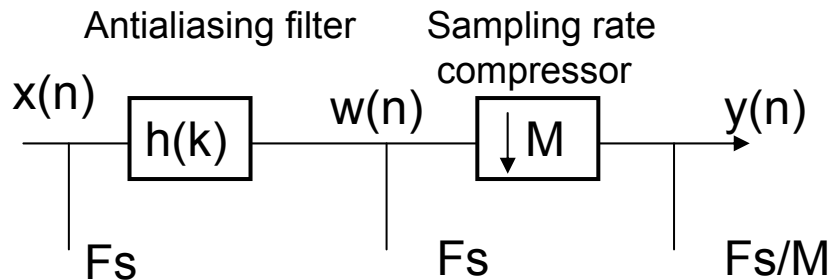


Multirate Signal Processing

Efficient technique for changing the sampling frequency of a digital signal.

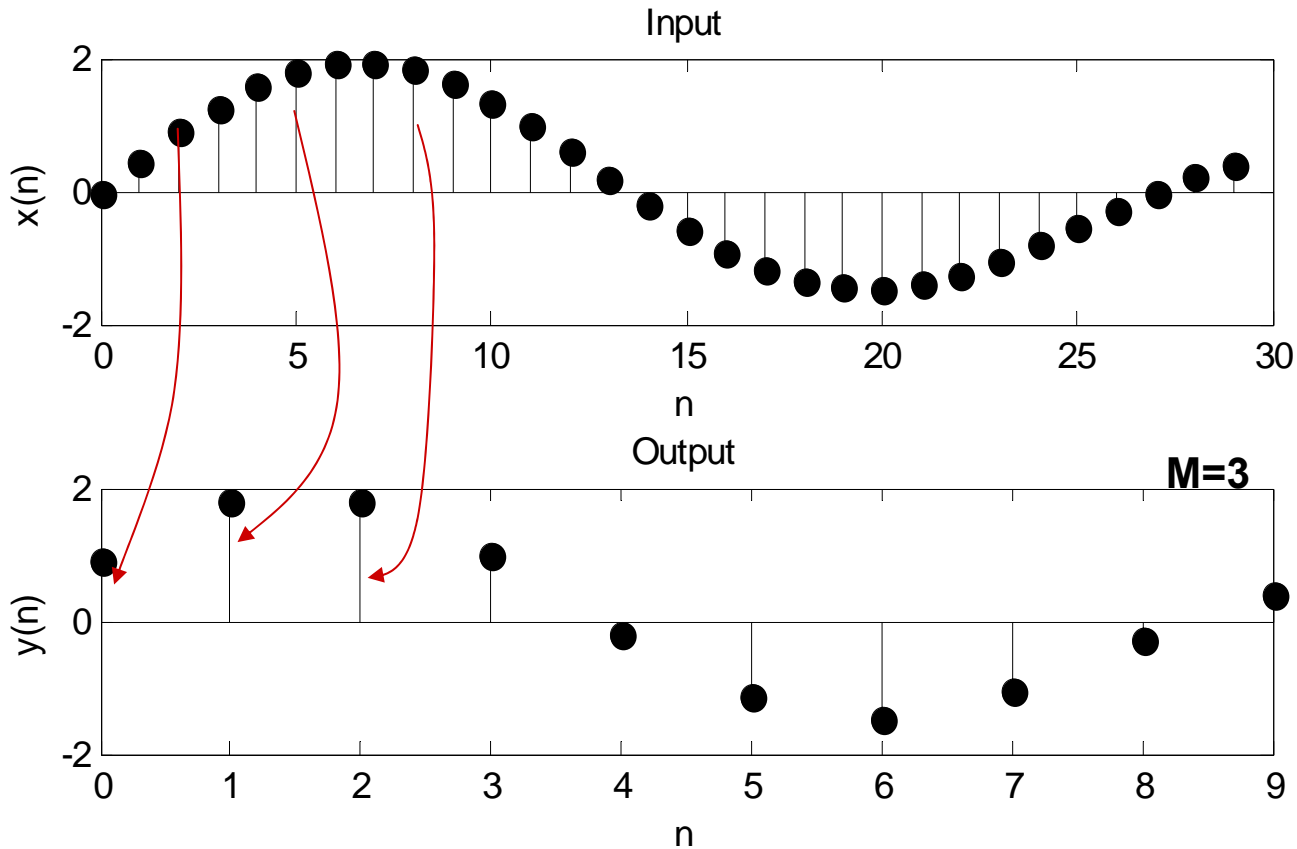
Sampling rate reduction-decimation by integer factor



$$y(n) = w(nM) = \sum_{k=-\infty}^{\infty} h(k)x(nM - k)$$

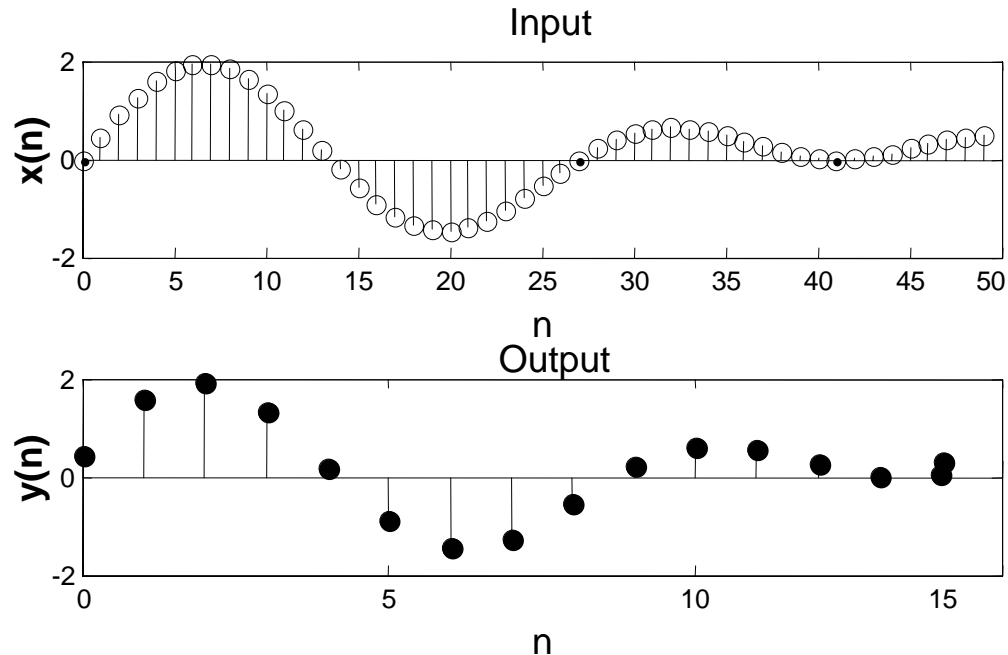
$$w(n) = \sum_{k=-\infty}^{\infty} h(k)x(n - k)$$

