Name – Vivek Onkarnath Rathi ID - 200256752 ECE 558 Project 02

```
a.
Solution
Code -
# -*- coding: utf-8 -*-
Created on Fri Oct 11 23:50:36 2019
Code works for asked all filters and images.
The outputs in the report are generated using this code
However, few examples with different filters are shown in the code
to reduce the code size for processing
uncommenting the python code can work in various desired ways
It only uses lena img, to use wolves img, change the imread function value.
@author: Vivek Rathi
import numpy as np
import cv2
import matplotlib.pyplot as plt
# convert float to uint8
def ftou8(img):
  img = img.astype(np.uint8)
  return img
# convert uint8 to float
def u8tof(img):
  img = img.astype(np.float32)
  return img
# spread intensities
def spread_linear(img,uplimit):
  s = np.copy(img)
  ma = img.max()
  mi = img.min()
  if len(img.shape) == 3:
    for i in range(img.shape[0]):
      for j in range(img.shape[1]):
         s[i,j,:] = ((uplimit - 1)/(ma - mi)) * (img[i,j,:] - mi)
    return (ftou8(s))
  else:
    for i in range(img.shape[0]):
      for j in range(img.shape[1]):
```

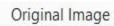
```
s[i,j] = ((uplimit - 1)/(ma - mi)) * (img[i,j] - mi)
    return (ftou8(s))
#padding function
def pad(img,typepad):
  rows = img.shape[0]
  cols = img.shape[1]
  if len(img.shape) == 3:
    imgpad = np.zeros((rows+2,cols+2,3), dtype = 'float')
  elif len(img.shape) == 2:
    imgpad = np.zeros((rows+2,cols+2), dtype = 'float')
  imgpad[1:rows+1,1:cols+1] = img
  rows = imgpad.shape[0]
  cols = imgpad.shape[1]
  if typepad == "zero":
    return imgpad
  elif typepad == "wrap":
    imgpad[:,0] = imgpad[:,cols-2]
    imgpad[:,cols-1] = imgpad[:,1]
    imgpad[0,:] = imgpad[rows-2,:]
    imgpad[rows-1,:] = imgpad[1,:]
    imgpad[0,0] = imgpad[rows-2,cols-2]
    imgpad[rows-1,0] = imgpad[1,cols-2]
    imgpad[0,cols-1] = imgpad[rows-2,1]
    imgpad[rows-1,cols-1] = imgpad[1,1]
    return imgpad
  elif typepad == "copyedge":
    imgpad[0,:] = imgpad[1,:]
    imgpad[rows-1,:] = imgpad[rows-2,:]
    imgpad[:,0] = imgpad[:,1]
    imgpad[:,cols-1] = imgpad[:,cols-2]
    imgpad[0,0] = imgpad[1,1]
    imgpad[rows-1,0] = imgpad[rows-2,1]
    imgpad[0,cols-1] = imgpad[1,cols-2]
    imgpad[rows-1,cols-1] = imgpad[rows-2,cols-2]
    return imgpad
  elif typepad == "reflect":
    imgpad[0,:] = imgpad[2,:]
    imgpad[rows-1,:] = imgpad[rows-3,:]
    imgpad[:,0] = imgpad[:,2]
    imgpad[:,cols-1] = imgpad[:,cols-3]
    imgpad[0,0] = imgpad[2,2]
    imgpad[rows-1,0] = imgpad[rows-3,2]
    imgpad[0,cols-1] = imgpad[2,cols-3]
    imgpad[rows-1,cols-1] = imgpad[rows-3,cols-3]
    return imgpad
```

```
p = 0 -> zero padding
p = 1 -> wrap padding
p = 2 -> copyedge padding
p = 3 -> reflect padding
def conv(img,k,p):
  imgcopy = img.astype(np.float32)
  if p == 0:
    padimg = pad(img,"zero")
  elif p == 1:
    padimg = pad(img,"wrap")
  elif p == 2:
    padimg = pad(img,"copyedge")
  elif p == 3:
    padimg = pad(img,"reflect")
  if len(img.shape) == 3:
    B = np.zeros((k.shape[0],k.shape[1],3))
    r = padimg.shape[0]
    c = padimg.shape[1]
    if k.shape[0] == k.shape[1] == 3:
       for i in range(r-2):
         for j in range(c-2):
           B[:,:,0] = np.multiply(k,padimg[i:i+3,j:j+3,0])
           B[:,:,1] = np.multiply(k,padimg[i:i+3,j:j+3,1])
           B[:,:,2] = np.multiply(k,padimg[i:i+3,j:j+3,2])
           imgcopy[i,j,0] = np.sum(B[:,:,0])
           imgcopy[i,j,1] = np.sum(B[:,:,1])
           imgcopy[i,j,2] = np.sum(B[:,:,2])
       return imgcopy
    elif k.shape[0] == k.shape[1] == 2:
       if k.all == k rx.all():
         for i in range(r-2):
           for j in range(c-2):
              B[:,:,0] = np.multiply(k,padimg[i+1:i+3,j:j+2,0])
              B[:,:,1] = np.multiply(k,padimg[i+1:i+3,j:j+2,1])
              B[:,:,2] = np.multiply(k,padimg[i+1:i+3,j:j+2,2])
             imgcopy[i,j,0] = np.sum(B[:,:,0])
             imgcopy[i,j,1] = np.sum(B[:,:,1])
             imgcopy[i,j,2] = np.sum(B[:,:,2])
         return imgcopy
       else:
         for i in range(r-2):
           for j in range(c-2):
              B[:,:,0] = np.multiply(k,padimg[i+1:i+3,j+1:j+3,0])
              B[:,:,1] = np.multiply(k,padimg[i+1:i+3,j+1:j+3,1])
              B[:,:,2] = np.multiply(k,padimg[i+1:i+3,j+1:j+3,2])
