

# Problem Set 5

1. (DTFT and DFT and FFT)

$$(a) \quad x * \exp(-j * \omega * \text{reshape}([0:N-1], \text{size}(x)))';$$

here  $x$  is  $[x[0], x[1], \dots, x[N-1]]$

$\text{reshape}([0:N-1], \text{size}(x))$  gives out  $[0, 1, \dots, N-1]$

then  $-j * \omega * \text{reshape}$  gives  $[e^{-j\omega 0}, e^{-j\omega 1}, \dots, e^{-j\omega(N-1)}]$

$\therefore x * \exp(-j * \omega * \text{reshape}([0:N-1], \text{size}(x)))'$

gives  $[x[0]e^{-j\omega 0}, x[1]e^{-j\omega 1}, \dots, x[N-1]e^{-j\omega(N-1)}]$

$\therefore$  and the sum of it gives a DTFT of  $x[n]$

Actually, it can also be written as:

$$y = x * \exp(-j * \omega * \text{reshape}([0:N-1], \text{size}(x)))';$$

because if  $x$  is a row vector

$$[x[0], x[1], \dots, x[N-1]] * [e^{-j\omega 0}, e^{-j\omega 1}, \dots, e^{-j\omega(N-1)}]^T$$

$$= \sum_{n=0}^{N-1} x[n] e^{-j\omega n}$$

(b) (c) (d) (e) see next pages with code and figure.

**1(b).**

**filename: mydft.m**

```
1 function y=mydft(x,k)
2 %make sure x is a row vector
3 N = length(x);
4 x = reshape(x,[1,N]);
5 y = x * exp(-1i*k*2*pi/N * (0:N-1)');
```

Use the above function to form a dft computation. **filename: dft.m**

```
1 function [m,phase,telapsed] = dft(x,mtype)
2 %function [m,phase,telapsed] = dft(x)
3 %if mtype is 0, magnitude type be decible, else be real number
4 %plot the magnitude, phase and time elapsed
5
6 N = length(x);
7 y = zeros(1,N);
8 tic;
9 tstart = tic;
10 for i = 1:N
11     y(i) = mydft(x,i-1);
12 end
13 telapsed = toc(tstart);
14 if mtype == 0
15     m = 10*log10(abs(y));
16 else
17     m = abs(y);
18 end
19 phase = angle(y);
20 disp('my dft time elapsed');
21 disp(num2str(telapsed));
22 subplot(2,1,1)
23 plot((0:N-1)*2/N,m)
24 if mtype == 0
25     ylabel('Magnitude (dB)')
26 else
27     ylabel('Magnitude')
28 end
29 xlabel('Frequency ({\times} \pi rad/sample)')
30 subplot(2,1,2)
31 plot((0:N-1)*2/N,phase)
32 ylabel('Phase')
33 xlabel('Frequency ({\times} \pi rad/sample)')
```

**1(c).**

Use the function generated in (b) to do the comparison.(M = 10).

**filename: solution\_c.m**

```
1 clear
2 %two sequence:
3 M = 10;
4 N = 2^M;
5 n = 0:N-1;
6 x1 = cos(pi * n/11);
7 x2 = double(n <= N/2-1);
8
9 %(c) compare dft and dtft
10 %the first sequence
11 %dft
12 figure
```

```

13 title('dft')
14 [m1,p1,t1]=dft(x1);
15 %dtft
16 figure
17 title('dtft')
18 freqz(x1,1,N);
19
20 %the second sequence
21 %dft
22 figure
23 title('dft')
24 [m2,p2,t2]=dft(x2);
25 %dtft
26 figure
27 title('dtft')
28 freqz(x2,1,N);
29
30 %d)compare dft and fft
31 %the first sequence
32 %dft
33 figure
34 title('dft')

