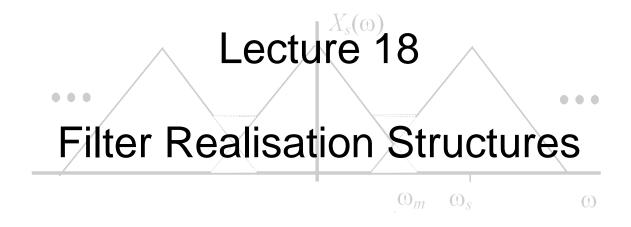
Digital Filters & Spectral Analysis

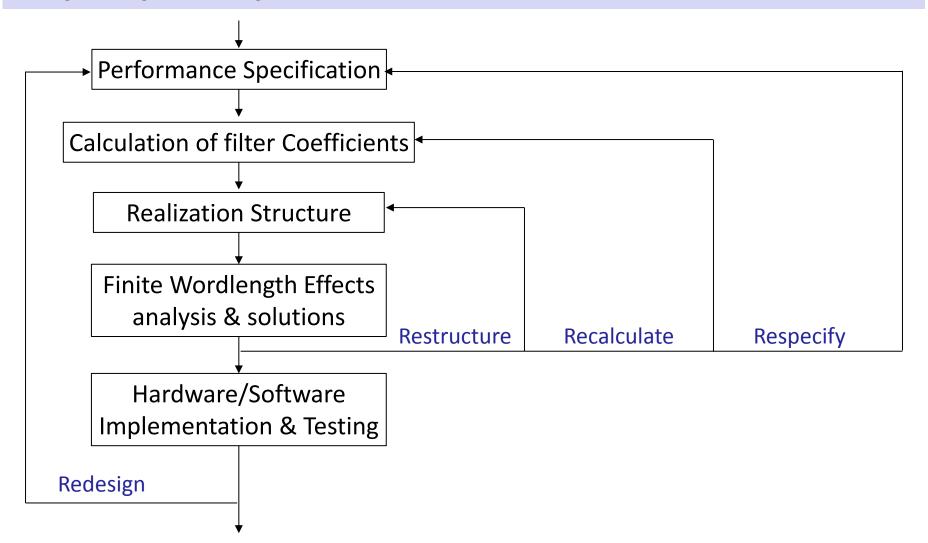




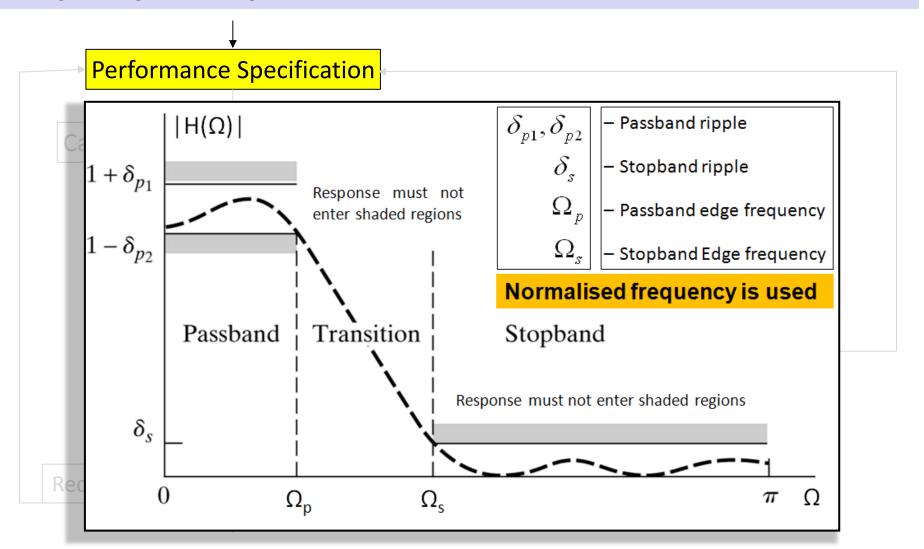
Implementing digital filters in software / hardware



