#### Teoria dei Segnali – Filtri tempo-discreti

#### Valentino Liberali

Dipartimento di Fisica Università degli Studi di Milano valentino.liberali@unimi.it



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#### Contenuto

- Filtri digitali
- 2 Filtri con risposta finita
- Siltri con risposta infinita

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### Digital Filters

Filters are used for band limiting signals (anti-aliasing), for band splitting in multiplexing/demultiplexing, for pulse forming in digital modulators, for decimation and interpolation (e.g., in  $\Sigma\Delta$  A/D and D/A data converters), for equalization, . . .

Filters may be:

- linear
- non-linear
- adaptive

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#### Linear Digital Filters

Linear filters are linear time-invariant (LTI) systems

 $\rightarrow$  they are completely described by their impulse response h(t) (or h[k])

For sampled-data systems (including digital systems), filtering may be described in the Z-domain:

$$H(z) = \mathcal{Z}\{h[k]\} = \sum_{k=-\infty}^{+\infty} h[k]z^{-k}$$

Linear filters may have:

- finite impulse response (FIR)
- infinite impulse response (IIR)

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### FIR Filters

The system function is

$$H(z) = \sum_{k=0}^{N-1} h[k] z^{-k}$$

The output is

$$y[m] = \sum_{k=0}^{N-1} h[k]x[m-k]$$

By applying an impulse  $\delta[k]$  to the input, the output goes to zero after N samples.

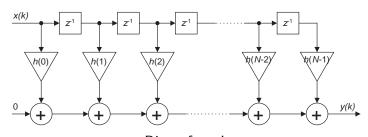
An FIR filter is also called a moving average (MA) filter.

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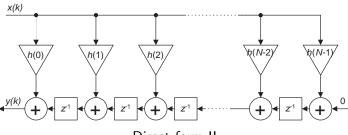
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#### Signal Flow Graphs of an FIR Filter



Direct form I



Direct form II

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### Linear Phase FIR filters

In DSP and communications, phase must be proportional to the frequency (*linear phase*):

$$\varphi(f) = \angle H(f) \propto f$$

Linear phase corresponds to a pure delay in time domain: all frequency components are delayed by the same time amount.

A linear phase FIR filter has **symmetrical impulse response** (either even-symmetrical or odd-symmetrical):

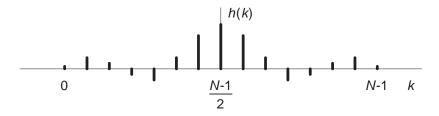
$$h[k] = h[N-1-k]$$
 even-symmetric  $h[k] = -h[N-1-k]$  odd-symmetric

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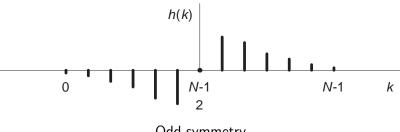
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#### Impulse Response of Linear Phase Filters



Even symmetry

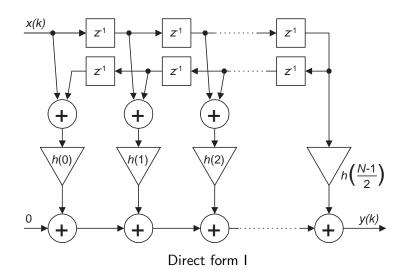


Odd symmetry

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## SFG of a Symmetrical FIR Filter



This solution saves about one half of the multiplications.

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#### IIR Filters

The system function is

$$H(z) = \frac{B(z)}{A(z)} = \frac{\sum_{k=0}^{N-1} b[k]z^{-k}}{1 - \sum_{j=1}^{M} a[j]z^{-j}}$$

The output is

$$y[m] = \sum_{k=0}^{N-1} b[k]x[m-k] + \sum_{j=1}^{M} a[j]y[m-j]$$

By applying an impulse to the input, the output does not go to zero after a finite number of samples.

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### AR IIR Filters

When B(z) = 1, the output sample y[m] is a linear regression of previous output values. Such a filter is called an **autoregressive** (AR) filter.