Time Domain Illustration

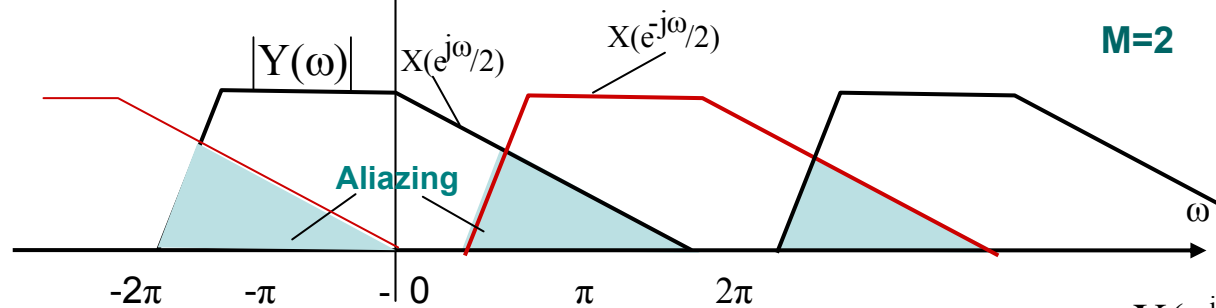
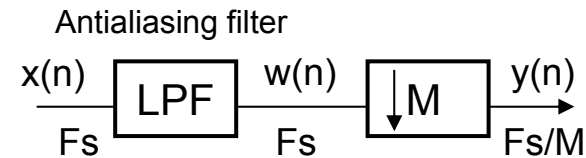
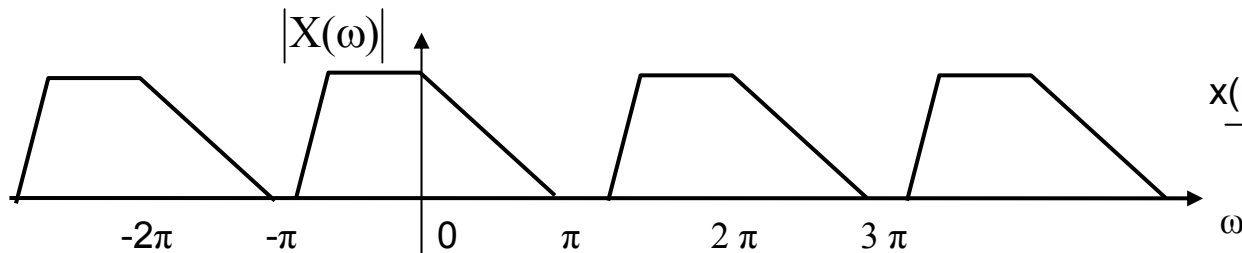


Decimation- Down-sampling

```
%Generate the input signal  
N=50;M=3;  
f1=0.043;  
f2=0.031;  
n=0:N-1;  
x=sin(2*pi*f1*n)+sin(2*pi*f2*n);  
%Generate the decimated signal  
y=decimate(x,M);  
% Plot trhe input and output signals  
subplot(2,1,1)  
stem(n,x(1:N)); title('Input')  
xlabel('n'); ylabel('x(n)')  
m=0:N/M-1  
subplot(2,1,2)  
stem(m,y(1:N/M));  
title('Input');  
xlabel('n'); ylabel('x(n)')  
title('Output')  
xlabel('n')  
ylabel('y(n)')
```



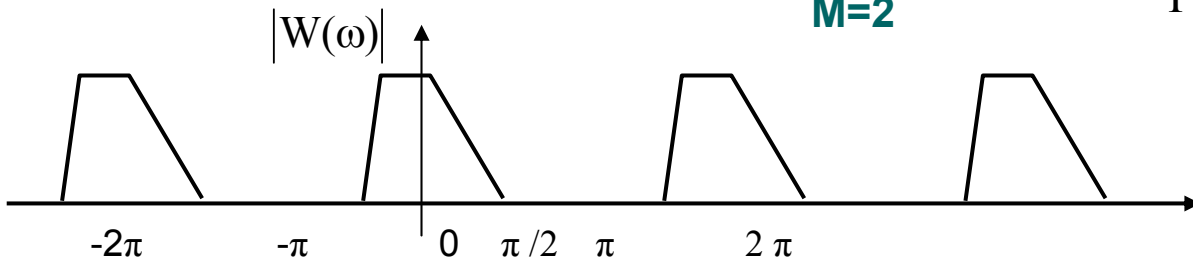
Spectral Interpretation



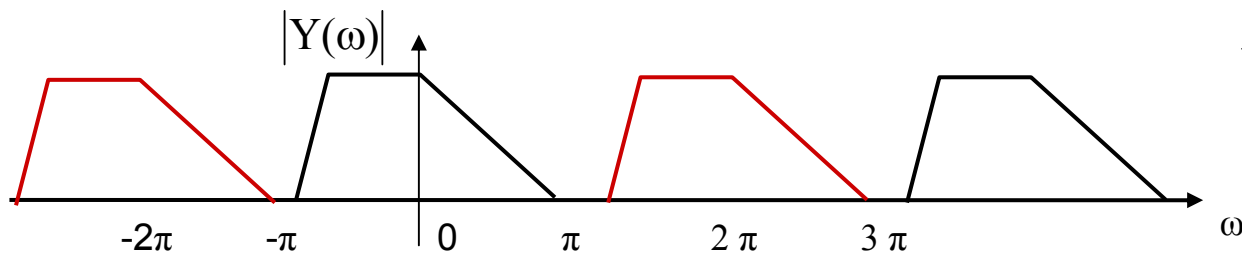
$$W_M = e^{-j2\pi/M}$$

$$Y(z) = \frac{1}{M} \sum_{k=0}^{M-1} X(z^{1/M}) W_M^{-k}$$

$$Y(e^{j\omega}) = \frac{1}{2} \{X(e^{j\omega/2}) + X(e^{-j\omega/2})\}$$

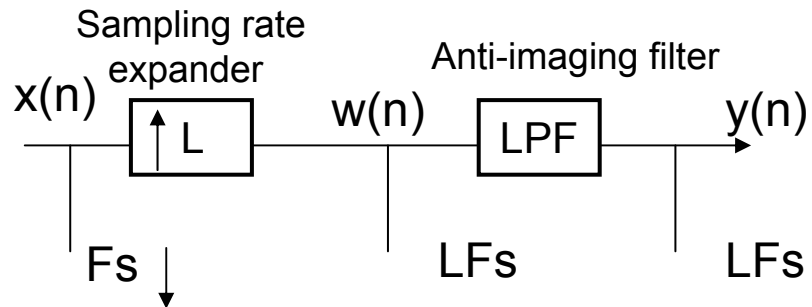


$$Y(-e^{j\omega}) = X(e^{j\frac{\omega-2\pi}{2}})$$



$$Y(e^{j\omega}) = \frac{1}{M} \sum_{k=0}^{M-1} X(e^{j\frac{\omega-2\pi k}{M}})$$