             imgcopy[i,j,0] = np.sum(B[:,:,0])
              imgcopy[i,j,1] = np.sum(B[:,:,1])
```

```
imgcopy[i,j,2] = np.sum(B[:,:,2])
       return imgcopy
  elif k.shape[0] < k.shape[1]:
    for i in range(r-2):
       for j in range(c-2):
         B[:,:,0] = np.multiply(k,padimg[i+1:i+2,j+1:j+3,0])
         B[:,:,1] = np.multiply(k,padimg[i+1:i+2,j+1:j+3,1])
         B[:,:,2] = np.multiply(k,padimg[i+1:i+2,j+1:j+3,2])
         imgcopy[i,j,0] = np.sum(B[:,:,0])
         imgcopy[i,j,1] = np.sum(B[:,:,1])
         imgcopy[i,j,2] = np.sum(B[:,:,2])
    return imgcopy
  elif k.shape[0] > k.shape[1]:
    for i in range(r-2):
       for j in range(c-2):
         B[:,:,0] = np.multiply(k,padimg[i+1:i+3,j+1:j+2,0])
         B[:,:,1] = np.multiply(k,padimg[i+1:i+3,j+1:j+2,1])
         B[:,:,2] = np.multiply(k,padimg[i+1:i+3,j+1:j+2,2])
         imgcopy[i,j,0] = np.sum(B[:,:,0])
         imgcopy[i,j,1] = np.sum(B[:,:,1])
         imgcopy[i,j,2] = np.sum(B[:,:,2])
    return imgcopy
elif len(img.shape) == 2:
  B = np.zeros((k.shape[0],k.shape[1]))
  r = padimg.shape[0]
  c = padimg.shape[1]
  if k.shape[0] == k.shape[1] == 3:
    for i in range(r-2):
      for j in range(c-2):
         B = np.multiply(k,padimg[i:i+3,j:j+3])
         imgcopy[i,j] = np.sum(B)
    return imgcopy
  elif k.shape[0] == k.shape[1] == 2:
    if k.all() == k_rx.all():
      for i in range(r-2):
         for j in range(c-2):
            B = np.multiply(k,padimg[i+1:i+3,j:j+2])
           imgcopy[i,j] = np.sum(B)
       return imgcopy
    else:
       for i in range(r-2):
         for j in range(c-2):
            B = np.multiply(k,padimg[i+1:i+3,j+1:j+3])
           imgcopy[i,j] = np.sum(B)
       return imgcopy
  elif k.shape[0] < k.shape[1]:
    for i in range(r-2):
```

```
for j in range(c-2):
           B = np.multiply(k,padimg[i+1:i+2,j+1:j+3])
           imgcopy[i,j] = np.sum(B)
       return imgcopy
    elif k.shape[0] > k.shape[1]:
       for i in range(r-2):
         for j in range(c-2):
           B = np.multiply(k,padimg[i+1:i+3,j+1:j+2])
           imgcopy[i,j] = np.sum(B)
       return imgcopy
Kernels
k_box = (1/9) * np.ones((3,3))
k x1 = np.matrix(([-1,1]))
k_y1 = np.matrix(([-1],[1]))
k_px = np.matrix(([-1,0,1],[-1,0,1],[-1,0,1]))
k_py = np.matrix(([1,1,1],[0,0,0],[-1,-1,-1]))
k_sx = np.matrix(([-1,0,1],[-2,0,2],[-1,0,1]))
k_sy = np.matrix(([1,2,1],[0,0,0],[-1,-2,-1]))
k rx = np.matrix(([0,1],[-1,0]))
k_ry = np.matrix(([1,0],[0,-1]))
# Load image
lenaimg = cv2.imread('lena.png',0)
#lenaimg = cv2.imread('lena.png',1)
# Apply Convolution
# Box Filter- Zero Padding
c11 = conv(lenaimg,k_box,0)
s11 = ftou8(c11)
# Fisrt Order X Derivative- Wrap Padding
d11 = conv(lenaimg,k_x1,1)
s12 = spread_linear(d11,256)
# Prewitt X Derivative - Copyedge Padding
e11 = conv(lenaimg,k_px,2)
s13 = spread linear(e11,256)
# Sobel Y Derivative - Reflect Padding
f11 = conv(lenaimg,k sy,3)
s14 = spread linear(f11,256)
# Roberts Y Derivative - Copyedge Padding
g11 = conv(lenaimg,k ry,2)
s15 = spread_linear(g11,256)
```

```
plt.subplot(221)
#plt.imshow(cv2.cvtColor(s11, cv2.COLOR_BGR2RGB))
plt.imshow(s11, cmap = 'gray')
plt.xticks([]), plt.yticks([])
plt.title('Box Filter - Pad 0')
plt.subplot(222)
#plt.imshow(cv2.cvtColor(s12, cv2.COLOR_BGR2RGB))
plt.imshow(s12, cmap = 'gray')
plt.xticks([]), plt.yticks([])
plt.title('X Derivative - Wrap')
plt.subplot(223)
plt.imshow(s13, cmap = 'gray')
#plt.imshow(cv2.cvtColor(s13, cv2.COLOR_BGR2RGB))
plt.xticks([]), plt.yticks([])
plt.title('Prewitt X - Copy')
plt.subplot(224)
#plt.imshow(cv2.cvtColor(s14, cv2.COLOR_BGR2RGB))
plt.imshow(s14, cmap = 'gray')
plt.xticks([]), plt.yticks([])
plt.title('Sobel Y - Reflect')
plt.show()
cv2.namedWindow('Original Image', cv2.WINDOW_NORMAL)
cv2.imshow('Original Image',lenaimg)
cv2.waitKey(0)
cv2.destroyAllWindows()
#cv2.namedWindow('Rx Derivative-Pad 0', cv2.WINDOW_NORMAL)
#cv2.imshow('Rx Derivative-Pad 0',c11)
#cv2.namedWindow('Rx Derivative-Pad wrap', cv2.WINDOW_NORMAL)
#cv2.imshow('Rx Derivative-Pad wrap',d11)
#cv2.namedWindow('Rx Derivative-Pad copy', cv2.WINDOW NORMAL)
#cv2.imshow('Rx Derivative-Pad copy',e11)
#cv2.namedWindow('Rx Derivative-Pad reflect', cv2.WINDOW_NORMAL)
#cv2.imshow('Rx Derivative-Pad reflect',f11)
#cv2.waitKey(0)
#cv2.destroyAllWindows()
```