The system function is

$$H(z) = \frac{1}{A(z)} = \frac{1}{1 - \sum_{j=1}^{M} a[j]z^{-j}}$$

The output is

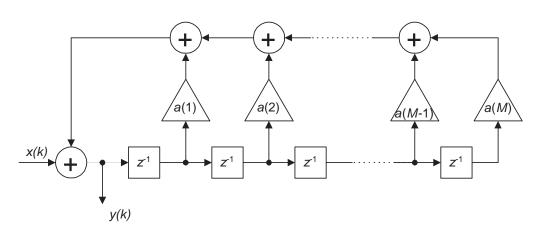
$$y[m] = x[m] + \sum_{j=1}^{M} a[j]y[m-j]$$

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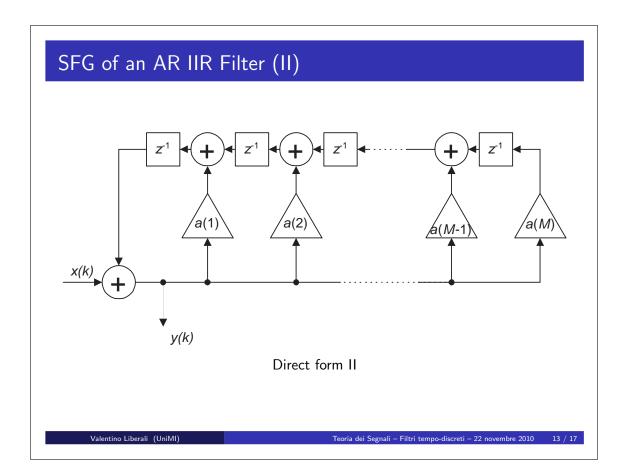
#### SFG of an AR IIR Filter (I)



Direct form I

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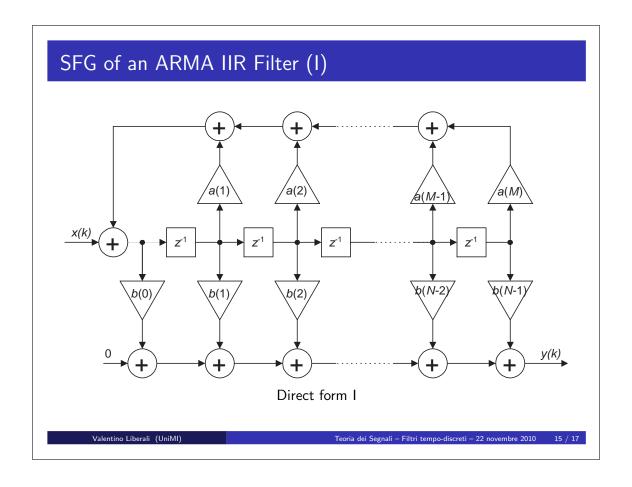


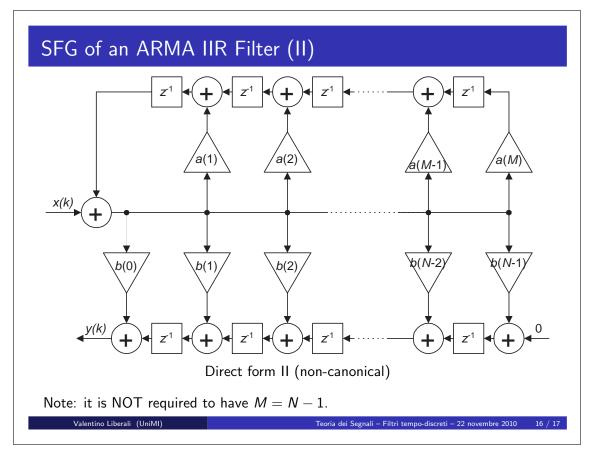
### ARMA IIR Filters

When  $B(z) \neq 1$ , the filter is an autoregressive, moving average (ARMA) filter.

The signal flow graph can be obtained by combining the SFGs of the AR part and of the MA part.

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# FIR vs IIR Filters

FIR			IIR
more coefficients	3	©	less coefficients
smooth cut-off in transition band	(:)	©	sharp cut-off in transition band
linear phase	©	②	no linear phase (only approximation possible)
always stable	©	3	limit cycles may occur due to finite arithmetics  → oscillations!

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