```

## Sequence 1

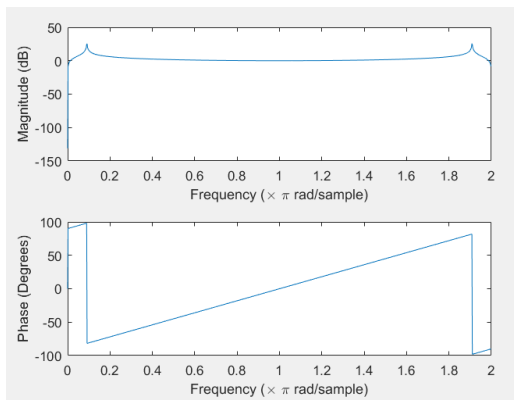


Figure 1: *dft*

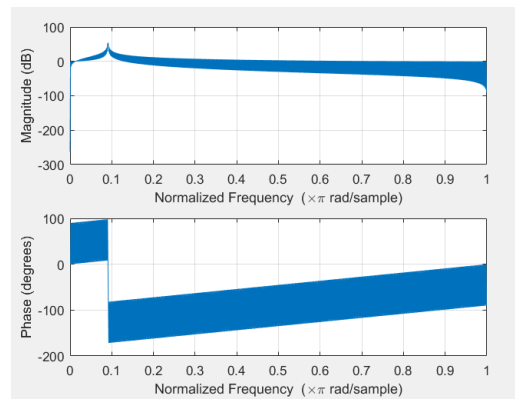


Figure 2: *dtft*

## Sequence 2

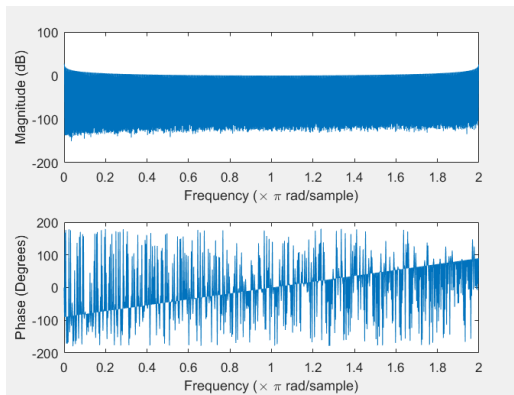


Figure 3: *dft*

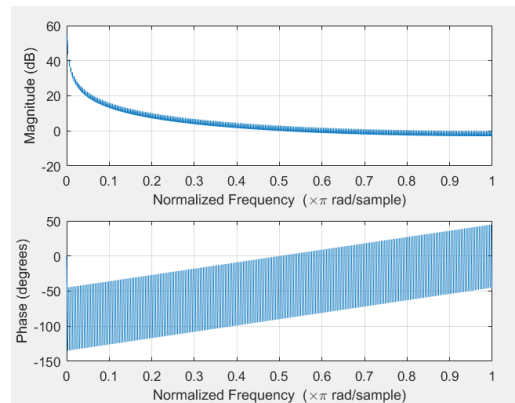


Figure 4: *dtft*

1(d) Some functions are created and running the following script to do the comparison.  
filename: myfft.m

```

1 function [m,phase,telapsed]=myfft(x,mtype)
2 N = length(x);
3 tic;
4 tstart = tic;
5 y = fft(x);
6 telapsed = toc(tstart);
7 %plot information
8 if mtype ==0
9     m = 10*log10(abs(y));
10 else
11     m = abs(y);
12 end
13 phase = angle(y);
14 disp('my fft time elapsed');
15 disp(num2str(telapsed));
16 subplot(2,1,1)
17 plot((0:N-1)*2/N,m)
18 if mtype == 0
19     ylabel('Magnitude (dB)')
20 else
21     ylabel('Magnitude')
22 end
23 xlabel('Frequency ({\times} \pi rad/sample)')
24 subplot(2,1,2)
25 plot((0:N-1)*2/N,phase)
26 ylabel('Phase')
27 xlabel('Frequency ({\times} \pi rad/sample)')
    
```

filename:solution\_d.m

```

1 %two sequence:
2 M = 17;
3 N = 2^M;
4 n= 0: N-1;
5 x1 = cos(pi * n/11);
6 x2 =double( n <= N/2-1);
    
```

```

7
8 %the first sequence
9 %dft choose dB
10 figure
11 [m1,p1,t1]=dft(x1,0);
12 %fft
13 figure
14 [m1_fft,p1_fft,t1_fft]=myfft(x1,0);
15
16 %the second sequence
17 %dft choose real number
18 figure
19 [m2,p2,t2]=dft(x2,1);
20 %fft
21 figure
22 [m2_fft,p2_fft,t2_fft]=myfft(x2,1);

```

**Result:(M = 17)**

my dft time elapsed

439.8895

my fft time elapsed

0.0098572

my dft time elapsed

437.2934

my fft time elapsed

0.002759

**1(e)**

Funvntion to generate one point. **filename: myConv.m**

```

1 function y = myConv(x1,x2,n)
2 length1 = length(x1);
3 length2 = length(x2);
4 sum = 0;
5 for m = 0 : length1-1
6     if n-m>=0 && (n-m)<=length2-1
7         sum = sum + x1(m+1)*x2(n-m+1);
8     end
9 end
10 y=sum;

```

Function to generate convolution

**filename:myConv.m**

```

1 function y = myConv(x1,x2)
2 length1 = length(x1);
3 length2 = length(x2);
4 y = zeros(1,length1+length2);
5 tic;
6 tstart = tic;
7 for i = 0 : length1 + length2 - 1
8     y(i+1) = myConv(x1,x2,i);
9 end
10 telapsed = toc(tstart);
11 disp('time elapsed');
12 disp(num2str(telapsed));

```

Function for the convolution using fft  
**filename:fftConv.m**

```
1 function x = fftConv(x1,x2)
2 N1 = length(x1);
3 N2 = length(x2);
4 x1 = [x1,zeros(1,N2-1)];
5 x2 = [x2,zeros(1,N1-1)];
6 tic;
7 tstart = tic;
8 X1 = fft(x1);
9 X2 = fft(x2);
10 X = X1 .* X2;
11 x = ifft(X);
12 telpased = toc(tstart);
13 disp('fft convolve time elapsed');
14 disp(num2str(telpased));
15 %fft convolution
```

Solution to this problem  
**filename: solution1e.m**

```
1 clear
2 %two sequence:
3 M = 15;
4 N = 2^M;
5 n= 0: N-1;
6 x1 = cos(pi * n/11);
7 x2 =double( n <= N/2-1);
8
9 y1 = myConv(x1,x2);
10 y2 = fftConv(x1,x2);
```

**Result:(M = 15)**

regular convolve time elapsed

24.4747

fft convolve time elapsed

0.02541

2. You are given a finite-length signal  $x[n]$ , defined for  $0 \leq n \leq N-1$ , where  $N = 3^M$  for some integer  $M$ . Derive a "radix-3 decimation-in-frequency" algorithm that computes the DFT of  $x[n]$  in terms of the three length- $N/3$  DFTs of the signals.

