



# REAL TIME DIGITAL SIGNAL PROCESSING

# Multirate DSP

Decimation

Interpolation

Polyphase Filters

IFIR Filters

CIC Filters

# Outline

- ***Introduction***
- Sample Rate Conversion
- Decimation
  - ▣ Two - Stage
- Interpolation
  - ▣ Two - Stage
- Combining Decimation and Interpolation
- Polyphase Filters
- Application examples

# Introduction



# Outline

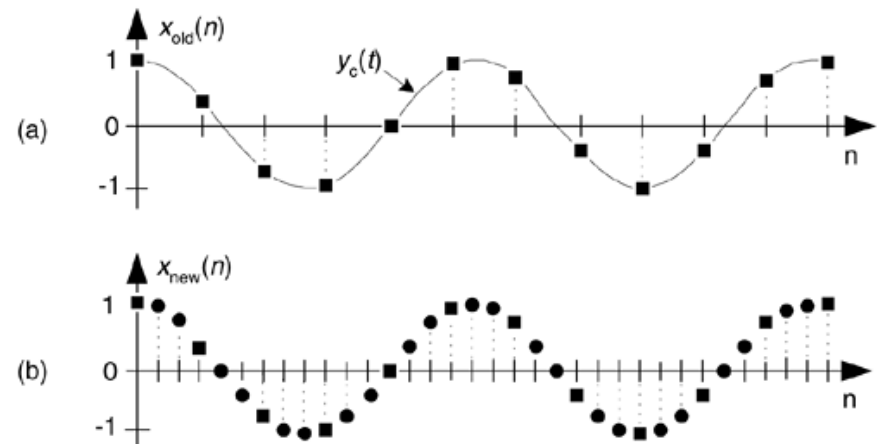
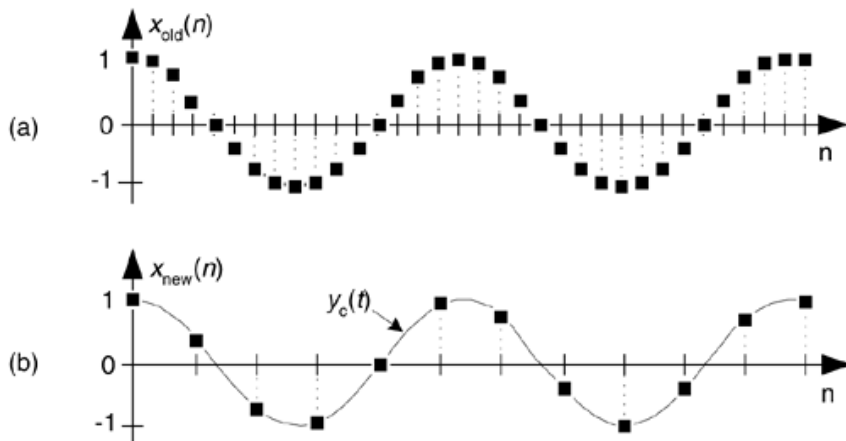
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# Sample Rate Conversion

- Consider the process where a continuous signal  $x(t)$  has been sampled at a rate of  $f_{s,old} = 1/T_{old}$ , and the discrete samples are  $x_{old}(n) = x(nT_{old})$ .
- Rate conversion is necessary when we need  $x_{new}(n) = x(nT_{new})$ , and direct sampling of the continuous  $x(t)$  at the rate of  $f_{s,new} = 1/T_{new}$  is not possible.
- How do we obtain  $x_{new}(n)$  directly from  $x_{old}(n)$ ?
  - ▣ One possibility is to digital-to-analog (D/A) convert the  $x_{old}(n)$  sequence to regenerate the continuous  $x(t)$  and then A/D convert  $x(t)$  at a sampling rate of  $f_{s,new}$  to obtain  $x_{new}(n)$ .
  - ▣ Due to the spectral distortions induced by D/A followed by A/D conversion, this technique limits our effective dynamic range and is typically avoided in practice.
  - ▣ Fortunately, accurate all-digital sample rate conversion schemes have been developed, as we shall see.

# Sample Rate Conversion

- Sampling rate changing come in two flavors:
  - Rate decreases -  $\downarrow M$ 
    - Its typically called **decimation**
    - Signal amplitude doesn't changes
  - Rate increases -  $\uparrow L$ 
    - Its typically called **interpolation**
    - It has amplitude loss
- It's not time invariant.

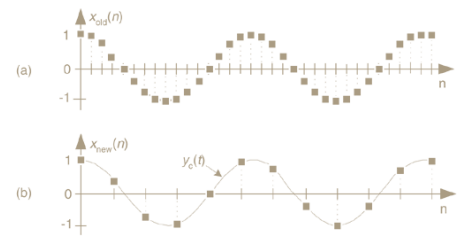


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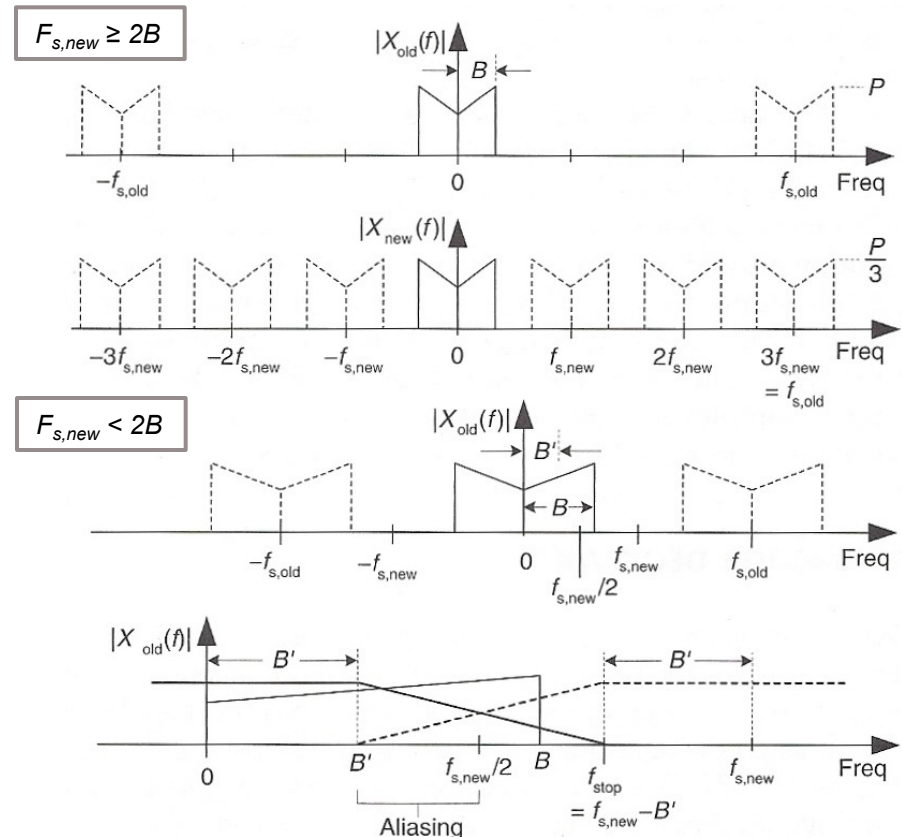


