

# LDW (Lane Departure Warning)

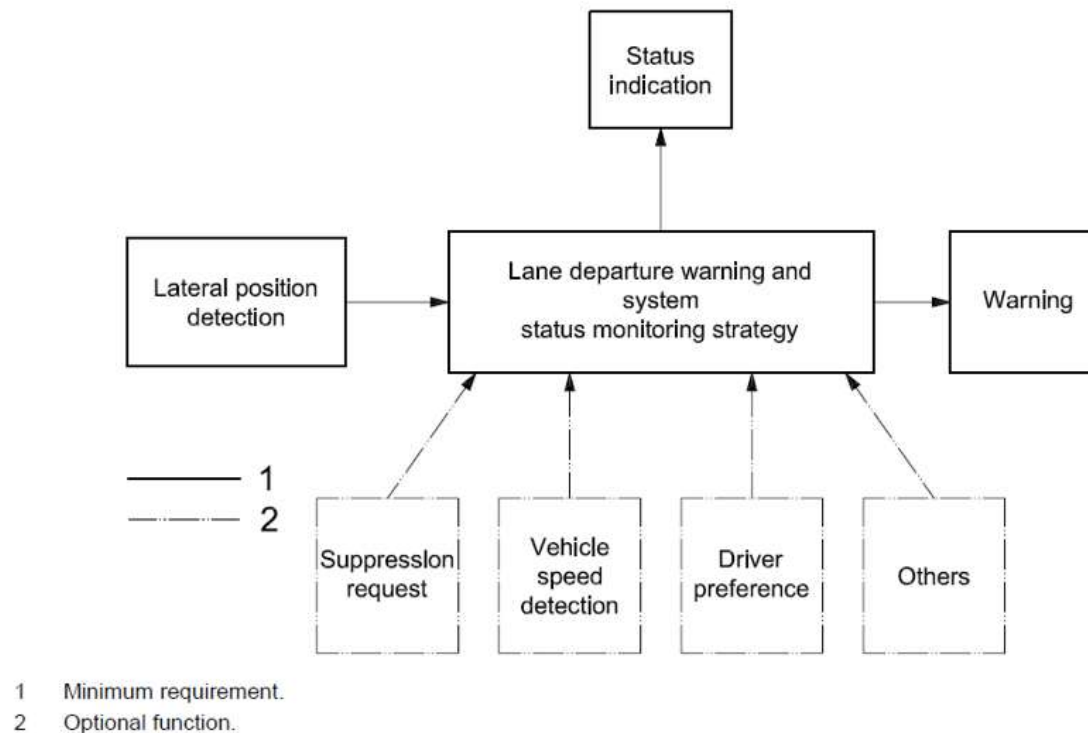
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15 Jan 2021

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신 주 석

## ◆ LDW (Lane Departure Warning) System

- Main Focus: Help the driver **keep the vehicle in the lane on highways and highway-like roads**
- 운전자의 부주의로 인하여 차선 이탈 시 운전자에게 알려주기 위해 경고를 발생 시키는 System
  - » 다른 차량과의 충돌에 대해 경고하거나 차량의 움직임을 제어하기 위한 System은 아님
  - » 차량의 제어는 운전자에게 책임이 있음



- Lane Detection in image (from Camera) ⇒ LDW ⇒ LKAS ⇒ HDA ⇒ 자율 차선 변경

## ◆ Finding Lane Lines on the Road



- 차선을 인식(검출)하기 위해 어떤 특징들이 좋은 걸까?
  - » Color
  - » Shape
  - » Orientation
  - » Position in the image

## ◆ Finding Lane Lines on the Road

- Identifying Lane Lines by Color



$$\text{Pure White} = \begin{bmatrix} \text{R} & \text{G} & \text{B} \\ ?, & ?, & ? \end{bmatrix}$$

## ◆ Install Pycharm

```
pip install numpy          (np : array)
    "      matplotlib        (plot)
    "      OpenCV-Python     (opencv)
    "      pillow            (plt. -)
    "      moviepy           (video)
```

## ◆ Color Selection

### – Write Code

```
import matplotlib.pyplot as plt
import matplotlib.image as mpimg
import numpy as np
```

```
image = mpimg.imread('test.jpg')
color_select = np.copy(image)
```

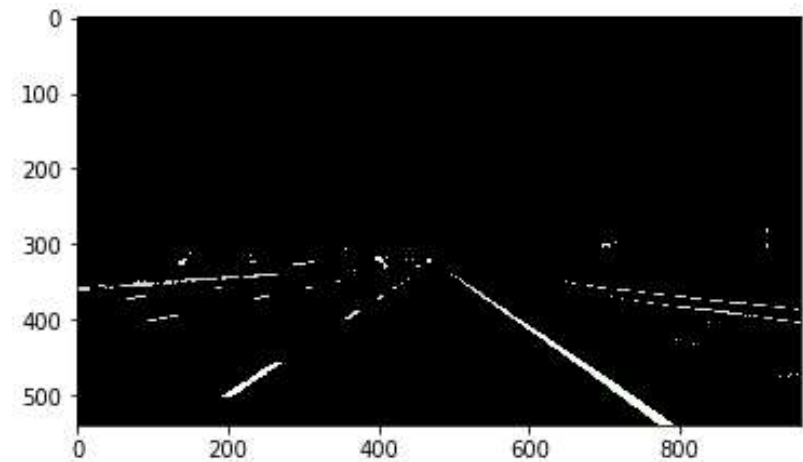
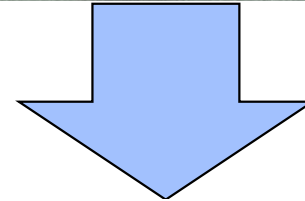
```
r_th = 0
g_th = 0
b_th = 0
rgb_th = [r_th, g_th, b_th]
```