Answer:

$$\begin{aligned}
 X[k] &= \sum_{n=0}^{N/3-1} x[n] W_N^{kn} + \sum_{n=N/3}^{2N/3-1} x[n] W_N^{kn} + \sum_{n=2N/3}^{N-1} x[n] W_N^{kn} \\
 &= \sum_{n=0}^{N/3-1} x[n] W_N^{kn} + \sum_{n=0}^{N/3-1} x[n+N/3] W_N^{k(n+N/3)} + \sum_{n=0}^{N/3-1} x[n+2N/3] W_N^{k(n+2N/3)} \\
 &= \sum_{n=0}^{N/3-1} x[n] W_N^{kn} + W_N^{kN/3} \sum_{n=0}^{N/3-1} x[n+N/3] W_N^{kn} + W_N^{2kN/3} \sum_{n=0}^{N/3-1} x[n+2N/3] W_N^{kn} \\
 &= \sum_{n=0}^{N/3-1} (x[n] W_N^{kn} + x[n+N/3] W_N^{k/3} W_N^{kn} + x[n+2N/3] W_N^{2k/3} W_N^{kn}) \\
 &= \sum_{n=0}^{N/3-1} (x[n] + W_N^{k/3} x[n+N/3] + W_N^{2k/3} x[n+2N/3]) W_N^{kn}
 \end{aligned}$$

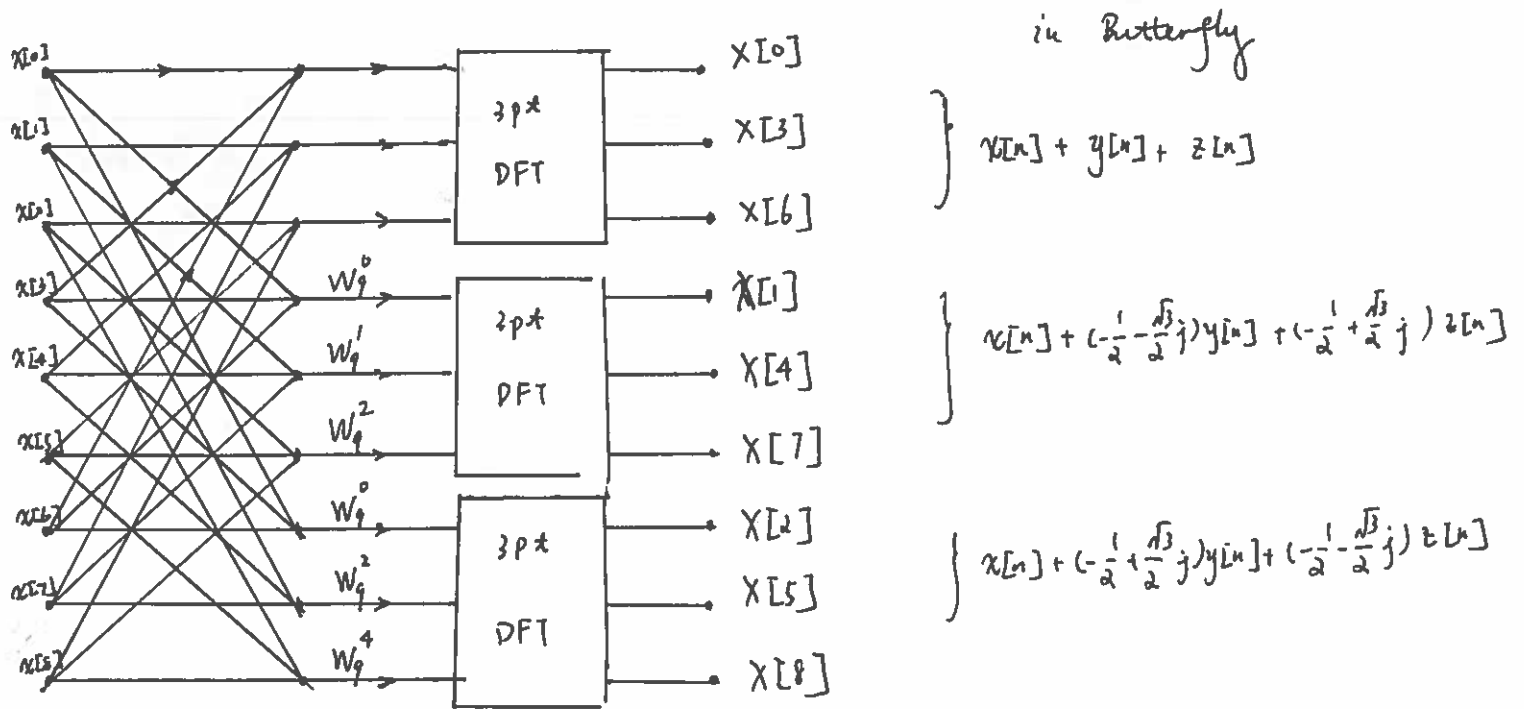
split  $X[k]$  into 3 part.