# Decimation

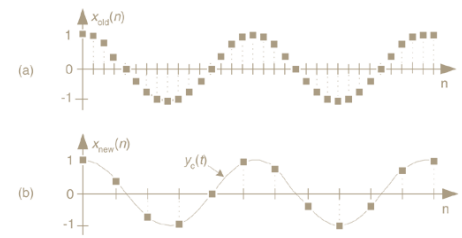


- Decimation is the two-step processes of **low-pass filtering** followed by an operation known as **downsampling**.
- We are using an alternate time index variable ***m***, rather than ***n***, to remind us that the time period between the  **$x_{new}(m)$**  samples is different from the time period between the  **$x_{old}(n)$**  samples.

$$f_{s,new} = \frac{f_{s,old}}{M}, \quad x_{new}(m) = x_{old}(Mn)$$



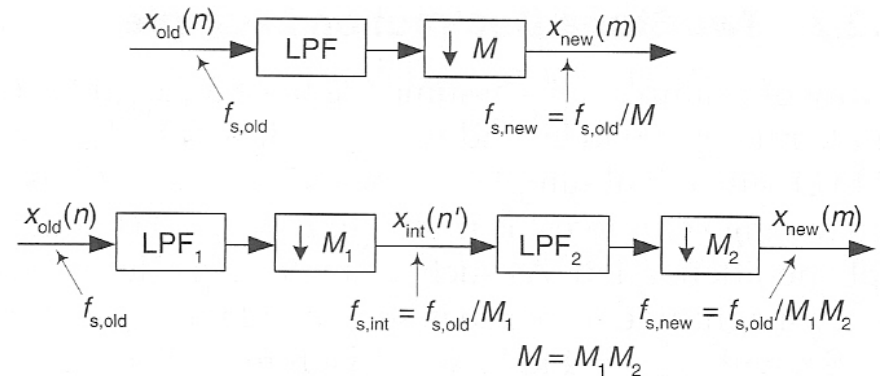
# Decimation



- If the original signal has a bandwidth  $B$ , and we're interested in retaining only the band  $B'$ , the signal above  $B'$  must be lowpass filtered, with full attenuation in the stopband beginning at  $f_{\text{stop}}$ , before the decimation process is performed.
- In practice, the nonrecursive **FIR** filter structure is the prevailing choice for **decimation filters** due to its **linear phase response**.
- It's not necessary compute filter output samples that are discarded. Digital **Polyphase Filters** avoid these computational inefficiencies.

# Two-Stage Decimation

- When the desired decimation factor  $M$  is large ( $M > 20$ ) there is an important feature of the filter/decimation process to keep in mind.
- The system in the figure are called multirate systems because there are two or more different data sample rate within a single system.



What should be the values of  $D_1$  and  $D_2$  to minimize the number of taps in lowpass filters  $LPF_1$  and  $LPF_2$ ?

$$M_{1,opt} \approx 2M \frac{1 - \sqrt{MF/(2-F)}}{2 - F(M+1)}, \quad F = \frac{f_{stop} - B'}{f_{stop}}$$

# Two-Stage Decimation Example

$f_{s,old} = 400\text{KHz}$  ,  $B > 100\text{KHz}$   
 $f_{s,new} = 4\text{KHz}$  ,  $B' = 1.8\text{KHz}$   
 60 dB stopband attenuation

