



EE 3101

Digital Signal Processing

BS Electronic Systems programme

R. David Koilpillai

September – December 2024



EE 3101Digital Signal ProcessingEE 3101
Lec 18

- Welcome
- Course Overview
- Introduction

Faculty : Prof. R. David Kalpillai
kalpillai@ee.iitm.ac.in

Instructor . Mr. Tony Varkey
tony @ study. iitm.ac.in

Introduction

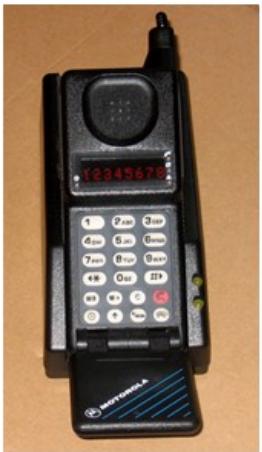
- A warm welcome to EE3101 DSP Course !!
- Builds on EE2101 Signals & Systems course
- Concepts of Signals, Systems and their representation
- In Discrete Time ...
 - DSP translates Signals & Systems into the domain of computers
 - Digital representation of Signals
 - Implementation, Transmission, Storage, Retrieval ...
 - Compression & Reconstruction
 - Encryption and Decryption
 -
 -
- Many interesting applications
- One of them is the Cellphone ...

Electrical Engineering
IIT Madras



2G
digitized voice
data

1989 - Motorola Micro tac



Electrical Engineering
IIT Madras



1992 Nokia 101



1996 - Motorola StarTAC



Electrical Engineering
IIT Madras



1998-2000



2002 – Blackberry 5810



2004 – Motorola
Razor



2006 –
Blackberry Pearl



2007
Apple iPhone



2012
iPhone 5



Electrical Engineering
IIT Madras



Ericsson Family



2 G

Single standard
Communications device
with some applications

evolution

Electrical Engineering
IIT Madras



4 G

Applications device with
Communications functionality
(Multiple DSP applications)



Cellphone Cameras

- An exciting application of DSP ...



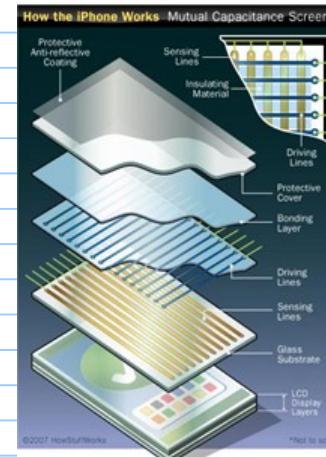
Pro camera system
48MP Main | Ultra Wide |
Telephoto
Super-high-resolution
photos
(24MP and 48MP)
Next-generation portraits
with Focus and Depth Control

Up to
10x

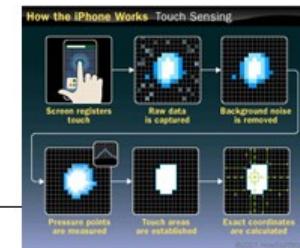
optical zoom range



Touch Screen

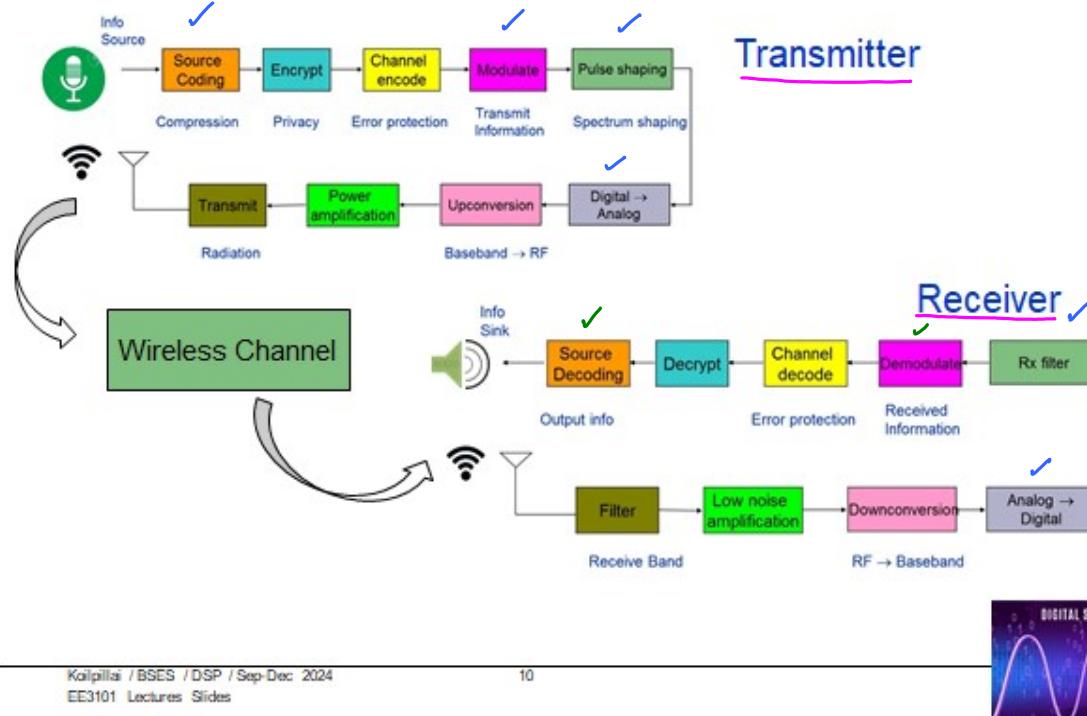


- Multi-touch, Capacitive method
- Layer of capacitive material
- Capacitors in coordinate system
- Sense changes at each point on grid.
- Works only if you touch it with fingertip
- Not stylus or non-conductive gloves



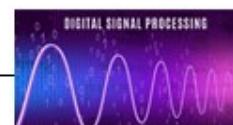
Wireless Channel

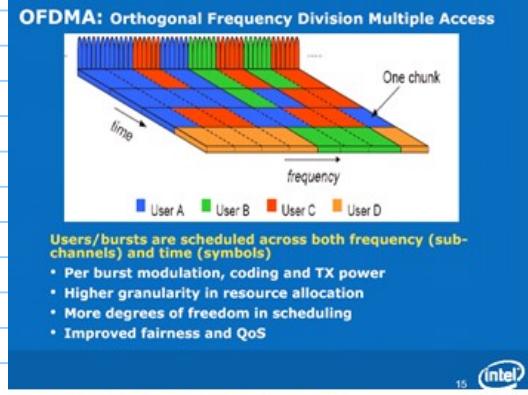
Electrical Engineering
IIT Madras



DSP involved in multiple parts of Receiver

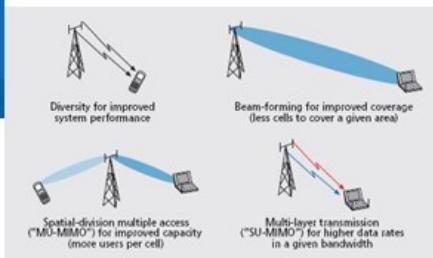
- ① Synchronization *freq time*
- ② Equalization





(oFDM)

Electrical Engineering
IIT Madras



Ref. Dahman, IEEE Comm Mag, Apr 2009

Key Aspects of 4G systems

- OFDMA
- Smart Antennas

DSP in a Cellphone

- In Transmitter
- In Receiver
- Camera
 - Motion deblurring, Special effects, ...
- Display
- Video
- Music
- Applications
 - Google Lens
 - Adaptive equalizer (Bass boost, ...)
 - Acoustic effects (Concert Hall ...)
-
-
-

Electrical Engineering
IIT Madras



DSP involved in OFDM modulation

DSP involved in Smart Antenna algorithms

Motivation for Studying DSP EE3101

Electrical Engineering
IIT Madras



- ✓ ■ A practical course
- ✓ ■ Many applications
- Essential in communications
- Foundation for Machine Learning / Deep Learning / Neural Networks
- DSP applied in all branches of Engineering, Medicine, ...
- DSP applications in Finance, Operations Research ...



