

### CONCEPTS, APPLICATIONS, AND SCIENCE

# **Chapter 7 PROGRAMMING EXERCISE**

## **Creating FIR Filters in C++**

FIR (finite impulse response) filters are time-domain audio filters that work by applying convolution to audio data represented in the time domain. Their operation is sketched in Figure 1.

Convolve **x** with **h** to get **y**. 
$$\mathbf{y}(\mathbf{n}) = \mathbf{h}(\mathbf{n}) \otimes \mathbf{x}(\mathbf{n})$$

$$\mathbf{h} = [\mathbf{a}_0, \, \mathbf{a}_1, \, \mathbf{a}_2, \, \mathbf{a}_3, \, \mathbf{a}_4]$$

$$\mathbf{y}(5) = \mathbf{a}_4 \mathbf{x}_0 + \mathbf{a}_3 \mathbf{x}_1 + \mathbf{a}_2 \mathbf{x}_2 + \mathbf{a}_1 \mathbf{x}_3 + \mathbf{a}_0 \mathbf{x}_4$$
filter coefficients
$$\mathbf{a}_4 \ \mathbf{a}_3 \ \mathbf{a}_2 \ \mathbf{a}_1 \ \mathbf{a}_0$$

$$\mathbf{x}_0 \ \mathbf{x}_1 \ \mathbf{x}_2 \ \mathbf{x}_3 \ \mathbf{x}_4$$
audio samples

To compute y(6), slide x to the left.

Figure 1 Convolution with an FIR filter

The filter is essentially an array of multipliers that is run as a "mask" across the audio samples. The multipliers are sometimes referred to as *taps*. The number of taps affects the precision of the filter. In general, the more taps there are, the more precise the filter is in filtering out unwanted frequencies. However, more taps require more memory and computation time. Filtering is accomplished by giving each sample a new value based on multiplying the filter values by neighboring samples and summing them, as shown in the figure. The operation is defined mathematically as follows:

Given a digital audio signal x(t) of size L in the time domain and an FIR filter h(k) of size N, the FIR filtering operation is defined by

$$\mathbf{y}(t) = \mathbf{h}(k) \otimes \mathbf{x}(t) = \sum_{k=0}^{N-1} h(k)\mathbf{x}(t-k)$$

where x(t - k) = 0 if t - k < 0.

y(t) is the filtered audio signal.

A graph of the values in an FIR filter takes the shape shown in Figure 2. This is the shape of a *sinc function*. A sinc function is the product of a sine function and a monotonically decreasing function. Its basic form is

$$sinc(x) = \begin{cases} \frac{\sin(x)}{x} for \ x \neq 0 \\ 1 for \ x = 0 \end{cases}$$



Figure 2 Graph of a sinc function, the shape of an FIR filter

In this exercise, we explore how you create a filter of the proper shape in order to filter out the frequencies you don't want and keep the ones you do want.

There are four commonly-used types of FIR filters: low-pass, high-pass, bandpass, and bandstop. A low-pass filter leaves in only frequencies below a cutoff frequency  $f_c$ . A high-pass filter leaves in only frequencies above a cutoff frequency  $f_c$ . A bandpass filter leaves in only frequencies between  $f_1$  and  $f_2$ . A bandstop filter leaves in only frequencies below  $f_1$  or above  $f_2$ .

The algorithms for low-pass, high-pass, bandpass, and bandstop filters are given below. These algorithms create the filters. After the filters are created, you have to apply them to the audio data with convolution, so you'll also have to write a convolution function.

```
algorithm FIR low pass filter
Input:
      f c, the cutoff frequency for the low-pass filter, in Hz
      f samp, sampling frequency of the audio signal to be filtered, in Hz
      N, the order of the filter; assume N is odd
Output:
      a low-pass FIR filter in the form of an N-element array */
//Normalize f c and \boldsymbol{\omega} c so that \boldsymbol{\pi} is equal to the Nyquist angular frequency
   fc = fc/fsamp
   \omega c = 2*\pi*f c
   \overline{\text{middle}} = N/2
                 /*Integer division, dropping remainder*/
   for i = -N/2 to N/2
      if (i == 0) fltr(middle) = fltr(middle) = 2*f c
      else fltr(i + middle) = \sin(\omega c^*i)/(\pi^*i)
//Now apply a windowing function to taper the edges of the filter, e.g.
//Hamming, Hanning, or Blackman
```