Sampling Rate Increase: Interpolation-Upsampling

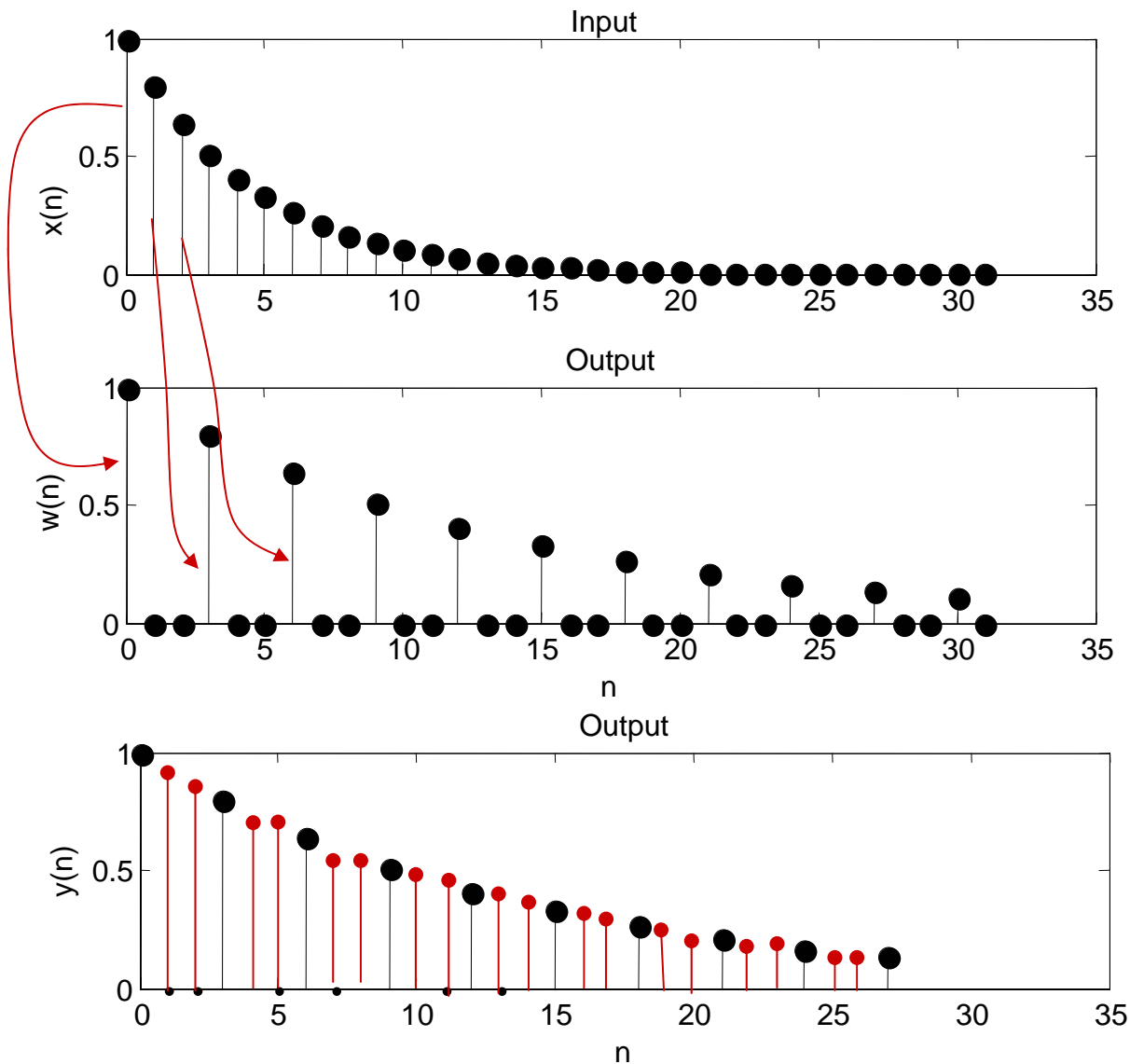


$$y(m) = \sum_{k=-\infty}^{\infty} h(k)w(m-k)$$

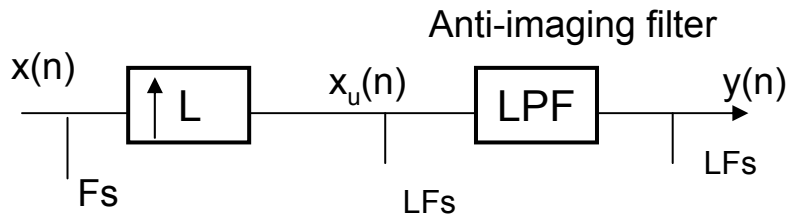
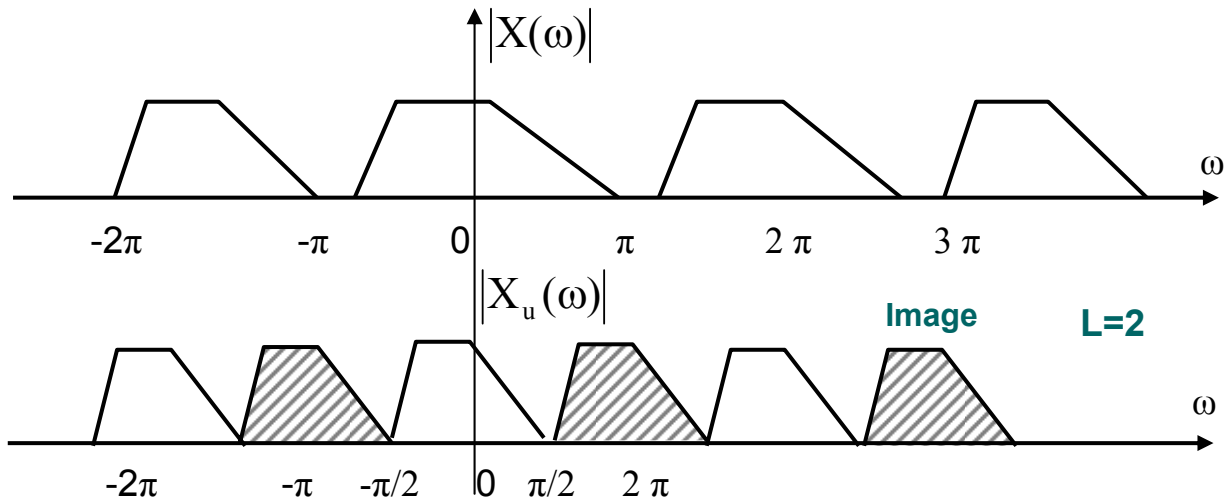
Where

$$W(m) = \begin{cases} x(m/L) & m=0, \pm L, \pm 2L, \pm 3L, \dots \\ 0 & \end{cases}$$

Time Domain Illustration



Spectral Interpretation



$$x_u(n) = \begin{cases} x(n/L) & n=0, \pm L, \pm 2L, \pm 3L, \dots \\ 0 & \text{otherwise} \end{cases} \quad x_u(n) = \begin{cases} x(n/2) & n=0, \pm 2, \pm 4, \dots \\ 0 & \text{otherwise} \end{cases}$$

$$X_u(z) = \sum_{n=-\infty}^{\infty} x_u(n) z^{-n} = \sum_{n=-\infty}^{\infty} x_u(n/2) z^{-n} = \sum_{n=-\infty}^{\infty} x_u(m) z^{-2m} = X(z^2)$$

$$|W(z)| = |X(z^L)|$$

Up-Sampling

% Upsampling factor

L=3;N=32;

% Generation the input

f=0.12;

n=0:N-1;

x=sin(2*pi*f*n);

%Generation the up-sampled signal

y=zeros(1,L*length(x));

y([1:L:length(y)])=x;

% Plot the input and output

subplot(2,1,1)

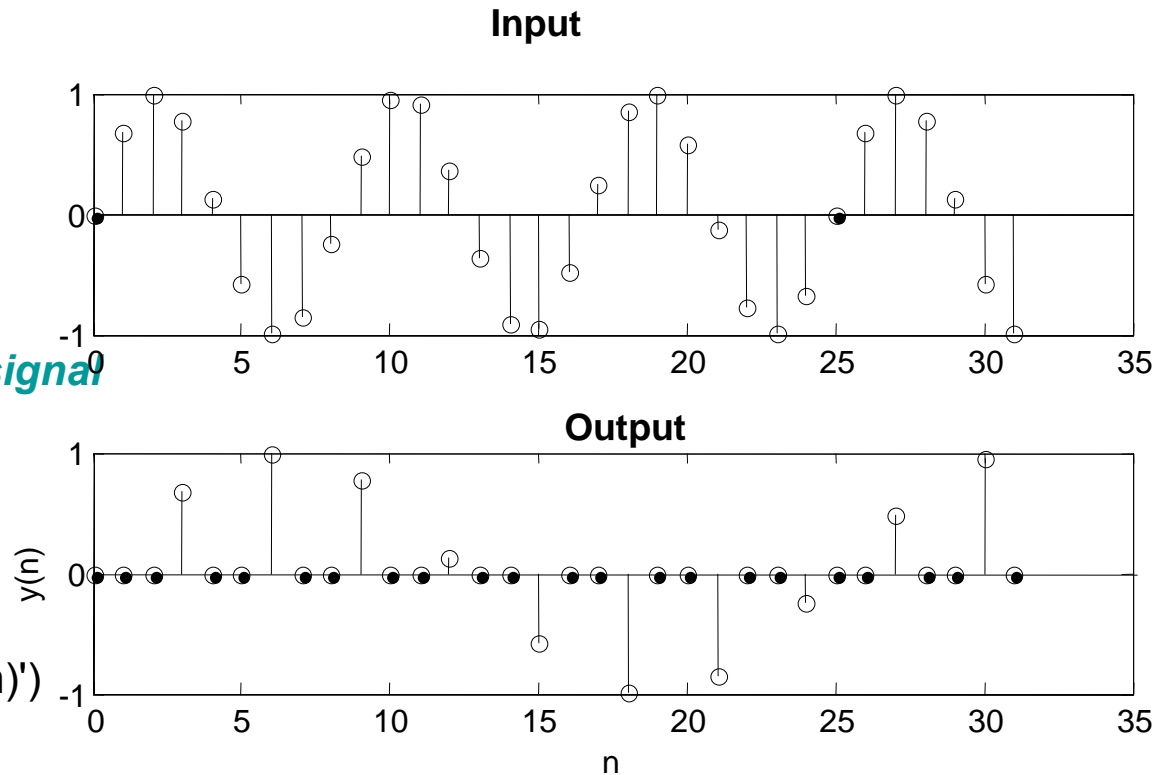
stem(n,x)

title('Input'); xlabel('n'); ylabel('x(n)')

subplot(2,1,2)

stem(n,y(1:length(x)));