$$M = f_{s,old} / f_{s,new} = 100$$

$$f_{stop} = f_{s,new} - B' = 2.2\text{KHz}$$

$$N_{FIR} = \text{Atten} / [22(f_{stop} - f_{pass})/f_s]$$

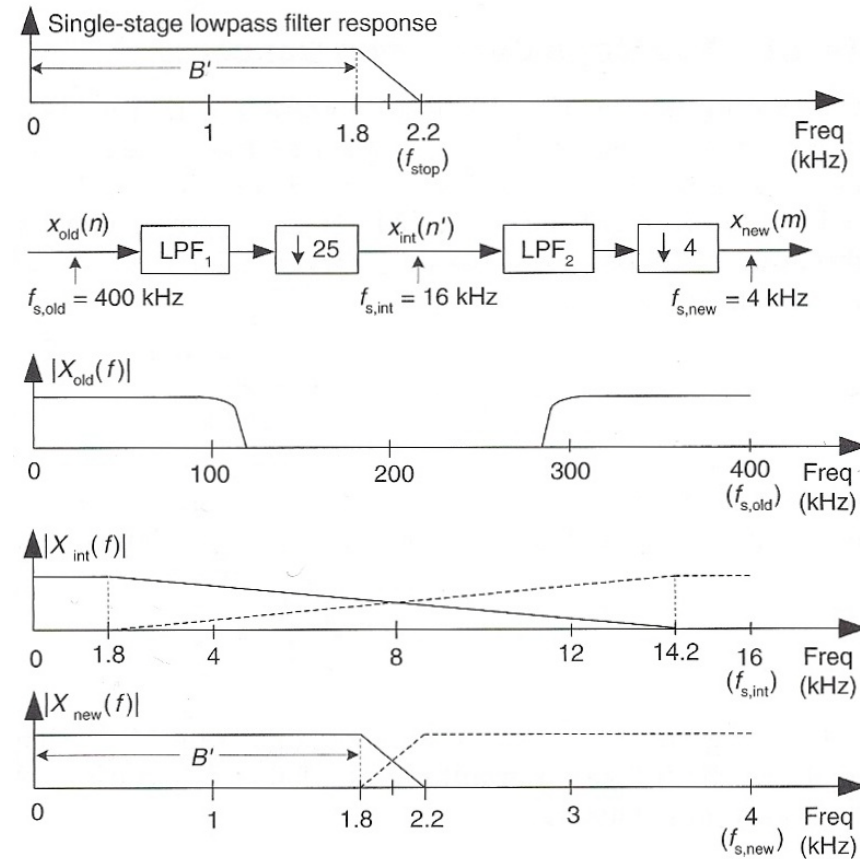
$$= 60 / [22 * (2.2 - 1.8) / 400]$$

$$= 2727$$

$$F = (2200 - 1800) / 2200 = 0.182$$

$$M_{1,opt} \approx 26.4 \rightarrow M_1 = 25, M_2 = 4$$

$$N_{LPF1} = 88 \quad N_{LPF2} = 109$$



1 stage:  $N_{FIR} \times M$  multiplications  
 2 stages:  $N_{LPF1} \times M_1 + N_{LPF2} \times M_2$  multiplications

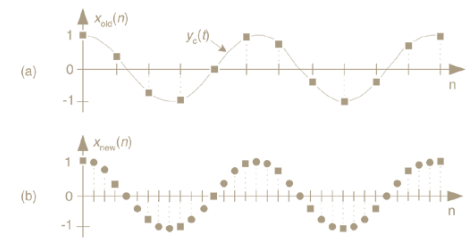
# Two-Stage Decimation

- It's always to our benefit to decimate in **order from the largest to the smallest** factor. ( $M_1 > M_2$ )
- It's advantageous to consider setting the  $M_1$  and  $M_2$  decimation factors equal to **integer powers of two** because we can use computationally efficient half-band filters for lowpass filters.
- If the dual filter system required a passband peak-peak of  $R$  dB, then **both filters** must be designed to have a **passband peak-peak  $\leq R/2$  dB**.
- The number of multiplications needed to compute each  $x_{new}(m)$  is much larger than  $N_{total}$ . **Polyphase filters** only requires  **$N_{total}$  multiplications** per  $x_{new}(m)$ .

# Outline

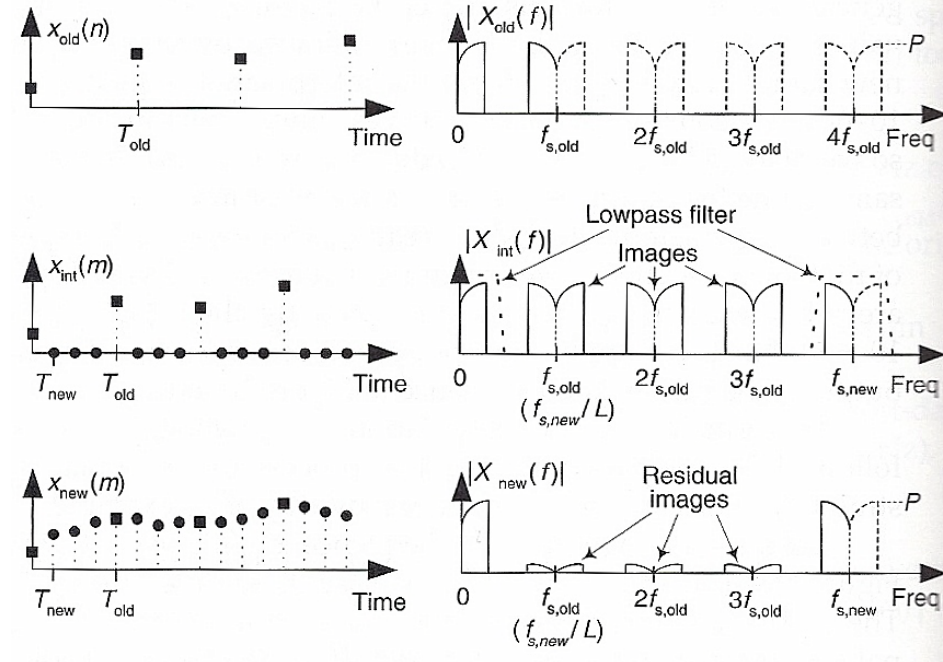
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# Interpolation

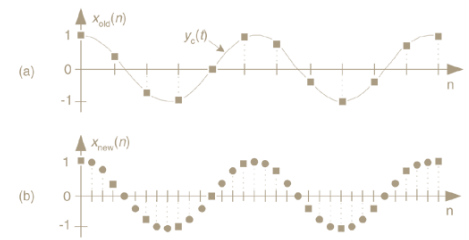


- Interpolation is the two-step processes of an operation known as **upsampling** followed by **low-pass filtering**.
- To increase a given  $f_{s,old}$  by an integer factor of  $L$ , we must to insert  **$L-1$  zero-valued samples** behind each sample in  $x_{old}(n)$ .