David Koilpillai Profile

Education

B.Tech, IIT Madras, MS, PhD Caltech, USA

Work Experience

IIT Madras (2002 – present)

- Qualcomm Institute Chair Professor (Mar 2016 – present)
- Professor, Electrical Engineering Department (Jun 2002 – present)
- Head, EE Department (Aug 2019 – Aug 2022)
- Dean (Planning) (Oct 2011 – Oct 2017)

CEWiT – Chief Scientist

Co-Chair, IIT Hyderabad Task Force

Ericsson Inc, USA

- Director, Advanced Technologies, Research and Patents

General Electric Corporate R&D Center, NY, USA (1990 – 1994)

Professional

- Areas of expertise: Cellular - 4G and 5G, DSP for wireless and optical communications
- 32 Issued US patents, 10 Canadian patents, 19 WIPO/European patents, 1 Indian Patent (+ 2 in process)
- Publications: 80 Conference and Journal publications
- Ericsson Inventor of Year Award 1999
- Fellow, Indian National Academy of Engineering
- Srimathi Marti Annapurna Gurunath Award for Excellence in Teaching 2014
 - Best Teacher Award of IIT Madras
- IITM Alumni Association Award for Distinguished Service – August 2017

Electrical Engineering
IIT Madras



Digital Signal Processing

Course ID: EE3101

Course Credits: 4+1

Course Type: Diploma

Pre-requisites: **EE2101 - Signals and Systems**

What you'll learn

To teach the fundamentals of Digital Signal Processing

Course structure & Assessments

- 5 credit course,
- weekly online assignments,
- 2 in-person invigilated quizzes,
- 1 in-person invigilated end term exam.

Evaluation

Quiz 1

Quiz 2

End Semester Exam

Weekly Assignments

Week 1-2

Introduction to sampling - Review of Signals and Systems: Basic operations on signals
- Discrete time complex exponentials and other basic signals – system properties (linearity, time-invariance, memory, causality, BIBO stability) -- impulse response and convolution

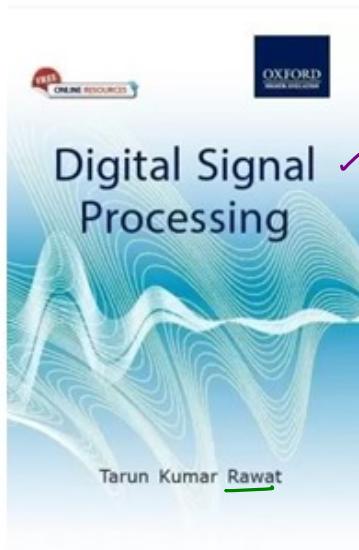
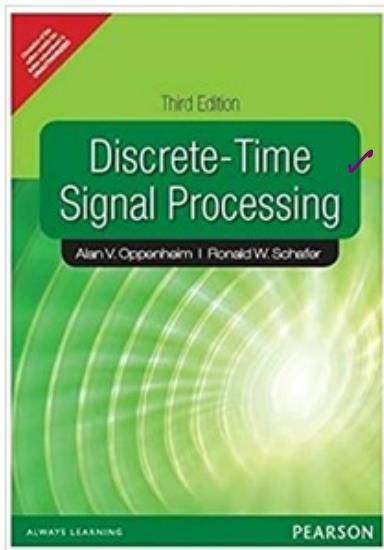
Week 3-4

Sampling: Impulse train sampling—relationship between impulse trained sampled continuous-time signal spectrum and the DTFT of its discrete-time counterpart—scaling of the frequency axis—relationship between true frequency and digital frequency—reconstruction through sinc interpolation—aliasing—effect of sampling at a discontinuous point—relationship between analog and digital sinc—effects of oversampling—discrete-time processing of continuous-time signals

Week 5-6

Discrete-Time Fourier Transform (DTFT): Complex exponentials as eigensignals of LTI systems—DTFT definition—inversion formula—properties—relationship to continuous-time Fourier series (CTFS)

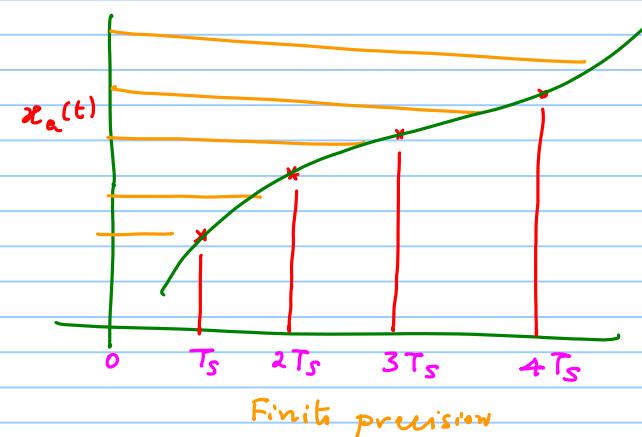
DSP Books



Electrical Engineering
IIT Madras



In DSP



Discrete Time
Amplitude \propto precision

DT signal

Discrete Time
Discrete in Amplitude
Quantized

Digital Signal

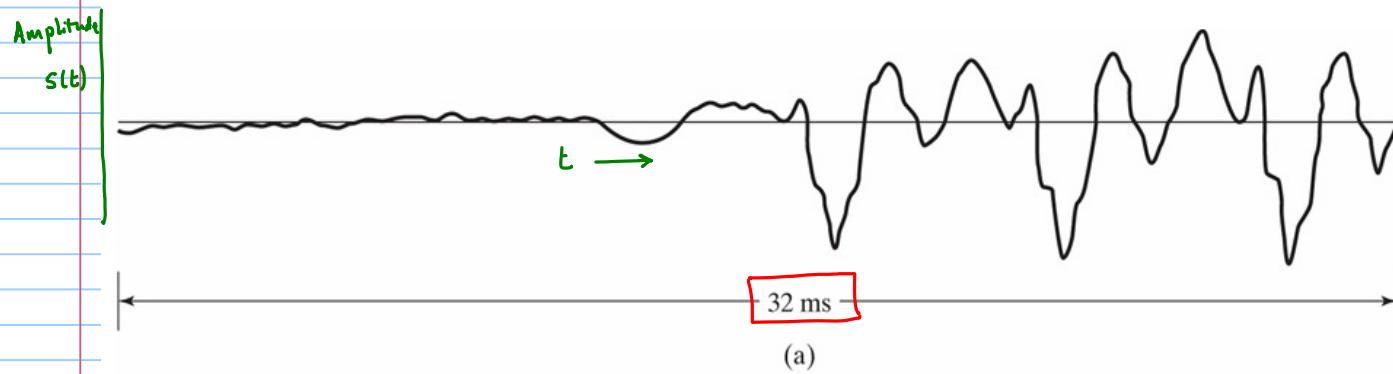




Week 1 ...