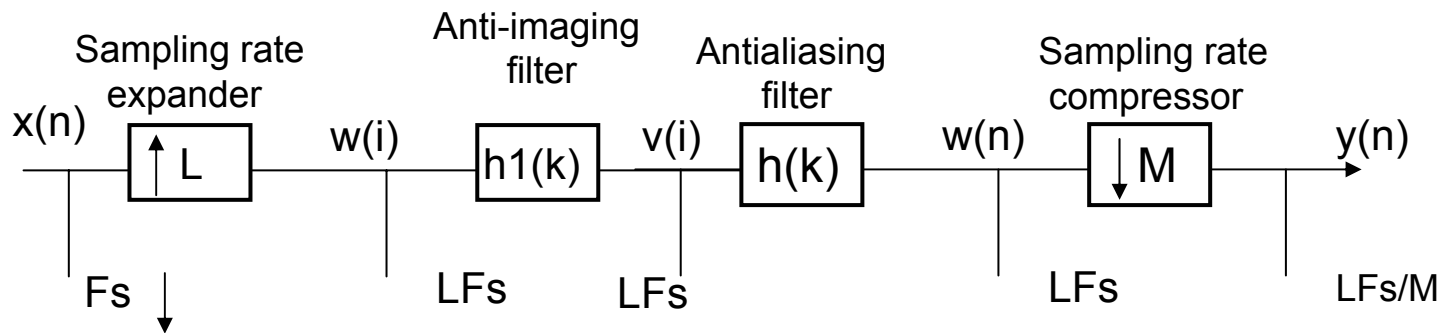
title('Output'); xlabel('n'); ylabel('y(n)')



Sampling Rate Conversion by Non-integre Factor

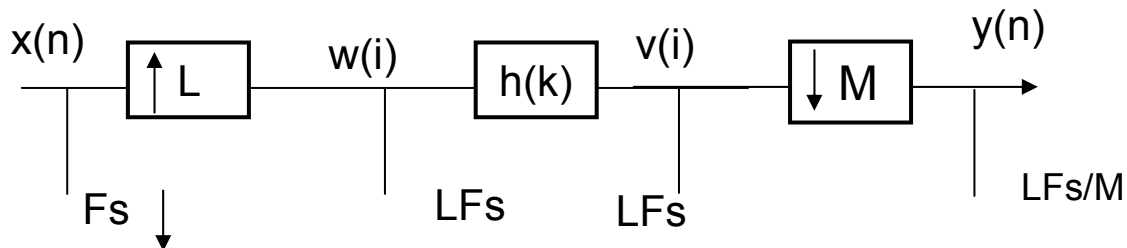
Transfer data from CD at a rate 44.1 kHz to a Digital audio tape (DAT) at a trate 48 kHz
 $48/44.1$ is anon integrer.

If $L=160$ and $M=147$ we increase CD data rate to $7056(44.1 \times 160)$ and then reduce it by $(7056/147)$ to 48 kHz



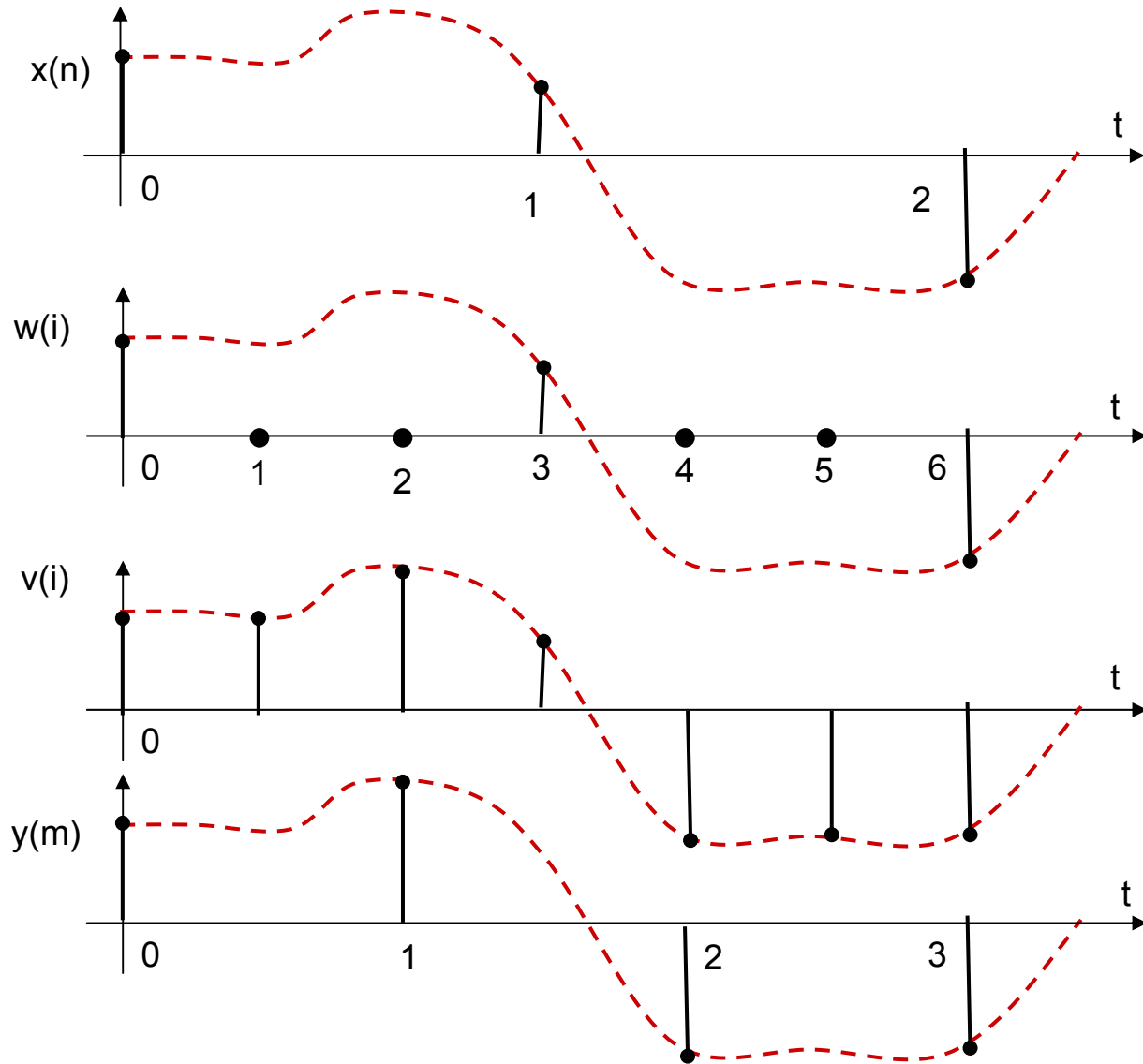
If $M > L$, resulting operation is a decimation

If $M < L$, resulting operation is a interpolation

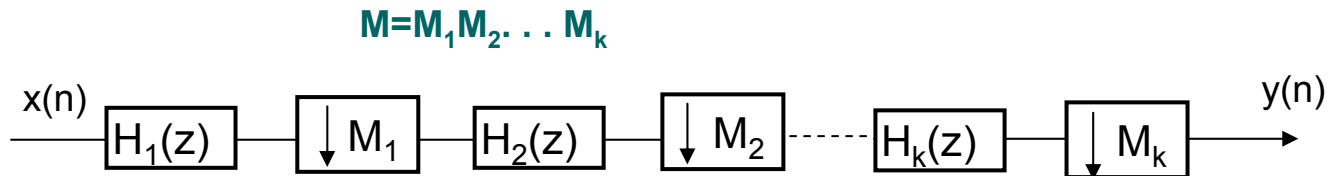
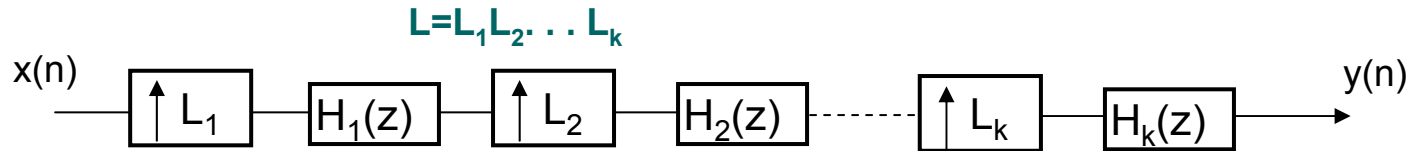