$$\begin{aligned}
 X[3k] &= \sum_{n=0}^{N/3-1} (x[n] + W_N^k x[n+N/3] + W_N^{2k} x[n+2N/3]) W_N^{3kn} \quad k=0, 1, \dots, N/3-1 \\
 &= \sum_{n=0}^{N/3-1} (x[n] + x[n+N/3] + x[n+2N/3]) W_{N/3}^{kn} \\
 &= \text{DFT} (x[n] + x[n+N/3] + x[n+2N/3]) \quad (N/3 \text{ point})
 \end{aligned}$$

$$\begin{aligned}
 X[3k+1] &= \sum_{n=0}^{N/3-1} (x[n] + W_N^{k+1/3} x[n+N/3] + W_N^{2k+2/3} x[n+2N/3]) W_N^{(3k+1)n} \quad k=0, 1, \dots, N/3-1 \\
 &= \sum_{n=0}^{N/3-1} (x[n] + (-\frac{1}{2} - \frac{\sqrt{3}}{2}j) x[n+N/3] + (-\frac{1}{2} + \frac{\sqrt{3}}{2}j) x[n+2N/3]) W_N^{(3k+1)n} \\
 &= \sum_{n=0}^{N/3-1} (x[n] + (-\frac{1}{2} - \frac{\sqrt{3}}{2}j) x[n+N/3] + (-\frac{1}{2} + \frac{\sqrt{3}}{2}j) x[n+2N/3]) W_{N/3}^{kn} W_N^n \\
 &= \text{DFT} ((x[n] + (-\frac{1}{2} - \frac{\sqrt{3}}{2}j) x[n+N/3] + (-\frac{1}{2} + \frac{\sqrt{3}}{2}j) x[n+2N/3]) W_N^n)
 \end{aligned}$$

$$\begin{aligned}
 X[3k+2] &= \sum_{n=0}^{N/3-1} (x[n] + W_N^{2k+2/3} x[n+N/3] + W_N^{4k+4/3} x[n+2N/3]) W_N^{(3k+2)n} \quad k=0, 1, \dots, N/3-1 \\
 &= \sum_{n=0}^{N/3-1} (x[n] + (-\frac{1}{2} + \frac{\sqrt{3}}{2}j) x[n+N/3] + (-\frac{1}{2} - \frac{\sqrt{3}}{2}j) x[n+2N/3]) W_N^{(3k+2)n} \\
 &= \text{DFT} ((x[n] + (-\frac{1}{2} + \frac{\sqrt{3}}{2}j) x[n+N/3] + (-\frac{1}{2} - \frac{\sqrt{3}}{2}j) x[n+2N/3]) W_N^{2n})
 \end{aligned}$$

the diagram as follows.  $N=9$



Complexity of DFT:  $N^2$  (multiple) +  $N^2$  (adding) =  $2N^2$

Complexity of 'radix-3 decimation-in frequency':

We have  $\log_3 N$  DFT processor if  $N$  is keep divided by 3.  
 each preprocessor has 3 adding (if we store  $(-\frac{1}{2} \pm \frac{j\sqrt{3}}{2})$  as constant)  
 each preprocessor has 2 multiplying.

each DFT processor has 9 adding and 9 multiplying.

We have  $N/3$  preprocessor and  $\log_3 N$  DFT processor.

$$\text{Complexity} = \frac{N}{3} (3+2) (18 \log_3 N) \approx 10N \log_3 N$$

$$O(\text{'radix-3 decimation-in frequency'}) = N \log_3 N$$

$\log_3 N$  layer  
 the # of processor  
 is  $\frac{1 - 3^{\log_3 N}}{1 - 3}$   
 $= \frac{N-1}{2}$

$$\text{Complexity} = O(\text{Pre}) + O(\text{DFT})$$

$$= \frac{N}{3} (3+2) \log_3 N + (\frac{N-1}{2}) \log_3 N$$

$$= (\frac{5N}{3} + \frac{N-1}{2}) \log_3 N \approx O(\frac{5}{2} N \log_3 N)$$



3. (The effect of zero-padding)

$$X[k] = \sum_{q=0}^{N-1} x[q] \delta[k-q]$$

$$g_q[n] = \text{IDFT}_N \{ \delta[k-q] \}[n] \quad \tilde{g}_q[n] \text{ is the } L\text{-length zero-padding of } g_q[n]$$

(a) Compute the closed-form expression for  $\tilde{G}_q[k]$

Answer:  $\tilde{G}_q[k] = \sum_{n=0}^L \tilde{g}_q[n] W_L^{kn}$

$$= \sum_{n=0}^{N-1} g_q[n] W_L^{kn}$$

$$g_q[n] = \text{IDFT}_N \{ \delta[k-q] \}[n]$$

$$= \frac{1}{N} \sum_{k=0}^{N-1} \delta[k-q] W_N^{-kn}$$

$$\therefore \tilde{G}_q[k_2] = \sum_{n=0}^{NL} \left( \frac{1}{N} \sum_{k_1=0}^{N-1} \delta[k_1-q] W_N^{-k_1 n} \right) W_L^{k_2 n}$$

$$= \frac{1}{N} \sum_{k_1=0}^{N-1} \sum_{n=0}^{N-1} \delta[k_1-q] W_N^{-k_1 n} W_L^{k_2 n}$$

$$= \frac{1}{N} \sum_{k_1=0}^{N-1} \delta[k_1-q] \frac{1 - W^{(-\frac{k_1}{N} + \frac{k_2}{L})N}}{1 - W^{-\frac{k_1}{N} + \frac{k_2}{L}}}$$