Speech signal $s(t)$ time independent information bearing



signal $s(t)$ continuous

$t \in \mathbb{R}$ continuous variable

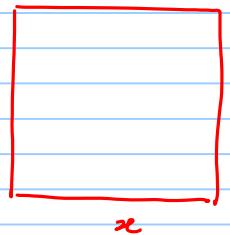
$s(t)$ one-dim signal

colour photograph

$I_r(x, y)$

$I_g(x, y)$

$I_b(x, y)$



video $I_r(x, y, t)$

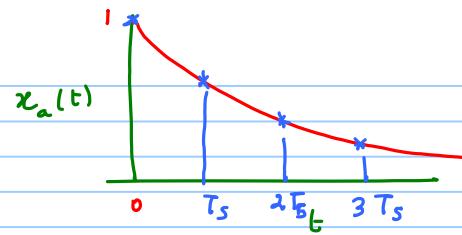
$I_g(x, y, t)$

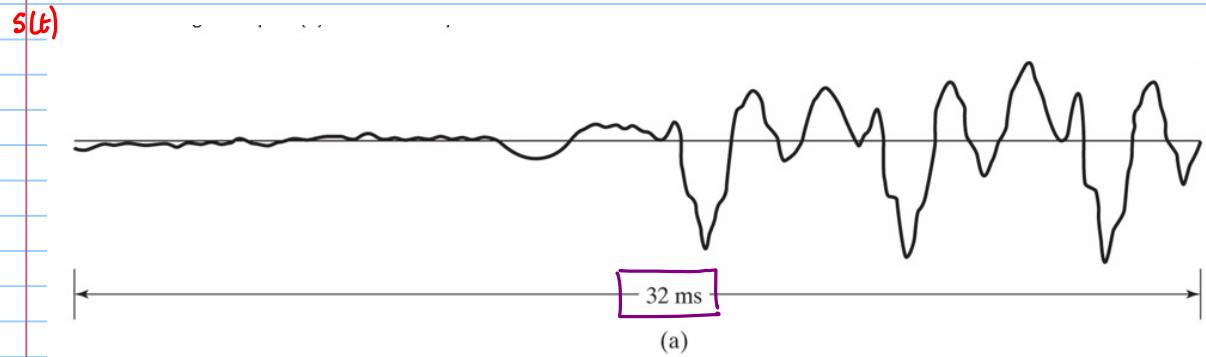
$I_b(x, y, t)$

Eg.

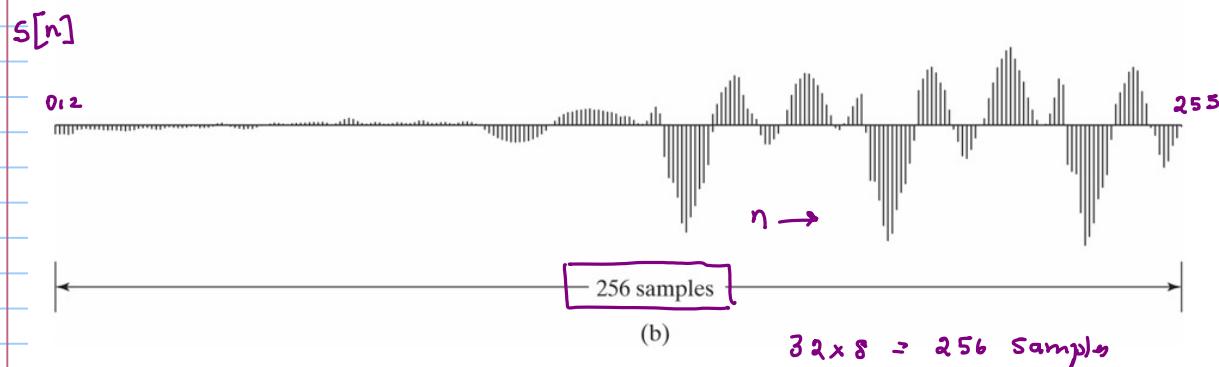
$$x_a(t) = e^{-t} u(t)$$

$$x_a(t) \Big|_{t = nT_s} \quad n = 0, \pm 1, \pm 2, \dots$$





(a)



(b)

$$32 \times 8 = 256 \text{ samples}$$

Nyquist sampling Theorem

$$f_s = \frac{1}{T_s} \geq 8 \text{ kHz}$$

8000 samples / sec

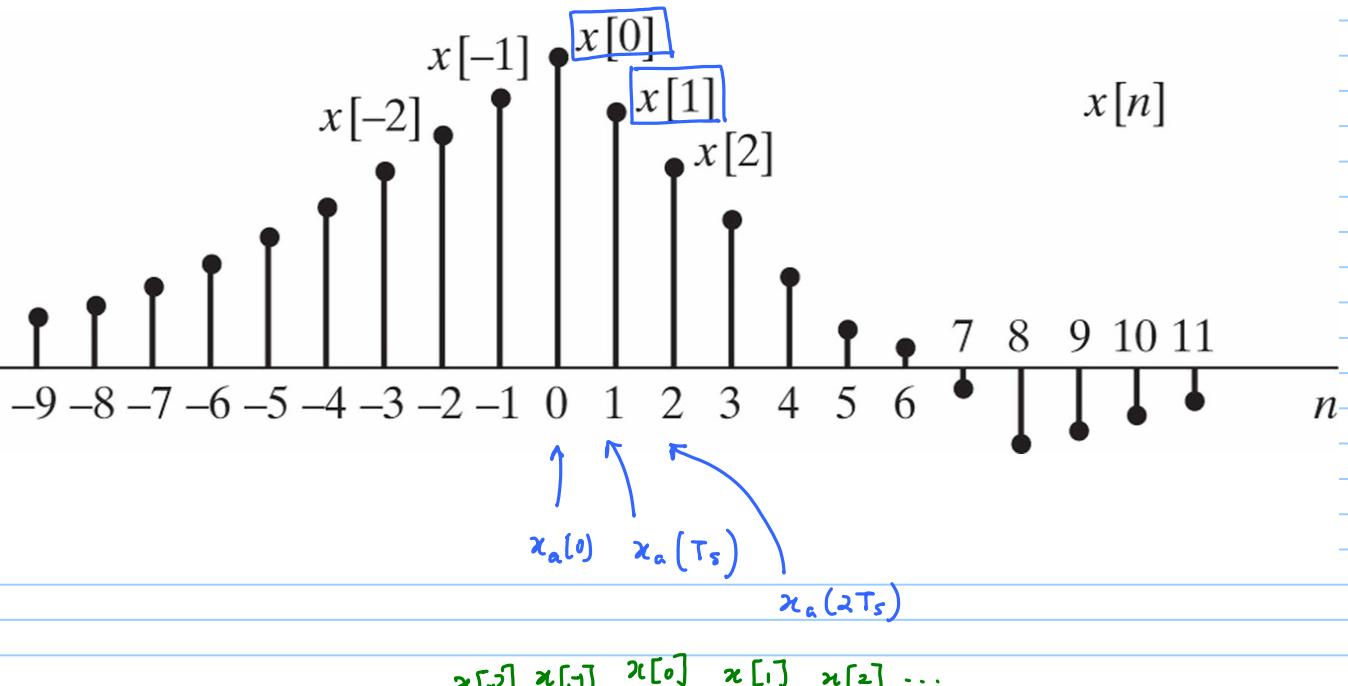
8 samples / msec

Compact Disc

oversampling Nyquist

sampling @ 44.1 kHz

44,100 samples



$$\{x[n]\} = \{ \dots x[-2] x[-1] x[0] x[1] x[2] \dots \}$$

DT signals - a sequence of numbers

$$x[n] = \{ \dots, x[-1], x[0], x[1], x[2], \dots \}$$

↑
index 0

$$\{ x[n] \}$$

square brackets

$$x[n] \in \mathbb{C}$$

Special case is the subset \mathbb{R}

defined only for $n \in \mathbb{Z}$ set of integers

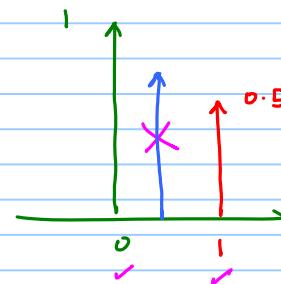
$x[n]$ undefined if $n \notin \mathbb{Z}$

uniform
Sampling

CT \longrightarrow DT

Continuous
Time

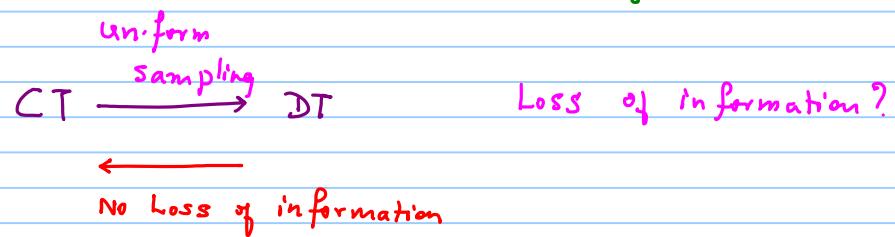
Discrete
Time



$$x_a(t) \Big|_{t=nT_s} = x[n]$$

T_s = Sampling period (sec)

$$\frac{1}{T_s}$$
 = Sampling freq (Hz)