Box - Pad 0



Box - Wrap



Box - Copy



Box - Reflect

















Px - Pad 0







Py - Pad 0







Rx - Pad 0



Rx - Wrap



Rx - Copy



Rx - Reflect



Ry - Pad 0















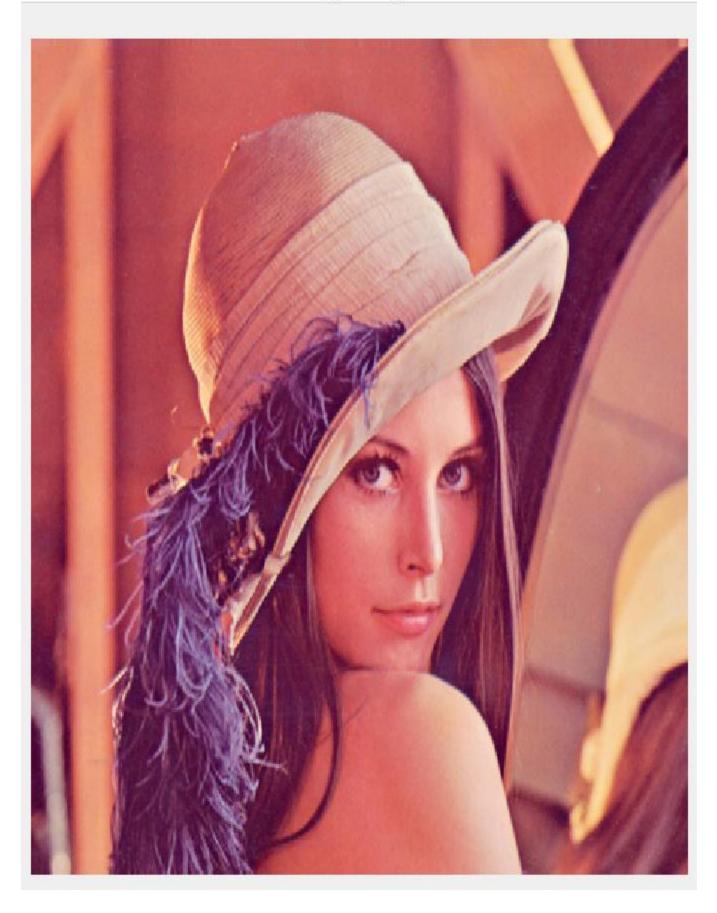
Sy - Pad 0







Original Image





Box Filter - Pad 0



Box Filter - Wrap

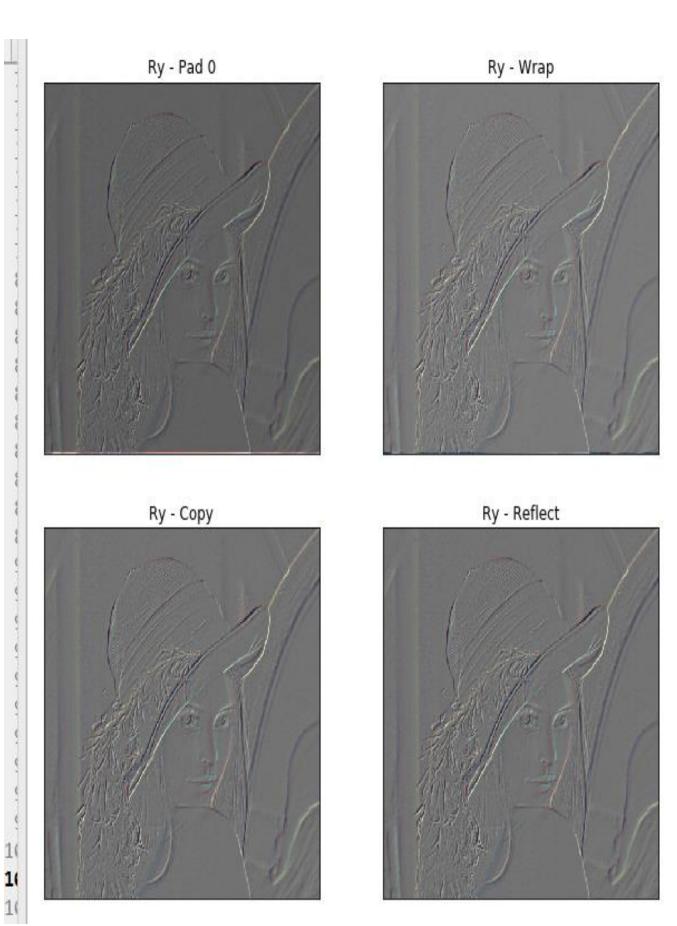


Box Filter - Copy

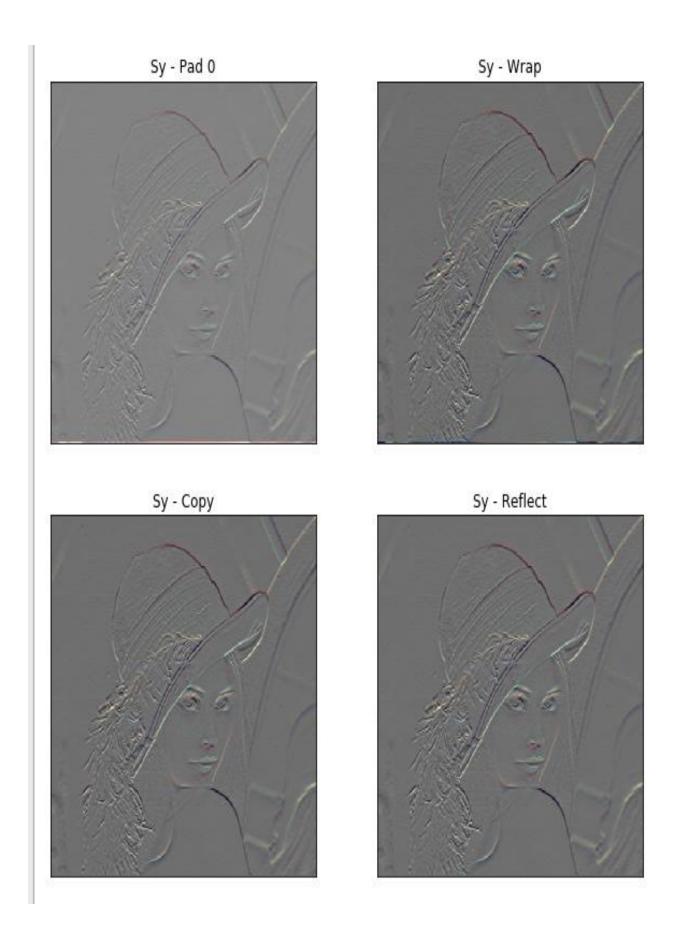


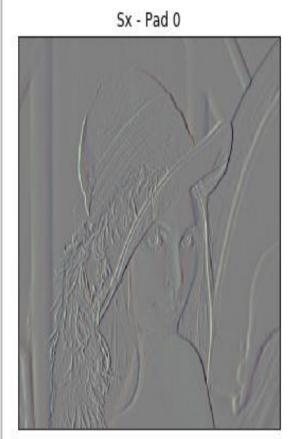
Box Filter - Reflect









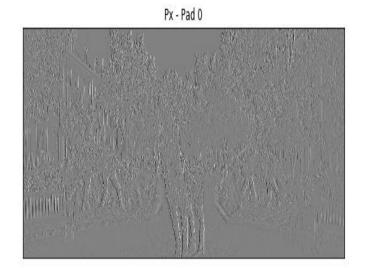


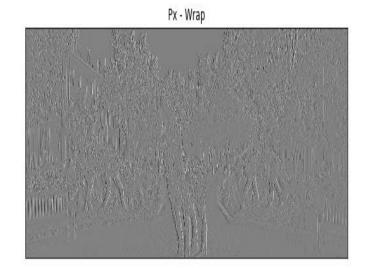


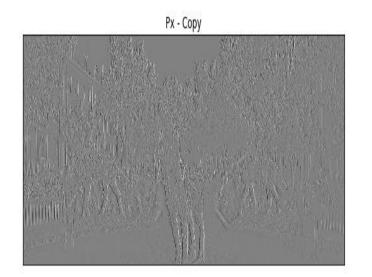


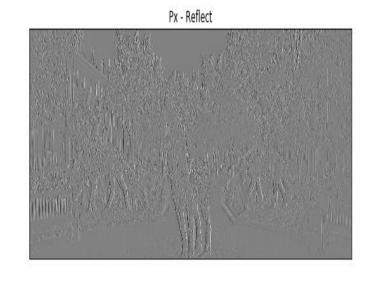


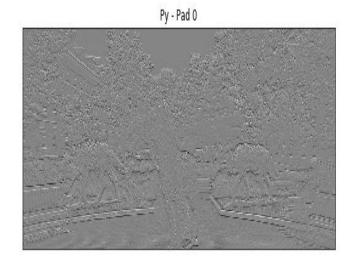


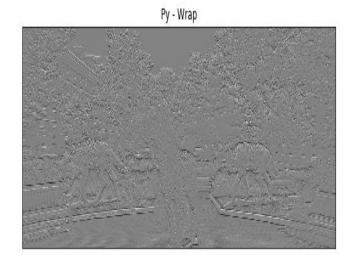


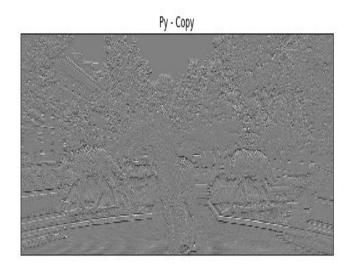


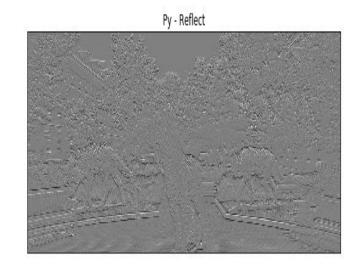


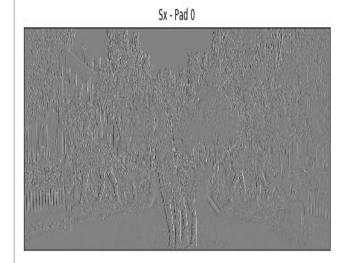


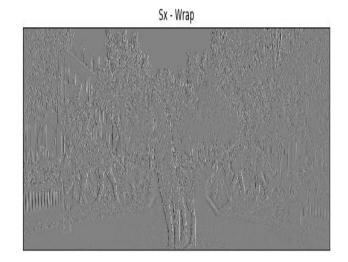


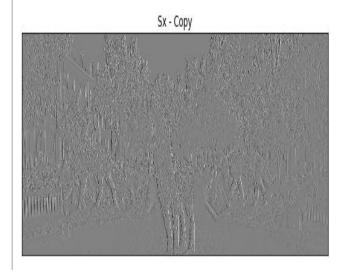


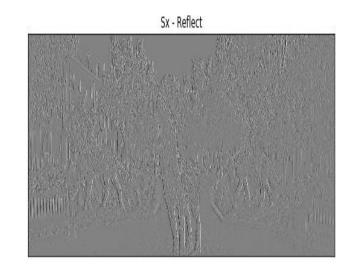




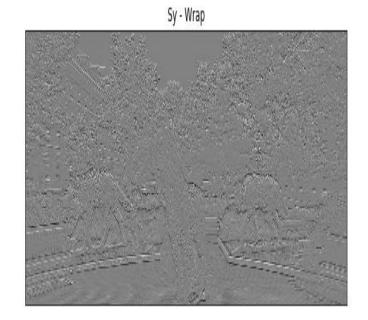


