

1. Given that

$$x(n) = \{4, -3, 2, -1, -5, 3, -1, 0\}, \quad n = 0 \rightarrow 7$$

(a) Using only 2-point FFTs, calculate the FFT of  $x(n)$

Here's the MATLAB script. Implemented for any size sequence  $x(n)$  where  $N$  is a power of 2

```

1  %% 1 part a
2
3  % sequence x(n)
4  x = [4, -3, 2, -1, -5, 3, -1, 0];
5
6  % get N, constant WN
7  N = length(x);
8  WN = exp(-1i * 2 * pi / N);
9
10 % result of FFT is result_x
11 result_x = x;
12 % temporary array holds values, go from one 2-point FFT to another
13 hold_x = bitrevorder(result_x);
14
15 % array to hold exponents for WN
16 exp_array = zeros(1, length(x) / 2);
17 % number of sections for corresponding FFTs
18 blocks = N / 2;
19
20 % loop through each layer of fast DFT algorithm
21 for n = 0:log2(N) - 1
22
23     % populate array for exponents of WN
24     for k = 0:2^n:(N / 2) - 1
25         exp_array(k + 1: k + 2^n) = 0:(N / 2^(n + 1)): (N / 2) - 1;
26     end
27
28     % a = index of exponents for WN
29     a = 1;
30     % other algorithm variables, will explain in a figure later
31     idx = 1;
32     for m = 1:blocks
33         for idx2 = 0:(2^n) - 1
34             index = idx + idx2;
35
36             % do the appropriate 2-point FFT
37             radix_res = fft([hold_x(index), (WN^exp_array(a)) * ...
38                             hold_x(index + 2^n)], 2);
39
40             % store results into result_x
41             result_x(index) = radix_res(1);
42             result_x(index + 2^n) = radix_res(2);
43
44             a = a + 1;
45         end
46         idx = idx + 2^(n + 1);
47     end
48     blocks = blocks / 2;
49     hold_x = result_x;
50 end

```

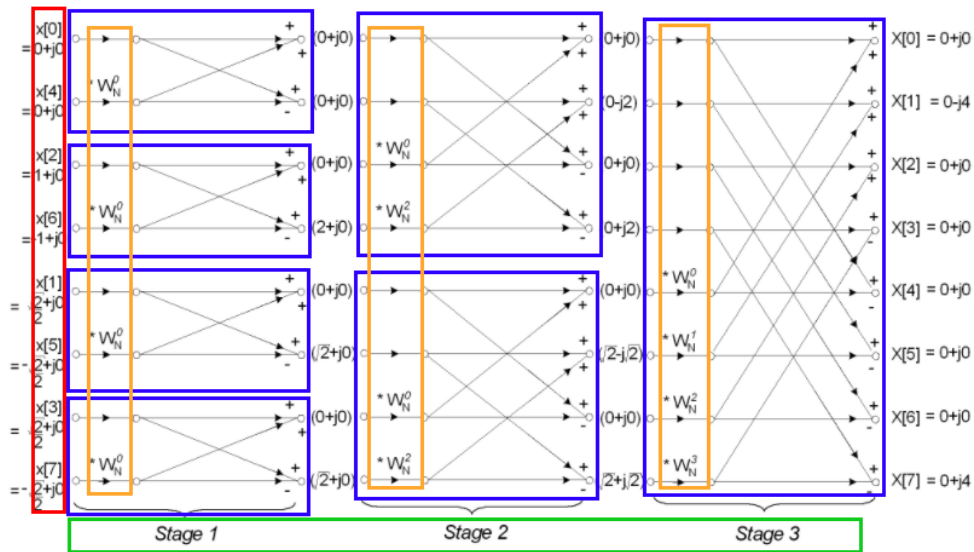


Figure 1: Annotated Radix-2 FFT diagram

Figure courtesy of

<https://riptutorial.com/algorithm/example/27088/radix-2-fft>.

In my algorithm shown above, the whole `for` loop is represented by the green sections, `blocks` is represented by the blue sections, the initial `bitreorder(x)` is done on `x` to represent the red section, and the `exp_array` is represented by the orange sections. As for the indices, the inner `for` loop loops through each block to appropriately compute the 2-point DFT.