$$f_{s,new} = L \cdot f_{s,old}$$



# Interpolation

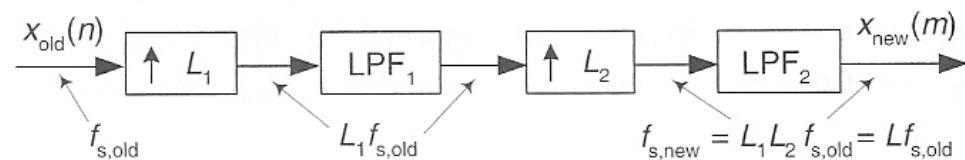
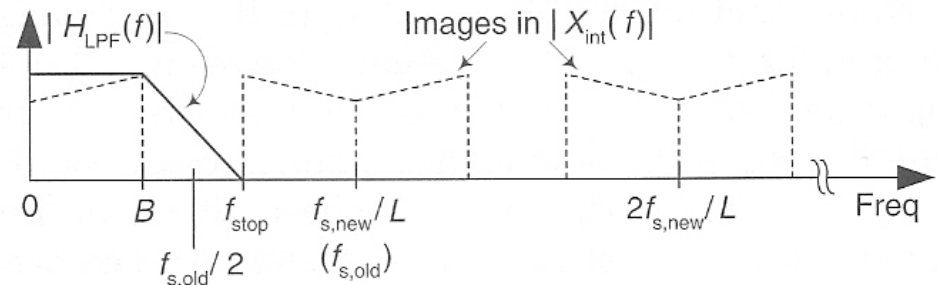
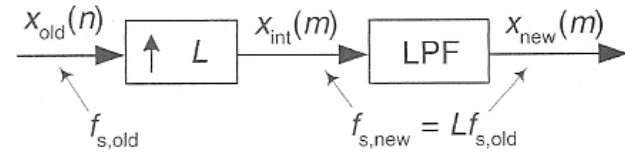


- We **can't implement** an **ideal lowpass filter**,  $x_{new}(m)$  will not be an exact interpolation of  $x_{old}(n)$ . The error manifests itself as the **residual images** within  $X_{new}(m)$ .
- We can only approximate an ideal lowpass interpolation filter. The **greater the stopband attenuation, the more accurate the interpolation**.
- Interpolation process, because of the zero-valued samples, has an inherent **amplitude loss factor of  $L$** . Thus to achieve unity gain between sequences  $x_{old}(n)$  and  $x_{new}(m)$ , the **interpolation filter must have a gain of  $L$** .



# Two-Stage Interpolation

- When the desired interpolation factor  $L$  is large ( $L > 20$ ) there is an important feature of the filter/interpolate process to keep in mind.
- The system in the figure are called multirate systems because there are two or more different data sample rate within a single system.



$$L_{2,opt} \approx 2L \frac{1 - \sqrt{LF/(2-F)}}{2 - F(L+1)}, \quad F = \frac{f_{stop} - B}{f_{stop}}$$

# Two-Stage Interpolation Example

$f_{s,old} = 44.1\text{KHz}$  ,  $B = 15\text{KHz}$   
 $f_{s,new} = 14.112\text{MHz}$   
 60 dB stopband attenuation

$$L = f_{s,new} / f_{s,old} = 320$$

$$f_{stop} = f_{s,old} - B = 29.1\text{KHz}$$

$$N_{FIR} = \text{Atten} / [22(f_{stop} - f_{pass})/f_s]$$

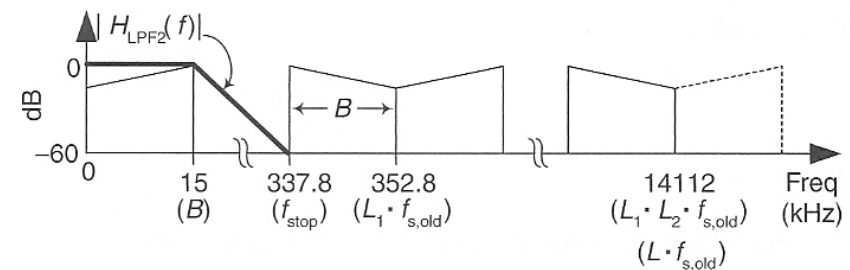
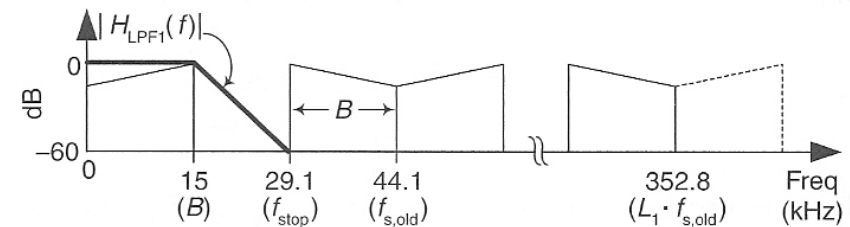
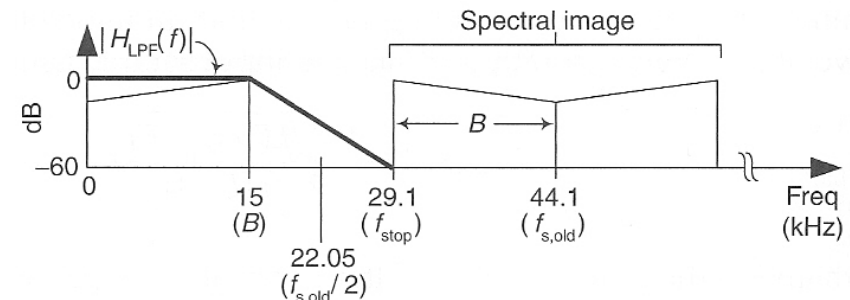
$$= 60 / [22 * (29.1 - 15) / 44.1]$$

$$= 2730$$

$$F = (29.1 - 15) / 29.1 = 0.4845$$

$$L_{2,opt} \approx 37.98 \rightarrow L_2 = 40, L_1 = 8$$

$$N_{LPF1} = 68 \quad N_{LPF2} = 119$$

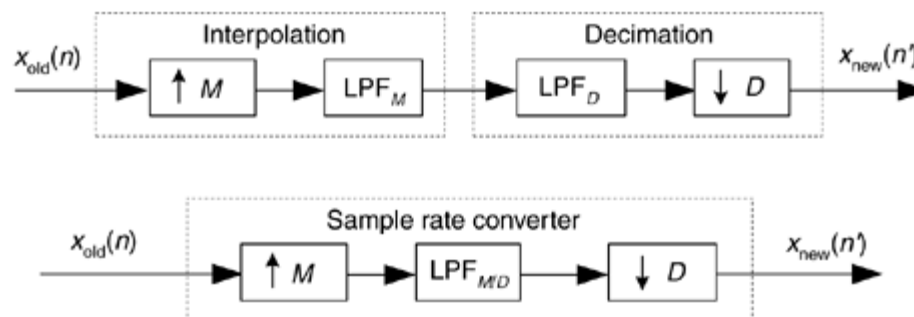


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# Combining Decimation and Interpolation

- We can implement sample rate conversion by any rational fraction  $L/M$  with interpolation by an integer factor of  $L$  followed by decimation by an integer factor of  $M$ .
- For hardware interpolator/decimators, we strive to implement designs optimizing the conflicting goals of high performance (minimum aliasing), simple architecture, high data throughput speed, and low power.