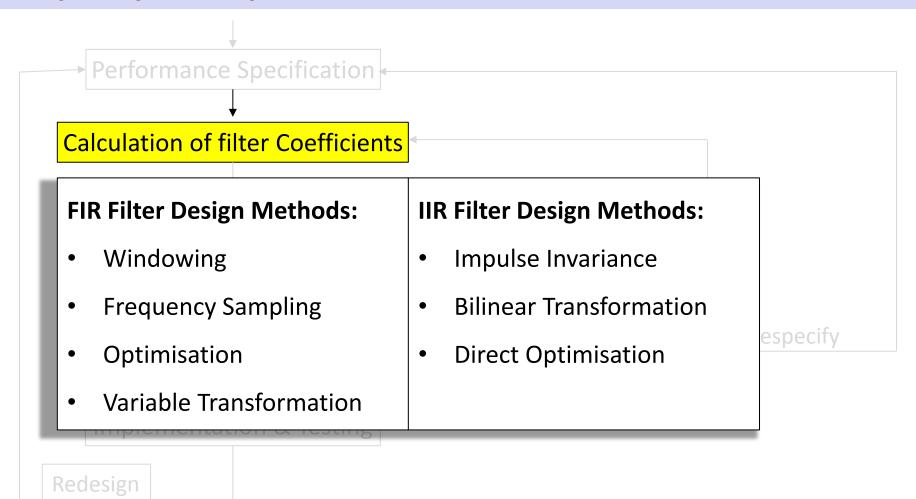
Digital Filter Design Procedure



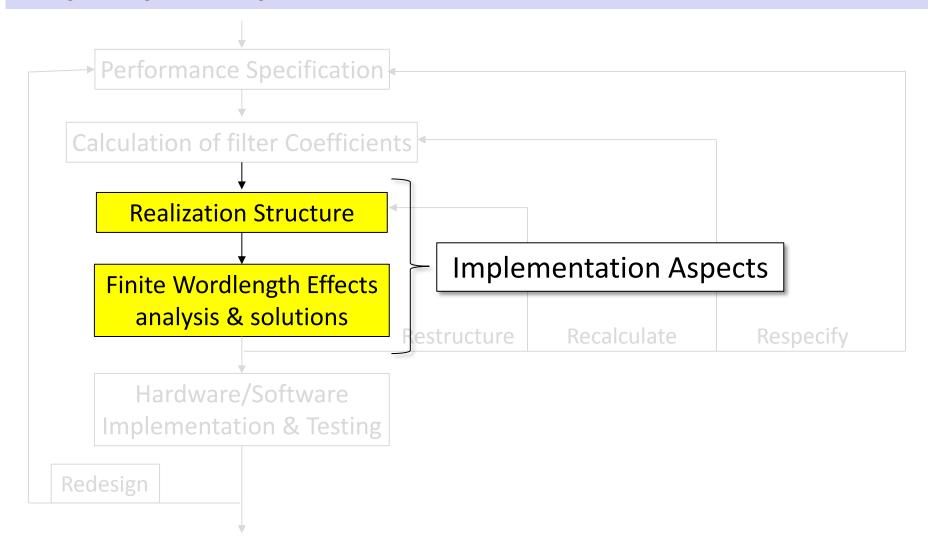
Digital Filter Design Procedure



Digital Filter Design Procedure



Digital Filter Design Procedure



Linear Constant Coefficient Difference Equations

Realisation structures from difference equations

LTI System function

$$H(z) = \sum_{k=0}^{N} b_k z^{-k} / \sum_{k=0}^{N} a_k z^{-k}$$



Time Domain: Difference equation

$$H(z) = \sum_{k=0}^{N} b_k z^{-k} / \sum_{k=0}^{N} a_k z^{-k}$$
 \Leftrightarrow
$$y[n] = \sum_{k=0}^{N} b_k x[n-k] - \sum_{k=1}^{N} a_k y[n-k]$$

1st order system example:
$$H(z) = \frac{b_0 + b_1 z^{-1}}{1 - a_1 z^{-1}} \iff y[n] - a_1 y[n-1] = b_0 x[n] + b_1 x[n-1]$$
 (1)

$$y[n] = a_1 y[n-1] + b_0 x[n] + b_1 x[n-1]$$

Recursive computation of the output y at any time n based on the previous output y[n-1], the current input x[n] and the previous input sample x[n-1]

Linear Constant Coefficient Difference Equations

Realisation structures from difference equations

LTI System function

$$H(z) = \sum_{k=0}^{N} b_k z^{-k} / \sum_{k=0}^{N} a_k z^{-k}$$



Time Domain: Difference equation

$$H(z) = \sum_{k=0}^{N} b_k z^{-k} / \sum_{k=0}^{N} a_k z^{-k}$$
 \Leftrightarrow $y[n] = \sum_{k=0}^{N} b_k x[n-k] - \sum_{k=1}^{N} a_k y[n-k]$

Realisation structures

- Methods of implementing difference equations in hardware / software
- Described by means of block diagrams or flow graphs
- Software implementation
 - Block diagram serves as the basis for a program that implements the filter
- Hardware implementation
 - Block diagram serves as a basis for determining the hardware architecture
- Multiple equivalent structures result from algebraic/block diagram manipulations

Realisation Structures from Difference Equations

Why multiple realisation structures?

1. Computational complexity

- Number of multiplications, additions, divisions
- Numbers of memory fetches, numerical comparisons

2. Memory requirements

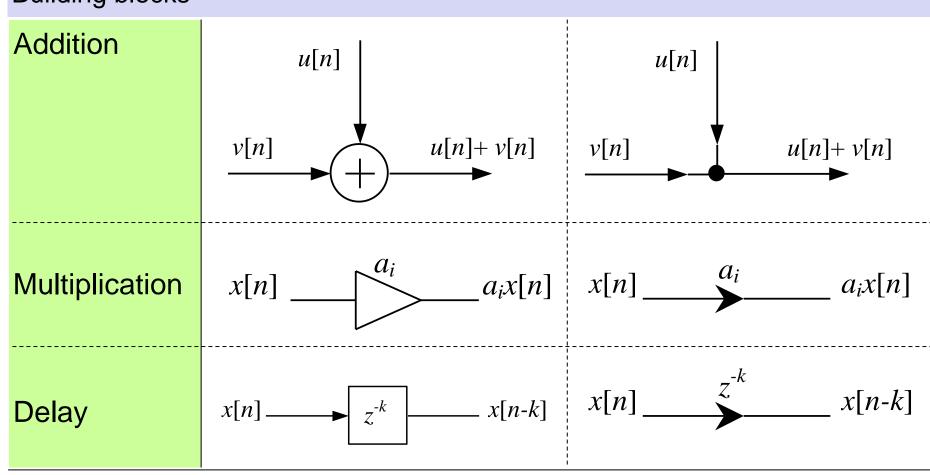
Number of memory locations for storing past inputs, outputs and intermediate values

3. Finite-word length effects

- Rounding / truncation of output / intermediate results due to finite precision available (e.g. 16bits or 32bits)
- Different structures exhibit different behaviour under finite-precision arithmetic

Block Diagram Representation of Difference Equations

Building blocks



Block Diagram Notation

Flow Graph Notation

Block Diagram Representation of Difference Equations

Example 1: 2nd order difference equation

2nd order filter:
$$H(z) = \frac{b_0}{1 - a_1 z^{-1} - a_2 z^{-2}} \iff y[n] = a_1 y[n-1] + a_2 y[n-2] + b_0 x[n]$$

Computational algorithm:

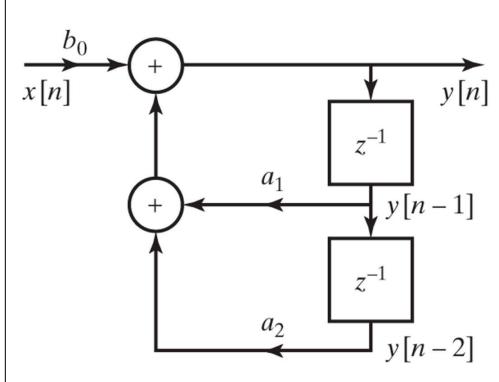
- 1. Form the products $a_1y[n-1]$ and $a_2y[n-2]$
- 2. Add them
- 3. Add the result to the product $b_0x[n]$

Memory requirements

- Storage required for delayed variables y[n-1], y[n-2]
- Storage for coefficients a_1 and a_2 and b_0

