# University of Pennsylvania Department of Electrical and System Engineering Digital Audio Basics 

- Exam ends at 5:50Pm; begin as instructed (target 4:35PM)
- Do not open exam until instructed to begin exam.
- Problems weighted as shown.
- Calculators allowed.
- Closed book $=$ No text or notes allowed.
- Provided reference materials on next to last page.
- Show work for partial credit consideration.
- Unless otherwise noted, answers to two significant figures are sufficient.
- Sign Code of Academic Integrity statement (see last page for code).

I certify that I have complied with the University of Pennsylvania's Code of Academic Integrity in completing this exam.

Name: Solution


[^0]1. Consider the following sampling cases, complete the table entries.

2. Telephone digital voice uses PCM encoding with 8 KHz sample rate and 8 b amplitude quantization.
(a) What is the maximum frequency this sample rate can accurately capture? 4 K Hz - Nyquist frequency is one half the sampling rate.
(b) What is the sample period (length of time between samples)?
$\frac{1}{8000 \mathrm{~Hz}}=0.125 \mathrm{~ms}$
-1 using $1 / 4000$ instead of $1 / 8000$
-1 misplace decimal, but otherwise correct
(c) How many bits does this scheme require to record a 15 second voice-mail message? $8 \mathrm{~K} \times 8 \mathrm{~b} \times 15=960,000$
-2 using $4 K$ instead of $8 K$
3. Consider the following quote from Lt. Cmd. Vindman:

| 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| T | h | i | s |  | i | s |  | A | m | e | r | i | c | a | . |  |


| 17 | 18 | 19 | 20 | 21 | 22 | 23 | 24 | 25 | 26 | 27 | 28 | 29 | 30 | 31 | 32 | 33 | 34 | 35 | 36 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| H | e | r | e | , |  | r | i | g | h | t |  | m | a | t | t | e | r | s | . |

This has 37 symbols from a set of 16 unique symbols.

| symbol | A | H | T | . | , |  | a | c | e | g | h | i | m | r | s | t | sum |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| count | 1 | 1 | 1 | 2 | 1 | 5 | 2 | 1 | 4 | 1 | 2 | 4 | 2 | 4 | 3 | 3 | 37 |

(a) How many bits to encode this using a uniform encoding where each symbol is encoded using the same number of bits?
$37 \times \log _{2}(16)=148$
(b) Is this likely to be compressible with a variable-length symbol encoding? Why? Illustrate with specific symbols.
Yes. Some symbols (like space and 'e') occur much more frequently than others (like ',' and 'c'). We can assign short encodings to the common cases and longer encoding to the uncommon ones.
(c) What is the Shannon Entropy lower bound for for this quote?

$$
\begin{equation*}
\text { Lower Bound }=-\sum_{i} \log _{2}(P(c[i])) \tag{1}
\end{equation*}
$$

Hint: there are only 5 different counts, so 5 different $\mathrm{P}(\mathrm{c}[\mathrm{i}])$ values to calculate.
No one got full credit here. Problem should have been clearer that c[] is the 37 character input array. So this is formulated to add the lower bound encoding for each character.
$-\log _{2}(P(c[0]))-\log _{2}(P(c[1]))-\log _{2}(P(c[2]))-\log _{2}(P(c[3]))-\log _{2}(P(c[4])) \ldots$
$=-\log _{2}\left(P\left({ }^{\prime} T^{\prime}\right)\right)-\log _{2}\left(P\left(h^{\prime} h^{\prime}\right)\right)-\log _{2}\left(P\left({ }^{\prime} i^{\prime}\right)\right)-\log _{2}\left(P\left({ }^{\prime} s^{\prime}\right)\right)-\log _{2}\left(P\left(^{\prime} \quad \prime\right)\right) \ldots$ $=-\log _{2}\left(\frac{1}{37}\right)-\log _{2}\left(\frac{2}{37}\right)-\log _{2}\left(\frac{4}{37}\right)-\log _{2}\left(\frac{3}{37}\right)-\log _{2}\left(\frac{5}{37}\right) \ldots$
$=-(5) \log _{2}\left(\frac{5}{37}\right)-(3 \times 4) \log _{2}\left(\frac{4}{37}\right)-(2 \times 3) \log _{2}\left(\frac{3}{37}\right)-(4 \times 2) \log _{2}\left(\frac{2}{37}\right)-(6 \times 1) \log _{2}\left(\frac{1}{37}\right)$
$=139.6 \approx 140$
(d) Consider the following set of variable-length binary encodings. Assign each symbol to an encoding to minimize the encoded length.

