ESE 3400: Medical Devices Lab

Lec 18: November 16, 2022 Quiz 2 Review



Signals and Systems





Discrete-time sinusoids $e^{j(\omega n + \phi)}$ have two counterintuitive properties

- **Property #1**: Aliasing

Property #2: Aperiodicity



- The signals x_1 and x_2 have different frequencies but are **identical!**
- We say that x_1 and x_2 are aliases; this phenomenon is called aliasing





• Consider
$$x_1[n] = e^{j(\omega n + \phi)}$$
 with frequency $\omega = \frac{2\pi k}{N}$, $k, N \in \mathbb{Z}$ (harmonic frequency)

It is easy to show that
$$\underline{x_1}$$
 is periodic with period N , since
 $x_1[n+N] = e^{j(\omega(n+N)+\phi)} = e^{j(\omega n+\omega N+\phi)} = e^{j(\omega n+\phi)} e^{j(\omega N)} = e^{j(\omega n+\phi)} e^{j(\frac{2\pi k}{N}N)} = x_1[n] \checkmark$



• Note: x_1 is periodic with the (smaller) period of $\frac{N}{k}$ when $\frac{N}{k}$ is an integer



$e^{j(\omega n + \phi)}$

 Semi-amazing fact: The only periodic discrete-time sinusoids are those with harmonic frequencies

$$\omega = \frac{2\pi k}{N}, \quad k, N \in \mathbb{Z}$$

Which means that

- Most discrete-time sinusoids are not periodic!
- The harmonic sinusoids are somehow magical (they play a starring role later in the DFT)



- Which is higher in frequency?
 - $\cos(\pi n)$ or $\cos(3\pi/2n)$?
- Periodic or not?
 - $\cos(5/7\pi n)$
 - $\cos(\pi/5n)$
 - If so, what are N and k? (I.e How many samples is one period?



DEFINITION

A system H is linear time-invariant (LTI) if it is both linear and time-invariant

LTI system can be completely characterized by its impulse response



 Then the output for an arbitrary input is a sum of weighted, delay impulse responses

$$x \longrightarrow h \longrightarrow y \qquad y[n] = \sum_{m=-\infty}^{\infty} h[n-m] x[m]$$
$$y[n] = x[n] * h[n]$$



$$x \longrightarrow h \longrightarrow y$$

Convolution formula:

$$y[n]=x[n]*h[n]=\sum_{m=-\infty}^{\infty}h[n-m]\,x[m]$$

• Convolution method:

- 1) Time reverse the impulse response and shift it *n* time steps to the right
- 2) Compute the inner product between the shifted impulse response and the input vector
- Repeat for evey *n*



$$y[n] = x[n] * h[n] = \sum_{m=-\infty}^{\infty} h[n-m] x[m]$$

• Convolve a unit pulse with itself



• Convolve a unit pulse with a unit pulse twice the width

LTI System Frequency Response

□ (DT)Fourier Transform of impulse response

$$x[n]=e^{j\omega n} \longrightarrow LTI System \rightarrow y[n]=H(e^{j\omega})e^{j\omega n}$$

$$H(e^{j\omega}) = \sum_{k=-\infty}^{\infty} h[k]e^{-j\omega k}$$

DTFT and Sampling





$$X(e^{j\omega}) = \sum_{k=-\infty}^{\infty} x[k]e^{-j\omega k}$$

- -

$$x[n] = \frac{1}{2\pi} \int_{-\pi}^{\pi} X(e^{j\omega}) e^{j\omega n} d\omega$$

















Compressive Sensing

- Shannon/Nyquist theorem is pessimistic
 - $2 \times$ bandwidth is the worst-case sampling rate holds uniformly for any bandlimited data
 - Sparsity/compressibility is irrelevant
 - Shannon sampling based on a linear model, compression based on a nonlinear model
- Compressive sensing
 - New sampling theory that leverages compressibility
 - Two conditions needed:
 - Sparsity in some domain
 - Transformation to incoherent domain