Computational complexity

- 2 additions
- 3 multiplications
- 2 memory locations



Block Diagram Representation of Difference Equations

General case: Higher order difference equations

Higher order filter:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k]$$

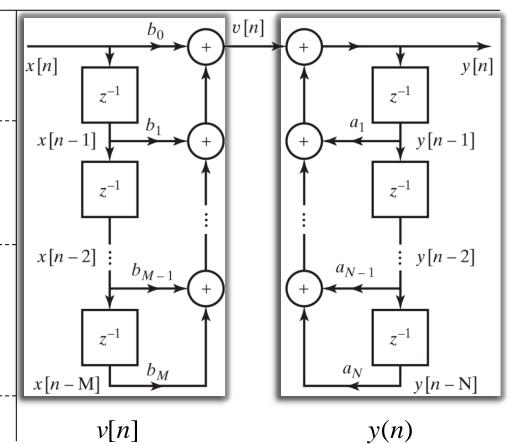
Difference equation 1

$$v[n] = \sum_{k=0}^{M} b_k x[n-k]$$

Difference equation 2

$$y[n] = \sum_{k=1}^{N} a_k y[n-k] + v[n]$$

Block diagram represents a pair of difference equations



Block Diagram Representation of Difference Equations

General case: Higher order difference equations

Higher order filter:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k]$$

System Function 1

$$V(z) = H_1(z)X(z) = \left(\sum_{k=0}^{M} b_k z^{-k}\right)X(z)$$

System Function 2

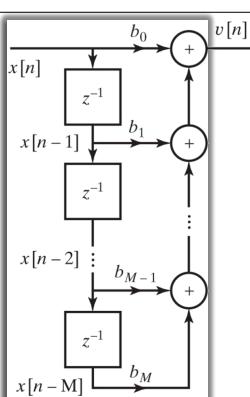
$$Y(z) = H_2(z)V(z) = \left[\frac{1}{1 - \sum_{k=1}^{N} a_k z^{-k}}\right]V(z)$$

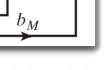
System is a cascade of two LTI systems

$$H(z) = H_2(z)H_1(z)$$

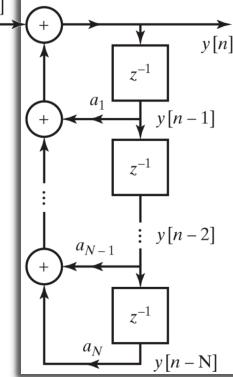
$$H_1(z) = \sum_{k=0}^{M} b_k z^{-k}, \quad H_2(z) = 1/(1 - \sum_{k=1}^{N} a_k z^{-k})$$

$$Y(z) = H(z)X(z) = H_2(z) H_1(z)X(z) | V(z) = H_1(z)X(z)$$





$$V(z) = H_1(z)X(z)$$



$$Y(z) = H_2(z)V(z)$$

Block Diagram Representation of Difference Equations

General case: Higher order difference equations

Higher order filter:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k]$$

System Function 1

$$W(z) = H_2(z)X(z) = \left[\frac{1}{1 - \sum_{k=1}^{N} a_k z^{-k}}\right] X(z)$$

System Function 2

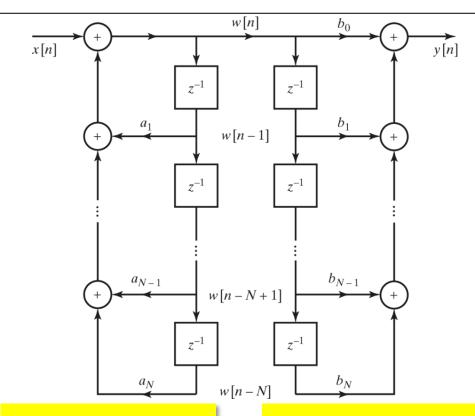
$$Y(z) = H_1(z)W(z) = \left(\sum_{k=0}^{M} b_k z^{-k}\right)W(z)$$

System is a cascade of two LTI systems

$$H(z) = H_1(z)H_2(z)$$

$$H_1(z) = \sum_{k=0}^{M} b_k z^{-k}, \quad H_2(z) = 1/(1 - \sum_{k=1}^{N} a_k z^{-k})$$

$$Y(z) = H(z)X(z) = H_1(z) H_2(z)X(z) W(z) = H_2(z)X(z)$$



 $Y(z) = H_1(z)W(z)$

Block Diagram Representation of Difference Equations

General case: Higher order difference equations

Higher order filter:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k]$$

Difference equation 1

$$w[n] = \sum_{k=1}^{N} a_k w[n-k] + x[n]$$

Difference equation 2

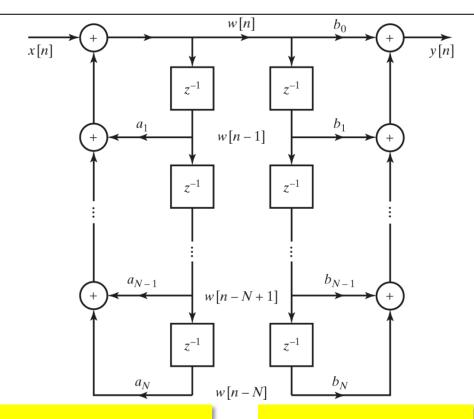
$$y[n] = \sum_{k=0}^{M} b_k w[n-k]$$

System is a cascade of two LTI systems

$$H(z) = H_1(z)H_2(z)$$

$$H_1(z) = \sum_{k=0}^{M} b_k z^{-k}, \quad H_2(z) = 1/(1 - \sum_{k=1}^{N} a_k z^{-k})$$