| encode | 000 | 0010 | 0011 | 0100 | 01010 | 01011 | 0110 | 0111 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| symbol | SpC | . | a | h | A | H | m | t |
| encode | 10000 | 10001 | 1001 | 101 | 11000 | 11001 | 1101 | 111 |
| symbol | T | , | i | e | c | g | s | r |

There are several equivalent assignments.
Space, being the most frequent, must get one of the 3b encodings. Two of $\{e, i, r\}$, which each have 4 occurrences, should get the other two. There are seven, 5b encodings; these go to the one occurrence symbols, of which there are also seven. This leaves the 4b encodings for the remaining symbols which have occurrences of 2-4.
(e) For the above assignment, how many bits are required to encode the quote?

$$
(5+4+4) \times 3+(2+2+2+2+3+3+4) \times 4+(1+1+1+1+1+1+1) \times 5=141
$$

4. While watching a movie, which sounds are likely to annoy you (interfere with your preception and enjoyment...) during each of two scenes: (a) piano recital ( $25-4200 \mathrm{~Hz}$ ) at $40-80 \mathrm{~dB}$, (b) 100 dB explosion (broad spectrum $20-8,000 \mathrm{~Hz}$ )?
Classify each as: (U)nnoticeable, (H)ighly annoying, (L)ightly annoying

|  | piano | explosion |
| :---: | :---: | :---: |
| $770 \mathrm{~dB}, 45 \mathrm{KHz}$ squeak | U | U |
| $60 \mathrm{~dB}, 2-3 \mathrm{KHz}$ child cry | H | U |
| $20 \mathrm{~dB}, 100-300 \mathrm{~Hz}$ whisper | L | U |
| $40 \mathrm{~dB}, 5 \mathrm{~Hz}$ mechanical vibration | U | U |
| $50 \mathrm{~dB}, 11 \mathrm{KHz}$ electronic whine | H | H |

- 45 KHz is above the highest band for human hearing
- The child crying is in sensitive auditory bands and likely to be louder than the piano notes in those bands at some points during the piano recital.
- The explosion is broad spectrum with louder components than the child in the bands in which the cry occurs. As such, it likely masks the child cry.
- The whisper is low volume, but might be audible during periods when no notes occur in the identified speech bands.
- The whisper is masked by the loud, broad-spectrum explosion.
- 5 Hz is below the lowest band for human hearing.
- The 11 KHz noise is within the human auditory band, and above the bands for either the piano or explosion, making it audible in both cases.

5. Assume for simplicity in this problem that each band has 30 discernable frequencies. We allocate 180b to encode each band. Assume 16b quantization is essentially perfect (zero error). The error for a frequency is a value between 0 and 1 equal to

$$
\begin{equation*}
\operatorname{Error}(f)=\frac{\mid \text { ActualFrequency }- \text { EncodedFrequency } \mid}{2^{16}} \tag{2}
\end{equation*}
$$

Encoding to k-bit quantization means an encoded value of $e$ will be interpreted as an EncodedFrequency of $e \times 2^{16-k}$.
(a) If we assign equal quantization to every frequency in the band, how many bits can we use to represent the amplitude of each frequency?

$$
\frac{180}{30}=6
$$

(b) Ignoring masking, what is the maximum possible total error across the entire band? (sum up the errors across all frequencies in the band.)
Maximum difference is $2^{16-6} / 2=2^{9}$; divide by two because can round up or down.
$30 \times \frac{2^{9}}{2^{16}}=0.23$
(c) Assuming anything with amplitude $20 \%$ below the maximum frequency in the band is masked and contributes no subjective error. Assume frequencies within the $20 \%$ bound contribute a subjective error equal to the full Error(f) stated above. Assume for simplicity omitted frequencies do not cost encoding bits.
i. What is the maximum number of loud (amplitude within $20 \%$ of maximum amplitude frequency in the band) frequencies that a band can have and achieve a zero subjective error encoding?
$\frac{180}{16}=11$
ii. What is the maximum possible subjective error when there are 15 loud frequencies (amplitude within $20 \%$ of maximum amplitude frequency in the band) and you assign equal quantization to these loud frequencies.
$\frac{180}{15}=12 \mathrm{~b}$ each
$30 \times \frac{2^{16-12-1}}{2^{16}}=0.0037$
6. Given: $f(t)=0.3 \cos (2 \pi \cdot 400 t)+\sin (2 \pi \cdot 600 t)+0.2 \sin (2 \pi \cdot 700 t)$
give the second, tenth, and twenty-third time-sample values of $f(t)$ for a 4 KHz sample rate.