### Algorithm 1 Low-pass filter

```
algorithm FIR high pass filter
Input:
      f c, the cutoff frequency for the high pass filter, in Hz
      f samp, sampling frequency of the audio signal to be filtered, in Hz
      N, the order of the filter; assume N is odd
Output:
      a high-pass FIR filter in the form of an N-element array */
//Normalize f c and \omega c so that \pi is equal to the Nyquist angular frequency
  f_c = f_c/f_samp
  \omega c = 2*\pi*f c
  middle = N/2 /*Integer division, dropping remainder*/
  for i = -N/2 to N/2
      if (i == 0)
                  fltr(middle) = 1 - 2*f c
      else fltr(i + middle) = -\sin(\omega c^*i)/(\pi^*i)
//Now apply a windowing function to taper the edges of the filter, e.g.
//Hamming, Hanning, or Blackman
```

Algorithm 2 High-pass filter

```
algorithm FIR bandpass filter
/*
Input:
      fl, the lowest frequency to be included, in Hz
      f2, the highest frequency to be included, in Hz
      f samp, sampling frequency of the audio signal to be filtered, in Hz
      N, the order of the filter; assume N is odd
Output:
      a bandpass FIR filter in the form of an N-element array */
//Normalize f c and \omega c so that \pi is equal to the Nyquist angular frequency
   f1 c = f1/f samp
   f2 c = f2/f samp
   \omega 1 c = 2 \times \pi \times f1 c
   \omega2 c = 2*\pi*f2 c
  middle = N/2
                  /*Integer division, dropping remainder*/
   for i = -N/2 to N/2
      if (i == 0) fltr(middle) = 2*f2 c - 2*f1 c
      else
         fltr(i + middle) = \sin(\omega 2_c^*i)/(\pi^*i) -
                            \sin(\omega 1 c*i)/(\pi*i)
//Now apply a windowing function to taper the edges of the filter, e.g.
//Hamming, Hanning, or Blackman
```

#### Algorithm 3 Bandpass filter

```
algorithm FIR bandstop filter
Input:
      fl, the highest frequency to be included in the bottom band, in \ensuremath{\text{\text{Hz}}}
      f2, the lowest frequency to be included in the top band, in \mbox{\rm Hz}
      Everything from f1 to f2 will be filtered out
      f samp, sampling frequency of the audio signal to be filtered, in Hz
      N, the order of the filter; assume N is odd
Output:
      a bandstop FIR filter in the form of an N-element array */
//Normalize f c and \omega c so that \pi is equal to the Nyquist angular frequency
   f1 c = f1/f samp
   f2 c = f2/f samp
   \omega 1 c = 2 \times \pi \times f1 c
   \omega 2 c = 2 \times \pi \times f2 c
   middle = N/2 /*Integer division, dropping remainder*/
   for i = -N/2 to N/2
      if (i == 0) fltr(middle) = 1 - 2*(f2 c - f1 c)
      else
          fltr(i + middle) = \sin(\omega 1 c^*i)/(\pi^*i) -
                             \sin(\omega 2 c*i)/(\pi*i)
//Now apply a windowing function to taper the edges of the filter, e.g.
//Hamming, Hanning, or Blackman
```

Algorithm 4 Bandstop filter

Your assignment is to do the following for each type of filter given in the algorithms. Filters of size N=1025 should be fine, but you can experiment with other sizes as well.

- Implement the filter in C++.
- Write a convolution function.
- Try the filter on an audio file by convolving the audio file with the filter using your convolution function.
- Listen to the audio file before and after to see if you notice a difference.
- If you have MATLAB, Octave, or some equivalent program, you may want to export your filter and your audio files and graph them to verify your results. Your filters should have the shape of a sinc function. In MATLAB, you can take the Fourier transform of the audio data before and after filtering to verify that the correct frequencies have been filtered out.