$$Y(z) = H(z)X(z) = H_1(z) H_2(z)X(z) W(z) = H_2(z)X(z)$$

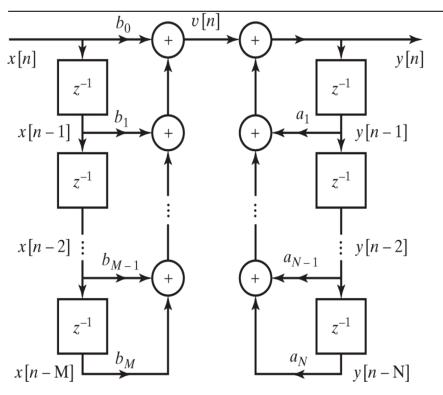


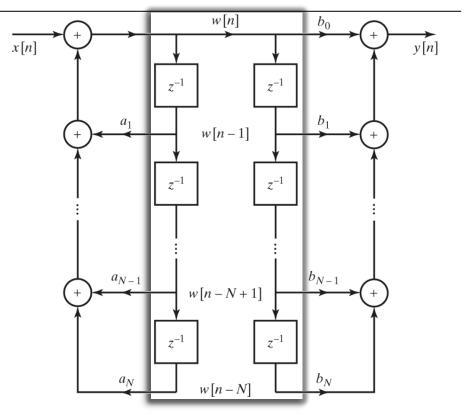
 $Y(z) = H_1(z)W(z)$

Block Diagram Representation of Difference Equations

General case: Higher order difference equations

Higher order filter:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k]$$



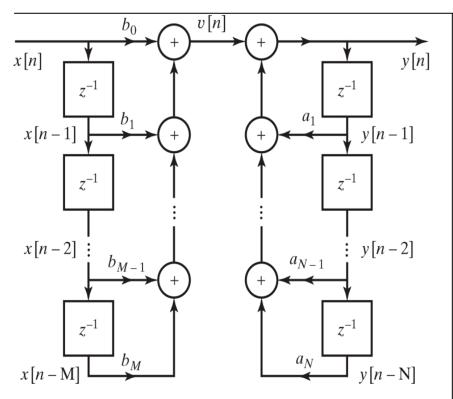


Same signal stored in two delay chains

IIR Direct Forms

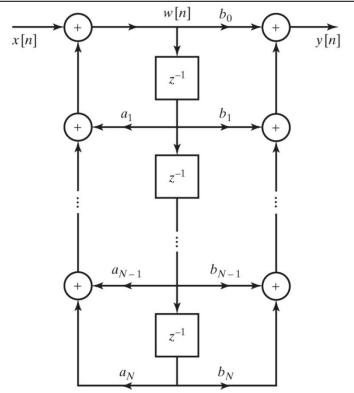
Direct Form I & Direct Form II

Higher order filter:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k]$$



DIRECT FORM I

Direct realisation of the difference equation



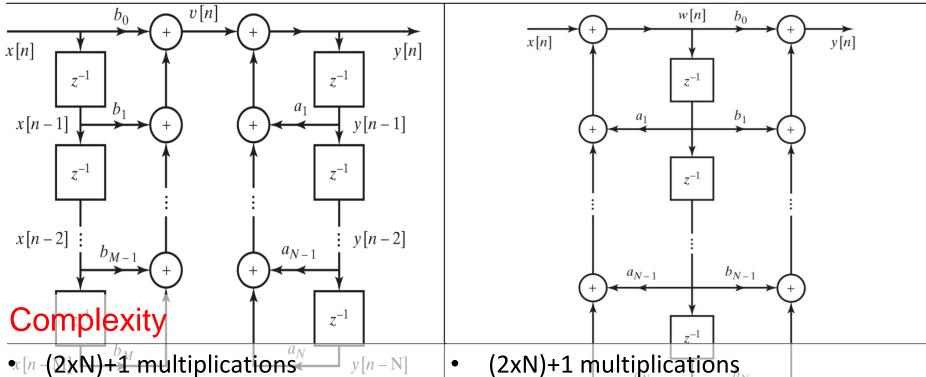
DIRECT FORM II – CANONIC FORM

Form with minimum number of delay elements

IIR Direct Forms

Direct Form I & Direct Form II

$$\text{Higher order filter: } H(z) = \sum_{k=0}^{M} b_k z^{-k} \left/ 1 - \sum_{k=1}^{N} a_k z^{-k} \Leftrightarrow y[n] = \sum_{k=1}^{N} a_k y[n-k] + \sum_{k=0}^{M} b_k x[n-k] \right.$$

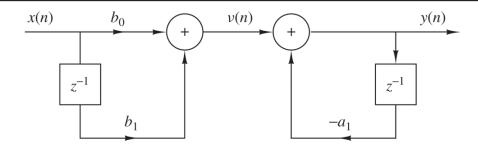


- 2xN additions
- 2xN memory locations

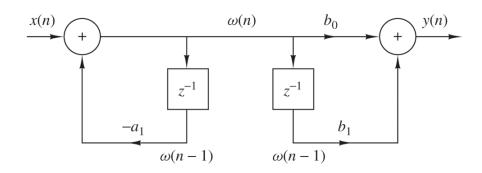
- (2xN)+1 multiplications
- 2xN additions
- N memory locations

IIR Direct Forms – From Direct Form I to Direct Form II

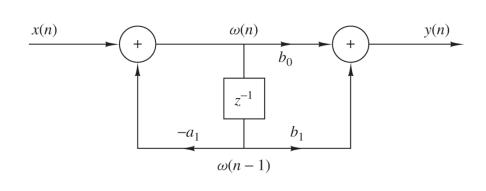
Direct Form I



- Interchange order of cascade
- Common input to delays



Direct Form II

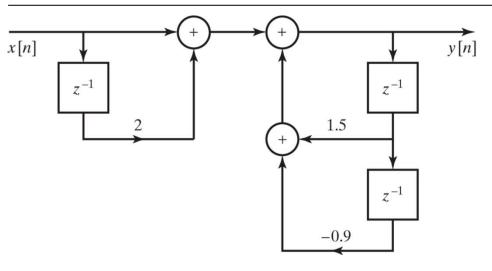


IIR Direct Forms

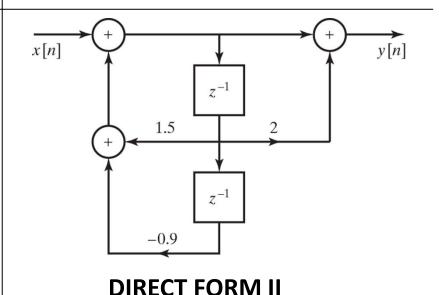
Example 2: Draw Direct Form I and Direct Form II Block Diagrams

