

UNIVERSITY OF MORATUWA



DEPARTMENT OF ELECTRONICS AND TELECOMMUNICATION

EN2570 - DIGITAL SIGNAL PROCESSING

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## **FIR Filter Design Project - Bandstop Filter**

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## 1 ABSTRACT

**This report outlines the design process of a Non - Recursive (Finite Impulse Response) Bandstop Filter using the Kaiser Window Function. MATLAB 2014a software package was used as the programming environment for the design project. In the following sections the basic theoretical construct underlying the design process, results obtained and the conclusion would be discussed.**

**Keywords - Non Recursive (FIR) Bandstop Filter, Kaiser Window Function, MATLAB 2014a software package**

## 2 INTRODUCTION

There are two classical methods for the design of nonrecursive filters.

- **Fourier series method (Window Method)**

Here, the Fourier series is used in conjunction with a class of functions known as window functions.

- **weighted-Chebyshev method**

This is a multivariable optimization method

In this report the Fourier series method is used in conjunction with the window known as the Kaiser Window.

### 3 BASIC THEORY

A fundamental property of digital filters in general is that they have a periodic frequency response with period equal to the sampling frequency  $\omega_s$

$$H(e^{j(\omega+k\omega_s)T}) = H(e^{j\omega T})$$

Since the frequency response is periodic we can represent it as a Fourier Series as below.

$$H(e^{j\omega T}) = \sum_{n=-\infty}^{n=\infty} h(nT)e^{-j\omega nT}$$

where,

$$h(nT) = \frac{1}{\omega_s} \int_{-\omega_s/2}^{\omega_s/2} H(e^{j\omega T}) e^{j\omega nT} d\omega$$

Define the impulse response of the Filter as  $h(nT)$  and then by substituting  $z = e^{j\omega T}$  we obtain the Transfer function of the filter as follows.

$$H(z) = \sum_{n=-\infty}^{n=\infty} h(nT)z^{-n}$$

Since the Fourier series coefficients are defined over the range  $-\infty < n < \infty$ , there are two problems regarding the Fourier series method.

- The nonrecursive filter obtained is of infinite length.
- The filter is noncausal because the impulse response is nonzero for negative time.

A finite filter length can be achieved by truncating the impulse response in such way that,  $h(nT) = 0$  for  $|n| > M$  where  $M = (N - 1)/2$ . And a causal filter can be obtained by delaying the impulse response by a period  $MT$  seconds or by  $M$  sampling periods.

Since delaying the impulse response by  $M$  sampling periods amounts to multiplying the transfer function by  $z^{-M}$ , the transfer function of the causal filter has the following form.

$$H'(z) = z^{-M} \sum_{n=-\infty}^{n=\infty} h(nT)z^{-n}$$

And we obtain the frequency response as,

$$H(e^{j\omega T}) = e^{-j\omega MT} \sum_{n=-\infty}^{n=\infty} h(nT)e^{-j\omega nT}$$

The amplitude response of the filter does not change with the sample shift as  $|e^{-j\omega MT}| = 1$ . However, the phase response will change from that of the original.

However, we can observe that the amplitude response of the filter would have undesirable oscillations (Gibbs oscillations) in both the stop band and the pass band. They are caused by the truncation of the Fourier series. And unfortunately we cannot reduce this phenomenon by increasing the truncation length.

As a solution this problem we use a window function ( $w(nT)$ ) to truncate the infinite duration filter response  $h(nT)$ . This is done as follows.

$$h_w(nT) = h(nT)w(nT)$$

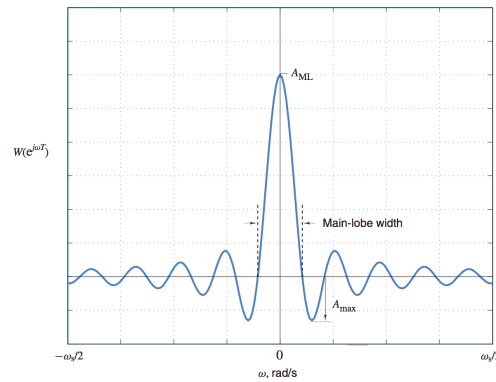
Then the Transfer Function of the modified filter is given by,

$$H_w(z) = Z[h(nT)w(nT)]$$

Hence, the frequency response of the modified filter is given by the convolution integral.

$$H_w(e^{j\omega T}) = \frac{T}{2\pi} \int_0^{2\pi/T} H(e^{j\omega' T}) W(e^{j(\omega - \omega') T}) d\omega'$$

Figure 3.1: Frequency Spectrum of a usual window



Windows are characterized by their **main-lobe width**,  $B_{ML}$ , which is the bandwidth between the first negative and the first positive zero crossings, and by their **ripple ratio**,  $r$ , which is defined as,

$$R = 20 \log \frac{A_{max}}{A_{ML}}$$

where  $A_{max}$  and  $A_{ML}$  are the maximum side-lobe and main-lobe amplitudes, respectively. The main-lobe width and ripple ratio should be as low as possible. The spectral energy of the window should be concentrated as far as possible in the main lobe and the energy in the side lobes should be as low as possible.