$$= \frac{1}{N} \frac{1 - W^{\frac{k_2 N}{L}}}{1 - W^{-\frac{q}{N} + \frac{k_2}{L}}}$$

$$\therefore \tilde{G}_q[k] = \frac{1}{N} \frac{1 - W^{\frac{kN}{L}}}{1 - W^{-\frac{q}{N} + \frac{k}{L}}}$$

if  $L=2N$

$$\tilde{G}_q[k] = \frac{1}{N} \frac{1 - W^{\frac{k}{2}}}{1 - W^{-\frac{q}{2N} + \frac{k}{4N}}} = \frac{1}{N} \frac{W_4^k}{W_{2N}^{-\frac{q}{2N} + \frac{k}{4N}}} \frac{\sin(\frac{\pi k}{2})}{\sin(\pi \frac{-\frac{q}{2N} + \frac{k}{4N}}{N})}$$

$\downarrow k \rightarrow 2(k+q)$

$$G_q[2(k+q)] = \frac{1}{N} \frac{W_4^k}{W_{2N}^k} \frac{\sin(\pi(k+q))}{\sin(\pi \frac{k}{N})}$$

when  $k = tN, t \in \mathbb{Z}$

$$G_q[2(k+q)] = \frac{W_4^k}{W_2^t} \frac{1}{\sin(\pi t)} \delta(k-tN)$$

which is an effect of "periodic sinc interpolation"

**3(b).**

filename: solution3b.m

```

1 clear
2 x = double((imread('cameraman.tif')));
3 imgSize = size(x);
4 row = imgSize(1);
5 col = imgSize(2);
6 fX = zeros(imgSize);
7 for i = 1 : imgSize(1)
8     fX(i,:) = fft(x(i,:));
9 end
10
11 %First way
12 newFx1 = zeros(imgSize(1),imgSize(2)+1024-256);
13 for i = 1 : imgSize(1)
14     newFx1(i,:) = [fX(i,:),zeros(1,1024-256)];
15 end
16
17 %Second way
18 newFx2 = zeros(imgSize(1),imgSize(2)+1024-256);
19 for i = 1 : imgSize(1)
20     newFx2(i,:) = [fX(i,1:col/2-1),zeros(1,1024-256),fX(i,col/2:col)];
21 end
22
23 %First way result
24 newImg1 = zeros(imgSize(1),imgSize(2)+1024-256);
25 for i = 1 : row
26     newImg1(i,:) = ifft(newFx1(i,:));
27 end
28 %Second way result
29 newImg2 = zeros(imgSize(1),imgSize(2)+1024-256);
30 for i = 1 : row
31     newImg2(i,:) = ifft(newFx2(i,:));
32 end
33 imagesc(x)
34 figure
35 imagesc(uint8(abs(newImg1)))
36 figure
37 imagesc(uint8(abs(newImg2)))

```

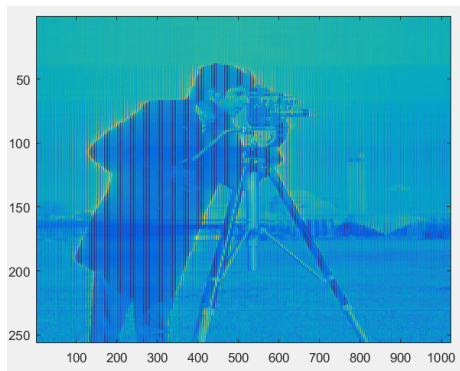
**Result:**

Figure 5: Method1



Figure 6: Method2

3(b) mathematical analysis.

first way:  $\text{IDFT}(\tilde{X}[k]) = \frac{1}{N} \sum_{k=0}^{L-1} X[k] W_L^{-nk}$

$$x[n] = \frac{1}{N} \sum_{k=0}^{N-1} X[k] W_N^{-nk}$$

$$= \frac{1}{N} \sum_{k=0}^{N-1} X[k] W_N^{-\frac{nkN}{L}}$$

$$\tilde{x}[n] = x[\frac{N}{L}n]$$

second way:  $\text{IDFT}(\tilde{x}[k]) = \frac{1}{N} \sum_{k=0}^{L-1} X[k] W_L^{-nk}$

$$= \frac{1}{N} \left( \sum_{k=0}^{N/2-1} X[k] W_L^{-nk} + \sum_{k=L-N/2}^{L-1} X[k-L+N] W_L^{-nk} \right)$$

$$= \frac{1}{N} \left( \sum_{k=0}^{N/2-1} X[k] W_L^{-nk} + \sum_{k_2=\frac{N}{2}}^{N-1} X[k_2] W_L^{-n(k_2+L-N)} \right)$$

$$= \frac{1}{N} \left( \sum_{k=0}^{N/2-1} X[k] W_L^{-nk} + \sum_{k_2=\frac{N}{2}}^{N-1} X[k_2] W_L^{-(k_2-N)n} \right)$$

$$= \frac{1}{N} \left( \sum_{k=0}^{N/2-1} X[k] W_L^{-nk} + \sum_{k=\frac{N}{2}}^{N-1} X[k] W_L^{kn} \underline{W_L^{Nn}} \right)$$

$$\tilde{x}[n] = x[\frac{N}{L}n] \text{ when } \frac{Nn}{L} \text{ is integer.}$$

$$\tilde{x}[n] = \frac{1}{N} \left( \sum_{k=0}^{N/2-1} X[k] W_L^{-nk} + \sum_{k=\frac{N}{2}}^{N-1} X[k] W_L^{kn} W_L^{Nn} \right)$$

when  $\frac{Nn}{L}$  is not integer.

therefore the second method interpolate some values.

