Digital Signal Processing for Speech Recognition

Berlin Chen

Department of Computer Science & Information Engineering
National Taiwan Normal University

References:

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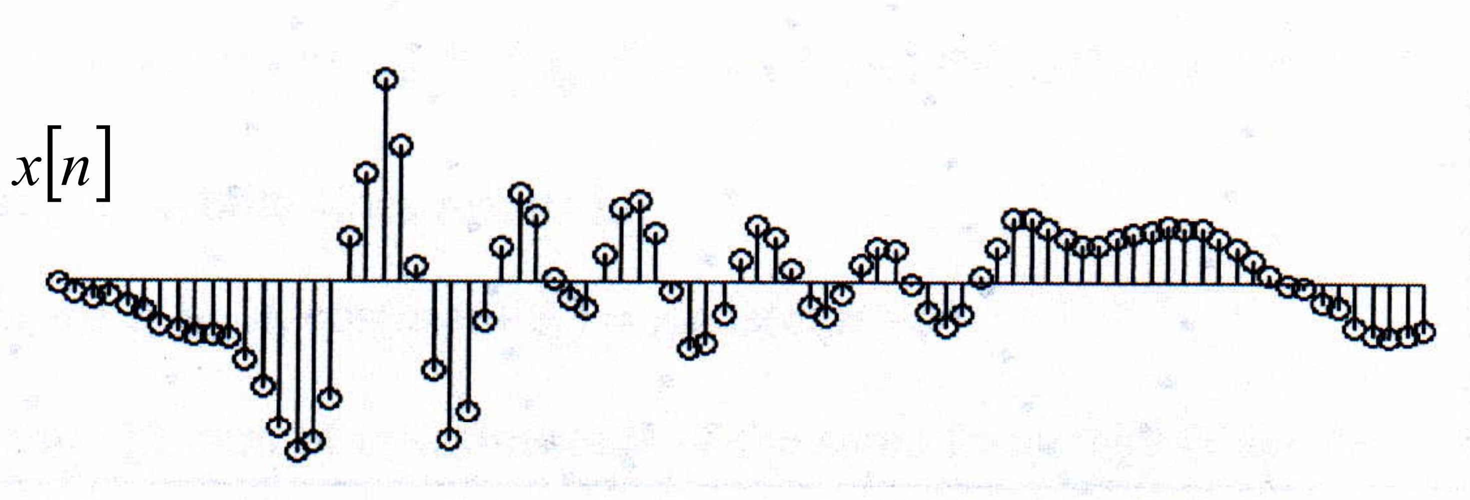
2. X. Huang et. al., *Spoken Language Processing*, Chapters 5, 6
3. J. R. Deller et. al., *Discrete-Time Processing of Speech Signals*, Chapters 4-6
4. J. W. Picone, "Signal modeling techniques in speech recognition," *proceedings of the IEEE*, September 1993, pp. 1215-1247

Digital Signal Processing

- Digital Signal
  - Discrete-time signal with discrete amplitude



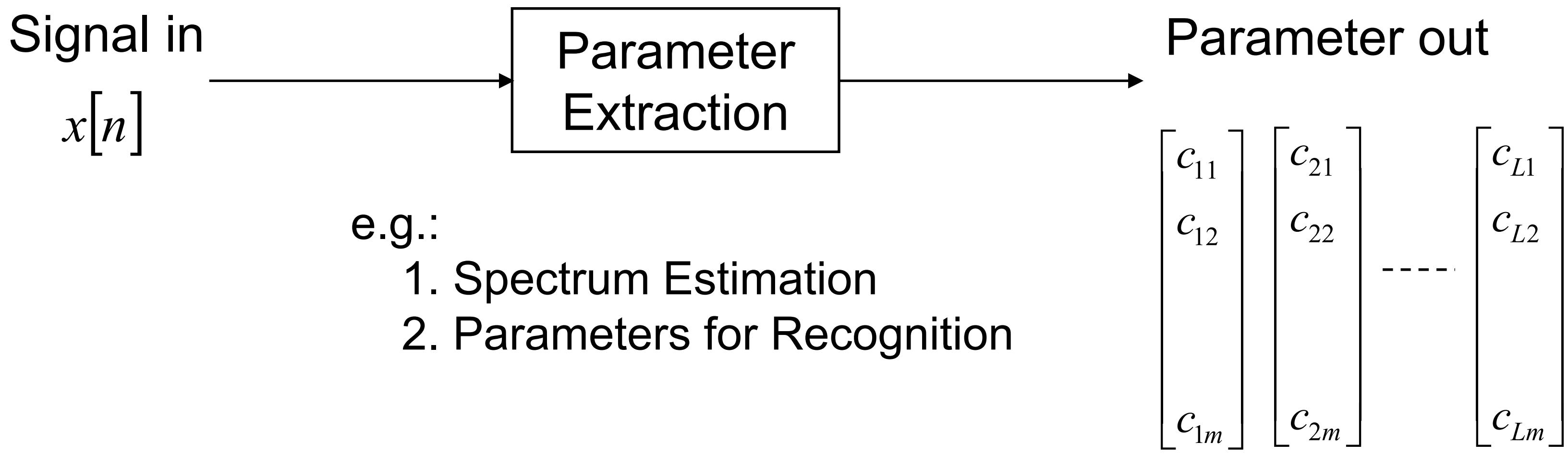
- Digital Signal Processing
  - Manipulate digital signals in a digital computer

Two Main Approaches to Digital Signal Processing

- Filtering

Amplify or attenuate some frequency components of $x[n]$

- Parameter Extraction



e.g.:
1. Spectrum Estimation
2. Parameters for Recognition

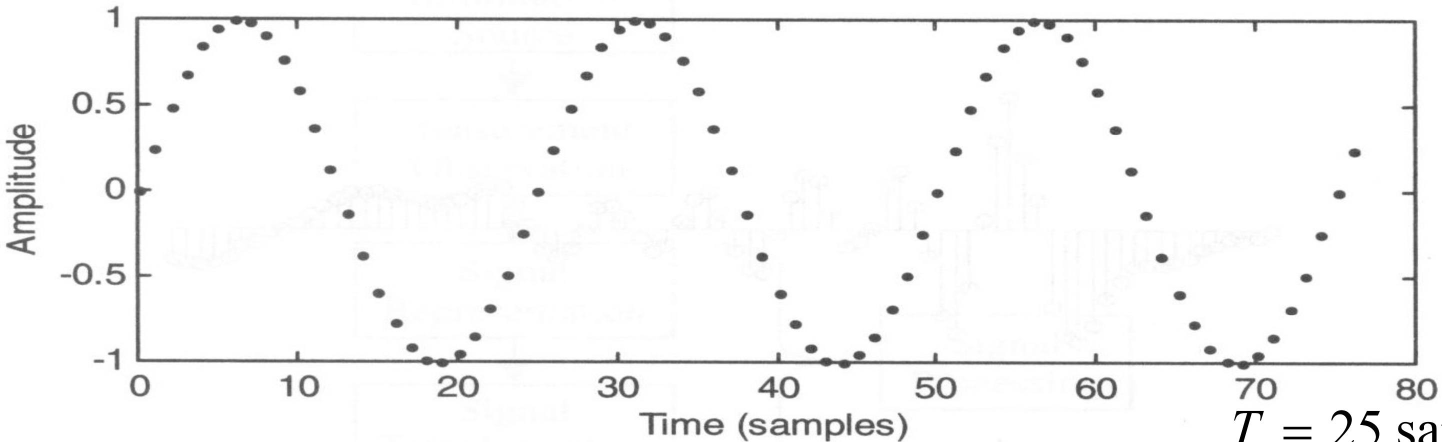
Sinusoid Signals

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

f : normalized frequency
$0 \le f \le 1$

- A : amplitude (振幅)
- ω : angular frequency (角頻率), $\omega = 2\pi f = \frac{2\pi}{T}$
- ϕ : phase (相角)

Period, represented by number of samples



$$x[n] = A\cos\left(\omega n - \frac{\pi}{2}\right)$$

Right-shifted

$T = 25$ samples

$$x[n] = x[n+N] = A\cos\left(\omega(n+N) - \frac{\pi}{2}\right)$$

$$\Rightarrow \omega N = 2\pi k \Rightarrow \omega = \frac{2\pi k}{N}(k = 1,2,\ldots)$$

- E.g., speech signals can be decomposed as sums of sinusoids

Sinusoid Signals (cont.)

- $x[n]$ is periodic with a period of *N* (samples)

$$\Rightarrow \quad x[n+N] = x[n]$$

$$\Rightarrow \quad A\cos(\omega(n+N)+\phi) = A\cos(\omega n+\phi)$$

$$\Rightarrow \quad \omega N = 2\pi k \quad (k = 1,2,\ldots)$$

$$\Rightarrow \quad \omega = \frac{2\pi}{N}$$

- Examples (sinusoid signals)
  - $x_1[n] = \cos(\pi n / 4)$ is periodic with period *N*=8
  - $x_2[n] = \cos(3\pi n / 8)$ is periodic with period *N*=16
  - $x_3[n] = \cos(n)$ is not periodic

Sinusoid Signals (cont.)

$$x_1[n] = \cos(\pi n / 4)$$

$$= \cos\left(\frac{\pi}{4} n\right) = \cos\left(\frac{\pi}{4}(n + N_1)\right) = \cos\left(\frac{\pi}{4} n + \frac{\pi}{4} N_1\right)$$

$$\Rightarrow \frac{\pi}{4} N_1 = 2\pi \cdot k \Rightarrow N_1 = 8 \cdot k \qquad (N_1 \text{ and } k \text{ are positive integers})$$

$$\therefore N_1 = 8$$

$$x_2[n] = \cos(3\pi n / 8)$$

$$= \cos\left(\frac{3\pi}{8} \cdot n\right) = \cos\left(\frac{3\pi}{8}(n + N_2)\right) = \cos\left(\frac{3\pi}{8} \cdot n + \frac{3\pi}{8} \cdot N_2\right)$$

$$\Rightarrow \frac{3\pi}{8} \cdot N_2 = 2\pi \cdot k \Rightarrow N_2 = \frac{16}{3} k \qquad (N_2 \text{ and } k \text{ are positive numbers})$$

$$\therefore N_2 = 16$$

$$x_3[n] = \cos(n)$$

$$= \cos(1 \cdot n) = \cos(1 \cdot (n + N_3)) = \cos(n + N_3)$$

$$\Rightarrow N_3 = 2\pi \cdot k$$

$$\because N_3 \text{ and } k \text{ are positive integers}$$

$$\therefore N_3 \text{ doesn't exist !}$$

Sinusoid Signals (cont.)

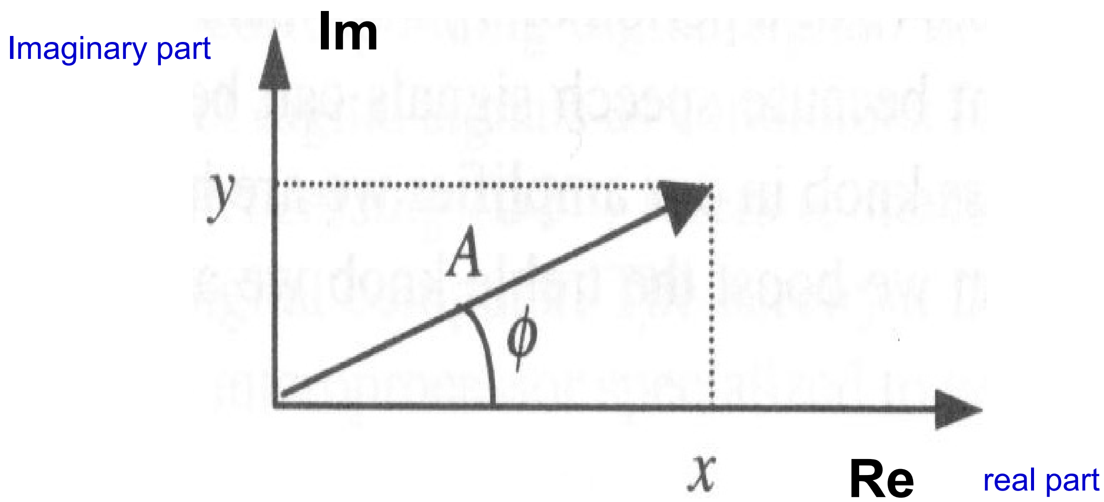
- Complex Exponential Signal
  - Use **Euler's relation** to express complex numbers

$$z = x + jy$$

$$\Rightarrow z = Ae^{j\phi} = A\left(\cos\phi + j\sin\phi\right)$$

$$A = \sqrt{x^2 + y^2} \qquad \cos\phi = \frac{x}{\sqrt{x^2 + y^2}} \qquad \sin\phi = \frac{y}{\sqrt{x^2 + y^2}}$$

(A is a real number)



$$x = A\cos\phi$$

$$y = A\sin\phi$$

Sinusoid Signals (cont.)

- A Sinusoid Signal

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

$$= \mathrm{Re}\left\{Ae^{j(\omega n + \phi)}\right\}$$

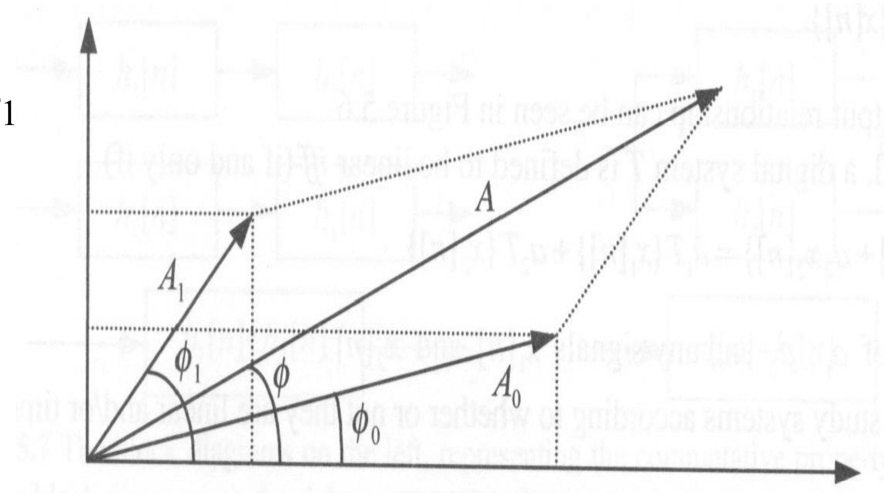
$$= \mathrm{Re}\left\{Ae^{j\omega n}e^{j\phi}\right\}$$

real part

Sinusoid Signals (cont.)