Nyquist Sampling Theorem \Rightarrow if satisfied, there is no loss of information in the DT signal

Basic Signals in CT

- ① Unit Step $u(t)$
- ② Dirac Delta $\delta(t)$
- ③ exponential $A e^{-at}$
- ④ causal sig, $A e^{-at} u(t)$
- ⑤ Sinusoids $A e^{j\omega t}$ or $B \sin(\omega t + \phi)$
 $B \cos(\omega t + \phi)$

DT Signals

① Temperature measured hourly

$x[1] \ x[2] \dots$
1 AM 2 AM

An example of a signal that is inherently Discrete-Time.

Next Session

Basic DT Signals

Operations performed on DT signals

DT systems

I/O relations in DT system.

Reading Assignment

Oppenheim & Schafer : Sec 2.0, 2.1

Rawat : Sec 1.1 - 1.3



EE 3101

Digital Signal Processing

BS Electronic Systems programme

R. David Koilpillai

September – December 2024



EE 3101 Digital Signal ProcessingEE 3101
Lec 2Outline

- Recap of last session
 - CT vs DT
 - DT vs Digital

Faculty : Prof. R. David Kalpillai
kalpillai@ee.iitm.ac.in

Instructor . Mr. Tony Varkey

tony @ study. iitm.ac.in

Week 1-2

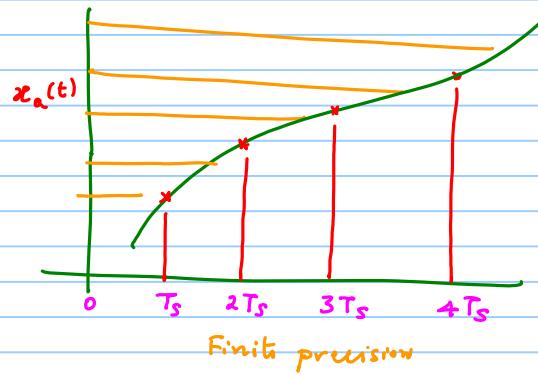
Introduction to sampling - Review of Signals and Systems: Basic operations on signals
- Discrete time complex exponentials and other basic signals – system properties (linearity, time-invariance, memory, causality, BIBO stability) -- impulse response and convolution

Reading Assignment

Oppenheim & Schafer : Sec 2.0, 2.1

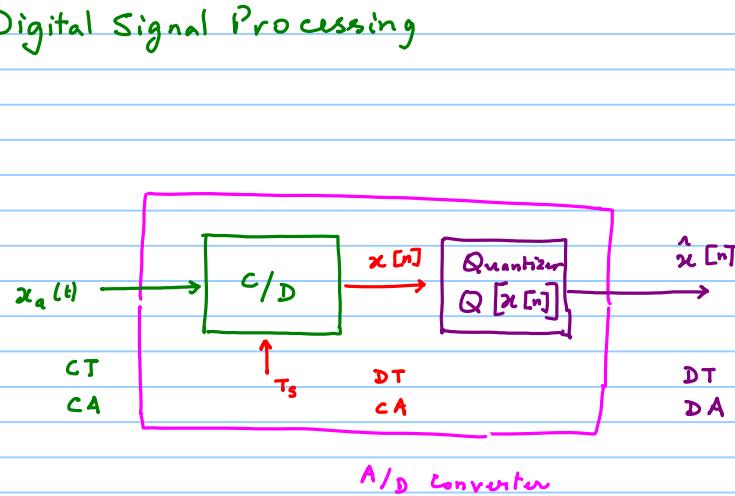
Rawat : Sec 1.1 - 1.3

Discrete Time Signal Processing vs Digital Signal Processing



Discrete Time
Amplitude \leftrightarrow precision

Discrete Time
Discrete in Amplitude
Quantized



C - Continuous
D - Discrete
T - Time
A - Amplitude

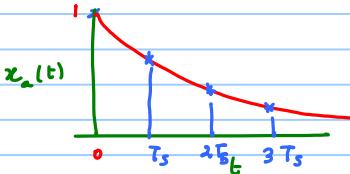
	$x_a(t)$	$x[n]$	$\hat{x}[n]$
Amplitude	C	C	D
Time	C	D	D

Uniform Sampling

$$x[n] \triangleq x_a(t) \Big|_{t=nT_s} \quad n = 0, \pm 1, \pm 2, \dots$$

T_s = sampling period (sec)

$\frac{1}{T_s}$ = sampling freq (Hz)



