# ECE 637: Lab 2

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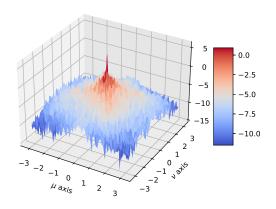
## Section 1 Report

1. Gray scale image img04g.tif

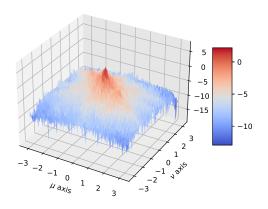


Figure 1: Input gray scale image

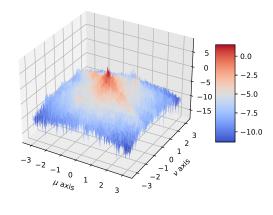
## 2. Power Spectral density plots:



## (a) PSD for 64x64



(b) PSD for 128x128



(c) PSD for 256x256

### 3. Improved PSD using BetterSpecAnal(x) function:

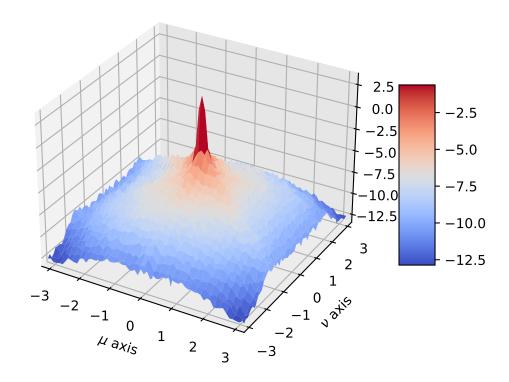


Figure 3: improved PSD for img04g.tif

4. For python code of BetterSpecAnal(x) function refer to Listing 1 at page 8.

### Section 2 Report

1. The image 255 \* (x + 0.5):

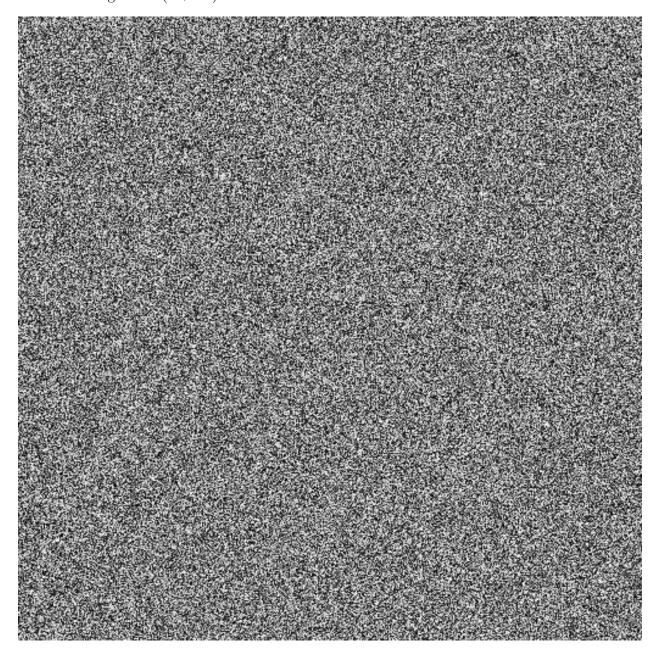


Figure 4: random gray scale image generated

We need to find the difference equation for the given transfer function:

$$\begin{split} H(z_1,z_2) &= \frac{Y(z_1,z_2)}{X(z_1,z_2)} = \frac{3}{1-0.99z_1^{-1}-0.99z_2^{-1}+0.981z_1^{-1}z_2^{-1}} \\ &\Rightarrow Y(z_1,z_2) = 3X(z_1,z_2) + 0.99(z_1^{-1}+z_2^{-1})Y(z_1,z_2) - 0.981z_1^{-1}z_2^{-1}Y(z_1,z_2) \\ &\qquad \qquad \text{Therefore the difference equation is given by:} \\ &y(m,n) = 3x(m,n) + 0.99(y(m-1,n) + y(m,n-1)) - 0.981y(m-1,n-1) \end{split}$$