Here is the resulting plot of `result_x` in MATLAB

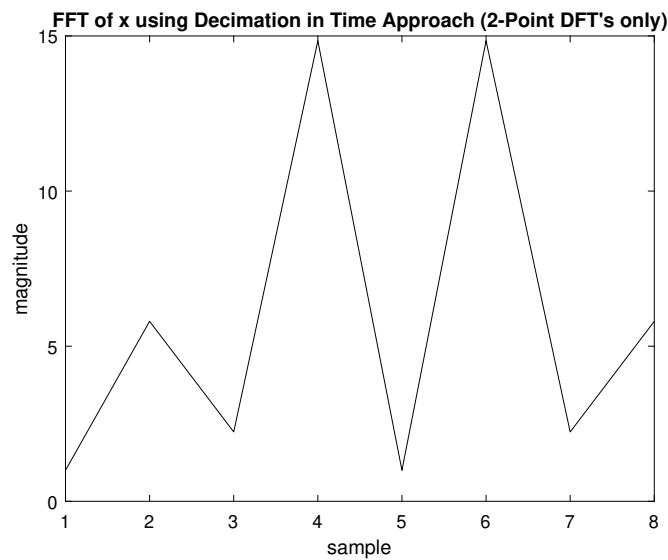


Figure 2: Radix-2 FFT magnitude result

(b) The standard 8-point DFT of  $x(n)$  using the MATLAB routine `fft` looks as such

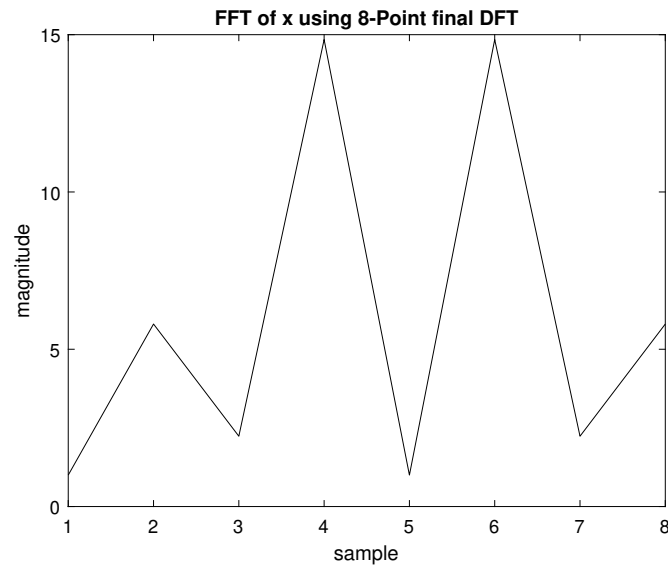


Figure 3: Standard 8-Point FFT magnitude result

(c) The results are identical, with an absolute difference on the magnitude of  $10^{-15}$

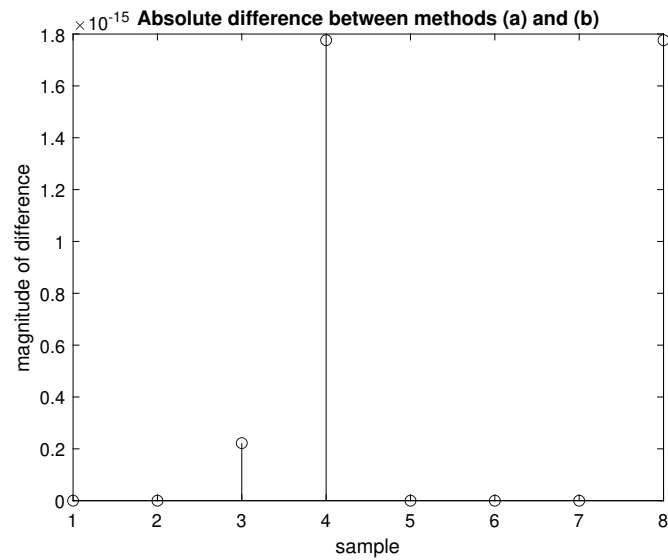


Figure 4: Absolute difference of results

2. (a) Get  $H(z)$  in the form

$$H(z) = E_1(z^4) + z^{-1}E_2(z^4) + z^{-2}E_3(z^4) + z^{-3}E_4(z^4)$$

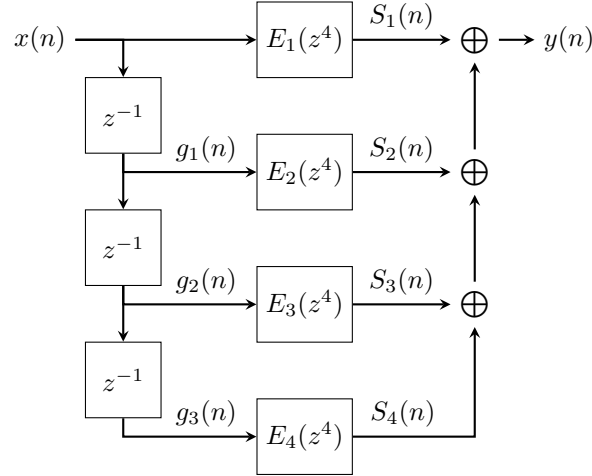
$$E_1(z) = 0.0168 + 0.0287z^{-1} + 0.2453z^{-2} - 0.0409z^{-3} \quad (1)$$