- Sum of two complex exponential signals with same frequency

$$
\begin{aligned}
& A_0 e^{j(\omega n+\phi_0)} + A_1 e^{j(\omega n+\phi_1)} \\
&= e^{j\omega n}\left(A_0 e^{j\phi_0} + A_1 e^{j\phi_1}\right) \\
&= e^{j\omega n} A e^{j\phi} \\
&= A e^{j(\omega n+\phi)}
\end{aligned}
$$



A, A_0 and A_1 are real numbers

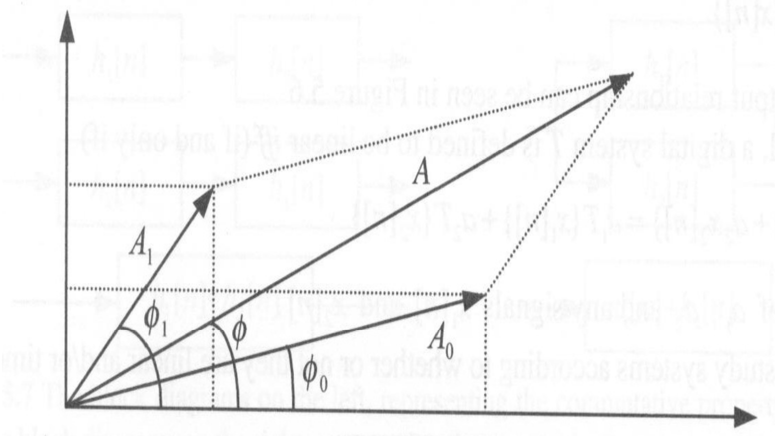
- When only the real part is considered

$$A_0 \cos(\omega n + \phi_0) + A_1 \cos(\omega n + \phi_1) = A \cos(\omega n + \phi)$$

- The sum of *N* sinusoids of the same frequency is another sinusoid of the same frequency

Sinusoid Signals (cont.)

- Trigonometric Identities



$$\tan\phi = \frac{A_0 \sin\phi_0 + A_1 \sin\phi_1}{A_0 \cos\phi_0 + A_1 \cos\phi_1}$$

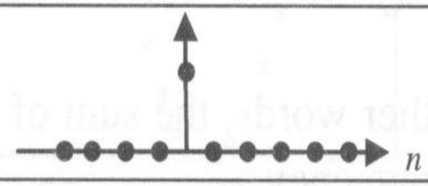
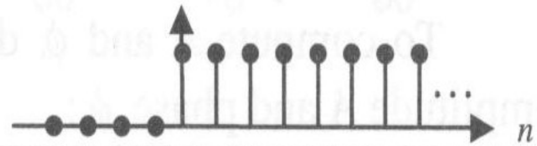
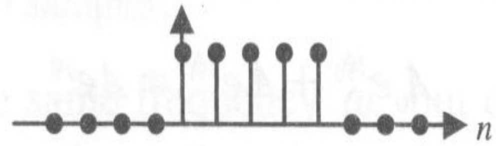
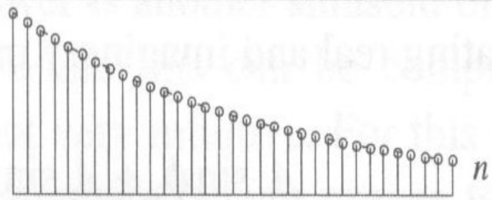
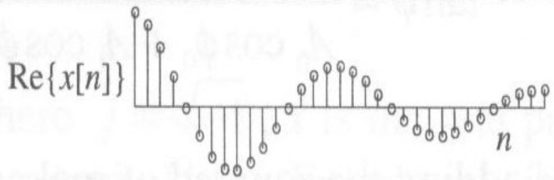
$$A^2 = \left(A_0 \cos\phi_0 + A_1 \cos\phi_1\right)^2 + \left(A_0 \sin\phi_0 + A_1 \sin\phi_1\right)^2$$

$$A^2 = A_0^2 + A_1^2 + 2A_0A_1\left(\cos\phi_0 \cos\phi_1 + \sin\phi_0 \sin\phi_1\right)$$

$$= A_0^2 + A_1^2 + 2A_0A_1 \cos\left(\phi_0 - \phi_1\right)$$

Some Digital Signals

Table 5.1 Some useful digital signals: the Kronecker delta, unit step, rectangular signal, real exponential ($a<1$) and real part of a complex exponential ($r<1$).

Kronecker delta, or *unit impulse*	$\delta[n]=\begin{cases}1 & n=0\\ 0 & otherwise\end{cases}$	
Unit step	$u[n]=\begin{cases}1 & n\geq 0\\ 0 & n<0\end{cases}$	
Rectangular signal	$\mathrm{rect}_N[n]=\begin{cases}1 & 0\leq n<N\\ 0 & otherwise\end{cases}$	
Real exponential	$x[n]=a^n u[n]$	
Complex exponential	$x[n]=a^n u[n]=r^n e^{jn\omega_0}u[n]$ $=r^n(\cos n\omega_0+j\sin n\omega_0)u[n]$	

Some Digital Signals

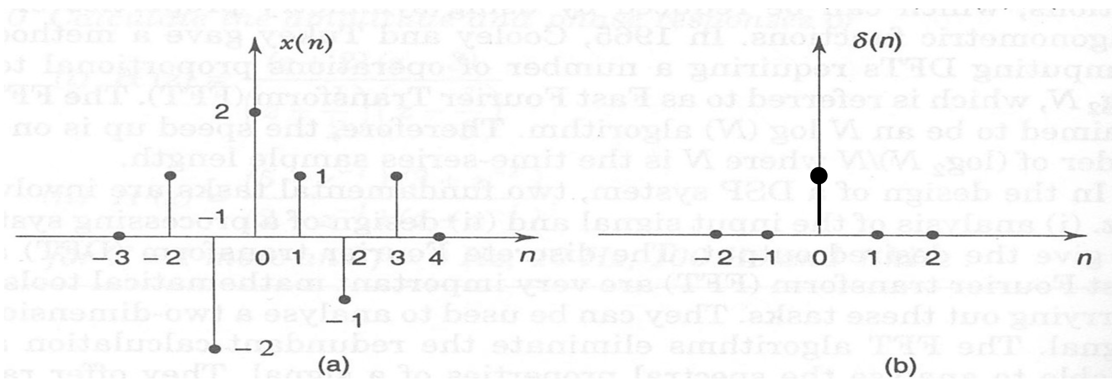
- Any signal sequence $x[n]$ can be represented as a sum of shift and scaled unit impulse sequences (signals)

$$x[n] = \sum_{k=-\infty}^{\infty} x[k]\,\delta[n-k]$$

$n = \ldots, -2, -1, 0, 1, 2, 3, \ldots$

scale/weighted

Time-shifted unit impulse sequence



$$x[n] = \sum_{k=-\infty}^{\infty} x[k]\,\delta[n-k] = \sum_{k=-2}^{3} x[k]\,\delta[n-k]$$

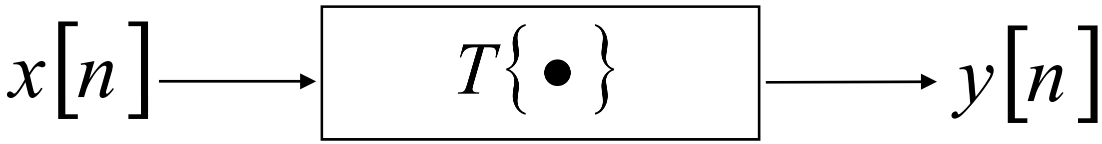
$$= x[-2]\delta[n+2] + x[-1]\delta[n+1] + x[0]\delta[n] + x[1]\delta[n-1] + x[2]\delta[n-2] + x[3]\delta[n-3]$$

$$= (1)\delta[n+2] + (-2)\delta[n+1] + (2)\delta[n] + (1)\delta[n-1] + (-1)\delta[n-2] + (1)\delta[n-3]$$

Digital Systems

- A digital system *T* is a system that, given an input signal *x*[*n*], generates an output signal *y*[*n*]

$$y[n] = T\{x[n]\}$$



Properties of Digital Systems

- Linear
  - Linear combination of inputs maps to linear combination of outputs

$$T\{ax_1[n]+bx_2[n]\} = aT\{x_1[n]\}+bT\{x_2[n]\}$$

- Time-invariant (Time-shift)
  - A time shift in the input by *m* samples gives a shift in the output by *m* samples

$$y[n \pm m] = T\{x[n \pm m]\}, \quad \forall m$$

time sift

$x[n-m]$ (if $m>0$) $\Rightarrow$ right shift m samples

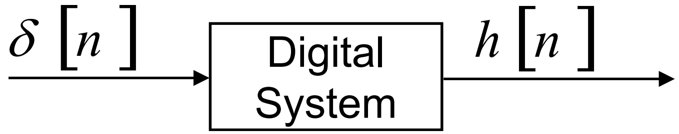
$x[n+m]$ (if $m>0$) $\Rightarrow$ left shift m samples

Properties of Digital Systems (cont.)

- Linear time-invariant (LTI)
  - The system output can be expressed as a convolution (迴旋積分) of the input $x[n]$ and the *impulse response* $h[n]$

$$T\{x[n]\} = x[n] * h[n] = \sum_{k=-\infty}^{\infty} x[k]h[n-k] = \sum_{k=-\infty}^{\infty} x[n-k]h[k]$$

  - The system can be characterized by the system's *impulse response* $h[n]$, which also is a signal sequence
    - If the input $x[n]$ is impulse $\delta[n]$, the output is $h[n]$



Properties of Digital Systems (cont.)

- Linear time-invariant (LTI)
  - Explanation:

$$x[n]=\sum_{k=-\infty}^{\infty} x[k]\,\delta[n-k]$$

$x[k]$: scale; $\delta[n-k]$: Time-shifted unit impulse sequence

$$\Rightarrow T\{x[n]\} = T\left\{\sum_{k=-\infty}^{\infty} x[k]\,\delta[n-k]\right\}$$

linear

$$= \sum_{k=-\infty}^{\infty} x[k]\,T\{\delta[n-k]\}$$

Time-invariant

$$= \sum_{k=-\infty}^{\infty} x[k]\,h[n-k]$$

$$= x[n] * h[n]$$

convolution

Impulse response

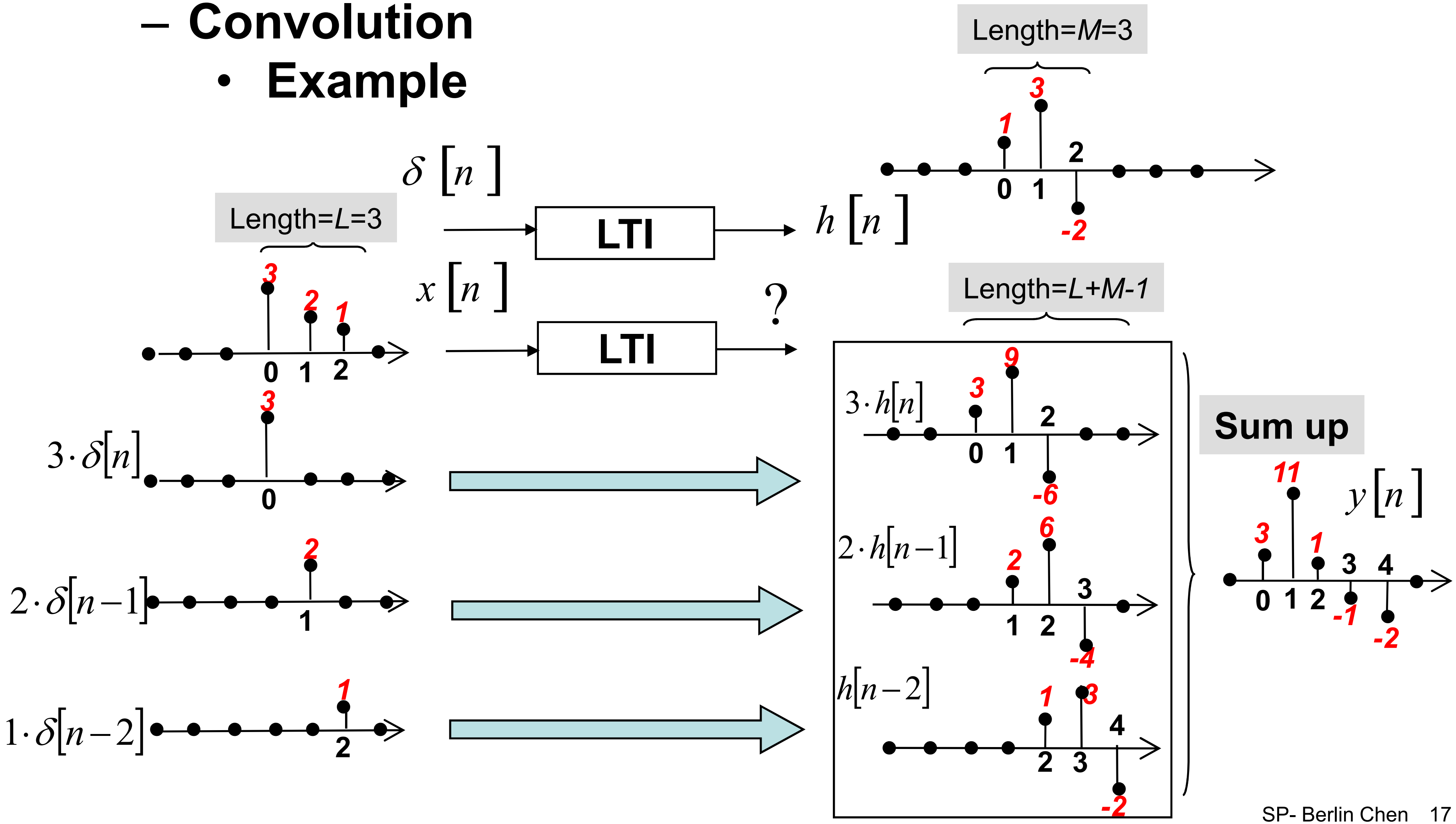
Time invariant

$$\delta[n] \xrightarrow{T} h[n]$$

$$\delta[n-k] \xrightarrow{T} h[n-k]$$

Properties of Digital Systems (cont.)