System Function:
$$H(z) = \frac{1 + 2z^{-1}}{1 - 1.5z^{-1} + 0.9z^{-2}}$$

$$b_0 = 1, b_1 = 2, a_1 = +1.5, a_2 = -0.9$$



DIRECT FORM I



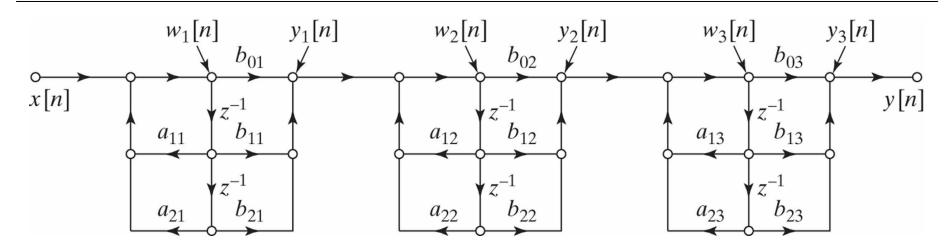
Coefficients in the feedback branches in the block diagram have opposite signs from the corresponding coefficients a_k in the system function \Leftrightarrow Feedback coefficients a_k always have the opposite sign in the difference equation from their sign in the system function

IIR Cascade Form

Realisation Structure resulting from Factorization of System Function

System Function:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} = \prod_{k=1}^{N_s} H_k(z) = \prod_{k=1}^{N_s} \frac{b_{0k} + b_{1k} z^{-1} + b_{2k} z^{-2}}{1 - a_k z^{-1} - a_{2k} z^{-2}}$$

- Implement each 2nd order systems in one of two Direct Forms
- Multiple equivalent structures can be obtained by different pairings of poles & zeros
- $N_s!$ pairings and $N_s!$ orderings of 2nd order systems => $(N_s!)^2$ structures, $N_s=\lfloor (N+1)/2 \rfloor$

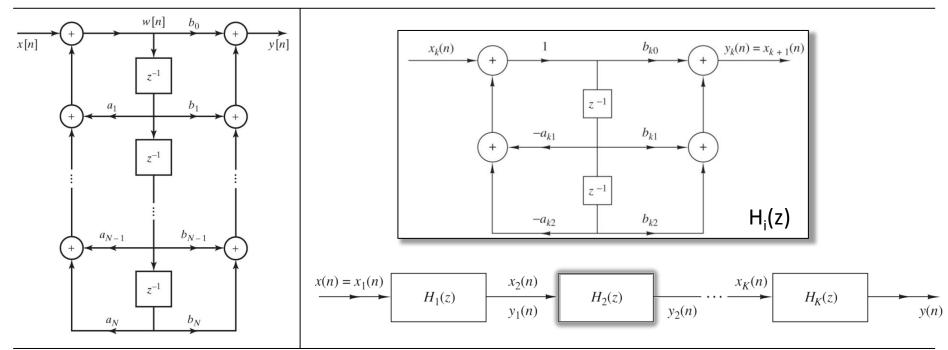


Cascade structure of 6th order system with a direct form II realization of each 2nd order subsystem

IIR Cascade Form

Realisation Structure resulting from Factorization of System Function

System Function:
$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} = \prod_{k=1}^{N_s} H_k(z) = \prod_{k=1}^{N_s} \frac{b_{0k} + b_{1k} z^{-1} + b_{2k} z^{-2}}{1 - a_k z^{-1} - a_{2k} z^{-2}}$$

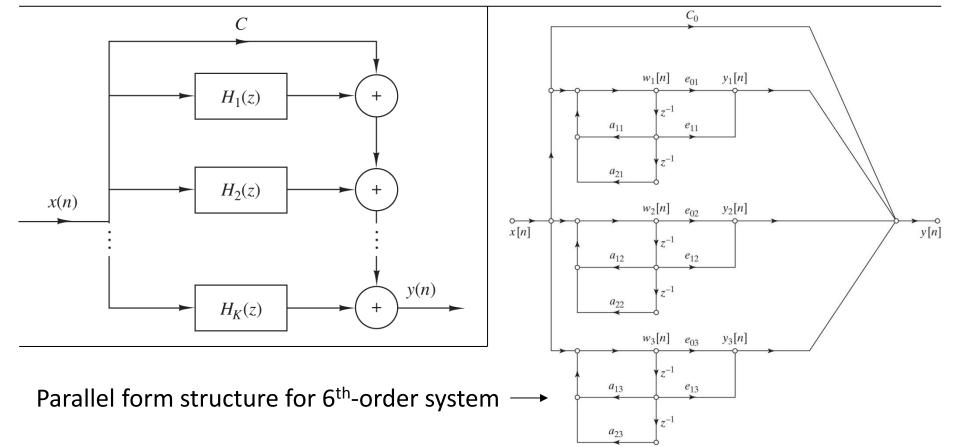


- Different structures -> different behaviour under finite arithmetic
- Overall gain of the system distributed, thus controlling the size of signals at various points

IIR Parallel Form

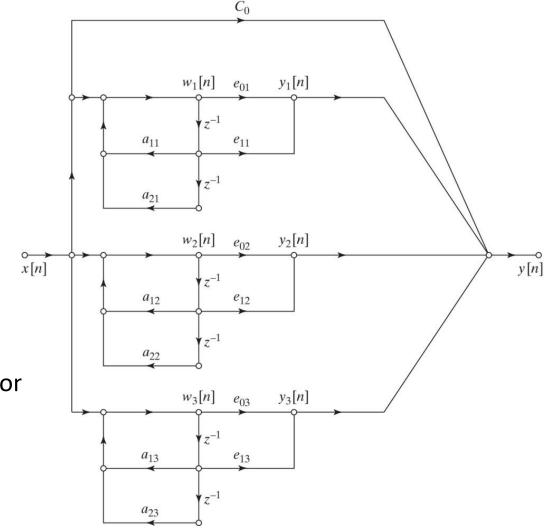
Realisation resulting from Partial Fraction Expansion of System Function

$$H(z) = \sum_{k=0}^{M} b_k z^{-k} / 1 - \sum_{k=1}^{N} a_k z^{-k} = C + \sum_{i=1}^{L} H_i(z) = C + \sum_{i=1}^{L} \frac{A_i}{1 - p_i z^{-1}} = b_0 + \sum_{i=1}^{L} \frac{b_{i0} + b_{i1} z^{-1}}{1 + a_{i1} z^{-1} + a_{i2} z^{-2}}$$