$t \in \mathbb{R}$ continuous variable

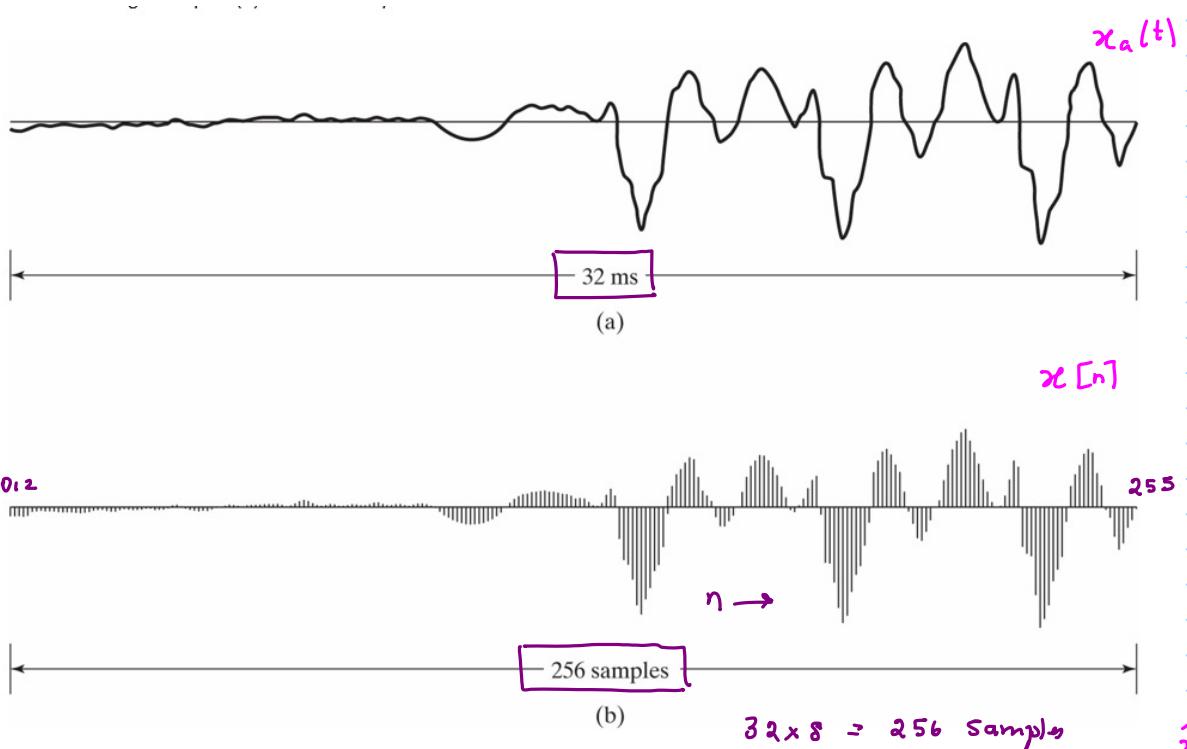
$x[n] \in \mathbb{C}$

special case is the subset \mathbb{R}

$x[n]$

defined only for $n \in \mathbb{Z}$ set of integers

$x[n]$ undefined if $n \notin \mathbb{Z}$



Nyquist Sampling Theorem

$$f_s = \frac{1}{T_s} \geq 8 \text{ kHz}$$

8000 samples / sec

8 samples / msec

DT signals

8000 samples/sec

Each sample ∞ precision

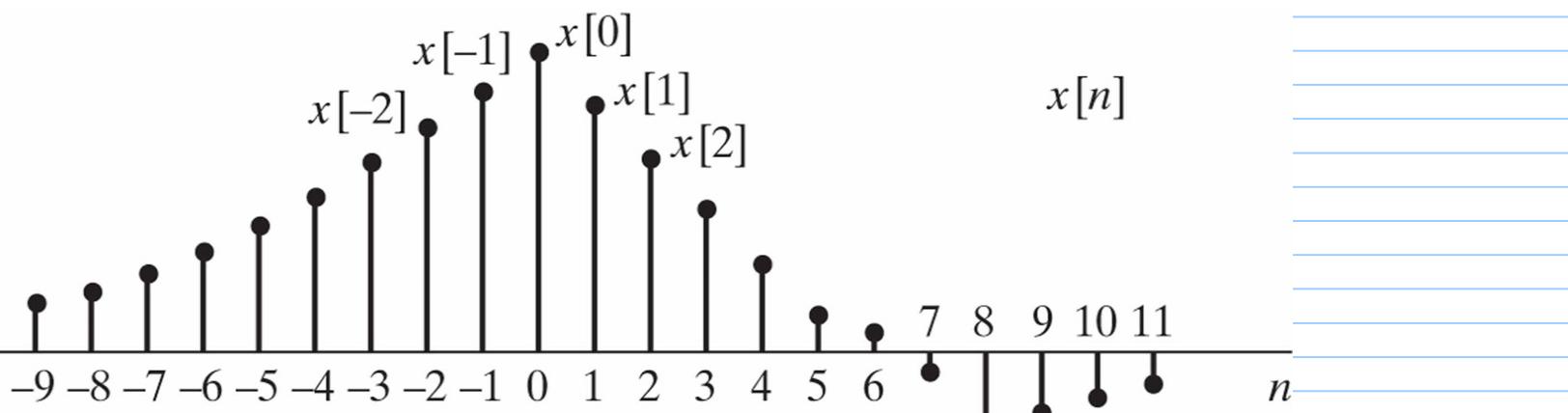
\Rightarrow No quantization

Digital signal

8000 samples/sec

Suppose each sample quantized to 8 bits

$\hat{x}[n]$ Digital signal $\rightarrow 8000 \times 8 = 64,000 \text{ bits/sec}$



$$\{x[n]\} = \{x[-9], x[-8], x[-7], x[-6], x[-5], x[-4], x[-3], x[-2], x[-1], x[0], x[1], x[2], \dots\}$$

↑
index $n=0$

$$\{1, 2, 3, 4, 5\}$$

$x[-2]$ ↑ $x[-1]$ ↑ $x[0]$ ↑ $x[1]$ ↑ $x[2]$ ↑

$$x_a(t) \Big|_{t=nT_s} = x[n]$$

T_s = Sampling period (sec)

$$\frac{1}{T_s} = \text{sampling freq (Hz)}$$

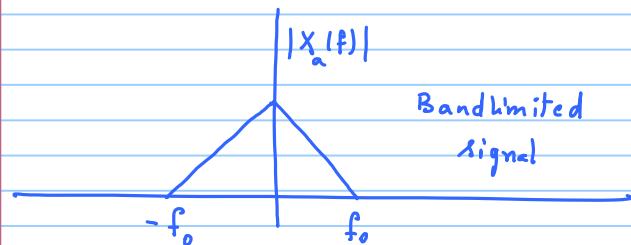
CT $\xrightarrow{\text{uniform sampling}}$ DT

Loss of information?

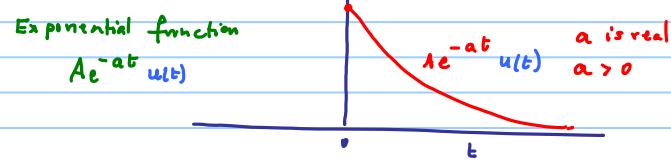
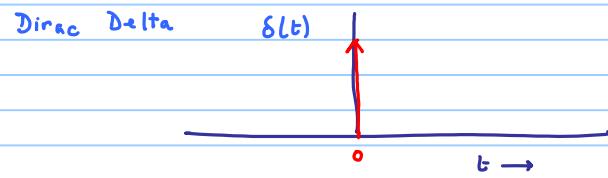
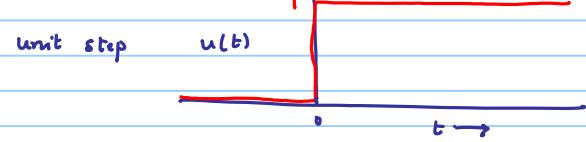
if No loss of information

Nyquist Sampling Theorem \Rightarrow if satisfied, there is no loss of information in the DT signal
Bandlimited signal

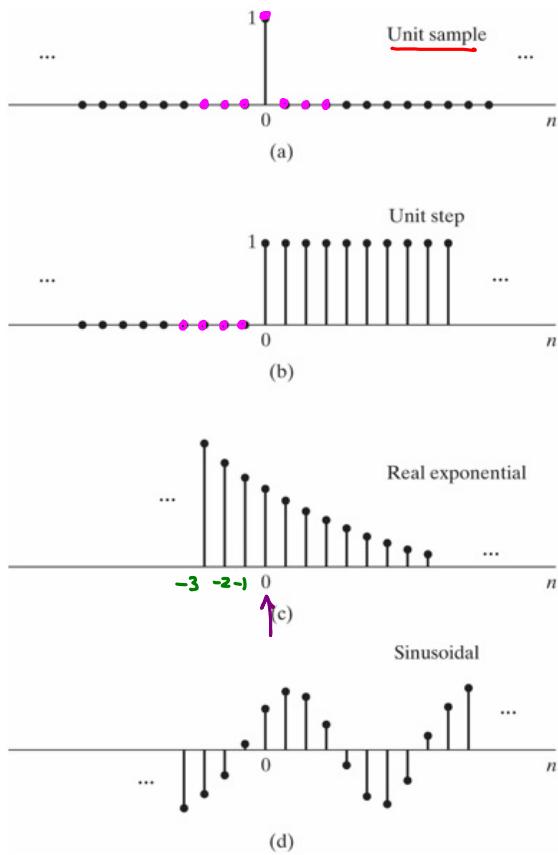
There is a class of signals that are inherently discrete time signals **



