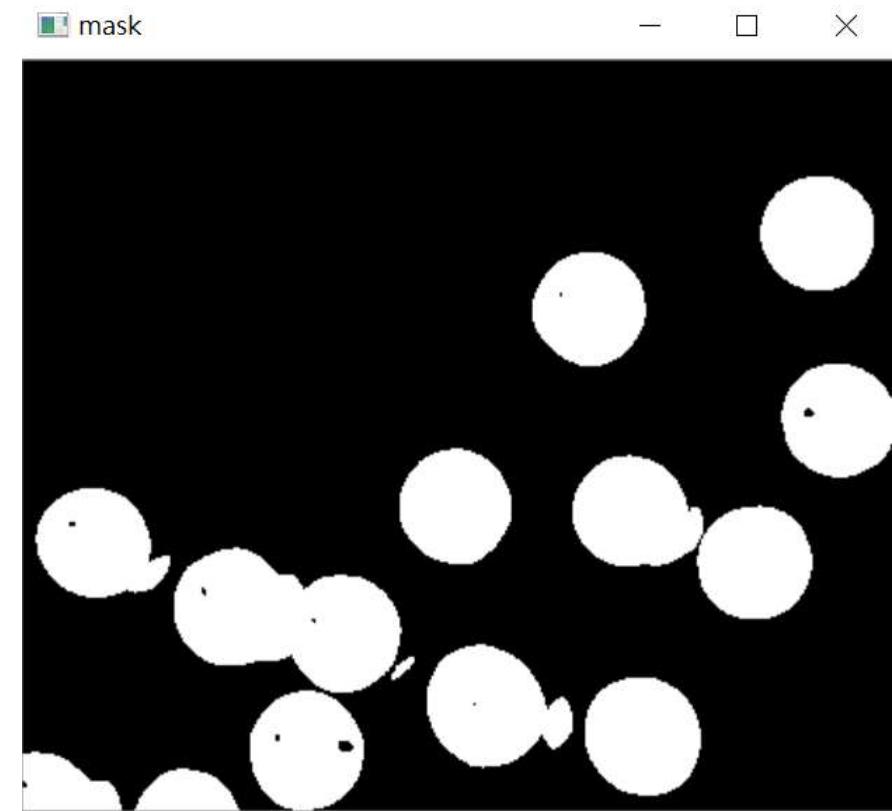
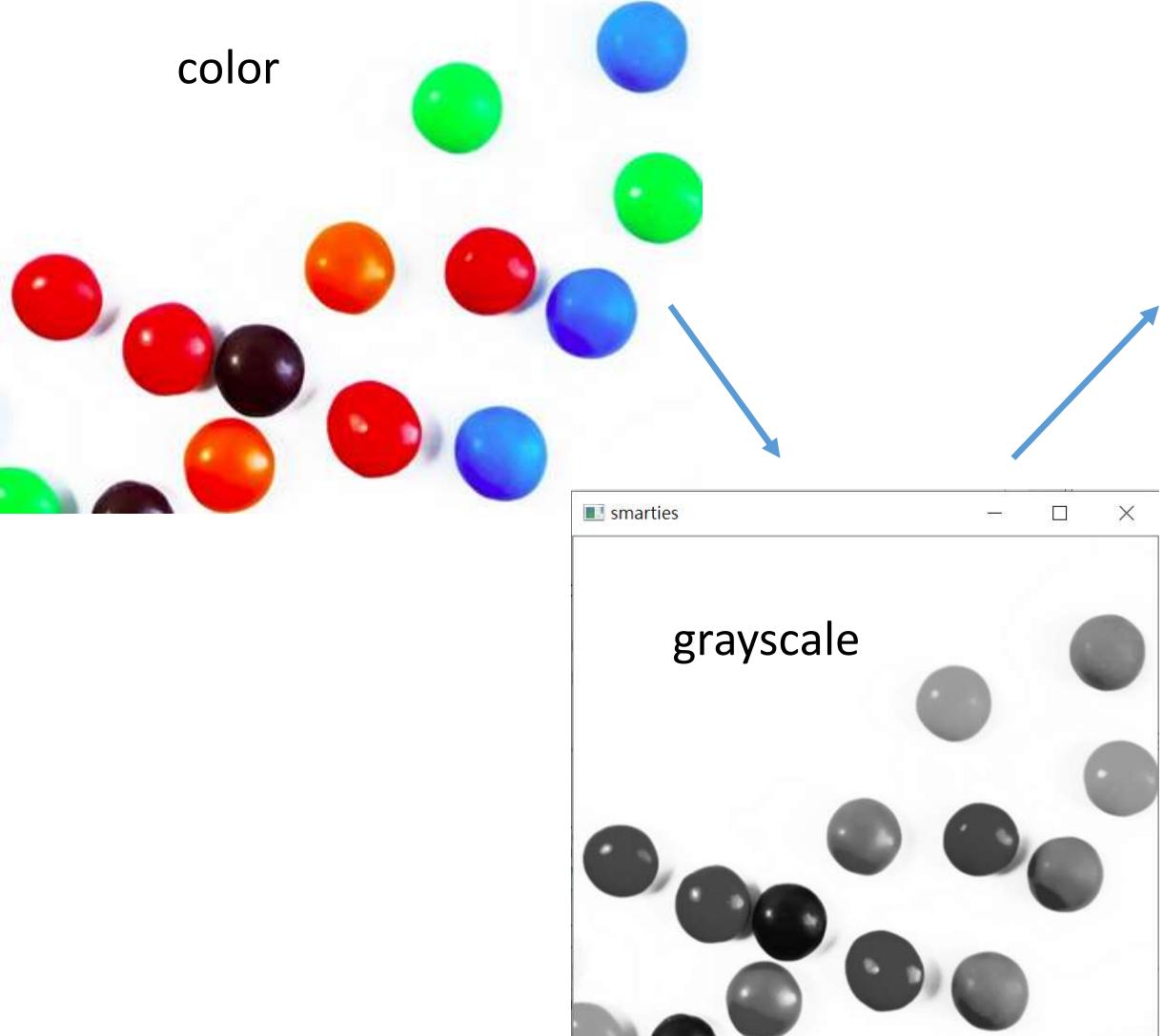
kernel: In image processing, a **kernel**, convolution matrix, or a mask is a small matrix. It is used for blurring, sharpening, embossing, edge detection, and more.

Opening: erosion followed by dilation, useful in removing noise.