← Modify these values

```
th = (image[:, :, 0] < rgb_th[0]) \
      | (image[:, :, 1] < rgb_th[1]) \
      | (image[:, :, 2] < rgb_th[2])
```

```
color_select[th] = [0, 0, 0]
```

```
plt.imshow(color_select)
plt.show()
```

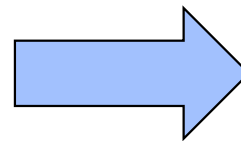
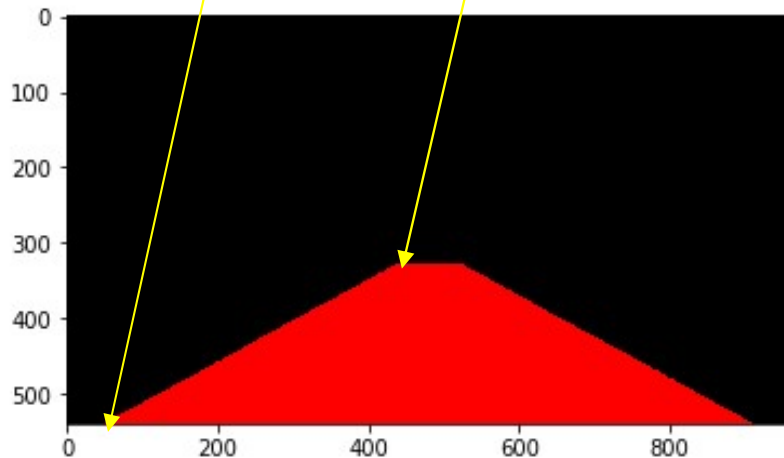


## ◆ ROI (Region Of Interest)

### — Make Mask

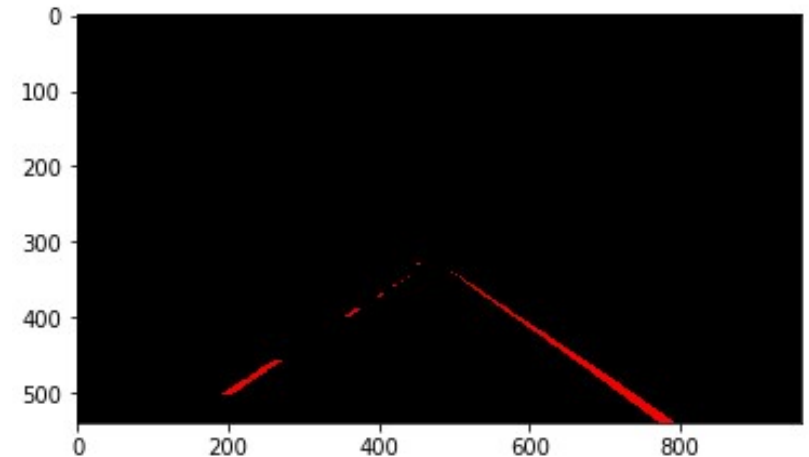
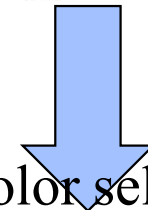
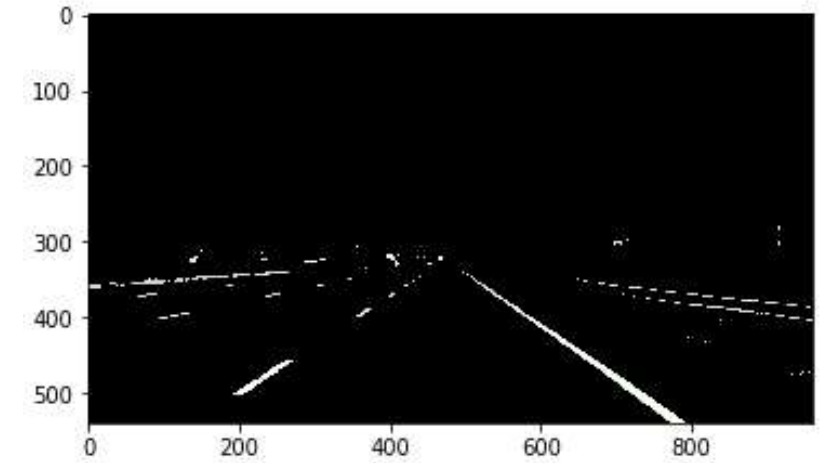
`import cv2` ← 추가

```
#th_img = cv2.cvtColor(color_select, cv2.COLOR_RGB2GRAY)
mask = np.zeros_like(color_select)
ignore_mask_color = 255
vertices = np.array([[50, height), (width/2-45, height/2+60),
                    (width/2+45, height/2+60), (width-50, height)], dtype=np.int32)
cv2.fillPoly(mask, vertices, ignore_mask_color)
plt.imshow(mask, 'gray')
plt.show()
```



Bitwise AND? OR?