$$E_2(z) = 0.0264 - 0.1205z^{-1} - 0.1205z^{-2} + 0.0264z^{-3} \quad (2)$$

$$E_3(z) = -0.0409 + 0.2453z^{-1} + 0.0287z^{-2} + 0.0168z^{-3} \quad (3)$$

$$E_4(z) = 0.0334 + 0.6694z^{-1} + 0.0334z^{-2} \quad (4)$$

(b) Appropriate difference equation is given using the following diagram



$$g_1(n) = x(n-1) \quad (5)$$

$$g_2(n) = g_1(n-1) \quad (6)$$

$$g_3(n) = g_2(n-1) \quad (7)$$

$$S_1(n) = 0.0168x(n) + 0.0287x(n-4) + 0.2453x(n-8) - 0.0409x(n-12) \quad (8)$$

$$S_2(n) = 0.0264g_1(n) - 0.1205g_1(n-4) - 0.1205g_1(n-8) + 0.0264g_1(n-12) \quad (9)$$

$$S_3(n) = -0.0409g_2(n) + 0.2453g_2(n-4) + 0.0287g_2(n-8) + 0.0168g_2(n-12) \quad (10)$$

$$S_4(n) = 0.0334g_3(n) + 0.6694g_3(n-4) + 0.0334g_3(n-8) \quad (11)$$

$$y(n) = S_1(n) + S_2(n) + S_3(n) + S_4(n) \quad (12)$$

3. (a) The  $2N$ -point sequence  $y(n)$  is defined as

$$y(n) = \begin{cases} x(\frac{n+1}{2}), & n \text{ odd} \\ 0, & n \text{ even} \end{cases}$$

where  $X(k)$  is the  $N$ -point DFT of the sequence  $x(n)$  for  $n \in \{0, N-1\}$

The  $2N$ -point DFT of  $y(n)$  is defined as

$$Y(k) = \sum_{n=0}^{2N-1} y(n) e^{-j\frac{2\pi nk}{2N}} \quad (13)$$

And since  $\forall n_{\text{even}}, y(n) = 0$ , the sequence  $y(n)$  under the condition that  $n_{\text{odd}}$  summed equals the summated sequence  $x(n)$ . The only difference in the DFT would be the  $n$  in the exponential term, where it ranges from  $n = 0 \rightarrow N - 1 \forall n_{\text{odd}}$ , meaning

$$\sum_{n=0}^{2N-1} y(n)e^{-\frac{j2\pi nk}{2N}} = \sum_{n=0}^{N-1} x(n)e^{-\frac{j2\pi(2n-1)k}{2N}} \quad (14)$$

where  $2n - 1$  represents the circular odd integers from  $0 \rightarrow N - 1$ . Keep in mind, that  $k \in \{0, 2N - 1\}$ , so the second equation will be circularly evaluated twice

So that

$$Y(k) = e^{\frac{j2\pi k}{2N}} \sum_{n=0}^{N-1} x(n)e^{-\frac{j2\pi nk}{N}} = e^{\frac{j2\pi k}{2N}} X((k))_N, \quad k \in \{0, 2N - 1\} \quad (15)$$

(b) Given

$$X_3[k] = \frac{1}{N} \sum_{l=0}^{N-1} X_1[l]X_2[((k-l))_N]$$

show that  $x_3[n] = x_1[n]x_2[n]$

First, we know from sampling as well as the convolution theorem, that

$$N \sum_{r=-\infty}^{\infty} \delta[n - rN] \longleftrightarrow \sum_{k=-\infty}^{\infty} \delta(f - k/N) \quad (16)$$

so that

$$\frac{1}{N} \sum_{l=0}^{N-1} X_1[l]X_2[((k-l))_N] = \sum_{l=0}^{N-1} \sum_{n=0}^{N-1} \left( x_1[n]e^{-\frac{j2\pi nl}{N}} x_2[n]e^{-\frac{j2\pi n(k-l)}{N}} \right) \quad (17)$$

$$\sum_{n=0}^{N-1} x_3[n]e^{-\frac{j2\pi nk}{N}} = \sum_{l=0}^{N-1} \sum_{n=0}^{N-1} \left( x_1[n]x_2[n]e^{-\frac{j2\pi nl}{N}} e^{\frac{j2\pi nl}{N}} e^{-\frac{j2\pi nk}{N}} \right) \quad (18)$$