## 2. The image y + 127:

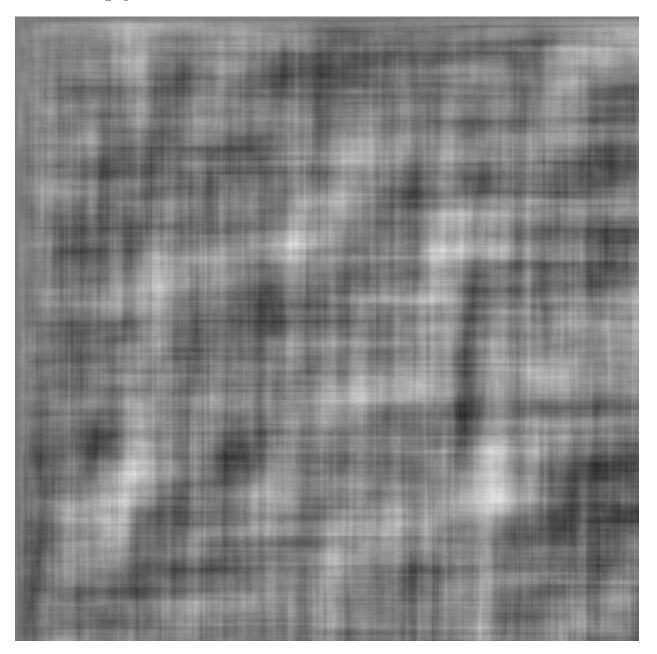


Figure 5: IIR Filtered image

# 3. Mesh plot of log $S_y(e^{j\mu}, e^{j\nu})$ :

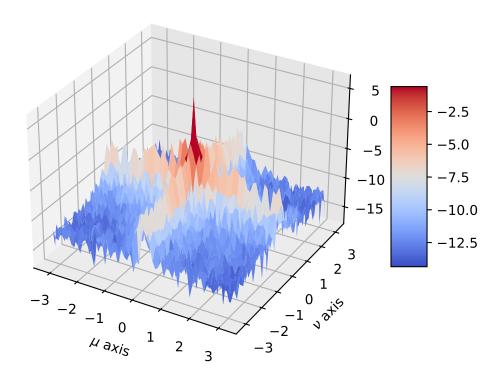


Figure 6: Mesh plot of PSD of y

## 4. Mesh plot of log of estimated PSD of y using BetterSpecAnal(y):

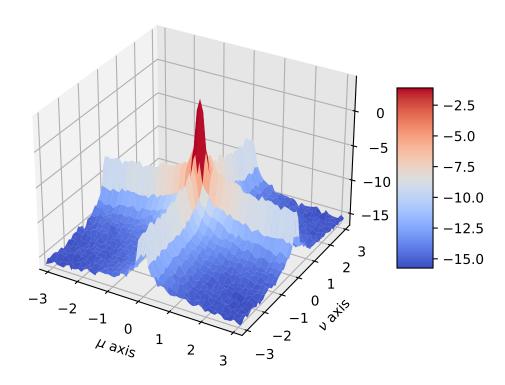


Figure 7: Mesh plot of PSD of y using BetterSpecAnal(x)