ADC

Analog to Digital Converter





- Practical quantizers have a limited input range and a finite set of output codes
- E.g. a 3-bit quantizer can map onto
 2³=8 distinct output codes

- Quantization error grows out of bounds beyond code boundaries
- We define the full scale range (FSR) as the maximum input range that satisfies $|e_q| \le \Delta/2$
 - Implies that $FSR = 2^B \cdot \Delta$





• Assuming full-scale sinusoidal input, we have

 $SNR_Q = 6.02B + 1.76 dB$

B (Number of Bits)	SQNR
8	50dB
12	74dB
16	98dB
20	122dB



- □ Word-at-a-time
 - E.g. flash ADC
 - Instantaneous comparison with 2^B-1 reference levels
- Multi-step
 - E.g. pipeline ADCs
 - Coarse conversion, followed by fine conversion of residuals
- Bit-at-a-time
 - E.g. successive approximation ADCs
 - Conversion via a binary search algorithm

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speed



Data: http://www.stanford.edu/~murmann/adcsurvey.html



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- **B**-bit flash ADC:
 - DAC generates all possible 2^B-1 levels
 - 2^B-1 comparators compare V_{IN} to DAC outputs
 - Comparator output:
 - If $V_{DAC} < V_{IN} \rightarrow 1$
 - If $V_{DAC} > V_{IN} \rightarrow 0$
 - Comparator outputs form thermometer code
 - Encoder converts thermometer to binary code







- □ Sampling phase: Sample input with Sample-and-Hold
- Bit-cycling: Compare with DAC output, adjusting the SAR with each clock cycle as bits are determined





 Total quantization noise at digital output is reduced proportional to "oversampling ratio" M=(f_S/2)/f_B









 Noise shaping with feedback to further reduce quantization noise



- **SQNR**
 - SQNR determined by bit resolution, B
- Nyquist ADCs
 - Flash ADCs
 - Word-at-a-time for high speed, low resolution applications
 - SAR ADCs
 - Bit-at-a-time for low speed, low power applications
 - Highly suited for medical devices
- Oversampling
 - Enables reduction in quantization noise with digital filter
 - Sigma-Delta ADCs
 - Use integrator in feedback to shape noise and achieve high resolution
 - Usually for low speed, low power applications



□ Which ADC topology would you choose and why?

- A 6b ADC with sampling frequency of 1Mhz?
- A 14b ADC with sampling frequency of 10 khz?
- A 8b ADC with sampling frequency of 100 khz?

□ What is the SQNR of each design?

Digital Filters











$$W(e^{j\omega}) = \sum_{k=-\infty}^{\infty} w[k]e^{-j\omega k}$$
$$= \sum_{k=-N}^{N} e^{-j\omega k}$$

$$W(e^{j\omega}) = \frac{\sin((N+1/2)\omega)}{\sin(\omega/2)}$$



Tradeoff – Ripple vs. Transition Width



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The frequency response H(ω) of the ideal low-pass filter passes low frequencies (near ω = 0) but blocks high frequencies (near ω = ±π)



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and shift





Time Bandwidth Product



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- Compute the DTFT of a simple(ish) window function
- □ Given a filter frequency response, what is the transition bandwidth? Pass ripple? Stop ripple?
- Create a freq and gain array for a given frequency spectrum requirement.

□ Review Lab 8 and 9! Lots of problems there



- Quiz 2
 - In class Monday 11/21
 - 60 minutes, start at exactly 5:15pm
 - Calculators allowed (non-cell phone)
 - 8.5x11 cheat sheet allowed
 - Cumulative, but will focus on lectures 9-16 and labs 6, 8 and 9 (ADC and filter labs)
- □ No lecture or lab next week TW because of Tgiving
- □ M 11/28 lecture cancelled, OH instead
- □ T 11/29 Free lab time for project
- Guest Lectures I expect your attendance