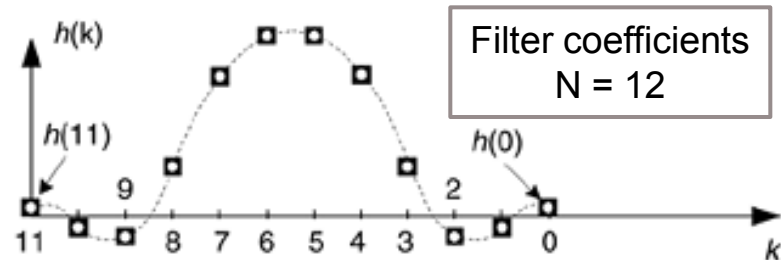
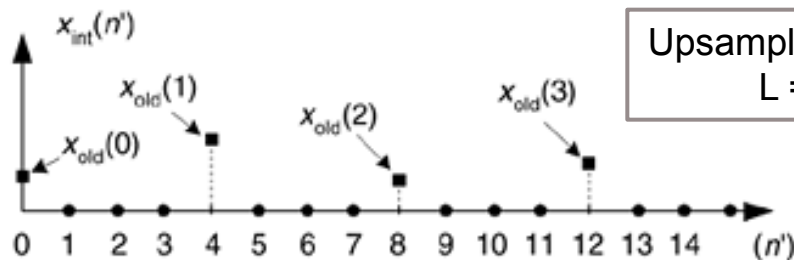


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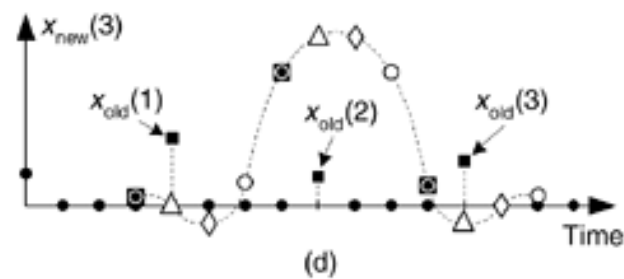
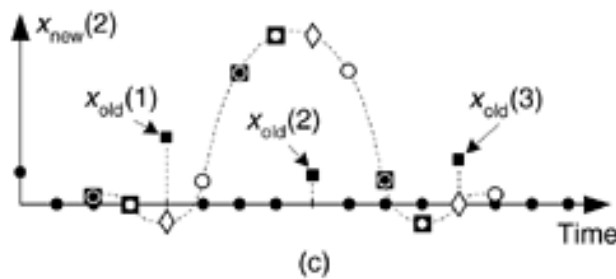
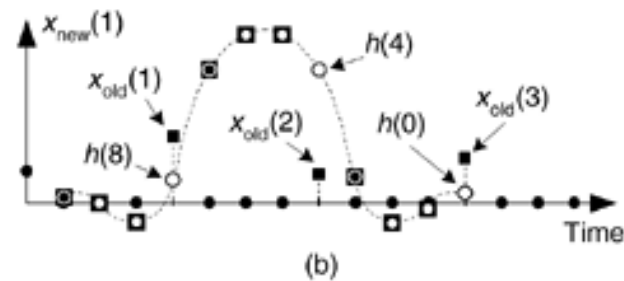
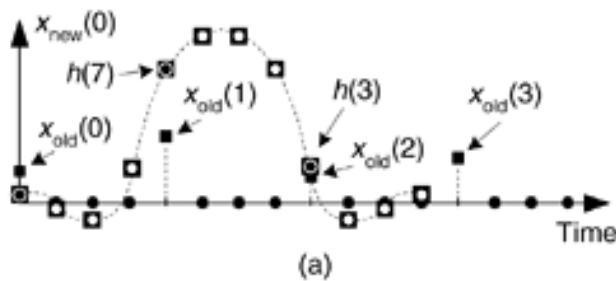
# Polyphase Filters

- Interpolation
  - ▣ eliminate all multiply by zero operations.
- Decimation
  - ▣ avoid the wasteful computation of filter output samples that are subsequently discarded.



“For my money, the development of polyphase filters arguably resides in the stratosphere of brilliant DSP innovations, along with the radix-2 FFT algorithm and the Parks-McClellan FIR filter design algorithm” *R. G. Lyons*

