For all homework throughout the semester you must do the following:

- 1. Explain in your own words what is being asked.
- 2. State your strategy for arriving at the solution.
- 3. Execute your strategy noting the steps.
- 4. Write legibly and in a logical order.

The purpose of this homework is to study and implement a filter bank based on wavelet spline filters. These filters have many interesting properties and are commonly used in signal processing.

Grading guidelines

- The theoretical part should be solved with pen and paper.
- For the experiments, you can use the programming language of your choice: C, Python, MATLAB, etc. You will not get credit for your code if you do not add comments in the code.
- You will only get credit for an experiment or a result if it includes a discussion that connects the experiment with a theoretical analysis.
- Discuss the issues that you encountered as you performed the experiments.

Theory

Consider the filter H_0 defined by

$$H_0(z) = -\frac{1}{8}z^{-2} + \frac{1}{4}z^{-1} + \frac{3}{4} + \frac{1}{4}z - \frac{1}{8}z^2$$
 (1)

- 1. Find all the zeroes and poles of H_0 , and factorize the filter. Is H_0 lowpass, highpass, or band pass?
- 2. Compute the frequency response $H_0(e^{j\omega})$ and show that H_0 has linear phase.
- 3. Plot the magnitude of the frequency response using Matlab.
- 4. Find the coefficients *a* and *b* of the filter

$$F_0(z) = az^{-1} + b + az (2)$$

so that

$$H_0(z)F_0(z) + H_0(-z)F_0(-z) = 2.$$
 (3)

- 5. Find all the zeroes and poles of F_0 , and factorize the filter. Is F_0 lowpass, highpass, band pass?
- 6. Compute the frequency response of F_0 .

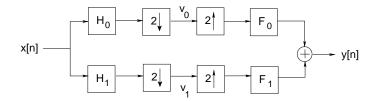


Figure 1: A maximally decimated, two channel filter bank

7. The filters H_0 and F_0 are used in the filter bank scheme described in Fig. 1. The filters H_1 and F_1 are defined by

$$F_1(z) = z^{-1}H_0(-z)$$
 and $H_1(z) = zF_0(-z)$. (4)

Give the expression of $f_1[n]$, and $h_1[n]$ in terms of $h_0[n]$ and $f_0[n]$ respectively.

8. Prove that the system provides a perfect reconstruction (up to a delay n_0 that you will determine),

$$y[n] = x[n - n_0]$$

Experiments

The goal of the experiments is to implement the filter bank scheme, and understand the concept of perceptual audio coding that is used in MP3, AAC, etc.

1. Write a MATLAB function filtdec that filters a sequence x[n] with a filter h[n], and downsamples the result by a factor 2. You should extend the signal x[n], $n = 1, \dots, N$ on each side using the following mirroring scheme :

$$x[-n] = x[n+1], \quad x[N+n] = x[N-n+1], \quad n = 0, 1, \cdots$$
 (5)

2. Write a MATLAB function upfilt that upsamples a sequence v[n] by a factor 2, and filters the result with a filter f[n]. You should extend the signal v[n], $n = 1, \dots, N$ on each side using the following mirroring scheme :

$$v[-n] = v[n+1], \quad v[N+n] = v[N-n+1], \quad n = 0, 1, \cdots$$
 (6)

- 3. Download the audio files http://ece.colorado.edu/~fmeyer/class/ecen4632/tracks.zip
- 4. Load one audio file. For instance,
 - > [x,fs]=audioread('electronic1.wav');
 > whos
 whos
 Name Size Bytes Class Attributes

 fs 1x1 8 double
 x 639451x1 5115608 double

x is the left channel of a stereo audio file. fs is the sampling rate, 22,050 Hz.

5. Apply the function filtdec with h_0 , and h_1 to the audio signal. You obtain two signals v_0 and v_1 .

6. Compute and display the magnitude of the Fourier transform of v_0 and v_1 . How do the Fourier transforms compare to the frequency responses $H_0\left(e^{j\omega}\right)$ and $H_1\left(e^{j\omega}\right)$ of the respective filters? You will need to display the logarithm of the Fourier transform using, e.g. the function log10.

Hint: type 'doc fft' and familiarize yourself with the cumbersome format that MATLAB uses to return the Fourier transform.

7. Play both filtered signal (at a slower rate) using the command:

```
> slowrate = fs/2;
> sound (filtered, slowrate);
```

Can you hear a difference between the signals?

- 8. Apply the function upfilt to v_0 and v_1 using the filters f_0 and f_1 respectively.
- 9. Construct the signal y[n] (see Fig. 1), and compute the difference with x[n]. Can your filter bank reconstruct exactly x[n] (up to a delay)?
- 10. Repeat questions 3. to 7. for the five audio files: classical1.wav, electronic1.wav, jazz1.wav, rock1.wav, world1.wav'. Compare the effect of the filter bank on the various tracks: provide an answer that is based on the appearance of the Fourier transform plot, and your auditory perception of the filtered signals.
- 11. Based on the plots of the Fourier transform of the original signal and the Fourier transforms of v_0 and v_1 , explain for which of the five tracks we could ignore v_0 or v_1 . Confirm your quantitative analysis with a perceptual validation by listening to the outputs v_0 and v_1 . By discarding v_0 or v_1 , you have implemented a simple perceptual audio coder.