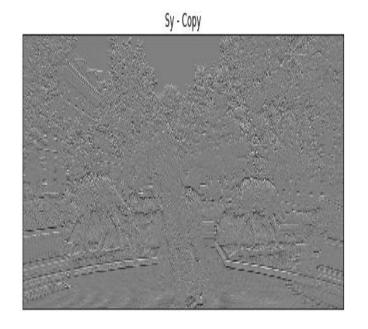


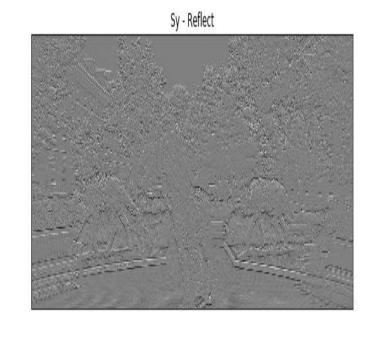




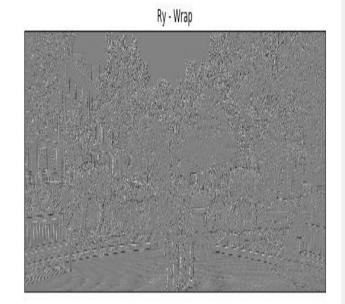
Sy - Pad 0



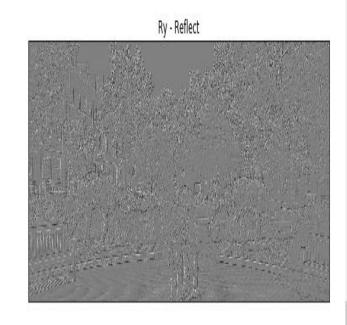




Ry - Pad 0















```
b.
Solution
Code -
# -*- coding: utf-8 -*-
Created on Fri Oct 18 18:40:37 2019
@author: Vivek Rathi
111111
import numpy as np
import cv2
import matplotlib.pyplot as plt
#padding function
def pad(img,typepad):
  rows = img.shape[0]
  cols = img.shape[1]
  if len(img.shape) == 3:
    imgpad = np.zeros((rows+2,cols+2,3), dtype = 'float')
  elif len(img.shape) == 2:
    imgpad = np.zeros((rows+2,cols+2), dtype = 'float')
  imgpad[1:rows+1,1:cols+1] = img
  rows = imgpad.shape[0]
  cols = imgpad.shape[1]
  if typepad == "zero":
    return imgpad
  elif typepad == "wrap":
    imgpad[:,0] = imgpad[:,cols-2]
    imgpad[:,cols-1] = imgpad[:,1]
    imgpad[0,:] = imgpad[rows-2,:]
    imgpad[rows-1,:] = imgpad[1,:]
    imgpad[0,0] = imgpad[rows-2,cols-2]
    imgpad[rows-1,0] = imgpad[1,cols-2]
    imgpad[0,cols-1] = imgpad[rows-2,1]