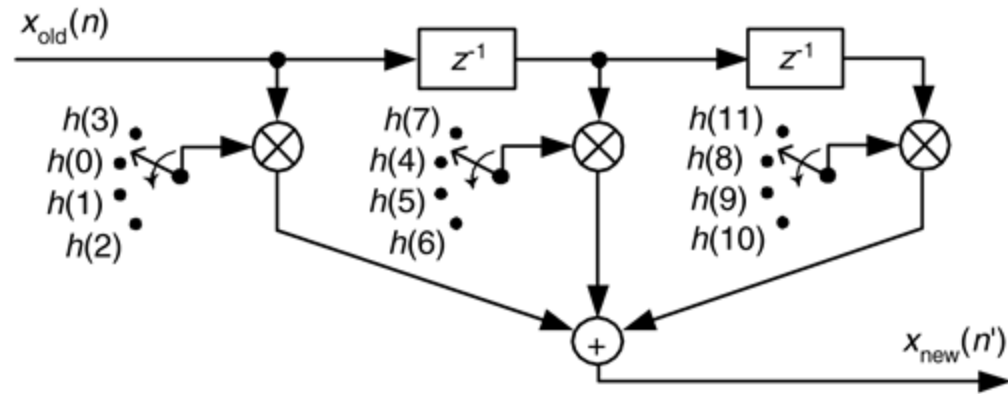
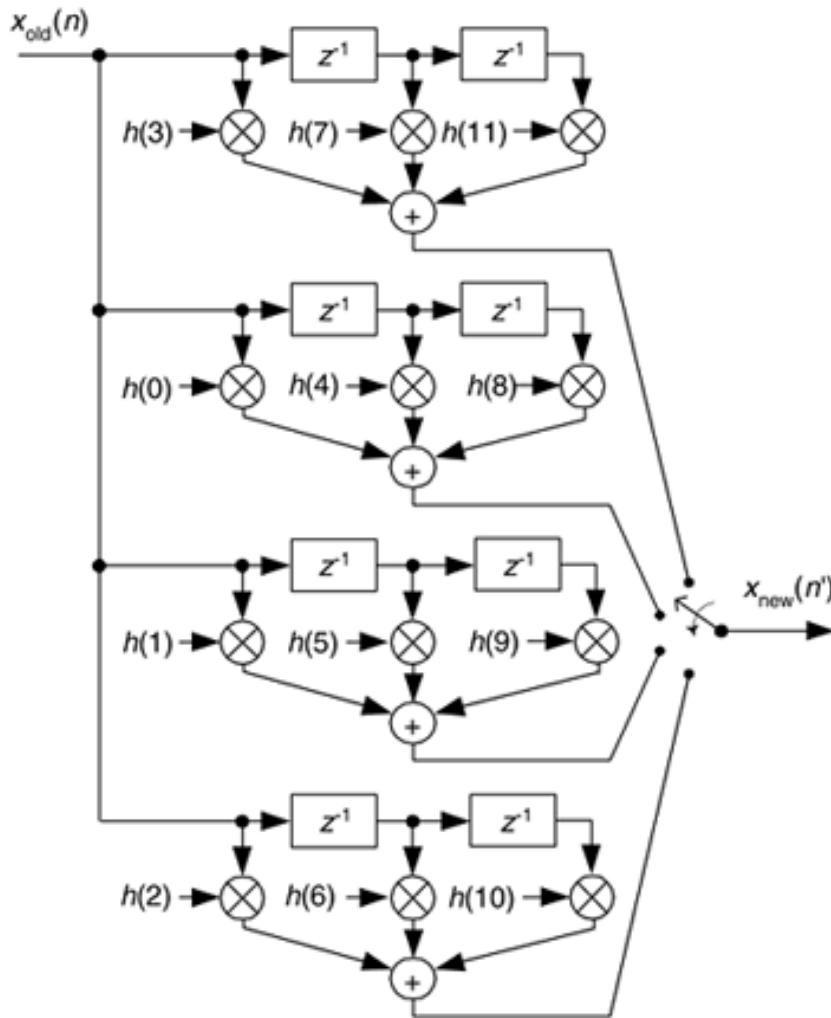
# Polyphase Interpolation



$x_{new}(0) = h(3)x_{old}(2) + h(7)x_{old}(1) + h(11)x_{old}(0)$	← uses the $\boxtimes$ coefficients
$x_{new}(1) = h(0)x_{old}(3) + h(4)x_{old}(2) + h(8)x_{old}(1)$	← uses the $\circ$ coefficients
$x_{new}(2) = h(1)x_{old}(3) + h(5)x_{old}(2) + h(9)x_{old}(1)$	← uses the $\diamond$ coefficients
$x_{new}(3) = h(2)x_{old}(3) + h(6)x_{old}(2) + h(10)x_{old}(1)$	← uses the $\Delta$ coefficient
$x_{new}(4) = h(3)x_{old}(3) + h(7)x_{old}(2) + h(11)x_{old}(1)$	← uses the $\boxtimes$ coefficients
$x_{new}(5) = h(0)x_{old}(4) + h(4)x_{old}(3) + h(8)x_{old}(2)$	← uses the $\circ$ coefficients
$x_{new}(6) = h(1)x_{old}(4) + h(5)x_{old}(3) + h(9)x_{old}(2)$	← uses the $\diamond$ coefficients
$x_{new}(7) = h(2)x_{old}(4) + h(6)x_{old}(3) + h(10)x_{old}(2)$	← uses the $\Delta$ coefficients