`Img0 = cv2.bitwise_?(color_select, mask)`

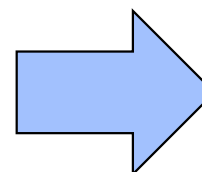
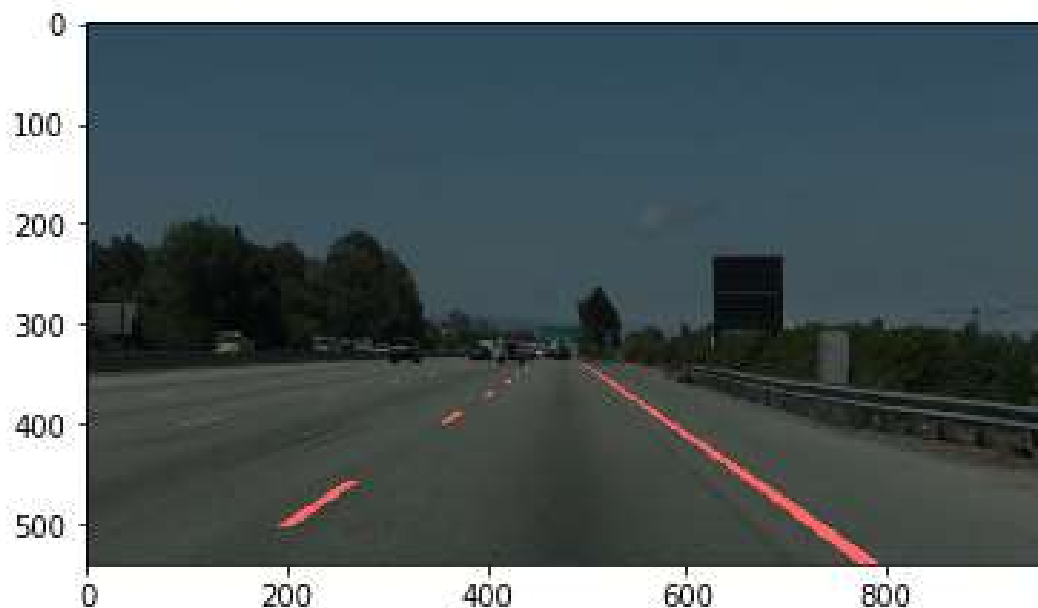


## ◆ Color Select + ROI

```
result = cv2.addWeighted(image, 0.4, img0, 1, 0)
plt.imshow(result)
plt.show()
```

원본이미지

Color Select + ROI (mask)

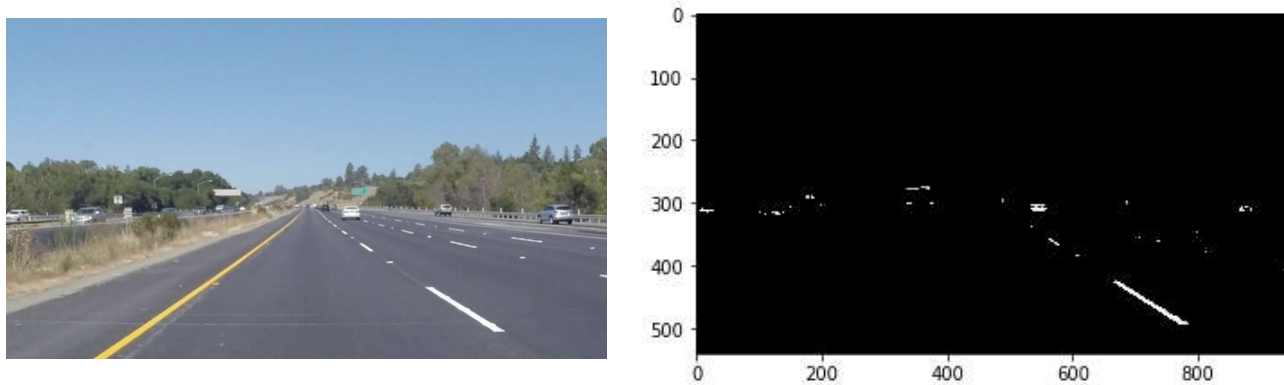


So, Can we upload  
this algorithm to the Car?