Closing: dilation followed by erosion, useful in closing small holes inside the foreground objects, or small black points on the object.





```
import cv2
import numpy as np
from matplotlib import pyplot as plt

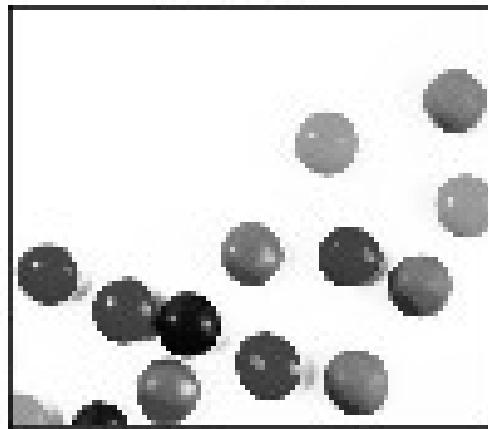
img = cv2.imread('smarties.png', cv2.IMREAD_GRAYSCALE) # 0
_, mask = cv2.threshold(img, 220, 255, cv2.THRESH_BINARY_INV)

kernel = np.ones((5,5), np.uint8) # 5x5
dilation = cv2.dilate(mask, kernel, iterations=2)
erosion = cv2.erode(mask, kernel, iterations=1)
opening = cv2.morphologyEx(mask, cv2.MORPH_OPEN, kernel)
closing = cv2.morphologyEx(mask, cv2.MORPH_CLOSE, kernel)

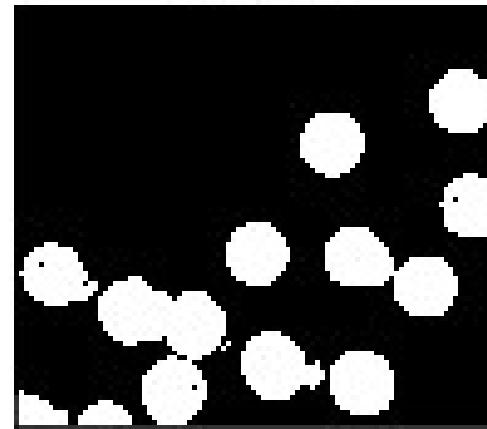
titles = ['image', 'mask', 'dilation', 'erosion', 'opening', 'closing']
images = [img, mask, dilation, erosion, opening, closing]

for i in range(6):
    plt.subplot(2, 3, i+1)
    plt.imshow(images[i], 'gray')
    plt.title(titles[i])
    plt.xticks([]),plt.yticks([])
plt.show()
```