- Linear time-invariant (LTI)
  - **Convolution**
    - **Example**

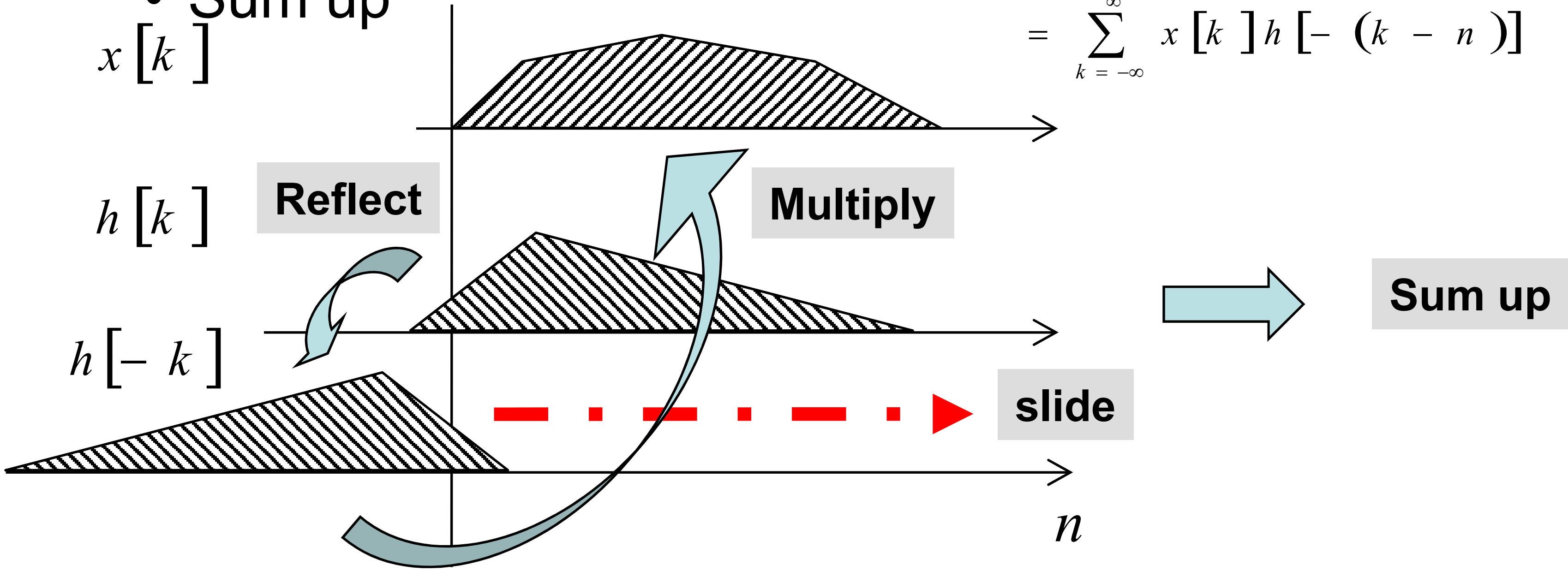


Properties of Digital Systems (cont.)

- Linear time-invariant (LTI)
  - Convolution: **Generalization**
    - Reflect $h[k]$ about the origin ($\rightarrow h[-k]$)
    - Slide ($h[-k] \rightarrow h[-k+n]$ or $h[-(k-n)]$), multiply it with $x[k]$
    - Sum up

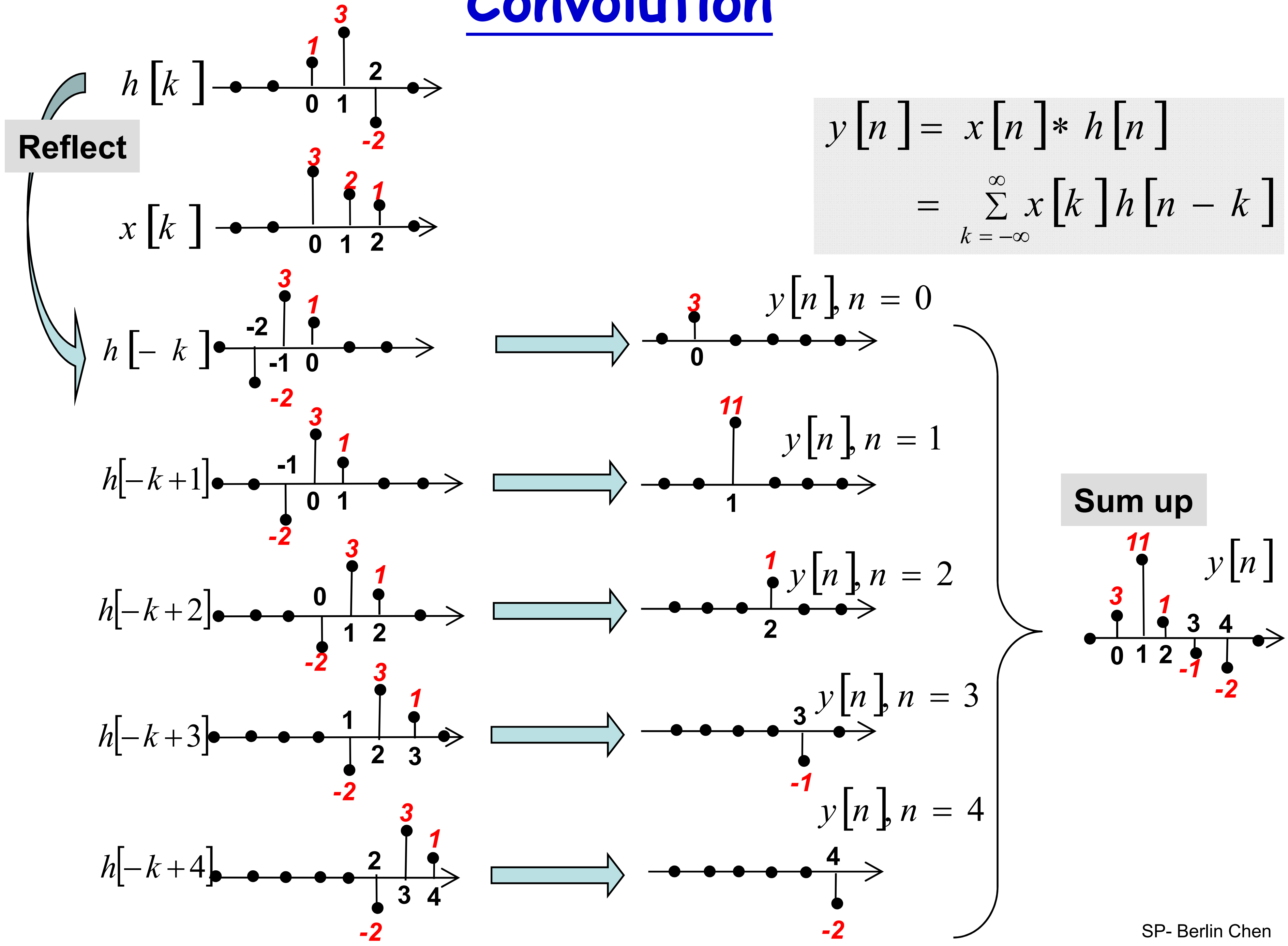
$$y[n] = \sum_{k=-\infty}^{\infty} x[k]h[n-k]$$

$$= \sum_{k=-\infty}^{\infty} x[k]h[-(k-n)]$$



Convolution

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



Properties of Digital Systems (cont.)

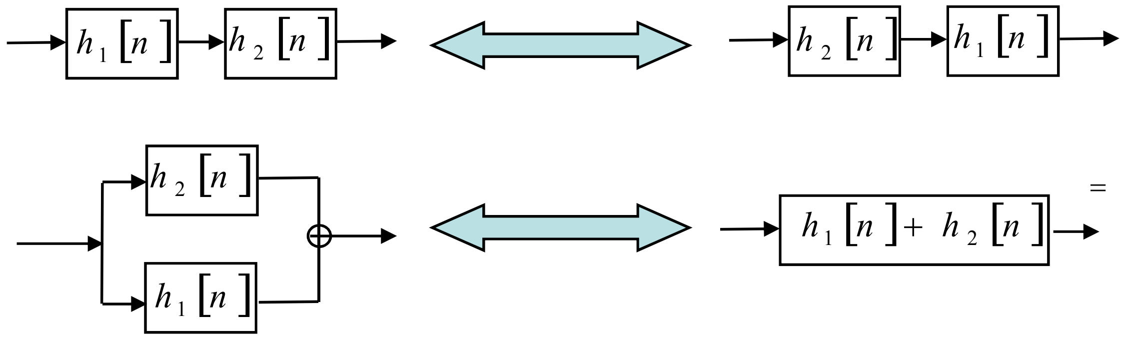
- Linear time-invariant (LTI)
  - Convolution is commutative and distributive

Commutation

$$x[n]*h_1[n]*h_2[n] = x[n]*h_2[n]*h_1[n]$$

Distribution

$$x[n]*(h_1[n]+h_2[n]) = x[n]*h_1[n]+x[n]*h_2[n]$$



– An impulse response has finite duration
  » **Finite-Impulse Response (FIR)**

– An impulse response has infinite duration
  » **Infinite-Impulse Response (IIR)**

$$\begin{aligned} y[n] &= x[n]*h[n] \\ &= h[n]*x[n] \\ &= \sum_{k=-\infty}^{\infty} x[k]\,h[n-k] \\ &= \sum_{k=-\infty}^{\infty} h[k]\,x[n-k] \end{aligned}$$

Properties of Digital Systems (cont.)

- Prove convolution is commutative

$$
\begin{aligned}
y[n] &= x[n] * h[n] \\
&= \sum_{k=-\infty}^{\infty} x[k]\, h[n-k] \\
&= \sum_{m=-\infty}^{\infty} x[n-m]\, h[m] \quad (\text{let } \mathrm{m} = n-k) \\
&= \sum_{k=-\infty}^{\infty} h[k]\, x[n-k] \\
&= h[n] * x[n]
\end{aligned}
$$

Properties of Digital Systems (cont.)

- Linear time-varying System
  - E.g., $y[n] = x[n]\cos\omega_0 n$ is an amplitude modulator

$$\text{suppose that} \quad x_1[n] = x[n-n_0] \Rightarrow y_1[n] \stackrel{?}{=} y[n-n_0]$$

$$y_1[n] = x_1[n]\cos\omega_0 n = \underline{x[n-n_0]\cos\omega_0 n}$$

$$\text{But} \quad y[n-n_0] = \underline{x[n-n_0]\cos\omega_0(n-n_0)}$$

Properties of Digital Systems (cont.)

- **Bounded Input and Bounded Output (BIBO)**: stable

$$|x[n]| \leq B_x < \infty \quad \forall n \qquad \text{and}$$
$$|y[n]| \leq B_y < \infty \quad \forall n$$

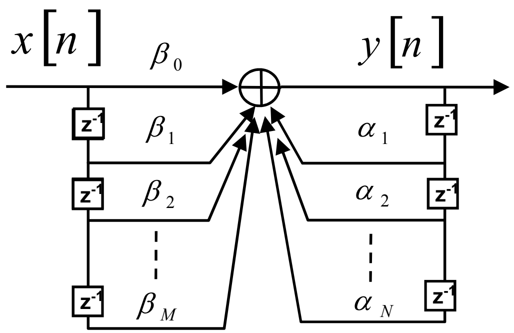
  – **A LTI system** is BIBO if only if *h*[*n*] is absolutely summable

$$\sum_{k=-\infty}^{\infty} |h[k]| \leq \infty$$

Properties of Digital Systems (cont.)

- **Causality**
  - A system is “casual” if for every choice of n_0, the output sequence value at indexing $n=n_0$ depends on only the input sequence value for $n \le n_0$

$$y[n_0] = \sum_{k=1}^{K} \alpha_k \, y[n_0 - k] + \sum_{k=m}^{M} \beta_k \, x[n_0 - m]$$



  - Any noncausal FIR can be made causal by adding sufficient long delay

Discrete-Time Fourier Transform (DTFT)

- Frequency Response $H\left(e^{j\omega}\right)$
  - Defined as the discrete-time Fourier Transform of $h[n]$
  - $H\left(e^{j\omega}\right)$ is continuous and is periodic with period= 2π

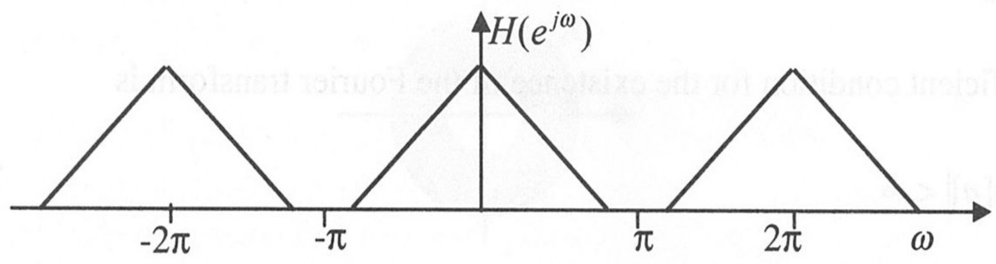


Figure 5.8 $H(e^{j\omega})$ is a periodic function of ω.

proportional to two times of the sampling frequency

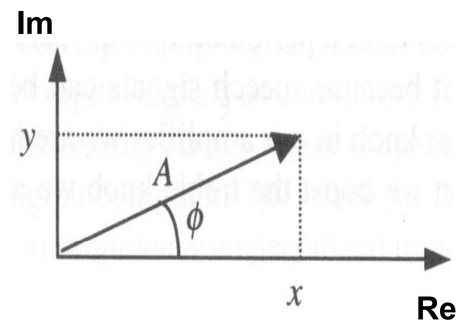
$$e^{j\omega n} = \cos \omega n + j \sin \omega n$$

  - $H\left(e^{j\omega}\right)$ is a complex function of ω

$$H\left(e^{j\omega}\right) = H_r\left(e^{j\omega}\right) + jH_i\left(e^{j\omega}\right)$$

$$= \left|H\left(e^{j\omega}\right)\right| e^{j\angle H\left(e^{j\omega}\right)}$$

magnitude
phase



Discrete-Time Fourier Transform (cont.)