**4(a) 4(b)**

```

1 x = double((imread('cameraman.tif')));
2 dctImage = dct2(x);
3 imagesc(uint8(log(abs(dctImage))));
4 colormap(gray);
5
6 energyTime = sum(x.^2);
7 energyDct = sum(dctImage.^2);
8 difference = energyDct - energyTime;

```

**Result:**

difference = 7.1526e-07



Figure 7: Method1

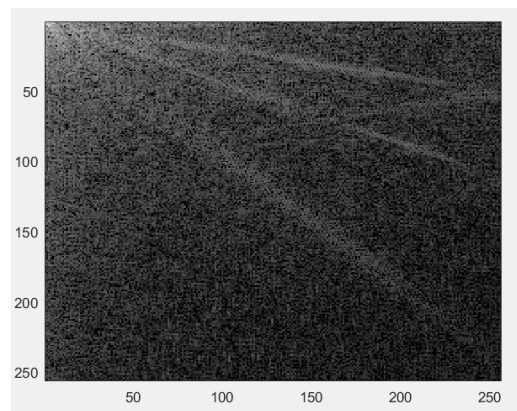


Figure 8: Method2

**4(c)**

A function called set zeros is set to do the set 0 processing.

filename: setZeros.m

```

1 function x = setZeros(x,alpha)
2 %x = setZeros(x,alpha)
3 %alpha: at what degree to set zeros
4 if alpha > 0
5 xSize= size(x);
6 xOp = sort(reshape(x,[1,xSize(1)*xSize(2)]));
7 position = round(length(xOp)*alpha);
8 valueForTest = xOp(position);
9 andGate = x > valueForTest;
10 x = x .* andGate;
11 end

```

filename: solution4c.m

```

1 x = double((imread('cameraman.tif')));
2 dctImageOrigin = dct2(x);
3 for i = 0.0 : 0.1 : 0.9
4     figure
5     dctImage = setZeros(dctImageOrigin,i);
6     imageidct = uint8(idct2(dctImage));

```

```

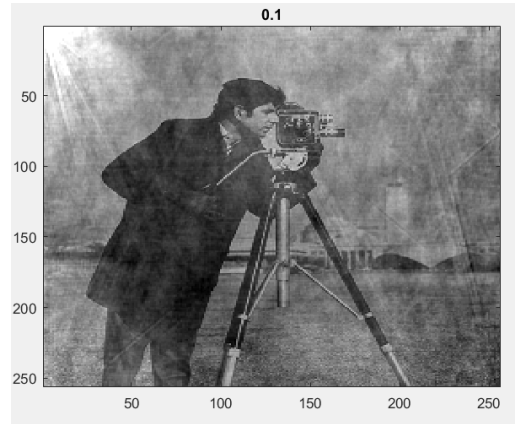
7   imagesc(imageidct);
8   colormap(gray)
9   title(num2str(i))
10 end