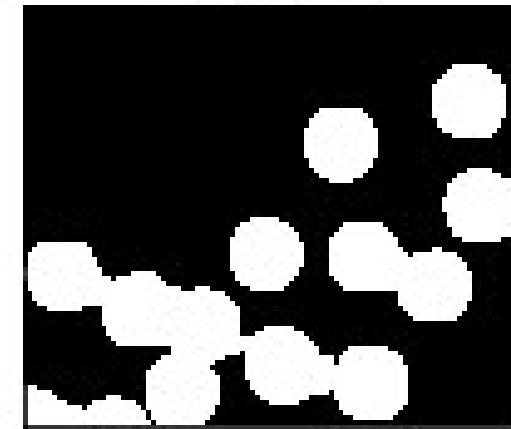
image



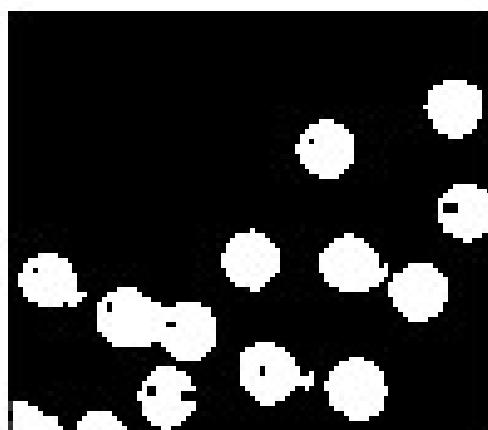
mask



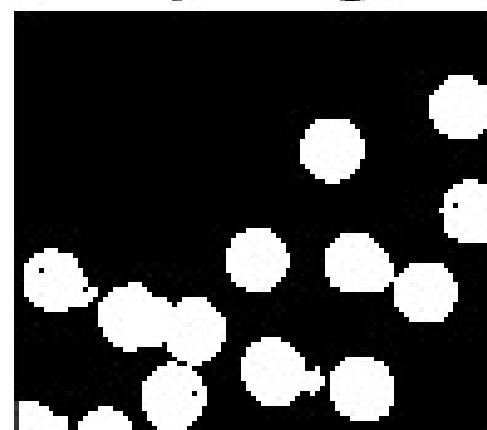
dilation



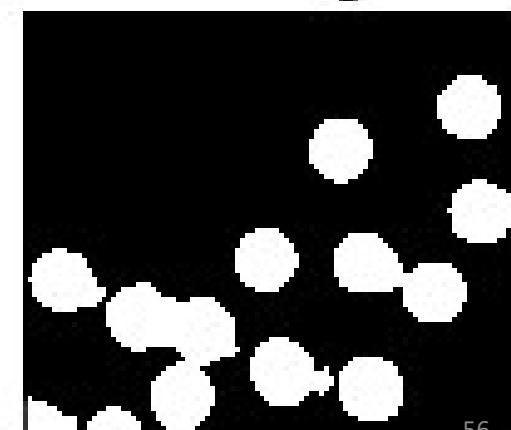
erosion



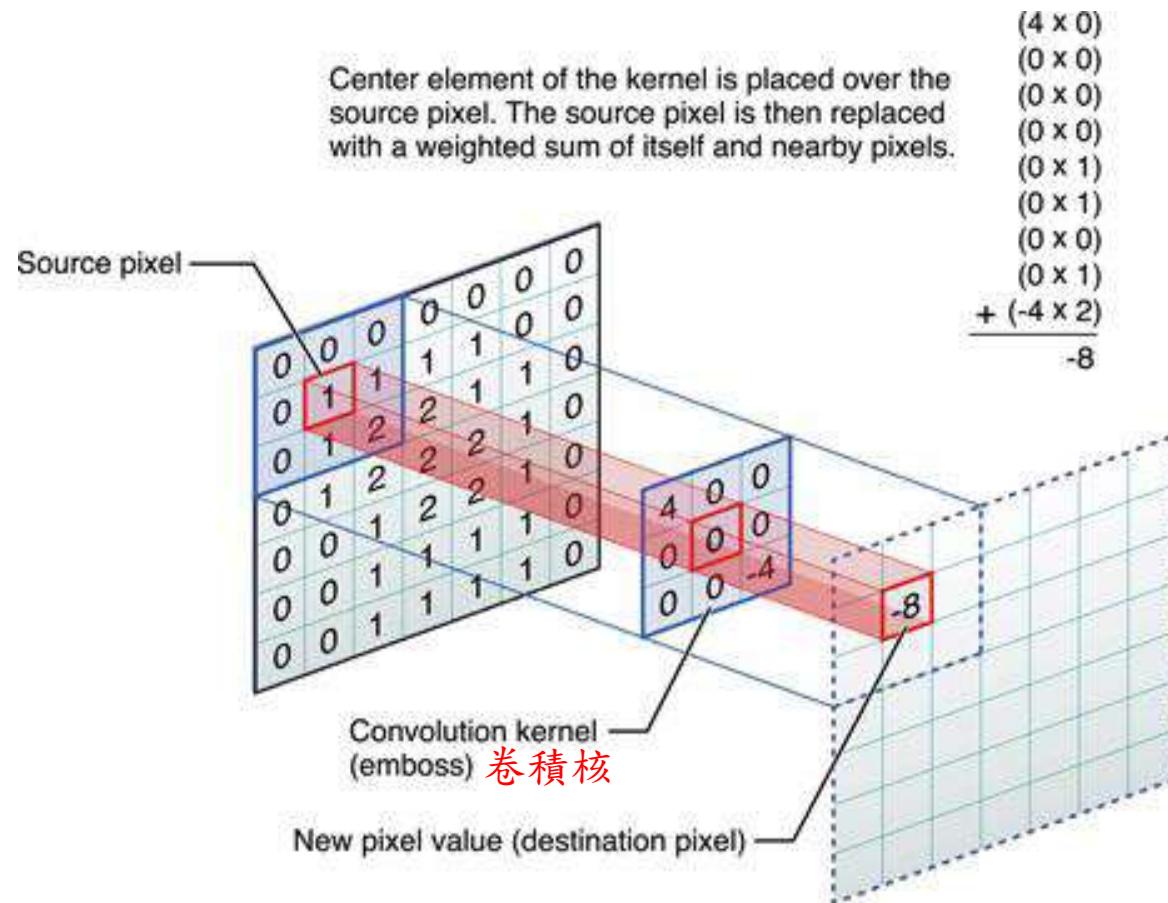
opening



closing



18. Smoothing Images | Blurring Images



18. Smoothing Images | Blurring Images

We will learn different morphological operations like **2D Convolution** (Image Filtering) and Image Blurring (Image Smoothing) using **Averaging**, **Gaussian Blurring**, **Median Blurring**, **Bilateral** Filtering etc. We will see different functions like : cv.filter2D(), cv.blur(), cv.GaussianBlur(), cv.medianBlur(), cv.bilateralFilter() etc.

`dst = cv2.filter2D(src, ddepth, kernel[, dst[, anchor[, delta[, borderType]]]])`

desired depth of the destination image 目標圖像的所需深度

`ddepth = -1`, the output image will have the same depth as the source.

`dst = cv2.blur(src, ksize)`: **averaging**

$$K = \frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

`ksize=(3,3)`

$$K = \frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$

`ksize=(5,5)`

```
dst = cv2.GaussianBlur(src , ksize , sigmaX [ , DST [ , sigmaY [ , borderType ] ] ] )
```

σ (空間的標準差) :0 程式自動計算

If only sigmaX is specified, sigmaY is taken as equal to sigmaX.

If both are given as zeros, they are calculated from the kernel size.

Gaussian filtering is highly effective in removing Gaussian noise from the image.

Gaussian Filter的模糊化效果比Averaging明顯，更為自然。

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```
dst = cv2.GaussianBlur(img, (5, 5), 0)
```

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18. Smoothing Images | Blurring Images

`dst = cv2.medianBlur(src, d): ksize=(d, d)`

good for salt-and-pepper noise

`cv2.medianBlur()` computes the median of all the pixels under the kernel window and the central pixel is replaced with this median value.

The central element is always replaced by some pixel value in the image. This reduces the noise effectively.

`dst = cv2.medianBlur(img, 5)`



`dst = cv2.bilateralFilter(src, d, sigmaColor, sigmaSpace):` (顏色空間的標準差)

能保持邊界清晰且有效的消除噪聲

但比較慢。

highly effective at noise removal while preserving edges.

color σ 即顏色空間的標準差，愈大代表在計算時需要考慮更多的顏色。space σ 即坐標空間的標準差，這個參數與Guassian filter使用的相同，數值越大，代表越遠的像素有較大的權值。

簡單起見，可以令2個sigma的值近似

如果他們很小（小於10），那麼濾波器幾乎沒有什麼效果

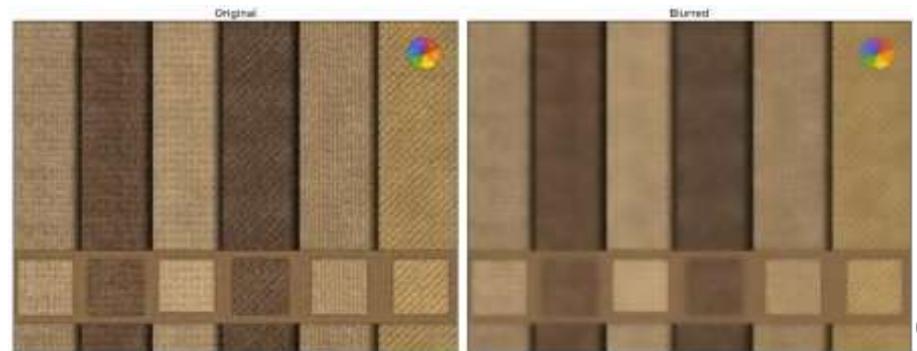
如果他們很大（大於150），那麼濾波器的效果會很強，使圖像清晰非常卡通化₆₀

`cv2.bilateralFilter(src, d, sigmaColor, sigmaSpace):`

The bilateral filter also uses a Gaussian filter in the space domain, but it also uses one more (multiplicative) Gaussian filter component which is a function of pixel intensity differences. The Gaussian function of space makes sure that only pixels are ‘spatial neighbors’ are considered for filtering, while the Gaussian component applied in the intensity domain (a Gaussian function of intensity differences) ensures that only those pixels with intensities similar to that of the central pixel (‘intensity neighbors’) are included to compute the blurred intensity value. As a result, this method preserves edges, since for pixels lying near edges, neighboring pixels placed on the other side of the edge, and therefore exhibiting large intensity variations when compared to the central pixel, will not be included for blurring.

`cv2.bilateralFilter(img,9,75,75)`

The texture on the surface is gone,
but edges are still preserved



ex22.py