- Representation of Sequences by Fourier Transform

$$H\left(e^{j\omega}\right)=\sum_{n=-\infty}^{\infty} h[n]e^{-j\omega n}$$ DTFT

$$h[n]=\frac{1}{2\pi}\int_{-\pi}^{\pi} H\left(e^{j\omega}\right)e^{j\omega n}d\omega$$ Inverse DTFT

  – A sufficient condition for the existence of Fourier transform

$$\sum_{n=-\infty}^{\infty} |h[n]| < \infty$$ *absolutely summable*

Fourier transform is invertible:

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

$$h[n]=\frac{1}{2\pi}\int_{-\pi}^{\pi} H\left(e^{j\omega}\right)e^{j\omega n}d\omega=\frac{1}{2\pi}\int_{-\pi}^{\pi}\sum_{m=-\infty}^{\infty} h[m]e^{-j\omega m}e^{j\omega n}d\omega$$

$$=\sum_{m=-\infty}^{\infty} h[m]\frac{1}{2\pi}\int_{-\pi}^{\pi} e^{j\omega(n-m)}d\omega=\sum_{m=-\infty}^{\infty} h[m]\delta[n-m]=h[n]$$

$$\frac{1}{2\pi}\int_{-\pi}^{\pi} e^{j\omega(n-m)}d\omega$$

$$=\frac{1}{j2\pi(n-m)}\left[e^{j\omega(n-m)}\right]_{-\pi}^{\pi}$$

$$=\frac{\sin\pi(n-m)}{\pi(n-m)}$$

$$=\begin{cases}1, & m=n\\ 0, & m\neq n\end{cases}$$

$$=\delta[n-m]$$

Discrete-Time Fourier Transform (cont.)

- Convolution Property

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

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

$$Y\left(e^{j\omega}\right)=\sum_{n=-\infty}^{\infty}\sum_{k=-\infty}^{\infty} x[k]h[n-k]e^{-j\omega n}$$

$$n'=n-k$$
$$\Rightarrow n=n'+k$$
$$\Rightarrow -n=-n'-k$$

$$=\sum_{k=-\infty}^{\infty} x[k]e^{-j\omega k}\left(\sum_{n'=-\infty}^{\infty} h[n']e^{-j\omega n'}\right)$$

$$=X\left(e^{j\omega}\right)H\left(e^{j\omega}\right)$$

$$\therefore\ x[n]*h[n]\Leftrightarrow X\left(e^{j\omega}\right)H\left(e^{j\omega}\right)$$

$$Y\left(e^{j\omega}\right)=X\left(e^{j\omega}\right)H\left(e^{j\omega}\right)$$
$$\Rightarrow \left|Y\left(e^{j\omega}\right)\right|=\left|X\left(e^{j\omega}\right)\right|\left|H\left(e^{j\omega}\right)\right|$$
$$\Rightarrow \angle Y\left(e^{j\omega}\right)=\angle X\left(e^{j\omega}\right)+\angle H\left(e^{j\omega}\right)$$

Discrete-Time Fourier Transform (cont.)

$*$: complex conjugate

$z = x + jy \Rightarrow z^* = x - jy$

$\Rightarrow z \cdot z^* = x^2 + y^2 = |z|^2$

- Parseval's Theorem

power spectrum

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

The total energy of a signal can be given in either the time or frequency domain.

- Define the autocorrelation of signal $x[n]$

$$R_{xx}[n] = \sum_{m=-\infty}^{\infty} x[m+n]x^*[m]$$

$l = m + n$

$\Rightarrow m = l - n = -(n - l)$

$$= \sum_{l=-\infty}^{\infty} x[l]x^*[-(n-l)] = x[n] * x^*[-n]$$

$\Leftrightarrow$

$$S_{xx}(\omega) = X(\omega)X^*(\omega) = |X(\omega)|^2$$

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

Set $n = 0$

$$R_{xx}[0] = \sum_{m=-\infty}^{\infty} x[m]x^*[m] = \sum_{m=-\infty}^{\infty} |x[m]|^2 = \frac{1}{2\pi}\int_{-\pi}^{\pi} |X(\omega)|^2 d\omega$$

Discrete-Time Fourier Transform (DTFT)

- A LTI system with impulse response $h[n]$
  - What is the output $y[n]$ for $x[n] = A\cos(\omega n + \phi)$

$$x_1[n] = jA\sin(\omega n + \phi)$$

$$x_0[n] = x[n] + x_1[n] = Ae^{j(\omega n + \phi)}$$

$$y_0[n] = Ae^{j(\omega n + \phi)} * h[n]$$

$$= \sum_{k=-\infty}^{\infty} h[k] Ae^{j(\omega(n-k)+\phi)}$$

$$= Ae^{j(\omega n + \phi)} \sum_{k=-\infty}^{\infty} h[k] e^{-j\omega k}$$

$$= Ae^{j(\omega n + \phi)} H\left(e^{j\omega}\right)$$

$$= Ae^{j(\omega n + \phi)} \left|H\left(e^{j\omega}\right)\right| e^{j\angle H\left(e^{j\omega}\right)}$$

System's frequency response

$\left|H\left(e^{j\omega}\right)\right| > 1$ amplify

$\left|H\left(e^{j\omega}\right)\right| < 1$ attenuate

$$= A\left|H\left(e^{j\omega}\right)\right| e^{j(\omega n + \phi) + j\angle H\left(e^{j\omega}\right)}$$

$y[n]$ $\qquad$ $y_1[n]$

$$= A\left|H\left(e^{j\omega}\right)\right| \cos\left((\omega n + \phi) + \angle H\left(e^{j\omega}\right)\right) + jA\left|H\left(e^{j\omega}\right)\right| \sin\left((\omega n + \phi) + \angle H\left(e^{j\omega}\right)\right)$$

$$\Rightarrow y[n] = A\left|H\left(e^{j\omega}\right)\right| \cos\left((\omega n + \phi) + \angle H\left(e^{j\omega}\right)\right)$$

Discrete-Time Fourier Transform (cont.)

Property	Signal	Fourier Transform
Linearity	$ax_1[n]+bx_2[n]$	$aX_1(e^{j\omega})+bX_2(e^{j\omega})$
Symmetry	$x[-n]$	$X(e^{-j\omega})$
	$x^*[n]$	$X^*(e^{-j\omega})$
	$x^*[-n]$	$X^*(e^{j\omega})$
	$x[n]$ real	$X(e^{j\omega})$ is *Hermitian* $X(e^{-j\omega})=X^*(e^{j\omega})$ $\lvert X(e^{j\omega})\rvert$ is even[6] $\mathrm{Re}\{X(e^{j\omega})\}$ is even $\arg\{X(e^{j\omega})\}$ is odd[7] $\mathrm{Im}\{X(e^{j\omega})\}$ is odd
	$\mathrm{Even}\{x[n]\}$	$\mathrm{Re}\{X(e^{j\omega})\}$
	$\mathrm{Odd}\{x[n]\}$	$j\,\mathrm{Im}\{X(e^{j\omega})\}$
Time-shifting	$x[n-n_0]$	$X(e^{j\omega})e^{-j\omega n_0}$
Modulation	$x[n]e^{j\omega_0 n}$	$X(e^{j(\omega-\omega_0)})$
	$x[n]z_0^n$	
Convolution	$x[n]*h[n]$	$X(e^{j\omega})H(e^{j\omega})$
	$x[n]y[n]$	$\frac{1}{2\pi}X(e^{j\omega})*Y(e^{j\omega})$
Parseval's Theorem	$R_{xx}[n]=\sum_{m=-\infty}^{\infty}x[m+n]x^*[m]$	$S_{xx}(\omega)=\lvert X(\omega)\rvert^2$

Z-Transform

- *z*-transform is a generalization of (Discrete-Time) Fourier transform

$$h[n] \longrightarrow H\left(e^{j\omega}\right)$$

$$h[n] \longrightarrow H(z)$$

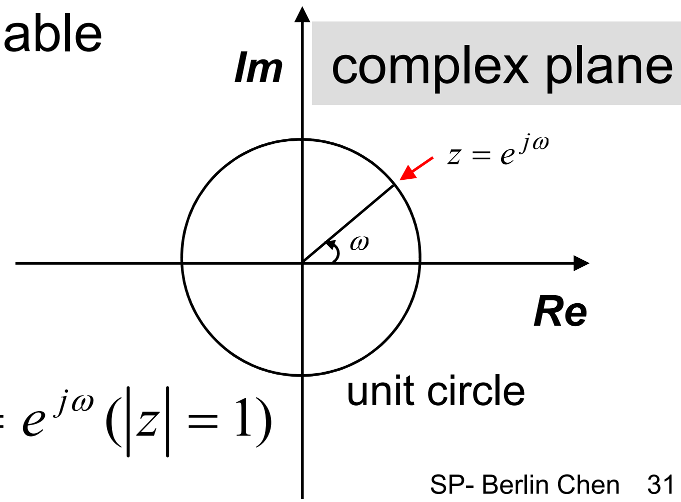
  – z-transform of $h[n]$ is defined as

$$H(z) = \sum_{n=-\infty}^{\infty} h[n] z^{-n}$$

  - Where $z = re^{j\omega}$, a complex-variable
  - For Fourier transform

$$H\left(e^{j\omega}\right) = H(z)\Big|_{z=e^{j\omega}}$$

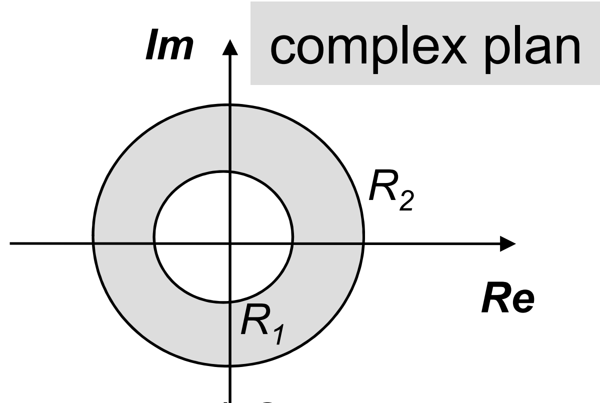
  – z-transform evaluated on the unit circle



$$z = e^{j\omega} \left(|z| = 1\right)$$

Z-Transform (cont.)

- Fourier transform vs. *z*-transform
  - Fourier transform used to plot the frequency response of a filter
  - z-transform used to analyze more general filter characteristics, e.g. stability



- ROC (Region of Converge)
  - Is the set of *z* for which *z*-transform exists (converges) ?

$$\sum_{n=-\infty}^{\infty} |h[n]||z|^{-n} < \infty$$

absolutely summable

  - In general, ROC is a **ring-shaped region** and the Fourier transform exists if ROC includes the unit circle ($|z| = 1$)

Z-Transform (cont.)

$$
\begin{aligned}
y[n] &= x[n] * h[n] \\
&= h[n] * x[n] \\
&= \sum_{k=-\infty}^{\infty} x[k]\, h[n-k] \\
&= \sum_{k=-\infty}^{\infty} h[k]\, x[n-k]
\end{aligned}
$$

- An LTI system is defined to be ***causal***, if its impulse response is a causal signal, i.e.

$$h[n] = 0 \quad \text{for} \quad n < 0$$

Right-sided sequence

  - Similarly, ***anti-causal*** can be defined as

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

Left-sided sequence

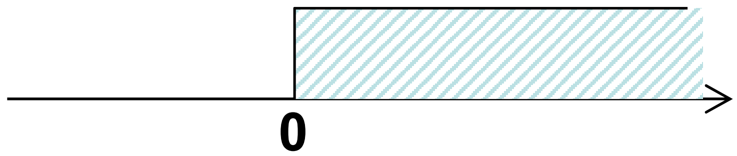
- An LTI system is defined to be ***stable***, if for every bounded input it produces a bounded output
  - Necessary condition:

$$\sum_{n=-\infty}^{\infty} \left| h[n] \right| < \infty$$

    - That is Fourier transform exists, and therefore z-transform includes the unit circle in its region of converge

Z-Transform (cont.)

- **Right-Sided Sequence**
  - E.g., the exponential signal



$$1. \quad h_1[n] = a^n u[n], \qquad \text{where } u[n] = \begin{cases} 1 & \text{for } n \geq 0 \\ 0 & \text{for } n < 0 \end{cases}$$

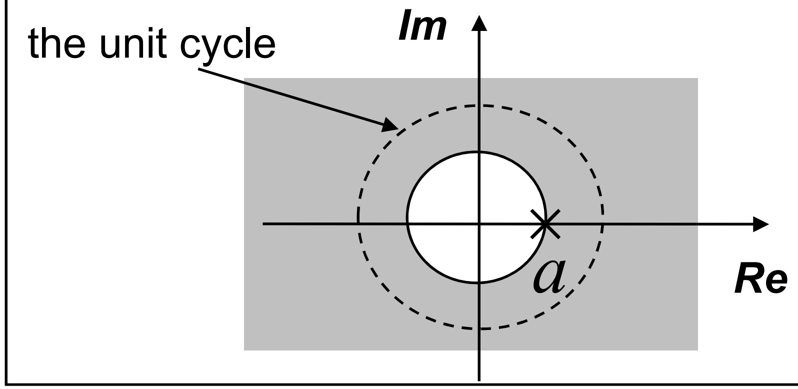
$$H_1(z) = \sum_{n=-\infty}^{\infty} a^n z^{-n} = \sum_{n=-\infty}^{\infty} \left(az^{-1}\right)^n = \frac{1}{1 - az^{-1}}$$

have a pole at $z = a$

(Pole: z-transform goes to infinity)

If $\left|az^{-1}\right| < 1$

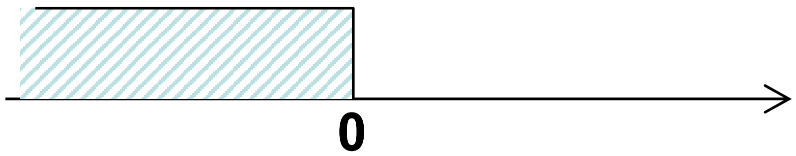
$$\therefore \; ROC_1 \text{ is } |z| > |a|$$



$$\text{Fourier transform of } h_1[n] \text{ exists if } |a| < 1$$

Z-Transform (cont.)