IIR Parallel & Cascade Form

Structure from Partial Fraction Expansion & Factorisation of System Function

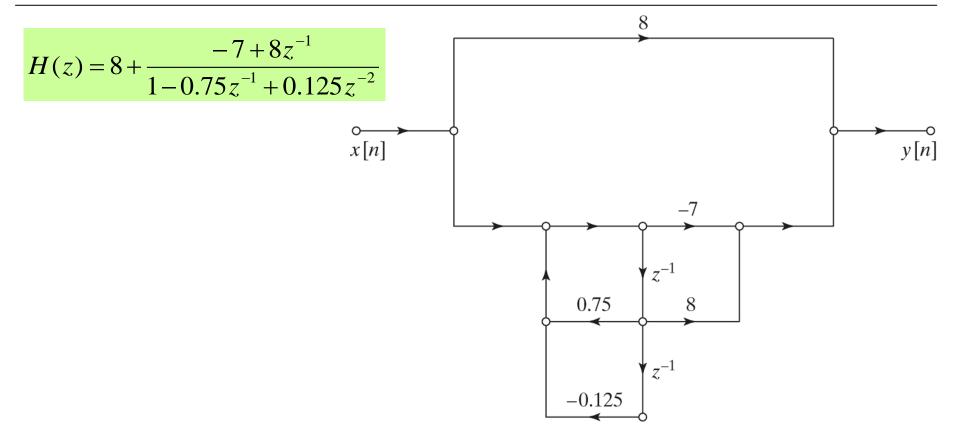


6th order
Realisation structure resulting fror
partial fraction expansion
of the system function

IIR Parallel Form

Example 4

$$H(z) = \frac{1 + 2z^{-1} + z^{-2}}{1 - 0.75z^{-1} + 0.125z^{-2}} = C + \sum_{i=1}^{L} H_i(z) = C + \sum_{i=1}^{L} \frac{A_i}{1 - p_i z^{-1}} = b_0 + \sum_{i=1}^{L} \frac{b_{i0} + b_{i1} z^{-1}}{1 + a_{i1} z^{-1} + a_{i2} z^{-2}}$$



IIR Parallel Form

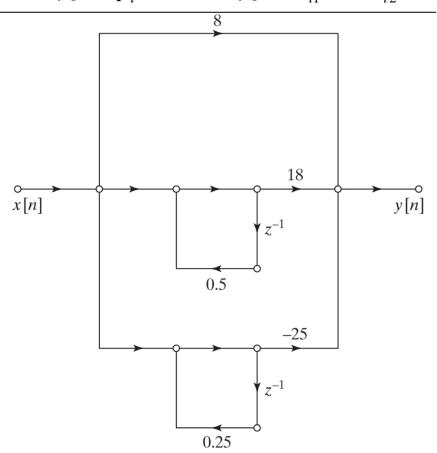
Example 4

$$H(z) = \frac{1 + 2z^{-1} + z^{-2}}{1 - 0.75z^{-1} + 0.125z^{-2}} = C + \sum_{i=1}^{L} H_i(z) = C + \sum_{i=1}^{L} \frac{A_i}{1 - p_i z^{-1}} = b_0 + \sum_{i=1}^{L} \frac{b_{i0} + b_{i1} z^{-1}}{1 + a_{i1} z^{-1} + a_{i2} z^{-2}}$$

$$H(z) = 8 + \frac{-7 + 8z^{-1}}{1 - 0.75z^{-1} + 0.125z^{-2}}$$

Further Expansion

$$H(z) = 8 + \frac{18}{1 - 0.5z^{-1}} - \frac{25}{1 - 0.25z^{-1}}$$



IIR Parallel Form

Example 5

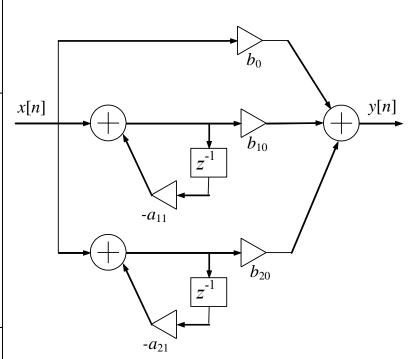
The figure below shows a parallel implementation for an IIR filter. A) Evaluate the system function for this filter. B) Draw the corresponding direct form implementation.

$$H(z) = b_0 + \frac{b_{10}}{1 + a_{11}z^{-1}} + \frac{b_{20}}{1 + a_{21}z^{-1}}$$

$$=\frac{b_0 \left(1+a_{11} z^{-1}\right) \left(1+a_{21} z^{-1}\right)+b_{10} \left(1+a_{21} z^{-1}\right)+b_{20} \left(1+a_{11} z^{-1}\right)}{\left(1+a_{11} z^{-1}\right) \left(1+a_{21} z^{-1}\right)}$$

$$H(z) = \frac{\left(b_0 + b_{10} + b_{20}\right) + \left(b_0 a_{11} + b_0 a_{21} + b_{10} a_{21} + b_{20} a_{11}\right) z^{-1} + b_0 a_{11} a_{21} z^{-2}}{1 + \left(a_{11} + a_{21}\right) z^{-1} + a_{11} a_{21} z^{-2}}$$

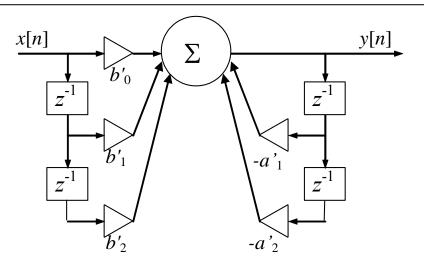
$$a'_{1} = a_{11} + a_{21}$$
 $a'_{2} = a_{11}.a_{21}$ $b'_{0} = b_{0} + b_{10} + b_{20}$
 $b'_{1} = b_{0}.a_{11} + b_{0}.a_{21} + b_{20}.a_{11} + b_{10}.a_{21}$ $b'_{2} = b_{0}.a_{11}.a_{21}$