    imgpad[rows-1,cols-1] = imgpad[1,1]
    return imgpad
  elif typepad == "copyedge":
    imgpad[0,:] = imgpad[1,:]
    imgpad[rows-1,:] = imgpad[rows-2,:]
    imgpad[:,0] = imgpad[:,1]
    imgpad[:,cols-1] = imgpad[:,cols-2]
    imgpad[0,0] = imgpad[1,1]
    imgpad[rows-1,0] = imgpad[rows-2,1]
    imgpad[0,cols-1] = imgpad[1,cols-2]
    imgpad[rows-1,cols-1] = imgpad[rows-2,cols-2]
    return imgpad
  elif typepad == "reflect":
```

```
imgpad[0,:] = imgpad[2,:]
    imgpad[rows-1,:] = imgpad[rows-3,:]
    imgpad[:,0] = imgpad[:,2]
    imgpad[:,cols-1] = imgpad[:,cols-3]
    imgpad[0,0] = imgpad[2,2]
    imgpad[rows-1,0] = imgpad[rows-3,2]
    imgpad[0,cols-1] = imgpad[2,cols-3]
    imgpad[rows-1,cols-1] = imgpad[rows-3,cols-3]
    return imgpad
# convolution function
def conv(img,k,p):
  imgcopy = img.astype(np.float32)
  if p == 0:
    padimg = pad(img,"zero")
  elif p == 1:
    padimg = pad(img,"wrap")
  elif p == 2:
    padimg = pad(img,"copyedge")
  elif p == 3:
    padimg = pad(img,"reflect")
  if len(img.shape) == 3:
    B = np.zeros((k.shape[0],k.shape[1],3))
    r = padimg.shape[0]
    c = padimg.shape[1]
    if k.shape[0] == k.shape[1] == 3:
       for i in range(r-2):
         for j in range(c-2):
           B[:,:,0] = np.multiply(k,padimg[i:i+3,j:j+3,0])
           B[:,:,1] = np.multiply(k,padimg[i:i+3,j:j+3,1])
           B[:,:,2] = np.multiply(k,padimg[i:i+3,j:j+3,2])
           imgcopy[i,j,0] = np.sum(B[:,:,0])
           imgcopy[i,j,1] = np.sum(B[:,:,1])
           imgcopy[i,j,2] = np.sum(B[:,:,2])
       return imgcopy
    elif k.shape[0] == k.shape[1] == 2:
       if k.all == k rx.all():
         for i in range(r-2):
           for j in range(c-2):
              B[:,:,0] = np.multiply(k,padimg[i+1:i+3,j:j+2,0])
              B[:,:,1] = np.multiply(k,padimg[i+1:i+3,j:j+2,1])
              B[:,:,2] = np.multiply(k,padimg[i+1:i+3,j:j+2,2])
             imgcopy[i,j,0] = np.sum(B[:,:,0])
             imgcopy[i,j,1] = np.sum(B[:,:,1])
             imgcopy[i,j,2] = np.sum(B[:,:,2])
         return imgcopy
       else:
         for i in range(r-2):
```

