

# BME 50500: Image and Signal Processing in Biomedicine

## **Lecture 1: Introduction, Digital Signals**



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#### Content

#### Linear systems in discrete time/space

Impulse response, shift invariance Convolution Discrete Fourier Transform Sampling Theorem Power spectrum

# Introduction to medial imaging modalities

MRI Tomography, CT, PET Ultrasound

#### **Engineering tradeoffs**

Sampling, aliasing Time and frequency resolution Wavelength and spatial resolution Aperture and resolution

#### Filtering

Magnitude and phase response Filtering Correlation Template Matching

#### **Intensity manipulations**

A/D conversion, linearity Thresholding Gamma correction Histogram equalization

#### Python and A/D conversion (DAQ) Recording signals



## Stuff you need

#### **Prerequisite:**

BME 405, complex variables, Fourier series, some programming

#### Literature (selected book chapters)

- Kayvan Najarian and Robert Splinter, Biomedical Signal and Image Processing, CRC Press, 2005.
- Eugene N. Bruce, 2001. Biomedical Signal Processing and Signal Modeling. Wiley.
- Semmlow, J.L., 2005. Circuits, Signals, and Systems for Bioengineers: A MATLABbased Introduction. Elsevier Academic Press.
- Jerry L. Prince & Jonathan Links, 2006. *Medical Imaging Signals and Systems*. Pearson.

#### Software

• Python or Matlab – we can select this together.

#### **Notes and Slides**

- These slides are not a complete record of the class material. They are only a brief reminder of what was discussed in class.
- Without careful notes you will not be able to study for your exams.



## Grading

60% assignments, 15% midterm exam, 25% final exam less than 60%: F 60% or more: D 70% or more: C 80% or more: B 90% or more: A 100% or more: A+

#### **Exams and quizzes:**

- Quizzes will test reading and programming homework (they are part of the 60%).
- Final exam will test everything.

#### Attendance:

- 100% attendance is expected (missing quiz = 0% credit)
- Homework assignments will include data recording which you complete independently using your own A/D board.
- If you miss class do not expect homework help from the TA.



### Assignments

- 1. Python programming
  - Due one week from assignment.
  - Turn in by email **prior to class**!
  - May have pop quizzes on programming assignments.
- 2. Reading
  - Understand the subject and cover gaps.
  - May have pop quizzes on reading assignments.
- 4. Data recordings
  - Will schedule lab time during class hours
  - You will start during class time and complete recordings as assignments using your own A/D equipment at home.
  - Contact the TA if you have not yet received your own A/D board.
  - You must return this equipment at the end of the semester in order to receive a grade.

All written assignments must include: Name, date, course number, assignment number. Title whenever applicable. Form matters!



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### **Getting ready - Computers**

- All students must install python or matlab on their laptops.
- Instructions are here: https://www.parralab.org/teaching/signal-and-image/



### **Digital signals**





### **Discretization with amplification**



## **Typical sampling and discretization values**

| Audio:<br>b = 16 per sample (16 bit)<br>$f_s = 44100Hz$    | 3 bit         | 1 digit      |
|--|---------------|--------------|
| Two channels: stereo<br>Data type: int16 (-32767 0 +32768) | binary<br>000 | decimal<br>0 |
|  | 001           | 1            |
| Images:  | 010           | 2            |
| b = 8 per pixel, per color                                 | 011           | 3            |
| 3 colors RGB   | 100           | 4            |
| Data type: uint8 (0 255)                                   | 101           | 5            |
| Video:   | 110           | 6            |
| $f_s = 30$ Hz (frames per second)                          | 111           | 7            |

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 $N=2^{b}$ 



#### Discretization

2 gray levels



4 gray levels



8 gray levels



16 gray levels





32 gray levels

256 gray levels



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### **Discretization**

#### The problem with discretization is that it is a non-linear process.



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### **Non-linear Amplification**

Non-linearity creates artifacts in the *frequency domain*.



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#### Discretization

Harmonic distortion explained ...

For example distortion of quadratic nonlinearity leads to frequency doubling:

Cubic leads triple frequencies:

$$x(t) = \sin(\omega t)$$
  

$$y(t) = x^{2}(t) = \sin^{2}(\omega t) = \frac{1}{2} - \frac{1}{2}\cos(2\omega t)$$
  

$$y(t) = \sin^{3}(\omega t) = \frac{3}{4}\sin(\omega t) - \frac{1}{4}\sin(3\omega t)$$

General non-linearity contains all orders according to Taylor expansion:

$$y = f(x) = \sum_{n=0}^{\infty} \frac{1}{n!} \left[ \frac{\partial^n f(x)}{\partial x^n} \right]_{x=0} x^n$$



## Sampling

If the signal is sampled every  $\Delta t$  (in seconds) the sampling frequency (in Hz=s<sup>-1</sup>) is given by:

$$f_s = \frac{1}{\Delta t}$$

For images the resolution is given by pixel size  $\Delta x$  (in cm) or as pixels per cm:

$$f_s = \frac{1}{\Delta x}$$

The sampling theorem states that one has to sample a signal at least twice the frequency of the highest oscillation.

Therefore a 10Hz oscillation has to be sampled at least at every 1/20s.



## Sampling

If we violate that requirement we get aliasing:

Example:  $f(x,y) = sin(x^2 + y^2)$ . 720x240 pixels and amplitude scaled to [0 255] and discretized.



Sampling creates artifacts in the space (time) domain.

Assignment 1: Generate figures in slide 7, 8 and 13.



## Some python commands used in class

import numpy as np
import matplotlib.pyplot as plt

pi = np.pi

t = np.arange(2\*fs)/fs # time vector

```
plt.clf()
plt.subplot(2,2,1)
plt.plot(t,y)
plt.stem(t,y)
```

```
P=plt.imread('penny.jpeg').copy()
P[:,:,[0,2]]=0
plt.imshow(P)
```

P=np.mean(P,2)for x in np.arange(0,10): y=xplt.clf() crop = P[y:y+40,x:x+40] ax=plt.imshow(crop,cmap='gray') plt.pause(1/30) plt.show()

x=np.tile(np.linspace(0,1,700),(400,1)) y=x.T r2=x\*\*2+y\*\*2



## **Programming Assignments**

- Assignments are due within one week and are submitted per email to bme505@gmail.com.
- If you do not submit on time, you will get 0 (zero) credit.
- If there is a medical reason why you need extra time, you must ask for an extension before the deadline.
- Requests to extra time after the deadline will be declined.
- You are **not** allowed to collaborate on programming assignments. If you do, I twill look like copying which is strictly forbidden.
- If you copy code, both the author and the copier will get zero credit. Therefore, do not email each other programs, do not use USB drives to copy code, do not screen share code.
- Be sure to write comments in your code to explain what you are doing.
- Submit single executable file called: first\_last\_number.py
- Do not submit image files or text files. Only submit data if that is part of the assignment.
- Your program should not generate warnings.
- Programs that crash with an error message will receive 0 (zero) credit.
- Your program must load all required data. Assume that data files are in the current directory. All required data will be posted on the web, unless otherwise stated.
- The criteria for full credit should be clear. If not, please ask in class. Do not take chances by assuming that your work is "sort of correct".