Interpolation by a Rational Factor

$L=3; M=2; L/M=1.5$



Multistage Design

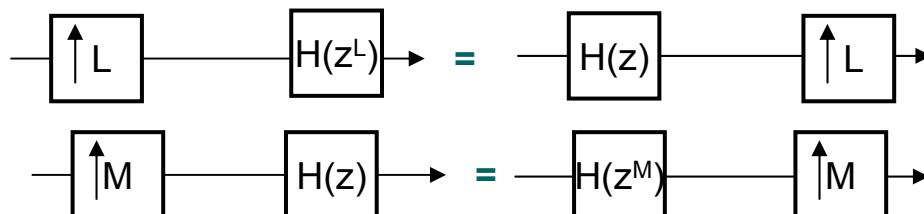


Cascade Equivalences

is valid if M and L are relatively prime



Equivalences with filters



Filter Requirements

For multistage decimator:

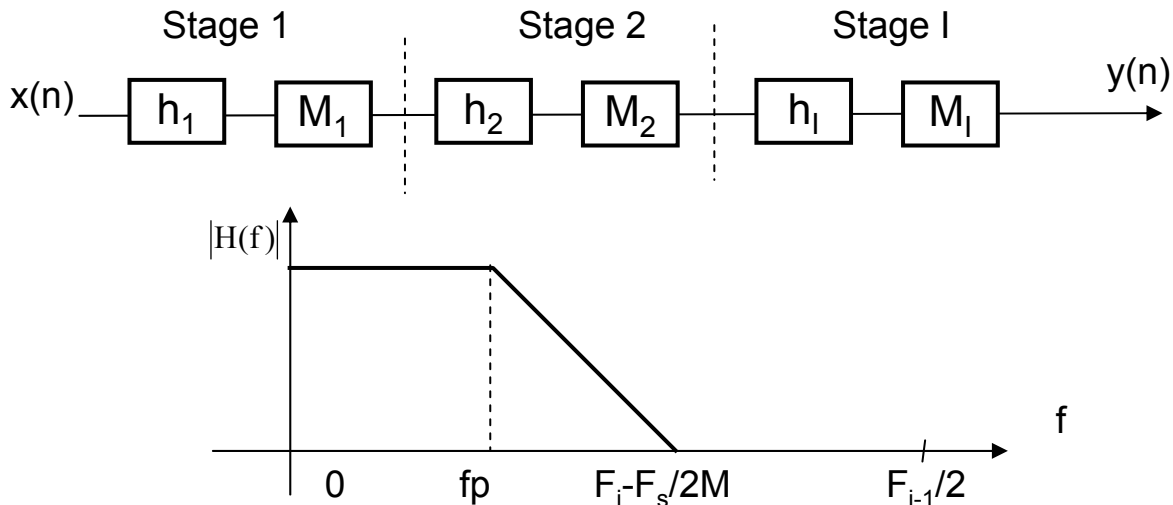
Passband	$0 \leq f \leq f_p$
Stopband	$(F_i - F_s/2M) \leq f \leq F_{i-1}/2, \quad i=1, 2, \dots, l$
Passband deviation	δ_p/l
Stopband deviation	δ_s

Filter length

$$N \approx \frac{D^\infty(\delta_p, \delta_s)}{\Delta f_i} - f(\delta_p, \delta_s) \Delta \Delta_i + 1$$

The output sampling frequency for each stage i is given by $F_i = (F_{i-1})/M_i$

F_i , N_i and Δf_i are , the output sampling frequency, length and transition width for i^{th} stage



Optimum Number of Stages

1. Specify the overall filter parameters
2. For each value of I obtain all possible set of integer decimation factors of M
3. For each set of decimation factor determine the MPS and TSR
4. Select the decimation factor giving minimum MPS and TSR

$$\text{MPS} = \sum_{i=1}^I N_i F_i \quad \text{TSR} = \sum_{i=1}^I N_i$$

For optimum MPS and TSR the optimum decimation factor satisfy: $M_1 > M_2 > M_3 \dots M_I$

For I=2 (two stages)

$$M_{1\text{opt}} = \frac{2M}{2 - \Delta f + (2M\Delta f)^{1/2}}$$

$$M_{2\text{opt}} = \frac{M}{M_{1\text{opt}}}$$

Design of Practical Multirate System

1. Specify the overall AAF and AIF requirement
2. Determine the optimum number of stages
3. Determine the decimation and or interpolation factors for each stage
4. Design an appropriate filter for each stage

1. Filter specification

1.1 Antialiasing filter AAF for decimation

Passband	$0 \leq f \leq f_p$
Stopband	$F_s/2M \leq f \leq F_s/2$
Passband deviation	δ_p
Stopband deviation	δ_s

Where f_p is highest frequency of original signal

1.2 Anti-imaging filter AIF for interpolation

Passband	$0 \leq f \leq f_p$
Stopband	$F_s/2 \leq f \leq LF_s/2$
Passband deviation	δ_p
Stopband deviation	δ_s

Problem

Design a 2-stage decimator that downsamples audio signal a factor 30 and satisfy the following specifications:

Input sampling frequency

$F_s=240$ kHz

Highest frequency of original data

3.4 kHz

Pasband deviation

$\delta_p=0.05$

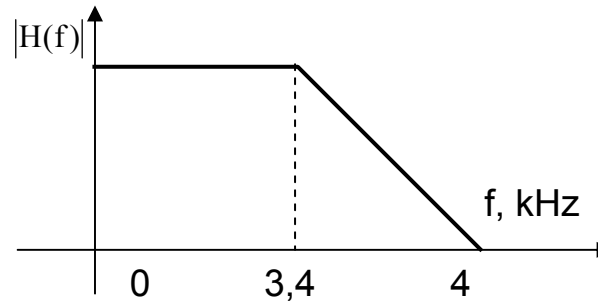
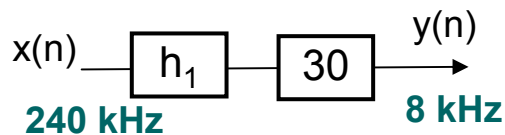
Stopband deviation

$\delta_s=0.01$

Filter length

$$N = \frac{-10 \log(\delta_p \delta_s) - 13}{14.6 \Delta f} + 1$$

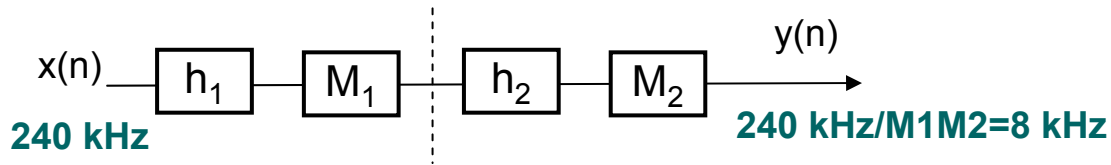
1. One-stage realization



$F_s=240$; $M=8$; $F_i=8$; $f_p=3.4$ kHz; $f_s=8-240/2 \times 30=4$ kHz

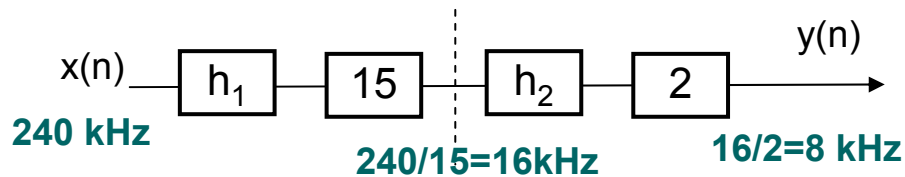
$\Delta f=(4-3.4)/240 = 2.5 \times 10^{-3}$; $N=549$; $MPS=N \times F_i=1368 \times 10^3$; $TSR=N=549$

2. Two-stages realization



Integre factors that allow to ge decimation factor 30 are: **15x2; 10x3; 6x5**

1. **M1=15; M2=2**

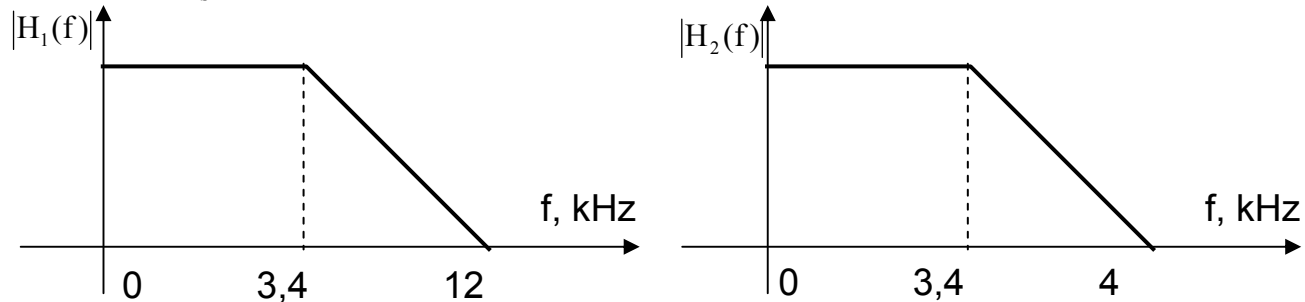


For h_1 filter bandedge frequencies: **$f_p=3.4 \text{ kHz}$** and **$f_s= F_i-F_s/2M=16-240/2 \times 30=12 \text{ kHz}$**

$$\Delta f = \frac{f_{s1} - f_p}{F_s} = \frac{12 - 3.4}{240} = 0.025; \quad \delta_{p1} = \frac{0.05}{2} = 0.025; \quad \delta_{s1} = 0.01; \quad N1 = 45$$

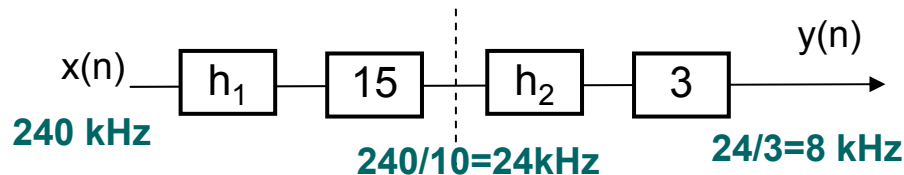
For h2 filter bandedge frequencies: $f_p=3.4$ kHz and $f_s= F_i-F_s/2M=8-240/2 \times 30=4$ kHz

$$\Delta f = \frac{f_{s2} - f_p}{F_{s1}} = 0.0375; \quad \delta_{p1} = \frac{0.05}{2} = 0.025; \delta_{s2} = 0.01; \quad N1 = 43$$



$$\text{MPS}=(45 \times 16+43 \times 8) 10^3=1064 \times 10^3 ; \quad \text{TSR}=N1+N2=45+43=88$$

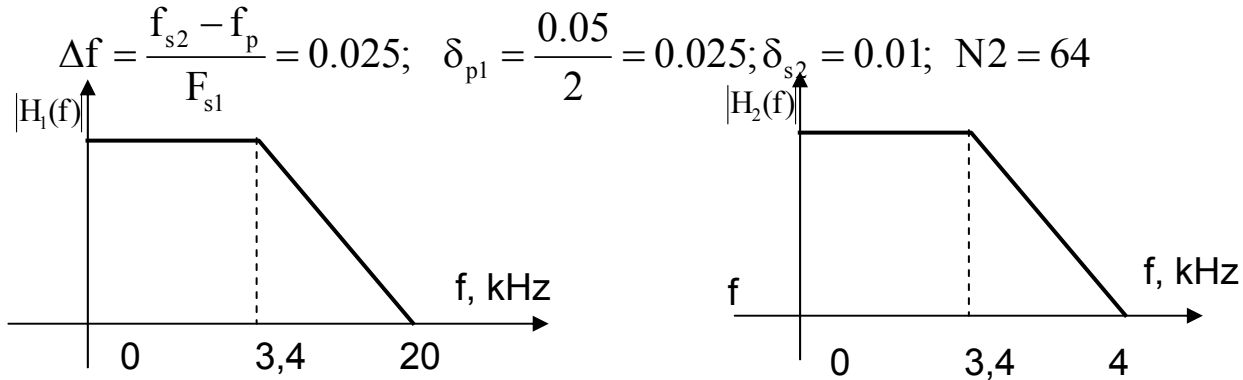
2. M1=10; M2=3



For h1 filter bandedge frequencies: $f_p=3.4$ kHz and $f_s= F_i-F_s/2M=24-240/2 \times 30=20$ kHz

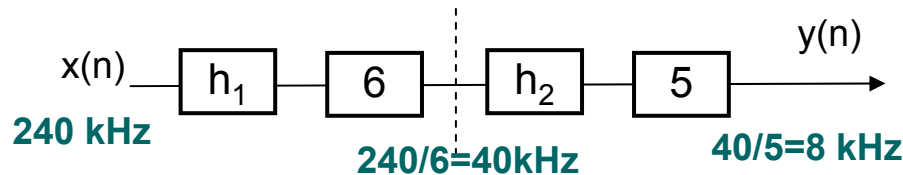
$$\Delta f = \frac{f_{s1} - f_p}{F_s} = \frac{20 - 3.4}{240} = 0.0691; \quad \delta_{p1} = \frac{0.05}{2} = 0.025; \delta_{s1} = 0.01; \quad N1 \approx 24$$

For h2 filter bandedge frequencies: $f_p=3.4$ kHz and $f_s= F_i-F_s/2M=8-4=4$ kHz



$$\text{MPS}=(24 \times 24+64 \times 8) 10^3=1088 \times 10^3 ; \quad \text{TSR}=N1+N2=64+24=88$$

3. M1=6; M2=5

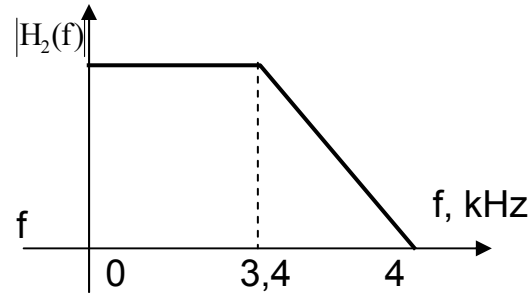
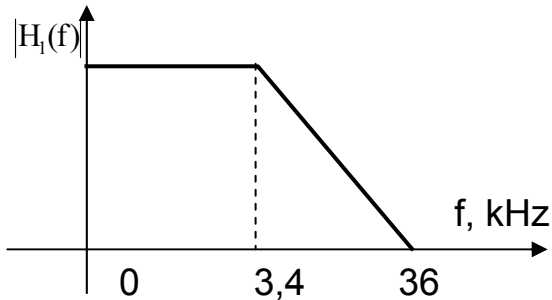


For h1 filter bandedge frequencies: $f_p=3.4$ kHz and $f_s= F_i-F_s/2M=40-240/2 \times 30=36$ kHz

$$\Delta f = \frac{f_{s1} - f_p}{F_s} = \frac{36 - 3.4}{240} = 0.1358; \quad \delta_{p1} = \frac{0.05}{2} = 0.025; \quad \delta_{s1} = 0.01; \quad N1 \approx 13$$