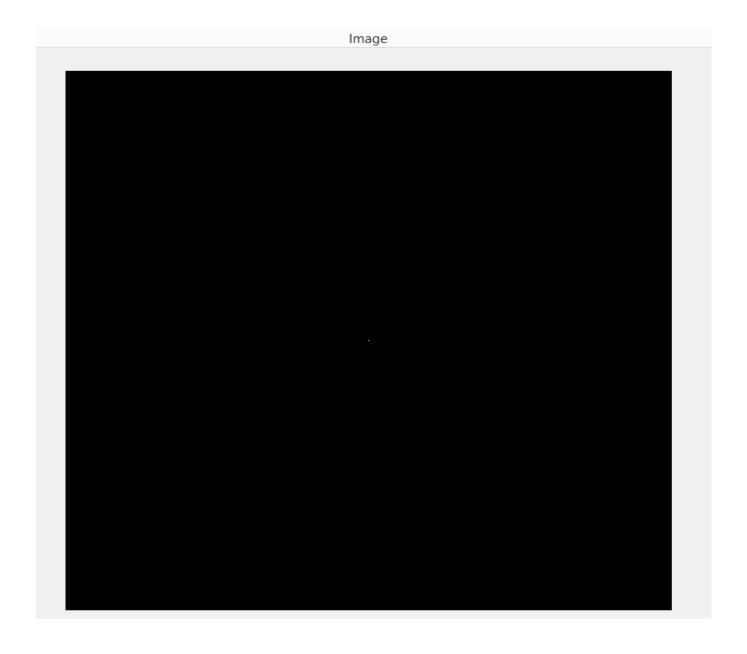
```
for j in range(c-2):
            B[:,:,0] = np.multiply(k,padimg[i+1:i+3,j+1:j+3,0])
            B[:,:,1] = np.multiply(k,padimg[i+1:i+3,j+1:j+3,1])
            B[:,:,2] = np.multiply(k,padimg[i+1:i+3,j+1:j+3,2])
           imgcopy[i,j,0] = np.sum(B[:,:,0])
           imgcopy[i,j,1] = np.sum(B[:,:,1])
           imgcopy[i,j,2] = np.sum(B[:,:,2])
       return imgcopy
  elif k.shape[0] < k.shape[1]:
    for i in range(r-2):
       for j in range(c-2):
         B[:,:,0] = np.multiply(k,padimg[i+1:i+2,j+1:j+3,0])
         B[:,:,1] = np.multiply(k,padimg[i+1:i+2,j+1:j+3,1])
         B[:,:,2] = np.multiply(k,padimg[i+1:i+2,j+1:j+3,2])
         imgcopy[i,j,0] = np.sum(B[:,:,0])
         imgcopy[i,j,1] = np.sum(B[:,:,1])
         imgcopy[i,j,2] = np.sum(B[:,:,2])
    return imgcopy
  elif k.shape[0] > k.shape[1]:
    for i in range(r-2):
       for j in range(c-2):
         B[:,:,0] = np.multiply(k,padimg[i+1:i+3,j+1:j+2,0])
         B[:,:,1] = np.multiply(k,padimg[i+1:i+3,j+1:j+2,1])
         B[:,:,2] = np.multiply(k,padimg[i+1:i+3,j+1:j+2,2])
         imgcopy[i,j,0] = np.sum(B[:,:,0])
         imgcopy[i,j,1] = np.sum(B[:,:,1])
         imgcopy[i,j,2] = np.sum(B[:,:,2])
    return imgcopy
elif len(img.shape) == 2:
  B = np.zeros((k.shape[0],k.shape[1]))
  r = padimg.shape[0]
  c = padimg.shape[1]
  if k.shape[0] == k.shape[1] == 3:
    for i in range(r-2):
       for j in range(c-2):
         B = np.multiply(k,padimg[i:i+3,j:j+3])
         imgcopy[i,j] = np.sum(B)
    return imgcopy
  elif k.shape[0] == k.shape[1] == 2:
    if k.all() == k rx.all():
      for i in range(r-2):
         for j in range(c-2):
            B = np.multiply(k,padimg[i+1:i+3,j:j+2])
           imgcopy[i,j] = np.sum(B)
       return imgcopy
    else:
       for i in range(r-2):
         for j in range(c-2):
```

```
B = np.multiply(k,padimg[i+1:i+3,j+1:j+3])
             imgcopy[i,j] = np.sum(B)
         return imgcopy
    elif k.shape[0] < k.shape[1]:
      for i in range(r-2):
        for j in range(c-2):
           B = np.multiply(k,padimg[i+1:i+2,j+1:j+3])
           imgcopy[i,j] = np.sum(B)
      return imgcopy
    elif k.shape[0] > k.shape[1]:
      for i in range(r-2):
        for j in range(c-2):
           B = np.multiply(k,padimg[i+1:i+3,j+1:j+2])
           imgcopy[i,j] = np.sum(B)
      return imgcopy
Kernels
k box = (1/9) * np.ones((3,3))
k_x1 = np.matrix(([-1,1]))
k_y1 = np.matrix(([-1],[1]))
k_px = np.matrix(([-1,0,1],[-1,0,1],[-1,0,1]))
k_py = np.matrix(([1,1,1],[0,0,0],[-1,-1,-1]))
k_sx = np.matrix(([-1,0,1],[-2,0,2],[-1,0,1]))
k_sy = np.matrix(([1,2,1],[0,0,0],[-1,-2,-1]))
k_rx = np.matrix(([0,1],[-1,0]))
k_ry = np.matrix(([1,0],[0,-1]))
#create image
img = np.zeros((1024,1024))
img[511,511] = 1
imgc = conv(img,k_box,0)
cv2.namedWindow('Image', cv2.WINDOW NORMAL)
cv2.imshow('Image',img)
cv2.namedWindow('Convolved Image', cv2.WINDOW NORMAL)
cv2.imshow('Convolved Image',imgc)
cv2.waitKey(0)
cv2.destroyAllWindows()
```