Basic CT Signals



Basic DT signals



unit sample

$$\delta[n] = \begin{cases} 1 & n = 0 \\ 0 & n \neq 0 \end{cases}$$

unit step

$$u[n] = \begin{cases} 1 & n \geq 0 \\ 0 & n < 0 \end{cases}$$

Exponential

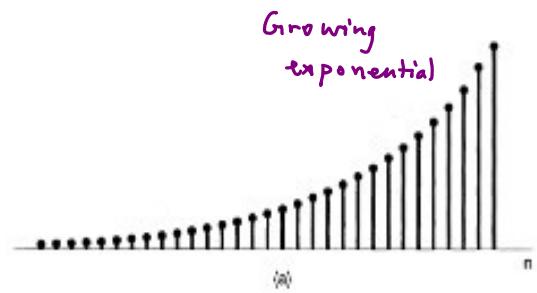
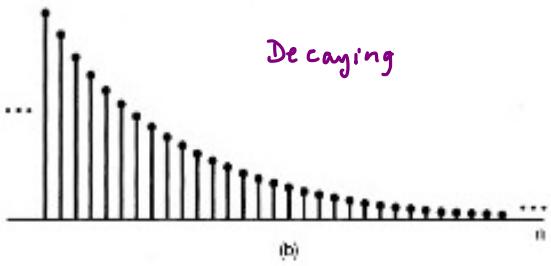
(Decaying)

$$x[n] = A \alpha^n \quad A, \alpha \text{ are real numbers}$$

A positive

$$0 < \alpha < 1$$

Exponential signals



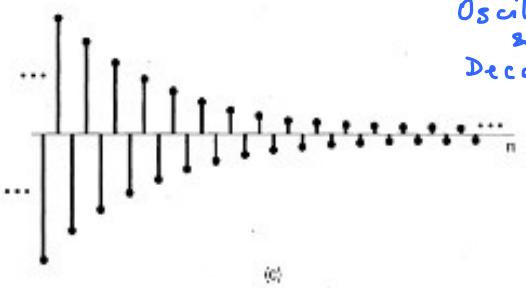
$$A \propto n^{\alpha}$$

$$0 < \alpha < 1$$

$$A \propto n^{\alpha}$$

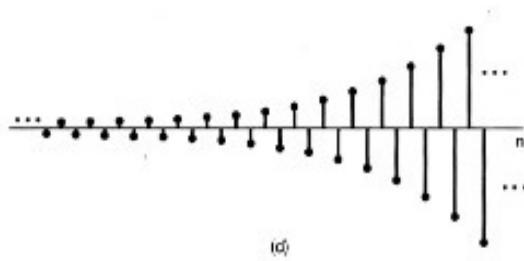
$$\alpha > 1$$

Exponential Signals (contd)



Oscillating
&
Decaying

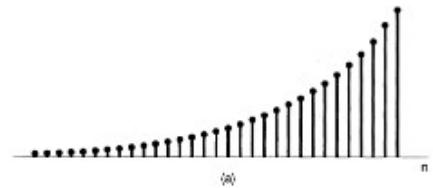
$$-1 < \alpha < 0$$



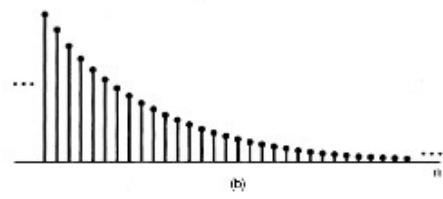
Oscillating
&
Growing

$$-1 < \alpha$$

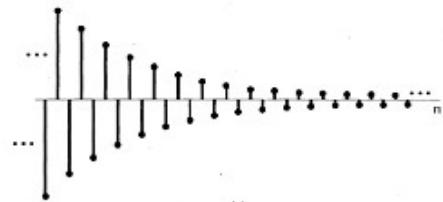
Family of Exponential Signals



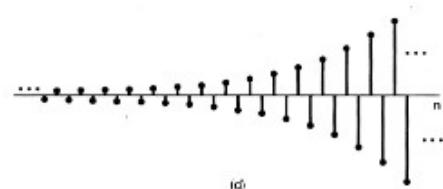
growing



decaying

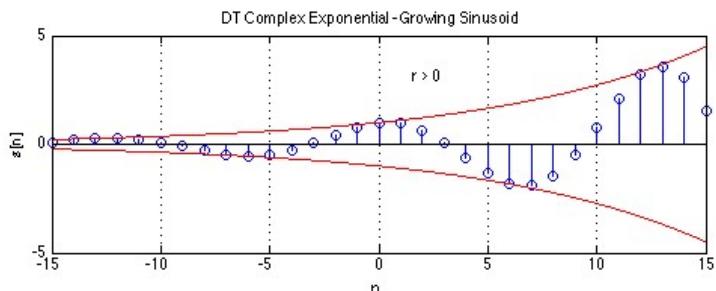


decaying & oscillating

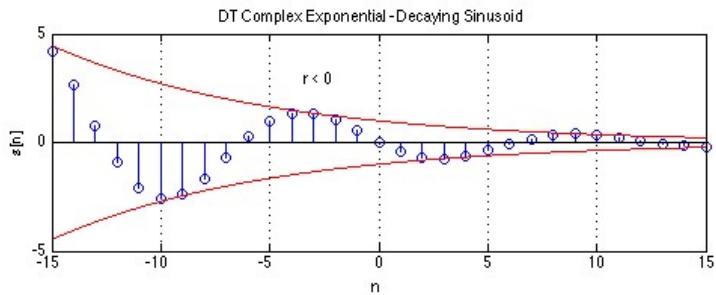


growing & oscillating

Sinusoidal signals

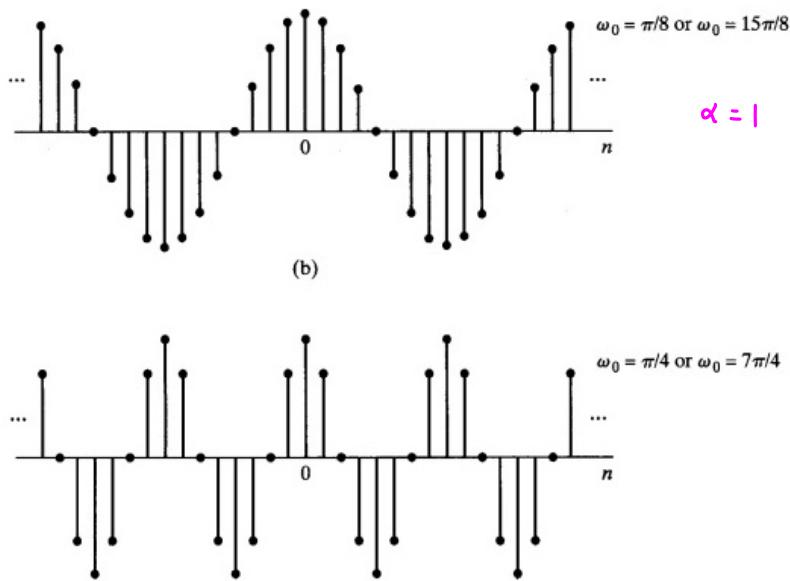


exp. growing
sinusoid



exp. decaying
sinusoid

DT Sinusoidal signals



$\alpha = 1$

Continuous time sinusoid $A \cos(\omega_0 t + \theta)$

$$x[n] = A \cos(\omega_0 n + \phi)$$

ω_0 DT frequency
dimensions

$$-\pi/T_s = \omega_0$$

$$\omega_0 \text{ rads/sec}$$

$$T_s \text{ sec}$$

$$\omega_0 \text{ rads}$$

$$x[n] = A \alpha^n e^{j(\omega_0 n + \phi)}$$

$$= A \alpha^n \left[\underbrace{\cos(\omega_0 n + \phi)}_{j = \sqrt{-1}} + j \underbrace{\sin(\omega_0 n + \phi)}_{j = \sqrt{-1}} \right]$$