IIR Parallel Form

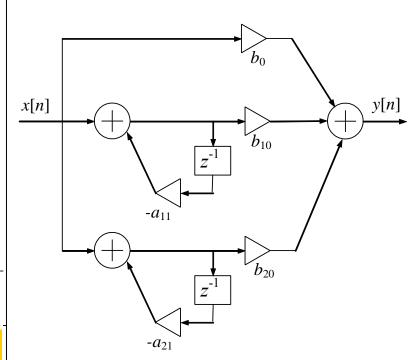
Example 5

The figure below shows a parallel implementation for an IIR filter. A) Evaluate the transfer function for this filter. B) Draw the corresponding direct form implementation.



$$H(z) = \frac{\left(b_0 + b_{10} + b_{20}\right) + \left(b_0 a_{11} + b_0 a_{21} + b_{10} a_{21} + b_{20} a_{11}\right) z^{-1} + b_0 a_{11} a_{21} z^{-2}}{1 + \left(a_{11} + a_{21}\right) z^{-1} + a_{11} a_{21} z^{-2}}$$

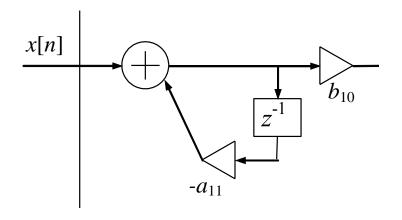
$$a'_{1} = a_{11} + a_{21}$$
 $a'_{2} = a_{11}.a_{21}$ $b'_{0} = b_{0} + b_{10} + b_{20}$
 $b'_{1} = b_{0}.a_{11} + b_{0}.a_{21} + b_{20}.a_{11} + b_{10}.a_{21}$ $b'_{2} = b_{0}.a_{11}.a_{21}$



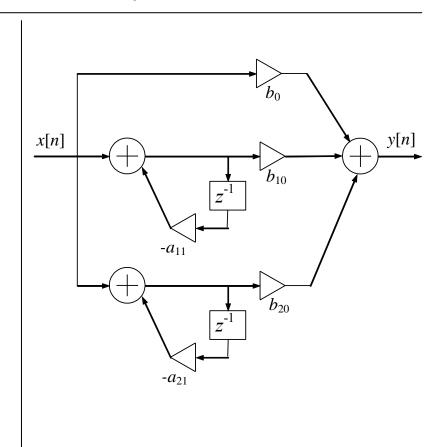
IIR Parallel Form

?

The figure below shows a parallel implementation for an IIR filter. A) Evaluate the transfer function for this filter. B) Draw the corresponding direct form implementation.



Which form is this?



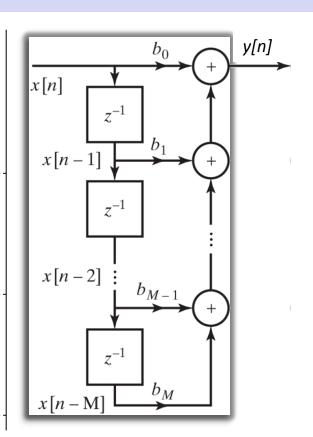
FIR Direct Form Structure

AKA Tapped Delay Line

$$y[n] = \sum_{k=0}^{N} b_k x[n-k] = b[n] * x[n]$$

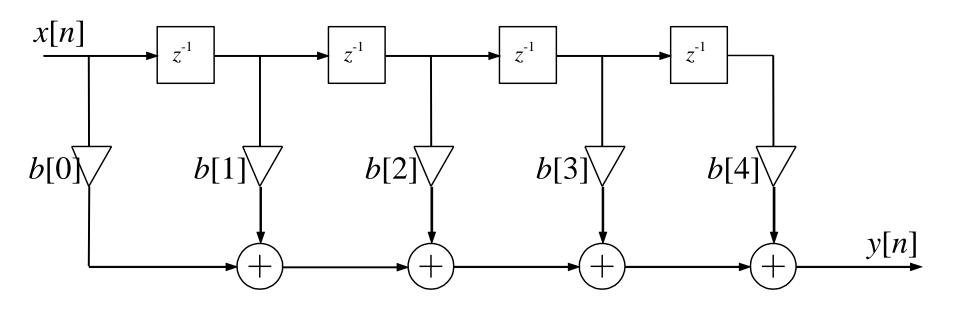
$$\Leftrightarrow Y(z) = \sum_{k=0}^{N} b_k z^{-k} X(z)$$

$$\Leftrightarrow H(z) = \sum_{k=0}^{N} b_k z^{-k}$$



FIR Direct Form Structure

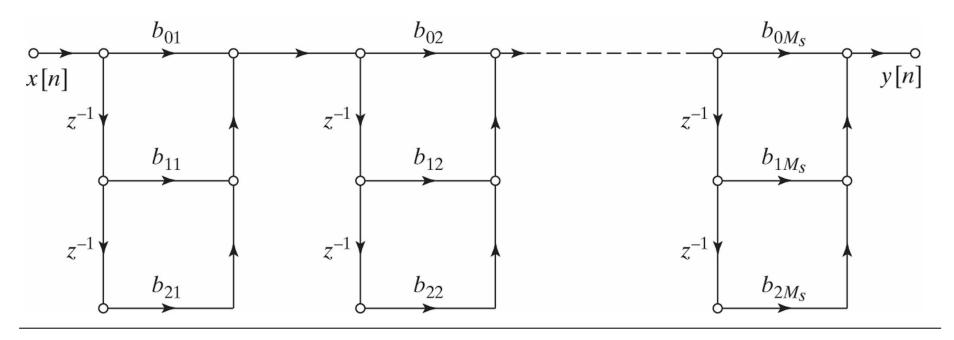
AKA Tapped Delay Line



$$y[n] = \sum_{k=0}^{N} b_k x[n-k] = b[n] * x[n] \iff Y(z) = \sum_{k=0}^{N} b_k z^{-k} X(z) \iff H(z) = \sum_{k=0}^{N} b_k z^{-k}$$