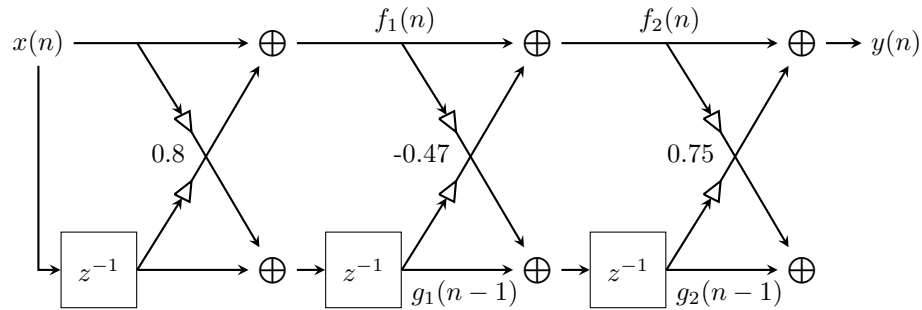
$$\sum_{n=0}^{N-1} x_3[n]e^{-\frac{j2\pi nk}{N}} = \sum_{n=0}^{N-1} x_1[n]x_2[n]e^{-\frac{j2\pi nk}{N}} \quad (19)$$

and then assuming element-wise equivalence, it is shown that

$$x_3[n] = x_1[n]x_2[n], \quad n = 0, 1, \dots, N - 1 \quad (20)$$

4. Consider an FIR lattice filter with coefficients  $K_1 = 0.8$ ,  $K_2 = -0.47$ ,  $K_3 = 0.75$

(a) Draw the FIR lattice filter



(b) The difference equations are

$$y(n) = f_2(n) + 0.75g_2(n-1) \quad (21)$$

$$g_2(n) = g_1(n-1) - 0.47f_1(n) \quad (22)$$

$$f_2(n) = f_1(n) - 0.47g_1(n-1) \quad (23)$$

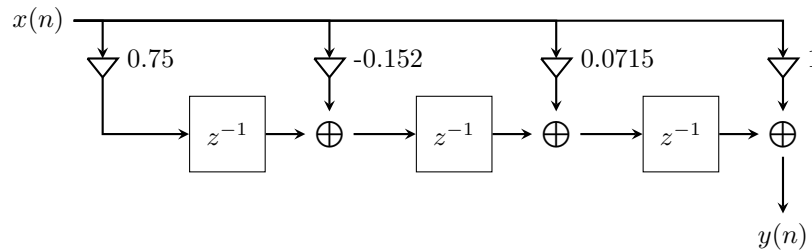
$$g_1(n) = x(n-1) + 0.8x(n) \quad (24)$$

$$f_1(n) = x(n) + 0.8x(n-1) \quad (25)$$

which gets reduced down to

$$y(n) = x(n) + 0.0715x(n-1) - 0.152x(n-2) + 0.75x(n-3) \quad (26)$$

(c) Draw the equivalent direct-form structure



5. Given

$$H(z) = 0.1325 - 0.0867z^{-1} + 0.4205z^{-2} + 1.3592z^{-3} + 0.4205z^{-4} - 0.0867z^{-5} + 0.1325z^{-6}$$

(a) We can split up the transfer function into multiple sections by knowing its roots. Since all roots are complex, the transfer function  $H(z)$  can be split up into multiple 2nd-order sections

$$H(z) = \frac{1}{0.1325} S_1(z) S_2(z) S_3(z) \quad (27)$$

where

$$S_1(z) = z^2 - 1.0184z + 31.0874 \quad (28)$$

$$S_2(z) = z^2 + 0.3968z + 1 \quad (29)$$

$$S_3(z) = z^2 - 0.0328z + 0.0322 \quad (30)$$

Where we can take any sections  $S_k(z)$  and  $S_l(z)$  where  $k \neq l$  to form either the first or second part of the cascaded filter. For this example, we will create the first filter  $F_1$  out of  $S_1(z)$  and  $S_2(z)$  while the second filter  $F_2$  will be  $S_3(z)$ . Using the algorithm in class, we find (by hand) that