#### Source Code

Listing 1: Python function for BetterSpecAnal

```
def BetterSpecAnal(x,base_name):
 1
 2
        block_size=64
 3
        h, w = x.shape
 4
        cx=w//2; cy=h//2
        or_x = cx - 5*(block_size//2)
 5
 6
        or_y = cy - 5*(block_size//2)
 7
        windows = []
        for i in range (5):
 8
            for j in range (5):
 9
10
                 ul_x = or_x + i * block_size
                 ul_y = or_y + j * block_size
11
                 windows.append(x[ul_y:ul_y+block_size,ul_x:ul_x+block_size])
12
       W = np.hamming(block_size)
13
14
       W = np.outer(W,W)
15
        #multiply 2D hamming window
        windows = [w*W for w in windows]
16
17
        #compute squred DFT magnitude
        Z = [(1/(block_size**2)*np.abs(np.fft.fft2(w))**2)  for w in windows]
18
        Z = [np.fft.fftshift(z) for z in Z]
19
20
        Zabs = [np.log(z) \text{ for } z \text{ in } Z]
21
        #compute average
22
        av = np.zeros((block_size, block_size))
23
        for z in Zabs: av+=z
24
        av/=25
25
26
        # Plot the result using a 3-D mesh plot and label the x and y axises properly.
27
        fig = plt.figure()
28
        ax = fig.add_subplot(111, projection='3d')
29
        a = b = np.linspace(-np.pi, np.pi, num = block_size)
30
        X, Y = np.meshgrid(a, b)
31
        surf = ax.plot_surface(X, Y, av, cmap=plt.cm.coolwarm)
32
33
        ax.set_xlim(-1*np.pi,1*np.pi)
        ax.set_ylim(-1*np.pi,1*np.pi)
34
35
        ax.autoscale (enable=True, axis='z', tight=True)
        ax.set_xlabel('\$\mu\$ axis')
36
37
        ax.set_ylabel('\$\\nu\$ axis')
38
        ax.set_zlabel('Z Label')
39
40
        fig.colorbar(surf, shrink=0.5, aspect=5)
41
        plt.savefig('BetterSpecAnal_'+base_name+'.eps',format='eps')
```

#### **Appendix**

Listing 2: Complete python code for computing PSD

```
1 #!/usr/bin/env python3
2 # -*- coding: utf-8 -*-
3 """
4 @author: rahul
5 course: ECE637-DIP-I
6 lab2- 2D Random Process
7 """
```

```
8
                                        # Numpy is a library support computation of large
9
   import numpy as np
       , multi-dimensional arrays and matrices.
10
                                        # Python Imaging Library (abbreviated as PIL) is
   from PIL import Image
       a free and open-source additional library for the Python programming language
       that adds support for opening, manipulating, and saving many different image
       file formats.
   import matplotlib.pyplot as plt
                                     # Matplotlib is a plotting library for the Python
11
        programming language.
12
   import sys, os
13
14
   def SpecAnal(x,cx,cy,block_size,base_name):
15
16
        i = cx
        j = cy
17
       N = block_size
18
19
20
       z = x[i:N+i, j:N+j]
21
22
       # Compute the power spectrum for the NxN region.
23
       Z = (1/N**2)*np.abs(np.fft.fft2(z))**2
24
25
       # Use fftshift to move the zero frequencies to the center of the plot.
26
       Z = np. fft. fftshift(Z)
27
28
       # Compute the logarithm of the Power Spectrum.
29
        Zabs = np.log(Z)
30
31
       # Plot the result using a 3-D mesh plot and label the x and y axises properly.
32
        fig = plt.figure()
        ax = fig.add_subplot(111, projection='3d')
33
34
        a = b = np. linspace(-np.pi, np.pi, num = N)
       X, Y = np.meshgrid(a, b)
35
36
        surf = ax.plot_surface(X, Y, Zabs, cmap=plt.cm.coolwarm)
37
38
        ax.set_xlabel('$\mu$ axis')
39
        ax.set_ylabel('$\\nu$ axis')
40
41
        ax.set_zlabel('Z Label')
42
43
        fig.colorbar(surf, shrink=0.5, aspect=5)
44
        plt.savefig('SpecAnal_'+base_name+'_'+str(block_size)+'.eps',format='eps')
45
46
47
   def BetterSpecAnal(x,base_name):
        block_size=64
48
49
       h, w = x.shape
        cx=w//2; cy=h//2
50
        or_x = cx - 5*(block_size/2)
51
52
        or_y = cy - 5*(block_size/2)
53
        windows = []
        for i in range (5):
54
55
            for j in range (5):
                ul_x = or_x + i * block_size
56
57
                ul_y = or_y + j * block_size
                windows.append(x[ul_y:ul_y+block_size,ul_x:ul_x+block_size])
58
59
       W = np.hamming(block_size)
60
       W = np.outer(W,W)
       #multiply 2D hamming window
61
```

```
62
         windows = [w*W for w in windows]
63
         #compute squred DFT magnitude
64
         Z = [(1/(block\_size**2)*np.abs(np.fft.fft2(w))**2) for w in windows]
65
         Z = [np.fft.fftshift(z) for z in Z]
66
         Zabs = [np.log(z) for z in Z]
67
         #compute average
         av = np.zeros((block_size, block_size))
68
69
         for z in Zabs: av+=z
70
         av/=25
71
72
         # Plot the result using a 3-D mesh plot and label the x and y axises properly.
73
         fig = plt.figure()
74
         ax = fig.add_subplot(111, projection='3d')
75
         a = b = np.linspace(-np.pi, np.pi, num = block_size)
76
         X, Y = np. meshgrid(a, b)
77
         surf = ax.plot_surface(X, Y, av, cmap=plt.cm.coolwarm)
78
79
         ax.set_xlim(-1*np.pi,1*np.pi)
80
         ax.set_ylim(-1*np.pi,1*np.pi)
         ax.autoscale (enable=True, axis='z', tight=True)
81
         ax.set_xlabel('$\mu$ axis')
82
         ax.set_ylabel('$\\nu$ axis')
83
84
         ax.set_zlabel('Z Label')
85
         \label{eq:fig.colorbar} \textit{fig.colorbar}(\,\textit{surf}\,,\,\,\textit{shrink}\!=\!0.5\,,\,\,\textit{aspect}\!=\!5)
86
87
         plt.savefig('BetterSpecAnal_'+base_name+'.eps',format='eps')
88
89
90
    if __name__="__main__":
91
         # Read in a gray scale TIFF image.
92
93
         img_name=sys.argv[1]
94
         base_name=os.path.basename(img_name).split('.')[0]
         flag_betterspecanal = int(sys.argv[2])
95
96
         if (flag_betterspecanal==0):
             print('Enter BlockSize: ')
97
98
             block_size=int(input())
99
100
         im = Image.open(img_name)
101
         print('Read'+img_name)
102
         print('Image size: ', im.size)
103
104
         # Display image object by PIL.
         im.show(title='image')
105
106
107
         # Import Image Data into Numpy array.
108
         # The matrix x contains a 2-D array of 8-bit gray scale values.
109
         x = np. array(im)
110
         print('Data type: ', x.dtype)
111
112
         # Display numpy array by matplotlib.
113
         plt.imshow(x, cmap=plt.cm.gray)
         plt.title('Image')
114
115
         # Set colorbar location. [left, bottom, width, height].
116
117
         cax = plt.axes([0.9, 0.15, 0.04, 0.7])
118
         plt.colorbar(cax=cax)
119
         plt.show()
120
```

```
121 | x = np.double(x)/255.0

122 | if flag_betterspecanal == 0:

123 | SpecAnal(x,99,99,block_size,base_name)

124 | else:

125 | BetterSpecAnal(x,base_name)
```