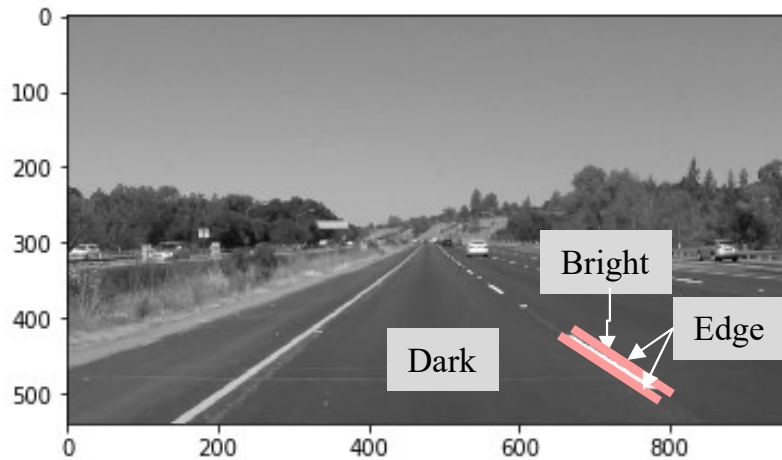


## ◆ Using Edge

- Result (using color: same code)



- What is edge?



$$f(x, y) = \text{pixel}$$

$$\frac{df}{dx} = \Delta(\text{pixel})$$

## ◆ Using Edge

- Where you expect to find strong edge?

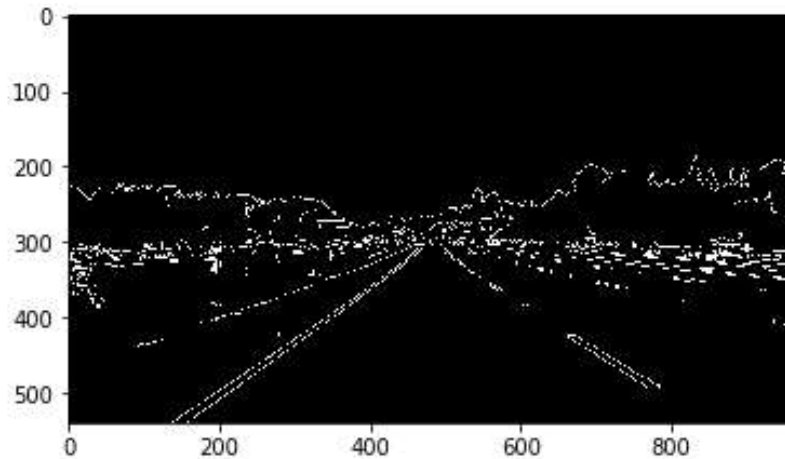


## ◆ Canny Edge

```
low_th = 0
high_th = 0
edge_img = cv2.Canny(smooth_img, low_th, high_th)
plt.imshow(edge_img, 'gray')
```

← Modify these values

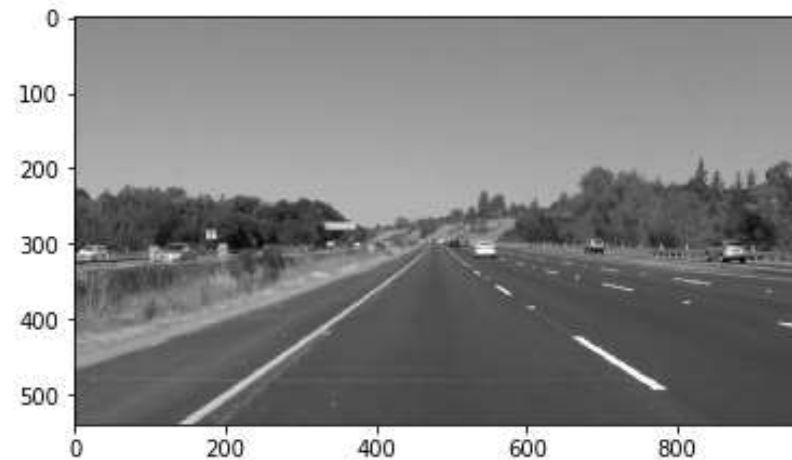
<matplotlib.image.AxesImage at 0x7f7e3796e6d8>



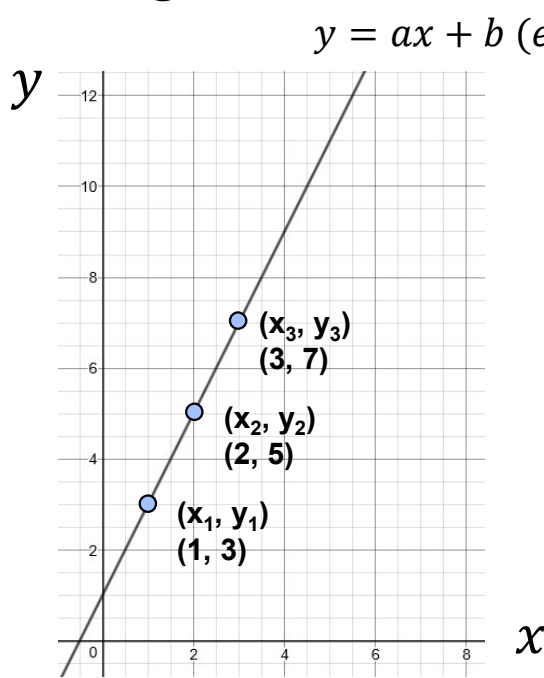
```
import matplotlib.pyplot as plt
import matplotlib.image as mpimg
import numpy as np
import cv2
```

```
image = mpimg.imread('test_1.jpg')
gray = cv2.cvtColor(image, cv2.COLOR_RGB2GRAY)
```

```
kernel_size = 3
smooth_img = cv2.GaussianBlur(gray, (kernel_size, kernel_size), 0)
plt.imshow(smooth_img, 'gray')
plt.show()
```