- **Left-Sided Sequence**
  - E.g.



2. $h_2[n] = -a^n u[-n-1]$ (n=0,-1,-2,..,-∞)

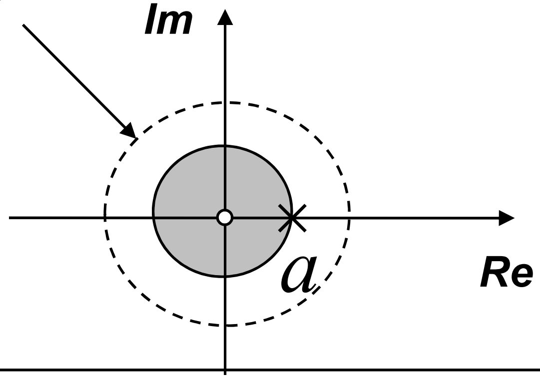
$$H_2(z) = -\sum_{n=-\infty}^{\infty} a^n u[-n-1] z^{-n} = -\sum_{n=-\infty}^{-1} a^n z^{-n}$$

If $\left|a^{-1}z\right| < 1$

$$= -\sum_{n=1}^{\infty} a^{-n} z^n = 1 - \sum_{n=0}^{\infty} \left(a^{-1}z\right)^n = 1 - \frac{1}{1-a^{-1}z} = -\frac{-a^{-1}z}{1-a^{-1}z} = \frac{1}{1-az^{-1}}$$

$\therefore\ ROC_2$ is $|z| < |a|$

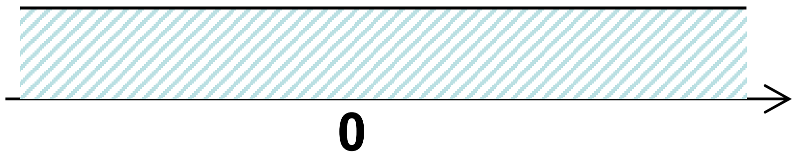
the unit cycle



when $|a| < 1$, the Fourier transform of $h_2[n]$ doesn't exist, because $h_2[n]$ will go exponentially as $n \to -\infty$

Z-Transform (cont.)

- **Two-Sided Sequence**



  – E.g.

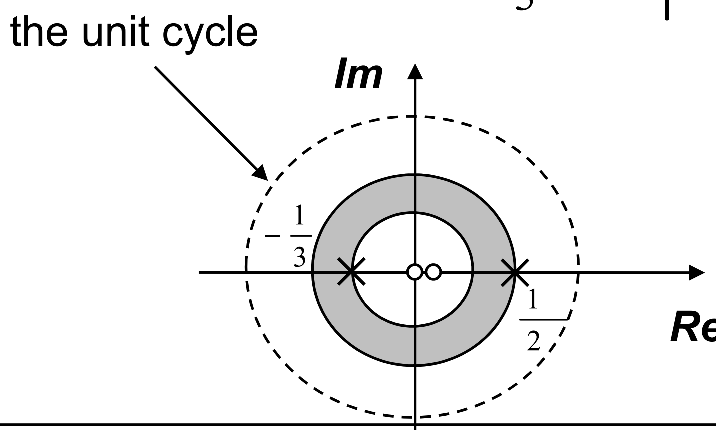
$$3.\quad h_3[n]=\left(-\frac{1}{3}\right)^n u[n]-\left(\frac{1}{2}\right)^n u[-n-1]$$

$$\left(-\frac{1}{3}\right)^n u[n] \overset{z}{\longleftrightarrow} \frac{1}{1+\frac{1}{3}z^{-1}},\quad |z|>\frac{1}{3}$$

$$-\left(\frac{1}{2}\right)^n u[-n-1] \overset{z}{\longleftrightarrow} \frac{1}{1-\frac{1}{2}z^{-1}},\quad |z|<\frac{1}{2}$$

$$H_3(z)=\frac{1}{1+\frac{1}{3}z^{-1}}+\frac{1}{1-\frac{1}{2}z^{-1}}=\frac{2z\left(z-\frac{1}{12}\right)}{\left(z+\frac{1}{3}\right)\left(z-\frac{1}{2}\right)}$$

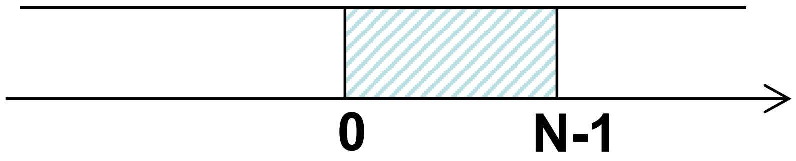
$$\therefore\ ROC_3 \text{ is } |z|<\left|\frac{1}{2}\right| \text{ and } |z|>\left|\frac{1}{3}\right|$$



Fourier transform of $h_3[n]$ doesn't exist, because ROC_3 doesn't include the unit circle

Z-Transform (cont.)

- **Finite-length Sequence**
  - E.g.



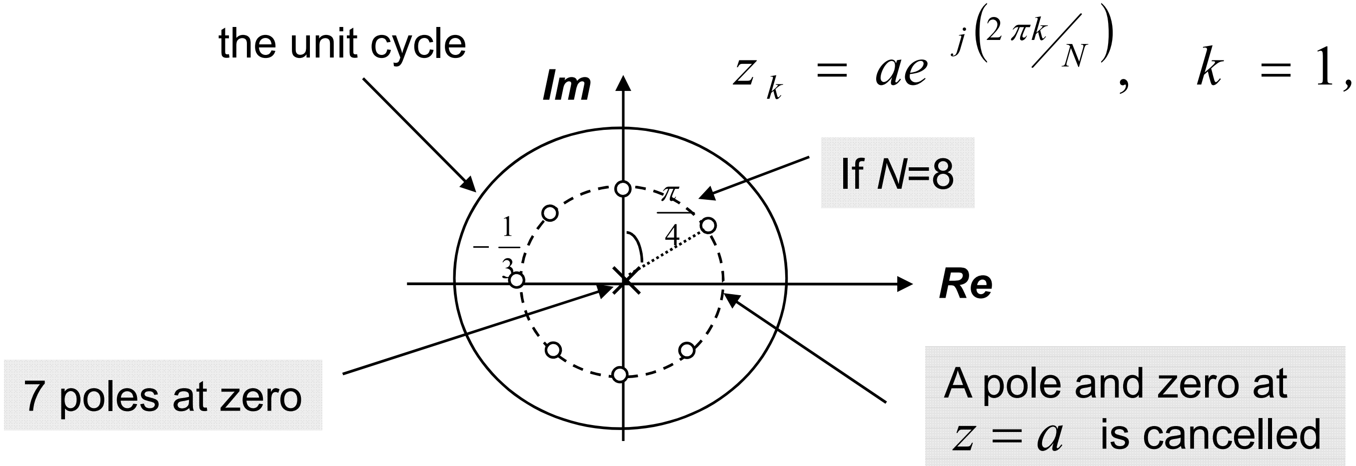
3. $$h_4[n] = \begin{cases} a^n, & 0 \le n \le N-1 \\ 0, & \text{others} \end{cases}$$

$$z^{N-1} + az^{N-2} + a^2 z^{N-3} + \ldots\ldots + a^{N-1}$$

$$H_4(z) = \sum_{n=0}^{N-1} a^n z^{-n} = \sum_{n=0}^{N-1} \left(az^{-1}\right)^n = \frac{1-\left(az^{-1}\right)^N}{1-az^{-1}} = \frac{1}{z^{N-1}} \frac{z^N - a^N}{z-a}$$

$$\therefore ROC_4 \text{ is entire } z\text{-plane except } z = 0$$

$$z_k = ae^{j\left(2\pi k / N\right)}, \quad k = 1,..,N-1$$



Z-Transform (cont.)

- **Properties of *z*-transform**

  1. If $h[n]$ is right-sided sequence, i.e. $h[n] = 0,\ n \le n_1$ and if *ROC* is the exterior of some circle, the **all finite** z for which $|z| > r_0$ will be in *ROC*

     - If $n_1 \ge 0$,*ROC* will include $z = \infty$

     > A causal sequence is right-sided with $n_1 \ge 0$
     > $\therefore$ ROC is the exterior of circle including $z = \infty$

  2. If $h[n]$ is left-sided sequence, i.e. $h[n] = 0,\ n \ge n_2$, the *ROC* is the interior of some circle,

     - If $n_2 < 0$,*ROC* will include $z = 0$

  3. If $h[n]$ is two-sided sequence, the *ROC* is a **ring**
  4. The ROC can't contain any poles

Summary of the Fourier and *z*-transforms

Table 5.5 Properties of the Fourier and *z*-transforms.

Property	Signal	Fourier Transform	*z*-Transform
Linearity	$ax_1[n]+bx_2[n]$	$aX_1(e^{j\omega})+bX_2(e^{j\omega})$	$aX_1(z)+bX_2(z)$
Symmetry	$x[-n]$	$X(e^{-j\omega})$	$X(z^{-1})$
	$x^*[n]$	$X^*(e^{-j\omega})$	$X^*(z^*)$
	$x^*[-n]$	$X^*(e^{j\omega})$	$X^*(1/z^*)$
	$x[n]$ real	$X(e^{j\omega})$ is *Hermitian* $X(e^{-j\omega})=X^*(e^{j\omega})$ $\lvert X(e^{j\omega})\rvert$ is even[6] $\mathrm{Re}\{X(e^{j\omega})\}$ is even $\arg\{X(e^{j\omega})\}$ is odd[7] $\mathrm{Im}\{X(e^{j\omega})\}$ is odd	$X(z^*)=X^*(z)$
	$\mathrm{Even}\{x[n]\}$	$\mathrm{Re}\{X(e^{j\omega})\}$	
	$\mathrm{Odd}\{x[n]\}$	$j\,\mathrm{Im}\{X(e^{j\omega})\}$	
Time-shifting	$x[n-n_0]$	$X(e^{j\omega})e^{-j\omega n_0}$	$X(z)z^{-n_0}$
Modulation	$x[n]e^{j\omega_0 n}$	$X(e^{j(\omega-\omega_0)})$	$X(e^{-j\omega_0}z)$
	$x[n]z_0^n$		$X(z/z_0)$
Convolution	$x[n]*h[n]$	$X(e^{j\omega})H(e^{j\omega})$	$X(z)H(z)$
	$x[n]y[n]$	$\frac{1}{2\pi}X(e^{j\omega})*Y(e^{j\omega})$	
Parseval's Theorem	$R_{xx}[n]=\sum_{m=-\infty}^{\infty}x[m+n]x^*[m]$	$S_{xx}(\omega)=\lvert X(\omega)\rvert^2$	$X(z)X^*(1/z^*)$

LTI Systems in the Frequency Domain

- **Example 1**: A complex exponential sequence $x[n] = e^{j\omega n}$
  – System impulse response $h[n]$

$$y[n] = x[n] * h[n] = \sum_{k=-\infty}^{\infty} h[k] e^{j\omega(n-k)}$$

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

$$= H\left(e^{j\omega}\right) e^{j\omega n}$$

$$\begin{aligned} y[n] &= x[n] * h[n] \\ &= h[n] * x[n] \\ &= \sum_{k=-\infty}^{\infty} x[k] h[n-k] \\ &= \sum_{k=-\infty}^{\infty} h[k] x[n-k] \end{aligned}$$

$H\left(e^{j\omega}\right)$: the Fourier transform of the system impulse response. It is often referred to as the system frequency response.

  – Therefore, a complex exponential input to an LTI system results in the same complex exponential at the output, but modified by $H\left(e^{j\omega}\right)$
    - The complex exponential is an eigenfunction of an LTI system, and $H\left(e^{j\omega}\right)$ is the associated eigenvalue

scalar

$$T\{x[n]\} = H\left(e^{j\omega}\right) x[n]$$

LTI Systems in the Frequency Domain (cont.)

- **Example 2**: A sinusoidal sequence $x[n] = A\cos(w_0 n + \phi)$

$$x[n] = A\cos(\omega_0 n + \phi) = \frac{A}{2} e^{j\phi} e^{j\omega_0 n} + \frac{A}{2} e^{-j\phi} e^{-j\omega_0 n}$$

$$e^{j\theta} = \cos\theta + i\sin\theta$$
$$e^{-j\theta} = \cos\theta - i\sin\theta$$
$$\Rightarrow \cos\theta = \frac{1}{2}\left(e^{j\theta} + e^{-j\theta}\right)$$

  – System impulse response $h[n]$

$$z = x + jy \qquad \Rightarrow e^{j\omega} = \cos\omega + j\sin\omega$$
$$z^* = x - jy \qquad \Rightarrow \left(e^{j\omega}\right)^* = \cos\omega - j\sin\omega$$
$$e^{-j\omega} = \cos(-\omega) + j\sin(-\omega) = \cos\omega - j\sin\omega$$

$$y[n] = H\left(e^{j\omega_0}\right)\frac{A}{2} e^{j\phi} e^{j\omega_0 n} + H\left(e^{-j\omega_0}\right)\frac{A}{2} e^{-j\phi} e^{-j\omega_0 n}$$

$$H\left(e^{-j\omega_0}\right) = H^*\left(e^{j\omega_0}\right)$$
$$H^*\left(e^{j\omega_0}\right) = \left|H\left(e^{j\omega_0}\right)\right| e^{-j\angle H\left(e^{j\omega_0}\right)}$$

$$= \frac{A}{2}\left[H\left(e^{j\omega_0}\right)e^{j(\omega_0 n + \phi)} + H^*\left(e^{j\omega_0}\right)e^{-j(\omega_0 n + \phi)}\right]$$

$$= \frac{A}{2}\left[\left|H\left(e^{j\omega_0}\right)\right| e^{j\angle H\left(e^{j\omega_0}\right)} e^{j(\omega_0 n + \phi)} + \left|H\left(e^{j\omega_0}\right)\right| e^{-j\angle H\left(e^{j\omega_0}\right)} e^{-j(\omega_0 n + \phi)}\right]$$

magnitude response   phase response

$$= A\left|H\left(e^{j\omega_0}\right)\right| \cos\left[\omega_0 n + \phi + \angle H\left(e^{j\omega_0}\right)\right]$$

LTI Systems in the Frequency Domain (cont.)

