

## ECE431 Homework 4

Due Friday, September 28 at 3pm. Submit to ECE431 mobile file in WisCEL.

4.1. Oppenheim and Schaffer 4.32.

**4.2. Quantization Noise.** Analog-to-digital converters sample continuous-time signals at uniformly spaced time intervals and quantize or round the amplitude of the sampled signal to a set of discrete levels in order to produce a value that can be stored in a computer. If a A/D converter has  $b$  bits of resolution, then it quantizes each sample to one of  $2^b$  levels. Note that there are  $2^b$  different numbers that can be represented using  $b$  bits - hence the number of levels. The difference between the true amplitude of a sample and the quantized amplitude may be modeled as a noise. Memory for storing the signal and A/D cost increase as  $b$  increases.

For example, CD quality audio is based on a 16-bit quantization because humans cannot audibly detect the difference between the “live” sound and sound sampled with 16 bits. Grayscale images are often quantized to 8 bits.

In this problem we will explore the characteristics of quantization noise using a music clip. We will assume that the amplitude of the music at each sample is continuous valued. This is a reasonable approximation because MATLAB employs double precision floating point numbers, which has much, much finer resolution than the quantization associated with the number of bits  $b$  used here to model an A/D converter. In MATLAB we will simulate quantization by applying the `round` command after scaling the signal to lie in the range from  $-2^{b-1} + 1$  to  $2^{b-1}$ . The `sound` command assumes signals are scaled to the interval  $[-1, 1]$ , so to quantize a signal `song` that has amplitudes between -1 and 1, we may apply `round` as follows:

```
quantsong = round(song*c)/c
```

where  $c = 2^{b-1} - 1$ . That is, first we scale `song` by `c` so that the quantization levels are integers (signal range is  $-2^{b-1} + 1$  to  $2^{b-1} - 1$ , then we round to quantize, and finally divide by `c` to restore the original amplitude range. For example, we may simulate quantization with  $b = 6$  or (64 amplitude levels) with the command `quantsong6 = round(song*31)/31`. You can compute the quantization noise by subtracting the quantized signal from the original signal.

Load the data from file `Bach44.mat`. This contains `song` - the same Bach selection we’ve listened to before, but with the empty space at the start and `endt` removed.

a) Quantize `song` assuming  $b = 10$ ,  $b = 8$ , and  $b = 6$ . Play the quantized and original signals using `sound(quantsong, fs)`. Can you hear the quantization noise? At what

value of  $b$ ?

b) Calculate the signal to quantization noise ratio (SQNR) in dB for  $b = 10$ ,  $b = 8$ , and  $b = 6$  by using `var` to compute the variance of the signal `sf song` and the variance of the quantization noise. Does your observed SQNR change by 6 dB/bit as the theory presented in class predicts?

For the remainder of this problem, assume  $b = 6$ .

c) Plot 500 values of the quantization noise from 5 different (well-separated) sections of the song. Is there a pattern evident?

d) Find the mean of the quantization noise and the maximum and minimum values. Is the mean approximately zero? How do the maximum and minimum values relate to  $b$ ?  
Hint: use MATLAB commands `mean`, `max`, `min`

e) Plot a histogram of the quantization noise with 100 bins using `hist(quantnse,100)`. Is a uniform probability distribution a good model for the distribution of the noise amplitude?

f) Now calculate the quantization noise for a sinusoid  $x[n] = \cos(2\pi n/32)$  for  $n = 0, 1, 2, \dots, 9999$  and repeat parts c) and e).

If you are curious, I suggest listening to `song` after quantizing it to 1 bit, as follows: `signsong = sign(song);`. This forces positive values to +1 and negative values to -1. Can you still recognize the piece with only 1 bit of information?