For h2 filter bandedge frequencies: $f_p=3.4$ kHz and $f_s= F_i-F_s/2M=8-4=4$ kHz

$$\Delta f = \frac{f_{s2} - f_p}{F_{s1}} = 0.015; \quad \delta_{p1} = \frac{0.05}{2} = 0.025; \delta_{s2} = 0.01; \quad N2 = 106$$



$$\text{MPS} = (13 \times 40 + 106 \times 8) 10^3 = 1368 \times 10^3; \quad \text{TSR} = 13 + 106 = 119$$

Decimation Factors	Length, N	MPS	TSR
M1=15; M2=2	N1=45, N2=43	1064x10³	88
M1=10; M2=3	N1=24, N2=64	1088x10 ³	88
M1=6; M2=5	N1=13, N2=106	1368x10 ³	119
M=30	549	4392x10 ³	549

Optimum



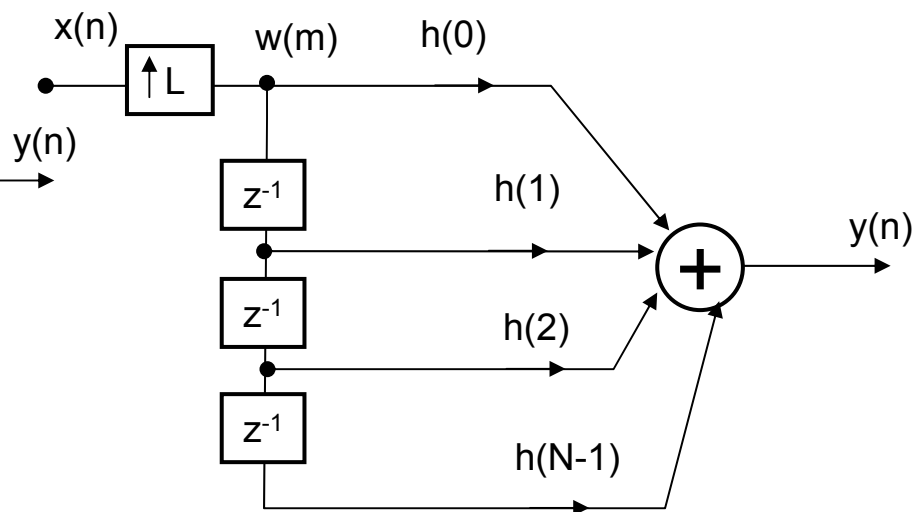
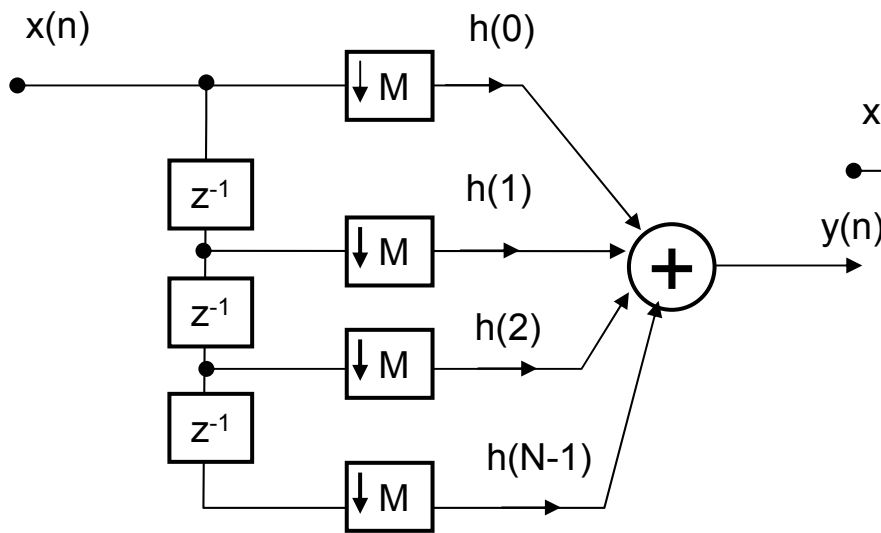
Implementation of Decimation and Interpolation

$$y(m) = w(mM) = \sum_{k=-\infty}^{\infty} h(k)x(mM - k)$$

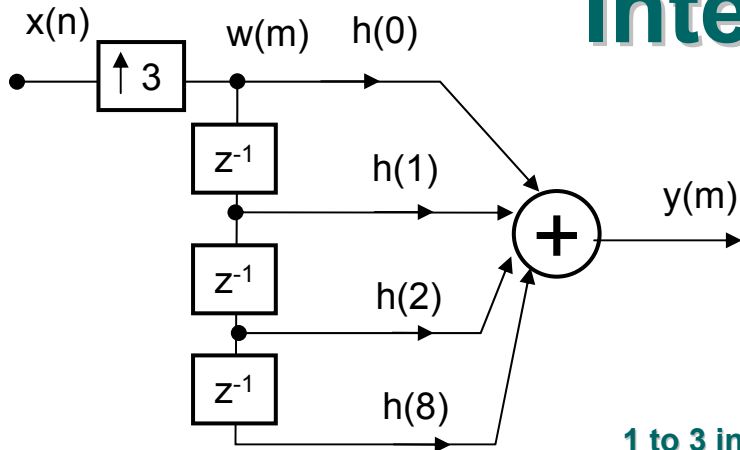
$$y(m) = \sum_{k=-\infty}^{\infty} h(k)w(m-k)$$

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

$$W(m) = \begin{cases} x(m/L) & m=0, \pm L, \pm 2L, \pm 3L, \dots \\ 0 & \text{otherwise} \end{cases}$$



Polyphase Implementation of Interpolators



$$y(0) = x(0) h(0)$$

$$y(1) = x(0) h(1)$$

$$y(2) = x(0) h(2)$$

$$Y(3) = x(1) h(0)$$

$$Y(4) = x(1) h(1) + x(0) h(4)$$

$$Y(5) = x(1) h(2) + x(0) h(5)$$

$$Y(6) = x(2) h(0) + x(1) h(3) + x(0) h(6)$$

$$Y(7) = x(2) h(1) + x(1) h(4) + x(0) h(7)$$

$$Y(8) = x(2) h(2) + x(1) h(5) + x(0) h(8)$$

$$y(9) = x(3) h(0) + x(2) h(3) + x(1) h(6)$$

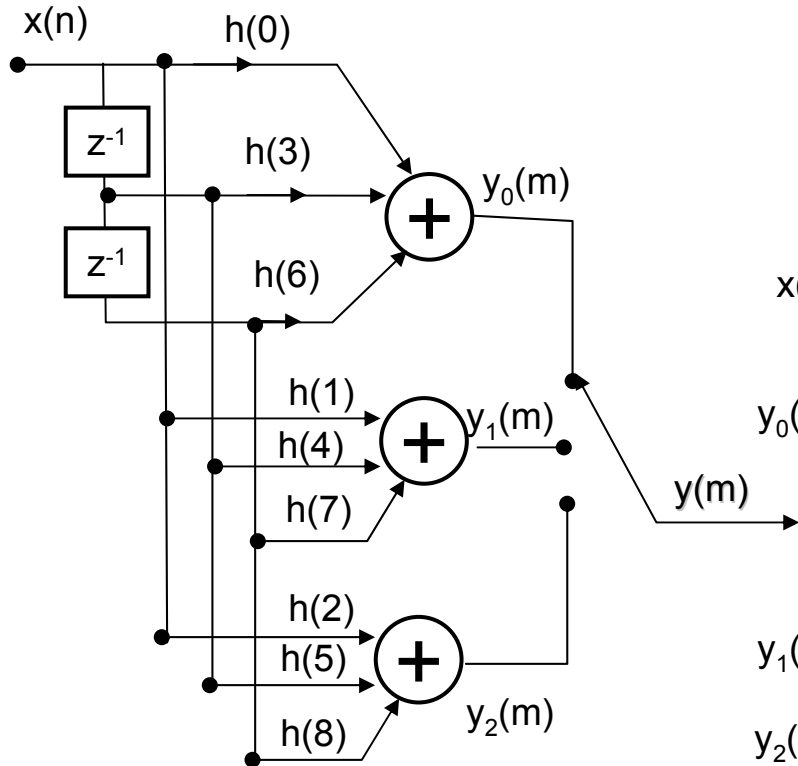
$$Y(10) = x(3) h(1) + x(2) h(4) + x(1) h(7)$$