## ◆ Hough Transform



$$b = -xa + y$$

$$b = -1a + 3$$

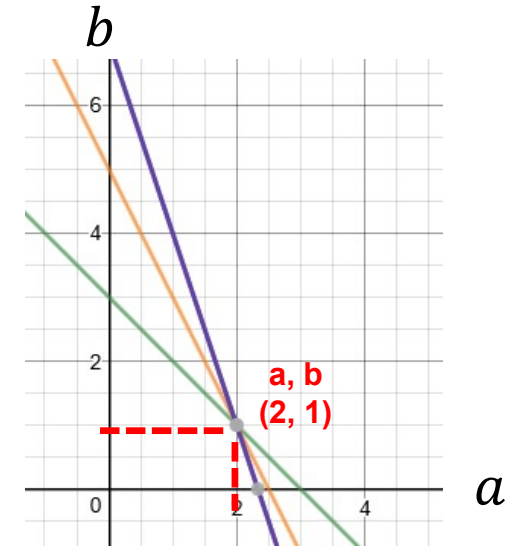
$$b = -2a + 5$$

$$b = -3a + 7$$

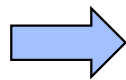
### Hough Transform

Use the following equation to express a straight line.

$$\rho = x \cos \theta + y \sin \theta$$



Why polar coordinate is used in Hough Transform?



**Vertical lines have infinite slope in a-b representation**

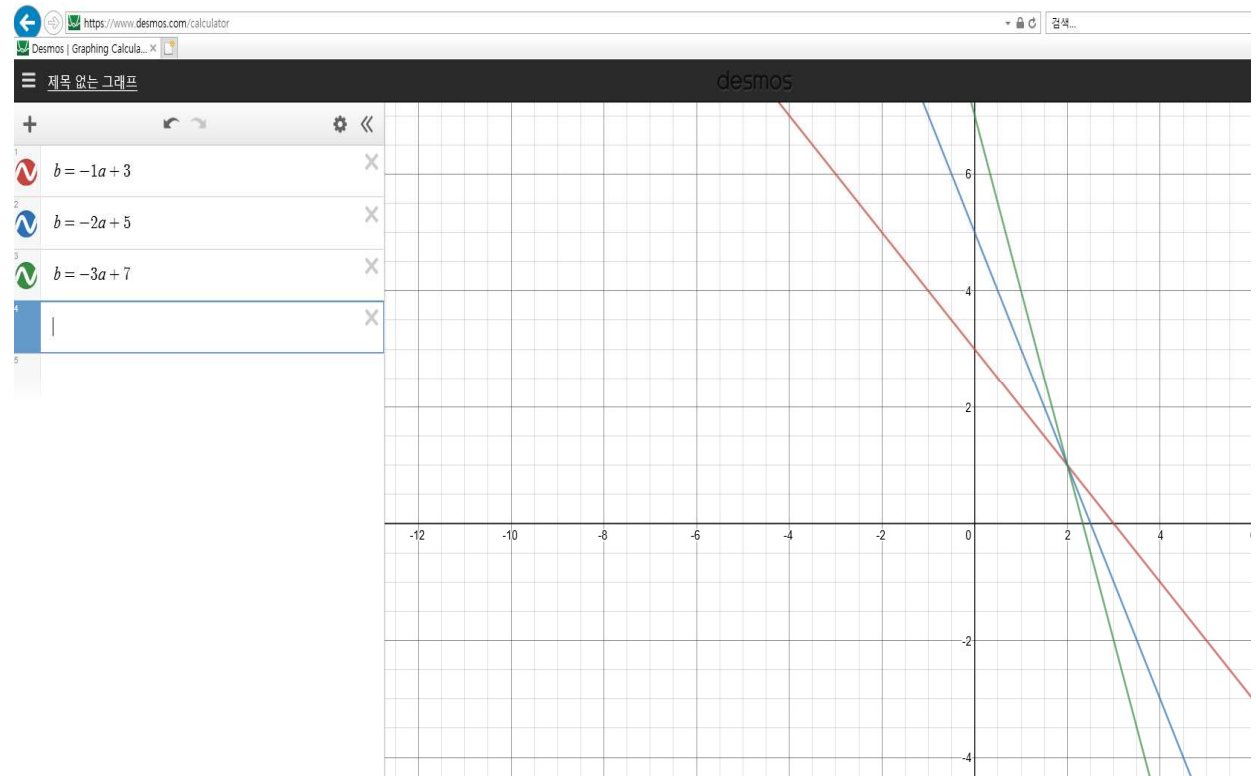
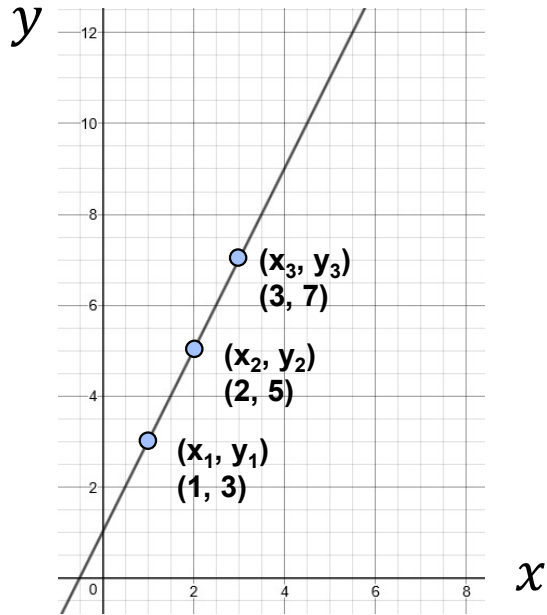
## ◆ Hough Transform