```

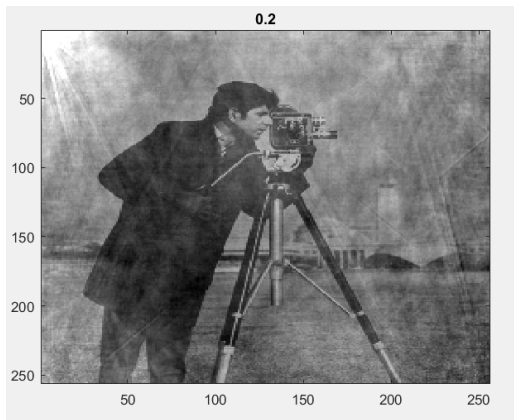
**Results:**



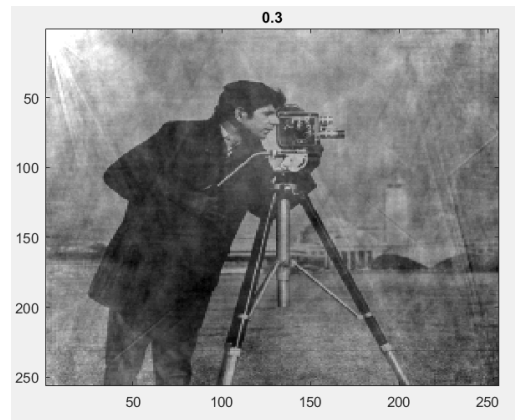
**Figure 9: 0%**



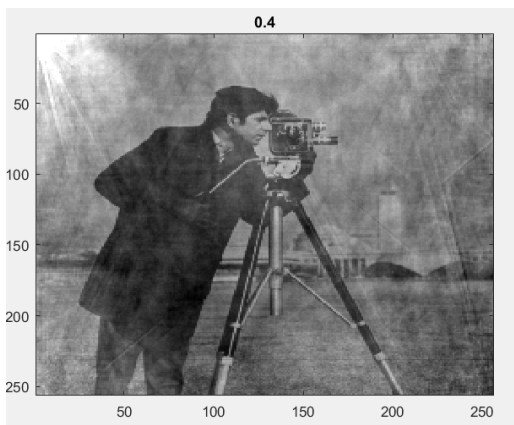
**Figure 10: 10%**



**Figure 11: 20%**



**Figure 12: 30%**



**Figure 13: 40%**

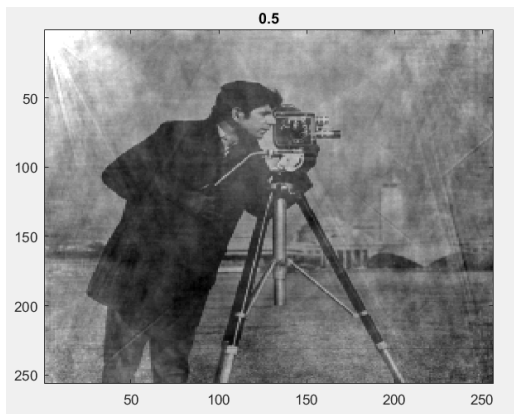


Figure 14: 50%

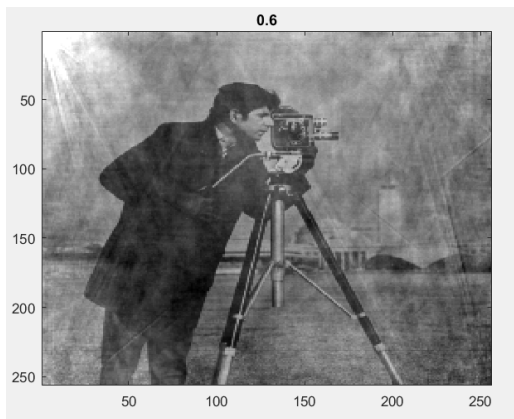


Figure 15: 60%



Figure 16: 70%

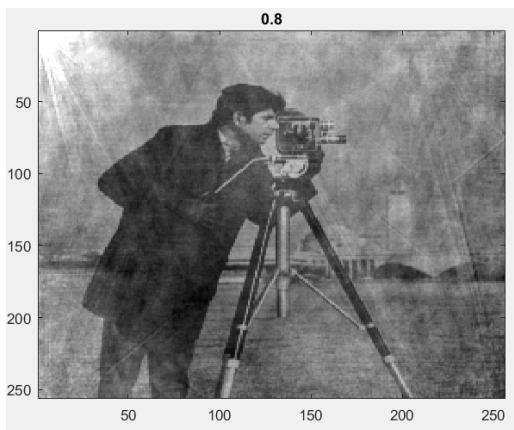


Figure 17: 80%

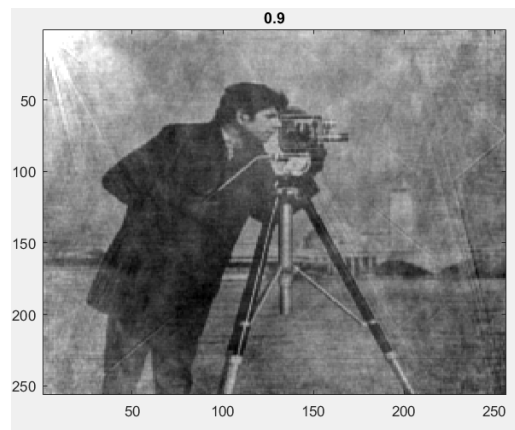


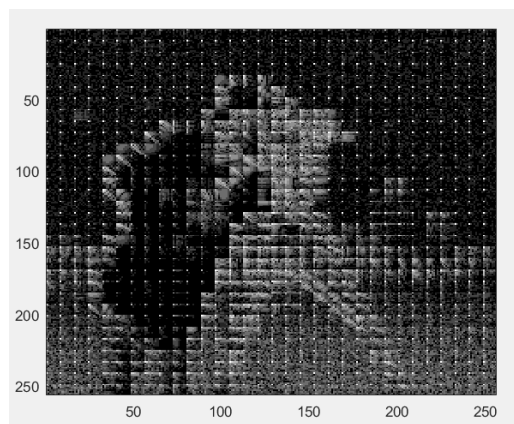
Figure 18: 90%

4(d)

filename:solution4d.m

```
1 x = double((imread('cameraman.tif')));
2 tileDCT = x; %need the size
3 for i = 1 : 32
4     for j = 1 : 32
5         tile = x((i-1)*8+1:i*8,(j-1)*8+1:j*8);
6         dctTile = dct2(tile);
7         tileDCT((i-1)*8+1:i*8,(j-1)*8+1:j*8)=dctTile;
8     end
9 end
10 imagesc((uint8(log(abs(tileDCT)))));
11 colormap(gray)
```

### Result



**Figure 19:** *Blocks of DCT*

5. (Haar Wavelet Transform) The Haar wavelet transform takes a length- $N$  signal  $x[n]$  for  $0 \leq n \leq N-1$ , and filters the signal with two different filters.