These are some of the window functions that are used to design filters.

- Rectangular
- von Hann
- Hamming
- Blackman
- Dolph-Chebyshev
- Kaiser
- Ultraspherical window

In this design project the Kaiser window is used as the window function to arrive at a band stop filter according to the given specifications.

## 4 KAISER WINDOW

The Kaiser window function is given by,

$$w_K(nT) = \begin{cases} \frac{I_0(\beta)}{I_0(\alpha)}, & \text{for } |n| < (N-1)/2 \\ 0, & \text{otherwise} \end{cases} \quad (4.1)$$

here,

$$\beta = \alpha \sqrt{1 - \left(\frac{2n}{N-1}\right)^2}$$

and

$$I_0(x) = 1 + \sum_{k=1}^{\infty} \left[ \frac{1}{k!} \left(\frac{x}{2}\right)^k \right]^2$$

$\alpha$  is an independent parameter, and  $I_0(x)$  is a zeroth-order modified Bessel function of the first kind.

Figure 4.1: Ripple Ratio vs  $\alpha$

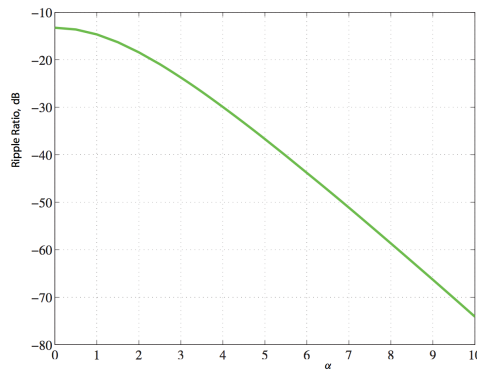
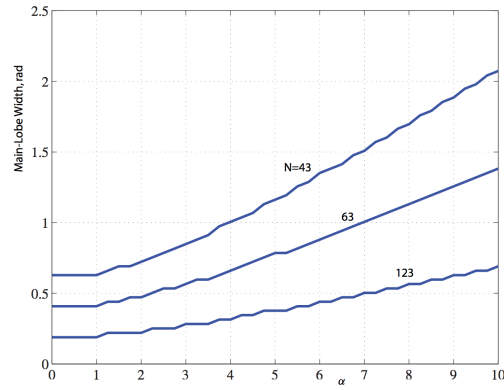


Figure 4.2: Main Lobe Width vs.  $\alpha$



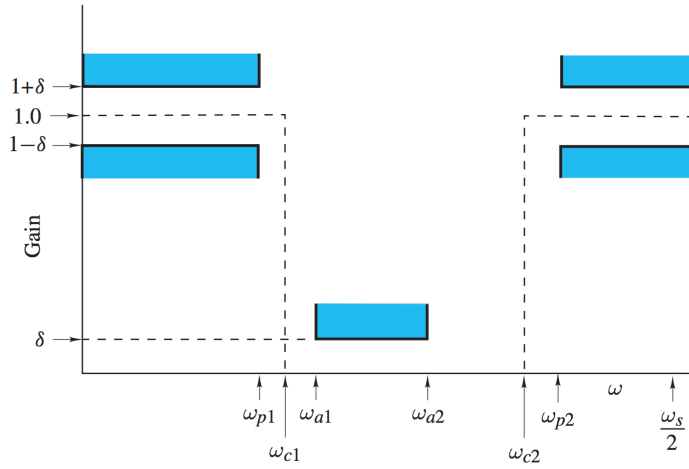
A filter-design method is available, also proposed by Kaiser, that can be used to design nonrecursive filters that would satisfy arbitrary prescribed specifications. This method can be used to design lowpass (LP), highpass (HP), bandpass (BP), and bandstop (BS) filters.

## 5 DESIGN PROCEDURE OF A NON RECURSIVE BAND STOP FILTER

Let us assume that the following are the design specifications of the desired bandpass filter.