Slide the impulse response to the right

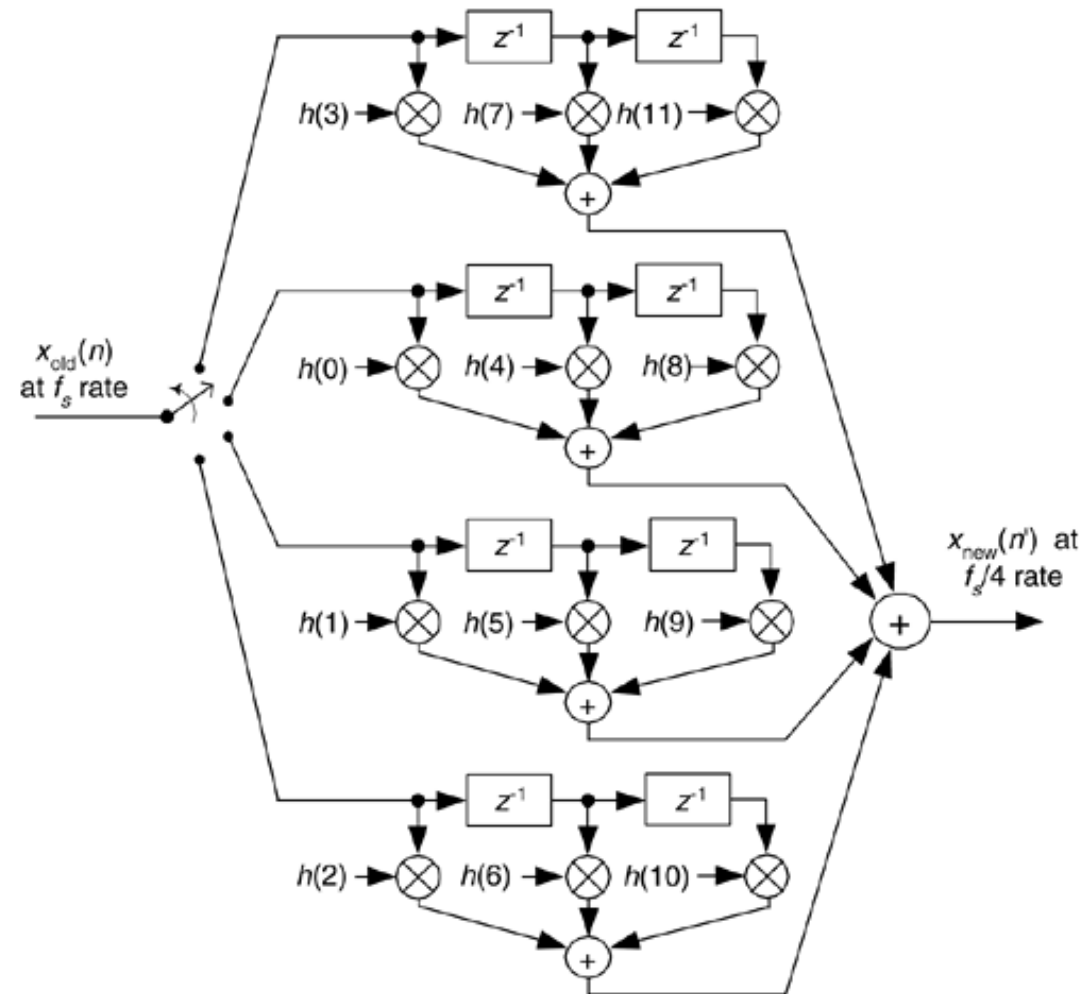
# Polyphase Interpolation



- Don't create  $x_{int}(m)$
- Don't multiply by zero
- L subfilters
- $N/L - 1$  delay elements
- N is chosen to be an integer multiple of L



# Polyphase Decimation

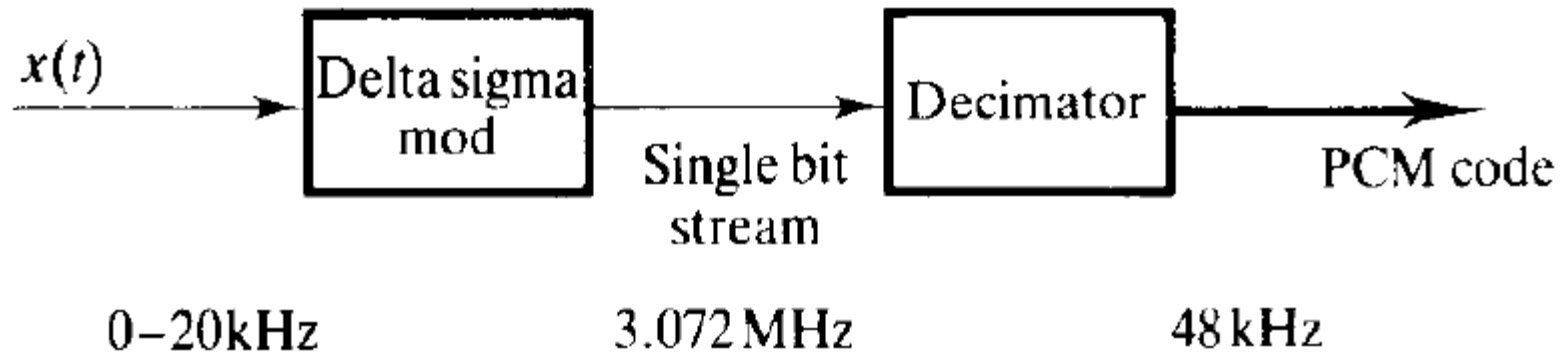


- Don't create  $x_{int}(m)$
- Don't perform unnecessary computations
- M subfilters
- $N/M - 1$  delay elements
- N is chosen to be an integer multiple of M