```
8 import cv2
9 import numpy as np
10 from matplotlib import pyplot as plt
11
12 #img = cv2.imread('Lena.jpg')
13 #img = cv2.imread('opencv-Logo.png')
14 #img = cv2.imread('water.png')
15 img = cv2.imread('Halftone_Gaussian Blur.jpg')
16 img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
17
18 kernel = np.ones((5, 5), np.float32)/25
19 dst = cv2.filter2D(img, -1, kernel)
20 blur = cv2.blur(img, (5, 5))
21 gblur = cv2.GaussianBlur(img, (5, 5), 0)
22 median = cv2.medianBlur(img, 5)
23 bilateralFilter = cv2.bilateralFilter(img, 9, 75, 75)
24
25 titles = ['image', '2D Convolution', 'blur', 'GaussianBlur', 'median', 'bilateralFilter']
26 images = [img, dst, blur, gblur, median, bilateralFilter]
27
28 for i in range(6):
29     plt.subplot(2, 3, i+1), plt.imshow(images[i], 'gray')
30     plt.title(titles[i])
31     plt.xticks([]),plt.yticks([])
32
33 plt.show()
```

$$K = \frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$

dst = blur

image



2D Convolution



blur



GaussianBlur



median



bilateralFilter



image



2D Convolution



blur



GaussianBlur



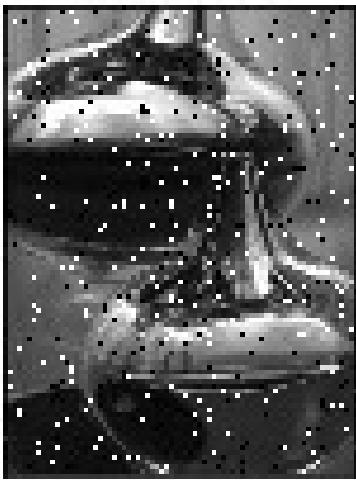
median



bilateralFilter



image



2D Convolution



blur



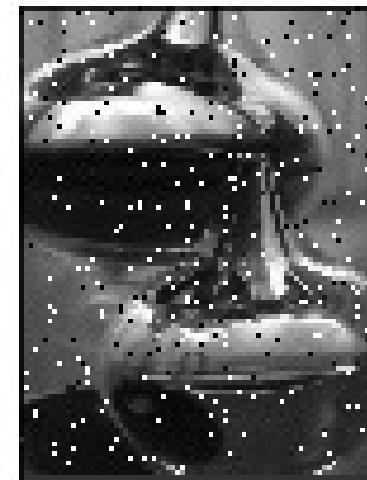
GaussianBlur



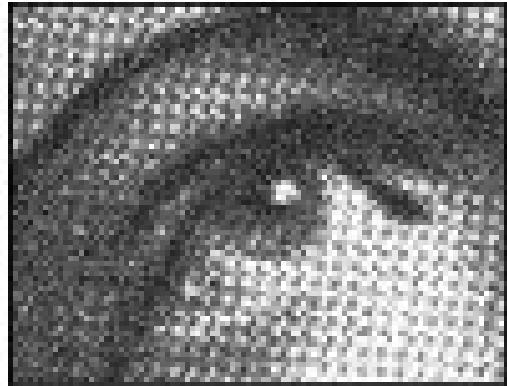
median



bilateralFilter



image



2D Convolution



blur



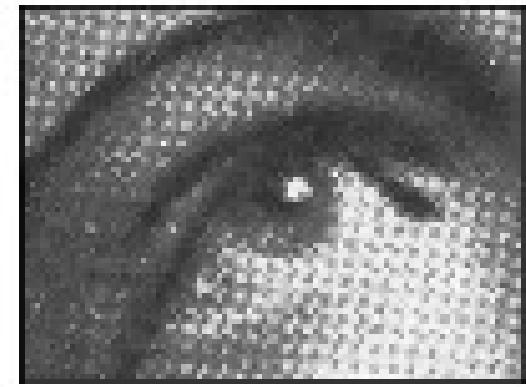
GaussianBlur



median



bilateralFilter



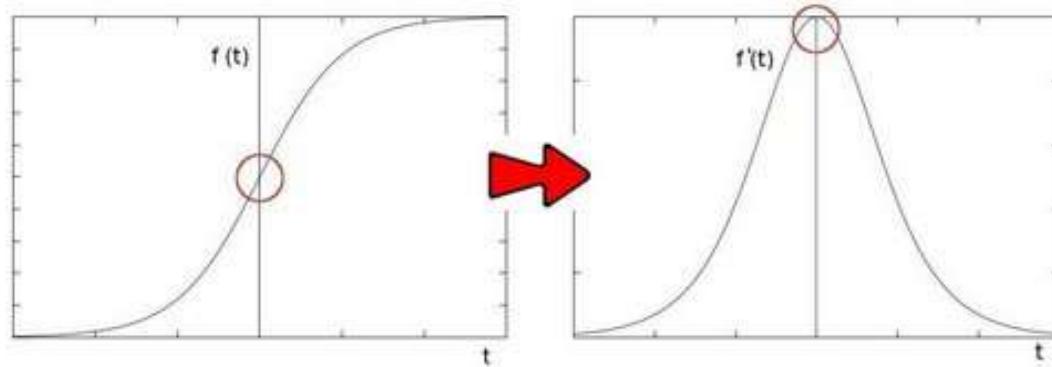
19. Image Gradients and Edge Detection

OpenCV provides three types of gradient filters or High-pass filters:

[Sobel](#), Scharr and [Laplacian](#) (input image in grayscale).

[Sobel](#): detect changes in the first derivative of intensity.

Getting the first derivative of the intensity, we observed that an edge is characterized by a maximum.



```
dst = cv2.Sobel(src, ddepth, dx, dy[, dst[, ksize[, scale[, delta[, borderType]]]]])
```

```
dst = cv2.Sobel(src, ddepth, dx, dy[, dst[, ksize[, scale[, delta[, borderType]]]]])
```

前四個是必須的引數：

第一個引數是需要處理的灰階影像；

第二個引數是影象的深度，-1表示採用的是與原影象相同的深度。目標影象的深度必須大於等於原影象的深度，可使用cv2.CV_16S, cv2.CV_64F；

第三、四個引數dx和dy表示求導的階數，0表示這個方向上沒有求導，一般為0、1、2。

其後是可選的引數：

dst: Destination (output) image；

ksize是Sobel運算元的大小，必須為1、3、5、7。

scale是縮放導數的比例常數，預設情況下沒有伸縮係數；1

delta是一個可選的增量，將會加到最終的dst中，同樣，預設情況下沒有額外的值加到dst中；0

borderType是判斷影象邊界的模式。這個引數預設值為cv2.BORDER_DEFAULT。

Sobel Operator **ksize = 3**

Assuming that the image to be operated is I :

1. We calculate two derivatives:

a. **Horizontal changes**: This is computed by convolving I with a kernel G_x with odd size. For example for a kernel size of 3, G_x would be computed as:

$$G_x = \begin{bmatrix} -1 & 0 & +1 \\ -2 & 0 & +2 \\ -1 & 0 & +1 \end{bmatrix} * I$$

a. **Vertical changes**: This is computed by convolving I with a kernel G_y with odd size. For example for a kernel size of 3, G_y would be computed as:

$$G_y = \begin{bmatrix} -1 & -2 & -1 \\ 0 & 0 & 0 \\ +1 & +2 & +1 \end{bmatrix} * I$$

Note:

When the size of the kernel is 3, the Sobel kernel shown above may produce noticeable inaccuracies (after all, Sobel is only an approximation of the derivative). OpenCV addresses this inaccuracy for kernels of size 3 by using the Scharr() function. This is as fast but more accurate than the standard Sobel function. It implements the following kernels:

$$G_x = \begin{bmatrix} -3 & 0 & +3 \\ -10 & 0 & +10 \\ -3 & 0 & +3 \end{bmatrix}$$

$$G_y = \begin{bmatrix} -3 & -10 & -3 \\ 0 & 0 & 0 \\ +3 & +10 & +3 \end{bmatrix}$$

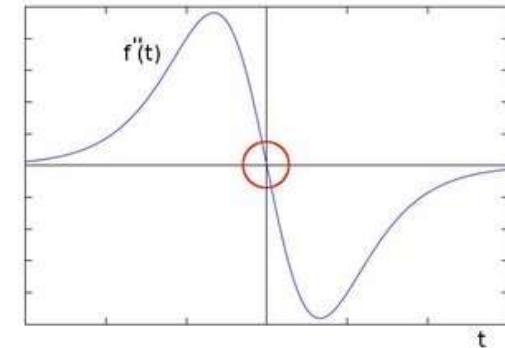
```
dst=cv2.Scharr(src, ddepth, dx, dy[, dst[, scale[, delta[, borderType]]]])
```

```
dst = cv2.Scharr(src, ddepth, 1, 0)
```

Laplacian: detect zero crossings of the second derivative on intensity changes

$$Laplace(f) = \frac{\partial^2 f}{\partial x^2} + \frac{\partial^2 f}{\partial y^2}$$

You can observe that the second derivative is zero! So, **we can also use this criterion to attempt to detect edges in an image**. However, note that zeros will not only appear in edges (they can actually appear in other meaningless locations); this can be solved by applying filtering where needed.