- **Example 3**: A sum of sinusoidal sequences

$$x[n] = \sum_{k=1}^{K} A_k \cos(\omega_k n + \phi_k)$$

$$y[n] = \sum_{k=1}^{K} A_k \left|H\left(e^{j\omega_k}\right)\right| \cos\left[\omega_k n + \phi_k + \angle H\left(e^{j\omega_k}\right)\right]$$

magnitude response — phase response

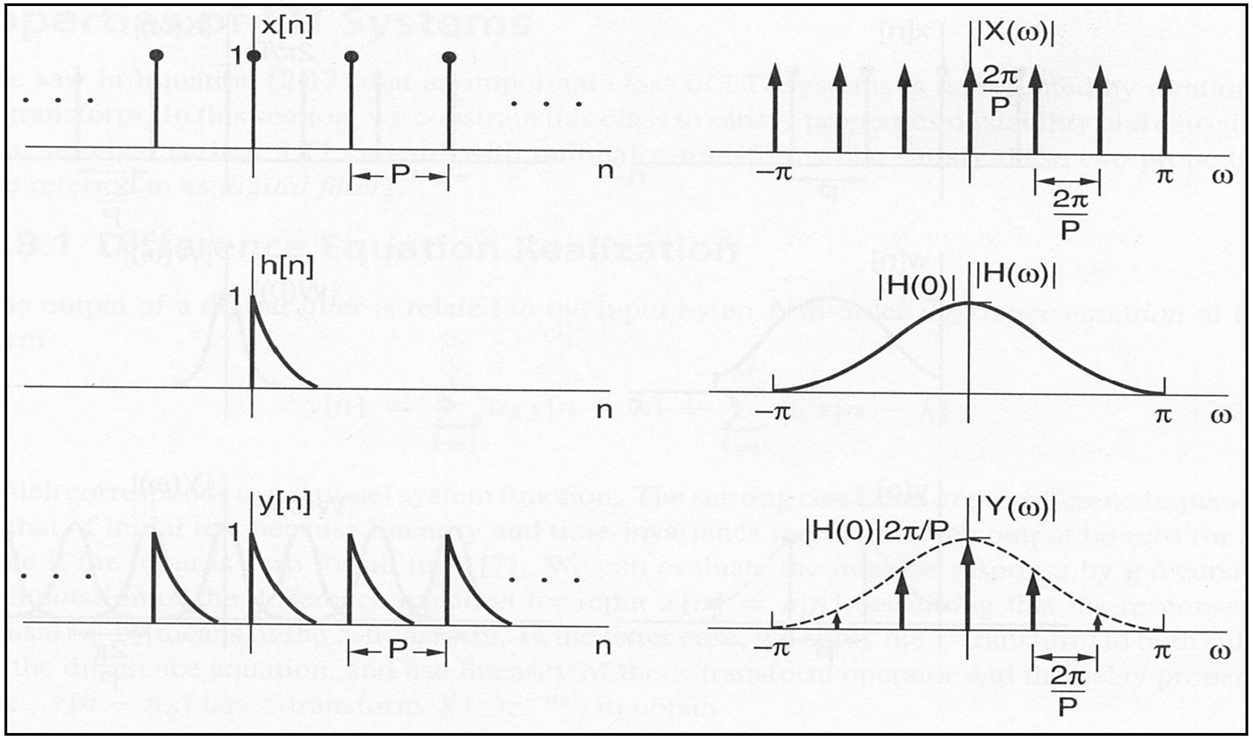
  – A similar expression is obtained for an input consisting of a sum of complex exponentials

LTI Systems in the Frequency Domain (cont.)

- **Example 4: Convolution Theorem** $x[n]*h[n] \Leftrightarrow X(e^{j\omega})H(e^{j\omega})$

$$x[n]=\sum_{k=-\infty}^{\infty}\delta[n-kP] \xrightarrow{\text{DTFT}} X(e^{j\omega})=\sum_{k=-\infty}^{\infty}\frac{2\pi}{P}\delta\left[\left(\omega-\frac{2\pi}{P}k\right)\right]$$

$$h[n]=\sum_{k=-\infty}^{\infty}a^n u[n],\ |a|<1 \xrightarrow{\text{DTFT}} H(e^{j\omega})=\frac{1}{1-ae^{-j\omega}}$$



$$Y(e^{j\omega})=H(e^{j\omega})X(e^{j\omega})$$

$$=\frac{1}{1-ae^{-j\omega}}\sum_{k=-\infty}^{\infty}\frac{2\pi}{P}\delta\left[\left(\omega-\frac{2\pi}{P}k\right)\right]$$

$$=\frac{2\pi}{P}\frac{1}{1-ae^{-j\omega}}$$

has a nonzero value when

$$k=\frac{\omega P}{2\pi}$$

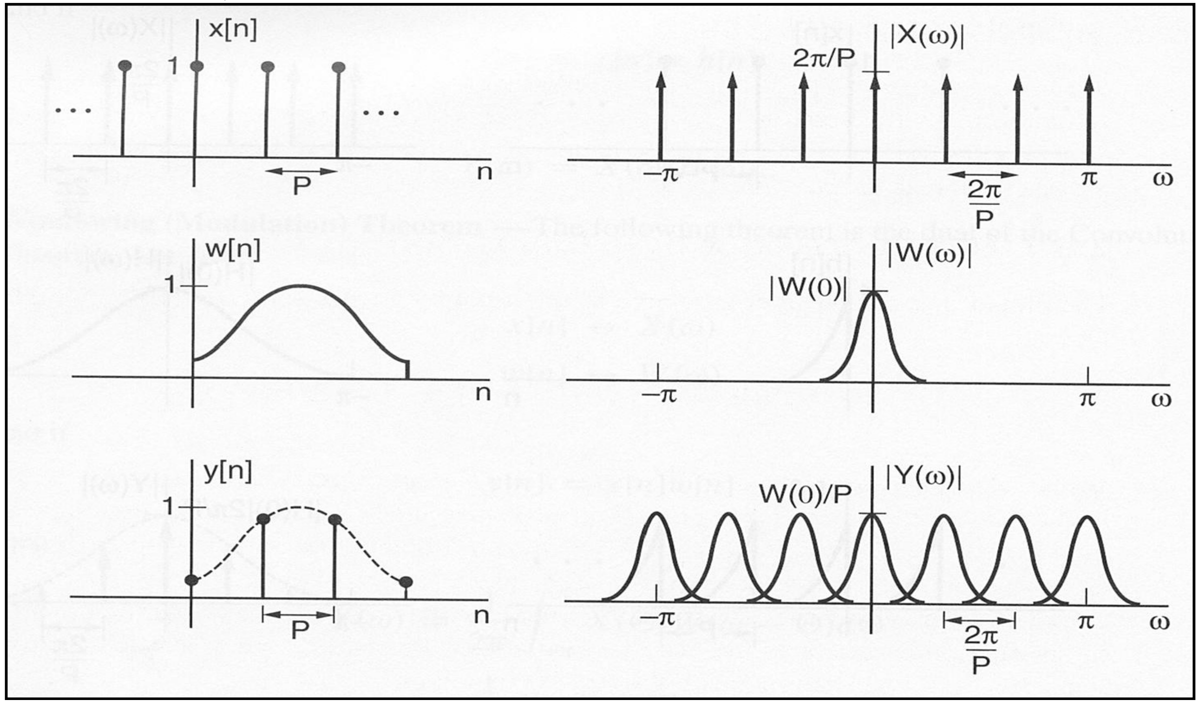
LTI Systems in the Frequency Domain (cont.)

- **Example 5: Windowing Theorem** $x[n]w[n] \Leftrightarrow \frac{1}{2\pi} W(e^{j\omega}) * X(e^{j\omega})$

$$x[n] = \sum_{k=-\infty}^{\infty} \delta[n - kP]$$

$$w[n] = \begin{cases} 0.54 - 0.46\cos\left(\frac{2\pi n}{N-1}\right), & n = 0,1,\ldots\ldots, N-1 \\ 0 & \text{otherwise} \end{cases}$$

Hamming window



$$Y(e^{j\omega}) = \frac{1}{2\pi} W(e^{j\omega}) * X(e^{j\omega})$$

$$= \frac{1}{2\pi} W(e^{j\omega}) * \sum_{k=-\infty}^{\infty} \frac{2\pi}{P} \delta\left(\omega - \frac{2\pi}{P}k\right)$$

$$= \frac{1}{P} \sum_{k=-\infty}^{\infty} \left\{ W(e^{j\omega}) * \delta\left(\omega - \frac{2\pi}{P}k\right) \right\}$$

$$= \frac{1}{P} \sum_{k=-\infty}^{\infty} \left\{ \sum_{m=-\infty}^{m=\infty} W(e^{jm}) \delta\left(\omega - \frac{2\pi}{P}k - m\right) \right\}$$

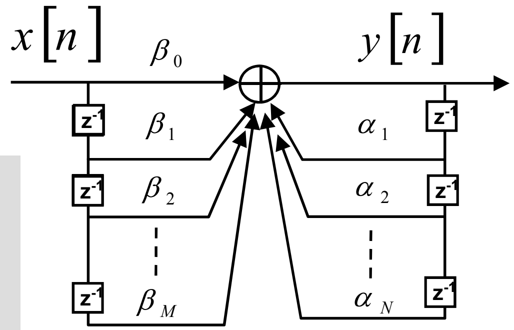
$$= \frac{1}{P} \sum_{k=-\infty}^{\infty} W\left(e^{j\left(\omega - \frac{2\pi}{P}k\right)}\right)$$

has a nonzero value when $m = \omega - \frac{2\pi}{P}k$

Difference Equation Realization for a Digital Filter

- The relation between the output and input of a digital filter can be expressed by

$$y[n] = \sum_{k=1}^{N} \alpha_k y[n-k] + \sum_{k=0}^{M} \beta_k x[n-k]$$



linearity and delay properties

delay property

$$x[n] \rightarrow X(z)$$

$$x[n-n_0] \rightarrow X(z) z^{-n_0}$$

$$Y(z) = \sum_{k=1}^{N} \alpha_k Y(z) z^{-k} + \sum_{k=0}^{M} \beta_k X(z) z^{-k}$$

A rational transfer function

$$H(z) = \frac{Y(z)}{X(z)} = \frac{\sum_{k=0}^{M} \beta_k z^{-k}}{1 - \sum_{k=1}^{N} \alpha_k z^{-k}}$$

Causal:
Rightsided, the ROC outside the outmost pole

Stable:
The ROC includes the unit circle

Causal and Stable:
all poles must fall inside the unit circle (not including zeros)

Difference Equation Realization for a Digital Filter (cont.)

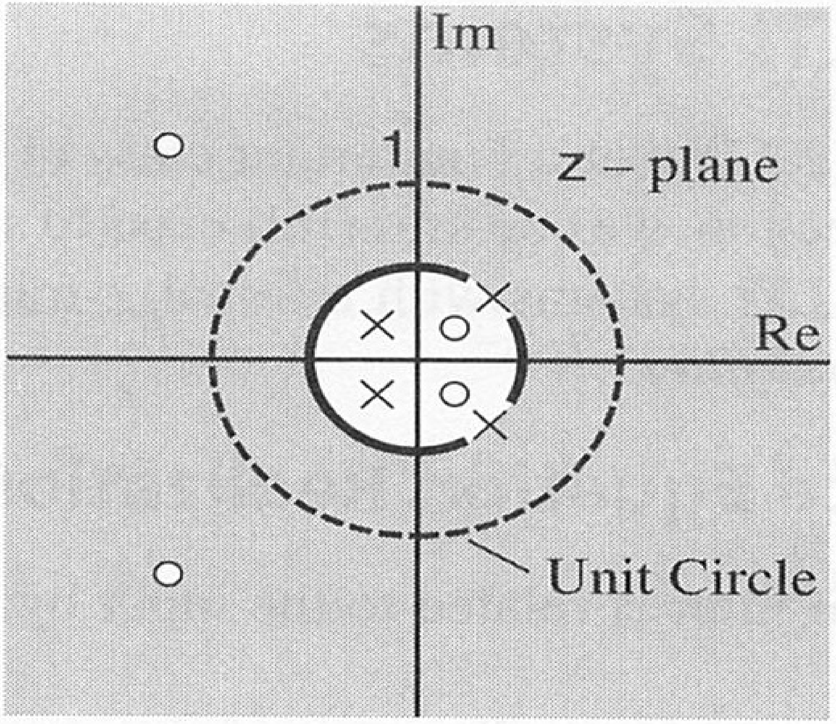


Figure 2.8 Pole-zero configuration for a causal and stable discrete-time system.

Magnitude-Phase Relationship

- **Minimum phase system:**
  - The z-transform of a system impulse response sequence (a rational transfer function) has all zeros as well as poles inside the unit cycle
  - Poles and zeros called "minimum phase components"
  - **Maximum phase**: all zeros (or poles) outside the unit cycle
- **All-pass system:**
  - Consist a cascade of factor of the form

$$\left[\frac{1\text{-}a^{*}z}{1-az^{-1}}\right]^{\pm 1}$$

  - Characterized by a frequency response with unit (or flat) magnitude for all frequencies $\left|\frac{1\text{-}a^{*}z}{1-az^{-1}}\right| = 1$

Poles and zeros occur at conjugate reciprocal locations

Magnitude-Phase Relationship (cont.)