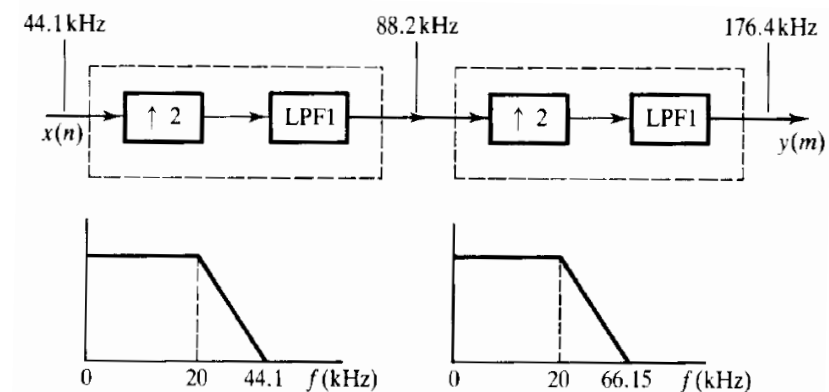
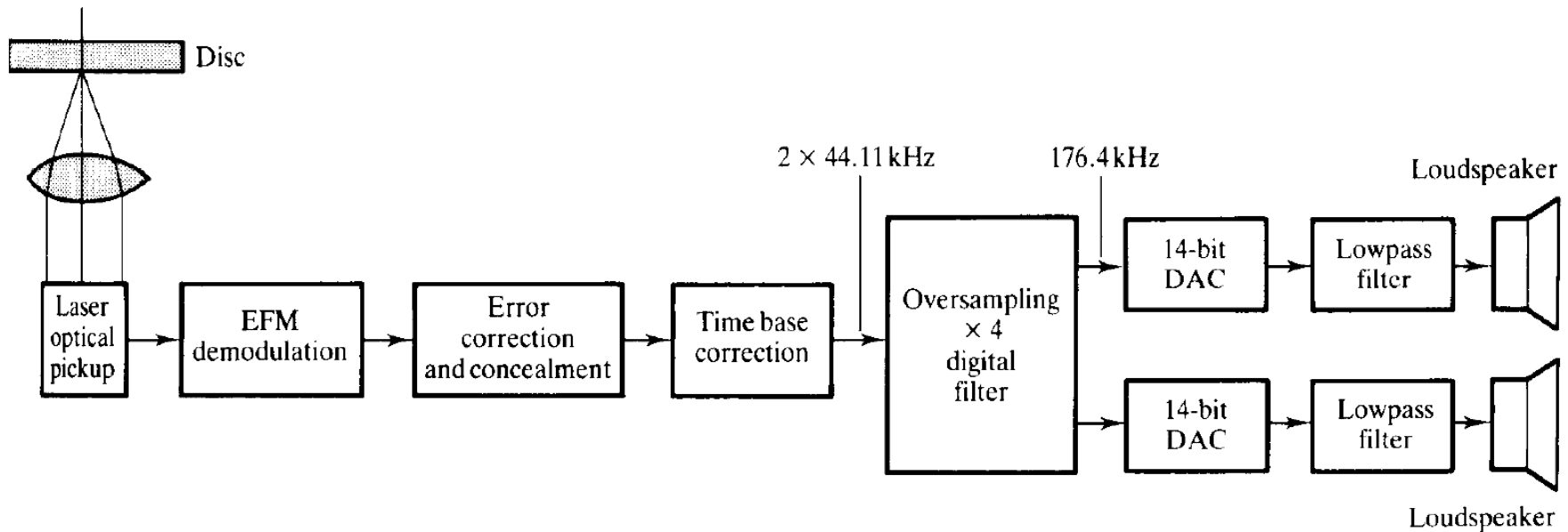
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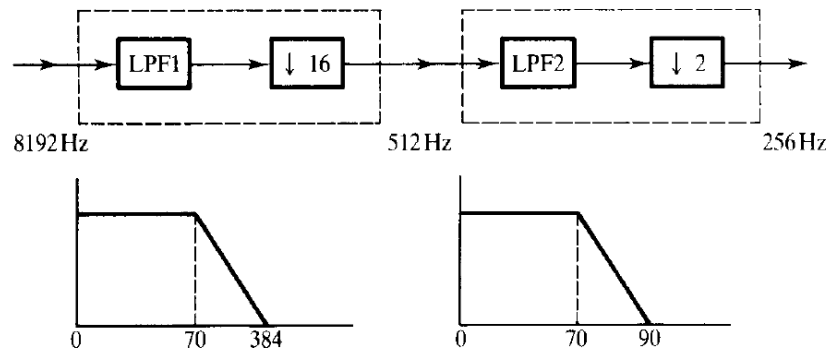
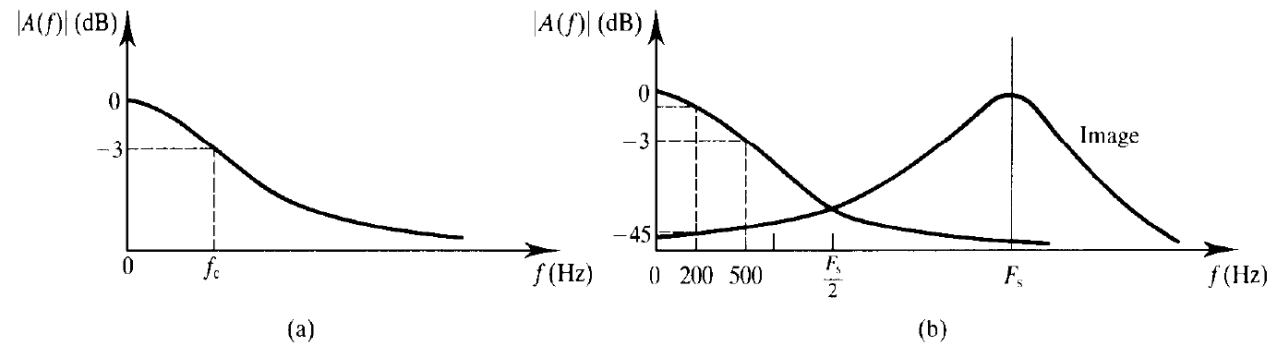
# High quality A/D conversion for digital audio



# Efficient D/A conversion in compact hi-fi system



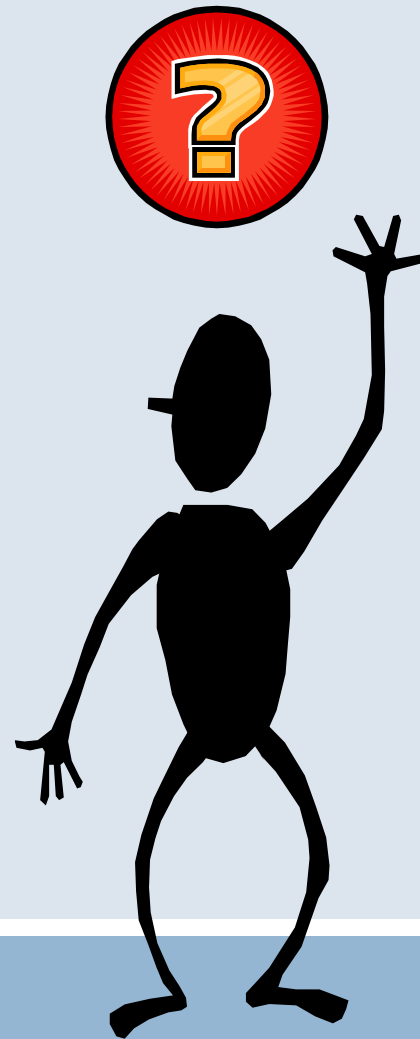
# Application in the acquisition of high quality data



# Recommended bibliography

- FJ Harris, Multirate Signal Processing for Communication Systems. First Edition. Prentice Hall 2004.
- RG Lyons, Understanding Digital Signal Processing. Third Edition. Prentice Hall 2010.
  - ▣ Ch10: Sample Rate Conversion.
- EC Ifeachor, BW Jervis. Digital Signal Processing. A Practical approach. Second Edition. Prentice Hall 2002.
  - ▣ Ch9: Multirate digital signal processing

**NOTE:** Many images used in this presentation were extracted from the recommended bibliography.



Questions?

Thank you!