```
dst = cv2.Laplacian(src, ddepth[, dst[, ksize[, scale[, delta[, borderType]]]]])  
dst = cv2.Laplacian(src_gray, ddepth, ksize=kernel_size)
```

- The arguments are:
 - **src_gray**: The input image.
 - **dst**: Destination (output) image
 - **ddepth**: Depth of the destination image. Since our input is CV_8U we define ddepth = **CV_64F** to avoid overflow
 - **kernel_size**: The kernel size of the Sobel operator to be applied internally. We use 3 in this example.
 - **scale**, **delta** and **BORDER_DEFAULT**: We leave them as default values.

ex23.py

```
8 import cv2
9 import numpy as np
10 from matplotlib import pyplot as plt
11
12 img = cv2.imread("messi5.jpg", cv2.IMREAD_GRAYSCALE)
13 #img = cv2.imread("sudoku.png", cv2.IMREAD_GRAYSCALE)
14 lap = cv2.Laplacian(img, cv2.CV_64F, ksize=3)
15 lap = np.uint8(np.absolute(lap))
16 sobelX = cv2.Sobel(img, cv2.CV_64F, 1, 0)
17 sobelY = cv2.Sobel(img, cv2.CV_64F, 0, 1)
18
19 sobelX = np.uint8(np.absolute(sobelX))
20 sobelY = np.uint8(np.absolute(sobelY))
21
22 sobelCombined = cv2.bitwise_or(sobelX, sobelY) # sobelCombined = cv2.addWeighted(sobelX, 0.5, sobelY, 0.5, 0)
```

bitwise_or: 類似 union 聯集
ex:

33 bitwise_or 21 = 53

00100001 (33)

00010101 (21)

00110101 (53)

40 bitwise_or 44 = 44

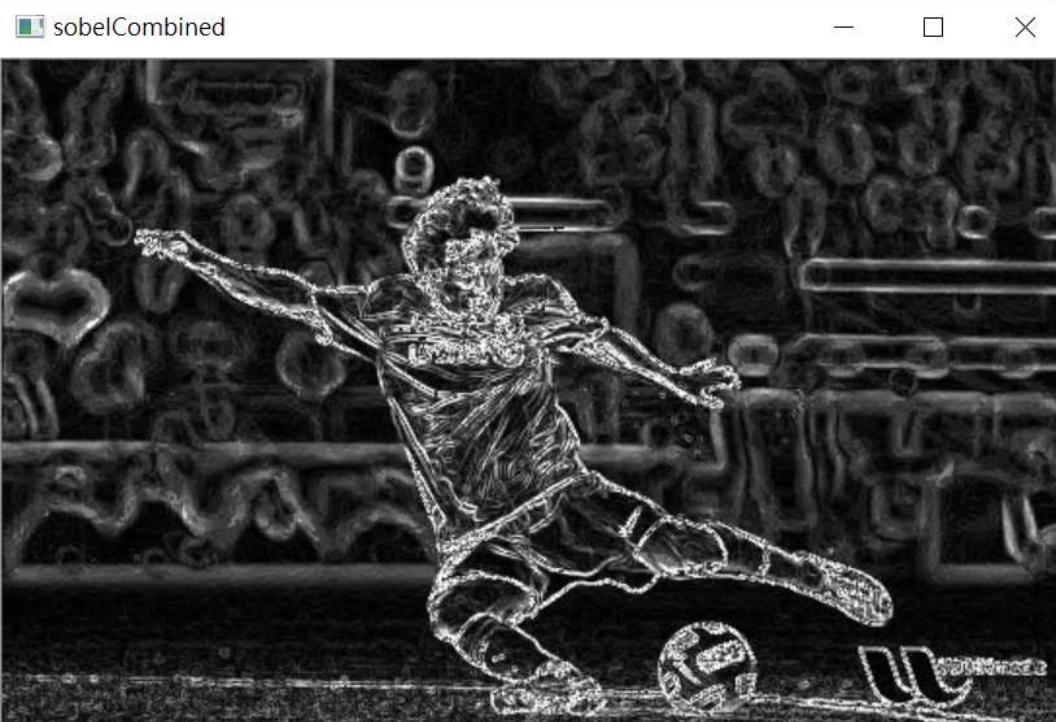
```
23
24 titles = ['image', 'Laplacian', 'sobelX', 'sobelY', 'sobelCombined']
25 images = [img, lap, sobelX, sobelY, sobelCombined]
26 for i in range(5):
27     plt.subplot(2, 3, i+1), plt.imshow(images[i], 'gray')
28     plt.title(titles[i])
29     plt.xticks([]),plt.yticks([])
30
31 plt.show()
32
33 cv2.imshow('image',img)
34 cv2.imshow('Laplacian',lap)
35 cv2.imshow('sobelX',sobelX)
36 cv2.imshow('sobelY',sobelY)
37 cv2.imshow('sobelCombined',sobelCombined)
38 cv2.waitKey(0)
39 cv2.destroyAllWindows()
```



edge: 亮



`cv2.bitwise_or(sobelX, sobelY)`



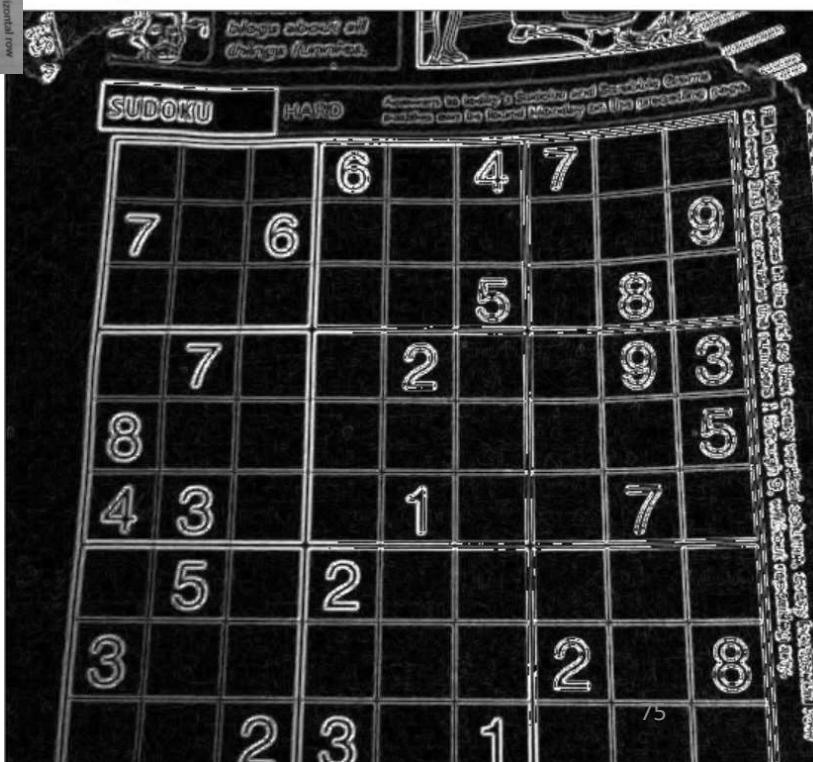
`cv2.addWeighted(sobelX, 0.5, sobelY, 0.5, 0)`



Laplacian



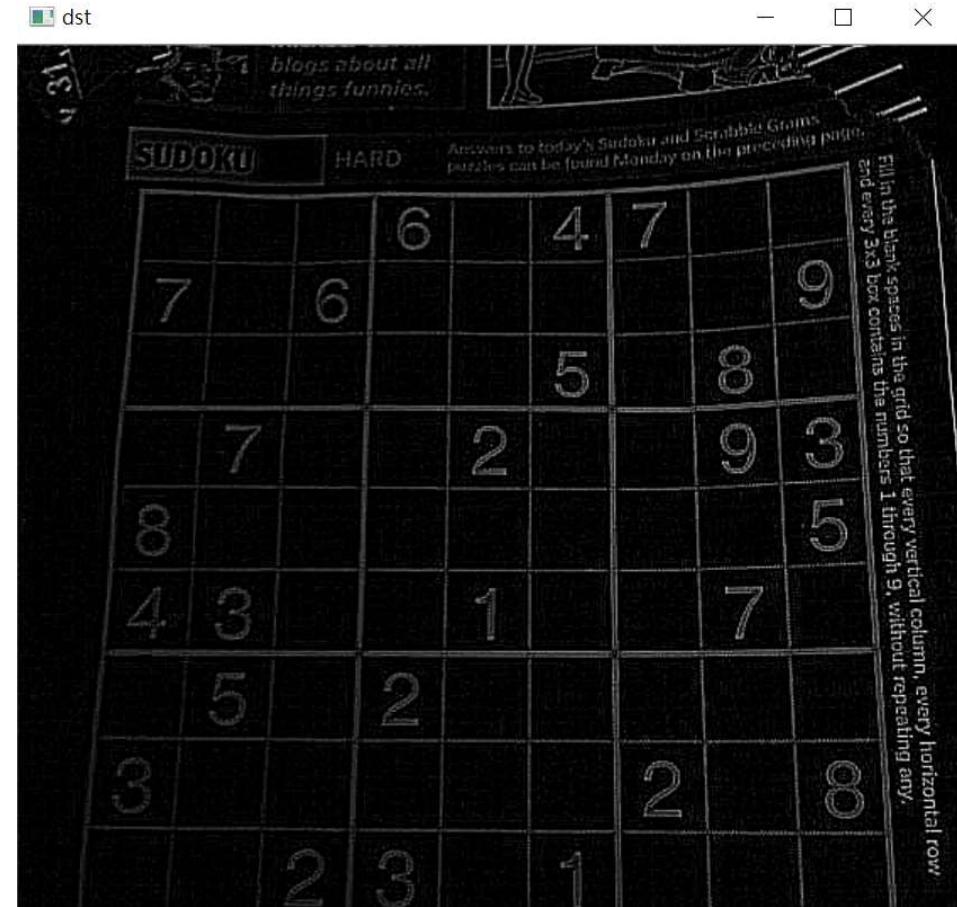
sobelCombined



More on Laplacian: two commonly used Laplacian operators

$$\begin{bmatrix} 0 & 1 & 0 \\ 1 & -4 & 1 \\ 0 & 1 & 0 \end{bmatrix} \quad \begin{bmatrix} 1 & 1 & 1 \\ 1 & -8 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