- Passband Ripple  $\leq \tilde{A}_p$
- Minimum Stop Band Attenuation  $\geq \tilde{A}_a$
- Lower passband edge  $\omega_{p1}$
- Lower stopband edge  $\omega_{a1}$
- Upper stopband edge  $\omega_{a2}$
- Upper passband edge  $\omega_{p2}$
- Sampling frequency  $\omega_s$

Figure 5.1: Design Specifications Visualized



From the above specifications, the more critical transition width is,

$$B_t = \min[(\omega_{a1} - \omega_{p1}), (\omega_{p2} - \omega_{a2})]$$

Hence, idealized frequency response for a Bandstop filter is given as,

$$H(e^{j\omega T}) = \begin{cases} 1, & \text{for } 0 \leq |\omega| \leq \omega_{c1} \\ 0, & \text{for } \omega_{c1} \leq |\omega| \leq \omega_{c2} \\ 1, & \text{for } \omega_{c1} \leq |\omega| \leq \omega_s/2 \end{cases} \quad (5.1)$$

where  $\omega_{c1} = \omega_{p1} + B_t/2$  and  $\omega_{c2} = \omega_{p2} + B_t/2$ .

Using the Fourier series, the impulse response of the ideal bandstop filter can be obtained as,

$$h(nT) = \begin{cases} 1 + \frac{2(\omega_{c1} - \omega_{c2})}{\omega_s}, & \text{for } n = 0 \\ \frac{1}{n\pi} (\sin(\omega_{c1} nT) - \sin(\omega_{c2} nT)), & \text{otherwise} \end{cases} \quad (5.2)$$

Now we can start the design procedure.

1. Choose a suitable values for  $\delta$  using the below eqautions.

$$\tilde{\delta}_p = \frac{10^{0.05\tilde{A}_p} - 1}{10^{0.05\tilde{A}_p} + 1}$$

$$\tilde{\delta}_a = 10^{-0.05\tilde{A}_a}$$

$$\delta = \min(\tilde{\delta}_p, \tilde{\delta}_a)$$

2. Calculate the actual stop band attenuation  $A_a$  by

$$A_a = -20 \log(\delta)$$

3. Choose parameter  $\alpha$  as,

$$\alpha = \begin{cases} 0, & \text{for } A_a \leq 21 \\ 0.5842(A_a - 21)^0.4 + 0.07886(A_a - 21), & \text{for } 21 < A_a \leq 50 \\ 0.1102(A_a - 8.7), & \text{for } A_a > 50 \end{cases} \quad (5.3)$$

4. Choose parameter  $D$  as,

$$D = \begin{cases} 0.9222, & \text{for } A_a \leq 21 \\ \frac{A_a - 7.95}{14.26}, & \text{for } A_a > 21 \end{cases} \quad (5.4)$$

5. Then select the lowest odd value of  $N$  that would satisfy the inequality,

$$N \geq \frac{\omega_s D}{B_t} + 1 \text{ where } B_t = \min[(\omega_{a1} - \omega_{p1}), (\omega_{p2} - \omega_{a2})]$$

6. Then using the definition of the Kaiser Window, find  $w_K(nT)$  :

$$w_K(nT) = \begin{cases} \frac{I_o(\beta)}{I_o(\alpha)}, & \text{for } |n| < (N-1)/2 \\ 0, & \text{otherwise} \end{cases} \quad (5.5)$$

here,

$$\beta = \alpha \sqrt{1 - \left(\frac{2n}{N-1}\right)^2}$$

and

$$I_o(x) = 1 + \sum_{k=1}^{\infty} \left[ \frac{1}{k!} \left(\frac{x}{2}\right)^k \right]^2$$