- Any digital filter can be represented by the cascade of a minimum-phase system and an all-pass system

$$H(z) = H_{\min}(z) H_{ap}(z)$$

Suppose that $H(z)$ has only one zero $1/a^*$ ($|a| < 1$) outside the unit circle. $H(z)$ can be expressed as :

$$H(z) = H_1(z)\left(1 - a^* z\right) \quad (H_1(z) \text{ is a minimum phase filter})$$

$$= H_1(z)\left(1 - az^{-1}\right)\frac{\left(1 - a^* z\right)}{\left(1 - az^{-1}\right)}$$

where :

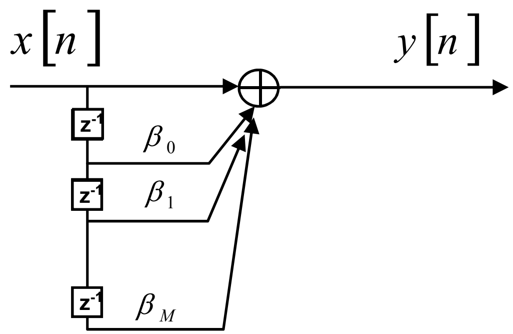
$H_1(z)\left(1 - az^{-1}\right)$ is also a minimum phase filter.

$\dfrac{\left(1 - a^* z\right)}{\left(1 - az^{-1}\right)}$ is a all-pass filter.

FIR Filters

- FIR (Finite Impulse Response)
  - The impulse response of an FIR filter has finite duration
  - Have no denominator in the rational function
    - No feedback in the difference equation

$H(z)$



$$y[n] = \sum_{r=0}^{M} \beta_r x[n-r]$$

$$h[n] = \begin{cases} \beta_n, & 0 \le n \le M \\ 0, & \text{otherwise} \end{cases}$$

$$H(z) = \frac{Y(z)}{X(z)} = \sum_{k=0}^{M} \beta_k z^{-k}$$

  - Can be implemented with simple a train of delay, multiple, and add operations

First-Order FIR Filters

- A special case of FIR filters

$$y[n] = x[n] + \alpha x[n-1] \quad \Longleftrightarrow \quad H(z) = 1 + \alpha z^{-1}$$

$$H\left(e^{j\omega}\right) = 1 + \alpha e^{-j\omega}$$

$$\left|H\left(e^{j\omega}\right)\right|^2 = \left|1 + \alpha(\cos\omega - j\sin\omega)\right|^2$$

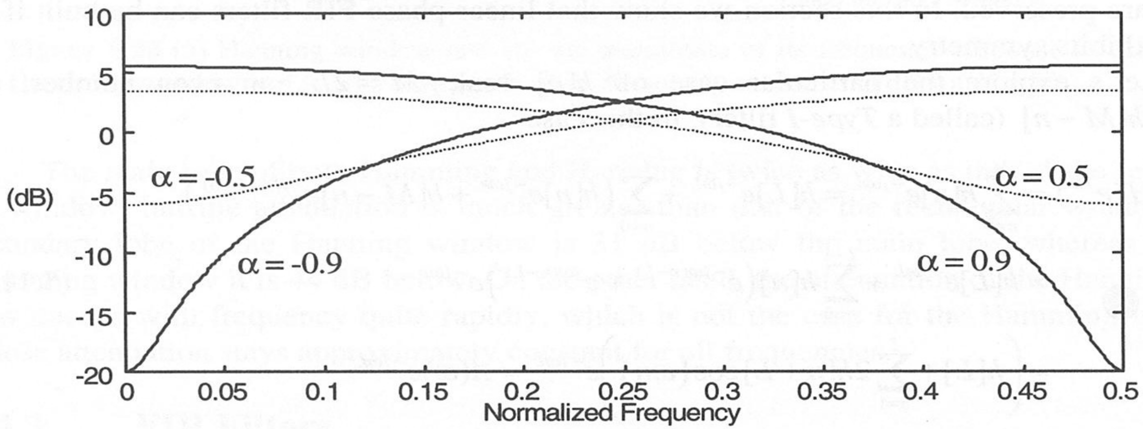
Re Im

$$= (1 + \alpha\cos\omega)^2 + (\alpha\sin\omega)^2 = 1 + \alpha^2 + 2\alpha\cos\omega$$

$$\theta\left(e^{j\omega}\right) = -\arctan\left(\frac{\alpha\sin\omega}{1 + \alpha\cos\omega}\right)$$

$\alpha < 0$: pre-emphasis filter

Re



$$10\log\left|H\left(e^{j\omega}\right)\right|^2$$

Figure 5.21 Frequency response of the first order FIR filter for various values of α.

Discrete Fourier Transform (DFT)

- The Fourier transform of a discrete-time sequence is a continuous function of frequency
  - We need to sample the Fourier transform finely enough to be able to recover the sequence
  - For a sequence of finite length *N*, sampling yields the new transform referred to as *discrete Fourier transform* (DFT)

$$X(k) = \sum_{n=0}^{N-1} x[n] e^{-j\frac{2\pi}{N}kn}, \quad 0 \le n \le N-1$$

DFT, **Analysis**

$$x[n] = \frac{1}{N} \sum_{k=0}^{N-1} X(k) e^{j\frac{2\pi}{N}kn}, \quad 0 \le n \le N-1$$

Inverse DFT, **Synthesis**

Discrete Fourier Transform (cont.)

$$\forall\ 0 \le k \le N-1$$

$$X[k] = \sum_{n=0}^{N-1} x[n] e^{-j\frac{2\pi}{N}kn}, \quad 0 \le n \le N-1$$

$$\begin{bmatrix} 1 & 1 & \cdots & 1 \\ 1 & e^{-j\frac{2\pi}{N}1\cdot 1} & \cdots & e^{-j\frac{2\pi}{N}1\cdot(N-1)} \\ \vdots & \vdots & \cdots & \vdots \\ 1 & e^{-j\frac{2\pi}{N}(N-1)\cdot 1} & \cdots & e^{-j\frac{2\pi}{N}(N-1)\cdot(N-1)} \end{bmatrix} \begin{bmatrix} x[0] \\ x[1] \\ \vdots \\ x[N-1] \end{bmatrix} = \begin{bmatrix} X[0] \\ X[1] \\ \vdots \\ X[N-1] \end{bmatrix}$$

Orthogonal

Discrete Fourier Transform (cont.)

- Orthogonality of Complex Exponentials

$$\frac{1}{N}\sum_{n=0}^{N-1} e^{j\frac{2\pi}{N}(k-r)n} = \begin{cases} 1, & \text{if } k\text{-}r = mN \\ 0, & \text{otherwise} \end{cases}$$

$$x[n] = \frac{1}{N}\sum_{k=0}^{N-1} X[k]\, e^{j\frac{2\pi}{N}kn}$$

$$\Rightarrow \sum_{n=0}^{N-1} x[n]\, e^{-j\frac{2\pi}{N}rn} = \sum_{n=0}^{N-1} \frac{1}{N}\sum_{k=0}^{N-1} X[k]\, e^{j\frac{2\pi}{N}(k-r)n}$$

$$= \sum_{k=0}^{N-1} X[k]\left[\frac{1}{N}\sum_{n=0}^{N-1} e^{j\frac{2\pi}{N}(k-r)n}\right]$$

$$= X[r]$$

$$\Rightarrow X[k] = \sum_{n=0}^{N-1} x[n]\, e^{-j\frac{2\pi}{N}kn}$$

$$X[k] = X[r + mN] = X[r]$$

Discrete Fourier Transform (DFT)

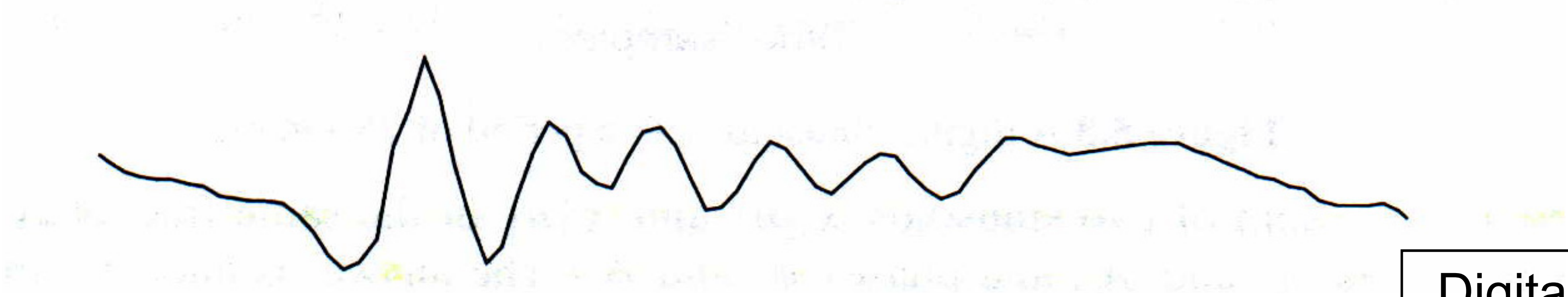
- Parseval's theorem

$$\sum_{n=0}^{N-1} \left| x[n] \right|^2 = \frac{1}{N} \sum_{k=0}^{N-1} \left| X(k) \right|^2$$

Energy density

Analog Signal to Digital Signal

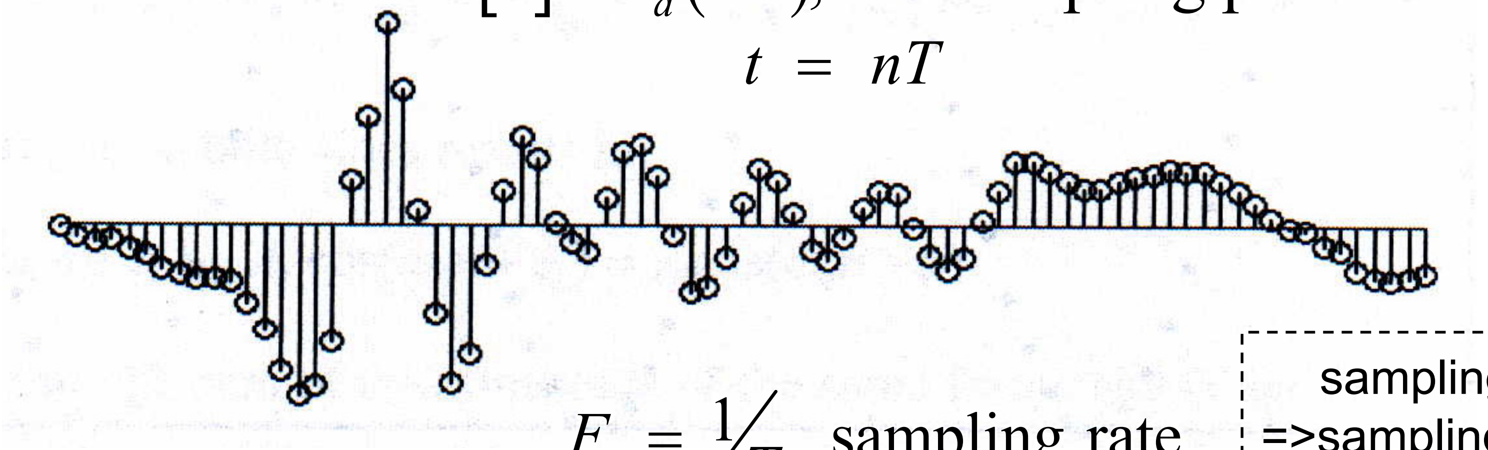
Analog Signal



Discrete-time Signal or Digital Signal

$$x[n] = x_a(nT), \quad T: \text{sampling period}$$

$$t = nT$$

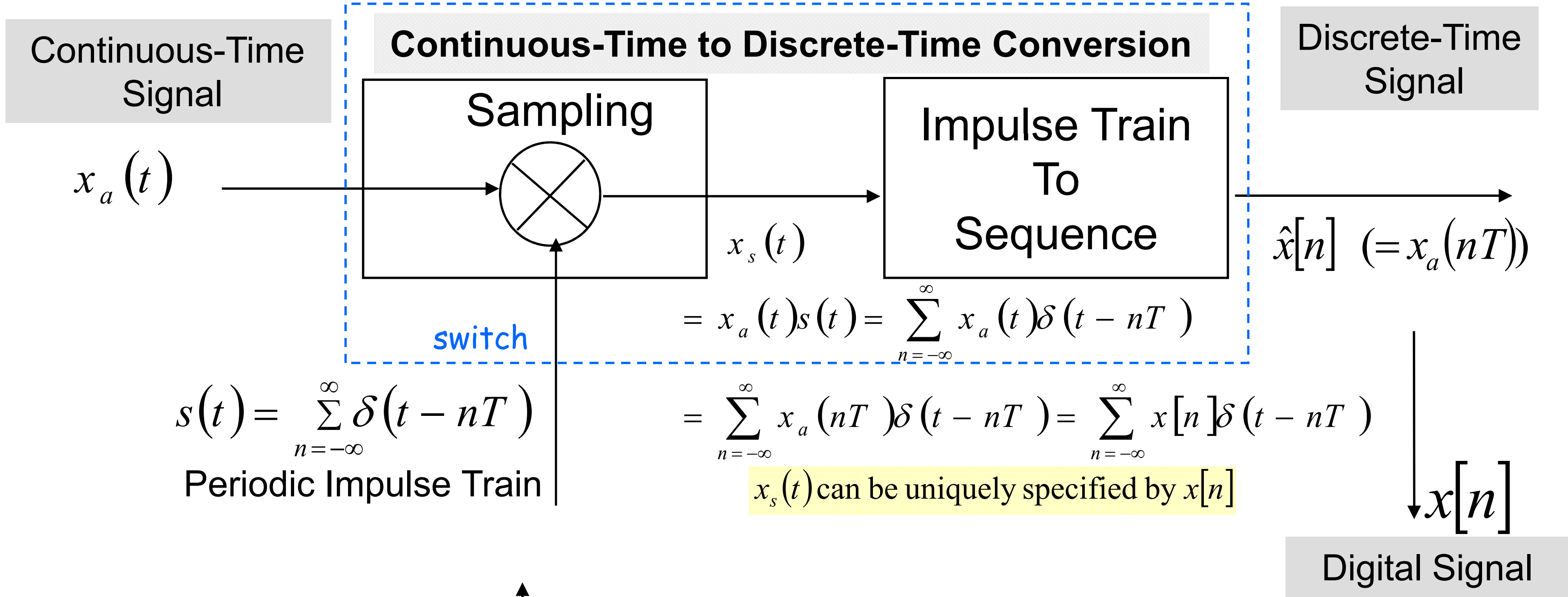


$$F_s = 1/T \quad \text{sampling rate}$$

Digital Signal:
Discrete-time signal with discrete amplitude

sampling period=125μs
=>sampling rate=8kHz

Analog Signal to Digital Signal (cont.)