LPF:  $h_1[n] = \{\frac{1}{\sqrt{2}}, \frac{1}{\sqrt{2}}\}$ . HPF  $h_2[n] = \{-\frac{1}{\sqrt{2}}, \frac{1}{\sqrt{2}}\}$ . Subsequently, the filtered signals are downsampled

$y_1[k] = x[n] \otimes h_1[n]$   $y_2[k] = x[n] \otimes h_2[n]$ . Haar wavelet coefficients  $X[k]$  of the sequence  $x[n]$  are defined as

$$X[k] = \begin{cases} y_1[2k], & k=0, \dots, \frac{N}{2}-1 \\ y_2[2(k-\frac{N}{2})], & k=\frac{N}{2}, \dots, N-1 \end{cases}$$

$$= \begin{cases} \sum_{n=0}^{N-1} x[n] h_1[2k-n], & k=0, \dots, \frac{N}{2}-1 \\ \sum_{n=0}^{N-1} x[n] h_2[2k-N-n], & k=\frac{N}{2}, \dots, N-1 \end{cases}$$

(a) Compute magnitude responses of  $h_1[n]$  and  $h_2[n]$ , verify their type of filter.

$$X_1(e^{j\omega}) = \sum_{n=0}^1 h_1[n] e^{-j\omega n} = \frac{1}{\sqrt{2}} + \frac{1}{\sqrt{2}} e^{-j\omega}$$

$$|X_1(e^{j\omega})|^2 = \left(\frac{1}{\sqrt{2}}\right)^2 (2 + 2\cos\omega + \cancel{\cos\omega}) = 1 + \cos\omega + \cancel{\frac{\cos\omega}{2}}$$

$$\omega=0, |X_1(e^{j\omega})|^2 = \frac{4}{2} = 2$$

$$\omega=\pi, |X_1(e^{j\omega})|^2 = 0$$

$|X_1(e^{j\omega})|^2$  continuous decreasing function over  $\omega$ .

$\therefore h_1[n] \rightarrow$  Low Pass filter.

$$X_2(e^{j\omega}) = \sum_{n=0}^1 h_2[n] e^{-j\omega n} = -\frac{1}{\sqrt{2}} + \frac{1}{\sqrt{2}} e^{-j\omega}$$

$$|X_2(e^{j\omega})|^2 = \frac{1}{2} (2 - 2\cos\omega) = 1 - \cos\omega$$

$$\omega=0, |X_2(e^{j\omega})|^2 = 0$$

$$\omega=\pi, |X_2(e^{j\omega})|^2 = 2$$

$|X_2(e^{j\omega})|^2$  continuous and increasing over  $\omega$ .

$\therefore h_2[n] \rightarrow$  High Pass filter.



(b) Assuming  $N=6$ , Matrix representation of Haar wavelet transform.

$$X[k] = \begin{bmatrix} h_1[0] & h_1[1] & \dots & \dots & h_1[1-N] \\ h_1[2] & h_1[3] & \dots & \dots & h_1[3-N] \\ \vdots & & & & \\ h_1[N-2] & h_1[N-3] & \dots & \dots & h_1[3-1] \\ h_2[0] & h_2[1] & \dots & \dots & h_2[0-N] \\ h_2[2] & h_2[3] & \dots & \dots & h_2[3-N] \\ \vdots & & & & \\ h_2[N-2] & h_2[N-3] & \dots & \dots & h_2[3-1] \end{bmatrix} \begin{bmatrix} x[0] \\ x[1] \\ \vdots \\ x[N-1] \end{bmatrix}$$

$$N=6, X[k] = \begin{bmatrix} \frac{1}{\sqrt{2}} & 0 & 0 & 0 & 0 & 0 \\ 0 & \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} & 0 & 0 & 0 \\ 0 & 0 & 0 & \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} & 0 \\ -\frac{1}{\sqrt{2}} & 0 & 0 & 0 & 0 & 0 \\ 0 & -\frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} & 0 & 0 & 0 \\ 0 & 0 & 0 & -\frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} & 0 \end{bmatrix} \cdot \begin{bmatrix} x[0] \\ x[1] \\ \vdots \\ x[5] \end{bmatrix}$$

$\hookrightarrow U_X$

$$(C) U_X^H = U_X^T$$

$$= \begin{bmatrix} \frac{1}{\sqrt{2}} & 0 & 0 & -\frac{1}{\sqrt{2}} & 0 & 0 \\ 0 & \frac{1}{\sqrt{2}} & 0 & 0 & -\frac{1}{\sqrt{2}} & 0 \\ 0 & \frac{1}{\sqrt{2}} & 0 & 0 & \frac{1}{\sqrt{2}} & 0 \\ 0 & 0 & \frac{1}{\sqrt{2}} & 0 & 0 & -\frac{1}{\sqrt{2}} \\ 0 & 0 & \frac{1}{\sqrt{2}} & 0 & 0 & \frac{1}{\sqrt{2}} \\ 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$

$$U_X^H \cdot U_X = \begin{bmatrix} 1 & & & & & \\ & 1 & & & & \\ & & 1 & & & \\ & & & 1 & & \\ & & & & 1 & \\ & & & & & 0 \end{bmatrix} = \begin{bmatrix} E & 0 \\ 0 & 0 \end{bmatrix}$$

0 ←

$\therefore$  it is "unitary" but with the last element missing.

$$a) \quad X[k] = U_x x[n]$$

$$U_x^{-1} X[k] = U_x^{-1} U_x x[n]$$

$$\therefore x[n] = U_x^H X[k]$$

$n = 0 \dots \dots \underline{N-2}$  last element missing.