| sample | 2 | 10 | 23 |
| :---: | :---: | :---: | :---: |
| time $(t)$ | 0.5 ms | 2.5 ms | 5.75 ms |
| value $f(t)$ | 1.2 | 0.10 | 0.25 |
| $\cos (2 \pi \cdot 400 t)$ | 0.31 | 1.0 | -0.31 |
| $\sin (2 \pi \cdot 600 t)$ | 0.95 | 0.0 | 0.31 |
| $\sin (2 \pi \cdot 700 t)$ | 0.81 | -1.0 | 0.16 |

You only need to complete the value row. Other rows are likely useful to assembling your solution and showing your work for partial credit.
reasonable to treat first sample as 0 , so times of $0.25 \mathrm{~ms}, 2.25 \mathrm{~ms}$, 5.5 ms
-2 if one value wrong
-3 if looks like mistakenly computed sin/cos on degrees for values that are actually in radians.
7. Early telephones used DTMF (dual-tone, multiple frequency)-signalling to send signals including phone number digits. They used pairs of frequencies (the dual tone) to represent each symbol. The table below shows how pairs formed from 2 sets of 4 frequencies were used to represent 16 symbols:

|  | 1209 Hz | 1336 Hz | 1477 Hz | 1633 Hz |
| :--- | :---: | :---: | :---: | :---: |
| 697 Hz | 1 | 2 | 3 | A |
| 770 Hz | 4 | 5 | 6 | B |
| 852 Hz | 7 | 8 | 9 | C |
| 941 Hz | $*$ | 0 | $\#$ | D |

Assume a tone must be present for at least 100 ms to be registered as a symbol and an absence of dual tone must occur for at least 20 ms to denote the separation between one symbol and the next.
(a) How would DTMF symbol detection and extraction work for a modern timesampled digital system listening to an analog line from an analog phone producing DTMF signals?

- Sample in time.
- Use Fourier Transform to convert to frequencies.
- (use 10 ms windows; so guaranteed to get an empty window between DTMF symbols.)
- Look for DTMF signal pairs in the frequency conversion. -1 point for not mention window size or use too large of a window size.
(b) If we just wanted a system to decode DTMF signals:
i. What is the minimum sample rate required for our time-sampled digital system?
$2 \times 1633 \approx 3300 \mathrm{~Hz}$
Nyquist Sampling Rate twice the maximum frequency component trying to capture.
ii. What analog filtering would be needed to support operation at this sample rate?
Low pass filter to remove frequencies above 1633 Hz to prevent aliasing.
-1 point for not being specific about filtering frequency.
(c) If you had an MP3 of a phone conversation where someone inadvertantly pushed a button on the phone that generated one or more DTMF signals, how could you clean it up? (produce a better MP3 that removed the audible DTMF tones)
- Look for DTMF frequency pairs in audio frames.
- If pair is present in a frame, remove (zero out) DTMF frequencies.
- Save out modified MP3.

The MP3 already represents things in frequency. -1 point for stating need to convert into (and out of) frequency.
(d) Assume you can place a digital processor between the microphone and analog output line on a phone (and similarly between the analog input line and the speaker). For legacy signalling over an analog line, how could you insert DTMF tones on the originating end and remove them at the destination so that the humans never heard them?

- Insert
- Capture with A2D
- Sample in time
- Perform inverse Fourier on the DTMF tone pair to create time samples for DTMF tones
- Add DTMF tone samples into time samples
- Render time samples back to analog through D2A
- Remove
- Capture with A2D
- Sample in time
- Perform Fourier Transform on time samples windows
- Look for DTMF signal in each window
- If present, note the symbol and remove the frequency pair from the frequency represenation
- Perform inverse Fourier Transform on each window to convert back to time samples
- Render time samples back to analog through D2A

8. Corporate sonic branding creates short audio snippets intended to identify the specific brand. For simplicity let's model the space of potential sounds as composed of four 100 ms chords, where each chord is composed of up to 3 frequencies.