$$y = ax + b \text{ (e.g. } y = 2x + 1) \longrightarrow b = -xa + y$$

$$b = -1a + 3$$

$$b = -2a + 5$$

$$b = -3a + 7$$



## ◆ Hough Transform

$$y = ax + b \text{ (e.g. } y = 3\text{)}$$



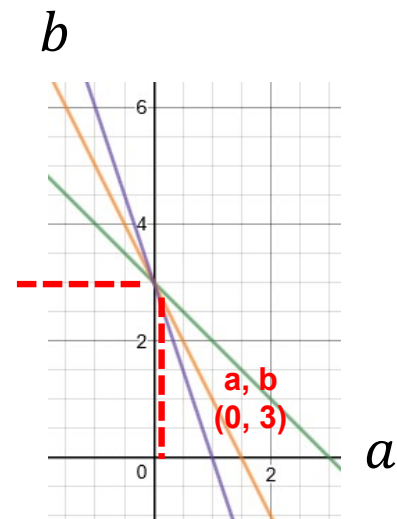
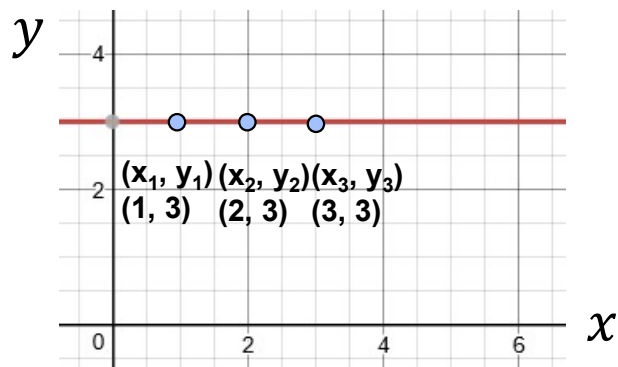
$$b = -xa + y$$

$$b = -1a + 3$$

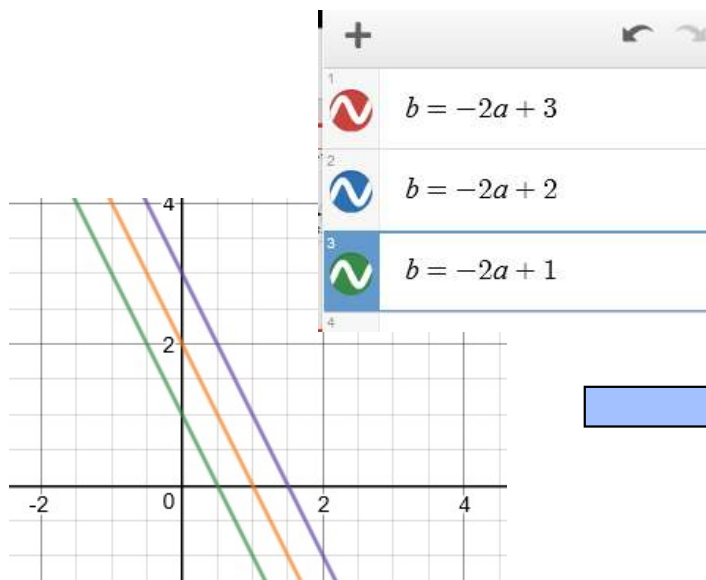
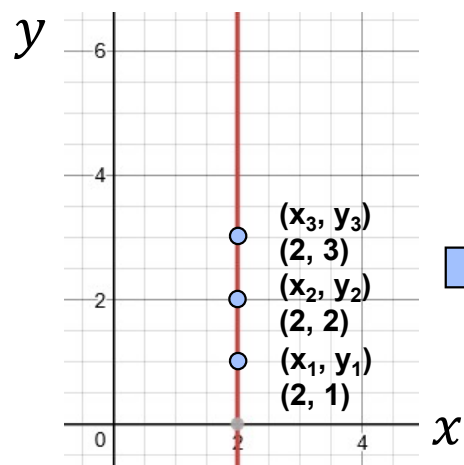
$$b = -2a + 3$$