FIR Direct Form Structure

Cascade form from factorisation

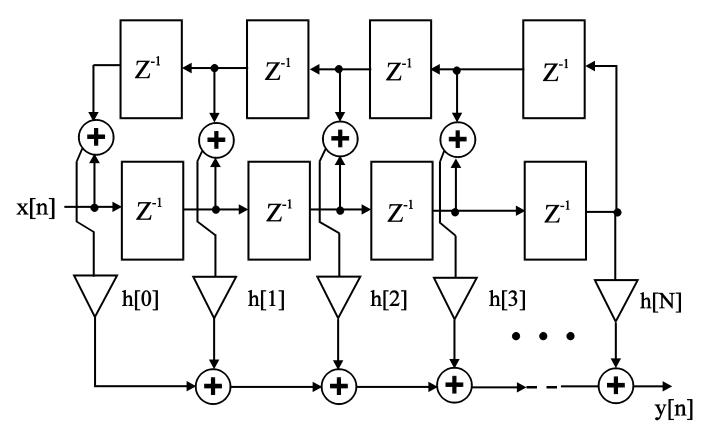


$$y[n] = \sum_{k=0}^{N} b_k x[n-k] = b[n] * x[n] \iff Y(z) = \sum_{k=0}^{N} b_k z^{-k} X(z) \iff H(z) = \sum_{k=0}^{N} b_k z^{-k}$$

$$H(z) = \sum_{k=0}^{N} b_k z^{-k} = \prod_{k=1}^{N_s} (b_{0k} + b_{1k} z^{-1} + b_{2k} z^{-2}), \quad N_s = \lfloor (N+1)/2 \rfloor$$

FIR Direct Form Structure

Linear Phase FIR Filters

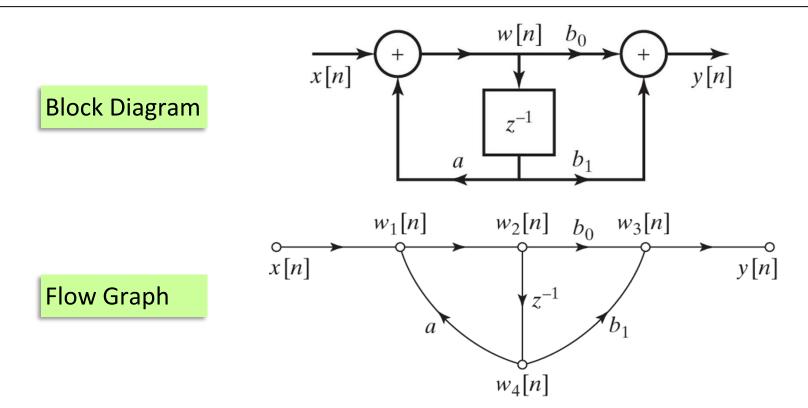


Savings due to symmetry (number of multipliers halved)

FIR Transposed Form Structure

Flow Graph Reversal Theorem

- If we reverse the directions of all branch transmittances and interchange the input and output in the flow graph the system function remains the same
- The resulting structure is called a transposed form

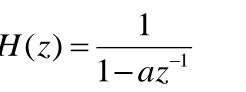


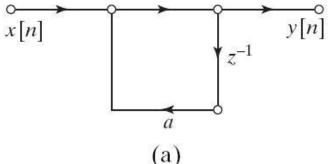
FIR Transposed Form Structure

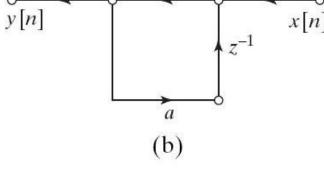
Flow Graph Reversal Theorem

- If we reverse the directions of all branch transmittances and interchange the input and output in the flow graph the system function remains the same
- The resulting structure is called a transposed form

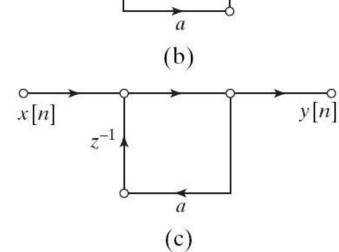
Example





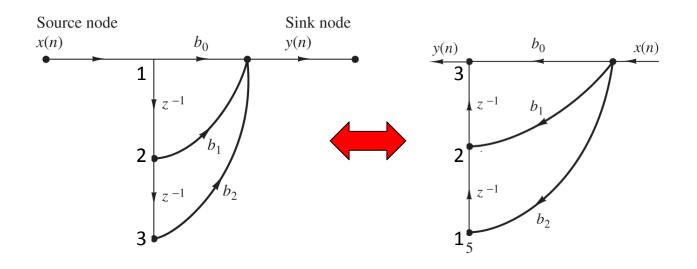


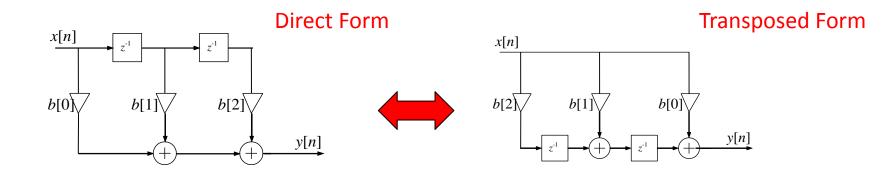
- (a) Flow graph of simple 1st-order system.
- (b) Transposed form of (a).
- (c) Structure of (b) Redrawn with input on left.



FIR Transposed Form Structure

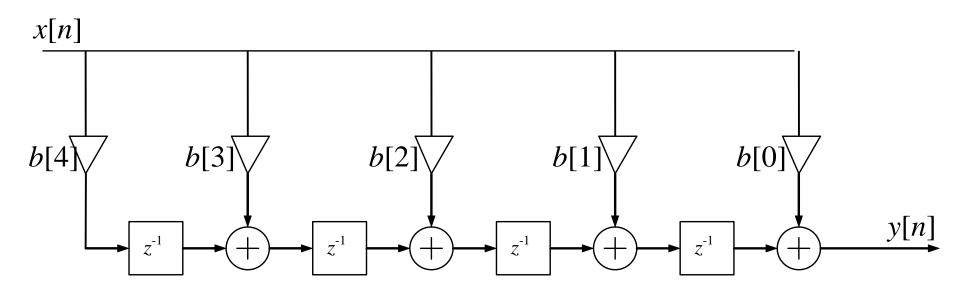
Flow Graph Reversal Theorem





FIR Transposed Form Structure

Flow Graph Reversal Theorem



Complexity

- L=N+1 multiplications
- N additions
- N memory locations

Multipliers can be implemented together in one multiplier block and both multiplication & summation can be performed in parallel