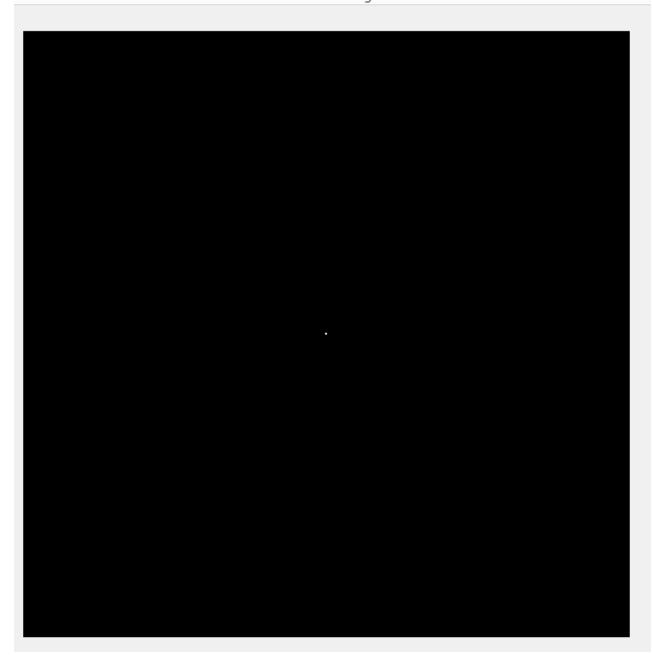
Output-

The filter is indeed performing convolution. It is clearly seen in the output image, where the pixel values i.e. 8-D neighbors of (511,511) pixel are changed from 1 to 0.111.

In convolution, each pixel value is changed as per the filter and its neighbors. It is evident from the snap below that, all 9 pixels including (511,511) are changed as per the filter, which proves it is performing convolution.



Convolved Image



Pixel Values adjacent to (511,511)

```
Solution-
Code
# -*- coding: utf-8 -*-
Created on Sun Oct 13 21:05:29 2019
@author: Vivek Rathi
111111
import numpy as np
import cv2
import matplotlib.pyplot as plt
from matplotlib.pyplot import figure
DFT2 - calculate 2d fft of i/p
def DFT2(img):
  if (img.dtype != complex):
    fimg = img.astype(np.float)
  else:
    fimg = np.copy(img)
  fimg = fimg / fimg.max()
  fftx = np.fft.fft(fimg,axis=0)
  fftxy = np.fft.fft(fftx,axis=1)
  return fftxy
getimg - gives o/p as uint8
def getimg(g,img):
  v = abs(g) * img.max()
  v = np.round(v).astype(np.uint8)
  return v
shift - shifts fourier spectrum to the centre, i.e. low frequencies
def shift(img):
  h = img.astype(np.float)
  for i in range(img.shape[0]):
    for j in range(img.shape[1]):
      h[i,j] = img[i,j]* (-1)**((i+j))
  return h
IDFT2 - inv fft using fft
def IDFT2(fft2d):
```

```
f_conj = np.conj(fft2d)
  ffxy = DFT2(f_conj)
  ffxy = ffxy / (fft2d.shape[0]*fft2d.shape[1])
  ffxy = ffxy / (abs(ffxy)).max()
  #im = np.conj(ffxy)
  im = np.conj(ffxy)
  return im
# read image
limg = cv2.imread('wolves.png',0)
lshift = shift(limg)
fl = DFT2(Ishift)
#wimg = cv2.imread('wolves.png',0)
#wshift = shift(wimg)
#fw = DFT2(Ishift)
# magnitude and phase spectrum
ms_l = np.log(1+np.abs(fl))
ps_l = np.angle(fl)
# IDFT
gl = IDFT2(fl)
img_gl = getimg(gl,limg)
# difference
d_l = limg - img_gl
# Plots
plt.figure(figsize=(10,10))
plt.subplot(221)
plt.imshow(limg, cmap = 'gray')
plt.xticks([]), plt.yticks([])
plt.title('Input Image')
plt.subplot(222)
plt.imshow(ms_l, cmap = 'gray')
plt.xticks([]), plt.yticks([])
plt.title('Magnitude Spectrum')
plt.subplot(223)
plt.imshow(ps_l, cmap = 'gray')
plt.xticks([]), plt.yticks([])
plt.title('Phase Spectrum')
plt.subplot(224)
plt.imshow(d_l, cmap = 'gray')
```

plt.xticks([]), plt.yticks([])
plt.title('Difference')
plt.show()

Output

1. Lena Image