```
import cv2
import numpy as np
#img = cv2.imread("messi5.jpg", cv2.IMREAD_GRAYSCALE)
img = cv2.imread("sudoku.png", cv2.IMREAD_GRAYSCALE)
kernel = np.ones((3,3), np.float32)
kernel[1][1]=-8
dst = cv2.filter2D(img,-1, kernel)
cv2.imshow('dst',dst)
cv2.waitKey(0)
cv2.destroyAllWindows()
```

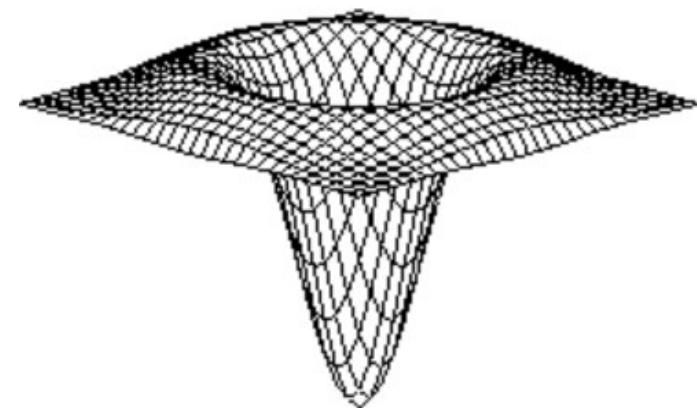


LoG (Laplacian of Gaussian) :

Because these Laplacian kernels are approximating **a second derivative** measurement on the image, they are very sensitive to noise. To counter this, the image is often **Gaussian smoothed** before applying the Laplacian filter. This pre-processing step reduces the high frequency noise components prior to the differentiation step.

LoG: 9x9 kernel Gaussian (sigma = 1.4)

0	1	1	2	2	2	1	1	0
1	2	4	5	5	5	4	2	1
1	4	5	3	0	3	5	4	1
2	5	3	-12	-24	-12	3	5	2
2	5	0	-24	-40	-24	0	5	2
2	5	3	-12	-24	-12	3	5	2
1	4	5	3	0	3	5	4	1
1	2	4	5	5	5	4	2	1
0	1	1	2	2	2	1	1	0



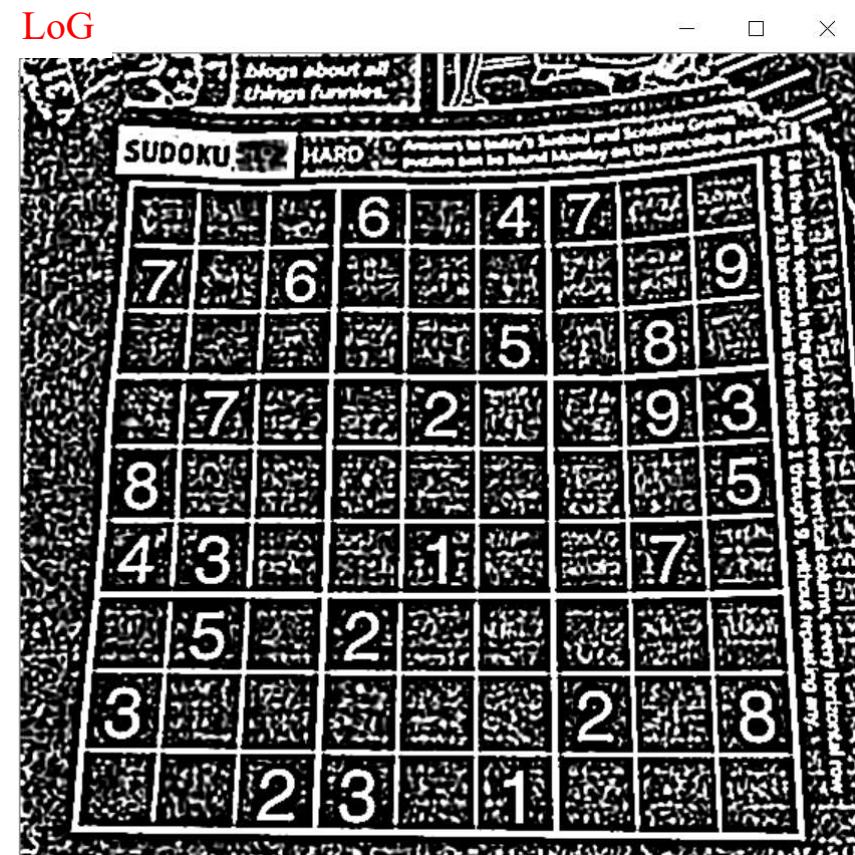
```