$$F_1: K_1 = 0.1984, \quad K_2 = 1, \quad K_3 = -0.0317, \quad K_4 = 31.0874 \quad (31)$$

$$F_2: K_1 = -0.0317, \quad K_2 = 0.0322 \quad (32)$$

We can confirm this in MATLAB, where I wrote a function to do just this

```

1 function [Ks, gain] = fir_lattice(Hz)
2 % Author: Arpad Voros
3 % fir_lattice() routine takes in coefficients of a transfer function
4 % and determines the FIR Lattice coefficients
5 % INPUT:      Hz - array of H(z) coefficients
6 % OUTPUT:     Ks - coefficients of lattice, ordered from input to ...
7 %             output cell array, if needs to be split up (special cases)
8 %             gain - the amount of gain for a given lattice
9
10 % initialize some variables
11 order = length(Hz) - 1;
12
13 % initialize outputs
14 Ks = {};
15 gain = {};
16
17 % check special case
18 if Hz(1) == Hz(order + 1)
19     % include first gain
20     if Hz(1) ≠ 1
21         gain{end + 1} = Hz(1);
22     end
23
24     % split the roots
25     rootsHz = roots(Hz);
26     split = ceil(length(rootsHz) / 2);
27     if rootsHz(split) == conj(rootsHz(split + 1))
28         split = split + 1;
29     end
30
31     % recursive call
32     [Ks{end + 1}, gain{end + 1}] = fir_lattice(poly(rootsHz(1:split)));
33     [Ks{end + 1}, gain{end + 1}] = fir_lattice(poly(rootsHz(split + ...
34         1:end)));
35 else
36     % normalize, place into Az
37     if Hz(1) ≠ 1
38         gain{end + 1} = Hz(1);
39         Az = Hz / Hz(1);
40     else
41         Az = Hz;
42     end
43
44     % temporary coefficients to be appended to Ks
45     K = zeros(order, 1);
46
47     % loop
48     for n = order:-1:3
49         % get last coefficient

```

```

48     K(n) = Az(n + 1);
49
50     % reverse coefficients
51     Bz = flip(Az);
52
53     % get new value of Az
54     Az = (Az - K(n)*Bz)/(1 - K(n)^2);
55     Az = Az(1:end - 1);
56 end
57 % final two coefficients
58 K(2) = Az(3);
59 K(1) = Az(2) / (1 + K(2));
60
61 % append to rest of coefficients
62 Ks{end + 1} = K;
63 end
64
65 % delete empty cells
66 gain = gain(~cellfun('isempty', gain));
67 end

```

So by calling `fir_lattice` in the script below, we get

```

1 % coefficients of transfer function
2 h = [0.1325, -0.0867, 4.205, 1.3592, 4.205, -0.0867, 0.1325];
3
4 % display gain and K coefficients
5 [result, gain] = fir_lattice(h);
6 celldisp(gain);
7 celldisp(result);

```

```

gain{1} =          result{1}{1} =          result{2}{1} =

          0.1325          0.1984          -0.0317
                   1.0000          0.0322
                   -0.0317
                   31.0874

```

- (b) Superscripts in this section do not indicate exponentiation, but rather help distinguish between  $F_1$  and  $F_2$ , where  $f_k^1$  and  $g_k^1$  correspond to  $F_1$  while  $f_k^2$  and  $g_k^2$  correspond to  $F_2$ . The appropriate difference equations for the cascaded filter above are

$$y(n) = f_1^2(n) + 0.0322g_1^2(n-1) \quad (33)$$

$$g_1^2(n) = f_4^1(n-1) - 0.0317f_4^1(n) \quad (34)$$

$$f_1^2(n) = f_4^1(n) - 0.0317f_4^1(n-1) \quad (35)$$

$$f_4^1(n) = f_3^1(n) + 31.0874g_3^1(n-1) \quad (36)$$

$$g_3^1(n) = g_2^1(n-1) - 0.0317f_2^1(n) \quad (37)$$



$$f_3^1(n) = f_2^1(n) - 0.0317g_2^1(n-1) \quad (38)$$

$$g_2^1(n) = g_1^1(n-1) + f_1^1(n) \quad (39)$$

$$f_2^1(n) = f_1^1(n) + g_1^1(n-1) \quad (40)$$

$$g_1^1(n) = x(n-1) + 0.1984x(n) \quad (41)$$

$$f_1^1(n) = x(n) + 0.1984x(n-1) \quad (42)$$