Listing 3: Python code for generating filtered image for section 2

```
#!/usr/bin/env python3
1
2
   # -*- coding: utf-8 -*-
3
4
   @author: rahul
   course: ECE637-DIP-I
5
   lab2 2-D Random Process
6
7
8
9
   from PIL import Image as pil
10
   import numpy as np
11
   import sys
12
   import matplotlib.pyplot as plt
13
14
   A = 3.0
   B = 0.99
15
16
   C = -0.981
17
18
   def IIR_filter(x):
19
        y=np.zeros_like(x)
20
        h, w = x.shape
21
        for m in range (1,h):
22
            for n in range (1, w):
                y[m][n] = A*x[m][n] +B*(y[m-1][n]+y[m][n-1]) +C*y[m-1][n-1]
23
24
        return y
25
   def main(fname):
26
27
        #create random image
28
        x = np.random.rand(512,512)
29
        x = 0.5 \# now in [-0.5, 0.5]
30
        #display scaled image
31
        x_{scaled} = 255*(x+0.5)
        plt.imshow(x_scaled.astype(np.uint8))
32
33
        img_out = pil.fromarray(x_scaled.astype(np.uint8))
        img_out.save('Random_image.tif')
34
35
        #filter image
36
        y = IIR_filter(x)
        plt.imshow((y+127).astype(np.uint8))
37
38
        img\_out = pil.fromarray((y+127).astype(np.uint8))
39
        img_out.save(fname)
40
   if = -name_- = "-main_-":
41
42
        fname = sys.argv[1]
43
        main (fname)
```