7. Finally form the modified transfer function of the filter.

$$H'_w(z) = z^{-(N-1)/2} H_w(z) \text{ where } H_w(z) = Z[h(nT)w_K(nT)]$$



## 6 RESULTS

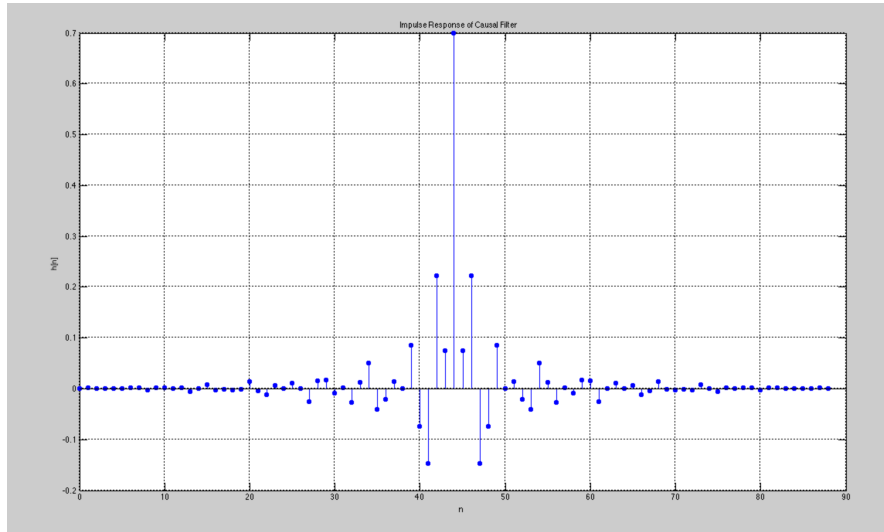
MATLAB 2014a Software package was used to design, simulate and validate the digital filter. The aforementioned procedure was used for the design process.

The following design specifications were used.

Parameter	Value
Passband Ripple $\tilde{A}_p$	0.06 dB
Minimum Stop Band Attenuation $\tilde{A}_a$	40 dB
Lower passband edge $\omega_{p1}$	600 rad/s
Lower stopband edge $\omega_{a1}$	700 rad/s
Upper stopband edge $\omega_{a2}$	1000 rad/s
Upper passband edge $\omega_{p2}$	1150 rad/s
Sampling frequency $\omega_s$	3000 rad/s

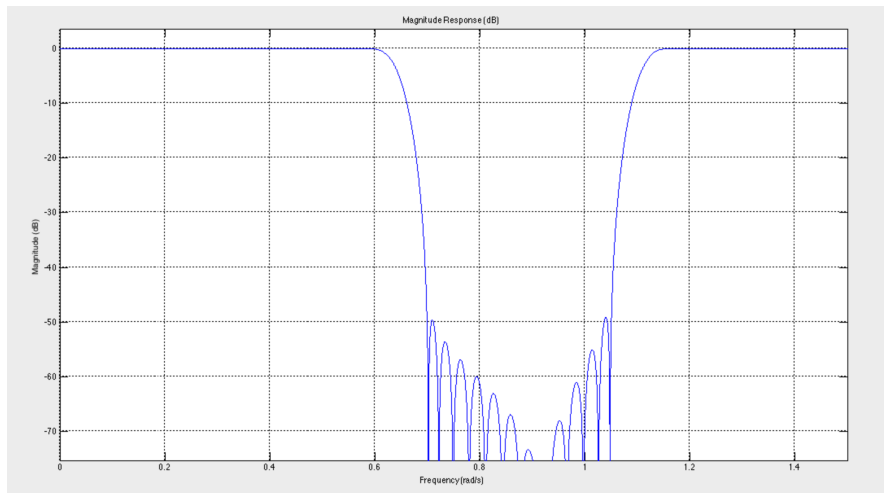
### 6.1 THE CAUSAL IMPULSE RESPONSE OF THE DESIGNED BANDSTOP FILTER

Figure 6.1: Causal Impulse Response



## 6.2 THE MAGNITUDE RESPONSE OF THE DESIGNED BANDSTOP FILTER

Figure 6.2: Magnitude Response



## 6.3 THE MAGNITUDE RESPONSE OF UPPER AND LOWER PASSBANDS

Figure 6.3: Lower Passband

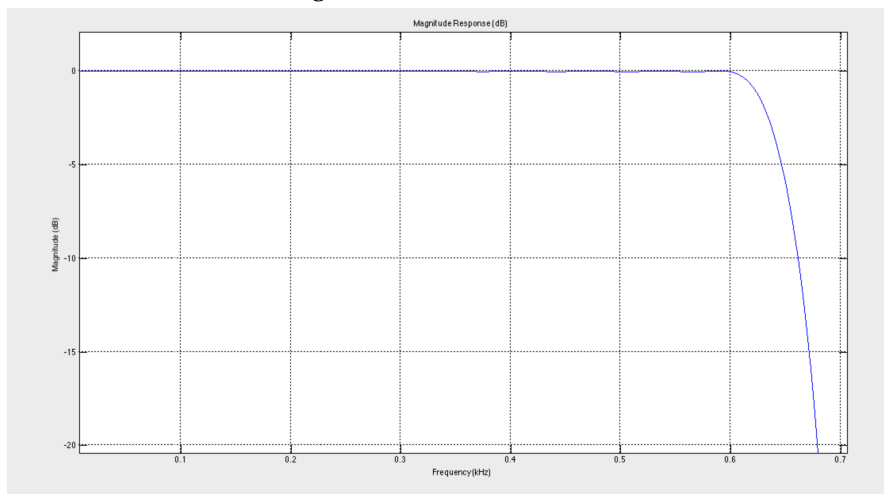
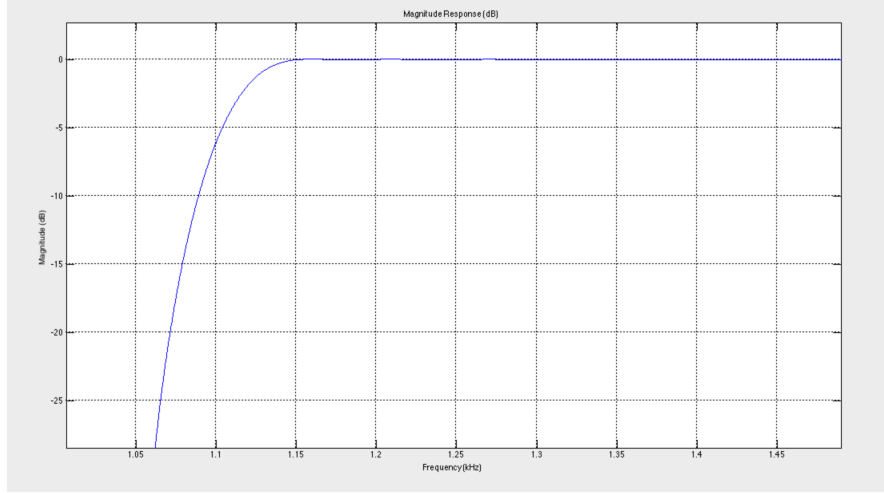


Figure 6.4: Upper Passband



## 7 VALIDATION OF THE DESIGNED BAND STOP FILTER

For the validation purposes, the following time domain excitation was used.

$$x(nT) = \sum_{i=1}^3 \sin(\Omega_i nT)$$

Since the cutoff frequencies of the designed bandstop filter was  $\Omega_{c1} = 650 \text{ rad s}^{-1}$  and  $\Omega_{c2} = 1100 \text{ rad s}^{-1}$ ,

$$\Omega_1 = 325 \text{ rad s}^{-1}$$

,

$$\Omega_2 = 850 \text{ rad s}^{-1}$$

,

$$\Omega_3 = 1275 \text{ rad s}^{-1}$$

was chosen as the frequencies of the excitation signal.

As it was observed, the filtered signal using the bandstop filter and the ideally filtered signal were almost the same.

Figure 7.1: Excitation in time domain

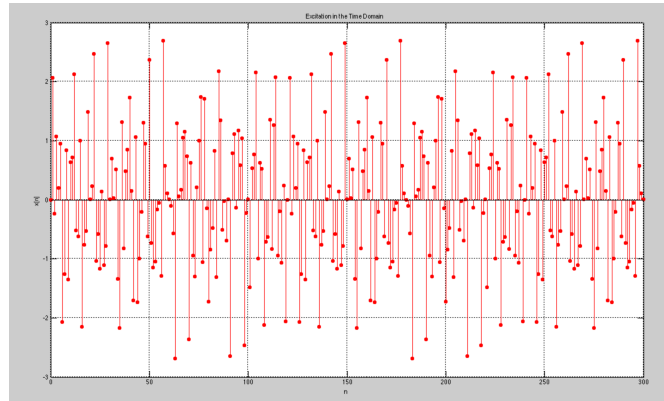


Figure 7.2: Filtered signal in the time domain

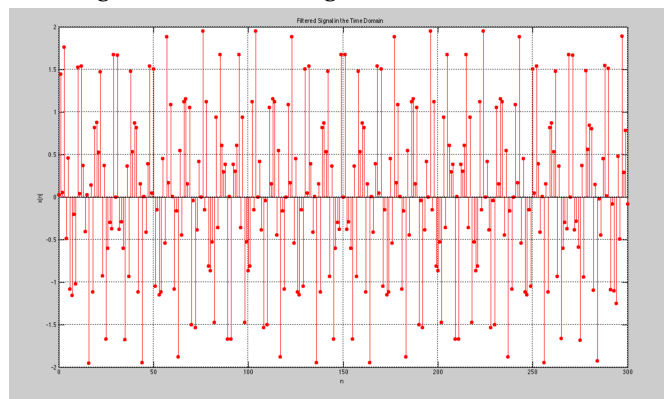
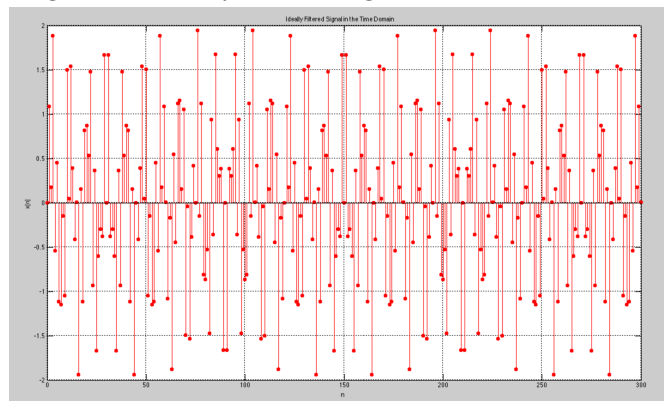


Figure 7.3: Ideally Filtered Signal in the Time Domain



As it can be observed, the filtered signal using the bandstop filter and the ideally filtered

signal were almost the same.

When the frequency domain was considered, the following results were obtained.

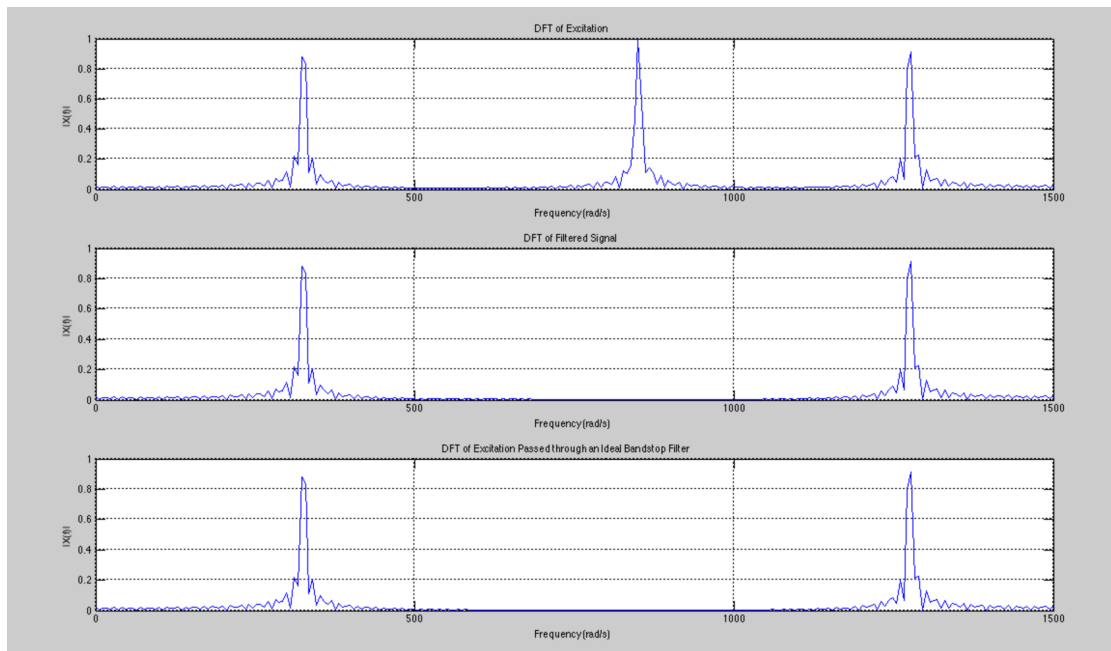


Figure 7.4: Frequency Domain Representation of the excitation, filtered excitation and the ideally filtered excitation

As the final step of the validation, the same filter was designed using the `designfilt` function of the MATLAB 2014a software package. The following magnitude response of the filter was obtained.

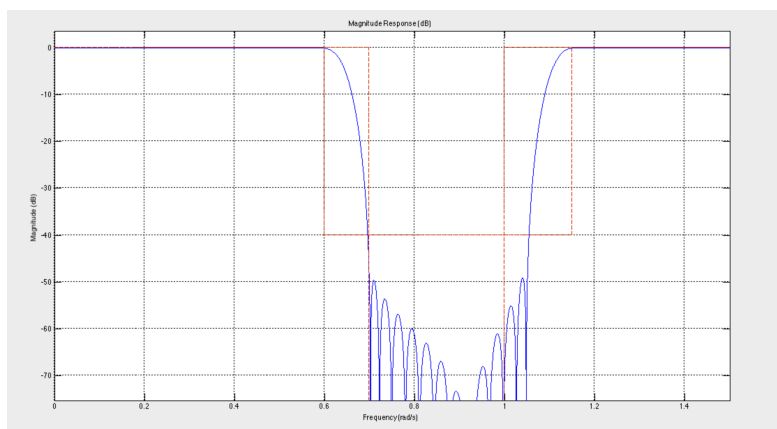


Figure 7.5: The magnitude response of the filter designed using the `designfilt` function

## 8 CONCLUSION

The Kaiser Window Function based Bandstop filter for the above specifications was successfully implemented adhering to the aforementioned procedure.