import cv2
import numpy as np

#img = cv2.imread("messi5.jpg", cv2.IMREAD_GRAYSCALE)
img = cv2.imread("sudoku.png", cv2.IMREAD_GRAYSCALE)
kernel = np.array([[0, 1, 1, 2, 2, 2, 1, 1, 0],[1, 2, 4, 5, 5, 5, 4, 2, 1],
[1, 4, 5, 3, 0, 3, 5, 4, 1],[2, 5, 3, -12, -24, -12, 3, 5, 2],
[2, 5, 0, -24, -40, -24, 0, 5, 2],[2, 5, 3, -12, -24, -12, 3, 5, 2],
[1, 4, 5, 3, 0, 3, 5, 4, 1],[1, 2, 4, 5, 5, 5, 4, 2, 1],
[0, 1, 1, 2, 2, 2, 1, 1, 0]], dtype = np.float32)
dst = cv2.filter2D(img,-1, kernel)

cv2.imshow('LoG',dst)
cv2.waitKey(0)
cv2.destroyAllWindows()

```



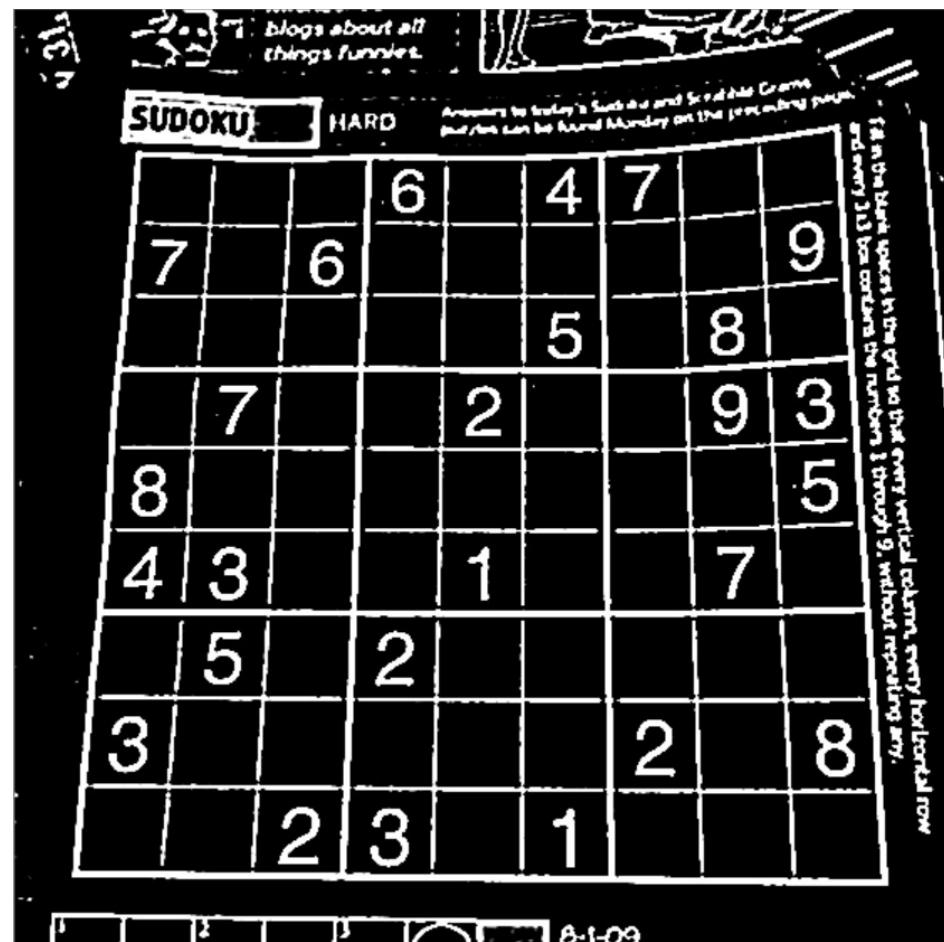
```

import cv2
import numpy as np

#img = cv2.imread("messi5.jpg", cv2.IMREAD_GRAYSCALE)
img = cv2.imread("sudoku.png", cv2.IMREAD_GRAYSCALE)
kernel = np.array([[0, 1, 1, 2, 2, 1, 0, 0, 0],[1, 2, 4, 5, 5, 5, 4, 2, 1],
[1, 4, 5, 3, 0, 3, 5, 4, 1],[2, 5, 3, -12, -24, -12, 3, 5, 2],
[2, 5, 0, -24, -40, -24, 0, 5, 2],[5, 1, 1, -12, -24, -12, 3, 5, 2],
[1, 4, 5, 3, 0, 3, 5, 4, 1],[1, 2, 4, 5, 5, 5, 4, 2, 1],
[0, 1, 1, 2, 0, 0, 0, 1, 0]], dtype = np.float32)
dst = cv2.filter2D(img,-1, kernel)

cv2.imshow('LoG',dst)
cv2.waitKey(0)
cv2.destroyAllWindows()

```



Laplacian



— □ ×

sobelCombined



— □ ×

LoG



— □ ×

dst

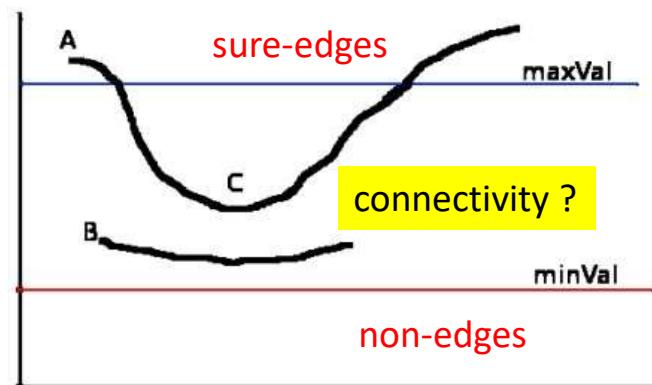


20. Canny Edge Detection

It was developed by John F. Canny in 1986. It is a multi-stage algorithm
The Canny edge detection algorithm is broken down to 5 steps:

- 1 **Noise reduction**: eg., to remove the noise in the image with a 5x5 Gaussian filter.
- 2 **Gradient calculation**: with a Sobel kernel in both horizontal and vertical direction to get first derivative in horizontal direction (G_x) and vertical direction (G_y).
- 3 **Non-maximum suppression**: At every pixel, pixel is checked if it is a local maximum in its neighborhood in the direction of gradient. If so, it is considered for next stage, otherwise, it is suppressed (put to zero).
- 4 **Double threshold**: two threshold values, minVal and maxVal .
- 5 **Edge Tracking by Hysteresis**:

Output = binary image [0, 255]



$$\text{maxVal}/\text{minVal} = 2^{2-3}$$