$$= x_a(t)s(t) = \sum_{n=-\infty}^{\infty} x_a(t)\delta(t-nT)$$

$$= \sum_{n=-\infty}^{\infty} x_a(nT)\delta(t-nT) = \sum_{n=-\infty}^{\infty} x[n]\delta(t-nT)$$

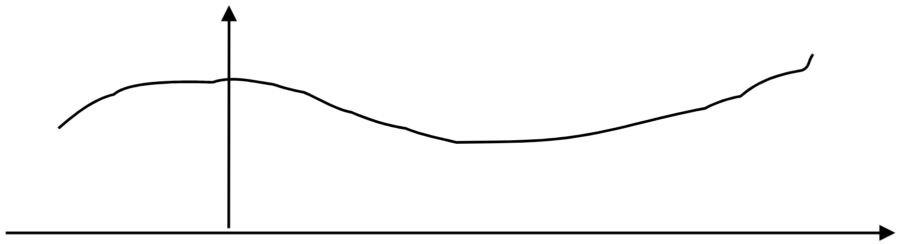
$$s(t) = \sum_{n=-\infty}^{\infty} \delta(t-nT)$$

Periodic Impulse Train

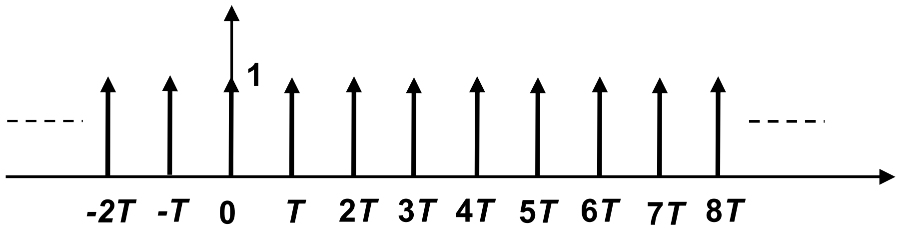
$x_s(t)$ can be uniquely specified by $x[n]$

Discrete-time signal with discrete amplitude

$x_a(t)$



$$s(t) = \sum_{n=-\infty}^{\infty} \delta(t-nT)$$

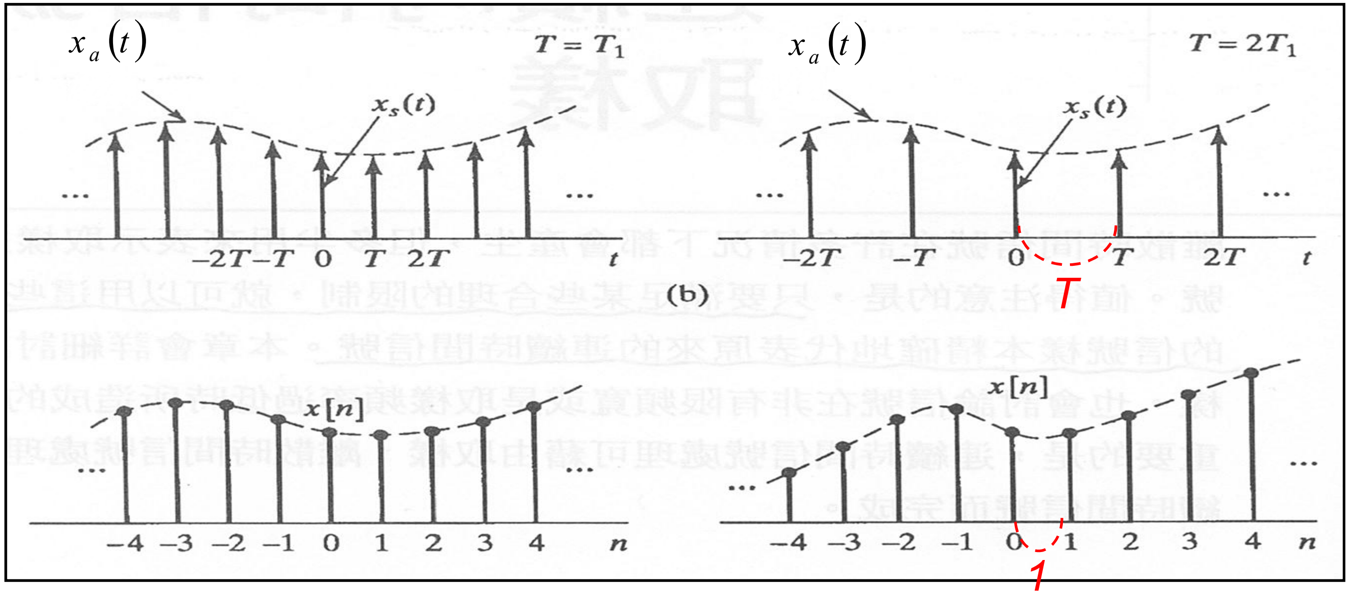


$$\delta(t) = 0, \quad \forall t \neq 0$$

$$\int_{-\infty}^{\infty} \delta(t)dt = 1$$

Analog Signal to Digital Signal (cont.)

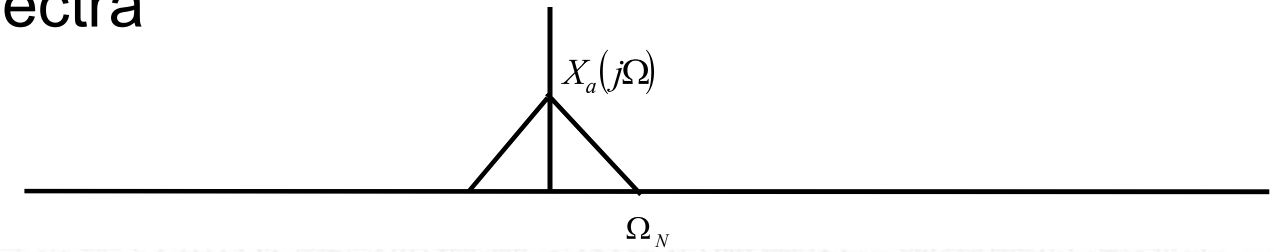
- A continuous signal sampled at different periods



$$
\begin{aligned}
& x_s(t) \\
&= x_a(t)s(t) = \sum_{n=-\infty}^{\infty} x_a(t)\delta(t-nT) \\
&= \sum_{n=-\infty}^{\infty} x_a(nT)\delta(t-nT) = \sum_{n=-\infty}^{\infty} x[n]\delta(t-nT)
\end{aligned}
$$

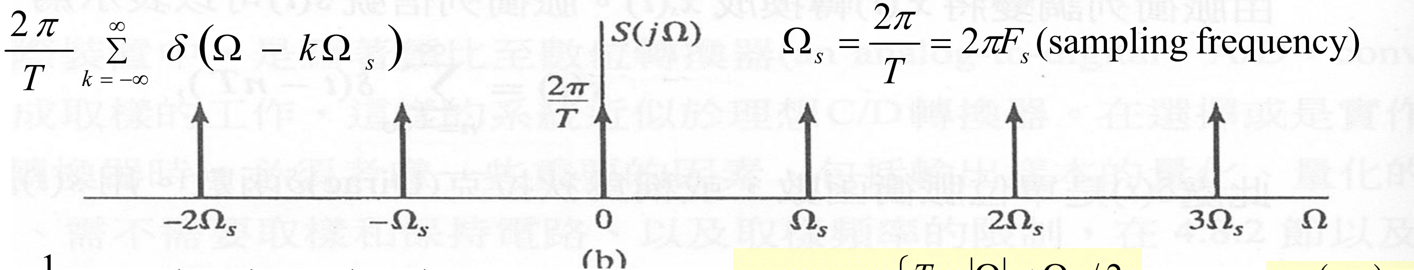
Analog Signal to Digital Signal (cont.)

- Spectra



$$S(j\Omega)=\frac{2\pi}{T}\sum_{k=-\infty}^{\infty}\delta(\Omega-k\Omega_s)$$

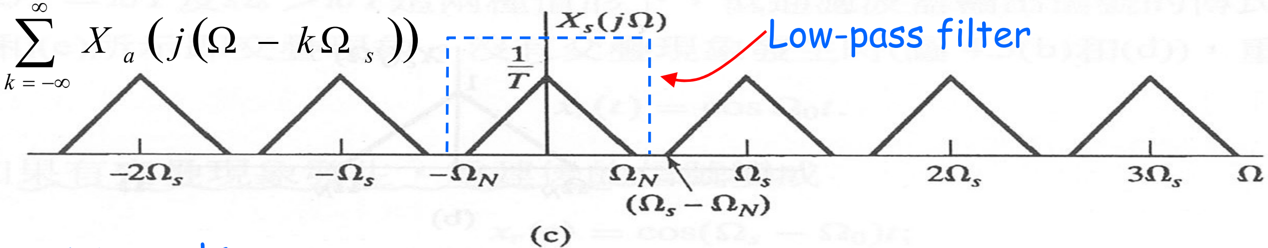
$$\Omega_s=\frac{2\pi}{T}=2\pi F_s \text{ (sampling frequency)}$$



$$X_s(j\Omega)=\frac{1}{2\pi}X_a(j\Omega)*S(j\Omega)$$

$$X_s(j\Omega)=\frac{1}{T}\sum_{k=-\infty}^{\infty}X_a(j(\Omega-k\Omega_s))$$

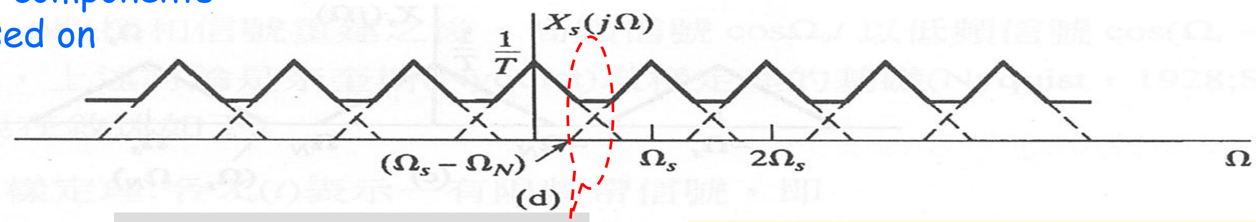
$$R_{\Omega_s}(j\Omega)=\begin{cases}T & |\Omega|<\Omega_s/2\\ 0 & \text{otherwise}\end{cases} \Rightarrow X_a(j\Omega)=R_{\Omega_s}(j\Omega)X_p(j\Omega)$$



$$\Omega_N<\frac{1}{2}\Omega_s\left(=\frac{\pi}{T}\right)$$

$$\left\{\begin{array}{l}\because(\Omega_s-\Omega_N)>\Omega_N\\ \Rightarrow\Omega_s>2\Omega_N\end{array}\right\}$$

high frequency components got superimposed on low frequency components



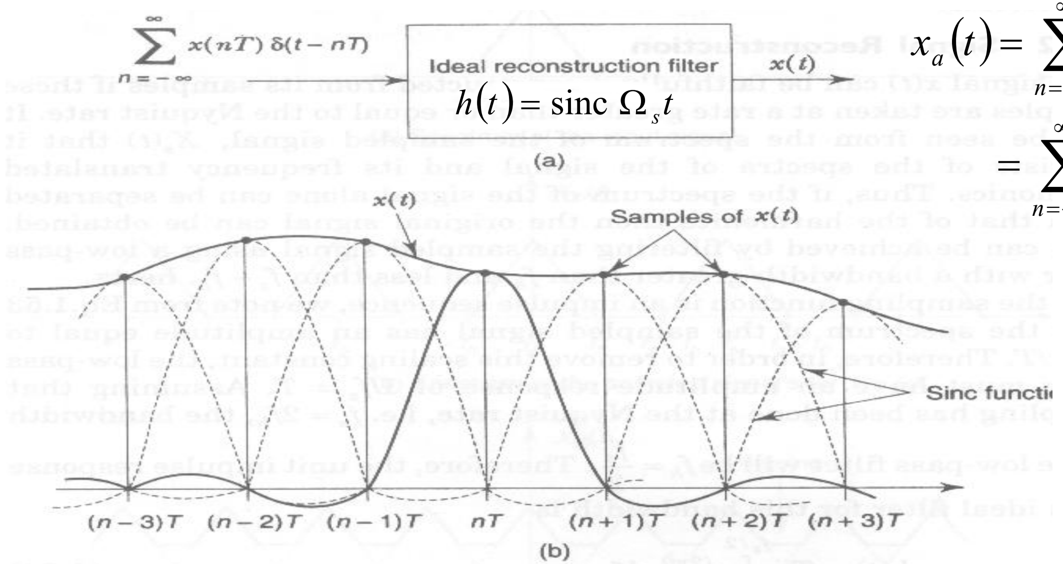
$$\Omega_N>\frac{1}{2}\Omega_s\left(=\frac{\pi}{T}\right)$$

$$\left\{\begin{array}{l}\because(\Omega_s-\Omega_N)<\Omega_N\\ \Rightarrow\Omega_s<2\Omega_N\end{array}\right\}$$

aliasing distortion $\Rightarrow$ $X_a(j\Omega)$ can't be recovered from $X_p(j\Omega)$

Analog Signal to Digital Signal (cont.)

- To avoid aliasing (*overlapping*, *fold over*)
  - The sampling frequency should be greater than two times of frequency of the signal to be sampled → $\Omega_s > 2\Omega_N$
  - (Nyquist) sampling theorem
- To reconstruct the original continuous signal
  - Filtered with a low pass filter with band limit Ω_s
    - Convolved in time domain



$$h(t) = \text{sinc}\ \Omega_s t$$

$$x_a(t) = \sum_{n=-\infty}^{\infty} x_a(nT)\,h(t-nT)$$

$$= \sum_{n=-\infty}^{\infty} x_a(nT)\,\text{sinc}\ \Omega_s(t-nT)$$