$$b = -3a + 3$$

Horizontal line is OK



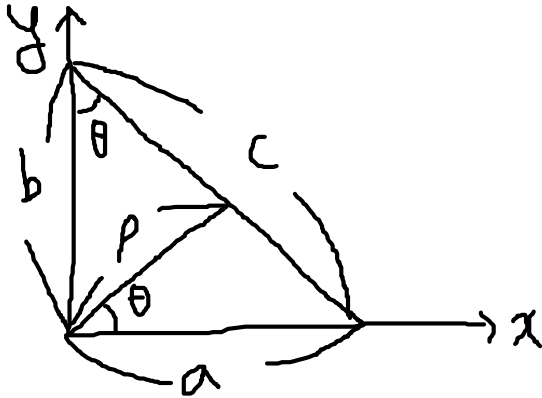
How about the Vertical Line?



$$\rho = x \cos \theta + y \sin \theta$$

## ◆ Hough Transform

$$\rho = x \cos \theta + y \sin \theta$$



$$y = -\frac{b}{a}x + b$$

$$\sin \theta = \frac{a}{c}$$

$$\cos \theta = \frac{b}{c}$$

$$\sin \theta = \frac{\rho}{b}$$

$$b = \frac{\rho}{\sin \theta}$$

$$-\frac{b}{a} = -\frac{\cos \theta \cdot c}{\sin \theta \cdot c} = -\frac{\cos \theta}{\sin \theta}$$

$$(x_3, y_3) \quad \rho = 2 \cdot \cos \theta + 3 \cdot \sin \theta$$

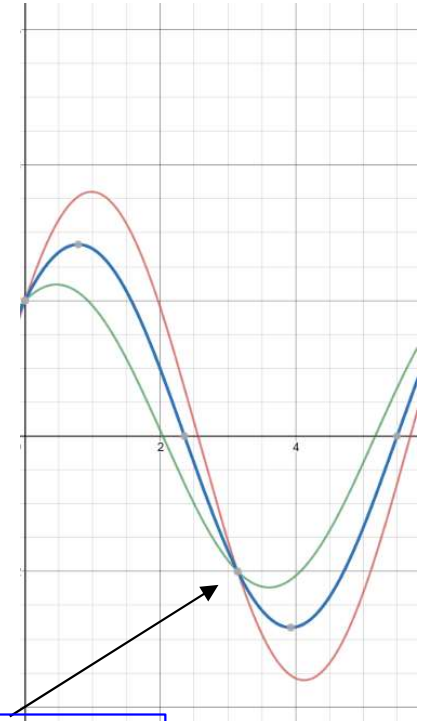
$$(x_2, y_2) \quad \rho = 2 \cdot \cos \theta + 2 \cdot \sin \theta$$