Basic Operations

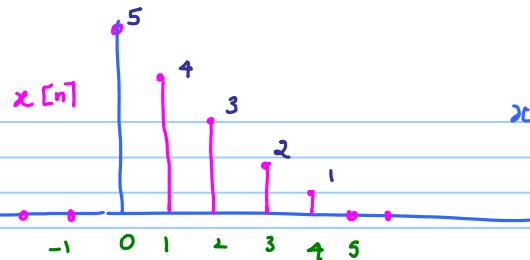
$x[n]$

$$y[n] = x[n - n_0] \quad n_0 \text{ integer}$$

$n_0 > 0$ delay

$$-\infty < n < \infty$$

$n_0 < 0$ advance



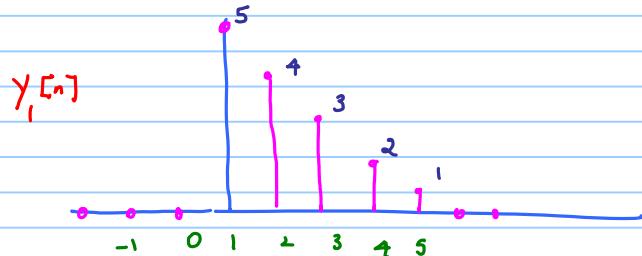
$$x[n] = \{ 0, 0, \dots, 0, 5, 4, 3, 2, 1, 0, 0, 0, \dots \}$$

n	-2	-1	0	1	2	3	4	5	6	7
$x[n]$	0	0	5	4	3	2	1	0	0	0
$y_1[n] = x[n-1]$	0	0	5	4	3	2	1	0	0	0
$y_2[n] = x[n+1]$	0	5	4	3	2	1	0	0	0	0

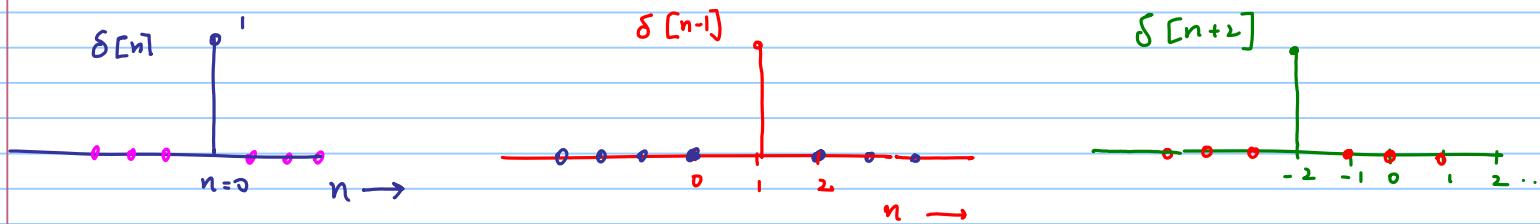
$$x[n] = \{ 0, 0, 0, 5, 4, 3, 2, 1, 0, 0, 0 \}$$

$$y_1[n] = \{ 0, 0, 0, 5, 4, 3, 2, 1, 0, 0, 0 \}$$

$$y_2[n] = \{ 0, 0, 0, 5, 4, 3, 2, 1, 0, 0, 0 \}$$



unit sample



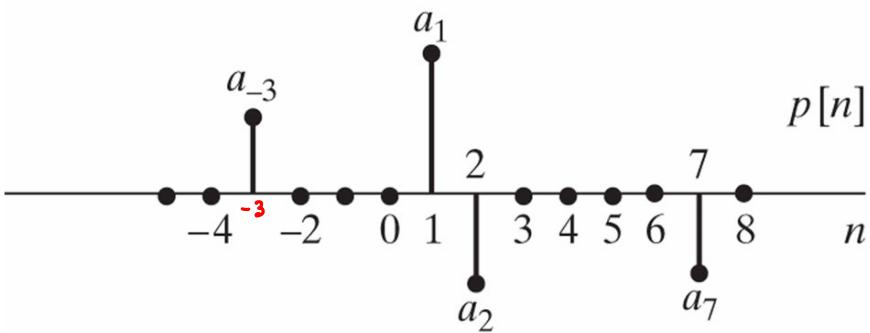
Example

$$n \rightarrow \quad 0 \ 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8 \ 9$$
$$x[n] = \{ 1, 0, 2, 0, 3, 0, 2, 0, 0, 1 \}$$

↑

$$x[n] = \delta[n] + 2\delta[n-2] + 3\delta[n-4] + 2\delta[n-6] + 1\delta[n-9]$$

Example



$$x[n] = a_{-3} \delta[n+3] + a_1 \delta[n-1] + a_2 \delta[n-2] + a_7 \delta[n-7]$$

Generalization

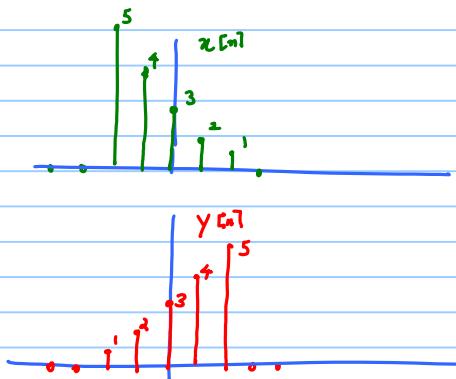
$$x[n] = \left\{ \dots, x[-2], x[-1], x[0], x[1], x[2], \dots \right.$$

$$x[n] = \sum_{k=-\infty}^{\infty} x[k] \delta[n-k] = \dots + x[-1] \delta[n+1] + x[0] \delta[n] + x[1] \delta[n-1] + \dots$$

↑ ↑ ↑ ↑
 sum scaling shifting

Time Reversal

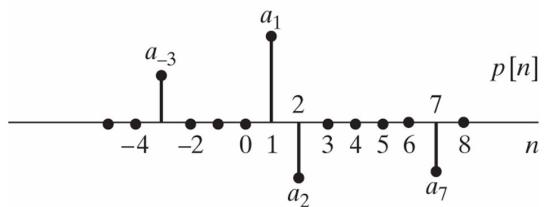
$$y[n] = x[-n]$$



$$x[n] = \{0, 0, 0, 5, 4, 3, 2, 1, 0, 0, 0, \dots\}$$

$$y[n] = \{0, 0, 0, 0, 1, 2, 3, 4, 5, 0, 0, \dots\}$$

Example Time-Reversal



$$p[n] = \{0, 0, a_{-3}, 0, 0, 0, a_1, a_2, 0, 0, 0, 0, a_7, 0, 0, 0\}$$

$$y[n] = p[-n] = \{0, a_7, 0, 0, 0, a_2, a_1, 0, 0, 0, 0, 0, 0, 0, 0, \dots\}$$

Basic Operations on DT Sequences

DT Sequences $x_1[n]$, and $x_2[n]$

Sequence } addition $y_1[n] = x_1[n] + x_2[n] \quad \forall n$
signal }

Scalar addition $y_2[n] = \alpha + x_2[n] \quad \forall n$

Sequence multiplication $y_3[n] = x_1[n] \cdot x_2[n] \quad \forall n$

Scalar multiplication $y_4[n] = \alpha x_1[n] \quad \forall n$.

$$y_1[0] = x_1[0] + x_2[0]$$

$$y_1[1] = x_1[1] + x_2[1]$$

$$y_2[0] = \alpha + x_2[0]$$

$$y_2[1] = \alpha + x_2[1]$$

$$y_3[0] = x_1[0] \cdot x_2[0]$$

:

Example

$$x_1[n] = \{ 1.5, \underset{\uparrow}{2}, 3.4, -5, 10 \}$$

$$x_2[n] = \{ 2.2, \underset{\uparrow}{3}, 2, 4.2, 8 \}$$

$$y_1[n] = x_1[n] + x_2[n]$$

$$y_2[n] = x_1[n] \cdot x_2[n]$$

$$y_3[n] = \frac{3}{2} x_2[n]$$

$$y_4[n] = \alpha + x_1[n] \quad \alpha = 2$$

Definitions

$\{x[n]\}$ finite length

infinite length

Finite length $x[n]$ is non-zero in $N_1 \leq n \leq N_2$
 unit step \rightarrow finite No.

$$\begin{cases} N_1 > -\infty \\ N_2 < \infty \end{cases}$$

\rightarrow infinite length Yes.