- Assume at most 30 distinguishable frequencies per critical band.
- Restrict to the 20 bands from 2-21 to assure most people can hear the frequencies.
(a) Assuming we want to avoid masking in the design of the brand snippet, what restrictions should we place on the frequencies composing each chord (composition of 3 frequencies composed in each of the four 100 ms segments)?
Use a single frequency per critical band.
(b) Given this restriction, and assuming you don't want to differentiate brand snippets only by the amplitude of frequencies, how many potential 400 ms audio snippets are there?
For each 100 ms chord, we can choose 3 bands, hence the $\binom{20}{3}$. Within each of the 3 bands, there are 30 frequencies to choose from. Each 100 ms chord is independent, so we have the same range of choices for each of the four.
$\left(\left(\binom{20}{3}\right) 30^{3}\right)^{4} \approx 9.0 \times 10^{29}$
Technically, we can consider chords of 2,1 , or 0 notes, but that doesn't change the magnitude significantly.

$$
\left(\left(\binom{20}{3}\right) 30^{3}+\left(\binom{20}{2} 30^{2}+\left(\binom{(20}{1}\right) 30+1\right)^{4} \approx 9.2 \times 10^{29}\right.
$$

(c) How many bits of information does this represent?
$\log _{2}\left(9.0 \times 10^{29}\right) \approx 100$
(d) Assuming 25 ms sample windows, 4b amplitude quantization, and that you can model the MP3 as encoding the present frequencies and their associated amplitudes in each 25 ms window, how large (in bits) will the MP3s be to respresent these audio snippets?
Each window has 3 frequencies.
Each frequency might need 15b (could be 11b, if think about 1152 sample windows).
Each frequency pair takes about $15 b+4 b=19 b$.
$16,25 \mathrm{~ms}$ windows.
$19 \times 3 \times 16=912 b$

Human auditory critical bands:

| Band Number | Low | High |
| ---: | ---: | ---: |
| 1 | 20 | 100 |
| 2 | 100 | 200 |
| 3 | 200 | 300 |
| 4 | 300 | 400 |
| 5 | 400 | 510 |
| 6 | 510 | 630 |
| 7 | 630 | 720 |
| 8 | 720 | 920 |
| 9 | 920 | 1080 |
| 10 | 1080 | 1370 |
| 11 | 1270 | 1480 |
| 12 | 1480 | 1720 |
| 13 | 1720 | 2000 |
| 14 | 2000 | 2320 |
| 15 | 2320 | 2700 |
| 16 | 2700 | 3150 |
| 17 | 3150 | 3700 |
| 18 | 3700 | 4400 |
| 19 | 4400 | 5300 |
| 20 | 5300 | 6400 |
| 21 | 6400 | 7700 |
| 22 | 7700 | 9500 |
| 23 | 9500 | 12000 |
| 24 | 12000 | 15500 |
|  |  |  |

## Code of Academic Integrity

Since the University is an academic community, its fundamental purpose is the pursuit of knowledge. Essential to the success of this educational mission is a commitment to the principles of academic integrity. Every member of the University community is responsible for upholding the highest standards of honesty at all times. Students, as members of the community, are also responsible for adhering to the principles and spirit of the following Code of Academic Integrity.*

Academic Dishonesty Definitions
Activities that have the effect or intention of interfering with education, pursuit of knowledge, or fair evaluation of a student's performance are prohibited. Examples of such activities include but are not limited to the following definitions:
A. Cheating Using or attempting to use unauthorized assistance, material, or study aids in examinations or other academic work or preventing, or attempting to prevent, another from using authorized assistance, material, or study aids. Example: using a cheat sheet in a quiz or exam, altering a graded exam and resubmitting it for a better grade, etc.
B. Plagiarism Using the ideas, data, or language of another without specific or proper acknowledgment. Example: copying another person's paper, article, or computer work and submitting it for an assignment, cloning someone else's ideas without attribution, failing to use quotation marks where appropriate, etc.
C. Fabrication Submitting contrived or altered information in any academic exercise. Example: making up data for an experiment, fudging data, citing nonexistent articles, contriving sources, etc.
D. Multiple Submissions Multiple submissions: submitting, without prior permission, any work submitted to fulfill another academic requirement.
E. Misrepresentation of academic records Misrepresentation of academic records: misrepresenting or tampering with or attempting to tamper with any portion of a student's transcripts or academic record, either before or after coming to the University of Pennsylvania. Example: forging a change of grade slip, tampering with computer records, falsifying academic information on one's resume, etc.
F. Facilitating Academic Dishonesty Knowingly helping or attempting to help another violate any provision of the Code. Example: working together on a take-home exam, etc.
G. Unfair Advantage Attempting to gain unauthorized advantage over fellow students in an academic exercise. Example: gaining or providing unauthorized access to examination materials, obstructing or interfering with another student's efforts in an academic exercise, lying about a need for an extension for an exam or paper, continuing to write even when time is up during an exam, destroying or keeping library materials for one's own use., etc.

* If a student is unsure whether his action(s) constitute a violation of the Code of Academic Integrity, then it is that student's responsibility to consult with the instructor to clarify any ambiguities.


[^0]:    Average:

