Matlab© Exercise II: Active Noise Control with an FIR filter

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Question 1

Question 1.1

Question 1.2

```
% Initialization
    close all
    clear all
    % Load uncorrupted signal d
    % N is the number of samples (signal length)
    load gong.mat;
    [N, k] = size(y);
10
11
    \% Generate zero-mean white noise sequence g with standard deviation 0.35
12
    sg = 0.35;
    g = sg*randn(N,1);

g = g - mean(g);
14
15
    \% Generate noise sequences v1 and v2
17
18 \begin{vmatrix} a1 = [1 & -0.90]; & b1 = [1 & -.2]; \\ a2 = [1 & -0.95]; & b2 = [1 & -.3]; \end{vmatrix}
    \begin{vmatrix} \mathbf{v}_1 \\ \mathbf{v}_1 \end{vmatrix} = \mathbf{filter}(\mathbf{b}_1, \mathbf{a}_1, \mathbf{g});
20
    v2 = filter(b2, a2, g);
23 % Generate the corrupted signal x
    x = d + v1;
{\bf 26} \Big|\% Exercise 1: Determining the optimal FIR Wiener Filter
27 % Goal: reconstruct d from x and v2 by estimating v1 from v2
```

```
% Let n vary between the desired filter orders
29
30
    n = [1 \ 2 \ 4 \ 6];
   Stdd = zeros(length(n), 1);
31
    W_{tot} = zeros(max(n), length(n));
33
    for k = 1:4
    % First we determine Rv2 and Rv1v2 needed to set up the Wiener-Hopf
34
    % Calculate the first two values of rv2 (i.e. rv2(0) and rv2(1))
36
    \% using eq (3.116) from Hayes
^{37}
    h = dimpulse(b2, a2, 20);
38
    c(1,1) = b2(1)*conj(h(1)) + b2(2)*conj(h(2));
39
    c(2,1) = b2(2)*conj(h(1));
40
41
     rv2 = zeros(200,1);
42
    \begin{array}{lll} rv\,2\,(\,1\,) &=& (\,s\,g\,\widehat{\,\,}\,2*\,c\,(\,1\,,\,1\,)\,\,-\,\,a\,2\,(\,2\,)*\,s\,g\,\,\widehat{\,\,}\,(\,2\,,\,1\,)\,\,)\,/(1-a\,2\,(\,2\,)\,\,\widehat{\,\,}\,2\,)\,\,;\\ rv\,2\,(\,2\,) &=& sg\,\widehat{\,\,}\,2*\,c\,(\,2\,,\,1\,)\,\,-\,\,a\,2\,(\,2\,)*\,rv\,2\,(\,1\,)\,\,; \end{array}
43
44
^{45}
    % Calculate the rest of rv2 until it becomes (almost) zero
46
    % We only determine one side of the auto-correlation function and then
47
    % mirror, to get the double sided ACF (centered at index 200)
48
49
    for i = 3:200,
         rv2(i) = -1*a2(2)*rv2(i-1);
50
51
    end
    rv2 ds = [rv2(end:-1:1); rv2(2:end)];
52
53
    \% Next we determine the the cross-correlation function between v1 and v2
    bb = conv(b1, a2);
55
    aa = conv(b2, a1);
56
    rv1v2 ds = filter(bb, aa, rv2 ds);
57
58
    % Put rv2 and rv1v2 into matrix form for the Wiener-Hopf equations
59
60
    Rv2 = zeros(n(k), n(k));
    for i = 1:n(k)
61
62
         for j = 1:n(k)
              Rv2(i,j) = rv2_ds(200+j-i);
63
64
         end
65
    Rv1v2 = zeros(n(k), 1);
66
67
    for i=1:n(k),
         Rv1v2(i,1) = rv1v2 ds(200+i-1);
68
69
    % Solve for the optimal filter
71
   |W = Rv2 \setminus Rv1v2;
72
   v1e = filter(W,1,v2);
73
    de = x - v1e;
74
75
    % Save the necessary data necessary to evaluate the sound
76
   W_{tot}(1:length(W),k) = W;
77
   \operatorname{St}\overline{\operatorname{d}}\operatorname{d}(k) = \operatorname{st}\operatorname{d}(\operatorname{d}-\operatorname{de});
79
   end
```

Table 1: Output coefficients w(j) for the optimal FIR Wiener filter

| | Filter order m | | | |
|--------------------|------------------|---------|---------|---------|
| Coefficient $w(j)$ | 1 | 2 | 4 | 6 |
| w(0) | 0.7759 | 0.9209 | 0.9935 | 0.9995 |
| w(1) | 0 | -0.1623 | 0.0327 | 0.0487 |
| w(2) | 0 | 0 | -0.0765 | -0.0242 |
| w(3) | 0 | 0 | -0.2255 | -0.0514 |
| w(4) | 0 | 0 | 0 | -0.0859 |
| w(5) | 0 | 0 | 0 | -0.1916 |

Question 2

Table 2: Standard deviation σ_W between the sound d(n) and the estimated sound $x(n) - \hat{v_1}(n)$

| Filter order m | σ_W |
|------------------|------------|
| 1 | 0.2075 |
| 2 | 0.1996 |
| 4 | 0.1674 |
| 6 | 0.1362 |

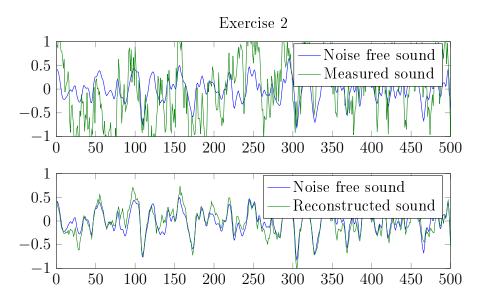


Figure 1: Subplot 1 shows the original sound and the noise corrupted signal. Subplot 2 shows the original sound and the filtered sound with optimal Wiener filter W(z) of order 6

Question 3

```
\% Exercise 3: Filter by approximating the correlation functions
   \% Goal: Approximate the auto- and cross correlation functions used in
             the Wiener-Hopf equations from the signals
3
4
   %n = input('Order filter: ');
    \% Let n vary between the desired filter orders
    n \ = \ \begin{bmatrix} 1 & 2 & 4 & 6 \end{bmatrix};
    Stdd2 = zeros(length(n),1);
    W_{tot2} = zeros(max(n), length(n));
9
    for k = 1: length(n)
    \% Construct an n by (N-n+1) matrix V2 containing shifted versions of v2
11
    V2 \; = \; \mathbf{z} \, \mathbf{e} \, \mathbf{r} \, \mathbf{o} \, \mathbf{s} \, (\, n \, (\, k \, ) \, \, , \  \, N\!\!-\!\! n \, (\, k \, ) +\!1) \, ;
12
13
    for i=1:n(k)
        V2(i,:) = v2(n(k)+1-i:N+1-i);
14
15
    end
16
    \% Use V2 and v1 to estimate Rv2 and Rv1v2
17
    rv2e = zeros(n(k), 1);
    for i = 1:n(k)
19
         rv2e(i) = sum(V2(1,:).*V2(i,:));
20
22
23
    \% Put rv2e in a Toeplitz matrix like in Exercise 2
    rv2e ds = [rv2e(end:-1:1); rv2e(2:end)];
24
    Rv2e = zeros(n(k),n(k));
25
26
    for i = 1:n(k)
         for j = 1:n(k)
27
              Rv2e(i,j) = rv2e ds(n(k)+j-i);
28
29
    end
30
    Rv 1v 2e = zeros(n(k), 1);
32
    for i=1:n(k),
33
         Rv1v2e(i,1) = sum(x(n(k):end).*(V2(i,:).'));
35
36
    % Calculate filter using Wiener-Hopf equations and reconstruct the signal
    w \ = \ \operatorname{Rv} 2e \backslash \operatorname{Rv} 1v 2e \, ;
38
39
    v1e = filter(w,1,v2);
    de = x - v1e;
40
41
    \% Save all the variables for the different values of n
    std (d-de);
43
    Stdd2(k) = std(d-de);
44
    W \cot 2(1: length(w), k) = w;
    end
46
```

Table 3: Output coefficients w(j) for the estimated FIR Wiener filter

| | Filter order m | | | |
|--------------------|------------------|---------|---------|---------|
| Coefficient $w(j)$ | 1 | 2 | 4 | 6 |
| w(0) | 0.7679 | 0.9200 | 0.9960 | 0.9995 |
| w(1) | 0 | -0.1689 | 0.0339 | 0.0513 |
| w(2) | 0 | 0 | -0.0783 | -0.0243 |
| w(3) | 0 | 0 | -0.2342 | -0.0548 |
| w(4) | 0 | 0 | 0 | -0.0885 |
| w(5) | 0 | 0 | 0 | -0.1956 |

Table 4: Standard deviation σ_w between the sound d(n) and the estimated sound $x(n) - \hat{v_1}(n)$

| Filter order m | σ_w |
|------------------|------------|
| 1 | 0.2177 |
| 2 | 0.2089 |
| 4 | 0.1750 |
| 6 | 0.1423 |

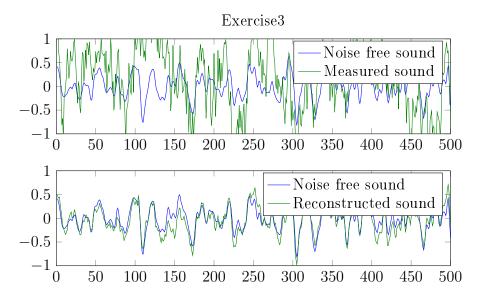


Figure 2: Subplot 1 shows the original sound and the noise corrupted signal. Subplot 2 shows the original sound and the filtered sound with estimated Wiener filter w(z) of order 6