## 9 ACKNOWLEDGEMENTS

I would like to extend my sincere gratitude towards Dr.Chamira Edussooriya for providing valuable support during this project.

## 10 REFERENCES

- Digital Signal Processing: Signals, Systems, and Filters 1st Edition by Andreas Antoniou
- [https://en.wikipedia.org/wiki/Kaiser\\_window](https://en.wikipedia.org/wiki/Kaiser_window)
- [https://en.wikipedia.org/wiki/Kaiser\\_window](https://en.wikipedia.org/wiki/Kaiser_window)

## 11 APPENDIX

The following code was used to design, simulate and validate the band stop filter.

```
1 %EN2570 Digital Signal Processing – Project
2
3 clear all;
4 close all;
5
6 %K.G.G.L.A. de Silva
7 %150103P
8 %Last Updated : 2017 Nov 10
9
10 % Get A,B,C in 150ABC (index)
11
12 indexNo = str2double(inputdlg('Enter Index Number', 'Index Number',1));
13 C = mod(indexNo,10);
14 B = mod(floor(indexNo/10),10);
15 A = mod(floor(indexNo/100),10);
16
17 %A = 1; B = 0; C = 3;
18
19 %Calculate the paramteres
20
21 Ap = 0.05 + (0.01 * A);
22 Aa = 40 + B;
23 Omega_p1 = C*100 + 300;
24 Omega_p2 = C*100 + 850;
25 Omega_a1 = C*100 + 400;
26 Omega_a2 = C*100 + 700;
27 Omega_s = 2*(C*100 + 1200);
28
29
30
31 %Compute the transition width, cut off frequeuncies and sampling period
32
33 Bt = min((Omega_a1 - Omega_p1),(Omega_p2 - Omega_a2));
34 Omega_c1 = Omega_p1 + Bt/2;
35 Omega_c2 = Omega_p2 - Bt/2;
36 T = 2*pi / Omega_s;
37
38 %Compute delta value
39
```

```

40 delta_p = (10^(0.05*Ap) - 1)/(10^(0.05*Ap) + 1); delta_a = 10^(-0.05*Aa)
    ;
41 delta = min(delta_p, delta_a);
42
43 %Compute actual stop band attenuation
44
45 Aaa = -20*log10(delta);
46
47 %Choose Parameter alpha
48
49 if Aaa <= 21
50     alpha = 0;
51 elseif (21 < Aaa) && (Aaa <= 50)
52     alpha = 0.5842*(Aaa-21)^0.4 + 0.07886*(Aaa-21);
53 else
54     alpha = 0.1102*(Aaa-8.7);
55 end
56
57 %Choose parameter D
58
59 if Aaa <= 21
60     D = 0.9222;
61 else
62     D = (Aaa - 7.95)/14.36;
63 end
64
65 %Select N
66
67 if mod(ceil(Omega_s*D/Bt + 1), 2) == 1
68     N = ceil(Omega_s*D/Bt + 1);
69 else
70     N = ceil(Omega_s*D/Bt + 1) + 1;
71 end
72
73 %Compute and plot the Window function
74
75 range2 = (N-1)/2;
76 n = -range2 : 1 : range2;
77 beta = alpha*(1 - (2*n/(N-1)).^2).^0.5;
78 I_beta = 0; I_alpha = 0;
79 for k = 1 : 100
80     I_beta = I_beta + ((1/factorial(k))*(beta/2).^k).^2;
81     I_alpha = I_alpha + ((1/factorial(k))*(alpha/2)^k).^2;
82 end