$$(x_1, y_1) \quad \rho = 2 \cdot \cos \theta + 1 \cdot \sin \theta$$

$$y = -\frac{\cos \theta}{\sin \theta} x + \frac{\rho}{\sin \theta}$$

$$\rho = \left( \frac{\cos \theta}{\sin \theta} x + y \right) \sin \theta$$

$$\rho = x \cos \theta + y \sin \theta$$



교점 발생

x절편과 y절편이 주어졌을 때 직선의 방정식

$$y = -\frac{b}{a}x + b$$



## ◆ Hough Transform

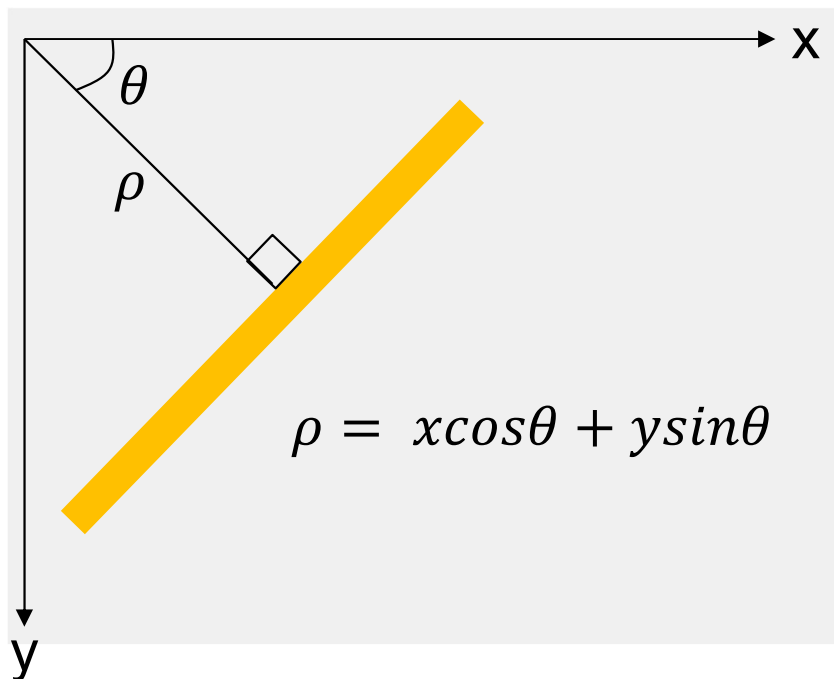
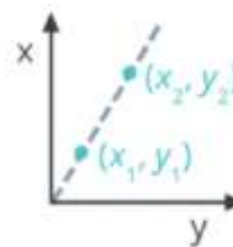
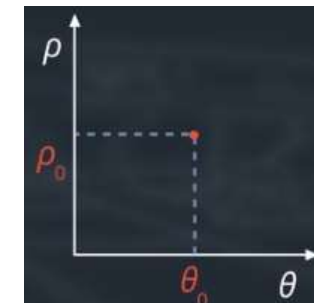
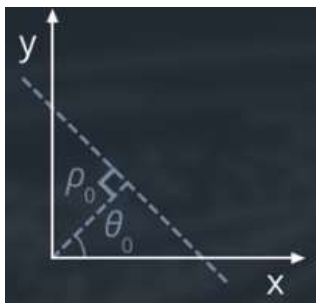
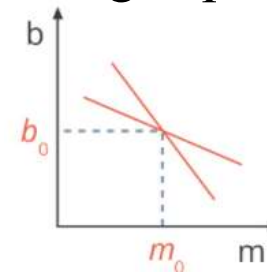


Image space



Hough space



```
cv2.HoughLinesP(image, rho, theta, threshold, minLineLength, maxLineGap)
```

image: input image (edge 영상)

rho: rho 값의 범위 (rho 값을 얼마큼 변경하면서 찾을 것인가)

theta: theta 값의 범위

threshold: 만나는 점의 개수 (많을수록 차선일 확률이 높음)

minLineLength: 직선의 최소 길이 (이 값보다 작으면, 찾고자하는 직선으로 간주 하지 않음)

maxLineGap: 찾은 직선들에서 직선끼리의 거리가 이 값 이상일 경우, 다른 직선으로 간주



## ◆ Hough Transform

```
import matplotlib.pyplot as plt
import matplotlib.image as mpimg
import numpy as np
import cv2

image = mpimg.imread('test_1.jpg')
gray = cv2.cvtColor(image, cv2.COLOR_RGB2GRAY)

kernel_size = 3
blur_gray = cv2.GaussianBlur(gray, (kernel_size, kernel_size), 0)

low_threshold = 50
high_threshold = 150
edges = cv2.Canny(blur_gray, low_threshold, high_threshold)

mask = np.zeros_like(edges)
ignore_mask_color = 255

imshape = image.shape
vertices = np.array([(0, imshape[0]), (450, 290), (490, 290), (imshape[1], imshape[0])], dtype=np.int32)
cv2.fillPoly(mask, vertices, ignore_mask_color)
masked_edges = cv2.bitwise_and(edges, mask)
```

## ◆ Hough Transform

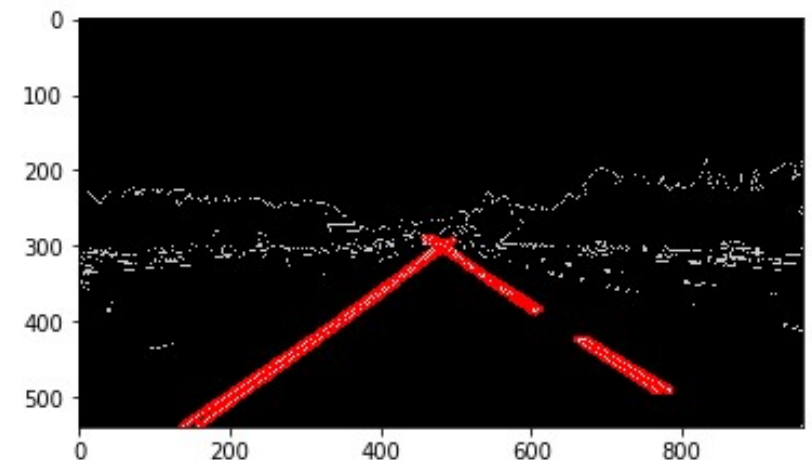
```
rho = 1
theta = np.pi/180
threshold = 1
min_line_length = 1
max_line_gap = 0
line_image = np.copy(image)*0

lines = cv2.HoughLinesP(masked_edges, rho, theta, threshold, np.array([]),
                        min_line_length, max_line_gap)

for line in lines:
    for x1,y1,x2,y2 in line:
        cv2.line(line_image,(x1,y1),(x2,y2),(255,0,0),10)

color_edges = np.dstack((edges, edges, edges))

lines_edges = cv2.addWeighted(color_edges, 0.8, line_image, 1, 0)
plt.imshow(lines_edges)
```



**Thank you & Good luck !**