```
cv2.Canny(image, threshold1, threshold2[, edges[, apertureSize[, L2gradient ]]])  
          (dst)
```

```
canny = cv2.Canny(img, 100, 200)
```

apertureSize: 就是Sobel運算子的大小。

L2gradient: Boolean 參數

True: 使用精確的L2範數進行計算（即兩個方向的導數的平方和再開根號）；

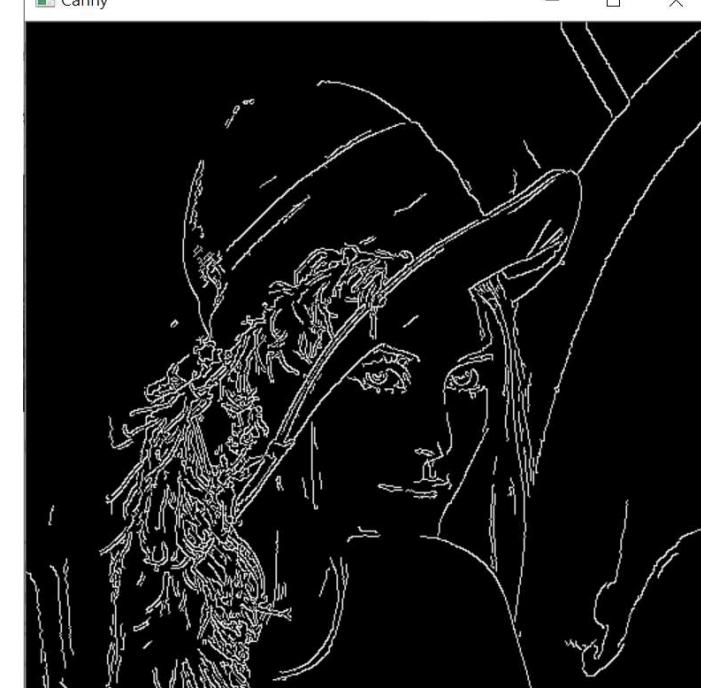
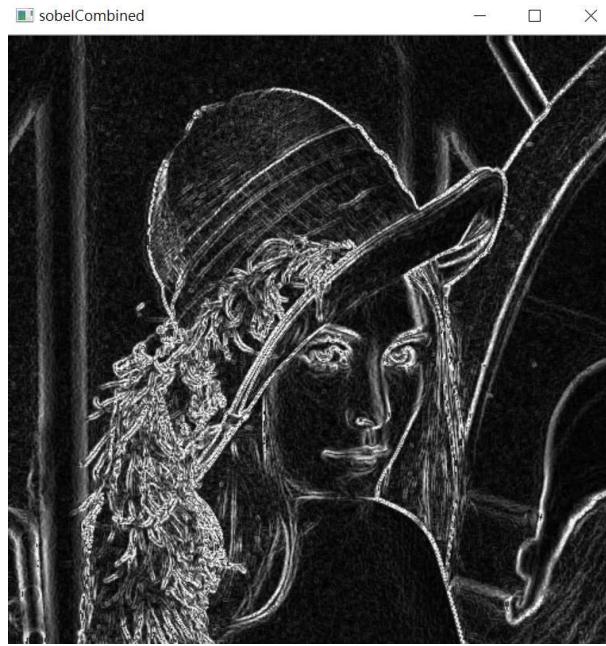
$$G = \sqrt{G_x^2 + G_y^2}$$

False 使用L1範數（直接將兩個方向導數的絕對值相加）。

$$G = |G_x| + |G_y|$$

ex24.py

```
8 import cv2
9 import numpy as np
10 from matplotlib import pyplot as plt
11
12 img = cv2.imread("lena.jpg", cv2.IMREAD_GRAYSCALE)
13 lap = cv2.Laplacian(img, cv2.CV_64F, ksize=3)
14 lap = np.uint8(np.absolute(lap))
15 sobelX = cv2.Sobel(img, cv2.CV_64F, 1, 0)
16 sobelY = cv2.Sobel(img, cv2.CV_64F, 0, 1)
17 canny = cv2.Canny(img,100,200)
18
19 sobelX = np.uint8(np.absolute(sobelX))
20 sobelY = np.uint8(np.absolute(sobelY))
21
22 sobelCombined = cv2.bitwise_or(sobelX, sobelY)
23
24 titles = ['image', 'Laplacian', 'sobelX', 'sobelY', 'sobelCombined', 'Canny']
25 images = [img, lap, sobelX, sobelY, sobelCombined, canny]
26 for i in range(6):
27     plt.subplot(2, 3, i+1), plt.imshow(images[i], 'gray')
28     plt.title(titles[i])
29     plt.xticks([]),plt.yticks([])
30
31 plt.show()
32
33 cv2.imshow('image',img)
34 cv2.imshow('Laplacian',lap)
35 cv2.imshow('sobelX',sobelX)
36 cv2.imshow('sobelY',sobelY)
37 cv2.imshow('sobelCombined',sobelCombined)
38 cv2.imshow('Canny',canny)
39 cv2.waitKey(0)
40 cv2.destroyAllWindows()
```



binary image

細緻
(see array)

Use Trackbar to dynamically changing the thresholds

```
8 import cv2
9
10 def CannyThreshold(lowThreshold):
11     detected_edges = cv2.GaussianBlur(gray,(3,3),0)
12     detected_edges = cv2.Canny(detected_edges,lowThreshold,lowThreshold*ratio,apertureSize = kernel_size)
13     dst = cv2.bitwise_and(img,img,mask = detected_edges) # just add some colours to edges from original image.
14     cv2.imshow('canny demo',dst)
15
16 lowThreshold = 0
17 max_lowThreshold = 100
18 ratio = 3
19 kernel_size = 3
20
21 img = cv2.imread('lena.jpg')
22 gray = cv2.cvtColor(img,cv2.COLOR_BGR2GRAY)
23
24 cv2.namedWindow('canny demo')
25 cv2.createTrackbar('Min threshold','canny demo',lowThreshold, max_lowThreshold, CannyThreshold)
26
27 CannyThreshold(0) # initialization
28 if cv2.waitKey(0) == 27:
29     cv2.destroyAllWindows()
```

ex25.py

detected_edges