$$Y(11) = x(3) h(2) + x(2) h(5) + x(1) h(8)$$

1 to 3 interpolation using polyphase filter

$h \backslash n$	0	-	-	1	-	-	2	-	-	3	-	-
h(0)	x(0)	0	0	x(1)	0	0	x(2)	0	0	x(3)	0	0
h(1)	0	x(0)	0	0	x(1)	0	0	x(2)	0	0	x(3)	0
h(2)	0	0	x(0)	0	0	x(1)	0	0	x(2)	0	0	x(3)
h(3)	0	0	0	x(0)	0	0	x(1)	0	0	x(2)	0	0
h(4)	0	0	0	0	x(0)	0	0	x(1)	0	0	x(2)	0
h(5)	0	0	0	0	0	x(0)	0	0	x(1)	0	0	x(2)
h(6)	0	0	0	0	0	0	x(0)	0	0	x(1)	0	0
h(7)	0	0	0	0	0	0	0	x(0)	0	0	x(1)	0
h(8)	0	0	0	0	0	0	0	0	x(0)	0	0	x(1)
y(m)	y(0)	y(1)	y(2)	y(3)	y(4)	y(5)	y(6)	y(7)	y(8)	y(9)	y(10)	y(11)

Polyphase Filter Implementation



$$y(0) = x(0)h(0)$$

$$y(1) = x(0)h(1)$$

$$y(2) = x(0)h(2)$$

$$Y(6) = x(2)h(0) + x(1)h(3) + x(0)h(6)$$

$$Y(7) = x(2)h(1) + x(1)h(4) + x(0)h(7)$$

$$Y(8) = x(2)h(2) + x(1)h(5) + x(0)h(8)$$

$$Y(3) = x(1)h(0)$$

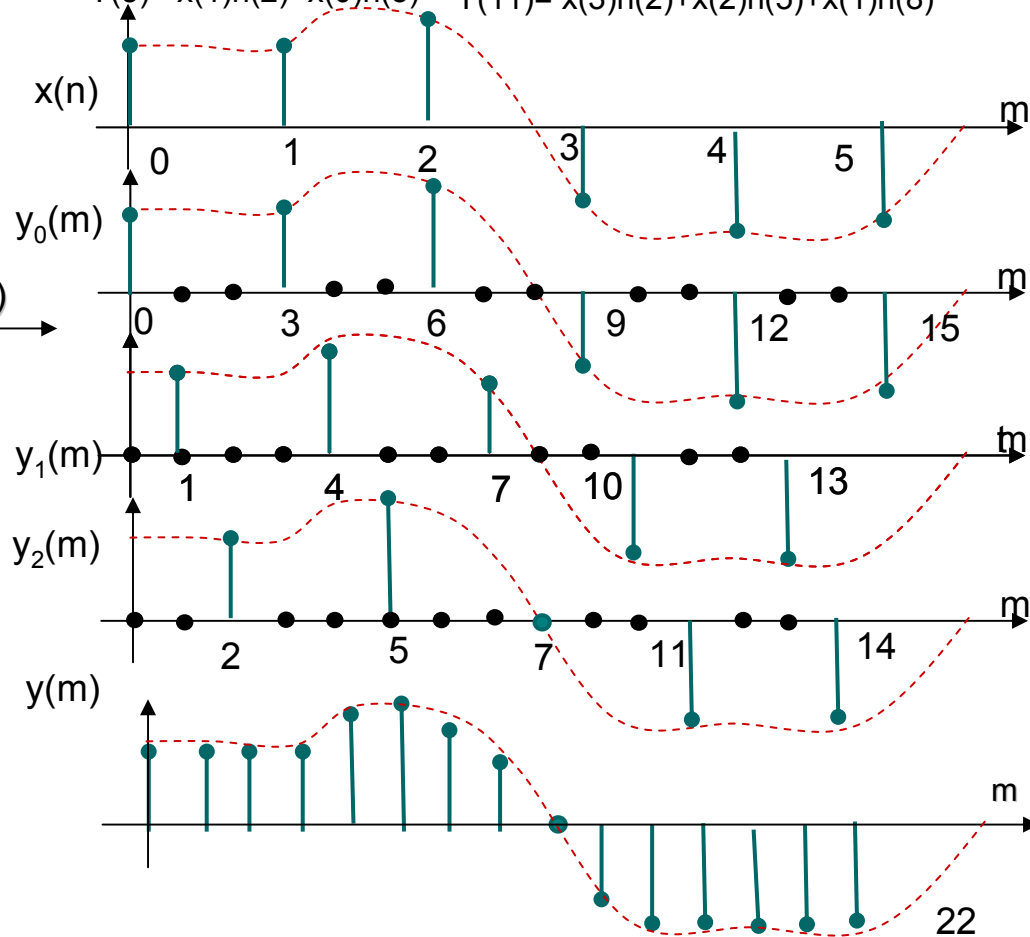
$$Y(4) = x(1)h(1) + x(0)h(4)$$

$$Y(5) = x(1)h(2) + x(0)h(5)$$

$$y(9) = x(3)h(0) + x(2)h(3) + x(1)h(6)$$

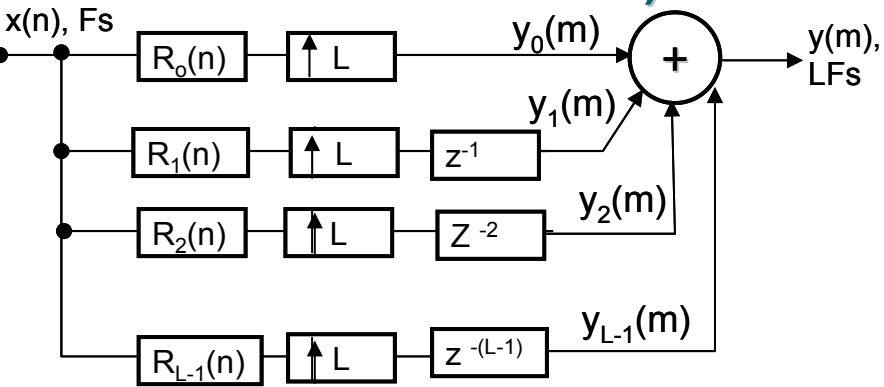
$$Y(10) = x(3)h(1) + x(2)h(4) + x(1)h(7)$$

$$Y(11) = x(3)h(2) + x(2)h(5) + x(1)h(8)$$



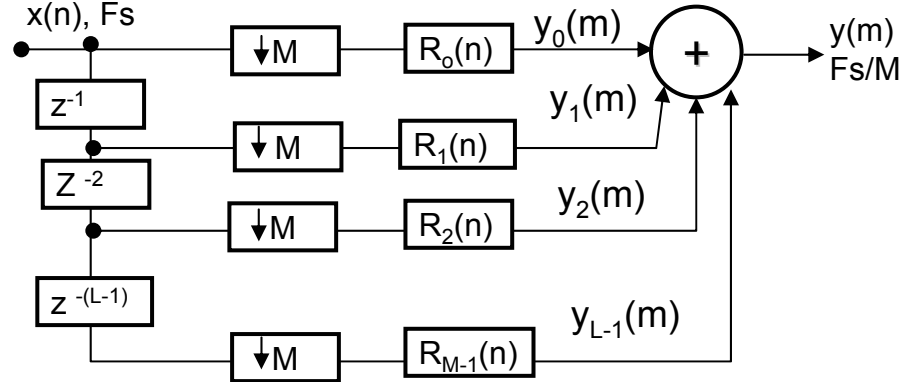
Models of the Polyphase Filters

a) General Models



The coefficients for interpolation:

$$R_k(n) = h(k+nL), \quad k=0, 1, \dots, L-1; \quad n=0, 1, \dots, (N/L)-1;$$



The coefficients for decimation:

$$R_k(n) = h(k+nM), \quad k=0, 1, \dots, M-1; \quad n=0, 1, \dots, (N/M)-1;$$

b) Commutative Models