unit sample \rightarrow finite Yes

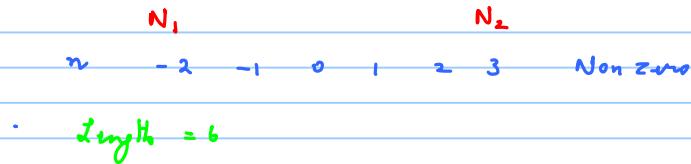
length of a finite length seq

$$\boxed{\text{Length} = N_2 - N_1 + 1}$$

Example

$$N_2 = 3 \quad N_1 = -2 \implies \text{Length} = 3 - (-2) + 1 = 6$$

$$(N_2 - N_1 + 1)$$



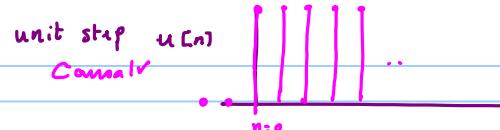
Example

$x[n]$ is non-zero in the range $2 \leq n \leq 5$

$$\text{Length} = N = 4$$

Causal signal

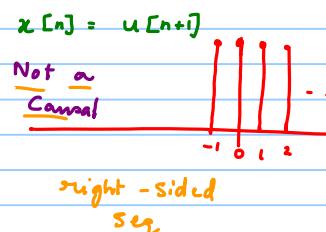
$$x[n] = 0 \quad n < 0$$



Right-sided seq

$$x[n] = 0 \quad n < N_1$$

$N_1 + or -$
can be ∞ length seq



Not causal
Not anticausal
Non causal

Anticausal signal

$$x[n] = 0 \quad \text{for } n \geq 0$$

can be ∞ length



$$\begin{cases} x[n] = u[-n] \\ y[n] = x[-n] = u[n] \end{cases}$$

Left-sided seq

$$x[n] = 0 \quad \text{for } n > N_2$$

$$N_2 \{ \pm$$

$u[-n]$ is a left-sided, not anticausal

Anticausal seq is a Left-sided seq, $u[-n]$ is a left-sided, anticausal

DT Sinusoids Properties

$$x[n] = A \sin(\omega_0 n + \phi) \text{ or } A \cos(\omega_0 n + \phi)$$

$$x(t) = A \sin(\omega_0 t + \Theta)$$

$$\omega_0 \rightarrow \infty$$

\uparrow low freq \uparrow freq

Freq $\omega_1 = \omega_0 + 2\pi k$ shifted by a multiple of 2π

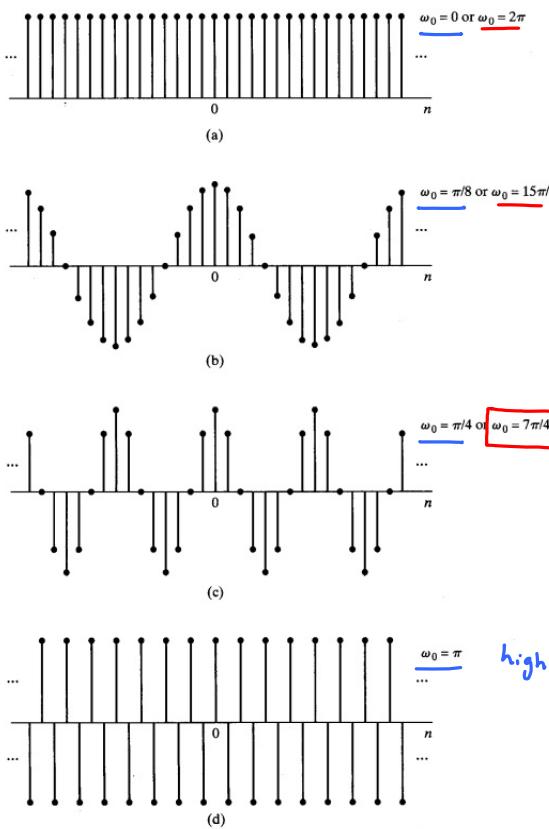
$$A \cos(\omega_1 n + \phi) = A \cos((\omega_0 + 2\pi k)n + \phi)$$

$$= A \cos(\omega_0 n + 2\pi k n + \phi) = A \cos(\omega_0 n + \phi)$$

Periodicity in frequency for DT sinusoids

Illustration

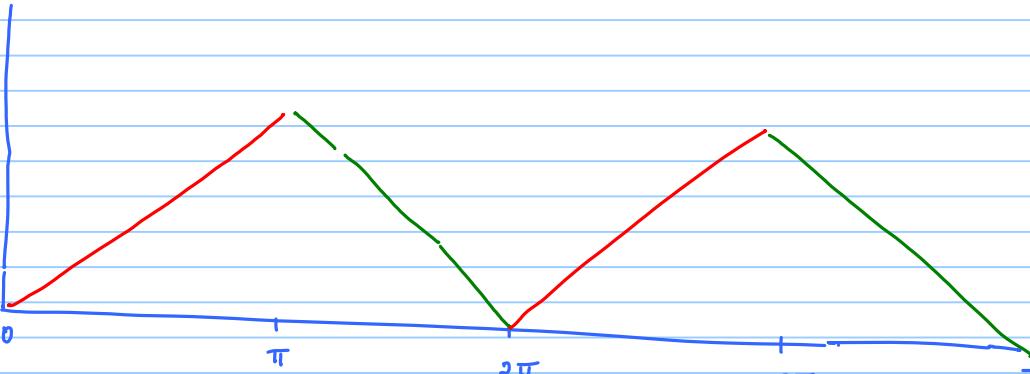
DT sinusoids



Low freq

$$A \cos(\omega_0 n + \phi)$$

Rate of
oscillation



high freq

$$A \cos(\omega_0 n + \phi)$$

$$\omega_0 = \pi$$

Observation #1 ***

DT sinusoids are periodic in frequency
Period = 2π or any multiple of 2π

Time behaviour

CT \rightarrow all sinusoids are periodic $T = \frac{2\pi}{\omega_0}$

DT $A \cos(\omega_0 n + \phi)$

If Periodic with period $= N$ $\Rightarrow A \cos(\omega_0(n + kN) + \phi) = A \cos(\omega_0 n + \phi)$
 $x[n + kN] = x[n]$

$\omega_0 k N$ = multiple of 2π

$k=1$ $\omega_0 N$ = multiple of 2π

$\omega_0 N = 2\pi m$ m is integer

A DT sinusoid is
periodic iff

$$\frac{2\pi}{\omega_0} = \frac{N}{m}$$

Rational function
 N, m are integers

Example

Condition for periodicity

$$\boxed{\frac{2\pi}{\omega_0} = \frac{N}{m}}$$

$N = \text{period}$

$m = \text{any integer}$

$$① x_1[n] = \cos \frac{\pi}{4} n \quad \omega_0 = \frac{\pi}{4}$$

Periodic function
with period = 8

$$\frac{2\pi}{\frac{\pi}{4}} = \frac{8}{1} = \frac{N}{m} \quad m=1$$

Then $N=8$

$$② x_2[n] = \cos \frac{3\pi}{8} n$$

$$\omega_0 = \frac{3\pi}{8} \quad \frac{2\pi}{\omega_0} = \frac{2\pi}{\frac{3\pi}{8}} = \frac{16}{3} = \frac{N}{m} \quad m=3$$

Then $N=16$

Periodic with period = 16

$$\frac{3\pi}{8} = 0.375\pi \rightarrow \text{periodic}$$

$$\frac{\pi}{4} = 0.25\pi \sim 0.7854 \rightarrow \text{periodic}$$

$$③ x_3[n] = \cos 0.785n$$

Not periodic

$$\frac{2\pi}{0.785} = \frac{N}{m}$$

No value of m for which N is integer

Fourier representation

Discrete Time Signal with period = N

$$\omega_0 N = 2\pi m$$

$$\frac{2\pi}{\omega_0} = \frac{N}{m} \Rightarrow \omega_0 = \frac{2\pi}{N} m$$

of periodic sequences with period = N
(sinusoidal)
 $\omega_0 = \frac{2\pi}{N} m$ $m = 0, 1, 2, 3, \dots, N-1$
 $\Rightarrow N$ sequences