```



```

83
84 I_beta = I_beta + ones(1,numel(I_beta));
85 I_alpha = I_alpha + ones(1,numel(I_alpha));
86
87 w = I_beta./I_alpha;
88
89 figure;stem(n,w, 'fill ');
90 xlabel('n');ylabel('w[n]');title('Windowing Function');
91 grid on;
92
93 %Compute and plot h[n]
94
95 range1 = (N-1)/2;
96 n1 = -range1 : 1 : -1;
97 h1 = ((1/pi)./n1).*(sin(Omega_c1*T.*n1) - sin(Omega_c2*T.*n1));
98 h0 = 1 + 2*(Omega_c1 - Omega_c2)/Omega_s;
99 n2 = 1 : 1 : range1;
100 h2 = ((1/pi)./n2).*(sin(Omega_c1*T.*n2) - sin(Omega_c2*T.*n2));
101 h = [h1,h0,h2];
102 n = [n1,0,n2];
103 figure;stem(n,h, 'fill ');grid on;
104 xlabel('n');ylabel('h[n]');title('Impulse Response of Ideal Bandstop
    Filter');
105
106 %Compute the filter response
107
108 h_filter = h.*w;
109
110 %subplot(1,2,1);
111 stem(n, h_filter);
112 xlabel('n');ylabel('h[n]');title('Impulse Response of Non Causal Filter'
    );grid on;
113 n_shifted = [0:1:N-1];
114 %subplot(1,2,2);
115 stem(n_shifted, h_filter, 'fill ');
116 xlabel('n');ylabel('h[n]');title('Impulse Response of Causal Filter');
    grid on;
117
118 %Magnitude Response of the filter
119
120 fvtool(h_filter);
121 freqz(h_filter);
122
123 %generate the excitation

```

```

124
125 n = 0 : 1 : 300;
126 L = numel(n);
127 x = sin(325*T*n) + sin(850*T*n) + sin(1275*T*n);
128
129 %Plot the DFT of the excitation
130
131 NFFT = 2^nextpow2(L); % Next power of 2 from length of y
132 Y = fft(x,NFFT)/L;
133 f = (Omega_s)/2*linspace(0,1,NFFT/2+1);
134 figure;
135 subplot(3,1,1);
136 plot(f,2*abs(Y(1:NFFT/2+1)));
137 title('DFT of Excitation')
138 xlabel('Frequency (rad/s)')
139 ylabel('|X(f)|'); grid on;
140
141 %Plot the DFT of filtered signal
142
143 x_f = conv(x,h_filter,'same');
144 L = numel(x_f);
145 NFFT = 2^nextpow2(L); % Next power of 2 from length of y
146 Y = fft(x_f,NFFT)/L;
147 f = (Omega_s)/2*linspace(0,1,NFFT/2+1);
148 subplot(3,1,2);
149 plot(f,2*abs(Y(1:NFFT/2+1)));
150 title('DFT of Filtered Signal')
151 xlabel('Frequency (rad/s)')
152 ylabel('|X(f)|'); grid on;
153
154
155 %Plot the DFT of the excitation passed through an ideal bandstop filter
156
157 x_i = sin(325*T*n) + sin(1275*T*n);
158 L = numel(n);
159 NFFT = 2^nextpow2(L); % Next power of 2 from length of y
160 Y = fft(x_i,NFFT)/L;
161 f = (Omega_s)/2*linspace(0,1,NFFT/2+1);
162 subplot(3,1,3);
163 plot(f,2*abs(Y(1:NFFT/2+1)));
164 title('DFT of Excitation Passed through an Ideal Bandstop Filter')
165 xlabel('Frequency (rad/s)')
166 ylabel('|X(f)|'); grid on;
167

```

```

168 %Plot the excitation in time domain
169
170 figure;
171 stem(n,x,'r','fill');
172 title('Excitation in the Time Domain')
173 xlabel('n')
174 ylabel('x[n]');grid on;
175
176 %Plot the Filtered signal in the time domain
177
178 nl = [0:1: numel(x_f)-1];
179
180 figure;
181 stem(nl,x_f,'r','fill');
182 title('Filtered Signal in the Time Domain')
183 xlabel('n')
184 ylabel('x[n]');grid on;
185
186 %Plot the Ideally Filtered signal in the time domain
187
188 figure;
189 stem(n,x_i,'r','fill');
190 title('Ideally Filtered Signal in the Time Domain')
191 xlabel('n')
192 ylabel('x[n]');grid on;
193
194 %Validation using the designfilt function
195
196 HpFilt = designfilt('bandstopfir','PassbandFrequency1',600, ...
197     'StopbandFrequency1',700,'StopbandFrequency2',1000,'
198     'PassbandFrequency2',1150,'PassbandRipple1',0.06, ...
199     'StopbandAttenuation',40,'PassbandRipple2',0.06,'DesignMethod
    ','kaiserwin','SampleRate',3000);
    fvtool(HpFilt);

```